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Essays on network formation and exchange

Dogan, G.

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Essays on Network Formation and Exchange

Gönül Doğan Ligtvoet

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Essays on Network Formation and Exchange

Proefschrift ter verkrijging van de graad van doctor aan de Universiteit van Tilburg, op gezag van de rector magnificus, prof.dr. Ph. Eijlander, in het openbaar te verdedigen ten overstaan van een door het college voor promoties aangewezen commissie in de aula van de Universiteit op

vrijdag 30 oktober 2009 om 14.15 uur

door

Gönül Doğan Ligtvoet

geboren op 28 januari 1979 te Bursa, Turkije.

Promotores:

Prof.dr. J.J.M. Potters

Prof.dr. K. Sijtsma

Copromotor:

Dr. M.A.L.M. van Assen

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Her gün bir yerden göçmek ne iyi
Her gün bir yere konmak ne güzel
Bulanmadan, donmadan akmak ne hoş
Dünle beraber gitti cancağzım
Ne kadar söz varsa düne ait
Şimdi yeni şeyler söylemek lazım
Mevlânâ Celâleddin-i Rûmî

This thesis is the result of an interdisciplinary project. I started the project with the knowledge that I needed to investigate social networks, but I soon realised that it is a huge field of study. Sociologists have been studying networks for decades, and economists were keen on catching up in the last 15 years. (Now I know that physicists, psychologists and computer scientists are also working on networks.) At first, I had trouble in even understanding sociology papers but then I learned how to benefit from them with the right approach. I learned how to write scientific papers and endlessly revise them. Sometimes I was so consumed with the idea of networks that I started seeing networks in everything. New ideas on social networks and social preferences sprung up along the way; some excite me and I hope to pursue further.

Both of my supervisors, Jan Potters and Marcel van Assen, provided me with valuable feedback and insights into how to think like a scientist. I would like to thank them for their time and effort during this project. I would also like to thank the committee members of this thesis (Charles Noussair, Klaas Sijtsma, Michael Kosfeld, Theo Offerman, and Vincent Buskens) for their valuable comments. Thanks to Ton Heinen for providing me with the facilities after my contract ended; I would not be able to finish my last paper otherwise. Thanks to Marieke Timmermans for her secretarial support.

My experience during the four and a half years of my PhD taught me that every PhD comes with a unique story. And mine is not an exception. Despite all the struggles I had -especially in the last months before finishing- and no real encouragement, I persevered. So, it is not only finishing the thesis but knowing that I successfully endured this process that makes this thesis a great achievement. Moreover, knowing that I can now build my own research agenda

and be independent is a relief. I am grateful for the help of my friends and family here and elsewhere for providing me with the necessary support throughout.

I would like to thank:

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Mercan, we have süp-per dreams that we still have to work on. Rahmi, it is good to have a friend who cares and does not care at the same time. Serap, Erdem, Ulaş, Pelin, Umut and Zeynep; it is always nice seeing you.

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Annem Gülhas Doğan ve babam Süleyman Doğan'a sınırsız desteklerinden dolayı; İlhan ve Fatma'ya bütün İstanbul ve Kaş seyahatleri için; yeni gelen Selim Mert'e varolduğu için; kuzenim Semra'ya her zaman yanımda olduğu için teşekkürü özellikle borç bilirim.

Ik wil de familie Ligetvoet (Sjannie, Ger, Leslie, en Cindy) ook bedanken voor de zorg over mij, voor de goede lachen en of course het lenen van de auto.

And Rudy. The prince, the ginger, sweeto and pō-ta-tō, the object of some of my nightmares, hayatım benim, canım beniiim, the rolling r that I cannot pronounce, the dedicated and the I-forgot. Thanks for all, but we are just beginning.

As the great poet and mystic Mevlana, better known as Rumi in English, says above, yesterday has passed and now is the time to say new things.

Gönül Doğan Ligetvoet

31 Ağustos.August.Augustus 2009, Tilburg

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Chapter 1

Introduction

Exchange of goods, and services as well as ideas, favors, and gifts constitutes a basic part of human existence. Exchange has been extensively studied in economics since the pioneering work of Edgeworth (1881). In social psychology and sociology, research on exchange gained a prominent position after Homans (1958) introduced the idea of social behavior as exchange.

In many real life situations, agents need to establish or maintain a connection to engage in exchange. Examples include the labor market, housing market, friendships, and collaborations among scientists. In the labor market, the potential employee and the employer first establish a connection via an application process before the job is negotiated. Likewise in the housing market, registering with a housing agency is a prerequisite for a potential tenant to start seeing the available houses. We tend to exchange gifts and favors only with our friends, and family. Scientists can exchange ideas and collaborate only if they are connected to each other.

Often, setting up or maintaining a connection (i.e., a link) is costly, and agents establish or keep their connections only if it is of benefit to them. So, the set of links agents have (i.e., the network) might play an important role in determining the outcomes of exchange. Who can interact with whom affects not only the potential gains from exchange but also how the gains are distributed. Typically, agents with more links and trading opportunities are in a better bargaining position than more isolated agents. Therefore the study of exchange cannot be parted from the set of connections among agents. Nonetheless, not until the work of Myerson (1977) in economics, and the works of Stolte and Emerson (1977) and Cook and Emerson (1978) in sociology the set of links that agents need to establish or maintain has been taken into account in the study of exchange. The recent but rapidly growing body of theoretical literature in economics shows that networks affect the outcomes of interactions (for an overview see e.g., Goyal, 2007; Jackson, 2008). Moreover, in sociology, the main result of predominantly empirical research on networks is that

network structure has a large impact on what actors earn in their relations (e.g., see Carrington, Scott, and Wasserman, 2005 for a recent review; Willer, 1999).

Agents' payoffs depend on their position in the network, and this dependence provides an incentive for agents to change the network structure. So, not every network structure can be expected to be resistant to change, i.e., not every network is stable. Similarly, some network structures might lead to inefficiencies in exchanges. The study of stable and efficient networks is central to the study of social networks in economics. In various network formation models, link costs play a prominent role in determining the set of stable and efficient networks. For example, in the buyer-seller networks model of Kranton and Minehart (2001) minimally connected networks are both efficient and stable in a range of link costs. Unlike in economics, in sociology almost all the theoretical and empirical studies on exchange focused on the effect of a given network structure on the outcomes of persons on different positions (see Breiger, Carley, and Pattison, 2003 for an overview on work on "dynamic" network studies in sociology). The stability or efficiency of networks was not until recently the subject of investigation in sociological research on networks (see Buskens and Van de Rijt, 2008a, for an exception).

The theoretical literature on network formation in economics has not yet been matched with much empirical and experimental work. There have been only a handful of studies that experimentally investigate the predictions of some network formation models. (See Berninghaus, Ehrhart, and Ott, 2006; Berninghaus, Ehrhart, Ott, and Vogt, 2007; Callander and Plott, 2005; Deck and Johnson, 2004; Falk and Kosfeld, 2003; Goeree, Riedl, and Ule, 2008). In this thesis, we contribute to the network formation literature in economics in two ways. In the first paper, we use experiments to analyze the strategies of the players in a repeated network formation game. The repeated game setup makes it possible for some players to anti-coordinate their actions such that by doing the opposite actions and turn-taking they reach a better outcome than in the one-shot game. It is also possible for a third player to facilitate coordination that benefits other players. We thus investigate the coordination behavior of the players and how it is affected by the

link costs. There are only a few studies on anti-coordination in which players do the opposite actions and take turns in order to maximize their payoff in a repeated setting (see Erev and Haruvy, 2008; Helbing, Schönhof, Stark, and Holyst, 2005; Kaplan and Ruffle, 2008). Most of the previous studies on network formation mainly focused on whether players coordinate on forming the star or cycle networks. In these network formation experiments being linked was generally better than not being linked. Unlike the previous anti-coordination and network formation experiments, in our study we focus both on the coordination and anti-coordination behaviors of players. Also, in our network formation game whether some players benefit from forming a link depends on the links of other players. The second contribution of this thesis is the analysis of behavior in a game with both network formation and interaction over the network. Almost all the previous network formation experiments assumed an exogenous structure of payoffs. There are only a few studies that studied the interaction over an exogenously given network (e.g. Charness, Corominas-Bosch, and Fréchette, 2007; Judd and Kearns, 2008). To our knowledge, the second paper of this thesis is among the first¹ to study both network formation and interaction over the network in the experimental network literature. In this study, players first decide whether to form a link or links and then bargain over a surplus if they are linked. This study allows us to test the assumption that sunk link costs do not affect the subsequent bargaining in the links.

This thesis does not only contribute to the economics literature on network formation, bargaining, and coordination, but also to the sociological literature on network formation and exchange. The theoretical literature on network formation in sociology largely focused on the effect of adding and deleting links on the payoffs of the players in the network without analyzing the stability or efficiency of a given network. (See e.g. Leik, 1991, 1992; Van Assen and Van de Rijt, 2007; Willer and Willer, 2000). The third paper of this thesis contributes to the sociology literature on networks by studying the stability and efficiency of exchange networks. In this

¹ Corbae and Duffy (2008) also studied a two-stage network game in which players first decided with whom to form links and then played the coordination game.

paper, different from the previous studies, we focus on results on the stability and efficiency of networks of any size, and characterize all the stable networks up to size eight as well as the efficient and egalitarian networks with varying link costs using a model of exchange in the sociological literature. Finally, in the fourth paper of this thesis we explain experimental outcomes in pure exchange situations while focusing on the efficiency of exchange. The comparison of the predictions of various models from economics and sociology to the data from pure exchange experiments sheds new light on how well these models explain exchange behavior in the laboratory. We also provide insights into the behavioral patterns observed in the experimental results that cannot be predicted by the models considered.

This thesis contains four substantive chapters. Each chapter is based on a separate paper including an introduction to the topic and relevant literature, outline of the theoretical predictions, and presentation and discussion of the results. The first two papers present two different experiments, and thus, also include information on the experimental design. The experimental instructions, some tables and further explanations on some procedures are included in the appendices of the relevant chapters. The last chapter of the thesis concludes.

In Chapter 2 we experimentally examine the impact of the link costs on network formation and coordination in a repeated buyer-seller network formation game. Particularly, we investigate whether two buyers and a seller coordinate on forming the non-competitive networks. The repeated play of the game allows for the equilibrium in which the long side of the market, i.e. the buyers, anti-coordinate their actions and take turns to maximize their payoff. However, as is shown in the paper, there is also an equilibrium in which the seller facilitates coordination that maximizes the buyers' payoff. Thus, the repeated link formation game lets us investigate whether the players coordinate, and who facilitates the coordination. We also study whether link costs affect the network formation and coordination behavior. We find that the link costs do not significantly affect the link offers of players. Regardless of the link costs, there exist evidence for coordination on the non-competitive networks facilitated both by the short side and the long side of the market. The coordination behavior is further reflected by the group level results.

Notably, the majority of the groups play similar to the coordination equilibria regardless of the link costs. However, contrary to what one might expect, link costs do not increase the number of coordinating groups.

Chapter 3 is an experimental investigation of the impact of the link costs on network formation and the ensuing bargaining process in a buyer-seller setting. In our game, two buyers and one seller can form either a competitive or a non-competitive network, and then bargain over the surplus given that they have a link. We examine the occurrence of competitive networks in which the seller is predicted to get the entire surplus, and analyze whether the bargaining process in the network is affected by the link costs. Standard theory predicts that link costs lead to less competitive networks, but that there is no effect of link costs on the bargaining outcomes within the network because the costs are sunk. We find support for the first but not the second prediction. So, link costs not only cause significantly fewer competitive networks to be formed, but also conditional on the type of the network, link costs have a significant impact on the bargaining outcomes. Specifically, link costs do not affect the bargaining outcome in the competitive network but increase the bargaining share of the buyer in the non-competitive network. Hence our study falsifies the assumption that bargaining is independent of the link costs incurred earlier. Moreover, as we show in the chapter, such an effect of link costs on the bargaining outcomes constitutes a major puzzle that cannot be completely explained by inequality aversion, equity theory, or loss aversion.

In Chapter 4, we investigate which network structures emerge as a function of link costs if actors choose with whom to maintain links. We focus on stable networks and investigate whether they are socially efficient, Pareto efficient and egalitarian. First, we show that, under some mild assumptions the minimal networks consisting of dyads are socially efficient and stable for a range of link costs regardless of how the payoffs are distributed. Second, we calculate the payoff distributions of all networks up to size eight, and analyze the stable networks with varying link costs by using the expected value theory proposed by Friedkin (1995) in the sociological literature on exchange networks. We find that only a very small number of networks are stable. In even-sized networks, minimal networks are the only

egalitarian, Pareto efficient, socially efficient, and stable networks over a wide range of link costs. In odd-sized networks, cycles are the most prominent egalitarian and stable networks. These cycles are also Pareto efficient, although they are not socially efficient. We also find that at low link costs social dilemmas exist such that no even-sized network exists that is both stable and Pareto efficient. The existence of social dilemmas suggests that agents can establish a network structure in which they are not willing to change their links but that is Pareto dominated by another network that is not stable.

Chapter 5 explains human behavior in pure exchange situations. We reanalyze the experimental data of Michener, Cohen, and Sørensen (1975, 1977) and compare the data to the predictions of various cooperative bargaining models from economics, and to the predictions of a bilateral exchange model adapted from sociology. Specifically, we consider the cooperative bargaining solutions of Nash (1950), Raiffa-Kalai-Smorodinsky (Kalai & Smorodinsky, 1975; Raiffa, 1953), Myerson (1977), and the bilateral exchange model of Stokman and Van Oosten (1994). We find that the bilateral exchange model fits the exchange data better than all the other models considered. However, systematic deviations from predictions of the bilateral exchange model and other models of rational behavior are observed. Such deviations can be explained by a boundedly rational model of exchange assuming that actors use heuristics with different sophistication levels to detect profitable exchange. In line with the predictions of the bounded rationality model, we find that the exchange opportunities that require more sophistication are less likely to be carried out. Models that assume rationality fail to predict the results of exchange if agents need to give up a good they like most to increase their payoff.

Finally, Chapter 6 summarizes the findings of the previous chapters, and then discusses their contribution to the network formation and exchange literatures. We also put forward some ideas for future work.

Chapter 2

Coordination in a 3-Player Network Formation Game*

2.1. Introduction

In many markets buyers and sellers need to establish or have connections with each other to be able to engage in trade. Such connections (i.e., links) between the buyers and the sellers in a market, and the structure of these connections (i.e., the network) have been the subject of a rapidly growing interest in economics. Various theoretical models identified the effect of the shape of the buyer-seller networks on the payoffs of agents (see Corominas-Bosch, 2004; Kranton and Minehart, 2000; and Wang and Watts, 2006). In these models, typically, agents with more links and trading opportunities get a better share of the surplus than more isolated agents. Also, link costs affect the links that are formed among the agents. Despite the sharp predictions of the theoretical models, there have been only a few studies that investigate buyer-seller networks in the laboratory (see Charness et al. 2007; Gale and Kariv, 2008; Judd and Kearns, 2008). These studies focused on a fixed network structure, and analyzed the effect of the network structure on agents' payoffs. In general, in these experiments it was found that agents with fewer links attain lower payoffs. Note, however, that the formation of the network was not studied in these experiments.

The present paper contributes to the experimental literature on networks by studying the formation of networks. We focus on coordination behaviour in a finitely repeated network formation game. In this game, if the long side of the market competes, the short side of the market gets the entire surplus. Moreover, competition leads to negative payoffs for the competing parties if they incur costs for getting the opportunity to trade. However, if the long side of the market anti-coordinates their actions such that only one player enters into trade with the short side, then that one player earns positive payoffs. Since positive earnings for the long side of the market are only possible by anti-coordination, in the one-shot

* This chapter is based on Doğan (2009), unpublished manuscript.

game, it is not obvious who enters into trade and who stays out. Such a problem, however, can be solved if the game is repeated. It is possible for the agents in the long side of the market to enter into trade in turns (anti-coordination), or the short side of the market can trade with one agent at a time (coordination) if the long side punishes deviations. Whether agents engage in anti-coordination or coordination, and how link costs affect their behaviour are the main questions investigated in this paper.

We focus on the simplest buyer-seller network formation game in which coordination strategies of players in a repeated game can be investigated. There is one seller who has one good and two potential buyers. All the players simultaneously make link offers; the seller decides whether to form a link with one buyer or two buyers and the buyers decide whether to form a link with the seller. If a competitive network is formed in which the seller is linked to both buyers, then the entire surplus goes to the seller. If the seller is linked to one buyer only, the surplus is shared, albeit not equally, between the seller and the linked buyer. In this non-competitive network, the seller earns two-thirds of the surplus, and the linked buyer one-third. In the one-shot game, offering two links is a weakly dominating strategy for the seller regardless of the link costs. It is a weakly dominating strategy for the buyers to offer a link to the seller only if the links are costless. So, playing the undominated one-shot game strategies results in the formation of the competitive network in every period if the links are costless. If the links are costly, however, the competitive network can not be supported as an equilibrium of the repeated game. Hence, link costs are predicted to reduce the occurrence of competitive networks. In a repeated game, there are other equilibria which ensure that the buyers maximize their total payoff while maintaining equality among each other. We focus on two repeated game equilibria that lead to such outcomes. First, it is possible for the buyers to anti-coordinate their link offers so as to form one link in an alternating fashion every period. Such anti-coordination constitutes a subgame perfect equilibrium *regardless* of the link costs. Second, instead of offering two links every period, the seller can coordinate on forming one link if the

buyers punish deviations by the seller². This equilibrium, as we will show in this paper, also holds regardless of the link costs. We thus investigate whether players engage in coordination, if so who facilitates the coordination, and whether coordination is affected by the link costs.

There exist two strands of experimental literature related to this paper. The first is the study of anti-coordination in the finitely repeated games of chicken, battle of the sexes, entry, and congestion. Similar to our study, in these games if the game is repeated, then agents can do the opposite actions and take turns to maximize their joint payoffs while also maintaining equality. Such anti-coordination behaviours did not receive substantial attention in the experimental literature, and the evidence for anti-coordination was mixed³. Rapoport, Guyer and Gordon (1976) studied a variant of the chicken game in a repeated setting and found anti-coordination to be prevalent. Similarly, Arifovic, McKelvey, and Pevnitskaya (2006) showed that players anti-coordinated in the repeated battle of the sexes games. Helbing et al. (2005) studied what they called the 2-persons congestion game. In this game choosing the Pareto dominating action yielded zero payoff for both players whereas alternating their actions maximized their long-run payoff. They found that the players often learned to alternate their actions in the repeated game. There was no conclusive evidence for alternation behaviour in repeated market entry games (see Erev and Haruvy, 2009 for an overview; Kaplan and Ruffle 2008). Unlike all these studies that exclusively studied anti-coordination, in our setting both coordination and anti-coordination is possible. The buyers can anti-coordinate and take turns on the non-competitive network, but taking turns on the non-competitive network can also be facilitated by the seller. Moreover, the

² For the sake of simplicity, in the rest of this paper, we will mostly stick to the expressions “coordinating on one link” for both buyer anti-coordination and seller coordination behaviour, “buyer coordination” to refer to the buyer anti-coordination, and “seller coordination” to refer to the seller coordination.

³ Anti-coordination behaviour received little attention also in the theoretical network literature. There exist two theoretical papers that investigate anti-coordination in networks by Bramoullé (2007), and Bramoullé, Lopez-Pintado, Goyal, and Vega-Redondo (2004).

network formation game makes it possible for us to study the anti-coordination behaviour of players also when a weakly dominating strategy exists in the one-shot game⁴. The existence of a weakly dominating strategy might make anti-coordination more difficult to achieve.

The second strand of related experimental literature focuses on network formation and examines whether behaviour in link formation games is in line with the predictions of various theoretical models (See Berninghaus et al., 2006, and 2007; Callander and Plott, 2005; Deck and Johnson, 2004; Falk and Kosfeld, 2003; Goeree, Riedl, and Ule, 2008). In most of these papers the focus was on whether certain network structures such as “stars” and “cycles”, which were predicted to be formed by the considered theoretical model, emerged in the laboratory. Attaining those structures posed a coordination problem for the players involved. In all these studies, being linked almost always led to higher payoffs than not being linked. The coordination results of these studies were mixed. Coordination on a star structure mostly failed if players were homogenous as in Goeree et al (2008) or if the player who payed for the link was not the sole beneficiary of the link as in Falk and Kosfeld (2003). However, players mostly formed the star structures in the continuous time setting of Berninghaus et al (2006, 2007), and with heterogeneous agents of Goeree et al (2008). Also, in both Falk and Kosfeld (2003), and Callander and Plott (2005) coordination on the cycle network occurred in the majority of the cases. Different from these network formation studies, in our game, not all the players have similar incentives for forming a certain network. Whereas the seller is better off in a competitive network, the buyers are better off by anti-coordinating on the non-competitive network. Moreover in a repeated setting, the buyers can induce the seller to coordinate on forming the non-competitive network by punishing deviations.

In this paper, we first show that formation of the non-competitive network with alternating buyers constitutes an equilibrium of the finitely repeated game, and such a formation can be facilitated either by buyer anti-coordination, or seller

⁴ If the link costs are 0.

coordination behaviour. Our experimental results show that the link costs do not significantly affect the seller or the buyers' link offers, and there exist both buyer and seller coordination in both cost treatments. The coordination behaviour is further reflected at the group level results that show that regardless of the link costs, the majority of the groups play similar to coordination equilibria. Among the coordinating groups, some engage in the buyer coordination, some in the seller coordination, and some in both. Interestingly, the number of coordinating groups does not increase with the link costs.

The remainder of this paper is organized as follows. The next section presents the game along with the hypotheses that are derived from the equilibrium analysis. Section 2.3 outlines the experimental design and procedure. Section 2.4 presents the experimental results and tests of the various hypotheses. Section 2.5 discusses and concludes.

2.2. The Game

The game involves one seller and two buyers. The players simultaneously offer links to each other. The two buyers cannot form a link with each other. Links can be considered as necessary connections for trade to take place. Since trade requires the consent of both players, a link is formed when both players offer it. After the simultaneous link offer stage, the payoffs are realised according to the link or links that are formed, and the next period starts. We investigate two cases with differing link costs. In the first case, links are costless; in the second, each link that is formed costs 40 points. The cost of a link can be thought of as a necessary investment for trade to take place. The cost of a link is the same for both sellers and buyers. Costs are incurred once a link is formed, not when a link is offered. The link offers of the players are made common knowledge at the end of the link formation.

There are 16 different networks that can be formed considering the link offers of the seller and the buyers. We categorize these 16 networks according to the number of links formed, and for simplicity call them the no-link networks, 1-link networks, and the 2-link network. In the no-link networks no player has a link. Nine networks

are categorized as no-link networks. In the 1-link networks one buyer maintains a link with the seller. Six networks are categorized as 1-link networks. In the 2-link network both buyers have a link with the seller. The 16 networks are depicted in the Appendix 2A in Figure 2A.1.

The payoffs of the players depend on the number of links that are formed, and their role. If no links are formed, each player receives a payoff of zero regardless of the link costs. The payoffs of players in the 1-link and 2-link networks if the link costs are 0, and 40 are illustrated in Figure 2.1, and Figure 2.2, respectively.⁵ Note that in the figures the link offers that are not reciprocated are omitted.

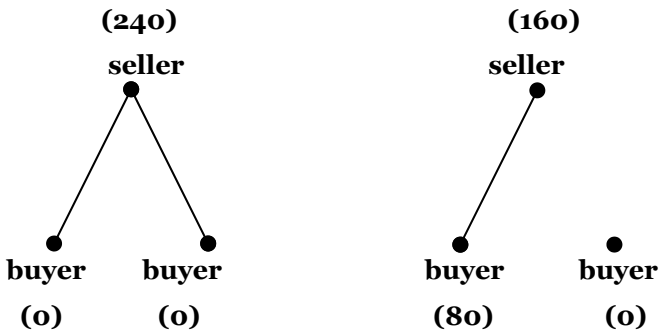


Figure 2.1. Payoffs if link costs are 0.

⁵ We ran another experiment (discussed in the next chapter) in which the players first engage in link formation, and then pursue bargaining. To be able to compare the link offer behaviour in this experiment with the link offer behaviour in the other experiment, the payoffs of players in this paper are fixed to the SPE payoffs of the bargaining regime implemented in the other experiment. However, comparison of the two settings is not the aim of this paper.

The bargaining regime of the other experiments was a three round alternating offers bargaining with a shrinking pie. Players engaged in bargaining only if they had a link with each other, and there could be at most one trade. The seller made the first offer from a pie of 240, the buyer or buyers offered from a pie of 160 in the second round, and the third round pie was 80. In this bargaining game, the unique SPE equilibrium strategy in the 2-link network was for the seller to offer zero to both buyers in the first round, and for the buyers to accept the offer. In a 1-link network it was the unique SPE for the seller to propose 80 to the buyer in the first round and for the buyer to accept the offer.

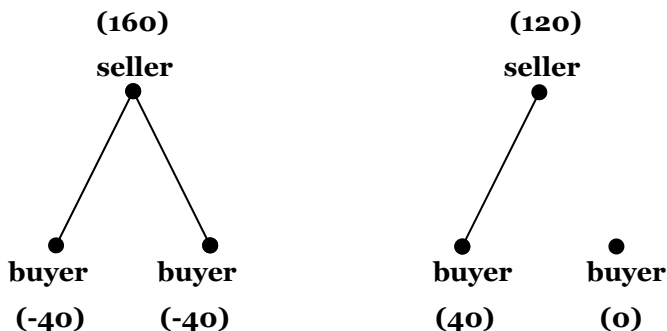


Figure 2.2. Payoffs if link costs are 40.

The Nash equilibrium of the one-shot game in pure strategies depends on the cost of a link. If the links are costless, the following six networks are Nash equilibria: the no-link network in which no player offers a link, the two 1-link networks in which the seller offers two links, the two 1-link networks in which the seller offers one link, and the unlinked buyer does not offer a link, and the 2-link network. The no-link network without link offers is a Nash equilibrium because neither the seller nor the buyers are better off by unilaterally offering a link. In the 1-link and 2-link Nash equilibrium networks, no player has an incentive to unilaterally break a link. In the 1-link networks, the unlinked buyer is not better off by offering a link, and the seller is indifferent between offering and not offering a link to the unlinked buyer. Notice that in the one-shot game, offering two links (one link) is a weakly dominating strategy for the seller (buyers); hence an equilibrium refinement such as trembling hand perfection would prescribe the 2-link network as the unique equilibrium in pure strategies.

If the link costs are 40, five networks are Nash equilibria. The no-link network with no link offers, the two 1-link networks in which the seller offers two links, and the two 1-link networks in which the seller offers one link and the unlinked buyer does not offer a link are Nash equilibria in pure strategies.⁶ Note that these five networks are also Nash equilibria if the links are costless and an explanation on why the networks are Nash equilibria is therefore omitted. Unlike the cost-0 case,

⁶ There is also a mixed strategy equilibrium in which the seller offers two links and both buyers offer a link with probability 1/2.

the 2-link network is not a Nash equilibrium because a buyer has an incentive to unilaterally delete the link with the seller, which improves her payoffs from -40 to 0 . In the one-shot game, offering two links is a weakly dominating strategy for the seller if the link costs are 40 , so the only trembling hand perfect equilibria in pure strategies are the two 1-link networks in which the seller offers two links.

The repeated game admits multiple pure strategy Nash equilibria as well as multiple subgame perfect Nash equilibria (SPE). Assuming that the players do not discount the future⁷, any combination of the Nash equilibria of the one-shot game throughout the experiment is a SPE equilibrium of the repeated game. To characterize all the SPE of the repeated game is complicated, and is beyond the scope of this paper. For a detailed exposition of the Nash and SPE equilibria of repeated games see Vega-Redondo (2003; Chapter 8).

In this paper we focus our analysis on three types of play: repeated play of the undominated strategies of the one-stage game and the two repeated game strategies that require coordinating on the formation of a 1-link network in each period. All three strategies can be supported as a SPE of the repeated game regardless of the link costs.

As the experimental literature points out, players generally avoid playing dominated strategies⁸. Hence we investigate the repeated play of the undominated strategies in this game. In the one-shot game, it is a weakly dominating strategy for the seller to offer two links regardless of the link costs. For the buyers, it is a weakly

⁷ The design of the experiment implicitly assumes that players do not discount the future such that the payoffs of the players are constant across periods.

⁸ For example, in the dominance solvable beauty contest games of Nagel (1995), few subjects chose the weakly dominated strategies. Similar results were found in the two-iteration dominance-solvable symmetric normal-form games of Stahl and Wilson (1994, 1995), and in the two- and three- iteration dominance solvable games of Costa-Gomes, Crawford, and Broseta (2001). Notice that in the network formation game considered in this paper, there is only one step of iteration needed for playing the undominated strategy.

dominating strategy to offer a link each only if the link costs are 0. There does not exist a weakly dominating strategy for the buyers if the link costs are c_0 . So, the repeated play of the undominated strategies predicts a 2-link network to be formed in every period if the link costs are 0. If the link costs are c_0 , however, the repeated formation of 2-link networks cannot be supported as an equilibrium. The growing social preference literature has shown that inequality aversion is not uncommon among players. So, we analyzed the two repeated game strategies that yield less unequal payoffs for the buyers compared to the undominated strategy play but require coordination among the players. These two strategies result in the formation of a 1-link network in each period with an alternating buyer so that not only the total payoff of the buyers is maximal but also the buyers' earnings are the same. Hence each buyer has an incentive to sustain these strategies. These two strategies differ in who coordinates the formation of the 1-link network; in the first it is the buyers (buyer coordination) and in the second it is the seller (seller coordination) who alternates the link offer. In the buyer coordination strategy, the seller offers two links every period, and buyers alternate in forming a link with the seller by taking turns in offering a link. In the seller coordination strategy, the buyers offer a link each to the seller every period, and the seller offers a link to one buyer only in an alternating fashion. We first prove that these two repeated game strategies are indeed equilibria.

Proposition 1. Buyer Coordination: Regardless of the link costs, in the repeated game, the following strategies can be supported as a SPE: the seller offers two links in every period, and the buyers alternate in offering a link to the seller.

Proof: We know that playing a stage Nash equilibrium in each period is a repeated game SPE. So, the 1-link network in which the seller offers two links, and the buyers offer a link in alternating periods is also a SPE of the repeated game regardless of the link costs. Q.E.D.

Notice that in the buyer coordination equilibrium, it is assumed that both the seller and the buyers stick to the equilibrium play if they are indifferent. For example, in the cost-0 case if the seller offers two links in every period, and buyer 1 offers a link in the odd-numbered periods, then it is also a SPE that buyer 2 offers a link in all

periods. Nonetheless, it can be shown that the buyer coordination equilibrium can be sustained as a strict equilibrium via appropriate punishment structures.

The next proposition shows how the seller coordination strategy can be supported as a SPE of the repeated game with an appropriate punishment structure.

Proposition 2. Seller Coordination: Regardless of the link costs, until the last three periods of the repeated game the following strategies can be supported as a SPE: buyers offer a link each in every period, and the seller alternates in offering a link to the buyers.

Proof: Without loss of generality assume that both buyers offer a link to the seller, and the seller offers a link to buyer 1 at odd numbered periods, and to buyer 2 at even numbered periods. Now, assuming that the seller and buyer 2 stick to the equilibrium play in every period, buyer 1 does not deviate in an odd numbered period because she is worse off by deviating. The same argument holds for buyer 2 in even numbered periods. Buyer 1 (2) does not deviate in even (odd) numbered periods, because she is not better off by deviating⁹. However, the seller has an incentive to deviate in every period because if she offers two links she earns more; i.e. 240 instead of 160 in cost-0 case, and 160 instead of 120 in the cost-40 case. So, to prevent the seller from offering two links at any period a punishment strategy is necessary.

If the seller deviates from equilibrium play and offers two links in a period, then both buyers offer no link for at least one period as a punishment (seller punishment hereafter). Notice that with this punishment structure the seller is strictly worse off by deviating: she earns 240 (160) in the deviation period and zero for the punishment period instead of earning 160×2 (120×2) for two periods if the link

⁹ As in the buyer coordination equilibrium, SPE assumes that if the players are indifferent between two actions, then they stick to the equilibrium play. The following punishment structure rules out such indifference: if say buyer 1 deviates in an even numbered period, then the seller offers two links for two consecutive periods, and buyer 2 offers a link whereas buyer 1 does not offer a link. Any deviation by buyer 1 from the punishment repeats the punishment.

costs are 0 (40). Now, a buyer prefers to deviate and form a link with the seller instead of punishing the seller. So, the following is necessary to sustain the punishment of the seller (buyer punishment hereafter). If buyer 1 deviates from not offering a link in the seller punishment, then buyer 2 offers a link to the seller for *at least* two consecutive periods, the seller offers two links in these two periods. Buyer 1 does not offer a link in these two periods. Any deviation by buyer 1 in the buyer punishment phase repeats the punishment. So, assume buyer 1 deviates in the seller punishment period, then she earns 80 (40) in the deviation period and zero in the next two periods if the link costs are 0 (40). If buyer 1 does not deviate from the seller punishment, then she earns zero for one period, and 80 (40) in total in the next two periods if the link costs are 0 (40). So buyer 1 is not better off by deviating from punishing the seller. Buyer 2, on the other hand, is strictly better off by punishing buyer 1; buyer 2 earns 80×2 (40×2) if she punishes buyer 1, and 80 (40) if she does not punish buyer 1 if the link costs are 0 (40). The seller is indifferent between punishing and not punishing buyer 1, and earns 160×2 (120×2) if the link costs are 0 (40). So, a minimum of three periods are necessary to sustain the equilibrium. In the last three periods any one-stage Nash equilibrium can be played. Q.E.D.

The next proposition provides the networks that cannot be supported as a SPE of the repeated game with any punishment structure.

Proposition 3. Regardless of the link costs, strategies leading to the repeated formation of no-link networks in which there is at least one link offer cannot be supported as a SPE of the repeated game. If the link costs are 40, strategies leading to the repeated formation of 2-link networks can also not be supported as a SPE of the repeated game.

Proof. In the eight no-link networks with at least one link offer, all players earn their minmax payoff¹⁰ such that assuming that the players best-respond, any

¹⁰ Formally, the minmax payoff is defined as the $\min_{a_{-i} \in \times A_{j \neq i}} \max_{a_i \in A_i} g_i(a_i, a_{-i})$ where $a_i \in A_i$ is player i 's pure action, $a_{-i} \in \times A_{j \neq i}$ is any combination of pure actions of players other than i , and g_i is player i 's payoff function.

combination of actions by other players cannot lower their payoff. Since there is at least one link offer by one player in these no-link networks, there exists a one period profitable deviation for at least one player. The player who is offered a link is better off by deviating and offering a link to that player. Such a deviation cannot be punished because players cannot be made worse off than their minmax payoff. Similarly, if link costs are 40, in the 2-link network, both buyers prefer to deviate by not forming a link and such a deviation cannot be punished. Q.E.D.

To sum up, the repeated play of all one-stage Nash equilibrium networks can be supported as a repeated game SPE. We focus on the buyer coordination equilibrium in which a 1-link network is formed every period, the seller offers two links every period, and the buyers alternate their link offers. We also show that the repeated play of some networks which are not one-stage Nash equilibria can be supported as repeated SPE. Among such networks, we give emphasis to the seller coordination equilibrium in which the buyers always offer two links and the seller alternates her link offer every period. Finally, there exist networks whose repeated play cannot be supported as a SPE of the repeated game.

Hypotheses

We formulate the theoretical predictions into five hypotheses. The first and the second hypotheses are based on the play of undominated strategies of the stage game. The third hypothesis is on the link formation in a coordination equilibrium. The fourth and the fifth hypotheses are on the buyers' and seller's link offers assuming the buyer and the seller coordination, respectively.

Link Formation in Undominated Strategies of the One-Shot Game

1. *The 2-link network is formed less often if the link costs are 40 than if the link costs are 0.*

If both the seller and the buyers play the weakly dominating strategies of the one-shot game, then a 2-link network is formed at all periods if the link costs are 0. If the seller plays the weakly dominating strategy of the one-

shot game, i.e., offers two links, then in equilibrium a 1-link network is formed at all periods if the link costs are 40.

Link Offers in Undominated Strategies of the One-Shot Game

2.1. Link costs do not affect the seller's link offer.

Offering two links is a weakly dominating strategy for the seller in the one-shot game irrespective of the link costs.

2.2. The buyers are less likely to offer a link if the link costs are 40 than if the link costs are 0.

Offering a link is a weakly dominating strategy for both buyers in the one-shot game if the link costs are 0 but not if the link costs are 40.

Link Formation in a Coordination Equilibrium

3. Regardless of the cost treatment, the conditional probability that a link is formed with buyer 1 (2) given that a link is formed with buyer 2 (1) is smaller than the marginal probability that a link is formed with buyer 1 (2).

In a buyer or seller coordination equilibrium one link is formed with alternating buyers in each period. So, the probability of having a 1-link network is not independent of the probability of buyer 1 or buyer 2 having a link. If we define \Pr_{Buyer1}^{link} as the probability that buyer 1 forms a link, and $\Pr_{Buyer1}^{link} |_{Buyer2}$ as the probability that buyer 1 forms a link given that buyer 2 forms a link, then by dependence of the link formation process the following holds in a coordination equilibrium:

$$\Pr_{Buyer1}^{link} > \Pr_{Buyer1}^{link} |_{Buyer2} \quad \text{and} \quad \Pr_{Buyer2}^{link} > \Pr_{Buyer2}^{link} |_{Buyer1}.$$

Link Offers in a Buyer Coordination

4. Regardless of the cost treatment, the conditional probability that buyer 1 (2) offers a link given that buyer 2 (1) offers a link is smaller than the marginal probability that buyer 1 (2) offers a link.

In a buyer coordination equilibrium, the buyers alternate on offering a link to the seller, and the seller offers two links regardless of the link costs. So, the link offer decisions of the buyers are not independent of each other. If we define $\Pr_{Buyer1}^{link\ offer}$ as buyer 1's probability of offering a link, and $\Pr_{Buyer1}^{link\ offer} |_{Buyer2}$ as the probability that buyer 1 offers a link given that buyer 2 offers a link, then by dependence of the link offers the following holds in a buyer coordination:

$$\Pr_{Buyer1}^{link\ offer} > \Pr_{Buyer1}^{link\ offer} |_{Buyer2} \quad \text{and} \quad \Pr_{Buyer2}^{link\ offer} > \Pr_{Buyer2}^{link\ offer} |_{Buyer1} .$$

Link Offers in a Seller Coordination

5. *Regardless of the cost treatment, the conditional probability that the seller offers a link to buyer 1 (2) given that she offers a link to buyer 2 (1) is smaller than the marginal probability the seller offers a link to buyer 1(2).*

In a seller coordination equilibrium, the seller offers one link to the buyers in an alternating fashion, and the buyers offer two links regardless of the link costs. So, the seller's link offer decision to a particular buyer is not independent of her link offer decision to the other buyer. If we define $\Pr_{Seller1}^{link\ offer}$ as the seller's probability of offering a link to buyer 1, and $\Pr_{Seller1}^{link\ offer} |_{Seller2}$ as the seller's probability of offering a link to buyer 1 given that she offers a link to buyer 2, then the dependence of the link offers of the seller implies the following in a seller coordination:

$$\Pr_{Seller1}^{link\ offer} > \Pr_{Seller1}^{link\ offer} |_{Seller2} \quad \text{and} \quad \Pr_{Seller2}^{link\ offer} > \Pr_{Seller2}^{link\ offer} |_{Seller1} .$$

Notice that the hypotheses are not mutually exclusive. The undominated strategy play predicts the formation of the 1-link network if the link costs are 40 but does not prescribe which 1-link network is formed. Also, the last two hypotheses can be confirmed for the same group if both the buyers and the seller coordinate on forming one link.

2.3. Experimental Design

The experiments were conducted at the CentERlab in Tilburg University, the Netherlands. A total of 63 subjects participated in 4 sessions, and each subject participated only once. Subjects were recruited through email lists of students interested in participating in experiments. There were in total 30 subjects (10 groups) in 2 sessions in the cost-0 treatment, and 33 subjects (11 groups) in 2 sessions in the cost-40 treatment. Subjects were at tables separated by partitions, such that they could not see other participants' screens but could see the experimenters in front of the room. Sessions lasted between 45 and 75 minutes, and average earnings were approximately 10.78 (9.54) Euros including a show-up fee of 5 Euros in the cost-0 (40) treatment.

First, written instructions were given to the participants and read out loud by the experimenter. A copy of the instructions is included in Appendix 2B. It was explained in the instructions that each group consisted of 3 players who were randomly selected at the beginning of the experiment and that the group composition stayed the same throughout the experiment. Subjects had no way of knowing which of the other participants were in their group during the experiment. In the instructions and the experiment, the sellers were denoted as Player 1, and one buyer was denoted as Player 2, and the other buyer as Player 3. Player roles remained fixed throughout the experiment. The game was explained as consisting of two parts: the first being about offering links to other players and the second about sharing an amount of points. Subjects were informed that the task would be repeated for 30 periods and that their final earnings comprised of the total points they earned in the experiment converted at a rate of 0.25 (0.35) Eurocents per point in the cost-0 (40) treatment plus the show up fee. In the cost-40 treatment, it was emphasized that offering a link is not costly, but that if a link is formed players who have the link each pay 40 points. After the instructions were finished, subjects played one practice period in order to familiarize them with the procedure and the screens. Subjects' understanding of the task was then assessed by asking them 3 questions to answer at their own pace. Their answers were checked one by one and when necessary the task and the payoff structure were explained again privately.

The experiment was programmed and conducted with the software z-Tree (Fischbacher 2007).¹¹ Each period started with a screen with the three boxes with labels 1, 2, and 3, representing the players of the group. An example of the subject screen is contained in the instructions of the experiment in Appendix 2B. A player's own box was always presented on top of the screen. Players simultaneously decided with whom to link, and they offered a link by clicking on the box of another player. Buyers could not link to each other. Subjects saw an arrow pointing to the other player's box when they clicked, and it was possible to undo the link offer by clicking again. When the players moved to the next screen¹², a line between two players on the screen informed them about the links that formed. If a link was offered unilaterally this was indicated with an arrow pointing to the other player. The players were informed about their own payoff in that period, the group members' payoffs in that period, and their own cumulative payoffs. In the cost-40 treatment, their total payoff was the amount of points from the link formation minus the link costs. Note that players could earn negative payoffs in this treatment in which case the money was deducted from their show-up fee. Also, the point to money conversion rate and the show-up fee were chosen such that even in the case of maximum losses in every period the subjects would not need to pay money to the experimenters. All groups in a session started each period at the same time. Thus it was not possible to identify one's group members at any point of the experiment. At the end of the experiment participants were paid privately and separately in an adjacent room.

¹¹ The program of the experiment is available from the author upon request.

¹² The subjects moved to the next phase of the experiment when all group members pressed the "Press to move" button. Also, each screen had a binding time limit of 180 seconds in the first 5 periods, and 60 seconds in the later periods.

2.4. Results

This section has four subsections. The first subsection illustrates the link formation and link offer results of the experiment in the order of the hypotheses¹³. In this subsection, first the averages¹⁴ are reported along with the relevant tests. Then, the independence of the link formations and the link offers are investigated using an exact test which will be described in detail. In the second, and third subsections, the buyers' and the seller's link offers are analysed in detail. The analyses comprise of logistic regressions on the probability of offering a link controlling for the previous period's links. The last subsection investigates the link offer behaviour at the group level using the test results on the independence of link offers. Throughout the results section, conclusions are based on the 10 percent α -level.

2.4.1. Link Formation Results

Result 1. The 2-link network was formed significantly less often if the link costs were 40 than if the link costs were 0.

Table 2.1 shows the frequencies of the number of links, and the average number of links per treatment. The '0 links' column shows that there were few periods with no links. The average frequency of one links was not significantly lower in the cost-0 treatment than in the cost-40; in the cost-0 treatment 1-link networks were formed

¹³ Unless otherwise stated, a group of one seller and two buyers interacting over 30 periods is treated as one independent observation. There are 10 independent observations in the cost-0 treatment and 11 in the cost-40 treatment. The p -values reported for between-treatment comparisons are based on the Mann-Whitney test; p -values reported for within-treatment comparisons are based on the Wilcoxon matched-pairs signed-ranks test. We use a one-tailed (two-tailed) test when the hypothesis is (is not) directional.

¹⁴ Throughout the results section, we will focus on the average number of links and average number of link offers. For the sake of simplicity and readability, the words "average number of" are dropped from the description of the results wherever the meaning is obvious. For example, instead of buyers' (seller's) average number of link offers, buyers' (seller's) link offers is used. Likewise, differences in link offers refers to differences in the average number of link offers.

in 62% of the periods, and in the cost-40 treatment in 70% of the periods. The frequency of the two links was significantly lower in the cost-40 treatment (21%) than in the cost-0 treatment (34%). The number of links was significantly lower in the cost-40 treatment (1.13) than in the cost-0 treatment (1.31). To sum up, in line with the undominated strategy equilibrium predictions, the 2-link network was formed less often in the cost-40 treatment than in the cost-0 treatment.

Table 2.1. Average frequency and number of links^a

	0 links	1 link	2 links	Average number of links
Cost-0	3.7 (4.0)	62.0 (25.4)	34.3 (27.7)	1.31 (0.30)
Cost-40	8.2 (9.2)	70.3 (25.6)	21.5 (23.9)	1.13 (0.26)
<i>p</i>	.338 ^c	.228 ^b	.095 ^b	.063 ^b

^a Standard deviations are in parentheses. ^b 1-tailed exact test ^c 2-tailed exact test

The results on formed links were further reflected in the average payoffs of the seller and the buyers. Whereas the average gross seller payoff was significantly lower in the cost-40 treatment due to the formation of fewer 2-link networks, the average payoff of the buyers was not significantly higher if the link costs were 40. Table 2C.1 in the Appendix 2C presents the average payoffs of the seller and the buyers in both cost treatments as well as the one-tailed exact *p*-values¹⁵.

Result 2.1. The seller's link offers were not significantly different between the cost treatments.

Table 2.2 shows the average number of link offers per period as a function of link costs and player roles. The second column of the table is the average number of links the seller offered to each buyer per period. The third column states the average number of links each buyer offered to the seller. The sellers offered on average 0.77 links per buyer in the cost-0 treatment, and 0.71 links in the cost-40 treatment. The difference in the average link offers of the sellers between the cost treatments was not significant.

¹⁵ Assuming undominated strategy play of the one-shot game, the seller's payoff is lower if the link costs are 40, but the average buyer payoff is higher if the link costs are 40.

Table 2.2 Average number of link offers^a

	Seller	Buyers
Cost-0	0.77 (0.15)	0.77 (0.16)
Cost-40	0.71 (0.18)	0.74 (0.16)
<i>p</i>	.415 ^c	.308 ^b

^aStandard deviations are in parentheses. ^b 1-tailed exact test ^c 2-tailed exact test

Result 2.2. The buyers' link offers were not significantly lower in the cost-40 treatment than in the cost-0 treatment.

As shown in the third column of Table 2.2, the buyers' average number of link offers was 0.77 in the cost-0 treatment, and 0.74 in the cost-40 treatment. So, the buyers' link offers were not significantly lower in the cost-40 treatment than in the cost-0 treatment.

To conclude, the result of the seller's and the buyers' link offers were not completely in line with the predictions based on the undominated strategies of the one-shot game. Although there was no significant difference in the seller's link offers across the cost treatments, the seller's link offers were less than two links in both treatments. Also, the buyers' link offers were not significantly lower in the cost-40 treatment.

The link offers of the seller and the buyers averaged over segments of three periods are illustrated in Figure 2.3, and Figure 2.4, respectively. As shown in Figure 2.3, the link offer of the seller averaged over three periods varied between 0.70 and 0.83 in the cost-0 treatment, and between 0.67 and 0.76 in the cost-40 treatment. Although the link offer of the seller was lower in the cost-40 treatment than in the cost-0 treatment in all segments but one, the differences between the cost treatments were not statistically significant except in the fourth segment. Similarly, the averaged link offer of the buyers was not significantly higher in the cost-0 treatment than in the cost-40 treatment. As depicted in Figure 2.4, in the cost-0 treatment the link offer of the buyers was between 0.73 and 0.85, and in the cost-40 treatment the average was between 0.62 and 0.79. Also, in both cost treatments

the link offer of the buyers seemed to have a downward trend with increasing periods.

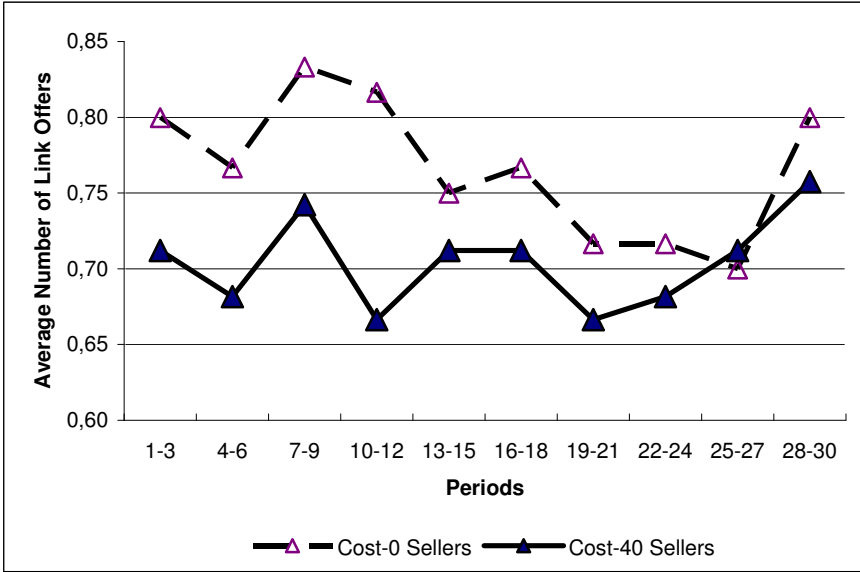


Figure 2.3. Average Number of Link Offers of the Seller

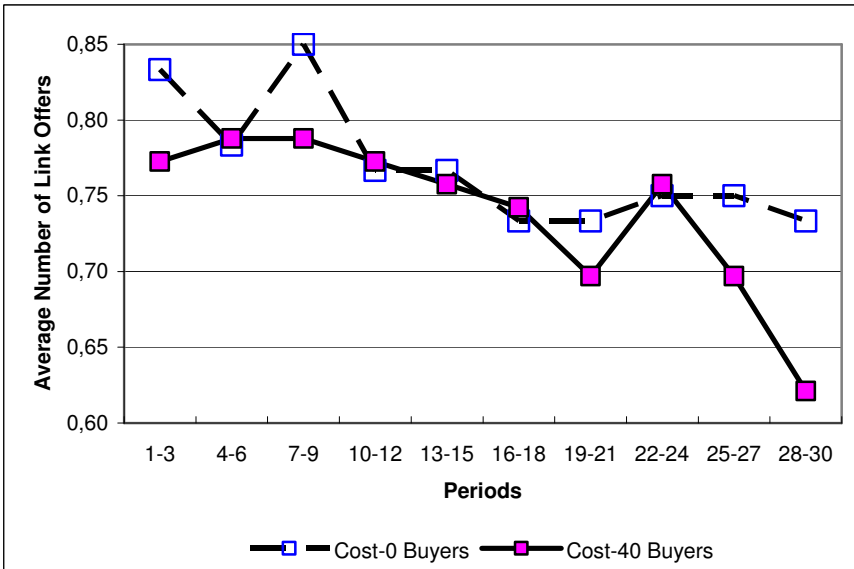


Figure 2.4. Average Number of Link Offers of the Buyers

Result 3. *Regardless of the cost treatment, the conditional probability that a link was formed with buyer 1 (2) given that a link was formed with buyer 2 (1) was significantly smaller than the marginal probability that a link was formed with buyer 1 (2).*

Table 2.3 illustrates the average number of periods buyer 1 and buyer 2 formed a link with the seller, and the expected number of periods in parentheses. The frequencies in the cells were calculated by averaging the corresponding cell frequencies of all groups in a treatment. The expected frequencies of the cells corresponding to the empty network, given the marginal frequencies of Table 2.3, were 3.61 and 5.62 for the cost-0 and cost-40 treatment respectively. These numbers exceeded the observed frequencies by 2.51 (3.61–1.10) and 3.16 (5.62–2.46) in the cost-0 and cost-40 treatment, respectively, which were in line with our hypothesis that the conditional probability of having a link is larger if the other buyer does not have a link. To test the hypothesis statistically we must take into account that Table 2.3 is the result of combining frequency distributions of groups that have substantial differences in their marginal frequencies. We first describe the logic of the test.

Table 2.3 Observed and expected number of links^{a,b}

		Buyer 2	
		No link	Link
		Cost-0	
Buyer 1	No Link	1.10 (3.61)	9.40 (6.90)
	Link	9.20 (3.70)	10.30 (12.81)
		<i>p</i> : < .001 ^b	
		Cost-40	
Buyer 1	No Link	2.46 (5.61)	9.73 (6.57)
	Link	11.36 (8.21)	6.46 (9.61)
		<i>p</i> : < .001 ^b	

^a Expected number of periods are in parentheses. ^b 1-tailed exact test

To test the null hypothesis of the independence of link formation across all groups within a treatment, we used the p -values of an independence test for each group. Let X_j denote the random variable corresponding to both buyers having a link with the seller, and x_j the observed value of that random variable for group $j=1, \dots, J$. Also, let the observed frequencies of no (one) link for buyer 1 and buyer 2 be denoted as r_{1j} and c_{1j} (r_{2j} and c_{2j}), respectively. The probability that X_j is at most x_j for group j given r_{1j} , r_{2j} , c_{1j} , and c_{2j} , $\Pr(X_j \leq x_j \mid r_{1j}, r_{2j}, c_{1j}, c_{2j})$ or $\Pr(X_j \leq x_j)$ for short, is also the p -value of the independence test of link formation at the group level. Note that, the smaller the x_j , the more evidence there is for dependence in the form of coordination on forming the 1-link network. This probability has a hypergeometric distribution and equals the one-tailed p -value of the Fischer exact test. Under the null hypothesis of independence, the probability that the p -value equals $\Pr(X_j \leq x_j)$ is equal to $\Pr(X_j \leq x_j) - \Pr(X_j \leq x_j - 1)$. An overview of the p -values from the independence tests at the group level is provided in the Appendix 2C Table 2C.2.

Assuming the independence of link formation across all groups within a treatment,

$\Pr(X_1 \leq x_1 \cap X_2 \leq x_2 \cap \dots \cap X_J \leq x_J) = \prod_{j=1}^J \Pr(X_j \leq x_j)$. This product can be calculated

for all possible value combinations of (X_1, X_2, \dots, X_J) . Under the null hypothesis the

probability of the value of the product $\prod_{j=1}^J \Pr(X_j \leq x_j)$ equals

$\prod_{j=1}^J [\Pr(X_j \leq x_j) - \Pr(X_j \leq x_j - 1)]$. Lower values of the product $\prod_{j=1}^J \Pr(X_j \leq x_j)$

correspond to more negative dependence. The one-tailed p -value of the test of independence of link formation across all groups is then the cumulative probability

that the value of product $\prod_{j=1}^J \Pr(X_j \leq x_j)$ is smaller or equal to the value of this

product observed across the groups. This probability can either be found by computing all such products or by simulation. We found the p -values by simulation after calculating the value of the product in 100,000 draws from the joint hypergeometric distributions.

Applying the test to the link distributions of the groups resulted in a p -value smaller than .001 for both cost treatments. Thus, in both treatments there was evidence for coordination behaviour and the proportion of periods in which a 1-link network was formed was higher than the expected proportion of periods under the independence assumption.

Result 4. *Regardless of the link costs, the probability that buyer 1 (2) offers a link given that buyer 2 (1) offers a link was significantly smaller than the probability that buyer 1 (2) offers a link.*

Table 2.4 illustrates the average, and expected number of periods buyer 1 and buyer 2 offered a link to the seller. The expected frequencies exceeded the observed frequencies corresponding to the empty network by 1.35 (1.55–0.20) and 0.91 (2.00–1.09) for the cost-0 and cost-40 treatment respectively. This was in line with our hypothesis that the conditional probability of a buyer offering a link is larger conditional on the other buyer not offering a link. Applying the same test as in Result 3, we rejected the null hypothesis of independence with p -values smaller than .001 for both cost treatments. Thus, in both cost treatments there was evidence for buyer coordination.

Table 2.4 Observed and expected number of periods of buyer link offers^a

		Buyer 2	
		No link Offer	Link Offer
		Cost-0	
Buyer 1	No Link Offer	0.20 (1.55)	5.70 (4.35)
	Link Offer	7.70 (6.35)	16.40 (17.75)
		Cost-40	
Buyer 1	No Link Offer	1.09 (2.00)	5.64 (4.73)
	Link Offer	7.82 (6.91)	15.46 (16.36)

^a Expected number of periods are in parentheses. ^b 1-tailed exact test.

Result 5. In both cost treatments, the probability that the seller offers a link to buyer 1 (2) given that the seller offers a link to buyer 2 (1) was significantly smaller than the probability the seller offers a link to buyer 1(2).

Table 2.5 shows the average and expected number of periods the seller offered a link to buyer 1 and buyer 2. The expected frequencies were 1.63 (1.63–0.00) and 2.48 (2.57–0.09) larger than the observed frequencies in the cells corresponding to the empty network for the cost-0 and cost-40 treatment, respectively. The *p*-values of the test of independence were smaller than .001 in both cost treatments, and the null hypotheses of independence were rejected. Thus, in both cost treatments there was evidence for seller coordination.

Table 2.5 Observed and expected number of periods of seller’s link offers^a

		Buyer 2	
		No link Offer	Link Offer
		Cost-0	
To Buyer 1	No Link Offer	0.00 (1.63)	7.50 (5.88)
	Link Offer	6.50 (4.88)	16.00 (17.63)
		Cost-40	
To Buyer 1	No Link Offer	0.09 (2.57)	7.55 (5.07)
	Link Offer	10.00 (7.52)	12.36 (14.84)

^a Standard deviations are in parentheses. ^b 1-tailed exact test

2.4.2. Coordination Strategies of the Buyers

The theoretical predictions arising from the use of undominated strategies in equilibrium state that both buyers offer a link in the cost-0 treatment, and offer one link in total in the cost-40 treatment. However, the buyers have an incentive to coordinate on other equilibria that ensure a maximal payoff. Result 3 to 5 show that the players coordinated in forming one link. So, to further investigate the buyer and seller coordination strategies we ran logistic regressions on the buyers’ link offer

decisions given the link offer decisions of the previous period, and the results are displayed in Table 2.6.

The model captures the effect of the following variables in the previous period on the probability of a buyer offering a link to the seller: a 1-link network in which the buyer forms a link (own link), a 1-link network in which the other buyer is linked (other link), and a two link network (two links)¹⁶. Thus, we controlled for the effect of the variables which are predicted to have an effect according to the coordination equilibria. We also controlled for period, and all the interaction effects with period. Period was grouped into 6 segments and centered, i.e for the periods 1-5, 6-10,...,25-30 the values of the variable period were -2.5 , -1.5 ,..., 2.5 respectively. We ran separate logistic regressions for the two cost treatments because the results of the logistic regression containing both treatments showed strong effects of the treatment with the variables own link times period, other link times period, and two links times period. Such strong effects suggested the use of different strategies in the two treatments. The logistic regression results including the treatment and the interactions with the treatment are shown in the Appendix 2C Table 2C.3. Table 2.6 shows the coefficients, and the corresponding p -values of the variables from the regression on the cost-0 (cost-40) treatment in the second and third (fourth and fifth) columns. The p -values are one-tailed for the variables in which an effect is predicted by the buyer or seller equilibrium, and two-tailed otherwise. The standard errors are stated in parentheses. The last two columns of the table show the predictions of the buyer and the seller coordination equilibrium. A positive (negative) sign indicates that the equilibrium predicts a positive (negative) effect of that variable on the buyer's probability of offering a link. For all the other variables, the buyer or the seller coordination equilibria have no prediction on their effect.

¹⁶ So, the network effects were captured with three dummies, and the constant in the regression referred to the empty network.

Table 2.6 A buyer's probability of offering a link to the seller^{a,b,c}

	<i>Cost-0</i>		<i>Cost-40</i>		<i>Buyer</i>	<i>Seller</i>
	Coeff.	<i>p</i>	Coeff.	<i>p</i>	<i>Eq</i>	<i>Eq</i>
Period	0.062 (0.325)	.848 ^c	-0.379 (0.164)	.021 ^c		
Own Link _{t-1}	-1.322 (0.694)	.029 ^b	0.106 (0.625)	.568 ^b	-	
Other Link _{t-1}	2.146 (1.126)	.029 ^b	0.884 (0.731)	.114 ^b	+	
Two Links _{t-1}	0.627 (0.880)	.762 ^b	0.824 (0.514)	.946 ^b		-
Period × Own Link _{t-1}	-0.454 (0.375)	.225 ^c	0.354 (0.179)	.048 ^c		
Period × Other Link _{t-1}	0.214 (0.482)	.657 ^c	0.003 (0.243)	.991 ^c		
Period × Two Links _{t-1}	0.271 (0.346)	.435 ^c	0.502 (0.207)	.016 ^c		
Constant	1.251 (0.778)	.108 ^c	0.604 (0.476)	.205 ^c		

^a Robust standard errors at the group level between parentheses.

^b One-tailed *p*-values. ^c Two-tailed *p*-values.

The results of the analysis on the cost-0 treatment show that each buyer's link offer was negatively affected by the formation of a 1-link network with an own link in the previous period regardless of the period. The formation of a 1-link network by the other buyer in the previous period significantly increased the probability of a buyer's link offer regardless of the period. The formation of two links in the previous period, however, did not significantly decrease the probability of the buyer's link offer. The effect of period as well as the interaction effects of the period

with own link, other link, and two links were not significant. So, in the cost-0 treatment a buyer's link offer decisions were consistent with the buyer coordination equilibrium predictions because of the significant effect of own link and other link. Contrary to the seller coordination equilibrium prediction, the effect of the two links was positive.

In the cost-40 treatment, a buyer's own link had a positive effect in the last three period segments because the effect of own link was equal to $0.106+0.354\times\text{Period}$. Regardless of the period, the other buyer's link did not have a significantly positive effect on the buyer's link offer. The effect of two links was equal to $0.824+0.502\times\text{Period}$, which was positive for all periods except the first one. Period had a significantly negative effect on the buyer's link offer probability if there was no link formed or the other link was formed in the previous period. So, contrary to the buyer equilibrium predictions, the effect of an own link was positive in later periods, and the other buyer's link did not have a significantly positive effect. Also, there was no evidence for the seller coordination since the effect of two links was not significant, and positive. Thus, in the cost-40 treatment, there was no evidence for the buyer or the seller coordination.

To sum up, there was evidence for the buyer coordination in the cost-0 treatment, but not in the cost-40 treatment. In both cost treatments, there was no evidence for the seller equilibrium.

2.4.3. Coordination Strategies of the Seller

The theoretical predictions arising from the use of undominated strategies of the one-shot game in equilibrium state that the seller offers two links in both cost treatments. However, we find evidence for both buyer and seller coordination in results four and five. To further investigate the strategies of the seller we ran logistic regressions on the seller's link offer decisions given the links formed in the previous period; the results are displayed in Table 2.7.

Table 2.7 Seller's probability of offering a link to a buyer^{a, b, c}

	<i>Cost-0</i>		<i>Cost-40</i>		<i>Seller Eq</i>
	Coefficient	<i>p</i>	Coefficient	<i>p</i>	
Period	-0.040 (0.209)	.848 ^c	0.187 (0.126)	.139 ^c	
Own Link _{t-1}	-0.796 (0.671)	.118 ^b	-0.518 (0.725)	.238 ^b	-
Other Link _{t-1}	1.980 (0.674)	.002 ^b	-0.967 (0.626)	.938 ^b	+
Two Links _{t-1}	1.128 (0.812)	.165 ^c	0.448 (0.439)	.307 ^c	
Period × Own Link _{t-1}	-0.093 (0.250)	.712 ^c	-0.151 (0.110)	.171 ^c	
Period × Other Link _{t-1}	0.037 (0.232)	.872 ^c	-0.172 (0.145)	.237 ^c	
Period × Two Links _{t-1}	0.125 (0.258)	.627 ^c	-0.061 (0.249)	.808 ^c	
Constant	0.746 (0.506)	.140 ^c	1.344 (0.256)	<.001 ^c	

^a Robust standard errors at the group level between parentheses.

^b One-tailed *p*-values. ^c Two-tailed *p*-values.

Similar to the analysis with the buyers' link offers, we ran separate analyses for the two cost treatments. In the logistic regressions the seller's probability of offering a link to a particular buyer was the dependent variable with the same control variables mentioned in subsection 2.4.2. So, the variables that account for the formation of 1-link or 2-link networks, and that the equilibria have predictions on were included in the regression and period was grouped into 6 segments. The coefficients, and the corresponding *p*-values of the variables from the regression on the cost-0 (40) treatment are shown in the second and third (fourth and fifth)

columns of Table 2.7. The standard errors are stated in parentheses. The last column of the table shows the predictions of the seller coordination equilibrium. The buyer equilibrium does not have predictions for the effect of any of the variables. A positive (negative) sign indicates that the seller equilibrium predicts a positive (negative) effect of that variable on the seller's probability of offering a link. No sign indicates that the seller equilibrium does not prescribe a prediction for that variable. The p -values are one-tailed for the variables in which an effect is predicted by seller equilibrium, and two-tailed otherwise. Also, the logistic regression results including the treatment and the interactions with the treatment are included in the Appendix 2C Table 2C.4. This analysis showed strong effects of the treatment with the variable other link suggesting the use of different strategies in the two treatments.

In the cost-0 treatment, the results of the regression show that the formation of a 1-link network with a particular buyer in the previous round did not significantly decrease the probability of the seller's link offer to that buyer. In line with the seller equilibrium the seller's probability of offering a link to a buyer significantly increased with the formation of a 1-link network with the other buyer. In sum, there was some evidence in line with the seller coordination in the cost-0 treatment.

The cost-40 treatment results demonstrate that the probability of the seller's link offer to a particular buyer did not significantly decrease (increase) after the formation of an own link (other link) in the previous period. Also, the variables two links, period, and the interaction effects with the period were not significant. So there was no support for the seller equilibrium in the cost-40 treatment.

To sum up, there was some evidence in the cost-0 treatment for the seller equilibrium, but not in the cost-40 treatment. Note that, the buyer equilibrium had no predictions on the effect of any of the variables.

2.4.4. Link Formation Results at the Group Level

Results 3 to 5 provide evidence for the coordination of link formation, link offers of the buyers and link offers of the seller in both cost treatments. The logistic regression results for the cost-0 treatment are parallel to these results such that buyer coordination predictions were supported by the strategies of the buyers, and there was some evidence in support of the seller coordination. However, in the cost-40 treatment, the logistic regression results show no evidence for the buyer coordination or the seller coordination. So, there was evidence for coordination in the cost-40 treatment based on the independence tests, but no such evidence was found from the logistic regressions. The mixed results might arise from different strategies that different groups employed within the cost-40 treatment. It is also possible that players used strategies other than buyer or seller equilibrium which led to the formation of a 1-link network in every period. As an example, the seller might form a link with the same buyer for 15 consecutive periods, and form a link with the other buyer in the remaining 15 periods. Logistic regression results do not pick up such coordination behaviour. Therefore, we investigated link offer decisions at the group level using the exact test that was explained in Result 3. Note that this exact test successfully picks up different types of coordination behaviour such as the one in the previous example.

To categorize the groups according to their strategies, we mainly relied on the test results of the independence of the buyers' link offers (as in Result 4) and the independence of the seller's link offers (as in Result 5). To be precise, if the test results of the independence test for the buyers' (seller's) link offers was significant, then that group was classified as playing the buyer (seller) coordination if it also satisfied the following conditions. For the buyer coordination, the difference between the following two numbers was not higher than 10: the number of periods buyer 1 offered a link to the seller and buyer 2 did not offer a link, and the number of periods buyer 2 offered a link to the seller and buyer 1 did not. Similarly, for the seller coordination, the difference between the following two numbers was not higher than 10: the number of periods the seller offered a link only to buyer 2, and the number of periods the seller offered a link only to buyer 1. The rationale for the

additional conditions was to prevent wrongly specifying the groups in which there was coordination on forming one link with the *same* buyer in most of the cases. This situation is referred to as ‘one buyer only’. In such a situation the link offers of the buyers might significantly depend on each other (likewise for the seller), hence leading to a significant p -value in the test for independence. However, since in this paper coordination is defined as forming one link that maximizes the payoff of each buyer in a repeated setting while maintaining equality, the aforementioned situations were not classified as coordination¹⁷.

A group was said to play *similar* to buyer (seller) coordination equilibrium if there was no significant p -value for the independence of the buyers’ (seller’s) link offers, but a 1-link network was formed in majority of the periods, and the above condition for the buyers (seller) held. An overview of the independence test results for each group is included in the Appendix 2C Table 2C.2. In this table, the groups are arranged according to the order of their mention in this section. All reported p -values in this section are one-tailed.

In the cost-0 treatment 7 out of 10 groups engaged in coordination. Among these seven groups there was one group with both buyer and seller coordination, three groups played the buyer coordination, and the other three groups played the seller coordination. The remaining three groups of the cost-0 treatment played similar to the undominated strategy of the one-shot game, i.e., these groups formed two links

¹⁷ Limiting the maximum difference between link offers to 10 periods or using a similar rule does not affect the categorization of the groups dramatically. For the differences between link offers between 10 and 25, the categorization would be the same as in this paper. Dropping these conditions altogether would lead to a change in the categorization of only one group. Making the conditions stricter would, however, lead some groups to be dropped from the coordination category depending on how small the chosen number is. Choosing another rule such as limiting the difference between the formed links of buyer 1 and buyer 2 to 10 would lead to the same categorization as in this paper. Nonetheless, there is a need to define a coordination index or heuristic that would lead to consistent and meaningful categorizations. The author of this paper is not aware of any such index that is applicable to this analysis.

in most periods. The categories of strategies in both cost treatments along with the number of groups playing those strategies are summarized in Table 2.8.

Table 2.8 Number of groups playing different strategies

	Cost-0	Cost-40
Buyer & Seller Coordination	1	2
Buyer Coordination	3	1
Seller Coordination	3	1
<i>Similar</i> to Coordination	-	2
One Buyer only	-	3
(Un)dominated Strategy	3	2
Total	10	11

In the first group of the cost-0 treatment, both buyer and seller coordination strategy play was observed; the buyers offered in total one link in 21 periods and the seller offered in total one link in 24 periods. 1-link networks were formed with each buyer for 13 periods.

In groups 2 to 4, there was similar play to the buyer coordination equilibrium; the buyers offered in total one link in 25, 23, and 24 periods, and the seller offered two links in 13, 19, and 16 periods. In these groups, a 1-link network was formed in 25, 22, and 24 periods with the buyers having roughly the same number of 1-link networks.

Third, in the three groups with similar play to the seller coordination equilibrium (groups 5 to 7), the buyers offered two links in 15, 30, and 24 periods, the seller offered one link in 27, 18, and 19 periods, and a 1-link network was formed in 26, 18, and 19 periods, respectively. In these three groups there was one buyer who always offered a link. Note that in none of these groups there was evidence for punishment after the formation of two links.

Finally, the repeated play of the undominated strategy equilibrium of the one-shot game was observed in three groups. In these three groups, the sellers offered two

links in 30, 30, and 20 periods, both buyers offered a link in 22, 25, and 22 periods, and as a result, two links were formed in 22, 25, and 16 periods respectively. Also, in all the three groups there was evidence of an attempted buyer coordination that failed such that one buyer alternated between offering and not offering a link at the beginning of the game, but the other buyer did not reciprocate. Notice that such repeated play is also a SPE of the game.

In the cost-40 treatment, 4 out of 11 groups played the coordination equilibria, and two other groups played similar to the coordination equilibria. Among the four coordinating groups, in two groups both buyer and seller coordination were observed, in one group there was buyer coordination, and one group played the seller equilibrium. In the two groups that played similar to the coordination equilibria, one group's play was similar to the buyer equilibrium, and the other group's play was similar to the seller equilibrium.

In the remaining five groups of the cost-40 treatment, two types of play other than coordination were observed. In three groups a 1-link network was observed almost exclusively with the same buyer, and in two groups there was "dominated strategy" play, leading to the formation of 2-link networks in the majority of the periods. Notice that such a strategy was dominated for the buyers in the cost-40 treatment.

In the groups 1 and 2 in which both the buyers and the seller coordinated, the buyers offered one link in total in 22, and 26 periods, and the sellers offered one link in 28, and 25 periods. In these two groups a 1-link network was formed with alternating buyers in 30, and 28 periods respectively. In group 3 there was buyer coordination; the buyers offered one link in total in 21 periods, the seller offered two links in 20 periods, and a 1-link network was formed in 18 periods. Group 4 could be considered as playing the seller coordination. In this group the buyers offered two links in 21 periods, the seller offered one link in 17 periods, and a 1-link network was formed in 16 periods. In this group the seller also formed two links in some periods without being punished afterwards.

Groups 5 and 6 could be considered as playing similar to the coordination equilibria. In group 5, the buyers offered one link in total in 17 periods, and the seller offered two links in 30 periods. A 1-link network was formed in 17 periods. In this group the buyers seemed to learn to alternate their link offers over time albeit not totally successfully. Group 6 could be considered as playing the seller coordination. The buyers in this group offered two links in 19 periods and the seller offered one link in 16 periods. In this group, 1-link networks were formed in 18 periods. However, there was not enough power to reject the independence hypothesis for the seller's link offer decisions.

Different from the cost-0 treatment, in the cost-40 treatment there were groups in which in almost all periods a 1-link network was formed with the same buyer. In groups 7 to 9, the buyers offered two links in 6, 24, and 28 periods, and the sellers of these groups offered a link to the *same* buyer in almost all periods (27, 29 and 27 periods respectively). In the first group both buyers offered two links in six out of the first nine periods, and after the ninth period one buyer did not offer a link whereas in the latter two groups buyers offered two links in most periods. Although in the last group the independence test showed a significant effect for the seller's link offers (p-value: .007), the coordination condition was not satisfied for the seller, i.e., the seller offered one link to buyer 1 in 27 periods, one link to buyer 2 in 2 periods and the difference between the two was more than 10. Notice that the strategies of the players in these three groups constitute a SPE of the repeated game¹⁸. Also, in all groups the seller offered two links in the last period implying that the sellers played equilibrium strategies until the last period in which a deviation could not be punished.

The last two groups' play was similar to the undominated strategy play of the one-shot game in the cost-0 treatment. In these two groups the seller offered two links in 22, and 26 periods, and the buyers offered two links in 22, and 24 periods

¹⁸ It can be shown that it is a SPE of the repeated game that both buyers always offer a link, and the seller always offers a link to the same buyer. If the seller deviates and offers two links, then both buyers punish the seller for at least one period by not offering a link.

respectively. As a result two links were formed in 15, and 22 periods, respectively which led to substantial losses for both buyers. Although given that the seller offered two links, and one buyer always offered a link, the other buyer was better off by not offering a link, both buyers did not deviate from offering a link in the majority of the periods. As in the groups that played the undominated strategy in the cost-0 treatment, in these two groups one buyer tried to coordinate at the beginning of the game, but the other buyer did not reciprocate and kept on offering a link to the seller in every period. Note that such buyer behaviour was not only contrary to the repeated SPE predictions, but also to the predictions of the inequality aversion models such as Fehr and Schmidt (1999), Bolton and Ockenfels (2000), and a preference for efficiency¹⁹.

To sum up, in the cost-0 treatment, seven out of 10 groups engaged in some sort of coordination behaviour. In the other three groups, the undominated strategy play was prevalent. In the cost-40 treatment, four out of 11 groups played coordination equilibria. In two other groups the strategies were similar to coordination play. In three groups players coordinated on forming one link with the *same* buyer only. Finally, there were two groups who played contrary to the theoretical predictions. So, in both cost treatments the majority of the groups played similar to the coordination predictions using the buyer or the seller coordination strategies or both. Remarkably, the number of coordinating groups did not increase with link costs.

2.5. Discussion and Conclusion

In this paper we examined the impact of the link costs on network formation. Particularly, we addressed the questions of whether the players coordinated on forming the non-competitive networks, who facilitated the coordination, and whether link costs affected the coordination behaviour.

¹⁹ Assuming that the seller always offers two links, and one of the buyers always offers one link as was the case in these three groups, then according to these models the other buyer is better off by not offering a link regardless of the parameter values.

To investigate these questions we implemented a finitely repeated game between one seller and two potential buyers. The seller decided whether to form one or two links with the buyers and the buyers simultaneously decided whether to form a link with the seller. If a competitive network was formed in which the seller was linked to both buyers, then the seller earned the entire surplus. In a one link network the surplus was shared between the seller and the linked buyer. We studied the repeated game subgame perfect equilibria with and without link costs. If the players used undominated strategies of the one-shot game, the presence of link costs was predicted to reduce the occurrence of competitive networks. We have shown that, regardless of the link costs, the formation of one link with alternating buyers in which the buyers anti-coordinate their actions and take-turns was a repeated game subgame perfect equilibrium. Moreover, coordination on forming one link that is facilitated by the seller could also be supported as a subgame perfect equilibrium. We thus investigated whether coordinated existed, and if so who facilitated the coordination.

We found that with link costs, a competitive network in which the seller was linked to both buyers was less likely to be formed. Although the average number of links was significantly lower with link costs, the seller's or the buyers' link offers were not significantly different across the cost treatments. Thus, both the seller and the buyers coordinated their link offers if the link costs were positive so as to form the competitive network less often. Moreover, sellers did not employ the weakly dominating strategy (of the one-shot game) of offering two links regardless of the link costs.

We found strong evidence for coordination on forming one link in both cost treatments. The test results on both treatments showed highly significant dependence of i) the link formation of one buyer on the link formation of the other buyer, ii) a buyer's link offer on the link offer of the other buyer, and iii) the seller's link offer to one buyer on the seller's link offer decision on the other buyer. The logistic regressions that controlled for the effect of the links formed in the previous period on the buyer's and the seller's link offer probability provided some support

for both the buyer and the seller coordination strategies if the links were costless. However, the logistic regression results were contrary to the buyer or seller coordination strategies if the link costs were positive. Such mixed results in the positive link cost treatment resulted from different strategies that groups employed if the links were costly.

The analysis at the group level showed that if the links were costless, seven out of 10 groups engaged in some sort of coordination behaviour. If the link costs were positive, four out of 11 groups played coordination equilibria, and two other groups played similar to coordination equilibria. Among the coordinating groups, some engaged in the buyer coordination, some in the seller coordination, and some in both. So, in both cost treatments the majority of the groups played *similar* to the coordination equilibria. Notably, and contrary to what one might expect, the number of coordinating groups did not increase with the link costs.

Our group level results pointed to two types of play that deserves special attention. First, if the links were costly, there were three groups in which one link was formed with the same buyer in almost all periods. In these three groups, the seller facilitated the formation of one link networks but did not “coordinate”. So, clearly, the sellers of these groups did not care about the payoff inequality across the buyers. The second type of play that deserves special attention is the dominated strategy play: If the links were costly in two groups two links were formed in most periods causing the buyers to earn negative payoffs. Such buyer behaviour cannot be explained by the profit maximizing rational agents even if inequality aversion or preference for efficiency is taken into consideration. Thus, these buyers might have social preferences that cannot be captured with the inequality aversion models .

Our findings on anti-coordinating on a mutually beneficial outcome by alternating, i.e., buyer coordination, was in line with the findings of the repeated chicken and battle of the sexes games investigated by Rapoport, Guyer and Gordon (1976) and Arifovic et al. (2006) respectively. Different from these studies, however, in our game anti-coordination involved more than two players. Also, a third party who had a weakly dominating strategy in the one-shot game could also coordinate on

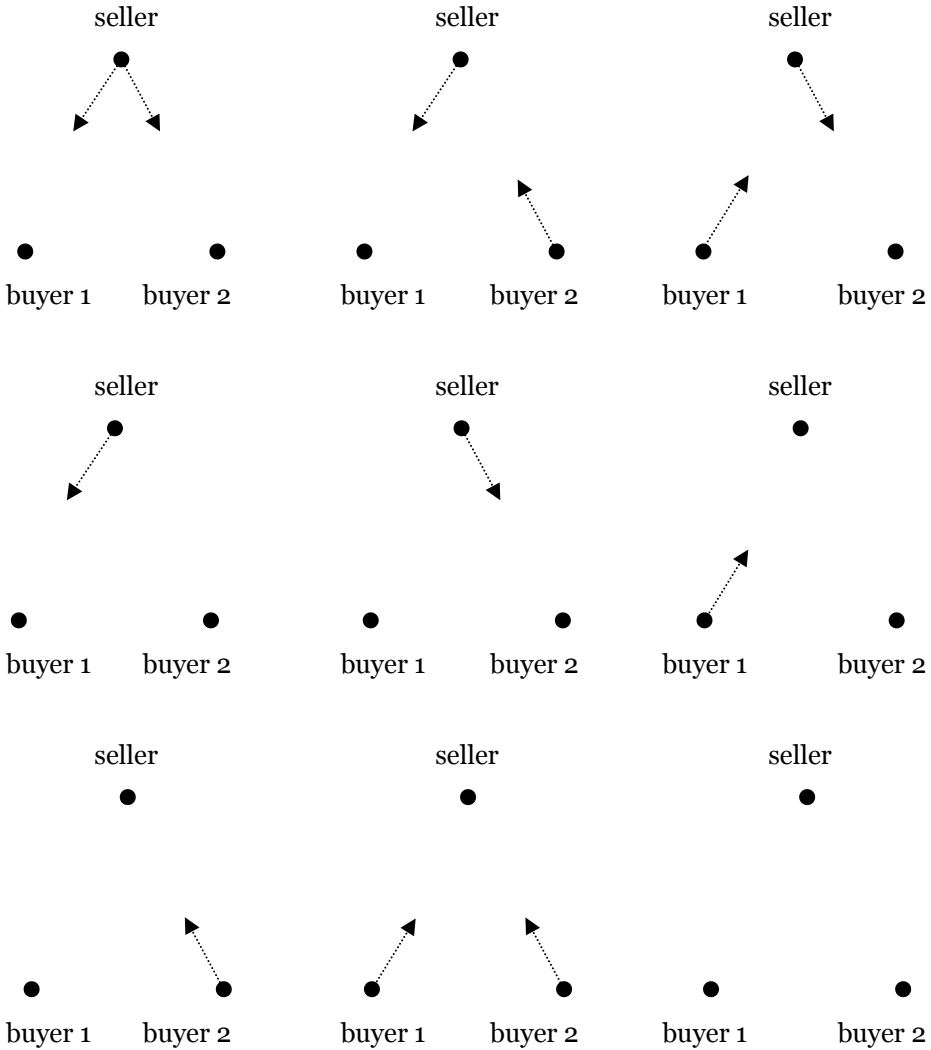
the mutually beneficial outcome of the other two players. We found evidence for both coordination and anti-coordination behaviour in a 3-player game with a rich setting. For future research, it would be interesting to study (anti-) coordination behaviour in network formation games of more than three players. Also, running our experiments with random matching would provide insights on whether the seller behaviour depended on the repetition of the game or was driven by a preference for distributional equality.

In sum, the present paper shows that in markets that require connections to be established between transacting agents, coordinating on the non-competitive outcome which maximizes the long-run payoffs of the long side of the market is common. Moreover, coordination does not only arise from the behaviour of the long side of the market, but from the short side as well.

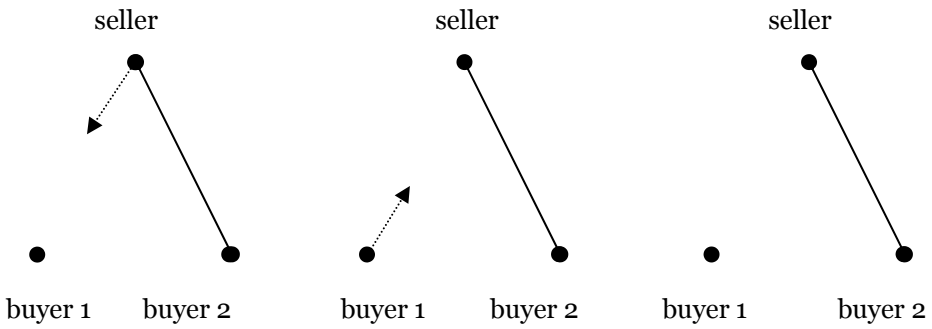
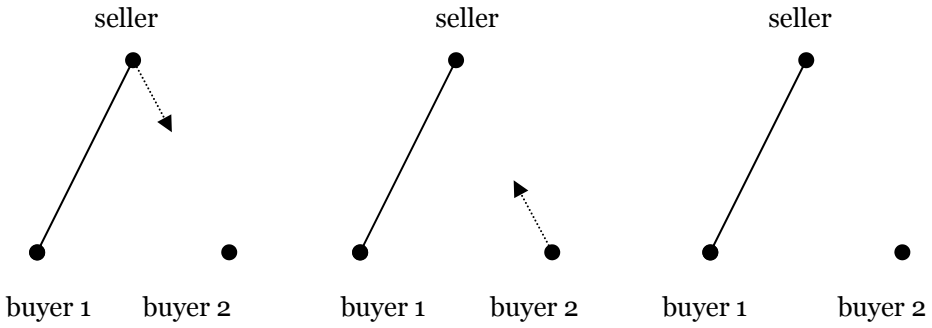
Appendix 2A. List of Networks

Figure 2A.1. Networks according to the number of links

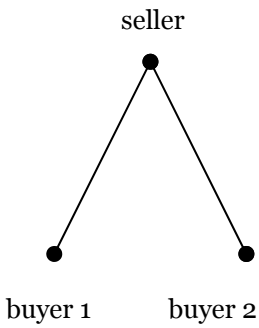
No-Link Networks:



1-Link Networks:



2-Link Network:



Note. An arrow indicates a link offer. A line indicates a formed link.

Appendix 2B. Experimental Instructions for the Cost-40 Treatment

Introduction

Welcome to this experiment on decision making. We will first go through the instructions together. Then there will be a practice period. After the practice period the experiment will start. Talking is strictly forbidden during the experiment. If you have a question, please raise your hand and I will come to your table to answer your question.

The experiment will last about 1 hour. If you follow the instructions carefully you can earn a considerable amount of money. During the experiment your earnings will be denoted in points. After the experiment your earnings will be converted into money at a rate of 1 point is 0.35 Eurocents. In addition, you will receive a show-up fee of 5 Euros. Your earnings will be paid to you, privately and in cash, immediately after the experiment.

Instructions for the experiment

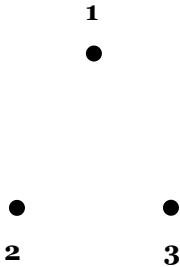
In this experiment, you are in a group of 3 persons. Each person has her or his own number; 1, 2, or 3. Your number is randomly determined at the beginning of the practice period and it stays the same throughout the whole experiment. Also, the composition of your group remains the same throughout the experiment. You will not know who is in your group. You and your group members are referred to as player 1, player 2 and player 3.

Your group faces the same task for 30 periods. In each period, you make a decision about whether to offer links to other players in your group or not.

A link is formed between two players if both of them offer a link to each other. Player 1 can have two links; player 2 and 3 can have only one. Hence player 2 and player 3 each have to decide whether they want to offer a link to player 1. Player 1 has to decide whether to offer a link to player 2 and whether to offer a link to player 3. Offering a link is not costly. However, each player has to pay 40 points for each link that he has formed.

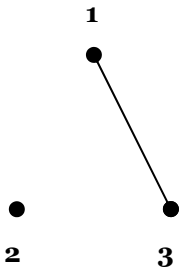
Depending on the links that form, a maximum of 240 points is shared among the players that form a link with each other. There are 4 different types of situations that can arise from the players' decisions to offer links to other players. The earnings of the players differ across these four situations.

SITUATION A:



In Situation A there are no links. This occurs when player 1 and player 3 do not both offer a link to each other, and player 1 and player 2 do not both offer a link to each other. No points are shared among the three players. And since no links have formed, no player pays any linking costs. Hence players 1, 2, and 3 earn $0 - 0 = 0$ points.

SITUATION B:

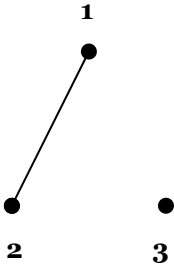


In Situation B there is only one link, namely between player 1 and player 3. This occurs when both player 1 and player 3 offer a link to each other, while player 1 and player 2 do not both offer a link to each other.

The 240 points are shared among player 1 and player 3 in the following way; Player 1 gets 160 points and player 3 gets 80 points. Both player 1 and player 3 pay 40

points for their link. Hence player 1 earns in total $160 - 40 = 120$ points, Player 3 earns in total $80 - 40 = 40$ points. Player 2 earns in total 0 points.

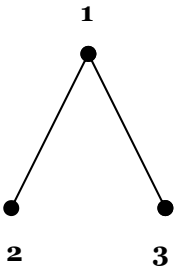
SITUATION C:



In Situation C there is only one link, namely between player 1 and player 2. This occurs when both player 1 and player 2 offer a link to each other, while player 1 and player 3 do not both offer a link to each other.

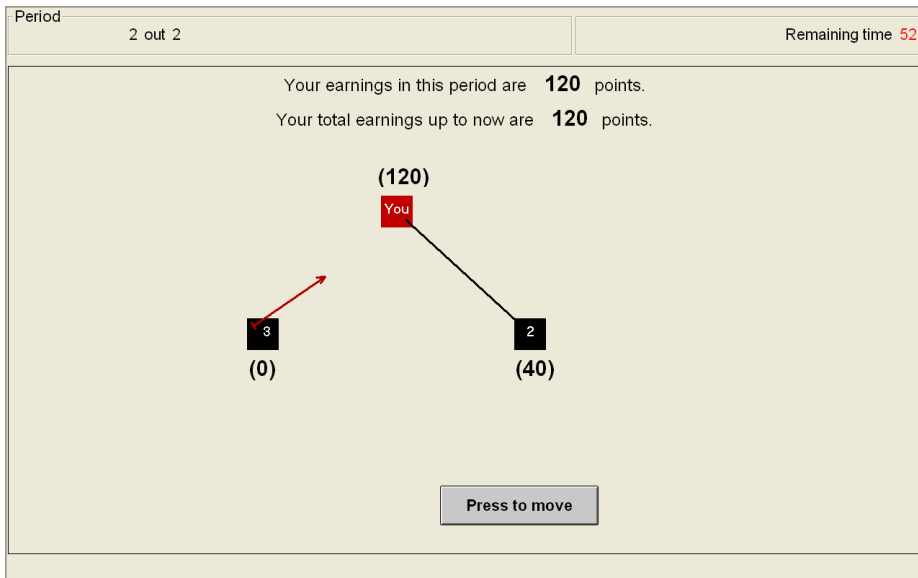
The 240 points are shared among player 1 and player 2 in the following way; Player 1 gets 160 points and player 2 gets 80 points. Both player 1 and player 2 pay 40 points for their link. Hence player 1 earns in total $160 - 40 = 120$ points, Player 2 earns in total $80 - 40 = 40$ points. Player 3 earns in total 0 points.

SITUATION D:



In Situation D there are two links: a link between player 1 and player 3, and a link between player 1 and player 2. This occurs when both player 1 and player 2 offer a link to each other and also both player 1 and player 3 offer a link to each other.

The 240 points are shared among the three players in the following way. Player 1 gets 240 points; player 2 and player 3 get 0 points. Player 1 pays 80 points for two links; and player 2, and player 3 each pay 40 points. Hence, player 1 earns in total $240 - 80 = 160$ points. Player 2 and player 3 each earn in total $0 - 40 = -40$ points.



The figure above illustrates how the results of the first part of the period are displayed to you on the computer screen. A black line indicates that both players offered a link to each other. A red arrow indicates that one player offered a link but the other player did not offer a link to that one player. So, in this example the black line indicates that player 1 (which is “You” in this case) and player 2 offered a link to each other and as a result a link is formed between them.

In this situation (which corresponds to situation C above), player 1 gets 160 points from one link and pays 40 points for the link. So, player 1 earns in total 120 points. Player 2 gets 80 points from the link and pays 40 points for the link. So, player 2 earns in total 40 points. The red arrow indicates that player 3 offered a link to player 1 while player 1 did not offer a link to player 3. Therefore no link is formed between player 1 and player 3. Player 3 does not pay for offering a link. Player 3 earns in total 0 points. Notice that for each player the total earnings for the period are indicated in parentheses.

To summarize:

You will be in a group of 3 persons. Each person will have her or his own number; 1, 2, or 3. Your number will be randomly determined at the beginning of the practice period and it will stay the same throughout the experiment. Also, the composition

of your group will remain the same throughout the experiment. You will not know who is in your group.

There will be 30 periods in the experiment. In every period you will decide with whom to link. The important points of the experiment are the following:

- A link is formed between two players if both of them offer a link to each other.
- Player 2 and player 3 cannot form a link with each other.
- Offering a link is not costly but if a link is formed, then players who have the link each pay 40 points for the link.
- If there is at least one link, the three players share 240 points among them.
- The earnings of players in each period are equal to the earnings from a link or links minus the cost of having a link/s.
- In each period you will be informed about all the decisions made by your group members. At the end of each period, you will be informed about your and other players' earnings.
- Your total earnings will be the sum of all points you earn over all periods. For each point you earn in the experiment, you will get 0.35 Eurocents.

Appendix 2C. Tables

Table 2C.1 The average gross payoff of the seller and the buyers^{a, b}

	Seller	Buyers
Cost-0	181.60 (26.71)	24.80 (10.14)
Cost-40	164.12 (24.27)	28.12 (10.23)
<i>p</i>	.041	.228

^a Standard deviations are in parentheses. ^b One-tailed exact *p*-values.

Table 2C.2 The one-tailed *p*-values of the independence tests per group^a

	Group	Buyer Link Offer	Seller Link Offer	Formed Links
Cost-0	1	.004	<.001	<.001
	2	.001	-	.005
	3	<.001	-	<.001
	4	<.001	-	.001
	5	-	<.001	<.001
	6	-	.022	.022
	7	-	.016	.069
	8	-	-	-
	9	-	-	-
	10	-	-	-
Cost-40	1	.003	<.001	<.001
	2	<.001	<.001	<.001
	3	.071	-	.340
	4	-	.035	.412
	5	.290	-	.290
	6	-	-	.231
	7	-	-	-
	8	-	-	-
	9	-	.007	.131
	10	-	-	-
	11	-	-	-

^a “-” indicates that there was not enough power to reject the independence hypothesis.

Note. The lack of power occurred for some combinations of marginal probabilities, for instance, if one of the marginal probabilities was very high.

Table 2C.3 A buyer's probability of offering a link to the seller^{a,b}

	Coefficient	<i>p</i>
Cost	-0.647 (0.888)	.466
Period	0.062 (0.316)	.844
Cost × Period	-0.441 (0.354)	.213
Own Link _{t-1}	-1.322 (0.675)	.050
Other Link _{t-1}	2.146 (1.094)	.050
Two Links _{t-1}	0.627 (0.855)	.464
Cost × Own Link _{t-1}	1.428 (0.910)	.117
Cost × Other Link _{t-1}	-1.263 (1.307)	.334
Cost × Two Links _{t-1}	0.197 (0.992)	.842
Period × Own Link _{t-1}	-0.454 (0.364)	.212
Period × Other Link _{t-1}	0.214 (0.469)	.648
Period × Two Links _{t-1}	0.271 (0.337)	.422
Cost × Period × Own Link _{t-1}	0.809 (0.404)	.045
Cost × Period × Other Link _{t-1}	-0.211 (0.526)	.688
Cost × Period × Two Links _{t-1}	0.231 (0.393)	.557
Constant	1.251 (0.757)	.098

^a Robust standard errors at the group level between parentheses.

^b All the *p*-values are two-tailed.

Table 2C.4 The seller's probability of offering a link to a buyer^{a,b}

	Coefficient	<i>p</i>
Cost	0.598 (0.551)	.278
Period	-0.040 (0.203)	.844
Cost × Period	0.227 (0.238)	.340
Own Link _{t-1}	-0.796 (0.653)	.223
Other Link _{t-1}	1.980 (0.655)	.002
Two Links _{t-1}	1.128 (0.789)	.153
Cost × Own Link _{t-1}	0.278 (0.963)	.773
Cost × Other Link _{t-1}	-2.947 (0.896)	.001
Cost × Two Links _{t-1}	-0.679 (0.898)	.450
Period × Own Link _{t-1}	-0.093 (0.243)	.704
Period × Other Link _{t-1}	0.037 (0.226)	.868
Period × Two Links _{t-1}	0.125 (0.251)	.617
Cost × Period × Own Link _{t-1}	-0.058 (0.266)	.827
Cost × Period × Other Link _{t-1}	-0.209 (0.266)	.433
Cost × Period × Two Links _{t-1}	-0.186 (0.350)	.595
Constant	0.746 (0.491)	.129

^a Robust standard errors at the group level between parentheses.

^b All the *p*-values are two-tailed.

Chapter 3

The Effect of Link Costs on the Formation and Outcome of Buyer-Seller Networks*

3.1. Introduction

In many markets, buyers and sellers first have to establish a 'link' between them before they can engage in an exchange. A case in point is the procurement of customized products and services. Products and services need to be tailored to buyers' needs and preferences, so a buyer and a potential seller first have to communicate and discuss such issues before they can engage in any contracting. Another example is the job market, where potential candidates and employers first have to establish a relationship by means of application letters and interviews before they can start negotiations over salaries and task assignments.

The collection of links between buyers and sellers (i.e., the 'network') may exert a strong influence on the outcome of the interactions. Who can interact with whom affects not only the gains from trade that can be realized (i.e., efficiency) but also how the gains of trade will be distributed. Typically, agents with more links and trading opportunities are in a better bargaining position than more isolated agents.

There is a rapidly growing body of theoretical literature that examines the formation of networks when establishing links is costly and how networks affect the outcomes of interaction (for an overview see e.g., Demange and Wooders, 2005; Dutta and Jackson, 2003; Goyal, 2007; Jackson, 2008). Link costs play a prominent role in determining the set of stable and efficient networks in various network formation models. For example, in the buyer-seller networks model of Kranton and Minehart (2001) minimally connected networks are both efficient and stable in a range of link costs. Whereas the link costs affect which networks are stable and efficient, in most models the shape of the network determines the payoffs of players. In the paper by Corominas-Bosch (2004) it was shown how the

* This chapter is based on Doğan, Van Assen and Potters (2009), unpublished manuscript.

decomposition of buyer-seller networks determines the outcome of the bargaining in the network. This theoretical literature has not yet been matched with substantial empirical and experimental work. The need for testing the network formation theories is all the more pressing as rather strong assumptions on the rationality of the interacting agents (unbounded) as well as their preferences (self-centered) have been made in the theoretical literature.

The present paper uses experiments to analyze behavior in a simple game with endogenous network formation in addition to endogenous interaction within the network. We focus on the impact of the costs of forming a link, and address two basic questions. The first question is which networks form and how the network formation is affected by the presence of link costs. In particular, we examine the occurrence of competitive networks in which one side of the market is predicted to get the entire surplus. To prevent such networks from forming the agents on the long side of the market need to coordinate their link formation. We examine whether they are able to do so, and whether costly link formation facilitates coordination as predicted by theory.

Our second main question is whether the *interaction* in the network, and not just the *formation* of the network, is affected by the costs of link formation. Because the network formation stage precedes the interaction in the network, any link costs are sunk at the moment the interaction in the network commences. Therefore, standard economic theory predicts that there is no effect of link costs on the interaction within the network. It is important to establish the absence of such an effect, as this is a basic assumption in the theoretical literature on network formation. In fact, the assumption is so standard that most papers do not even mention it explicitly. The validity of this assumption is less obvious though if agents are loss averse or if they are endowed with a concern for equity or equality. That is, the presence of risk and social preferences may prompt the link costs to affect bargaining outcomes.

To address the two basic questions we focus on the simplest possible, non-trivial buyer-seller network formation game. We analyze a two-stage game between one

seller who has one good and two potential buyers.²⁰ In the first stage, the seller decides whether to form one or two links with the buyers and the buyers simultaneously decide whether to form a link with the seller. In the second stage, and conditional on the network that was formed in the first stage, the players engage in a three round alternating offer bargaining. The players bargain over the division of the gains of trade, where at most one buyer can trade with the seller.

The equilibrium prediction of the bargaining stage is that all the surplus goes to the seller if a competitive network forms, whereas the surplus is shared when the seller is linked to one buyer only. The networks that are formed in equilibrium in the first stage are different for the two different link costs treatments. When links are costless, although a Nash equilibrium, the 1-link network does not survive refinements like trembling hand perfection. When links are costly, the competitive network is no longer a Nash equilibrium. Hence, the presence of link costs is predicted to reduce the occurrence of competitive networks and makes buyers better off as a result. The other basic prediction is that the presence of link costs does not have an effect on the outcomes of bargaining. Agents should ignore such costs as sunk and let bygones be bygones.

Our paper is related to three different strands of experimental literature. The first strand examines the effect of competition on bargaining outcomes. Roth, Prasnikar, Okuno-Fujiwara, and Zamir (1991) examined bargaining between one proposer and one responder as well as bargaining between nine competing proposers and one responder. They found that competition had a dramatic effect on the bargaining outcomes. While bilateral bargaining led to a near equal division of the surplus in as much as 70 percent of the cases, with the introduction of proposer competition the occurrence of the near equal division dropped to less than five percent of the cases and almost all surplus went to the responder.²¹ Other

²⁰ More in line with a procurement setting, the game can also be interpreted as one between a buyer and two potential sellers.

²¹ Other experimental studies that examine the effect of competition on bargaining outcomes include Grosskopf (2003), Güth, Marchand and Rulliere (1997), and Fischbacher,

papers tested the effect of competition and network structure on outcomes of exchange. In economics, the paper by Charness et al. (2007) tested the implications of Corominas-Bosch's (2004) model. The model identifies buyer-seller networks that are 'even' and those that are 'competitive', where the latter leave almost no surplus to the long side of the market. Charness et al.'s (2007) experiment involved bargaining over a given network structure, in which the network structure was changed exogenously by introducing a link after a certain number of periods. The experimental results indicated that the competitiveness of the network had a strong effect on bargaining outcomes, even though the effect was less extreme than predicted. In the sociological literature there exist many experimental papers on the effect of network structure on outcomes of exchange. The main conclusion of this research is that the network structure has a strong effect on outcomes (e.g., Willer, 1999; special issue *Social Networks*, June 1992). In experiments using (so-called strong power) networks where an agent has the power to always exclude at least one other agent from exchange, the first agent earns most of the surplus in an exchange whereas the agent that could be excluded earns a small share of the surplus (e.g., Skvoretz and Willer, 1993).

Analyzing the effect of competition on bargaining outcomes is also central to our study. In our experiment, however, the competitiveness of the network is not given exogenously, but comes about endogenously. In view of the finding that competitive market structures and networks tend to leave the long side of the market with very little surplus, it is particularly important to analyze whether such competitive networks are formed in the first place, especially if the links are costly and as a result some agents may not recover their link costs.²²

Fehr, and Fong (2003).

²² This question is not just of theoretical interest. During the revision of the new European directive on procurement rules (EU Directive 2004/18/EC), much discussion was addressed at potential hold-up problems and bidder exploitation. The association of construction companies, for example, feared that competing bidders could be exploited to such a degree that they would not be able to earn back the costs of crafting a decent bid.

The second strand of related experimental literature focuses on network formation and examines whether behavior in a link formation game is in line with the predictions of various equilibrium concepts (See Berninghaus et al., 2006, and 2007; Callander and Plott, 2003; Corbae and Duffy, 2008; Deck and Johnson, 2004; Falk and Kosfeld, 2003; Goeree, Riedl, and Ule, 2008).²³ As an example, Falk and Kosfeld (2003) tested the model of Bala and Goyal (2000) in the lab to examine whether the formation of networks was in line with the predictions of strict Nash equilibrium. They found that the predictive power of the strict Nash equilibrium depended strongly on the costs and benefits of establishing a link. Equilibrium worked well when both the costs and the benefits of links were one-sided but often failed when the benefits of links were two-sided while the costs were one-sided, that is, in case of payoff asymmetries. They argued that social preferences might explain such behavioral patterns. Note, however, that except the paper by Corbae and Duffy (2008) all experimental papers on network formation – to our knowledge – focused on network formation but did not have endogenous interaction within the network. In the paper by Corbae and Duffy, players first decided with whom to form links, and then played a coordination game. In our experiments, however, after the network formation stage, players engaged in bargaining. Investigating both the endogenous network formation and interaction is crucial if one wants to study the effect of link costs on the interaction within the network.

Finally, there exists an experimental literature examining the effect of sunk costs. Some studies found little evidence that sunk costs have a systematic effect on behavior (e.g., Phillips, Battalio, and Kogut, 1991; Friedman, Pommerenke, Lukose, Milam, and Huberman, 2007). Others, however, found a significant effect of the presence and the size of sunk costs. In particular, some studies suggested that sunk entry costs may induce players to coordinate on a better equilibrium in case there are multiple (Pareto-ranked) equilibria (Cachon and Camerer, 1996; Offerman and Potters, 2006). Others found an effect of sunk investment costs that seemed to be better explained by a concern for fairness (Ellingsen and Johannesson, 2005). No

²³ Also related are papers on market entry, such as Camerer and Lovo (1999).

study, however, has yet examined the effect of linking or entry costs on bargaining behavior.²⁴ Nevertheless, the aforementioned studies on sunk cost do suggest that sunk costs cannot always be assumed to be irrelevant for behavior.

Combining both the endogenous link formation and bargaining in our experiment, we analyze which networks form and how the network formation is affected by the presence of link costs, and whether bargaining is affected by the costs of link formation. We find competition to be prevalent only if there are no link costs, and that, contrary to the theoretical predictions, this is due to the seller's linking behavior. Interestingly, the sunk link costs do have an effect on the seller offers but only in the 1-link networks, which cannot be explained by the standard nor the alternative theories we examined.

The remainder of this paper is organized as follows. The next section presents the game that we implemented along with the hypotheses that can be derived from the equilibrium analysis. Section 3.3 outlines the experimental design and procedure. Section 3.4 presents the experimental results and tests of the various hypotheses. Section 3.5 contains a discussion, and Section 3.6 concludes.

3.2 . The Game

The game involves one seller and two buyers who take part in two stages of play. In the first stage, players simultaneously offer links to each other. If a link or links are formed, players proceed to the second stage in which they engage in a three round alternating offers bargaining with a shrinking pie. At most one agreement can be formed between the seller and one of the buyers.

²⁴ One exception is Güth and Schwarze (1983) who auctioned the rights to play the ultimatum game experiment as either a proposer or a responder; they found that the winning proposers were greedier than was usually the case in standard ultimatum game experiments. It is not clear though whether this is due to a selection of the auction or due to the price paid by the auction winner.

A link represents the opportunity to bargain in the second stage of the game. Hence links can be considered as necessary connections for trade to take place. Since exchange requires the consent of both players, a link is formed when both players offer it. The two buyers cannot form a link with each other. We consider two different cases that correspond to the two treatments implemented in the experiment. In the first case, links are costless; in the second, each link that is formed costs 40. The cost of a link can be thought of as a necessary investment for trade to take place. The cost of a link is the same for both sellers and buyers. Costs are incurred once the link is formed, not when the link is offered. All the link offers and the formed links become common knowledge at the end of the first stage.

The players proceed to the second stage if at least one link is formed. If no link is formed the game ends and all players obtain a payoff of zero. In the second stage, bargaining starts with the seller simultaneously offering a share between 0 and 240 to each buyer that he is linked to. The seller can make different offers to each linked buyer. An agreement is reached if at least one buyer accepts the offer. If both buyers accept the seller's offer, one of them is randomly chosen for payoff realization. If no agreement is reached the game proceeds to the next round. There are at most three rounds in the bargaining and the side of the market that makes offers alternates: in the second round the buyers make offers and in the third round the seller makes offers again. The pie shrinks with each round by 80 points; the first round pie is 240, the second round pie is 160, and the third round pie is 80 points. After each round all players are informed about the offers, and the acceptances. If no offer is accepted in any of the three rounds, all players receive a payoff of zero minus the link costs.

Standard Theoretical Predictions

Three different types of network can form. In the empty network no player has a link. In a 1-link network one buyer maintains a link with the seller. In the 2-link network both buyers have a link with the seller. When the empty network forms, each player receives a payoff of 0. The unique subgame perfect equilibrium (SPE) payoffs for the 1-link and 2-link network are depicted in Figure 3.1.

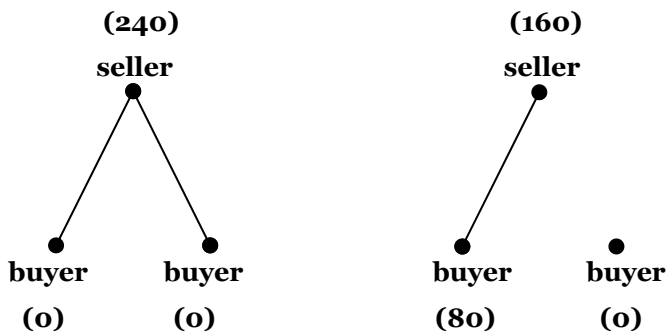


Figure 3.1. The SPE payoffs in the 2-link and 1-link network.

In the 2-link network, the unique SPE for the seller is to offer 0 to both buyers in the first round, and for buyers to accept the offer. This unique SPE can be derived by backward induction. In the third round, the seller offers 0 to both buyers, and both buyers accept the offer. So the seller gets 80 and the buyers get 0. In the second round, the seller accepts the highest offer. The (Bertrand) competition between the buyers induces both of them to offer 160 to the seller. The seller accepts one of the offers. Finally, in the first round, the seller offers 0 to both buyers, and both buyers accept the offer since they are not better off by unilateral deviation.

In a 1-link network it is the unique SPE for the seller to propose 80 to the buyer in the first round and for the buyer to accept the offer. Again this follows by backward induction. In the third round, the seller offers 0 to the buyer, and the buyer accepts the offer since rejecting the offer does not make him better off. In the second round, the buyer has to offer at least 80 for the seller to accept the offer. Hence he offers 80 to the seller who accepts, and both get 80. Finally, in the first round, the seller has to offer at least 80 to induce the buyer to accept the offer. So, the seller offers 80, which is accepted by the buyer, resulting in a payoff of 160 for the seller and 80 for the buyer.

Notice that the SPE payoffs depicted in Figure 3.1 are independent of the link costs since the bargaining stage occurs after the link formation. Once a 1-link or a 2-link network has been formed, any link costs are sunk. Therefore, link costs do not affect the bargaining payoffs in equilibrium.

Given the SPE payoffs of the bargaining stage, the Nash equilibria of the link formation stage depend on the cost of a link. When links are costless, all networks are Nash equilibria. No player has an incentive to unilaterally break a link, in neither the 1-link nor the 2-link network. Moreover, as long as the seller believes that a buyer will not offer a link, the seller is indifferent between offering and not offering a link to that buyer. The same holds for the buyers. Hence, any network is a Nash equilibrium. When the link costs are 40, the empty network and the two 1-link networks are Nash equilibria of the link formation stage. The 2-link network, however, is not a Nash equilibrium because a buyer has an incentive to unilaterally delete the link with the seller. In the 2-link network the link costs are 40, whereas the buyer's bargaining payoff is zero. Hence, in the 2-link network, a buyer improves his payoffs from -40 to 0 by not forming a link. Notice that there is also a mixed strategy equilibrium if the link costs are 40. Both buyers in the mixed strategy equilibrium offer the seller a link with probability .5, while the seller offers a link to both buyers. The expected payoffs in this equilibrium are 100 and 0 for the seller and buyers, respectively. Notice that the 1-link network equilibrium (weakly) Pareto dominates the mixed strategy equilibrium.

We also examined trembling hand perfect (THP) equilibrium given the SPE payoffs of the bargaining stage. THP equilibrium eliminates weakly dominated strategies and is a refinement of Nash equilibrium. When links are costless, only the 2-link network is a THP equilibrium because the seller weakly prefers to offer links to both buyers and both buyers are weakly better off by offering a link to the seller. When the link costs are 40, only the 1-link networks are THP. The seller offers a link to both buyers, but only one of the buyers reciprocates. The empty network is not a THP since the seller weakly prefers to offer two links to the buyers. Given that one buyer does not offer a link to the seller, the other buyer is better off by offering a link to the seller. The mixed strategy equilibrium in which the seller offers two links and both buyers offer a link with probability .5 is also THP.

Hypotheses

We formulate the standard theoretical predictions into four hypotheses. Throughout the hypotheses and the results section, the theoretical payoff predictions from the bargaining stage of the game are based on the SPE predictions, and the link formation predictions are based on the THP equilibrium predictions, unless otherwise stated.

H1. The effect of the link costs on link formation.

1a. The seller offers two links irrespective of the link costs.

The seller offers two links irrespective of whether the link costs are 0 or 40 since offering two links is a weakly dominating strategy.

1b. The buyers are less likely to offer a link when link costs are 40.

If link costs are 0, both buyers offer a link to the seller. If the link costs are 40, only one buyer offers a link to the seller, or both do so with probability 0.5.

1c. The 2-link network forms less often when link costs are 40.

The 2-link network is both a Nash and a THP equilibrium when the link costs are 0, but the 2-link network is not a Nash and hence not a THP equilibrium when the link costs are 40. Moreover, the only pure THP equilibria for the cost 0 and cost 40 cases are the 2-link and 1-link network, respectively.

H2. The effect of competition on bargaining.

2a. The first round offer of the seller is higher in the 1-link network than in the 2-link network.

If there are two links, the seller offers 0 to the buyers in the first round of the bargaining stage; when there is one link, the seller offers 80 to the linked buyer.

2b. Buyers reject higher offers in the first round in the 1-link network than in the 2-link network.

Both buyers accept any offer the seller makes in the first round in the 2-link network; in a 1-link network, however, the buyer rejects any offer less than 80.

H3. The effect of the link costs on bargaining.

3a. Offers do not depend on the link costs.

Since the bargaining stage occurs after the link formation, when the players are in the bargaining stage the link costs have already been incurred, i.e., the costs are sunk. As a result, conditional on the network that forms, the offers in the bargaining stage are independent of the link costs.

3b. Rejecting an offer does not depend on the link costs.

The decision to accept or reject an offer is not affected by the link costs since the link costs have been incurred once the bargaining stage is reached.

H4. The effect of the link costs on payoffs.

4a. The seller is better off if there are no link costs.

If the link costs are zero the 2-link network is formed and the seller's net payoff is 240. If the link costs are 40 and the 1-link network forms the seller's net payoff is 120 (160–40), whereas the seller's expected payoff in the mixed strategy equilibrium is $.25 \times 240 + .5 \times 120 + .25 \times 0 = 120$ as well.

4b. The buyers are better off if there are link costs.

If there are no link costs, both buyers earn zero, since a 2-link network forms. If the link costs are 40 and a 1-link network forms the linked buyer earns 40 (80–40) and the other buyer earns zero, whereas their expected payoff in the mixed strategy equilibrium equals $.25 \times -40 + .5 \times 0 + .25 \times 40 = 0$. Assuming that not all buyers play the mixed strategy equilibrium, the buyer's net payoff is higher if the link costs are 40 than if the link costs are zero.

Alternative Theoretical Predictions

The experimental literature on bargaining indicates that people often do not behave as predicted by standard theory. There exists growing evidence that people exhibit social preferences (e.g., Camerer, 2003). In this section we show that social preferences might lead the link costs to have an effect on the bargaining outcomes contrary to the Hypotheses 3. In particular, we examine the predictions of inequality aversion (Fehr and Schmidt, 1999), and equity theory (Homans, 1961, Selten, 1978).

The model by Fehr and Schmidt (1999) assumes that a player's utility decreases in the absolute difference between his own payoff and the payoffs of other players. The link costs might affect the difference between players' payoffs which in return affects the bargaining outcomes. It is tedious but straightforward to derive the SPE predictions for the bargaining stage with inequality averse players. The analysis reveals that given a certain assumption the sunk link costs affect the bargaining strategies²⁵. In particular, when a 1-link network forms a seller makes a lower offer to the buyer if there are link costs compared to the case without link costs. If the link costs are 40, the buyer in the link accepts lower offers since he dislikes the fact that his payoff from rejecting an offer (-40) is lower than the payoff of the other buyer (0). Anticipating this, the seller offers less to the buyer in the cost 40 case than in the case without link costs. Interestingly, link costs have no impact on the bargaining outcome if a 2-link network is formed. The reason is that competition induces the buyers to offer the whole pie to the seller in the second round which in return results in the buyers accepting any offer of the seller in the first round irrespective of the link costs. Consequently the seller offers zero to the buyers in both cases.

²⁵ The result relies on the assumption that the seller does not have a strong dislike for disadvantageous inequality. To be precise, in the standard notation of the Fehr Schmidt model, link costs affect bargaining if $\beta < 2/3$. Fehr and Schmidt suggest that this assumption is reasonable for a vast majority of people.

Equity theory assumes that the social output is split proportional to players' inputs (e.g., Homans, 1961; Selten, 1978). It is used both as a normative and as a positive theory (Gantner, Güth, and Königstein, 2001). We hypothesize that in the absence of the link costs equity theory would propose an equitable division of the surplus. Since side payments are not possible, an equitable division would imply a 50-50 split between the seller and the contracting buyer. The presence of link costs, however, could imply a different division of output if the link costs are interpreted as inputs. In case a 1-link network is formed, both the seller and the linked buyer incur link costs of 40. So there is little reason to deviate from a 50-50 split. However, in case a 2-link network is formed, the contracting buyer incurs link costs of 40 whereas the seller has link costs of 80. A division of the output proportional to the link costs (i.e., the inputs) would then imply that the seller gets $(2/3 \times 240)$ which is more than the buyer's payoff $(1/3 \times 240)$. Likewise, an equal division of the net surplus $(240 - 80 - 40)$ would also imply that the seller gets more $(80 + 1/2 \times 120)$ than the contracting buyer $(40 + 1/2 \times 120)$. To conclude, equity theory suggests that the seller gets a larger share of the output (i.e., makes lower offers to the buyers) in the presence of link costs only if a 2-link network is formed.

Table 3.1 summarizes the standard theoretical predictions regarding the effect of link costs on the seller's first round offer along with the alternative predictions based on inequality aversion and equity theory.

Table 3.1 The effect of link costs on the seller's first round offer

	1-link	2-link
Standard	No effect	No effect
Inequality aversion	Negative	No effect
Equity theory	No effect	Positive

3.3. Experimental Design

The experiments were conducted at the CentERlab in Tilburg University, the Netherlands. A total of 105 subjects participated in 6 sessions, and each subject

participated only once. Subjects were recruited through email lists of students interested in participating in experiments. There were in total 48 subjects in 3 sessions in the cost-0 treatment, and 57 subjects in 3 sessions in the cost-40 treatment. Subjects were at tables separated by partitions, such that they could not see other participants' screens but could see the experimenters in front of the room. Sessions lasted between 90 and 150 minutes, and average earnings were approximately 18.60 Euros including a show-up fee of 7.5 Euros.

First, written instructions were given to the participants and read out loud by the experimenter. A copy of the instructions is included in Appendix 3A. It was explained in the instructions that each group consisted of 3 players who were randomly selected at the beginning of the experiment and that the group composition stayed the same throughout the experiment. Subjects had no way of knowing which of the other participants were in their group. In the instructions and the experiment, the sellers were denoted as Player 1, and buyers were denoted as Player 2 or Player 3. Player roles remained fixed throughout the experiment. The game was explained as consisting of two parts: the first being about offering links to other players and the second about sharing an amount of points. Subjects were informed that the task would be repeated for 30 periods and that their final earnings comprised of the total points they earned in the experiment converted at a rate of 0.5 (0.7) Eurocents per point in the cost-0 (40) treatment plus the show up fee. In the cost-40 treatment, it was emphasized that offering a link is not costly, but that if a link is formed players who have the link each pay 40 points. After the instructions were finished, subjects played one practice period in order to familiarize them with the procedure and the screens. Subjects' understanding of the task was then assessed by asking them 3 questions to answer at their own pace. Their answers were checked one by one and when necessary the task and the payoff structure were explained again privately.

The experiment was programmed and conducted with the software z-Tree (Fischbacher 2007).²⁶ Each period started with a screen with the three boxes with

²⁶ The program of the experiment is available from the authors upon request.

labels 1, 2, and 3, representing the players of the group. An example of the subject screen is contained in the instructions of the experiment in Appendix 3A. A player's own box was always presented on top of the screen. Players simultaneously decided with whom to link, and they offered a link by clicking on the box of another player. Buyers could not link to each other. Subjects saw an arrow pointing to the other player's box when they clicked, and it was possible to undo the link offer by clicking again. When the players moved to the next screen²⁷, a line between two players on the screen informed them about the links that formed. If a link was offered unilaterally this was indicated with an arrow pointing to the other player.

If one link or two links were formed, the group proceeded to the bargaining stage in which the seller offered a share between 0 and 240 points to the linked buyer or buyers. If there were two links, the offers could be different for the two buyers. Then, buyers were informed about the offer or offers that the seller made, and buyers simultaneously decided whether to accept or reject the offer. If an offer was accepted, the bargaining ended and the offer was implemented. If both buyers accepted the offer, one of them was randomly chosen by the computer for the payoff realisation. If both buyers rejected the seller's offer, the group proceeded to the second round of bargaining in which the buyer(s) offered a share between 0 and 160 to the seller. If the seller rejected the offer(s), they proceeded to the third and final round, in which the seller offered a share between 0 and 80 to the buyer(s). After each bargaining round, all players were informed about the acceptance and rejection decisions of their group members even when they did not have a link. At the end of bargaining, the players were informed about their own payoff in that period, the group members' payoffs in that period, and their own cumulative payoffs. In the cost-40 treatment, their total payoff was the amount of points from an agreement minus the link costs. Note that players could earn negative payoffs in this treatment. All groups in a session started each period at the same time. Thus it was not possible to identify one's group members at any point of the experiment. At

²⁷ The subjects moved to the next phase of the experiment when all group members pressed the OK button. Also, each screen had a binding time limit of 180 seconds in the first 5 periods, and 60 seconds in the later periods.

the end of the experiment participants were paid privately and separately in an adjacent room.

3.4. Results

In this section we discuss the experimental results. The results are organised parallel to the hypotheses stated in Section 3.2.²⁸

Effect of link costs on link formation

Result 1a. The hypothesis that the seller offers two links irrespective of the link costs was rejected.

Table 3.2 depicts the average link offers per period as a function of costs and player role. The second column of the table is the average number of links the seller offered to each buyer per period. The third column states the average number of links each buyer offered to the seller. The p -values from the comparison of the link offers of the seller and the buyers within each treatment are stated in the last column. Finally the last row shows the p -values from the comparison of the link offers across the two treatments.

In the cost-0 treatment the seller offered an average of 0.87 links to each buyer per period, which was significantly more than the average 0.61 links to each buyer in the cost-40 treatment. So, contrary to the standard theoretical prediction, the seller offered less than two links in both cost treatments, and the number of links offered by the seller was significantly lower if there were link costs.

²⁸ Unless stated otherwise, statistics treat a group of one seller and two buyers interacting over 30 periods as one independent observation. This means that we have 16 independent observations in the cost-0 treatment and 19 independent observations in the cost-40 treatment. The p -values reported for between-treatment comparisons are based on the Mann-Whitney test; p -values reported for within-treatment comparisons are based on the Wilcoxon matched-pairs signed-ranks test. We use a one-sided (two-sided) test when the hypothesis is (is not) directional.

Table 3.2 Average link offers per period^a

	Seller	Buyers	<i>P</i>
Cost-0	0.87 (0.17)	0.94 (0.12)	.096 ^b
Cost-40	0.61 (0.16)	0.97 (0.03)	< .001 ^c
<i>p</i>	< .001 ^b	.968 ^c	

^aStandard deviations are in parentheses. ^b 2-tailed exact test ^c 1-tailed exact test

Result 1b. The hypothesis that the buyers are less likely to offer a link when the link costs are 40 was rejected.

Table 3.2 shows that the buyers offered on average 0.94 and 0.97 links to the seller in the cost-0 and cost-40 treatment, respectively. These averages were not significantly different. Hence, contrary to the standard theoretical prediction, both buyers almost always offered a link to the seller in both cost treatments.

Result 1c. The hypothesis that the 2-link network forms less often when the link costs are 40 was not rejected.

Table 3.3 depicts the frequencies of the number of links, and the average number of links per treatment. The '0 links' column shows that there were few periods with no links. The percentage of 2-link networks was, as expected, significantly higher in the cost-0 treatment (69%) than in the cost-40 treatment (21.4%). Consequently, the percentage of 1-link networks was significantly higher in the cost-40 (76.8%) than in the cost-0 treatment (30.2%). The average number of links per group was 1.68 in the cost-0 treatment and 1.20 in the cost-40 treatment. This result also confirms the direction of change that is predicted by the standard theory.

To sum up, the effect of the link costs on the average number of links was as predicted by the standard theory but the predictions on the link offers of the seller and the buyers were not supported. Because the buyers almost always offered a link to the seller in both treatments, it was due to the seller offering less links in the cost-40 treatment that the average number of links was lower in the cost-40 treatment.

Table 3.3 Average frequency and number of links^a

	0 links	1 link	2 links	Average number of links
Cost-0	0.8 (1.5)	30.2 (32.1)	69.0 (32.9)	1.68 (0.34)
Cost-40	1.8 (1.7)	76.8 (29.8)	21.4 (30.0)	1.20 (0.30)
<i>p</i>	.166 ^c	<.001 ^b	<.001 ^b	.001 ^b

^a Standard deviations are in parentheses ^b 1-tailed exact test ^c 2-tailed exact test

To see whether the results on the link offers depend on period, we include Figure 3.2 that depicts the average link offer of the seller and the buyer per period in the cost-0, and cost-40 treatments. Figure 3.2 shows that in the cost-0 treatment the buyers' link offer was around 0.95 across periods, and the seller's average link offer was smaller than the buyers'. In the cost-40 treatment, there was a downward trend from 0.63 to 0.55 in the seller's average link offer. The buyers' average link offer, however, varied between 0.95 and 1 across periods.

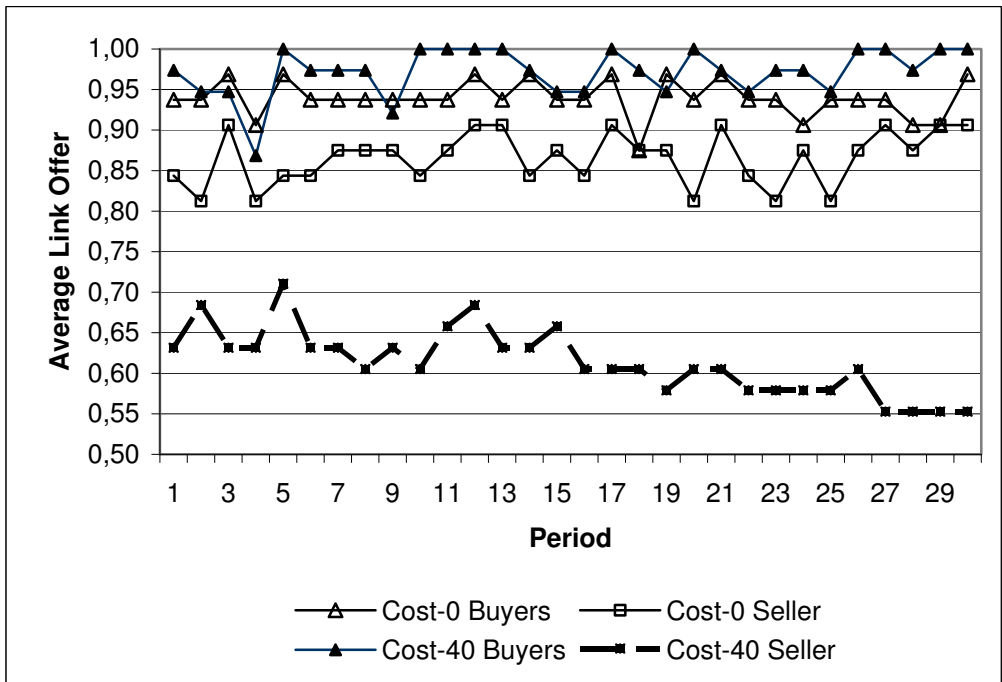


Figure 3.2. Average link offer in the cost-0 and cost-40 treatments

To analyze whether the failure of the prediction that the seller always offers two links was confined to some groups, we made descriptive analyses on the link offers at the group level. We found that the variance of behavior of the sellers between and within treatments was high whereas the buyers' behavior did not noticeably differ. In the cost-0 treatment 10 out of 16 sellers offered two links in at least 80% of the periods, but only two out of 19 sellers did so in the cost-40 treatment. Likewise, two out of 16 sellers in the cost-0 treatment offered one link in at least 80% of the periods whereas the majority (12 out of 19) of sellers did so in the cost-40 treatment. To conclude, most sellers offered two links in the cost-0 treatment, whereas the majority of sellers offered one link in the cost-40 treatment. Contrary to the sellers, the behavior of the buyers was similar in the two cost treatments. Most buyers offered a link in at least 80% of the periods; 30 out of 32 buyers in the cost-0 treatment, and all 38 buyers in the cost-40 treatment.

Finally, the only two groups in the cost-40 treatment in which the seller offered two links in most periods (27 and 30 periods, respectively) showed that, even though there existed monetary incentives to do so, the buyers did not coordinate on forming only one link with the seller. In both groups buyers always offered a link except in one period in the second group and buyers on average had a negative payoff. Hence both buyers in the first group and at least one of the buyers in the second group did not try to coordinate.

Effect of competition on bargaining

Result 2a. The hypothesis that the first round offer of the seller is higher in the 1-link network than in the 2-link network was not rejected.

In Table 3.4 the average offers of the first, second, and third rounds conditional on the number of links are depicted. The last column shows the p -values of the comparison of the first round offers of the 1-link network with the first round offers of the 2-link network. The average offer in the first round was significantly higher in the 1-link than in the 2-link network for both cost treatments; 75.6 vs. 65.13 and 95.15 vs. 60.41, for the cost-0 and cost-40 treatments, respectively. Hence, as

predicted, competition between the buyers reduced the seller's offer. Nevertheless, the point prediction was quite far off the mark for the 2-link case. The seller was predicted to offer 0 in the first round, whereas the observed offer was above 60 in both treatments. Too few observations were available to test corresponding hypotheses on the second and third round offers.²⁹ Note from Table 3.4, however, that the direction of the differences were in line with the theoretical predictions.

Table 3.4 Average offer per round ^{a, b}

	First		Second		Third		<i>p</i> (first) ^c
	1 link	2 links	1 link	2 links	1 link	2 links	
Cost-0	75.60 (21.10) N=15	65.13 (25.20) N=14	66.96 (18.42) N=12	84.80 (11.93) N=4	23.60 (12.71) N=10	11.25 (1.77) N=2	<.001 N=13
Cost-40	95.15 (22.26) N=19	60.41 (21.29) N=11	59.89 (13.53) N=16	75.18 (19.75) N=9	26.49 (14.80) N=13	20.00 (15.00) N=3	.001 N=11
<i>p</i> ^d	.023	.809	.245	.414	.633	.800	

^a Standard deviations are in parentheses ^b The number of observations are indicated with N ^c 1-tailed exact test. ^d 2-tailed exact test

Result 2b. The hypothesis that the buyers reject higher offers in the first round in the 1-link network than in the 2-link network was not rejected.

We ran a logistic regression analysis to analyse the effect of the number of links on the acceptance decisions of the buyers in the first round, controlling for the offer of the seller. We report the results of two models in Table 3.5. Apart from the link costs, the number of links, the interaction between link costs and number of links, and the period number, Model 1 also includes interaction effects between these

²⁹ In the cost-0 treatment, there were four groups that had data on both 1-link and 2-link second round offers, and in the cost-40 treatment, there were eight. In the cost-0 treatment, there were two groups that had data on both 1-link and 2-link third round offers, and in the cost-40 treatment, there was one.

variables and the seller's offer. Model 2 does not include the latter interaction effects. The parameter estimates and the significances of Wald tests in Model 1 (2) are reported in the second and third (fourth and fifth) columns of Table 3.5. We focus on Model 2 to draw conclusions on our hypotheses because none of the interaction effects with Offer were significant.

Table 3.5 Probability of accepting an offer^{a,b}

	Model 1		Model 2	
	Coefficient ^b	<i>p</i>	Coefficient ^b	<i>p</i>
Constant	-1.205 (0.953)	0.206	-1.626 (0.609)	0.008
Offer	0.029 (0.010)	0.003	0.035 (0.006)	0.000
Link costs	-1.941 (1.475)	0.188	-0.217 (0.399)	0.586
Links	0.562 (0.971)	0.563	0.824 (0.403)	0.041
Link costs × Links	1.552 (1.514)	0.305	-0.384 (0.497)	0.440
Period ^c	0.088 (0.071)	0.218	0.033 (0.012)	0.007
Offer × Link costs	0.022 (0.018)	0.231	—	—
Offer × Links	0.003 (0.011)	0.760	—	—
Offer × Link costs × Links	-0.025 (0.020)	0.195	—	—
Offer x Period	-0.0002 (0.000)	0.614	—	—

^a The variable Links is 0 if in a dyad, and 1 in a triad; Link costs are 0 in the cost-0 treatment, and 1 in the cost-40 treatment. ^b Robust standard errors at the group level between parentheses. ^c Period is normalised to actual period – 15.5.

Notice first that the effect of the seller's offer was positive and highly significant; a 10-point increase in offer was associated with an odds ratio of 1.42. The effect of the number of links was positive and significant; the odds of accepting an offer were 2.28 times larger in the 2-link network than in the 1-link network, meaning that buyers were more likely to accept the same offer in the 2-link than in the 1-link network. The effects of the link costs and link costs interacted with the number of links were not significant; thus the acceptance behavior of the buyers was similar across the two cost treatments (see Result 3b below). The effect of period was also positive and significant; the buyers were more likely to accept the same offer later in the experiment.

Effect of link costs on bargaining

Result 3a. The hypothesis that the offers do not depend on the link costs was rejected.

As depicted in the second column of Table 3.4, the average offer in the first round of the 1-link network was significantly higher in the cost-40 treatment (95.15) than in the cost-0 treatment (75.60). The difference was smaller and not significant in the 2-link network; 65.13 vs. 60.41, for cost-0 and cost-40 treatments, respectively. The second and third round offers were not significantly different across the treatments, as shown in columns four to seven of Table 3.4³⁰.

Hence, the link costs had a positive effect on the first round offer, but only for 1-link networks. Interestingly, the effect is not in line with the alternative theoretical predictions either (see Table 3.1). Inequality aversion predicts a negative effect in the 1-link case rather than a positive effect, and equity theory predicts a positive effect of link costs only for the 2-link case.

³⁰ Although the p -values are reported, there were not enough cases to make a statistically powerful comparison in the case of two links in the second and third rounds.

To check whether the effect of link costs is perhaps due to confusion and is reduced by learning we plot the average first round offer for 10 different segments of periods (1-3, 4-6, ..., 27-30). Figure 3.3 depicts the average first round offer in the 1-link and 2-link networks for both cost treatments. For the 1-link networks, the average offer was consistently higher in the cost-40 treatment, with a minimum difference higher than 10.29 points for all period segments. Thus, Figure 3.3 supports the result that the offers were significantly different in the 1-link networks across cost treatments. Consider now the offers in the 2-link networks in the two cost treatments. Even though the offers were consistently higher in the cost-0 treatment, the difference between the treatments was not statistically significant in any of the ten segments. Moreover, there was no evidence that over the periods the offers were getting closer to the theoretical prediction that the seller offers zero.

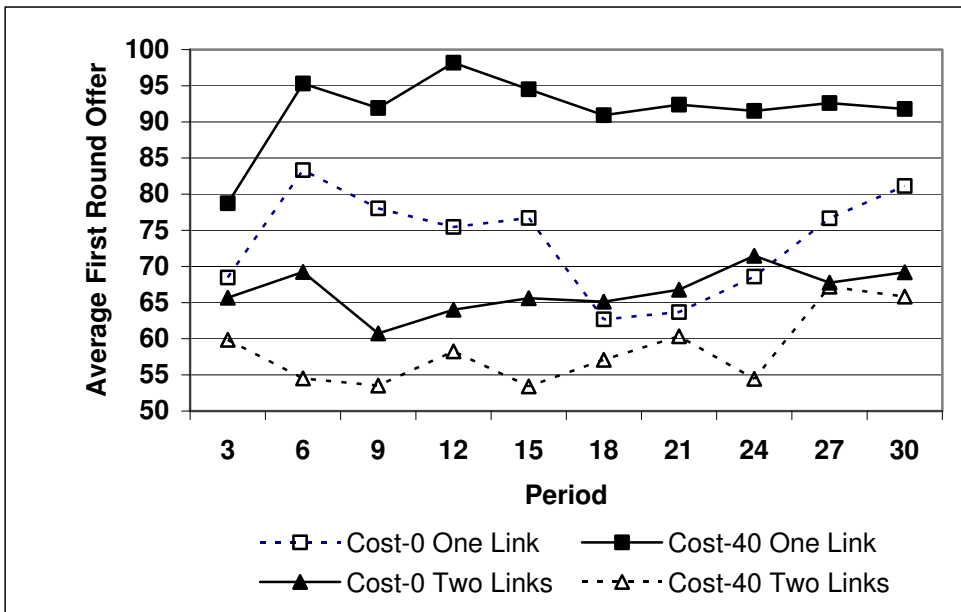


Figure 3.3. The average first round offers if there is one or two links

Result 3b. The hypothesis that rejecting an offer does not depend on the link costs was not rejected.

Table 3.5 above shows the logistic regression results on the acceptance probability of the offer. The effect of link costs on the probability of accepting an offer was, although negative, not significant. The interaction effect between link costs and number of links was negative, indicating that link costs had a smaller effect in case of 2 links, but this effect was not significant. To sum up, there was a significant positive effect of the link costs on the seller's first round offer, but only in case a 1-link network formed, and link costs did not have a significant effect on the buyers' bargaining, that is, the acceptance probability of an offer.

Effect of link costs on payoffs

Result 4a. The hypothesis that the seller is better off if there are no link costs is not rejected.

Table 3.6 shows the average net payoffs of the seller and the buyer as well as the average 1-link and 2-link payoffs. The p -values in the fifth column correspond to the tests comparing the earnings of the sellers in the 1-link network to the earnings of the seller in the 2-link network within each cost treatment. Likewise, the p -values in the last column correspond to the tests comparing the earnings of the buyers.

The seller earned on average 151.58 in the cost-0 treatment, which was significantly higher than the average earning of 82.14 in the cost-40 treatment. Note that the average earning of the seller in the cost-0 treatment was almost 89 points less than the theoretical prediction, and in the cost-40 treatment it was 38 points less. The seller also earned less than the predicted 160 points in the 1-link network.

Table 3.6 Average net payoffs per period ^{a, b}

	Seller				Buyers			
	Average	1 link	2 links	<i>p</i> ^c	Average	1 link	2 links	<i>p</i> ^c
Cost-0	151.48 (23.44)	113.57 (36.98) N=15	164.99 (22.82) N=14	<.001 N=13	34.60 (10.46)	37.02 (11.52) N=15	33.33 (11.99) N=14	.133 N=13
Cost-40	82.14 (12.45)	80.09 (27.73) N=19	75.87 (24.72) N=11	.700 N=11	18.12 (14.09)	27.97 (14.03) N=19	-7.24 (9.53) N=11	.001 N=11
<i>p</i> ^c	<.001	.002	<.001		<.001	.007	<.001	

^a Standard deviations are in parentheses ^b The number of observations are indicated with N ^c 1-tailed exact test.

There were three reasons why the seller's earnings were substantially lower than the theoretical predictions. First, contrary to the theoretical predictions, 1-link networks formed in as much as 30% of the cases in the cost-0 treatment (see Table 3.3), which decreased the seller payoffs. Second, sellers' first round offers were higher than predicted if there were two links. In both treatments, sellers offered more than 60 in the first round, whereas they were predicted to offer 0. The third reason was the buyers' rejection of the first round offers of the seller. The cumulative acceptance frequency of the offers is depicted in Table 3.7. It can be seen that in the cost-0 treatment in the 1-link network, 42 percent of the offers were rejected in the first round whereas in the 2-link network both buyers rejected the seller's offer in only 7 percent of the cases. In the cost-40 treatment, however, the percentage of rejections in the first round were similar in both 1-link and 2-link cases; 22 percent in the 1-link network and 21 percent in the 2-link network. Thus, the seller's payoff from 1-link networks in the cost-0 treatment was substantially lessened due to disagreements.

Table 3.7 Cumulative percentage of acceptances ^a

	1 link			2 links		
	First	Second	Third	First	Second	Third
Cost-0	0.58 (0.36)	0.82 (0.26)	0.95 (0.08)	0.93 (0.14)	0.97 (0.07)	0.99 (0.03)
Cost-40	0.78 (0.16)	0.94 (0.06)	0.97 (0.04)	0.79 (0.28)	0.98 (0.04)	1.00 (0.00)
p^b	.175	.164	.740	.015	.595	.487

^a Standard deviations are in parentheses ^b 2-tailed exact test.

Result 4b. The hypothesis that the buyers are better off in the cost-40 treatment is rejected.

Contrary to the theoretical prediction, buyers on average earned more (34.60) in the cost-0 than in the cost-40 (18.12) treatment (see sixth column of Table 3.6). There are two main reasons why buyers did not benefit from the presence of link costs. First, in the cost-40 treatment the 2-link networks formed in over 20% of the periods (see Table 3.3) and in these cases the buyers earned a very low payoff (-7.24). The second reason was that the buyer payoffs in the 2-link networks in the cost 0 treatment was not as low as predicted. Buyers were predicted to earn a payoff of zero in this case, but in fact they earned 33.33 on average.

To sum up, as predicted by theory the seller earned significantly more in the cost-0 treatment than in the cost-40 treatment, but the seller's earnings were substantially reduced for several reasons in both cost treatments. Contrary to the theoretical predictions, the buyer earnings were significantly higher in the cost-0 treatment than in the cost-40 treatment.

3.5. Discussion

The standard theory successfully predicts the formation of fewer links with higher link costs, as well as the (direction of the) effect of competition on the bargaining outcomes. However, in our experiment we observe two results on the effect of link

costs that cannot be explained by standard theory: (i) the seller determines which type of network is formed, and (ii) the offers of the seller are significantly affected by the presence or absence of link costs.

Theory predicts that in both cost treatments the seller offers links to both buyers, and that (on average) only one buyer offers a link to the seller in the cost-40 treatment. However, the formation of a 1-link network was mostly due to the seller, since both buyers almost always offered a link to the seller. Why did the sellers not offer two links more often in the cost-40 treatment? The reason for this is simply that it was not profitable to do so on average. Theoretically, having two links rather than one link is predicted to increase the seller's net payoff from 120 (=160-40) to 160 (=240-80). As can be seen in Table 3.6, however, in the experiment the average net payoff to the seller is actually lower in a 2-link network (75.87) than in a 1-link network (80.09). Although, a seller usually gets a larger higher share of the surplus with two links, this is not enough to compensate for the extra link costs.

The second main result that is not in line with the standard model is that the sellers on average offered 20 points more to the buyer in the cost-40 treatment (96) than in the cost-0 treatment (76) in a 1-link network. Interestingly, this finding cannot be explained by inequality aversion or equity theory either. Below we examine four potential explanations. The first two are 'static' while the last two rely on the game being repeated.

First, in line with the fairness model by Bolton and Ockenfels (2000), we explored the assumption that players care about relative payoff shares rather than absolute payoff differences (as in Fehr and Schmidt, 1999). This may matter for the predicted impact of link costs. If two sides of a link have to pay link costs of 40, their absolute payoff difference does not change, but their relative payoff shares may. To illustrate, consider a 1-link network in which the seller makes a first round offer of 80 to the buyer. In case the link costs are 0, this offer gives the buyer a share of $1/3$ ($80/240$) of the total payoff. In case the link costs are 40, however, the same offer would give the buyer a share of only $1/4$ ($40/160$). So, in order to give the buyer the same net payoff share, the seller would have to increase her offer (as

in fact we observe in the experiment). In a 2-link network this effect is mitigated (or even reversed) by the fact that the seller has to pay the link costs twice. To examine this argument more generally, it would be useful to apply the model by Bolton and Ockenfels (2000). This model, however, is only defined for games with non-negative payoffs and it is not obvious how to adjust the model such that it allows for negative payoffs. We have experimented with several alternative models, but the results are quite sensitive to the exact specification.

Second, it has been suggested that Prospect Theory (PT) might be able to explain the impact of sunk costs. Upon paying the cost of establishing a link, players may perceive to be 'in the domain of losses', which may make them more prone to take risks than in the case without link costs. Clearly, for PT to have bite there needs to be some degree of (strategic) uncertainty in the game. A natural candidate to incorporate such uncertainty is Quantal Response Equilibrium (QRE), which assumes that players make errors, and are more likely to make errors with small costs than errors with large costs (McKelvey and Palfrey, 1995, 1998). Note that the link costs can affect QRE predictions only if the utility function is nonlinear or if it incorporates loss aversion. We calculated the QRE predictions for the bargaining game to examine whether it can predict the difference in the seller's offer across the cost treatment. We assumed that all players had the same power value function with loss aversion and the same risk parameter for losses and gains³¹. We found that the 20 points difference in the seller's first period offers in the 1-link network between the cost-0 and cost-40 treatments could not be explained by QRE with any parameter value combination. The maximum point difference was 11, but then other predictions, like those on the absolute value of the offers and the net payoffs, were substantially off the mark. So, although it is possible to predict an increase in the first round offers using a combination of PT and QRE, there does not exist a

³¹ If x denotes the payoff, the utility of the subjects is $u(x) = x^\alpha$ for nonnegative x , and $u(x) = -\lambda(-x)^\alpha$ for negative x , where α is the risk aversion parameter, and $\lambda \geq 1$ measures loss aversion. We computed all QRE using values of α between 0.5 to 1, values of λ between 1 and 5, and the rationality parameter ranging from 0 (random behavior) to infinity (full rationality).

parameter combination such that average predicted behavior is close to that observed in the experiment.

Third, there is substantial experimental evidence that agents tend to act fairer towards another agent the more stable the relationship they are in. For example, in Brown, Falk, and Fehr (2004) rents tend to be shared more equally when the trading parties were contracting over longer periods of time. Therefore, a reasonable hypothesis for our game is that on average a seller offered a larger share of the pie to a buyer in the cost-40 treatment because typically they had more stable bilateral relationships in this treatment than in the cost-0 treatment. To examine this hypothesis we calculated the average number of periods that a 1-link relationship between a seller and a buyer lasted in the two treatments. Indeed, we found that 1-link relationships typically lasted longer in the cost-40 treatment (2.3 periods on average) than in the cost-0 treatment (1.4 periods on average). However, there is no evidence that sellers made higher offers to the buyer when their relationship lasted longer. Quite the contrary; on average a seller decreased the offer to the buyer when the 1-link relationship proceeded from one period to the next, and this was true for both treatments. Hence, we can reject the hypothesis that sellers' offers in a 1-link relationship are higher in the cost-40 treatment than in the cost-0 treatment because relationships on average lasted longer in the former than in the latter treatment.

A final explanation for the effect of link costs on the seller's offer in the 1-link case also relies on the game being repeated. The presence of linking costs reduces the seller's bargaining power in a 1-link network in the cost-40 compared to the cost-0 treatment. If a 1-link network is formed in the cost-0 treatment, the implicit threat by the seller to move to a 2-link network in the next period is very credible. Recall from Table 3.2 that the buyers almost always offer a link, so essentially the seller decides which network forms. This enables the seller to extract a relatively large part of the pie in the 1-link network (larger than the SPE predictions); if the buyer does not accept an offer, in the next period the seller can move to the 2-link network in which the buyer can expect to get a lower payoff. In the cost-40 treatment, it is also feasible for the seller to move to a 2-link network, but such a

move is substantially less attractive as the seller has to pay the linking costs twice. The implicit threat to move from a 1-link to a 2-link network in the next period is less credible in the cost-40 treatment and as a result the seller has to offer a larger share of the pie to the buyer.

Some empirical evidence is in line with this explanation. We investigated the rate at which sellers moved from a 1-link network in period t to a 2-link network in period $t+1$, in case the seller's offer was rejected by the buyer in the first round of period t . We find that this rate is 0.429 (18/42) in the cost-0 and 0.143 (13/92) in the cost-40 treatment. This suggests that the implicit threat to move to a 2-link network in case the seller's offer was rejected in the 1-link network was executed more frequently in the cost-0 treatment than in the cost-40 treatment.³² Moreover, moving from a 1-link network to a 2-link network was considerably more profitable for the seller in the cost-0 than the cost-40 treatment. On average, a seller increased his payoffs from 110.7 to 172.5 when moving from a 1-link to a 2-link network in the cost-0 treatment. In the cost-40 treatment, such a move increased the seller's average payoff as well, from 62.1 to 84.1, but the increase is lower than in the cost-0 treatment. These figures support the hypothesis that the presence of linking costs reduced the bargaining power of the seller in the 1-link network as it made the outside option less attractive.

3.6. Conclusion

In this paper we addressed two main questions regarding the effect of link costs on networks. First, do link costs affect the competitiveness of networks? Second, do link costs have a direct effect on the interaction within the network, independently of the network that forms?

³² Note that this difference may be biased somewhat by the fact that there were more switches for a 1-link to a 2-link network in the cost-0 treatment than in the cost-40 treatment overall.

To examine these questions we implemented a two-stage game between one seller and two potential buyers. In the first stage, the seller decides whether to form one or two links with the buyers and the buyers simultaneously decide whether to form a link with the seller. In the second stage, and conditional on the network that was formed in the first stage, the players engage in a three round alternating offer bargaining with a shrinking surplus. The players bargain over the division of the gains of trade, where at most one buyer can trade with the seller.

Regarding the first question, we find that link costs reduce the number of links as the standard theory predicts. Without link costs, a competitive network is likely to form in which the seller is linked to both buyers. The introduction of link costs reduces the prevalence of competitive networks and the seller usually ends up being linked to one buyer only. Moreover, as predicted, the competitiveness of the network has a strong effect on the bargaining outcomes. The seller is able to extract a significantly larger share of the surplus if he or she is linked to two buyers rather than one, even though the difference is not as large as predicted by the standard model based on full rationality and strict selfishness. Another notable finding is the sellers do not employ the (theoretically dominant) strategy of offering two links regardless of the link costs, whereas the buyers almost always offer a link to the seller in both cost treatments. Consequently, sellers determine the network. Many sellers offer only one link in the presence of link costs because they experience or anticipate (correctly) that on average they do not earn more in the 2-link network than in the 1-link network.

Second, we study whether the interaction in the network is affected by the costs of link formation. Standard theory predicts that link costs do not affect the interaction within the network, since network formation precedes the interaction in the network. However, we find that link costs do influence bargaining outcomes if there is one link, but not if there are two links. The presence of link costs significantly increases sellers' offers in a dyad, while offers are not affected in a triad. This finding is in contrast to the standard sunk cost argument. Several potentially relevant models (inequality aversion, equity theory, prospect theory, quantal response equilibrium) cannot account for this result either. We retain two

behavioral factors that can at least partially explain the impact of link costs on the seller's offers. One rests on the assumption that players care about their relative payoff shares (rather than about absolute payoff differences). The other explanation is based on the fact that the seller's bargaining power in the 1-link network is higher in the cost-0 than in the cost-40 treatment because the alternative, a 2-link network, is relatively more attractive in the former than in the latter treatment.

In sum, the present paper shows that link costs play a dual role for markets and other settings that require connections to be established between transacting agents. Firstly, they shape the competitiveness (power distribution) of the network, which in turn exerts a strong influence on the outcomes. Secondly, link costs have a direct effect on the interaction within a network. Link costs cannot simply be assumed to be sunk, once a network has formed. In other words, the *interaction within* a network cannot simply be assumed to be independent from the *formation* of the network.

Appendix 3A. Experimental Instructions for the Cost-0 Treatment

Introduction

Welcome to this experiment on decision making. We will first go through the instructions together. Then there will be a practice period. After the practice period the experiment will start. Talking is strictly forbidden during the experiment. If you have a question, please raise your hand and I will come to your table to answer your question.

The experiment will last about 2 hours. If you follow the instructions carefully you can earn a considerable amount of money. During the experiment your earnings will be denoted in points. After the experiment your earnings will be converted into money at a rate of 1 point is 0.5 Eurocents. In addition, you will receive a show-up fee of 7.5 Euros. Your earnings will be paid to you, privately and in cash, immediately after the experiment.

Instructions for the experiment

In this experiment, you are in a group of 3 persons. Each person has her or his own number; 1, 2, or 3. Your number is randomly determined at the beginning of the practice period and it stays the same throughout the whole experiment. Also, the composition of your group remains the same throughout the experiment. You will not know who is in your group. You and your group members are referred to as player 1, player 2 and player 3.

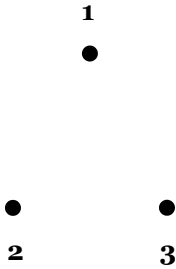
Your group faces the same task for 30 periods. The task has two parts. First, you make a decision about whether to offer links to other players in your group or not. Second, players who form a link to each other try to share an amount of points between them.

In the first part a link is formed between two players if both of them offer a link to each other. Player 1 can have two links; player 2 and 3 can have only one. Hence player 2 and player 3 each have to decide whether they want to offer a link to player 1. Player 1 has to decide whether to offer a link to player 2 and whether to offer a

link to player 3. Offering a link is not costly. Also, links that have formed are not costly.

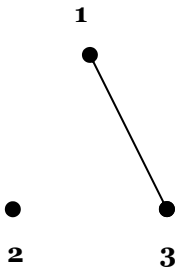
There are 4 different types of situations that can arise from the players' decisions to offer links to other players.

SITUATION A:



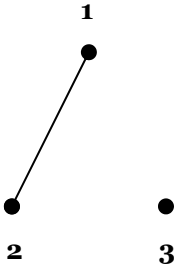
In Situation A there are no links. This occurs when player 1 and player 3 do not both offer a link to each other, and player 1 and player 2 do not both offer a link to each other.

SITUATION B:



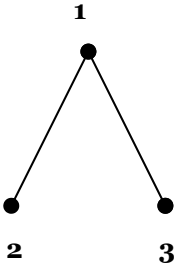
In Situation B there is only one link, namely between player 1 and player 3. This occurs when both player 1 and player 3 offer a link to each other, while player 1 and player 2 do not both offer a link to each other.

SITUATION C:

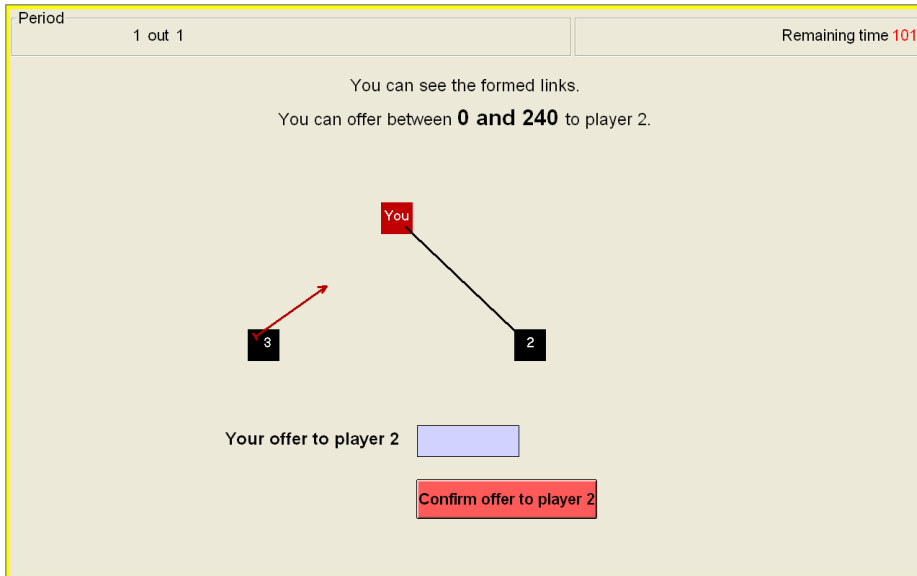


In Situation C there is only one link, namely between player 1 and player 2. This occurs when both player 1 and player 2 offer a link to each other, while player 1 and player 3 do not both offer a link to each other.

SITUATION D:



In Situation D there are two links: one link between player 1 and player 3, and one link between player 1 and player 2. This occurs when both player 1 and player 2 offer a link to each other and also both player 1 and player 3 offer a link to each other.



The figure above illustrates how the results of the first part of the period are displayed to you on the computer screen. A black line indicates that both players offered a link to each other. A red arrow indicates that one player offered a link but the other player did not offer a link to that one player. So, in this example the black line indicates that player 1 (which is "You" in this case) and player 2 offered a link to each other and as a result a link is formed between them. The red arrow indicates that player 3 offered a link to player 1 while player 1 did not offer a link to player 3. Therefore no link is formed between player 1 and player 3.

After the first part, if a link or links are formed, your group proceeds to the second part of the period. If no links are formed in the first part all members of your group receive zero points and they proceed to the next period. In the second part, two players who have a link to each other try to share a certain amount of points among the two of them. The second part has at most 3 stages. There are two aspects of the second part that change in each stage; the amount of points to be shared and the player or players that can make an offer.

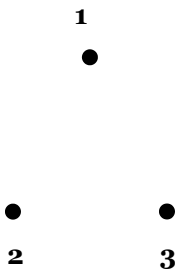
Let us first focus on the amount of points to be shared in each of the three stages. In the first stage, the amount of points that two players can share is 240. If no two

players agree on how to share the 240 points, they proceed to the second stage. In the second stage, the amount of points that can be shared is reduced by 80 points, from 240 to 160 points. If no two players agree on how to share the 160 points in the second stage, they proceed to the third and final stage. In the third stage, the amount of points that can be shared is again reduced by 80 points, from 160 to 80 points. If no two players agree on how to share the 80 points in the third stage, then the period ends and all players earn 0 points in that period.

Let us now focus on which player or players that can make an offer in each of the three stages. In the first stage player 1 offers a share to the players that s/he has links with. In the second stage player 2 and/or player 3 offer a share to player 1. In the third stage player 1 offers a share to the players that s/he has links with.

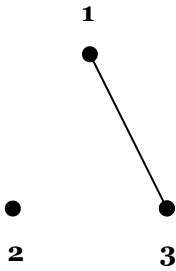
To explain the procedure in the second part in more detail, now we again go through each of the situations that can arise in the first part.

SITUATION A:

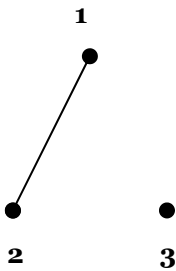


Since no links have formed in Situation A, players cannot share points. Hence, the period is over and all players earn 0 points.

SITUATION B:



SITUATION C:



Consider first Situation B in which there is one link, namely between player 1 and player 3. Recall that there are at most 3 possible stages.

First stage

- In the first stage player 1 offers between **0 and 240** to player 3. Keep in mind that an offer always means the amount of points **offered to** the other player. So, player 1 offers an amount of points to player 3; thus, player 1 demands **240 – offer** for herself/himself.
- Player 3 sees player 1's offer and decides to accept or to reject player 1's offer.
 - If player 3 accepts player 1's offer, the period is over and they share the 240 points as offered by player 1.
 - If player 3 does not accept player 1's offer, they proceed to the second stage.

Second stage if reached

- In the second stage player 3 offers between **0 and 160** to player 1.

- Player 1 sees player 3's offer and decides to accept or to reject player 3's offer.
 - If player 1 accepts player 3's offer, the period is over and they share the 160 points as offered by player 3.
 - If player 1 does not accept player 3's offer, they proceed to the third stage.

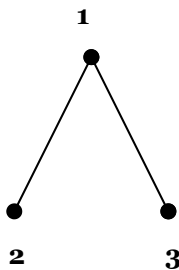
Third stage if reached

- In the third stage player 1 offers between **0 and 80** to player 3.
- Player 3 sees player 1's offer and decides to accept or to reject player 1's offer.
 - If player 3 accepts player 1's offer, they share the 80 points as offered by player 1.
 - If player 3 does not accept player 1's offer, they both earn 0 points.

Situation C is similar to Situation B except that instead of player 3, now player 2 has a link to player 1.

Let us now turn to the final situation, Situation D.

SITUATION D:



In Situation D there is a link between player 1 and 3 and a link between player 1 and 2. It is important to realize that at most one pair of players can form an agreement on how to share the points.

First stage

- In the first stage, player 1 offers between 0 and 240 to player 3 and to player 2. The offers to player 3 and player 2 can be different.

- Players 2 and 3 see player 1's offers. Players 2 and 3 decide to accept or to reject player 1's offer.
 - If both player 2 and player 3 accept player 1's offer, the computer **randomly chooses** player 2 or player 3. If player 3 is chosen, then player 1 and player 3 share the 240 points as offered by player 1, and player 2 earns 0 points. If player 2 is chosen, then player 1 and player 2 share the 240 points as offered by player 1, and player 3 earns 0 points.
 - If either player 2 or player 3 accepts player 1's offer and the other player rejects, then the player that accepts and player 1 share the 240 points as offered by player 1. Let's assume player 2 accepted player 1's offer and player 3 rejected. Then player 1 and player 2 share the 240 points as offered by player 1, and player 3 earns 0 points.
 - If both players 2 and 3 reject player 1's offer, they proceed to the second stage.

Second stage if reached

- In the second stage, player 2 and player 3 offer between 0 and 160 to player 1.
- Player 1 sees player 2's and player 3's offers. Player 1 decides to accept one of the offers, or to reject both offers.
 - If player 1 accepts one of the offers, then the player whose offer was accepted and player 1 share the 160 points as offered. Let's assume player 1 accepted player 3's offer. Then player 1 and player 3 share the 160 points as offered by player 3, and player 2 earns 0 points.
 - If player 1 rejects both offers, they proceed to the third stage.

Third stage if reached

- In the third stage, player 1 offers between 0 and 80 to player 3 and to player 2. The offers to player 3 and player 2 can be different.
- Players 2 and 3 see player 1's offers. Players 2 and 3 decide to accept or to reject player 1's offer.
 - If both player 2 and player 3 accept player 1's offer, the computer **randomly chooses** player 2 or player 3. If player 3 is chosen,

then player 1 and player 3 share the 80 points as offered by player 1, and player 2 earns 0 points. If player 2 is chosen, then player 1 and player 2 share the 80 points as offered by player 1, and player 3 earns 0 points.

- If either player 2 or player 3 accepts player 1's offer and the other player rejects, then the player that accepts and player 1 share the 80 points as offered by player 1. Let's assume player 2 accepted player 1's offer and player 3 rejected. Then player 1 and player 2 share the 80 points as offered by player 1, and player 3 earns 0 points.
- If both players 2 and 3 reject player 1's offer, players 1, 2 and 3 earn 0 points.

To summarize:

You will be in a group of 3 persons. Each person will have her or his own number; 1, 2, or 3. Your number will be randomly determined at the beginning of the practice period and it will stay the same throughout the experiment. Also, the composition of your group will remain the same throughout the experiment. You will not know who is in your group.

There will be 30 periods in the experiment. In every period there will be two parts. First, you will decide with whom to link. Second, at most one pair of linked players shares an amount of points. The important points of the experiment are the following:

- A link is formed between two players if both of them offer a link to each other.
- Player 2 and player 3 cannot form a link with each other.
- Only two players who have a link with each other can try to share a certain amount of points among themselves.
- In the second part of the period, there are at most 3 stages. In the first stage the amount to be shared is 240; in the second it is 160; in the third it is 80.
- In the first stage player 1 can make an offer, in the second stage player 2 and/or player 3 can make an offer, and in the third stage player 1 can

make an offer. If there is no agreement in the third stage, everyone gets 0 points.

- At most one pair of players can reach an agreement in a period. When there are two links and if both players 2 and 3 accept player 1's offer, either player 2 or player 3 is chosen randomly by the computer to form an agreement with player 1.
- In each period you will be informed about all the decisions made by your group members. At the end of each period, you will be informed about your and other players' earnings.
- Your total earnings will be the sum of all points you earn over all periods. For each point you earn in the experiment, you will get 0.5 Eurocents.

Chapter 4

The Stability of Exchange Networks*

4.1. Introduction

An exchange situation can broadly be defined as a situation involving actors who have the opportunity to collaborate for the benefits of all actors involved. While exchange has been intensively studied in economics for more than a century (e.g., Coddington, 1968; Edgeworth, 1881; Young, 1975), exchange entered the fields of social psychology and sociology only in the second half of the twentieth century. Homans (1958: 606) introduced the idea that ‘social behavior is an exchange of goods, material goods but also non-material ones, such as the symbols of approval and prestige’. The conception of social behavior as exchange was also used by other prominent social scientists in the same time period, such as Thibaut and Kelley (1959) and Blau (1964). After these important works research on exchange as a model of social behavior gained a prominent position in social psychology and sociology.

Since Stolte and Emerson (1977) and Cook and Emerson’s (1978) seminal studies, sociologists have focused on the effect of social structures on exchange outcomes. The basic idea of this research is that social behavior is shaped by the social relations in which it occurs, which are in return conditioned by the structures within which they are embedded (Willer, 1999: xiii). Where social behavior is conceived of as exchange, the social relation is dubbed an ‘exchange relation’ and the structure is denoted an ‘exchange network’. If two persons have an exchange relation, this means that both persons have the opportunity to exchange, but they need not do so. If they do not have an exchange relation, they have no opportunity to exchange. These opportunities and restrictions to exchange arise naturally in many real-life situations. Three of the most common causes for the absence of an exchange relation between two persons are natural barriers, non-matching preferences, and the decreasing marginal utility of relations. Examples of barriers

* This chapter is based on Doğan, Van Assen, Van de Rijt, and Buskens (2009) published in *Social Networks*, 31, 118-125.

are not knowing each other, or not being able to contact or meet each other. Also, two people might not have an exchange relation because one of them has nothing to offer that is valuable enough to the other. Finally, if maintaining each tie is costly and the marginal benefit of a relation decreases in the number of relations one already has, it could be optimal to forego some relations.

In almost all sociological studies on exchange, both theoretical and empirical, the social structure is the independent variable, i.e., what was studied was the effect of the network structure on outcomes of persons in different network positions. These studies show that network structure has a large impact on what actors earn in their exchange relations (e.g., Willer, 1999; special issue *Social Networks*, June 1992; special issue *Rationality and Society*, January 1997). The well-documented tendency for exchange experiments with small sums of money to yield rather egalitarian outcomes largely independent of experimental conditions (e.g., Roth, 1995) makes this result all the more pervasive. Since in different networks actors obtain different exchange benefits, there is an incentive for actors to change the network structure. Important questions are, therefore, how exchange networks evolve in the first place, and which networks are stable or resistant to change. Note that, although we attempt to answer these questions in the context of exchange networks, these questions are relevant to any network in which benefit differences between actors are substantial and depend on the network structure. Examples are communication, knowledge, and friendship networks.

In our study the structure of the exchange network is the dependent variable. We ask what structure can be expected to emerge if actors have the opportunity to choose with whom to maintain exchange relations, as a function of tie costs. We assume that tie costs are constant and both actors involved in a tie pay the tie costs. Actors add and keep ties only if they are marginally beneficial. We investigate the networks that are stable, and the networks that are efficient or egalitarian with varying tie costs. We have two main results. First, sparse networks consisting of only dyads and odd-sized cycles are both stable and egalitarian over a wide range of tie costs. Second, we find that at low tie costs no even-sized network exists that is both stable and efficient; we call this situation a 'social dilemma', i.e., actors end up

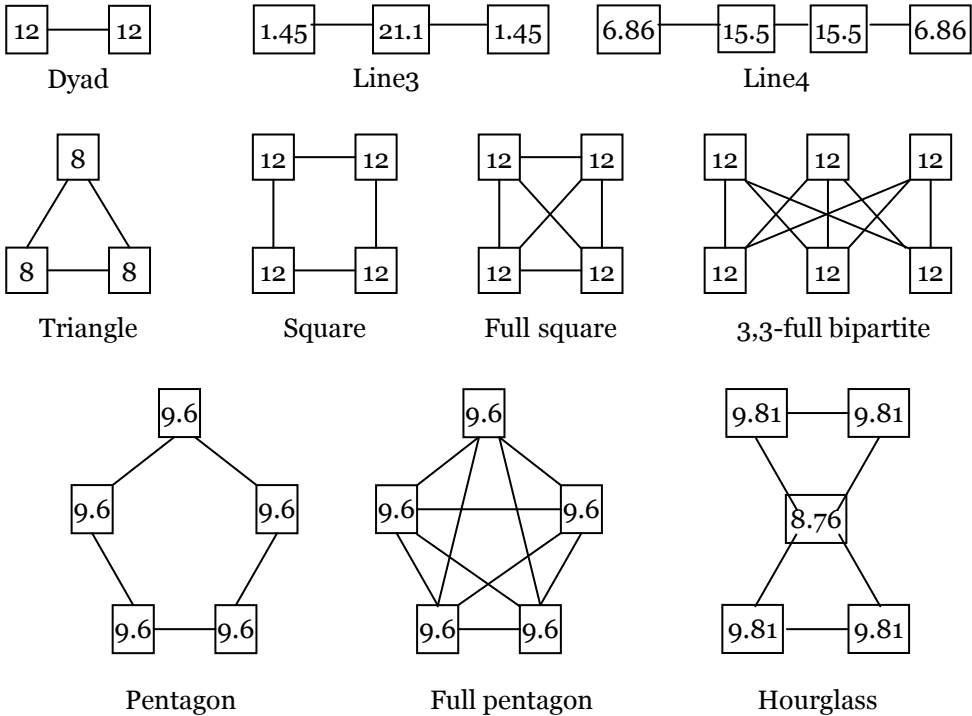
in networks where actors are unwilling to delete a tie to reach a network in which all actors are better off.

We proceed as follows. In Section 4.2 we review the sociological exchange literature and explain why we use Friedkin's Expected Value Theory for determining exchange benefits in exchange networks. We also outline the rules pertaining how actors engage in exchange. In Section 4.3, we define network stability, efficiency, and equality. In Section 4.4, we analyze the efficiency and equality of stable networks as a function of tie costs. We present simulation results for networks up to size 8 and prove three general theorems. These general theorems hold for networks of any size and hold for all published theories of network exchange. We conclude with a discussion in Section 4.5.

4.2. Theoretical Background

An exchange network is a set of actors and their exchange relations within this set. Figure 4.1 depicts some examples of exchange networks. In these networks, connected actors can exchange with each other. In sociological research on exchange networks, two assumptions have been commonly made that we also make in the present study (e.g., Willer, 1999; special issue *Social Networks*, June 1992; special issue *Rationality and Society*, January 1997). First, an exchange relation is represented as an opportunity to divide an exchange benefit of 24. Exchange occurs if two connected actors can agree on a division. If they do not agree they obtain nothing in that relation. Second, actors can only engage in one exchange, the so-called one-exchange rule. Applied to the Line3 (see Figure 4.1), the one-exchange rule implies that the central actor can exchange with one of the two peripheral actors, but not with both.

Figure 4.1. Networks with expected exchange benefits based on EVT



Theories of network exchange predict how actors divide exchange benefits given the network structure. They specify the expected exchange benefits for each actor in the network. Many theories of network exchange have been developed and tested in the last three decades; power-dependence theory (e.g., Cook and Emerson, 1978; Cook and Yamagishi, 1992), exchange-resistance theory (e.g., Skvoretz and Willer, 1993), a graph analytic theory using the graph-theoretic power index (GPI) (e.g., Markovsky, Willer, and Patton, 1988), core theory (e.g., Bienenstock and Bonacich, 1992), optimal seek theory (Willer and Simpson, 1999), identity theory (Burke, 1997), Yamaguchi's (1996; 2000) rational choice model, expected value theory (e.g., Friedkin, 1992), non-cooperative bargaining models (Berg and Panther, 1998; Braun and Gautschi, 2006), and a recent model that takes sequentiality of exchange into account (Buskens and Van de Rijt, 2008b). Four theories have received more attention than the other theories (Willer, 1999; special issue *Social Networks*, June 1992; special issue *Rationality and Society*, January 1997); core

theory, power-dependence theory, expected value theory, and NET, which is a combination of exchange-resistance, GPI, and optimal seek theories.

We use one of these exchange theories to determine what exchange benefits actors obtain in a given network. Once exchange benefits are determined we can compare the differences in benefits of actors across different networks. We can then compute the exact effect of adding and deleting ties on actors' exchange benefits. Hence, an exchange theory is required that generates a unique point prediction for the exchange benefits of each actor in each exchange network. Since core theory and power-dependence theory do not provide unique point predictions they are not suitable for our investigation. We did not select NET because there are several different versions of the theory, and the most recent version of NET advocated by its developers has not been computerized yet (Emanuelson 2005; Willer and Emanuelson 2008). Consequently, we select the remaining theory: Friedkin's (1992, 1993, 1995) expected value theory (EVT). Although uniqueness and existence for all networks is not proven, for every network up to 8 actors, the algorithm of EVT generates a point prediction. Previous research suggests that EVT, like other theories of network exchange, predict the outcomes of the exchange networks that are realized in the lab with reasonable accuracy (e.g., Friedkin, 1995; Van de Rijt and Van Assen, 2008).

After establishing the exchange benefits associated with each position in each network by using EVT, differences in benefits of actors across networks can be assessed. A number of studies have examined the effects of adding and deleting ties to one actor on his expected benefits, his neighbors' expected benefits, and the overall power differences or variance in benefits in the network (Leik, 1991, 1992; Van Assen and Van de Rijt, 2007; Willer and Willer, 2000). These studies examine the effect of exogenous network changes, whereas we focus on endogenously stable networks. That is, the actors in their studies are passive with respect to changing ties, while the actors in our study actively consider deleting and adding ties to maximize their expected benefits.

In our model, while the exact strategy space of the actors depends on the stability concept employed, the unilateral deletion and bilateral addition of a tie is shared by all stability concepts considered in this paper. An actor deletes a tie if the deletion results in a network in which he obtains a larger payoff. A pair of actors adds a tie between them if a network results in which at least one of them obtains a better payoff and none of them fares worse. Actors thus only care about immediate improvements in expected payoffs that are a direct consequence of their tie change. They do not take potential future rewards into account that could result from subsequent tie changes by other actors. They are *myopic* maximizers. Since both actors in a tie pay the tie costs, establishing a link between two actors requires mutual consent, whereas deletion of a tie is unilateral.

In this study it is assumed that *equal* tie costs are incurred for *both* actors involved in a tie. Tie costs apply for each tie that an actor has. We vary the tie cost from 0 to 12 to analyze the impact of tie costs on the stable, efficient, and egalitarian networks. Since the amount to be divided in an exchange is 24, there always exists an actor who wants to delete a tie for tie costs higher than 12. Such costs need not be considered. In this paper, we use the term expected benefits to refer to the expected benefits from exchange minus the tie costs incurred.

Expected Value Theory (EVT)

Building upon the theory of social power proposed by French (1956), Friedkin (1986) first suggested the idea of using expected values to predict the outcomes in a power structure. Friedkin (1992; 1993) extended the idea of expected values to analyze outcomes in an exchange network. Friedkin's model predicts the probability with which each maximal exchange pattern occurs, and the distribution of outcomes in each one of these patterns. A maximal exchange pattern is maximal in the sense that no further feasible transaction exists between the actors that have not exchanged yet. For example, the Line4 (see Figure 4.1) has two maximal exchange patterns: each peripheral actor exchanges with one of the central actors, or the two central actors exchange with each other. Using an iterative algorithm, each actor's expected exchange benefits are calculated as the expected value of his

exchange benefits over all possible maximal exchange patterns (see Appendix 4A for a detailed description of the EVT algorithm.)

Despite what the name suggests, EVT is not a theory based on actors rationally maximizing their benefits. The algorithm generating the predictions assumes that both actors' claim of their share in their relation increases non-linearly in the probability that each of them is excluded in any exchange. Three rules determine the final allocation in the relation. Which rule is applied depends on the sum of both actors' claims and their claims relative to half of the exchange benefits to be divided. See Friedkin (1995) for details of the EVT model. An inconvenience of the EVT model is the analytical intractability of the algorithm because of the non-linear function and the three rules embedded in it. Another characteristic of EVT is that its predictions satisfy symmetry (i.e., automorphically equivalent positions get the same payoff), however, invariance under scalar multiplication is violated (relative share is affected if all resource pools are multiplied with the same constant). EVT implies that the relative share of an actor decreases if the resource pool is increased. See Van de Rijt and Van Assen (2008) for an overview of properties of EVT and other theories of network exchange.

Figure 4.1 shows expected exchange benefits predicted by EVT for several networks. For example, in the Line3, it is expected that the peripheral actor who exchanges with the central actor receives 2.9 out of 24, while the central actor obtains 21.1. Because peripheral actors are only expected to exchange half of the time, their expected benefit is 1.45.

4.3. Definitions of Stability, Equality, and Efficiency

We borrow our definitions of what constitutes a stable network from a rapidly growing literature on network formation in economics (e.g., Demange and Wooders, 2005; Dutta and Jackson, 2003; Goyal, 2007). Some networks considered in this literature are similar to exchange networks. By doing so, we bring together research on network exchange in sociology and research on network formation in economics.

Stability

Jackson and Wolinsky (1996) introduced the *pairwise stability* concept. In his survey on network formation Jackson (2003) argues that pairwise stability might be considered a necessary condition for network stability. It is the weakest notion of stability that allows for tie formation while providing narrow predictions about the set of stable networks. An exchange network is *pairwise stable* if (i) adding a currently *absent* tie is costly to at least one of the two actors involved or leaves both actors equally well off, (ii) removing a *present* tie does not benefit either of the two actors it currently connects.

As an example of how to use the notion of pairwise stability, consider an 8-actor network where one actor is connected to three other actors, but not to the remaining four actors. This can be denoted by an ‘adjacency row’ 1110000, where the 1’s indicate the three existing relations and the 0’s the four absent relations. Then, with regard to the focal actor, pairwise stability holds if no single change from 1 to 0 (the deletion of one tie) increases this actor’s expected benefits, and if no single change from 0 to 1 (the addition of one tie) increases the expected benefits of the focal actor while not decreasing the expected benefits of the other actor in this relation. A network is pairwise stable if the conditions above hold for each actor in the network.

In our analysis we also use two stronger stability concepts that are refinements of pairwise stability: pairwise Nash and unilateral stability. Pairwise Nash is a refinement of pairwise stability, and unilateral stability is a refinement of pairwise Nash. We use these two additional concepts for two reasons. First, we want to examine whether our results are robust against alternative stability concepts. Second, we are able to prove two general theorems using pairwise Nash, which we cannot by using pairwise stability.

A network is *strongly pairwise stable* (Gilles and Sarangi, 2004) or *pairwise Nash* (Calvó-Armengol and İlkılıç, 2005) if (i) adding a presently *absent* tie is costly to at least one of the two actors or leaves both actors equally well off; and (ii) removing a

subset of an actor's *present* ties does not benefit this actor. Note that condition (i) of pairwise Nash is identical to condition (i) of pairwise stability. The difference between pairwise stability and pairwise Nash is that pairwise Nash allows for simultaneous deletions of ties. Continuing our previous example, consider again the 8-actor network with adjacency row equal to 1110000 for the focal actor. Pairwise Nash holds for this actor if each change of *one* 0 to 1 does not increase his expected benefits and the other actor is not worse off, and each change of a subset of 1s to 0s does not increase the focal actor's expected benefits. A network is pairwise Nash if this condition holds for each actor in the network.

A network is *unilaterally stable* (Buskens and Van de Rijt, 2008a; Van de Rijt and Buskens, 2007) if no actor can profitably reconfigure his ties without objection by his *new* contacts. Different from pairwise stability, unilateral stability allows for simultaneous addition and deletion of ties such that actors can replace one tie with another as long as the addition of each new tie does not make the actor in the new tie worse off³³. In our example, unilateral stability holds for the focal actor if no adjacency row other than 1110000 simultaneously (i) increases this actor's expected benefits, *and* (ii) makes no actor who is connected to the focal actor in the new network but disconnected in the old network worse off. Only the actors newly connected have to agree, because only for creating new ties mutual consent is required. A network is unilaterally stable if this condition holds for each actor in the network.

Egalitarian Networks

Networks are defined as egalitarian if all actors in the network obtain the same expected benefits in which the subtraction of the tie costs is included. Some examples of egalitarian networks are complete networks, cycles, and even-sized

³³ If a network is unilaterally stable, then it is also pairwise stable, but the opposite is not true. Hence it is possible that a network is pairwise stable at some cost level but not unilaterally stable; even if it is not profitable to add a tie, or delete ties, an actor might profitably reconfigure his network by adding more than one tie, or replacing some of his ties.

networks consisting of only dyads. We will categorize stable networks that are egalitarian.

Efficiency

With the introduction of tie costs inefficient pairwise stable networks might arise. We distinguish two forms of efficiency. First, a network is *socially efficient* if, given tie costs, there is no other network in which the sum of the expected benefits is larger than in this network. Second, a network is *Pareto efficient* if there exists no other network in which no actor earns less and at least one actor earns more than in the given network. We will investigate if there are tie cost levels for which no pairwise stable network of a given size is Pareto efficient. If such tie cost levels exist, we say that there is a tension between efficiency and stability and say that a *social dilemma* exists. It is easy to see that social efficiency implies Pareto efficiency.

4.4. Results

Friedkin's EVT is a system of many assumptions and equations that makes a formal analysis very difficult. However, we prove some general results on stability that concern networks of any size and do not depend on the use of EVT as a prediction method of exchange benefits. In addition, to get more insight into the properties of stable networks, we analyze a subset of exchange networks; all 13,597 non-isomorphic exchange networks of size 2 through 8. We first present simulation results for these small networks obtained with EVT, and then prove our general results.

Simulation Results

For all exchange networks of size 2 through 8, we computed at what tie cost levels each exchange network is pairwise stable, pairwise Nash, or unilaterally stable. In order to find these cost levels, we calculated for each network, the highest cost level h for which some pair of actors still wants to add a tie. In addition, we calculated

the lowest cost level l for which some actor still wants to remove one or more ties (depending on the stability concept). Whenever the resulting interval $[h, l]$ is not empty, the network is stable for the cost levels in this interval. The reason is that for these cost levels, tie costs are too high to add ties and too low to remove ties. Because we also need to check for simultaneous removal and addition of ties to establish unilateral stability, some more conditions need to be checked for unilateral stability. The details of this procedure can be obtained from the authors.³⁴

A first general observation is that there are rather few networks (at least for not too small network size) that are stable within some tie cost range, and that the proportion of stable networks decreases quickly with network size. If network size is 6, 17 out of 156 networks are pairwise stable of which 16 are pairwise Nash and 13 are unilaterally stable. This is about 10% of the total number of networks of size 6. When network size is 7, 40 out of 1,044 networks are pairwise stable, of which 34 are pairwise Nash and 30 unilaterally stable. Here the proportion of stable networks is around three percent. Finally, for network size 8, 105 out of 12,346 networks (less than 1%) are pairwise stable of which 93 are pairwise Nash and 72 are unilaterally stable.

Table 4.1 provides detailed information for a subset of stable networks, namely those that are pairwise stable over a tie cost range spanning at least 1 exchange point (out of 24). We use the names triangle, square, pentagon, hexagon, etc. for cycles of 3, 4, 5, 6 etc. actors. The word “full” is added if we refer to the complete network with the same number of actors (see also Figure 4.1). Table 4.1 reports lower and upper bounds on the tie cost intervals for which the networks are stable. The lower bound for pairwise Nash is not reported because it coincides with the lower bound for pairwise stability. The reason is that they both refer to the highest cost level for which some pair of actors still wants to add a tie. The table also reports the density, tie costs for which the network is egalitarian, and tie costs for

³⁴ All calculations were programmed in Borland Delphi. The source code is available from the authors upon request.

Table 4.1 Pairwise stable networks that are stable in a tie cost range larger than one³⁵

Network	Size	Lower bound for pairwise stability	Upper bound for pairwise stability	Upper bound for		Density	Tie costs for which egalitarian	Tie costs for which pairwise stable & Pareto efficient
				Lower bound for pairwise stability	Upper bound for pairwise stability			
dyad	2	$-\infty$	12	12	$-\infty$	1	always	≤ 12
dyad, isolate	3	1.449	12	12	1.449	0.333	12	1.449-12
Triangle		$-\infty$	6.551	4	$-\infty$	1	always	< 4

³⁵ The number of networks that are pairwise stable in some cost range smaller than 1 and hence not included in the table for size 2 to 8 are respectively, 0, 0, 2, 7, 28, and 88. There is one other network for size 6 that is egalitarian and stable in a small range and one that is egalitarian but not stable. There is also one other egalitarian network with 7 actors that is stable in a small range. There are 7 other networks of size 8 that are egalitarian from which 6 fulfill all stability criterions for a small range. The remaining network is unstable.

There are other networks that are pairwise stable and Pareto efficient especially for sizes equal to 5 and 7 for small cost ranges. Examples are the hourglass and the hourglass + dyad, which are both pairwise stable and Pareto efficient for cost = 1. All these other networks are non-egalitarian and have a subset of actors who are relatively well off.

A complete overview of the ranges for which networks of sizes 2 to 8 are stable is available from the authors.

two dyads	4	3.482	12	12	3.482	12	0.333	always	3.482-12
triangle, isolate		4.114	6.551	not p. Nash	not unilaterally stable	stable	0.5	4	never
Square		2.811	5.138	5.138	2.811	5.138	0.667	always	never
full square		$-\infty$	4.026	3.943	$-\infty$	3.943	1	always	≤ 0
two dyads, isolate	5	3.482	12	12	3.482	12	0.2	12	3.482-12
square, isolate		2.811	5.138	5.138	not unilaterally stable	stable	0.4	6	never
triangle, dyad		-0.536	6.551	4	0.488	4	0.4	never	-0.536-4
Pentagon		0.124	5.95	4.8	0.366	4.8	0.5	always	0.124-4.8
full pentagon		$-\infty$	0.839	0.839	$-\infty$	0.839	1	always	≤ 0
three dyads	6	3.482	12	12	3.482	12	0.2	always	3.482-12
triangle, dyad, isolate		4.114	6.551	not p. Nash	not unilaterally stable	stable	0.267	never	never
pentagon, isolate		3.326	5.95	4.8	not unilaterally stable	stable	0.333	4.8	never
square, dyad		2.811	5.138	5.138	2.811	5.138	0.333	0	never
Hexagon		2.723	5.15	5.15	2.723	5.15	0.4	always	never
3,3-full bipartite		1.941	3.007	3.007	1.941	3.007	0.6	always	never
two triangles		1.553	6.551	4	not unilaterally stable	stable	0.4	always	never
full square, dyad		1.178	4.026	3.943	1.178	3.943	0.467	0	never
full hexagon		$-\infty$	2.104	2.033	$-\infty$	2.033	1	always	≤ 0

three dyads, isolate	7	3.482	12	12	3.482	12	0.143	12	3.482-12
square, dyad, isolate		2.811	5.138	5.138	not unilaterally stable	stable	0.238	never	never
hexagon, isolate		2.78	5.15	5.15	not unilaterally stable	stable	0.286	6	never
triangle, two dyads		3.482	6.551	4	3.482	4	0.238	never	3.482-4
pentagon, dyad		0.124	5.95	4.8	0.622	4.8	0.286	never	0.124-4.8
two triangles, isolate		4.114	6.551	not p. Nash	not unilaterally stable	stable	0.286	4	never
Heptagon		0.796	5.769	5.143	0.796	5.143	0.333	always	0.796-5.143
square, triangle		2.811	5.138	4	2.811	4	0.333	never	never
full square, triangle		-0.042	4.026	3.943	2.977	3.752	0.429	4	-0.042-0
full pentagon, dyad		-0.662	0.839	0.839	0.432	0.839	0.524	never	-0.662-0
full heptagon		$-\infty$	0.395	0.395	$-\infty$	0.395	1	always	≤ 0
four dyads	8	3.482	12	12	3.482	12	0.143	always	3.482-12
triangle, two dyads, isolate		4.114	6.551	not p. Nash	not unilaterally stable	stable	0.179	never	never
pentagon, dyad, isolate		3.326	5.95	4.8	not unilaterally stable	stable	0.214	never	never
square, two dyads		3.482	5.138	5.138	3.482	5.138	0.214	0	never
heptagon, isolate		3.059	5.769	5.143	not unilaterally stable	stable	0.25	5.143	never
hexagon, dyad		2.723	5.15	5.15	2.723	5.15	0.25	0	never

square, triangle, isolate	8	4.114	5.138	not p. Nash	not unilaterally stable	0.25	never	never
3,3-full bipartite, dyad		1.941	3.007	3.007	1.941	0.357	0	never
two squares		2.811	5.138	5.138	2.811	0.286	always	never
Octagon		1.635	5.282	5.2	1.944	0.286	always	never
two triangles, dyad		1.553	6.551	4	not unilaterally stable	0.25	never	never
pentagon, triangle		0.774	5.95	4	2.47	0.286	never	never
square, full square		2.811	4.026	3.943	2.811	0.357	0	never
two full squares		1.456	4.026	3.943	1.456	0.429	always	never
full hexagon, dyad		0.594	2.104	2.033	0.594	0.571	0	never
full octagon		$-\infty$	1.326	1.254	$-\infty$	1	always	≤ 0

≡

which the network is both pairwise stable and Pareto efficient. Stable networks in Table 4.1 consist of either one component or of multiple disconnected components in which everybody has an automorphically equivalent position and therefore expects the same benefits. Between components there can be differences in expected benefits. Note that if all components are identical, stable networks are egalitarian irrespective of the tie costs.

Social efficiency is not included in the table because for positive tie costs the only socially efficient networks that exist are the dyads, possibly in combination with one isolate if the number of actors is odd. We call the unconnected dyads and at most one isolate M (inimal) networks. Given nonzero tie costs M networks are the unique socially efficient networks. In M networks the maximum number of exchanges is realized with a minimal number of ties. Total exchange benefits can never be larger and costs are minimized in M networks. In Table 4.1 we see that all socially efficient M networks are stable if tie costs are large enough, larger than 3.48 in the case of EVT. For even-sized networks, these networks are also egalitarian, and Pareto efficient. For odd-sized networks, there is some inequality in these networks because one actor obtains nothing.

The density of stable networks in general decreases with tie costs, although not monotonically. As an example, consider the pairwise stable networks of size 4. All pairwise stable networks of size 4 are listed in Table 4.1. For tie costs in the interval $[0, 4.026]$, the complete network with density 1 is pairwise stable. The square (4-cycle) with density $2/3$ is pairwise stable for tie costs in $[2.811, 5.138]$. The M network (2 dyads) with density $1/3$ is pairwise stable when tie costs are in $[3.482, 12]$. A triangle and an isolate, with density $1/2$, is pairwise stable for tie costs in $[4.114, 6.551]$. Interestingly, the often investigated Line4 network is not stable at any tie cost; for tie costs larger than 3.482 the actors with two ties prefer to delete their connection in order to form a dyad, and for tie costs smaller than 5.138 the two peripherals prefer to be connected to each other. Hence, our analysis suggests that in real-life exchange settings that resemble the point of departure of our analysis, the Line4 network will not occur often.

Because stable networks at low tie costs have a higher density than the socially efficient M networks, a social dilemma situation might exist. Indeed, if tie costs are smaller than 3.48 the even-sized M network is not stable (see also Theorem 2 below) but Pareto dominates the stable networks for such tie costs. Hence EVT predicts social dilemma situations for tie costs smaller than 3.48 in even-sized exchange networks of size 4, 6, 8; the networks will evolve into stable networks that are ‘overconnected’ and Pareto dominated by the M networks. In odd-sized networks, there exist other Pareto efficient stable networks in addition to the M network because all actors gain more than the isolate in the M network.

Although most networks listed in Table 4.1 as well as the other stable networks are not egalitarian, differences in exchange benefits across actors are mostly not large. First, no pairwise stable network is a so-called ‘strong power’ network (Willer, 1999: 109-111), i.e., there is no network up to size 8 with a minority of actors earning almost all points in their exchange relations. The largest benefit differences arise in odd-sized M networks. Within components some actors might earn a bit more than others, the hourglass network with five actors (see Figure 4.1) is one example, but if power difference becomes too large within components, there are always actors in these components who do seek other exchange relations, rendering the network unstable.

Analytic Results

The analysis of networks up to size 8 demonstrates that M networks are important: they are efficient, stable for a large tie cost interval, and egalitarian if the network size is even. Here we show some general results on the efficiency (Theorem 1) and stability (Theorem 2 and 3) of M networks of any size. Throughout the remainder of the section, the only assumptions made about the distribution of exchange benefits with no side payments are³⁶ (i) if two actors can exchange with one

³⁶ The assumptions are related only to the distribution of exchange benefits. Hence the results apply to any exchange distribution mechanism given that (i) the networks are undirected under the 1-exchange rule, (ii) there is mutual consent for tie addition, (iii) tie

another and do not exchange with third parties then they will exchange with one another, and (ii) if they both have only one exchange relation they divide exchange benefits in that relation equally. With the exception of core theory – which leaves exchange divisions in isolated dyads unspecified – all exchange theories that have been proposed in the sociological literature satisfy these requirements.

As we have already argued in the previous subsection, M networks are socially efficient networks and, therefore, they are also Pareto efficient as is summarized in the first theorem.

Theorem 1: An M network is socially efficient (and therefore also Pareto efficient) for any tie cost c in the closed interval $[0, 12]$.

Proof of theorem 1: Total benefits are maximal because the maximum number of exchanges, $n/2$ (rounded down if n is odd), is always carried out. Any additional tie reduces the total profit by $2c$. Also, the marginal benefit of each tie in the M network is 24, which is the highest possible marginal benefit a tie can have. For c in $[0, 12]$, the increase in net total benefit from each of these ties is nonnegative. Q.E.D.

In particular, M networks are the *only* socially efficient networks for tie costs in the interval $(0, 12)$. There are other socially efficient networks if tie costs are equal to 0, because in that case any network that guarantees the maximal number of exchanges is socially efficient. There are also other Pareto efficient networks. For even-sized networks, these Pareto efficient networks are non-egalitarian. By definition an M network has the minimum number of ties with the maximum number of exchanges. Hence, any Pareto efficient network other than the M network has more ties than the M network. If another Pareto efficient network is also egalitarian, then the M network Pareto dominates it for any tie cost larger than zero, which is a contradiction. None of the other Pareto efficient even-sized stable networks are included in Table 4.1, since these networks are stable only for narrow tie cost ranges. For odd-sized networks, many Pareto-efficient stable networks

deletion is unilateral, and (iv) equal tie costs are incurred for both parties in the tie.

exist. One of these networks is the cycle with all actors involved, which is egalitarian and stable over a wide range of tie costs.

M networks are unilaterally stable (and hence pairwise Nash, and pairwise stable) for high tie costs. For pairwise Nash and pairwise stability, this result can be generalized to networks of any size and any exchange theory, as Theorem 2 shows. Consider a value $d = \max(e - 12, \min(f - 12, g))$, where e is the exchange benefit of a central actor in the Line4, f the exchange benefit of the central actor in the Line3, and g the exchange benefit of the peripheral actor in the Line3. For example, $d = 3.48$ for EVT, since $e = 15.48$, $f = 21.1$, and $g = 1.45$.

Theorem 2: An M network of any size is pairwise Nash (and therefore also pairwise stable) for tie costs c in $(d, 12)$.

Proof of Theorem 2: Because everyone with a tie obtains benefits from the exchange equal to 12 in an M network, no one wants to remove a tie as long as the tie costs are below 12. Since actors can only add one tie, there are only two possible additions. First, if two dyads connect with each other the connecting actors see their exchange benefits raise to e . Thus, to make this change unprofitable, tie costs should exceed the marginal benefits of these actors, which equal $e - 12$. In odd-sized networks the isolate can try to connect to a dyad, raising his partner's expected benefits to f , obtaining g himself. For this tie addition to be unprofitable, tie costs should exceed the lowest marginal benefit across the two actors, which is $\min(f - 12, g)$. Therefore, pairwise Nash stability is established for the interval $(d, 12)$. Q.E.D.

Table 4.1 suggests that given EVT benefits, the M network is the only pairwise stable network at tie costs larger than 6.55. Networks other than M networks that are pairwise stable at, e.g., $c = 6.5$, consist of combinations of triangles, dyads, and at most one isolate. We were unable to prove that M networks are the only pairwise stable networks for any tie costs c in $(6.55, 12)$ using EVT. Nonetheless, we can prove that with tie costs c in $(6, 12)$, the only pairwise Nash and unilaterally stable networks are M networks regardless of the theory used. Note that triangles are not

pairwise Nash for $c > 4$ since one actor can improve his payoffs with $2c - 8$ by deleting two links at the same time.

Theorem 3: The only pairwise Nash (and unilaterally stable) networks with c in $(6, 12)$ are M networks.

Proof of Theorem 3: The networks with fewer ties than M networks are not stable since tie addition is profitable for two isolates. Hence, it suffices to show that in any network with more ties than an M network with c in $(6, 12)$ at least one actor wants to delete at least one of his ties. Such a network has at least one actor with two ties. Let's first assume everyone has more than one tie. Then everyone pays more than 12 for the ties. However, not everybody can earn more than 12. Thus, someone has negative net earnings and is better off deleting all ties. Hence, there should be at least one actor with one tie who has a neighbor with at least two ties (otherwise we have the M network). Let us label the actor with one tie as A, A's neighbor with at least two ties as B, and one of B's neighbors other than A as C. Actor A should have at least an expected benefit c from exchange, otherwise he would remove the tie. Actor B should have at least $12 + c$ as exchange benefit from his two ties, otherwise he would remove all his ties except with A, and get an exchange benefit of 12. But actor B can earn at most $24 - c$ from his exchange with A which is less than $12 + c$ for c in $(6, 12)$. So actor B should earn more than $24 - c$ in at least one of his other exchanges, and without loss of generality this neighbor is C. However, now actor C earns less than c from his exchange with B, and hence actor C prefers to delete the tie. Q.E.D.

4.5. Discussion

Research on network exchange in sociology has focused on the effect of the social structure on outcomes of exchange. In almost all of this research, the exchange network has been exogenous and the independent variable. The main result of this research is that network structure has a large impact on what actors earn in their exchange relations. Because positions in different networks obtain different benefits, there exist incentives for actors to change the network. Subsequently, the questions of how these networks evolve, and which networks are stable arise. In the

current article we study what the network structure looks like if actors have the opportunity to choose with whom they have an exchange relation, that is, the network structure is our dependent variable.

We investigate the networks that are stable, the networks that are efficient or egalitarian with varying tie costs, and the occurrence of social dilemmas. We employed the assumptions mostly used in the sociological literature on exchange networks, including the one-exchange rule and that the value of each exchange relation is the same. Additionally, we assume that actors delete and add ties in order to maximize their expected benefits; for adding ties mutual consent is needed, whereas tie deletion is unilateral. Ties are costly and the costs are the same for both actors in the tie. To assess the stability of exchange networks we employ three stability concepts from the economic literature on networks: pairwise stability, pairwise Nash, and unilateral stability. In addition, social efficiency and Pareto efficiency are used as efficiency measures, and the networks are considered egalitarian if all actors in the network expect the same benefits. To calculate the actors' expected benefits we use Friedkin's Expected Value Theory. First, we investigate all networks up to size 8. Then we prove three general results.

Few networks are stable over a wide range of tie costs, and all of them can be divided into two types: M networks consisting of only dyads and at most one isolate, and cycles with an odd number of actors. Even-sized M networks and odd cycles are egalitarian. As we have shown, M networks of any size are the only *socially* efficient networks for any tie costs but they are only stable starting from intermediate cost levels. Hence, any stable network is socially *inefficient* at low tie costs. Finally, we observe social dilemmas at low tie costs in even-sized networks; that is, none of the (*socially* inefficient) stable networks are *Pareto* efficient. Using pairwise Nash or unilateral stability does not change any of these results.

A remarkable result is that almost all egalitarian networks up to size 8 are stable at some tie costs. Although actors in our model maximize their own expected benefits that do not include equality preferences, they can be "satisfied" in egalitarian networks. Nonetheless, many non-egalitarian networks are stable as well. Thus, it

is an interesting empirical question whether exchange networks evolve into non-egalitarian networks in real world settings. To what extent actors' preferences for equality [as in Fehr and Schmidt (1999)] *do* affect the stability of networks, and whether these preferences are observed in the evolution of (exchange) networks remains to be examined.

Although there exist stable networks that are also efficient at some tie costs, most stable networks are not efficient. Hence, tensions between stability and efficiency arise over a wide range of tie costs. This tension is strongest in even-sized networks at low tie costs where social dilemmas occur, because at such tie costs no stable network is Pareto efficient. It is an interesting empirical question whether actors resist the immediate temptation and end up in the both socially and Pareto efficient but not stable M network. Preferences for efficiency can be incorporated in the actors' utility function as in Charness and Rabin (2002), and the effect of efficiency and equality preferences on the evolution and stability of networks can thus be examined.

The results of our study can be compared to those of Bonacich (2001), and Van de Rijt and Buskens (forthcoming) who studied the dynamics of sociological exchange networks. Bonacich (2001) simulated exchange network evolution and found that, in equilibrium, differences in benefits were small. One important difference between our analysis and Bonacich's analysis is that in his simulation the actors are assumed to be myopic *satisficers* such that they change the network if their earnings drop below a certain level. In our study, however, the actors are assumed to be myopic *maximizers* such that they change the network as long as marginal benefits outweigh marginal tie costs. Another difference is that instead of adding or deleting ties, Bonacich' actors move to another cell on a checkerboard, where they can exchange with actors in adjacent squares. Interestingly, despite these different assumptions, he also arrives at the conclusion that in equilibrium networks are egalitarian. Bonacich (2004) provides some intuitions for how this approach can be extended to more general structures. Van de Rijt and Buskens (forthcoming) analyzed the stability of exchange networks employing the same stability concepts, but using another exchange theory, and without focusing on efficiency and equality.

Our stability results are very similar to the ones reported in their paper, and confirm the robustness of the dynamics results across exchange theories.

The focus of the present article is on the possible path ends of the evolution of exchange networks, i.e., the stable networks. Consequently, a natural extension is investigating how to get to these possible endpoints, i.e., the evolution of the network. The probability of reaching each stable network could also be investigated. Factors that could determine these probabilities are the initial network configuration, tie costs, and preferences for equality and efficiency. It might also be that stable networks differ in their robustness to the errors of actors. In some stable networks one error might be enough to move to another stable network, whereas other stable networks might be stable after one or more accidental errors. Such issues remain to be investigated both in the laboratory, and by theory or simulation.

In our analysis we assume that actors are myopic; they only take their immediate benefits into account but not the consequences of their behavior on future benefits. The justification of this assumption is that not only it makes the analysis more tractable, but also that actor behavior in the laboratory seems to be rather myopic as well. Most actors are found to think two, or at most three steps ahead in many different experimental games (Camerer 2003, Ch. 5). Nevertheless, in their book on network formation Dutta and Jackson (2003:13) argue that allowing for farsighted actors in models of network evolution is “perhaps the most important (and possibly the hardest) issue regarding modeling the formation of networks”. Actors taking the future into account are likely to affect the evolution and stability of exchange networks. To mention two examples, taking the future into account gives opportunities to solve social dilemmas and the problems of inefficiency of stable networks as described above. An even-sized M network that is efficient but not stable can be sustained as equilibrium if the actors are rational and the ‘network evolution game’ is indefinitely repeated. Similarly, an odd-sized M network that is efficient but neither stable at low tie costs nor egalitarian can be sustained as equilibrium if the shadow of the future is sufficiently long, and if the actors

coordinate on alternating the excluded actor. Alternating the excluded actor ensures that both efficiency and equality are satisfied.

The implications of the current study extend to other social networks among which are communication, knowledge, and friendship networks. In these networks similar questions of stability are of interest such as whether only few networks are stable, and whether stable networks tend to be egalitarian. As Jackson and Wolinsky (1996) showed with a theorem in their seminal paper, there exist a tension between stability and efficiency in different economic and social network contexts. Thus, analyzing whether actors form socially inefficient but stable networks that correspond to social dilemma situations is particularly appealing. For example, Buskens and Van de Rijt (2008a) show that efficiency, stability, and equal divisions of outcomes can also go hand in hand even in competitive network formation settings in which everybody strives for a central network position. Considering the importance of network studies in aforementioned fields, more of such analyses are to be expected.

Appendix 4A. Expected Value Theory

Building upon the theory of social power proposed by French (1956), Friedkin (1986) first suggested the idea of using expected values to predict the outcomes in a power structure. Friedkin (1992; 1993) extended the idea of expected values to analyze outcomes in an exchange network. In this expected value model of social exchange, Friedkin defines R -networks and their probabilities, and a method to calculate the expected value of a certain position in a certain R -network. An R -network is defined as a subset of exchange relations. An R -network is assumed to be maximal in the sense that no further feasible transaction exists. For example, consider the Line4 that has two R -networks; $R_1 = \{\{A-B\}, \{C-D\}\}$ and $R_2 = \{\{B-C\}\}$.

Friedkin (1995) introduced a function of offers, f_{ij} , made by actor i to actor j . If 24 points are divided in the exchange, f_{ij} amounts to

$$f_{ij} = 24 - 23^{1-d_i} \quad (1)$$

Friedkin claims that the function f_{ij} is built on the theory of Cook and Emerson (1978) where actors lower their offers when their offers are not accepted. He introduces the dependency of actor i on j , d_i , which, under a 1-exchange rule, is simply the probability that actor i is not involved in an exchange. The following three assumptions deal with what happens to the outcomes or values obtained by the actors in the relation when the personal claims $24 - f_{ij}$ and $24 - f_{ji}$ do not add up to the amount of available resources, 24. The first assumption says that when the actors' personal claims sum up to more than the available resources, they get the average of the difference between their claims plus available resources. To illustrate the idea: when f_{ij} is 4 and f_{ji} is 8, i 's and j 's personal claims are 20 and 16 respectively. Hence, the first assumption states that player i will obtain $(24+20-16)/2$ which is 14 and j will obtain $(24+16-20)/2$ which is 10. The second assumption says that if both actors claim less than one-half of the resources, they split the resources equally. The third assumption says that if one actor claims less than one-half and the other claims one-half or more and the sum of the two claims is less than the available resources, the unclaimed portion is allocated to the one who asks for less.

The iterative algorithm of the 1995 version of EVT subsequently updates exchange outcomes, called “values” in EVT, and probabilities that each exchange is used. In iteration zero each actor obtains 12 in each of her relations. In iteration 1 the probabilities are calculated using the values in each relation. Subsequently, the values are updated using the probabilities that determine d_i , as explained in the previous paragraph. The first iteration is repeated until the algorithm converges.

The probabilities that an exchange is used are calculated in four steps. First, a weighting matrix $W = [w_{ij}]$ is introduced, with

$$w_{ij} = \frac{v_{ij}}{\sum_{j=1}^n v_{ij}} \frac{v_{ji}}{\sum_{i=1}^n v_{ji}} \quad (2)$$

$V=[v_{ij}]$ in (2) denoting the $n \times n$ matrix of values where v_{ij} denotes the expected exchange outcome of i when exchanging with j . Note that w_{ij} can be considered as the product of the relative values of relation ij to i and j . By definition, $v_{ij} = 0$ if i and j cannot exchange. In the next steps the following formula is used to calculate the probability that ij is used *first, conditional on the remaining relations not used yet*:

$$p_{ij} = \frac{w_{ij}}{\sum_{j=1}^{n^*} \sum_{\substack{i=1 \\ i \neq j}}^{n^*} w_{ij}} \quad (3)$$

That is, the summation in the denominator of (3) is only over the n^* actors that have not yet exchanged. In the second step all possible sequences of exchanges are listed in which a relation ij takes part. All these sequences are obtained by taking all R -networks of which ij is a part of. Third, the probability of each sequence is calculated as a product of conditional probabilities using (3). Finally, the probability that relation ij is used equals the sum of the probabilities of all sequences containing ij across all R -networks. Probability d_i is the sum over all the probabilities that each of her relations is used. Probabilities d_i are used to calculate the new values of v , which are again used to compute the new probabilities, etc.

An example will clarify the complicated iterative procedure. For example, consider again the Line4. $p_{AB} = P(\text{first } \{A-B\}, \text{ then } \{C-D\}) + P(\text{first } \{C-D\}, \text{ then } \{A-B\})$,

where $P(\text{first } \{A-B\}, \text{ then } \{C-D\}) = \frac{w_{AB}}{w_{AB} + w_{CD} + w_{BC}} \frac{w_{CD}}{w_{CD}}$, and $P(\text{first } \{C-D\},$

then $\{A-B\}) = \frac{w_{CD}}{w_{AB} + w_{CD} + w_{BC}} \frac{w_{AB}}{w_{AB}}$. Similarly, $P(R_2) = P(\{B-C\})$

$\frac{w_{BC}}{w_{AB} + w_{CD} + w_{BC}}$. At iteration 0, all weights are equal, so $p_{AB} = p_{CD} = 2/3$ and p_{BC}

$= 1/3$. The next step is deriving the d_i 's, $d_A = d_D = 1/3$ and $d_B = d_C = 0$. Using these values in the offer function f_{ij} and using the three assumptions to solve for inconsistent offers, we get the V matrix. Using this function we can see that $f_{AB} = f_{DC} = 15.91$, $f_{BA} = f_{BC} = f_{CB} = f_{CD} = 1$. Using the first assumption for dealing with claims that sum to more than the amount of available resources, we get: $v_{AB} = v_{DC} = 4.55$, $v_{BA} = v_{CD} = 19.45$, $v_{BC} = v_{CB} = 12$. The values of w_{ij} are now determined from these v_{ij} using (2). The new w_{ij} values will then be used to calculate probabilities again, then the d_{ij} and then subsequently the v_{ij} etc., until the values and probabilities converge. After many iterations we obtain $v_{AB} = v_{DC} = 7.96$, $v_{BA} = v_{CD} = 16.04$, $v_{BC} = v_{CB} = 12$, and $d_A = d_D = 0.138$.

Using the values and probabilities we can calculate an actor's expected payoff in the network by

$$E(v_i) = \sum_{i=1}^n \sum_{j=1}^n p_{ij} v_{ij} \quad (4)$$

where v_i denotes the expected value of i . Applying (4) to our example yields $E(v_A) = E(v_B) = 0.862 \times 7.96 = 6.86$, $E(v_B) = E(v_C) = 0.862 \times 16.04 + 0.138 \times 12 = 15.48$.

Chapter 5

Testing Models of Pure Exchange*

5.1. Introduction

An *exchange situation* can be defined as a situation involving actors who have the opportunity to collaborate for the benefits of all actors involved.³⁷ Exchange as a typical example of bargaining is intensively studied in economics (e.g., Coddington, 1968; Young, 1975). While bargaining in general, and exchange in particular, became the object of research of economists in the late nineteenth century (Edgeworth, 1881), exchange entered the fields of social psychology and sociology only in the second half of the twentieth century. Homans (1958) was among the first social scientists to regard social behaviour as exchange. More specifically, Homans (1958, p. 606) stated that "social behaviour is an exchange of goods, material goods but also non-material ones, such as the symbols of approval and prestige". This approach to social behavior, known as *social exchange theory*, was also used by other researchers of the same era, such as Thibaut and Kelley (1959) and Blau (1964).

The present study focuses on explaining outcomes of human behaviour in pure exchange situations. *Pure exchange situations* can be described as situations in which no production is possible and the commodities that are ultimately consumed are those that individuals possess as endowments (Mas-Colell, Whinston, & Green, 1995, p. 515). Two examples of simple pure exchange situations of two goods by two actors are presented in Table 5.1. C denotes the endowments X, Y that actors A, B initially have, and I denotes the utility of one unit of each endowment. Note that the definition of I implies that an actor's utility is linear in his endowments. In both situations of Table 5.1 actors A and B can make a mutually profitable exchange. For

* This chapter is based on Doğan and Van Assen (2009) published in *The Journal of Mathematical Sociology*, 33, 97-128.

³⁷ This definition of an exchange situation is similar to Nash's (1950, p. 155) definition of a two-person bargaining situation.

example, in Situation 1, if A transfers all of his X ($C_X = 1/2$) to B , and B transfers all of his Y ($C_Y = 1/2$) to A , then both gain $1/6$ ($= 2/3 \times 1/2 - 1/3 \times 1/2$).

Table 5.1 Two Examples of Bilateral Pure Exchange

Actors	<i>Situation 1</i>				<i>Situation 2</i>			
	<i>A</i>		<i>B</i>		<i>A</i>		<i>B</i>	
Goods	X	Y	X	Y	X	Y	X	Y
C	$1/2$	$1/2$	$1/2$	$1/2$	$1/2$	$1/2$	$1/2$	$1/2$
I	$1/3$	$2/3$	$2/3$	$1/3$	$8/9$	$1/9$	$2/3$	$1/3$

Note. Actors A, B can exchange their initial endowments X, Y . C denotes the initial endowment, I the utility of one unit of an endowment.

There exist two main theoretical approaches for predicting final endowments given both the initial endowments and the preference relations of the actors on the endowments (Hildenbrand & Kirman, 1988; Kreps, 1990). The first approach is called the *general equilibrium* or *competitive (Walrasian) equilibrium*. It assumes that actors in the exchange economy take prices or exchange rates between goods as given. Sociologist Coleman (1972, 1973, 1990) used the competitive equilibrium approach of economics to calculate the final allocation of endowments in pure (social) exchange. The second approach, attributed to Edgeworth (1881), involves the idea that actors independently or cooperatively improve upon the initial distribution of the goods; it does not assume that actors are price-takers. The main concept in the second approach is the *core*. The core of pure exchange economies with a small number of actors is usually a subset of the endowment space containing many possible outcomes. Some solution concepts from cooperative game theory predict a single-valued solution that is necessarily in the core. The *Nash* solution (1953), the *Raiffa-Kalai-Smorodinsky (RKS)* solution (Kalai & Smorodinsky, 1975; Raiffa, 1953), and Myerson's (1977) solution of *equal utility gain* (EG) are well-known.³⁸ These models will be discussed in detail in Section 5.2.

³⁸ Psychologist Emerson (e.g., 1962, 1976) formulated power-dependence theory on the basis of the EG solution to predict outcomes of bilateral exchange and exchange in small

The goal of the present paper is to explain human behavior in pure exchange situations. Behavior is modelled by three types of models that differ to the extent they assume behavior to be rational. The first type concerns all the cooperative bargaining models discussed above, i.e., the core, Nash, RKS and equal utility gain. A central assumption of these models is that the final allocation is *weakly Pareto optimal*, i.e., the final allocation is such that no additional exchange can be carried out that increases the payoff or utility of the actors involved in the exchange. Possible deviations from weak Pareto optimality might be caused by the procedure used in the experiments that are analyzed in this paper. In this procedure participants were only allowed to exchange bilaterally. Therefore we developed a model of bilateral exchange, which is our second type, assuming that bilateral exchange is Pareto optimal. This model is an adaptation of Stokman and van Oosten's (1994) model to forecast outcomes of collective decision making. Finally, the third type of model assumes that actors are boundedly rational. The model assumes that the task complexity of detecting a mutually profitable exchange ratio varies across bilateral exchange opportunities, and hence that the exchange opportunities that are more difficult to detect are less likely to be carried out. Both the bilateral exchange and boundedly rational models focus on a different level than the cooperative bargaining models. Whereas the cooperative bargaining models provide predictions at the macro level directly, the bilateral exchange and boundedly rational models infer predictions at the macro level from predictions of behavior at the micro level, i.e., at the level of exchanges between pairs of actors. Both models are discussed in Section 5.2.

Our investigation of pure exchange uses the aggregated data of Michener, Cohen, and Sørensen's (1975, 1977) experiments. Michener et al (1975) and Michener et al (1977) examined pure exchange situations with three actors exchanging four goods, and with four actors exchanging five goods, respectively. These experiments are

groups of actors. Although initially social scientists concentrated on pure exchange, their attention rapidly shifted to the study of exchange as represented by splits of common resource pools. Most of that work concerns the bilateral exchanges between pairs of actors contained in networks, so-called exchange networks. For instance, see Willer (1999) for a description of the large body of research on network exchange.

described in Section 5.3. Michener et al's (1975, 1977) main aim was to test Coleman's competitive equilibrium approach of social exchange. However, as is explained in Appendix 5B, Michener et al's experiments do not comprise an appropriate test of Coleman's model because the experiments do not match the assumptions of the Coleman's model. Nonetheless, we discuss Coleman's model and analyze its predictions in Section 5.2 because it fits the experimental data well and provides insight into human behavior in pure exchange situations.

In Section 5.4 Michener et al's data are re-analyzed using the cooperative bargaining models, the bilateral exchange model, and the bounded rationality model. This reanalysis reveals that Coleman's model, although its assumptions do not match those of the experiments, performed on average at least as good as the cooperative bargaining models. However, the bilateral exchange model developed in the present paper performed best. As expected, task complexity was found to be inversely related to successfully reaching a mutually profitable agreement in bilateral exchange situations. The analysis revealed that subjects had problems reaching a mutually profitable agreement if they had to give up a good they liked, and in particular if they liked this good more than the good they obtained in the exchange. After discussing these results and their implications in the Discussion section we conclude with the Conclusions section.

5.2. Models and Hypotheses

All the models and hypotheses are illustrated using the exchange situations that are presented in Table 5.1. It is important to note that A 's and B 's payoffs are linear in their endowments, which was also the case for the actors in the exchange situations in Michener et al's experiments.

No-exchange model

The no-exchange model assumes that the final allocation is equal to the initial allocation. Hence it predicts that each actor in situation 1 and 2 presented in Table 5.1 still obtains half of each resource and gain no utility. The no-exchange model is

used as a reference or null model to calculate the explained variances of final allocations of goods by other models in the Results section.

Coleman's model of exchange

Coleman labels endowments as 'controls' C , and preferences as 'interests' I over goods in the pure exchange situation. Two basic assumptions of Coleman's model are that each actor is a price-taker, and that the utility of the players is of Cobb-Douglas type, i.e.,

$$U_i = c_{i1}^{x_{i1}} c_{i2}^{x_{i2}} \dots c_{im}^{x_{im}} \text{ for all actors } i=1\dots n \text{ and for goods } j=1\dots m \quad (1)$$

where U_i is the utility of actor i , c_{ij} is the amount of good j actor i has and x_{ij} 's are known interest parameters (with $\sum_{i=1}^n x_{ij} = 1$). Coleman (1990) used competitive

equilibrium to generate a point prediction of the final allocation of goods C_{ij}^* , the value or price of good v_j , and the resources of an actor r_i after exchange. In competitive equilibrium $v_j = \sum_{i=1}^n x_{ij} r_i = \sum_{i=1}^n x_{ij} \sum_{k=1}^m c_{ik} v_k$, which yields

$$C_{ij}^* = \frac{x_{ij} r_i}{v_j} \quad (2)$$

after scaling arbitrarily the r_i and v_j such that their sum over individuals and goods are equal to 1 respectively (see, e.g., Coleman, 1990, chap. 25 for a detailed exposition).

Applying Coleman's model to Situation 1 predicts the final allocation as $C_{AX}^* = C_{BY}^* = 1/3$, $C_{AY}^* = C_{BX}^* = 2/3$, and a payoff gain for $A = B = (2/3) \times (2/3) + (1/3) \times (1/3) - 1/2 = 1/18$. However, the assumption of Cobb-Douglas utility is violated in Situation 1. Since utility is linear and not Cobb-Douglas both actors can improve their payoffs substantially by switching to another allocation of goods: if A transfers all his X 's to B and B transfers all his Y 's to A , their payoff gain will increase to $2/3 - 1/2 = 1/6$. This is visualized in Figure 5.1a which depicts Coleman's prediction and predictions assuming Pareto optimality for Situation 1.

The interior of Figure 5.1a denotes all possible payoff gains from exchange (multiplied by 36). The two connected straight lines to the upper right of the interior represent the Pareto optimal outcomes. The kink at the junction of the two lines occurs at an exchange ratio equal to 1. To conclude, Coleman's prediction assuming Cobb-Douglas utility, is far from being Pareto optimal when utility is in fact linear. Applying Coleman's model to Situation 2 yields the same conclusion. The payoff space of Situation 2 is depicted in Figure 5.1b (multiplied by 168). Coleman's model predicts players *A* and *B* to gain $1/28 (= 6/168)$ at an exchange ratio equal to 3.5. However, each player can earn twice as much at the same exchange ratio of 3.5 if *A* transfers more of his *Y*'s and *B* transfers more of his *X*'s.

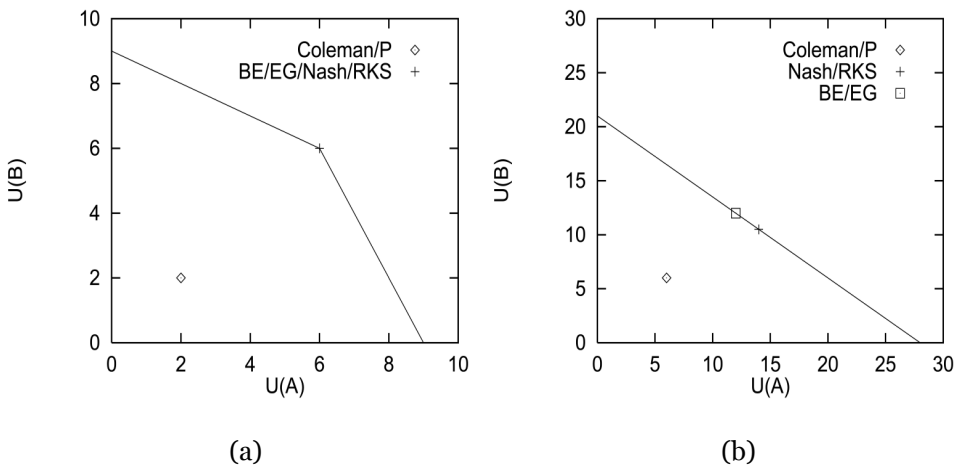


Figure 5.1. Payoff spaces of bilateral exchange Situation 1 and 2 of Table 5.1. The payoffs are multiplied by 36 and 168 in Figure 5.1a and Figure 5.1b, respectively. The payoff gain predictions of bilateral exchange (BE), Coleman, Nash, RKS, and equal utility gain (EG) models are depicted.

There are two important implications of Coleman's model for our analysis. First, as illustrated by the two simple bilateral exchange situations, Coleman's model can predict irrational behavior or suboptimal outcomes of exchange. This paradox resulting from the mismatch of the assumptions of Coleman's model and the payoff function used in the experiments for the subjects is explained in Appendix 5B. The consequence of this mismatch is that Michener et al. (1975, 1977) do not comprise an appropriate test of Coleman's model of pure exchange. The second implication is

that it predicts that each actor obtains from each good an amount equal to his proportionate interest in that good if the value of resources is equal across actors: using (2) and $r_A = r_B$ we get $c_{AX}^*/c_{BX}^* = x_{AX}/x_{BX}$ and $c_{AY}^*/c_{BY}^* = x_{AY}/x_{BY}$. For example in Situation 2 Coleman's model predicts $c_{AX}^*/c_{BX}^* = \frac{4}{7}/\frac{3}{7} = x_{AX}/x_{BX} = \frac{8}{9}/\frac{2}{3}$ and $c_{AY}^*/c_{BY}^* = \frac{1}{4}/\frac{3}{4} = x_{AY}/x_{BY} = \frac{1}{9}/\frac{1}{3}$ because $r_A = r_B = 1/2$. If an actor has more resources than another actor, Coleman's model predicts that he obtains more than his proportionate interest in that good.

Proportional interest model

The proportionate interest (P) model predicts that the players have final controls proportionate to their interest in the goods, i.e., $c_{ij}^* = x_{ij} / \sum_{j=1}^n x_{ij}$. Note that it does not take into account the initial endowments. If the value of all actors' resources is equal, Coleman's model and the P model provide the same predictions. Hence both models predict the same allocations in situations 1 and 2. Consequently, also the P model can predict irrational behavior or suboptimal outcomes of exchange (see also Appendix 5B).

Models of cooperative bargaining

The core is based on two assumptions, individual rationality and weak Pareto-optimality:

- (i) The payoff vector $u = (u_1, \dots, u_n)$ is individually rational i.e.

$$u_i \geq u_{i \text{ initial}} \quad \forall i \in N,$$
- (ii) u is weakly Pareto optimal i.e.

$$u \in PO(S) \text{ where } PO(S) := \{u \in S : \forall y \in R^n : y > u \Rightarrow y \notin S\},$$

where S is a compact convex subset of R^n denoting the set of all payoff vectors that can be the outcome of the bargaining. In the experiments, S is the set of all possible payoff triplets or quadruplets that makes each player *at least* as well off as his initial payoff. The core implies that after exchange there is no payoff vector which makes all players better off.

Usually, the core contains a large (often infinite) set of payoff vectors. For example, the core in the bilateral exchange situations of Table 5.1 is represented by the straight lines in Figure 5.1a and 5.1b. The core of the pure exchange situations in Michener et al's studies are three-dimensional and four-dimensional spaces. To make unique predictions on the set of core solutions, other cooperative game theory solution concepts have been developed. These solutions select one solution from the core that satisfies one or more reasonable or 'fair' requirements of a solution.³⁹ In the present study we use the *Nash* bargaining solution, the *Rafai-Kalai-Smorodinsky* bargaining solution, and Myerson's equal utility solution.

The *Nash* bargaining solution is the vector of utilities or payoffs that satisfies

$$\arg \max_{d \leq s \in S} \prod_{i=1}^n (s_i - d_i)$$

where $\langle S, d \rangle$ is a bargaining problem and $i=1 \dots n$ denotes the

players. S , as before, is a compact convex subset of R^n denoting the set of all payoff vectors that can be the outcome of the bargaining, and d is the disagreement payoff vector. The disagreement payoff vector, d , is the players' payoff before exchange. The Nash bargaining solutions in Figure 5.1a and 5.1b are (6, 6) and (14, 10.5), respectively.

The *Rafai-Kalai-Smorodinsky* (*RKS*) solution is the intersection point of the weakly Pareto optimal set, $PO(S)$ as defined before, with the line that connects the disagreement point, d , with the utopia point. The utopia point is defined as $utopia(S, d) := (\max\{x_1 : x \in S, x \geq d\}, \dots, \max\{x_n : x \in S, x \geq d\})$. So, the RKS solution is found by defining the ray passing through the two points d and $utopia(S, d)$ and

³⁹ In theory, some models of cooperative bargaining, like Nash or equal utility gain, can select more than one solution (e.g., see Heckathorn 1978). However, always one solution is selected in the pure exchange situations here because of the linearity of the payoff space. For an explanation of the set of requirements underlying the Nash and RKS bargaining solutions, see Luce and Raiffa (1957) and Felsenthal and Diskin (1982).

then selecting the point at which this ray intersects with the core. The RKS solutions are identical to the Nash solutions for both situations in Figure 5.1.⁴⁰

The *equal utility gain (EG)* solution assumes that players only care about the absolute utility increase of each player in an exchange situation. Formally, EG is the solution to $\max \theta$ s.t. $\forall i: u_i = d_i + \theta$ and $(u_1, \dots, u_n) \in S$. So, the EG solution is the point where the unit vector, or the ray representing equal utility increments for all players starting from the disagreement utilities, intersects with the core. The EG solution predicts (6, 6) in Situation 1, and (12,12) in Situation 2.

Bilateral exchange model

Michener et al.'s experimental procedure only allowed for bilateral exchanges, and not for agreements between three or more players. Nonetheless, the cooperative solution concepts mentioned above assume that *any* coalition of players can be formed for exchange. Because of this mismatch between the solution concepts and the experimental procedure, an outcome of a pure exchange situation might not be in the core, but still be 'rationalizable'. For example, consider an example of *generalized exchange* (e.g., Bearman, 1997) with three actors A, B, and C: A wants what B has, B wants what C has, and C wants what A has. No profitable bilateral exchange is possible; hence an outcome in which no exchange occurs is rationalizable. However, the core solution predicts that each good is transferred to the actor who wants it.

We employ a model of bilateral exchange that fits the experimental procedure. It is based upon the model of collective decision-making developed by Stokman and van Oosten (1994). The model detects and employs the exchange opportunities of actors in the exchange situation. That is, it works on the micro level, whereas the

⁴⁰ Assuming linear payoffs, payoff spaces of bilateral pure exchange situations in which one good is exchanged for one other good either have one kink or no kink. It can be shown that the Nash and RKS solutions are always equal if there is no kink, and are equal only under certain conditions if there is a kink.

cooperative bargaining models are macro level models. It assumes that actors in a collective decision-making situation bilaterally exchange voting positions in order to affect the final outcome to their advantage. It uses the EG solution to specify the ratio of each bilateral exchange. Generalizing Stokman and van Oosten's (1994) model to predict outcomes of pure exchange situations leads to the following *bilateral exchange (BE)* algorithm consisting of two iterative steps:

- (i) *Conditional on the current allocation of endowments, construct a list of mutually profitable bilateral exchange opportunities, ordered with respect to payoff gain. If some exchange opportunities yield the same profit, then order these exchanges randomly.*
- (ii) *Execute the bilateral exchange opportunity on top of the list*
Repeat steps (i) and (ii) until the list is empty.

If some exchange opportunities yield the same profit in step (i), the random order determines the exchanges carried out and consequently the final allocations. Therefore we ran the algorithm 1,000 times and calculated the final c^* as the average c^* across these 1,000 runs.

It is assumed in the algorithm that actors give up and receive only one good in each exchange. Note that the list can be ordered, because the EG solution specifies an equal gain for both actors in the exchange. A strong assumption of the model is that a less profitable exchange is carried out later than a more profitable exchange, even if the two exchanges concern a pair of different actors. Finally, the model can be said to assume bounded rationality of the actors: they do not take into account that generalized exchange or perhaps another order of bilateral exchange might result in a higher payoff for each actor.

Bounded rationality model

A bounded rationality model is developed to explain possible deviations from weak Pareto optimality, either in the whole group (models of cooperative bargaining) or in dyads (bilateral exchange model). To understand the distinction between rationality and bounded rationality Kahneman (2003) distinguishes two cognitive systems, each responsible for its own mode of thinking and deciding. These

systems are reasoning and intuition. Reasoning is done deliberately and effortfully, but intuitive thoughts seem to come spontaneously to mind, without conscious search or computation, and without effort (Kahneman, 2003, p.1450). While rationality is associated with the reasoning system, bounded rationality is mainly associated with the intuition system. Whether a task requires the intuition or reasoning system is contingent on characteristics of the task. An important task variable is *task complexity*. Task complexity has been shown to affect both actors' preferences and decision-making behavior in many studies (e.g., Ho & Weigelt, 1996; Johnson & Payne, 1985; Swait & Adamowicz, 2001). It is generally hypothesized in these studies that as task complexity increases, the accuracy of decision-making heuristics decreases. There is a close relation between task complexity and bounded rationality, as Ho and Weigelt (1996, p.660) explain: "Task complexity and bounded rationality are flip sides of a coin. If players are fully rational, task complexity is irrelevant because they can solve games of any complexity. Conversely, games with trivial complexity can be solved by even severely boundedly rational players."

The participants in the pure exchange experiments of Michener et al. face a complex task. There are many exchange opportunities between different actors in which actors have to bargain to obtain a gain, and there is time pressure to close a profitable deal with someone before someone else does. Therefore we hypothesize that the participants might be inclined to employ heuristics, i.e., bounded rationality. We distinguish three heuristics or strategies related to detecting profitable bilateral exchange opportunities. Increasing in sophistication, these strategies are:

- (i) Exchange a good you do not want yourself for some good you value ('zero').
- (ii) Exchange a good you want for some good you like more ('absolute').
- (iii) Exchange a good you want for some good you like relatively more ('relative').

The 'zero' strategy requires hardly any reasoning. It requires actors to realize that they can exchange goods for which their interest is zero for any other good they value (interest larger than zero). The 'absolute' strategy requires a bit more thinking. It requires actors to give away a good they value, while they obtain a good they value more. Finally, the 'relative' strategy requires the most thinking, and in

fact comes down to rational behavior in bilateral exchange situations. It requires actors to realize that profitable exchange is possible whenever the relative interest of two actors for two goods differ. Note that the ‘relative’ strategy contains the profitable opportunities detected by the ‘absolute’ strategy, and the ‘absolute’ strategy contains the opportunities detected by the ‘zero’ strategy. For example, consider again exchange situations 1 and 2 presented in Table 5.1. The ‘zero’, ‘absolute’, ‘relative’ strategy detects no, one (situation 1), both profitable opportunities, respectively. Finally, and most importantly, note that the BE model assumes that actors use the fully rational ‘relative’ heuristic, whereas both the P and Coleman model violate the ‘relative’ heuristic.

Many profitable bilateral exchange opportunities exist given the initial allocations of endowments. These opportunities can be distinguished into different categories which can be detected by one or more of the strategies identified above. We distinguish the following four categories of exchange opportunities:

- D_o : Actors have *different* preference orders, and at least one actor has o interest in one good
- S_o : Actors have the same preference order, and one actor has o interest in one good
- D_b : Actors have *different* preference orders, and both actors have interest in *both* goods
- S_b : Actors have the same preference order, and both actors have interest in *both* goods

One only needs the least sophisticated heuristic to detect opportunity D_o . One actor can use the ‘zero’ strategy, the other either the ‘zero’ (in the case that both actors do not value the good they offer) or ‘absolute’ strategy (if that actor values the good he offers). Opportunity S_o is more difficult to detect; whereas one actor can use ‘zero’, the other requires the most sophisticated ‘relative’ strategy to detect the opportunity. However, we contend that it is sufficient if one of the two actors detects the opportunity. Since the actor using ‘zero’ detects an opportunity S_o easily, he can make the opportunity salient to the other actor by offering many of his valueless units in exchange for one of the other’s goods. In opportunity D_b both

actors are required to use at least the ‘absolute’ strategy. Finally, both actors must use the most sophisticated ‘relative’ strategy to detect S_b .

If actors are boundedly rational and use heuristics to detect profitable exchange opportunities then some of these opportunities might go undetected. We expect, as is generally hypothesized, that there is a negative relation between the task complexity of detecting the opportunity and the proportion of these opportunities that are detected and actually carried out. That is, at the end of the experiment, on the basis of the final allocation of endowments, relatively more opportunities will exist of those that are more difficult to detect. More formally, let f_{kB} and f_{kE} denote the frequency of opportunities of type k at the *Beginning* and *End* of the experiment, and $rf_k = f_{kE}/f_{kB}$. Then the bounded rationality model implies:

Hypothesis 1: $rf_{Sb} > rf_{Db} > rf_{So} > rf_{Do}$.

Similarly, exchange opportunities that are difficult to detect might systematically not be carried out in many experimental sessions, while those that are more easy to detect, like S_o and D_o , might accidentally not be carried out by some actors in only some experimental sessions. Consequently, on average across all experimental sessions we would expect a larger potential gain of exchanges at the end of the experiment of opportunities that are difficult to detect than of opportunities that are easy to detect. Let X_k denote the average potential gain of an exchange of opportunity category k at the end of the experiment, then this hypothesis can be formulated as:

Hypothesis 2: $X_{Sb} > X_{Db} > X_{So} > X_{Do}$

The potential gain of each exchange opportunity is calculated by assuming the EG solution.

5.3. Michener et al’s Experiments

Michener et al. (1975) investigated pure exchange systems consisting of three actors exchanging four goods (1975) and four actors exchanging five goods (1977).

The experimental procedure was identical in both studies. Here, only a brief summary with the essential details is provided.

In each study three pure exchange systems, called ‘configurations’ by Michener et al, were investigated. Sixteen groups of three persons and 12 groups of four persons were randomly assigned to each of the three configurations in the 1975 and 1977 study, respectively. Hence in total 144 subjects participated in each study.

After being seated around a table, the subjects were designated by name cards (Alpha, Beta, Gamma, Delta). The subjects received colored poker chips, which were in full view of all subjects. In total there were 400 or 500 chips, 100 of each color. Before trading began, each subject received a sheet of paper indicating the traders’ interest and initial control over chips. Hence the subjects had complete information on all subjects’ payoffs. The interest and control matrix of each configuration is depicted in Table 5.2a and Table 5.2b for the 1975 and 1977 study, respectively. Michener et al. state that the interest and control values in all configurations were randomly sampled, and rounded off to the nearest multiple of ten.

Subjects were free to talk during the experiment. The experimenter left the room and subjects were free to negotiate any trade bilaterally. No three-way or four-way deals were permitted. Equilibrium was reached when all subjects decided that they no longer wanted to trade or found that they could not promote any further trades with the other subjects. Subjects earned a participation fee of \$1 plus the money earned in the experiment. The subjects’ payoff was linear in the endowments in the following way: a subject received for each good an amount equal to (his interest for the good) \times (the number of units of the good he possesses) cents.

Table 5.2a. Experimental Configurations of Michener et al (1975).

Configuration 1							
Interest matrix				Control matrix			
	Alpha	Beta	Gamma		Alpha	Beta	Gamma
Red	0.8	0.6	0.8	Red	0	90	10
White	0.0	0.1	0.0	White	40	10	50
Blue	0.0	0.2	0.2	Blue	10	20	70
Yellow	0.2	0.1	0.0	Yellow	70	10	20

Configuration 2							
Interest matrix				Control matrix			
	Alpha	Beta	Gamma		Alpha	Beta	Gamma
Red	0.0	0.6	0.5	Red	80	0	20
White	0.1	0.0	0.0	White	40	20	40
Blue	0.0	0.4	0.0	Blue	10	40	50
Yellow	0.9	0.0	0.5	Yellow	0	40	60

Configuration 3							
Interest matrix				Control matrix			
	Alpha	Beta	Gamma		Alpha	Beta	Gamma
Red	0.2	0.6	0.0	Red	90	10	0
White	0.2	0.2	0.5	White	80	0	20
Blue	0.6	0.0	0.1	Blue	50	0	50
Yellow	0.0	0.2	0.4	Yellow	40	50	10

Note. Names of colors and Greek characters represent endowments and actors, respectively.

Table 5.2b. Experimental Configurations of Michener et al (1977)

Configuration 1									
Interest matrix					Control matrix				
	alpha	beta	gamma	delta		alpha	beta	gamma	Delta
red	0.0	0.3	0.3	0.0	red	60	0	0	40
white	0.9	0.5	0.0	0.8	white	10	0	80	10
blue	0.1	0.0	0.0	0.0	blue	0	90	10	0
yellow	0.0	0.0	0.3	0.2	yellow	0	60	40	0
green	0.0	0.2	0.4	0.0	green	40	0	0	60

Configuration 2									
Interest matrix					Control matrix				
	alpha	beta	gamma	delta		alpha	beta	gamma	delta
red	0.0	0.8	0.3	0.3	red	60	20	0	20
white	0.3	0.1	0.0	0.0	white	10	70	10	10
blue	0.1	0.1	0.0	0.0	blue	30	0	40	30
yellow	0.0	0.0	0.4	0.5	yellow	50	50	0	0
green	0.6	0.0	0.3	0.2	green	0	60	20	20

Configuration 3									
Interest matrix					Control matrix				
	alpha	beta	gamma	delta		alpha	beta	gamma	delta
red	0.6	0.2	0.9	0.0	red	10	90	0	0
white	0.2	0.0	0.0	0.2	white	10	50	10	30
blue	0.2	0.4	0.1	0.0	blue	80	0	0	20
yellow	0.0	0.0	0.0	0.5	yellow	40	20	20	20
green	0.0	0.4	0.0	0.3	green	60	10	30	0

Note. Names of colors and Greek characters represent endowments and actors, respectively.

5.4. Results

Approach

We focus on the final allocations c^* . For each configuration we first calculated the core. After calculating the core the Nash, RKS, and EG solutions were found. The core is a convex surface in a three-dimensional (1975 paper) or a four-dimensional (1977 paper) payoff space. The surface is spanned by a number of points. For example, for Configuration 1 (C1) and C2 of the 1975 paper the core is the surface that spans five points, for C3 eleven points span the surface. In Figure 5.2 the solutions of the core (shaded area), Nash, RKS, EG, BE, Coleman, P, together with the experimental results (open circles) are depicted for C1.⁴¹ Note that the experimental results as well as the predictions of Coleman and P for this configuration were not in the core. The P model even predicted Beta to lose 20 compared to his initial payoff.

Our analysis consisted of two steps. First we analyzed how much variance of the final allocations was explained by the predictions of BE, Coleman, P, Nash, RKS, and EG in the six configurations. Second, we tested our hypotheses on the relationship between the complexity of the task to detect a mutually profitable exchange and the type of exchange opportunity.

⁴¹ We do not include the core sets here because they are not easy to visualize, and since they are big sets the core prediction is quite uninformative about the final outcome of the pure exchange situation.

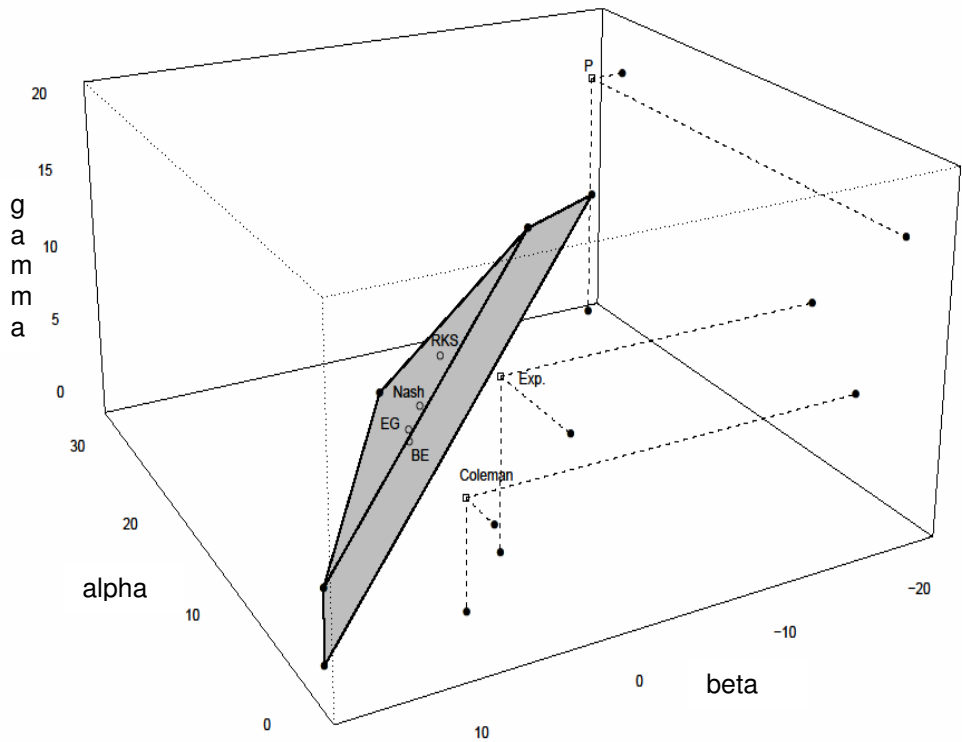


Figure 5.2. Payoff space of the pure exchange situation of Configuration 1 of Michener et al. (1975). On the three axes the payoff gains are depicted of Alpha, Beta, and Gamma. The shaded area represents the core, which here contains the bilateral exchange (BE), Nash, RKS, and equal utility gain (EG) solution. The experimental results (Exp) and the predictions of the proportional interest (P) and Coleman model are also presented.

Explained variances

The proportion of variance (R^2) of the final allocations of a configuration explained by a model is the sum of squared deviations of this model's predicted final allocations and the observed final allocations, divided by the sum of squared deviations of the initial and final allocations:

$$R^2 = \frac{\sum_{i=1}^n \sum_{j=1}^m (c_{ij}^* - c_{ij}^{\text{model}})^2}{\sum_{i=1}^n \sum_{j=1}^m (c_{ij}^* - c_{ij}^{\text{initial}})^2} \quad (3)$$

The models' predictions of the final allocations for all configurations are shown in Table 5A.1 to 5A.6 in the Appendix 5A. The denominator of (3) presents the sum of squares of the null or *no-exchange* model considered by Michener et al. Dividing this sum of squares by the number of actor-good combinations, equal to 12 and 20 for both studies, yields the variance not explained by the null model. The square root of this number, the standard deviation, is presented in the top row of Table 5.3. The value of R^2 for each model-configuration combination is presented in Table 5.3, together with the average R^2 of each model and of each configuration. Note that no test could be performed comparing the R^2 of different models, since the models were not nested.

Table 5.3 Proportions of Variance Explained by the Solutions in all Configurations

	1975 paper			1977 Paper			<i>Average</i>
	C1	C2	C3	C1	C2	C3	
SD	37.68	47.07	30.64	56.88	47.75	56.06	
Coleman	0.68	0.99	0.86	0.91	0.96	0.96	0.89
Proportional	0.84	0.95	0.42	0.92	0.91	0.80	0.81
Nash	0.77	0.98	0.14	0.93	0.56	0.94	0.72
RKS	0.76	0.98	0.35	0.77	0.42	0.96	0.71
Egalitarian	0.77	0.95	0.41	0.84	0.38	0.98	0.72
Bilateral	0.78	0.98	0.85	0.99	0.94	0.94	0.91
<i>Average</i>	0.77	0.97	0.51	0.89	0.70	0.93	0.79

Note. The square root of the unexplained variances (SD) of each configuration is presented in the top row. 'Average' represents the average of the variance explained in a row or column.

The average R^2 of the Coleman model was large, 0.89, and greater than the average R^2 of the P model, which was 0.81. Table 5.3 shows that all three models of cooperative bargaining, Nash, RKS, and EG, performed on average worse than the

P and Coleman's model. Their average R^2 was 0.71 or 0.72. The three cooperative bargaining models showed comparable performance in four configurations but performed worse than Coleman's model in C3 and C2 of the 1975 and 1977 paper, respectively. In these configurations the differences in R^2 were between 0.4 and 0.72 in favor of Coleman's model. The BE model performed best with an average R^2 equal to 0.91, although the difference with Coleman was small. The BE model also performed much better than the cooperative bargaining models in C3 and C2 of the 1975 and 1977 papers, respectively.

Note that the performance of all solutions was good (R^2 's from 0.89 to 0.97) in the three configurations, C2 of the 1975 paper, and C1 and C3 of the 1977 paper. In fact, the worst performance of all solutions in these configurations ($R^2 = 0.77$) was not worse than the best performance (also $R^2 = 0.77$, of C1 of the 1975 paper) of the three remaining configurations (C1 and C3 of 1975, and C2 of 1997). We attempt to explain these differences in average performances across configurations in the Discussion section.

Relationship between task complexity and type of exchange opportunity

Columns 2 to 4 of Table 5.4 represent the number of pure bilateral exchange situations of each opportunity type in each configuration based on the initial allocations, and between brackets those based on the final allocations. Initially there were in total 88 profitable exchange opportunities among all possible actor pair-good pair combinations.⁴² Of these 88, only 2 were of type D_b , and 2 of type S_b , the types that were hypothesized most difficult to detect (see column 8 of Table 5.4). At the end of the experiment, 20 opportunities existed (bottom of column 8), of which only 13 were identical to those that existed initially. Hence 7 new opportunities were created by the exchanges carried out by the participants in the experiment. Of the 13 opportunities that remained at the end of the experiment, 2, 8, 1, and 2 were of type D_o , S_o , D_b , and S_b respectively (numbers not shown in Table

⁴² There were in total $3 \times 3 \times 6 + 3 \times 6 \times 10 = 234$ actor-good pair combinations (for each paper these numbers represent configurations \times actor pairs \times good pairs).

Table 5.4 Bilateral Exchange Opportunities and Their Gain

	1975 paper			1977 Paper				Total potential gain from exchange		
	C1	C2	C3	C1	C2	C3	Total	Potential initial	Potential final	Ratio fin/ini
D_o	2 (0)	6 (1)	1 (0)	12 (0)	24 (0)	12 (1)	57 (2)	460.86	0.17	0.0004
S_o	8 (5)	2 (1)	2 (2)	3 (1)	6 (0)	6 (0)	27 (9)	107.90	0.78	0.007
D_b	0 (0)	0 (0)	1 (0)	0 (0)	0 (0)	1 (2)	2 (2)	40.00	1.17	0.029
S_b	1 (2)	0 (0)	0 (0)	0 (0)	1 (4)	0 (1)	2 (7)	3.50	3.96	1.13
Total	11 (7)	8 (2)	4 (2)	15 (1)	31 (4)	19 (4)	88 (20)	612.14	6.08	0.011

Note. The first columns represent the number of opportunities of types D_o , S_o , D_b , S_b in each configuration on the basis of initial and, between brackets, final allocations. The last columns represent the total potential gains from bilateral exchange for each situation on the basis of fin(al) and ini(tial) allocations.

5.4). The null hypothesis that these remaining 13 were a random selection of the original 88 was rejected in favor of the alternative hypothesis that the frequency of complex type exchange opportunities (S_b and D_b) was larger at the end of the experiment ($p = 0.0095$), conforming Hypothesis 1.⁴³ The null hypothesis that the remaining 10 exchanges of a simple type (D_o and S_o) at the end of the experiment were a random selection of the 84 simple ones existing at the start, was again

⁴³ Using the hypergeometric distribution, the probability of obtaining 3 or 4 complex type exchanges in a sample of 13 from a population of 88 with 4 complex is equal

$$\text{to } \frac{\binom{4}{3}\binom{84}{10} + \binom{4}{4}\binom{84}{9}}{\binom{88}{13}}.$$

rejected in favor of the hypothesis that the relative frequency of the more complex type S_o at the end was larger ($p = 0.0014$).⁴⁴ Finally, of the 7 newly created exchange opportunities 0, 1, 1, and 5 were of type D_o , S_o , D_b , and S_b respectively (numbers not shown in Table 5.4). If one hypothesizes S_b as likely to occur as each of the other types, then this hypothesis is rejected with a binomial test ($p = 0.008$). This result is also in line with our first hypothesis that there is a positive relationship between the difficulty to detect an opportunity and its occurrence at the end of the experiment.

Let us now focus on our second hypothesis on the size of the average potential gain from exchange opportunities based on the initial and final allocations. The average potential gains at the end of the experiment were 0.085, 0.087, 0.584, and 0.566 for type D_o , S_o , D_b , S_b , respectively. An average was obtained by calculating the average potential gain of all exchange opportunities remaining at the end of the experiments across all six experimental configurations. The number of opportunities for each type was 2, 9, 2, and 7 for type D_o , S_o , D_b , and S_b respectively (see 8th column of Table 5.4). These numbers are too small to perform a powerful test on Hypothesis 2. However, comparing the simple types D_o and S_o to the complex types led to the conclusion that the combined average potential gain for the complex types S_b and D_b was larger than for the simple types ($t = -3.488$, $df = 8.63$, $p = 0.004$, one-tailed) corroborating Hypothesis 2. Note, however, that the average potential gains at the end were substantially smaller than at the start of the experiment. Of the 88 opportunities at the start, an opportunity's potential gain was smaller than 1 for only 2 opportunities, while out of 20 opportunities at the end the potential gain was larger than 1 for only 2 opportunities (both of most complex type S_b).

⁴⁴ Using the hypergeometric distribution, the probability of obtaining 2 or less D_o exchanges in a sample of 10 from a population of 84 with 57 of type D_o is equal

$$\text{to } \frac{\binom{57}{2}\binom{27}{8} + \binom{57}{1}\binom{27}{9} + \binom{57}{0}\binom{27}{10}}{\binom{84}{10}}.$$

Additional evidence for both hypotheses on the relation between task complexity and the likelihood of carrying out different exchange opportunities comes from columns 9 to 11 of Table 5.4. The 9th column of Table 5.4 represents the total potential gains from bilateral exchange opportunities for each type in the initial allocation across all experimental configurations, i.e., the sum of all potential gains of all exchange opportunities of each type that existed at the start of the experiment. Note that this number by itself is not meaningful since not all of these exchanges can be carried out simultaneously. This number is a combination of both the size of the average potential gain and the frequency of each exchange opportunity type. The 10th column shows the same numbers for the final allocations, the 11th column shows the ratio of these numbers to those of the 9th column. Note that the ratios in the 11th column increase in task complexity of the exchange type, which is in agreement with both hypotheses. The potential gain for most complex type S_b was even 1.13 times larger at the end than at the start of the experiment. While at the start of the experiment the relative potential for S_b was only $3.5/612.14 = 0.006$, and 0.071 for S_b and D_b together, at the end it was $3.96/6.08 = 0.651$ (and 0.856 for S_b and D_b together).

5.5. Discussion

In this section we attempt to provide an explanation of the fit of the models to the data of all six configurations, by analyzing the properties of the configurations and the models applied to them. We first start with the configurations of which the final allocations were fitted well by all models, then the configurations are discussed where cooperative bargaining models failed to explain the final allocations.

The models' average fit was between 0.89 and 0.97 in C2 of 1975 and C1 and C3 of 1977, substantially better than in the other three configurations. A relatively straightforward explanation of this good fit can be provided for two of these configurations: C2 of 1975 and C1 of 1997. Only for these configurations the initial exchange opportunities consisted only of simple type (D_o and S_o). If all exchange opportunities are of a simple type then the core spans a smaller area, because all

points in the core correspond to allocations in which actors having no interest in a good obtain nothing of that good. Nash, RKS, and EG are necessarily in the core. Coleman's model and the P model also predict that the actors having no interest in a good do not have that good, which makes Coleman and P solutions close to the core if not in. For C2 and C3 of 1977 these solutions were in fact in the core. Moreover, final allocations were also in the core because actors could detect the exchanges of a simple type using the least sophisticated 'zero' heuristic, and by carrying out these opportunities no profitable exchange opportunity remained at the end of the experiment.

An ad hoc explanation for the very good fit for C3 of 1977 is that there was only one exchange opportunity of complex type D_b , which was not that hard to detect. This one opportunity was likely to be a focal exchange opportunity for two reasons. First, it involved Red and White, the goods in which all actors were most interested. Second, of all exchange opportunities present at the start of the experiment, the opportunity D_b had the largest potential gain. Because this exchange opportunity was likely to be detected, it was likely to be carried out, as predicted by all rational models of exchange.

The models' average fit was substantially smaller for the other three configurations. In particular, the fit of the cooperative bargaining models was poor in C3 of 1975 and C2 of 1977 (see Table 5.3). The superior performance of the BE model over the other models' performance in these configurations suggests that there was a difference in 'pair rationality' or Pareto optimality at the level of dyads as assumed in the BE model, and group rationality or (weak) Pareto optimality at the level of the whole group as assumed in the cooperative bargaining models. Consider first C3 of the 1975 paper. The final allocation matrix (top of Table 5A.3) and the interest matrix (Table 5.2a, bottom and left) reveal that all three actors could not improve their payoffs much by exchanging bilaterally, but they could have done so by generalized exchange. If Alpha had transferred Red to Beta, Beta had transferred Yellow to Gamma, and Gamma had transferred White to Alpha, all actors' payoffs would improve significantly. Hence, as predicted by the BE model, not all

participants did carry out the generalized exchange, falsifying the cooperative bargaining models.⁴⁵

Although we did not find evidence for generalized exchange in these pure exchange experiments, this does not imply that actors never did it. Indeed, there exists both empirical and ecological evidence of generalized exchange in the sociological literature (e.g., Bearman, 1997; Yamagishi & Cook, 1993). The explanation of why generalized exchange was not carried out by all participants can be found in task complexity. Previous research on task complexity revealed that as task complexity increases, decision-making becomes less sophisticated and easy heuristics are used. The participants in the experiments face a complex environment containing many exchange opportunities, of which many are easy to detect, and some, in particular the generalized exchange opportunity, difficult to detect. Hence participants carried out the ones that were easy to detect with the easy heuristics, and not the generalized exchange. However, if the only exchange opportunity that exists is generalized exchange, then the complexity of the task is reduced and one can expect this generalized exchange to be carried out by some groups of actors, as is indeed observed in experimental studies (Cook & Yamagishi, 1993).

The misfit of the cooperative bargaining solutions for C2 of 1977 might have resulted from not taking into account differences in exchange opportunities between actors in the pure exchange situation, as in exchange networks. C2 can be represented by a Stern exchange network, Alpha, Beta, Delta forming a triangle, and Gamma only connected to Alpha. Alpha has two alternative exchange relations with Beta and Delta that are also more valuable to him than his relation with Gamma. Alpha's relation with Delta is more valuable because Delta pays a better price for the Yellow of Alpha since Delta is more interested in the Yellow than Gamma. Alpha's relation with Beta is more valuable since Beta pays a better price for Red than Gamma. Since Alpha cannot exchange with Gamma and the other two partners at the same time (all his Yellow and Red were sold to Beta and Delta),

⁴⁵ The predictions of the P model were unreasonable for this configuration, and performance bad, because it predicted Alpha to *lose* points.

Gamma is excluded from an exchange yielding substantial gain. Table 5A.5 reveals that Alpha and Beta obtained a substantially higher payoff in the experiment than predicted by the cooperative bargaining solutions, and Gamma substantially less. The BE model yielded a very good fit ($R^2 = 0.94$) and predicted that Gamma is excluded from an exchange yielding substantial gain. However, this asymmetry in gains because of differences in exchange opportunities was not predicted by the cooperative bargaining models because they do not take into account possible exclusion from exchange.

The Coleman and P model also predicted accurately the final allocations in C2 of the 1977 paper, however, for other reasons than the BE model. The P model predicted Alpha's and Beta's relative advantage because their proportional interests were larger than those of Gamma and Delta. Coleman's model accurately predicted an even larger relative advantage of Alpha and Beta because they had more resources than Gamma (resources were 0.336, 0.398, 0.096, 0.169, for Alpha to Delta, respectively).

The third and last configuration for which average performance was not very good ($R^2 = 0.77$) was C1 of the 1975 paper. This performance can partly be explained by the fact that the sum of potential gains from exchanging in this configuration (19.26) were smaller than in the other configurations (39.71 for C3 of 1975, and > 100 for the others), and by the presence of two opportunities of most complex type S_a . We conclude by noting that, although the P model fitted best, the P model as well as the Coleman model generated a prediction that is nonsensical. The P model predicted Beta to lose more than 20 payoff points (see Table 5A.1). Coleman's model predicted Alpha to end up with less Yellow than he started with. This implies that Alpha was predicted to engage in an exchange yielding a *negative* payoff, because of all actors Alpha is relatively most interested in Yellow. Both models' nonsensical predictions result from two factors. First, the initially skewed distribution of resources in favor of Beta (Beta's resources were 0.653, almost twice as much as the resources of Alpha and Gamma combined) were not taken into account by the P model. Second, both models' predictions are in line with the 'absolute' heuristic, and not the 'relative' heuristic; both models predict actors to

end up with more of the good they like most, instead of ending up with the good they like most relatively.

Finally, the fit of models' predictions cannot be explained by the possibility of actors behaving rationally in each session, whereas the average across all sessions is not in the core. Although it is true that the core is, by definition, a convex space, and the average of some points in this space might lie below it; the experiments' results ruled out this possible alternative explanation. For example, the data clearly revealed that the actors did not engage in generalized exchange in at least one configuration. As another example, consider C1 of 1975. Its final configuration can only be explained by assuming that actors were reluctant to give up the good that they liked most, thereby violating the fully rational 'relative' heuristic. All points in the core correspond to Beta having all the Blue and Alpha having some Yellow before having any Red. The actors were most interested in Red. In the experiments did not exchange Red for their relatively most preferred good, which is evidence that many participants used the 'absolute' heuristic, i.e., focus on getting as much of what they like most, instead of the 'relative' heuristic. Consequently, Beta did not end up having all the Blue and Alpha did not have any Yellow. The use of the 'absolute' heuristic instead of the 'relative' heuristic is in line with Coleman's and the P model, and partly explains these models' good fit in many configurations.

5.6. Conclusion

The goal of the present paper was to explain human behavior in pure exchange situations. The data of the pure exchange experiments of Michener, Cohen and Sørensen (1975, 1977) were reanalyzed with models that differ to the extent they assume behavior to be rational. First, cooperative bargaining models were applied that assume group rationality or weak Pareto optimality at the group level. Second, a bilateral exchange model was applied assuming Pareto optimality at the dyadic level. The bilateral exchange model is an adaptation of Stokman van Oosten's (1994) model to forecast outcomes of collective decision making. The model was developed because in the experimental procedure participants were only allowed to exchange bilaterally. Third, a model was applied assuming bounded rational actors

who apply heuristics to detect mutually profitable exchange opportunities. The heuristics were linked to the task complexity of four exchange opportunity categories, i.e., the difficulty to detect whether each of these categories can give rise to mutually profitable exchanges.

On average, the models could predict the final allocations from reasonably well to very well, with the best performance by the bilateral exchange model. This good performance in combination with the observation that only very few profitable exchange opportunities remained at the end of the experiments suggests that actors' behavior in pure exchange situations is rational at the dyadic level, i.e., leads to Pareto optimal outcomes in bilateral exchange. However, evidence for deviations from rational behavior was obtained confirming our hypothesis on the relation between the sophistication needed to detect the opportunity and the likelihood that it is carried out. It turned out that participants were less likely to give up a good they like most, thereby violating the 'relative' heuristic, and used the less sophisticated 'zero' and 'absolute' heuristics corresponding to boundedly rational behavior. This finding agrees with the P and Coleman's model that also violate the 'relative' heuristic. This might partly explain the good fit of these models, although these models were shown to generate nonsensical predictions in some pure exchange situations.

While there existed opportunities that could only be detected by the most sophisticated 'relative' heuristic corresponding to rational behavior, almost all opportunities in the experiments could be detected by the 'zero' and 'absolute' heuristics corresponding to boundedly rational behavior. This explains the seemingly inconsistent result that the bilateral exchange model fitted very well although evidence for deviations of dyadic rationality was found. Finally, actors did not carry out some generalized exchanges, and evidence was found that exchange opportunities lead to large differences in actors' payoffs, as in some exchange networks. These two results were accurately predicted by the bilateral exchange model, but were not anticipated by the cooperative bargaining models. However, we note that only by analyzing the data with the cooperative bargaining models we

could detect these and other deviations from rationality in the experiments in the first place.

For future research we have two suggestions. The first suggestion is to study systematically the effect of type of exchange opportunity on the frequency with which these different types are carried out, and on their outcomes. In Michener et al's data there were only a few opportunities of complex type. In particular, more opportunities of complex types need to be investigated and compared to simple types in order to obtain more insight on how pure exchange is carried out. A second suggestion for future research would be to study pure exchange in the context of exchange networks. The results of the current study suggest that not all pure exchanges are alike, some are more cognitive complex than others. In the exchange network literature, an (bilateral) exchange is defined as the opportunity to split a common resource pool of fixed size, usually 24 points. This split is a representation of exchange of low cognitive complexity. Since we found that the cognitive complexity of an exchange opportunity decreased the likelihood or extent to which it was carried out, it might be that the effect of network structure on the outcome of exchange interacts with the cognitive complexity of the relations embedded in this network. For example, an actor having relatively many opportunities of a complex type might have difficulties detecting and carrying out these opportunities, while an actor having opportunities of a simple type might not.

Appendix 5A: Experimental Results and Theories' Predictions of Final Allocations

In Tables 5A.1-6 the row 'Gain' presents the average payoff gain predicted by the solutions or observed in the experimental configuration.

Table 5A.1 Configuration 1 of Michener et al (1975)

Experiment						
	Alpha	Beta	Gamma			
Red	6.10	62.40	31.50			
White	0.60	99.40	0.00			
Blue	0.00	63.50	36.50			
Yellow	74.80	24.60	0.60			
<i>Gain</i>	<i>5.84</i>	<i>2.54</i>	<i>10.50</i>			
Coleman			Proportional			
	Alpha	Beta	Gamma	Alpha	Beta	Gamma
Red	12.50	58.50	29.00	36.36	27.27	36.36
White	0.00	100.00	0.00	0.00	100.00	0.00
Blue	0.00	73.00	27.00	0.00	50.00	50.00
Yellow	24.20	75.80	0.00	66.67	33.33	0.00
<i>Gain</i>	<i>0.84</i>	<i>7.28</i>	<i>6.60</i>	<i>28.42</i>	<i>-20.30</i>	<i>17.07</i>
Nash			RKS			
	Alpha	Beta	Gamma	Alpha	Beta	Gamma
Red	2.50	60.00	37.50	5.28	55.50	39.22
White	0.00	100.00	0.00	0.00	100.00	0.00
Blue	0.00	100.00	0.00	0.00	100.00	0.00
Yellow	100.00	0.00	0.00	100.00	0.00	0.00
<i>Gain</i>	<i>8.00</i>	<i>6.00</i>	<i>8.00</i>	<i>10.23</i>	<i>3.30</i>	<i>9.37</i>
Egalitarian			Bilateral			
	Alpha	Beta	Gamma	Alpha	Beta	Gamma
Red	1.50	62.00	36.50	0.00	63.10	36.90
White	0.00	100.00	0.00	0.00	100.00	0.00
Blue	0.00	100.00	0.00	0.00	100.00	0.00
Yellow	100.00	0.00	0.00	97.90	2.10	0.00
<i>Gain</i>	<i>7.20</i>	<i>7.20</i>	<i>7.20</i>	<i>5.58</i>	<i>8.07</i>	<i>7.52</i>

Table 5A.2 Configuration 2 of Michener et al (1975)

Experiment						
	Alpha	Beta	Gamma			
Red	0.00	28.90	71.10			
White	99.80	0.10	0.10			
Blue	0.30	99.70	0.00			
Yellow	56.20	0.00	43.80			
<i>Gain</i>	<i>56.56</i>	<i>41.22</i>	<i>17.45</i>			

Coleman			Proportional			
	Alpha	Beta	Gamma	Alpha	Beta	Gamma
Red	0.00	40.40	59.60	0.00	54.55	45.45
White	100.00	0.00	0.00	100.00	0.00	0.00
Blue	0.00	100.00	0.00	0.00	100.00	0.00
Yellow	56.50	0.00	43.50	64.29	0.00	35.71
<i>Gain</i>	<i>56.85</i>	<i>48.24</i>	<i>11.55</i>	<i>63.86</i>	<i>56.73</i>	<i>0.58</i>

Nash			RKS			
	Alpha	Beta	Gamma	Alpha	Beta	Gamma
Red	0.00	15.56	84.44	0.00	23.64	76.36
White	100.00	0.00	0.00	100.00	0.00	0.00
Blue	0.00	100.00	0.00	0.00	100.00	0.00
Yellow	48.89	0.00	51.11	41.82	0.00	58.18
<i>Gain</i>	<i>50.00</i>	<i>33.33</i>	<i>27.78</i>	<i>43.64</i>	<i>38.18</i>	<i>27.27</i>

Egalitarian			Bilateral			
	Alpha	Beta	Gamma	Alpha	Beta	Gamma
Red	0.00	18.14	81.86	0.00	41.82	58.18
White	100.00	0.00	0.00	100.00	0.00	0.00
Blue	0.00	100.00	0.00	5.00	95.00	0.00
Yellow	32.09	0.00	67.91	44.29	0.00	55.71
<i>Gain</i>	<i>34.88</i>	<i>34.88</i>	<i>34.88</i>	<i>45.86</i>	<i>47.09</i>	<i>16.95</i>

Table 5A.3 Configuration 3 of Michener et al (1975)

Experiment						
	Alpha	Beta	Gamma			
Red	67.40	32.60	0.00			
White	63.60	0.00	36.40			
Blue	100.00	0.00	0.00			
Yellow	1.90	33.50	64.60			
<i>Gain</i>	<i>22.20</i>	<i>10.26</i>	<i>25.04</i>			

Coleman			Proportional			
	Alpha	Beta	Gamma	Alpha	Beta	Gamma
Red	72.60	27.40	0.00	25.00	75.00	0.00
White	45.50	5.70	48.80	22.22	22.22	55.56
Blue	93.30	0.00	6.70	85.71	0.00	14.29
Yellow	0.00	12.80	87.20	0.00	33.33	66.67
<i>Gain</i>	<i>15.60</i>	<i>4.14</i>	<i>40.95</i>	<i>-3.13</i>	<i>40.11</i>	<i>36.87</i>

Nash			RKS			
	Alpha	Beta	Gamma	Alpha	Beta	Gamma
Red	8.22	91.78	0.00	19.41	80.59	0.00
White	76.89	0.00	23.11	76.95	0.00	23.05
Blue	100.00	0.00	0.00	100.00	0.00	0.00
Yellow	0.00	0.00	100.00	0.00	0.00	100.00
<i>Gain</i>	<i>13.02</i>	<i>39.07</i>	<i>32.56</i>	<i>15.27</i>	<i>32.35</i>	<i>32.53</i>

Egalitarian			Bilateral			
	Alpha	Beta	Gamma	Alpha	Beta	Gamma
Red	35.77	64.23	0.00	90.00	10.00	0.00
White	96.92	0.00	3.08	52.86	0.00	47.14
Blue	100.00	0.00	0.00	100.00	0.00	0.00
Yellow	0.00	0.00	100.00	0.00	50.00	50.00
<i>Gain</i>	<i>22.54</i>	<i>22.54</i>	<i>22.54</i>	<i>24.57</i>	<i>0.00</i>	<i>24.57</i>

Table 5A.4 Configuration 1 of Michener et al (1977)

Experiment				
	Alpha	Beta	Gamma	Delta
Red	0.00	66.80	33.20	0.00
White	44.90	7.10	0.00	48.00
Blue	90.00	7.50	2.50	0.00
Yellow	0.00	0.00	69.40	30.60
Green	0.00	0.00	100.00	0.00
<i>Gain</i>	<i>40.41</i>	<i>23.59</i>	<i>58.78</i>	<i>36.52</i>

Coleman					Proportional			
	Alpha	Beta	Gamma	Delta	Alpha	Beta	Gamma	Delta
Red	0.00	22.50	77.50	0.00	0.00	50.00	50.00	0.00
White	45.00	14.00	0.00	41.10	40.91	22.73	0.00	36.36
Blue	100.00	0.00	0.00	0.00	100.00	0.00	0.00	0.00
Yellow	0.00	0.00	73.80	26.20	0.00	0.00	60.00	40.00
Green	0.00	12.70	87.30	0.00	0.00	33.33	66.67	0.00
<i>Gain</i>	<i>41.50</i>	<i>16.29</i>	<i>68.31</i>	<i>30.12</i>	<i>37.82</i>	<i>33.03</i>	<i>47.67</i>	<i>29.09</i>

Nash					RKS			
	Alpha	Beta	Gamma	Delta	Alpha	Beta	Gamma	Delta
Red	0.00	100.00	0.00	0.00	0.00	100.00	0.00	0.00
White	45.37	0.00	0.00	54.63	41.83	0.00	0.00	58.17
Blue	100.00	0.00	0.00	0.00	100.00	0.00	0.00	0.00
Yellow	0.00	0.00	92.59	7.41	0.00	0.00	97.35	2.65
Green	0.00	0.00	100.00	0.00	0.00	62.33	37.67	0.00
<i>Gain</i>	<i>41.83</i>	<i>30.00</i>	<i>55.78</i>	<i>37.19</i>	<i>38.65</i>	<i>42.67</i>	<i>32.27</i>	<i>39.07</i>

Egalitarian					Bilateral			
	Alpha	Beta	Gamma	Delta	Alpha	Beta	Gamma	Delta
Red	0.00	100.00	0.00	0.00	0.00	69.18	30.82	0.00
White	42.19	0.00	0.00	57.81	35.37	13.89	0.00	50.74
Blue	100.00	0.00	0.00	0.00	90.00	0.00	10.00	0.00
Yellow	0.00	0.00	96.38	3.62	0.00	0.00	79.58	20.42
Green	0.00	44.86	55.14	0.00	0.00	1.99	98.01	0.00
<i>Gain</i>	<i>38.97</i>	<i>38.97</i>	<i>38.97</i>	<i>38.97</i>	<i>31.83</i>	<i>28.10</i>	<i>60.32</i>	<i>36.68</i>

Table 5A.5 Configuration 2 of Michener et al (1977)

Experiment				
	Alpha	Beta	Gamma	Delta
Red	0.00	93.20	2.60	4.20
White	81.70	18.30	0.00	0.00
Blue	24.80	75.20	0.00	0.00
Yellow	0.00	0.00	43.30	56.70
Green	79.40	0.00	13.20	7.40
<i>Gain</i>	<i>68.63</i>	<i>60.91</i>	<i>16.06</i>	<i>21.09</i>

Coleman					Proportional			
	Alpha	Beta	Gamma	Delta	Alpha	Beta	Gamma	Delta
Red	0.00	80.00	7.30	12.70	0.00	57.14	21.43	21.43
White	71.70	28.30	0.00	0.00	75.00	25.00	0.00	0.00
Blue	45.80	54.20	0.00	0.00	50.00	50.00	0.00	0.00
Yellow	0.00	0.00	31.40	68.60	0.00	0.00	44.44	55.56
Green	76.30	0.00	10.90	12.80	54.55	0.00	27.27	18.18
<i>Gain</i>	<i>65.87</i>	<i>49.25</i>	<i>12.02</i>	<i>30.67</i>	<i>54.23</i>	<i>30.21</i>	<i>26.39</i>	<i>27.84</i>

Nash					RKS			
	Alpha	Beta	Gamma	Delta	Alpha	Beta	Gamma	Delta
Red	0.00	100.00	0.00	0.00	0.00	68.54	31.46	0.00
White	100.00	0.00	0.00	0.00	100.00	0.00	0.00	0.00
Blue	100.00	0.00	0.00	0.00	100.00	0.00	0.00	0.00
Yellow	0.00	0.00	19.17	80.83	0.00	0.00	10.44	89.56
Green	24.44	0.00	75.56	0.00	9.47	0.00	90.53	0.00
<i>Gain</i>	<i>48.66</i>	<i>57.00</i>	<i>24.34</i>	<i>30.42</i>	<i>39.68</i>	<i>21.83</i>	<i>34.77</i>	<i>34.78</i>

Egalitarian					Bilateral			
	Alpha	Beta	Gamma	Delta	Alpha	Beta	Gamma	Delta
Red	0.00	72.85	27.15	0.00	0.00	100.00	0.00	0.00
White	100.00	0.00	0.00	0.00	95.00	5.00	0.00	0.00
Blue	100.00	0.00	0.00	0.00	0.00	100.00	0.00	0.00
Yellow	0.00	0.00	9.44	90.56	0.00	0.00	24.45	75.55
Green	2.13	0.00	97.87	0.00	74.11	0.00	25.89	0.00
<i>Gain</i>	<i>35.28</i>	<i>35.28</i>	<i>35.28</i>	<i>35.28</i>	<i>66.97</i>	<i>67.50</i>	<i>11.55</i>	<i>27.78</i>

Table 5A.6 Configuration 3 of Michener et al (1977).

Experiment				
	Alpha	Beta	Gamma	Delta
Red	62.20	2.30	31.50	0.00
White	99.20	0.00	0.00	0.80
Blue	28.00	70.70	1.30	0.00
Yellow	5.00	0.00	0.80	94.20
Green	0.00	94.90	0.00	5.10
<i>Gain</i>	<i>38.76</i>	<i>44.70</i>	<i>28.48</i>	<i>32.79</i>

Coleman					Proportional			
	Alpha	Beta	Gamma	Delta	Alpha	Beta	Gamma	Delta
Red	60.10	21.90	18.00	0.00	35.29	11.76	52.94	0.00
White	81.40	0.00	0.00	18.60	50.00	0.00	0.00	50.00
Blue	30.40	66.60	3.00	0.00	28.57	57.14	14.29	0.00
Yellow	0.00	0.00	0.00	100.00	0.00	0.00	0.00	100.00
Green	0.00	86.50	0.00	13.50	0.00	57.14	0.00	42.86
<i>Gain</i>	<i>34.42</i>	<i>43.62</i>	<i>16.50</i>	<i>41.77</i>	<i>12.89</i>	<i>26.07</i>	<i>49.08</i>	<i>56.86</i>

Nash					RKS			
	Alpha	Beta	Gamma	Delta	Alpha	Beta	Gamma	Delta
Red	53.33	0.00	46.67	0.00	50.53	0.00	49.47	0.00
White	100.00	0.00	0.00	0.00	100.00	0.00	0.00	0.00
Blue	0.00	100.00	0.00	0.00	41.03	58.97	0.00	0.00
Yellow	0.00	0.00	0.00	100.00	0.00	0.00	0.00	100.00
Green	0.00	84.17	0.00	15.83	0.00	83.10	0.00	16.90
<i>Gain</i>	<i>28.00</i>	<i>51.67</i>	<i>42.00</i>	<i>38.75</i>	<i>34.52</i>	<i>34.83</i>	<i>44.52</i>	<i>39.07</i>

Egalitarian					Bilateral			
	Alpha	Beta	Gamma	Delta	Alpha	Beta	Gamma	Delta
Red	57.78	0.00	42.22	0.00	90.09	0.78	9.13	0.00
White	100.00	0.00	0.00	0.00	89.80	0.00	0.00	10.20
Blue	36.67	63.33	0.00	0.00	10.54	89.46	0.00	0.00
Yellow	0.00	0.00	0.00	100.00	7.84	12.16	20.00	60.00
Green	0.00	86.67	0.00	13.33	0.00	100.00	0.00	0.00
<i>Gain</i>	<i>38.00</i>	<i>38.00</i>	<i>38.00</i>	<i>38.00</i>	<i>50.12</i>	<i>53.94</i>	<i>8.22</i>	<i>16.04</i>

Appendix 5B. Michener et al.'s Experiments and Coleman's Model

The goal of Michener et al. (1975, 1977) was to test Coleman's model of exchange in the lab. Their studies do not comprise an appropriate test of the model because of a mismatch between the assumed utility function and the payoff function used in the experiment. Coleman's model assumes Cobb-Douglas utility (see Equation 1), which implies decreasing marginal utility, whereas the payoffs in Michener et al.'s experiment were linear in the quantities of the goods possessed by the actors. That is, each additional unit of a good provides less additional utility in Coleman's model while it provides the same additional payoff in Michener et al.'s experiments. Because of this misspecification Coleman's model predicts irrational behaviour and suboptimal outcomes of exchange in Michener et al.'s experiments.

The first step in order to understand this paradox is the realization that the use of linear payoffs results in extreme allocations of endowments if rational behavior is assumed. That is, at least one of two actors will transfer all units of his good in a bilateral exchange situation. For example, the Pareto optimal allocations in Situation 2 correspond to exchanges in which *A* transfers all of his *Y* to *B*, other exchanges are suboptimal. However, a consequence of using Cobb-Douglas utility is that Coleman's model predicts final allocations in which actors always keep some of a good if they are interested in it, which is suboptimal.

Applying Coleman's model to situations 1 and 2 led to suboptimal outcomes, but these outcomes were still an improvement relative to the initial allocation. However, it is easy to construct bilateral exchange situations with linear payoffs where Coleman's model predicts *all* actors to *lose*. For example, consider the 3-event 3-actor exchange system (actors 1,2,3, goods *D,E,F*) with $c_{1D} = c_{2E} = c_{3F} = 1$, $x_{1D} = x_{2E} = x_{3F} = 0.6$, $x_{1F} = x_{2D} = x_{3E} = 0.4$, and all other values of x and c equal to 0. Since all actors already have all of the good they want most, their payoff is already maximized. Because all actors' resources are equal and all goods are equally valuable, Coleman's model predicts final allocations equal to the interests: $c_{1D} = c_{2E} = c_{3F} = 0.6$, $c_{1D} = c_{2E} = c_{3F} = 0.4$. This final allocation amounts to a loss in payoffs for all actors equal to $0.4 \times 0.6 = 0.24$, or 40% of their initial payoff. Note that the P model produces the same nonsensical prediction for this 3-event 3-actor exchange system.

Chapter 6

Conclusions

This thesis studies network formation and exchange using experiments as well as theory. The thesis contains four papers, and each paper is a separate chapter with a different focus. In the first paper we analyze coordination behaviour in a network formation experiment. The second work focuses on the behaviour in an experiment that involves both endogenous network formation and bargaining. The third study investigates the stability and efficiency of exchange networks. The final study analyzes pure exchange behaviour in experiments. In this chapter we highlight the main findings of each of these papers, make suggestions for further work and lay out the general implications.

In Chapter 2 we experimentally examined coordination in a repeated buyer-seller network formation game. In this network formation game, two buyers and a seller could form a competitive (two-link) network in which the seller earns the entire surplus, or a non-competitive (one-link) network in which the surplus was shared between the seller and the linked buyer. Forming the competitive network was the equilibrium of the one-shot game in undominated strategies if the links were costless, while the non-competitive network was predicted to be formed when links were costly. However, the impact of link costs was less clear when the game was repeated. We showed that, regardless of the link costs, forming the non-competitive network constituted equilibria in the repeated game using the following two coordination strategies: i) the buyers anti-coordinate and take turns on forming the non-competitive network, ii) the seller facilitates coordination that maximizes the buyers' payoff. We investigated experimentally, who facilitated the coordination (if at all), and whether link costs affected the coordination behaviour.

We found evidence for coordination on forming the non-competitive network in both cost treatments. Regardless of the link costs, the buyers' link offers significantly depended on each other. Similarly, the seller's link offer to a buyer significantly depended on the seller's link offer to the other buyer. Such dependence provided support for both the buyer and the seller coordination on

forming the non-competitive network in both cost treatments. This was in contrast to the equilibrium predictions of the stage-game. Analysis at the group level showed that the majority of the groups displayed outcomes which resembled the coordination equilibria. Remarkably, and contrary to what one might expect, the presence of link costs did not increase the number of groups that coordinated on forming the non-competitive networks.

The results on coordination raise questions for future studies on the conditions under which coordination is likely to occur. First, coordination might be sensitive to the exact specification of the payoffs. Consider the following situation in which the only way that both players earn positive payoffs in a finitely repeated 2x2 game is by anti-coordinating their actions and turn-taking. Assume the following payoff structure which is a modification of buyer payoffs in our game with positive link costs. If player 1 (2) plays “link”, and player 2 (1) plays “not link”, then player 1 (2) earns positive payoffs while player 2 (1) earns negative payoffs amounting to A . If both players play link, then they both earn B which is strictly smaller than A . If they both play not link, then they both earn C which is less than zero and strictly larger than A . In this game, there are two symmetric anti-coordination equilibria of the one-shot game. In the repeated game, one would expect the players to play solely the anti-coordination equilibria by taking turns because there is no other way that both players can avoid negative payoffs. Similar minor modifications that change the relative benefit of coordinating might have an important impact on the coordination behaviour of the players. Second, coordination behaviour might be enhanced if unilateral punishment mechanisms exist for deviations from coordination. In our games, the seller coordination was supportable via a punishment structure that assumed that both buyers contributed to the punishment. The need for the involvement of two players for the punishment might, however, make punishment unlikely. We indeed observed the seller coordination play but no evidence for punishment was found. So, the existence of unilateral punishment opportunities might make seller coordination more likely. Moreover, the lack of evidence for punishment in the seller coordination calls for research on why the seller coordinated at all.

The evidence for coordination found in this study has further implications on the study of market competition. Although in some games coordination is a means to achieve mutually beneficial outcomes, in the context of markets coordination can also lead to collusion and need not always be desirable from a societal perspective. For example, firms which repeatedly enter into contracting with a third party might anti-coordinate their linking behavior rather than engaging in repeated competition. In some sense, this would allow them to act as alternating monopolists. Moreover, as our analysis suggests, the third party may even be induced to facilitate the coordination through (implicit) punishment strategies by the firms.

Chapter 3 was the first experimental study to investigate the impact of link costs on network formation and the ensuing bargaining process in a repeated game setting. In our game, two buyers and one seller formed either a competitive or a non-competitive network, and then bargained over the surplus given that they had a link. We examined the occurrence of competitive networks in which the seller was predicted to get the entire surplus, and analyzed whether the bargaining process in the network was affected by the link costs. We also tested the assumption that sunk link costs do not affect the subsequent bargaining.

We found that, as predicted by standard theory, link costs lead to less competitive networks. However, interestingly, the formation of non-competitive networks was due to the seller's behaviour; regardless of the link costs the buyers almost always offered a link to the seller. Contrary to the standard theoretical predictions, we found that link costs had a significant impact on the bargaining outcomes. Remarkably, this impact was present for non-competitive networks but not for the competitive networks. In particular, the seller's offer to the buyer(s) was increasing in the link costs when a non-competitive (one-link) network was formed but not when a competitive (two-link) network was formed. Moreover, such an effect of -sunk- link costs on the bargaining outcomes constituted a major puzzle that could not be completely explained by inequality aversion, equity theory, or loss aversion.

This chapter sheds new light on the link formation and bargaining behaviour of players while opening up new questions. First, we found that the long side of the market was passive in terms of determining the network regardless of the link costs. However, in Chapter 2 we found that buyers coordinated on forming one-link networks regardless of the link costs. The difference in the buyer behaviours of Chapter 2, and Chapter 3 can partially be explained by the differences in average payoffs of buyers in the one-link and two-link networks. If the links were costless, in Chapter 2, both buyers earned zero payoffs in the two-link network, but one buyer had positive earnings in the one-link network creating an incentive for buyer anti-coordination and turn-taking. In Chapter 3, however, if links were costless the average buyer payoff from bargaining in the two-link network was almost identical to the payoff in the one-link network. So the buyers did not have a strong incentive to coordinate on the one-link network. Such an argument does not hold for the case with positive link costs. Although in the bargaining condition the buyers earned on average 30 points higher in the one-link network compared to the two-link network, there was no buyer coordination. Thus, the failure of buyer coordination if players bargained over a surplus but not if the payoffs were exogenously given calls for further research. Moreover, how the link formation behaviour would be affected with more buyers or with more sellers is an open question. Second, we found that the link costs had an effect on the bargaining outcomes. Whether such an effect is observed due to a behavioral phenomenon occurring because the game is repeated can be investigated by running the same experiment with random matching. How fairness decisions of players interact with their offers in bargaining can also be studied. It might be that fairness minded players make higher offers in bargaining especially if links are costly. Finally, the failure of the various theoretical models in predicting the effect of the sunk link costs on the bargaining outcomes points to the need for theoretical models that can predict such effects.

The general implications of this study are twofold. The first general implication is that high costs of connections prevent competition but also lead to overall inefficiencies. So, if a highly competitive and efficient market needs to be created, the cost of entry to that market should be lowered. For example, in a subcontracting market between firms, a centralized event such as a fair or an

internet platform that connects the firms might help in setting up connections, and thereby increasing the overall efficiency of trade. The second implication is that high costs of connections lead to a fairer distribution of surplus among the trading parties if there is no competition. If such an effect is due to the buyers asking for a better deal after incurring link costs, then introducing high connection costs might lead to a fairer distribution of surplus between the buyers and firms in some markets. For instance, asking “maintenance fees” from the buyers for water or gas might lead the buyers to get a better price from the firms. Likewise, assuming that the demand is insensitive to price, high taxes for commodities like alcohol and cigarettes might lead the companies producing such goods to earn lower profits.

In Chapter 4, we investigated which network structures were stable as a function of link costs. We studied whether stable networks were socially efficient, Pareto efficient and egalitarian. First, we proved some general results on stable networks using the commonly made assumptions in the exchange network literature in sociology. Second, we calculated the payoff distributions of all networks up to size eight, and analyzed the stable networks with varying link costs by using the expected value theory proposed by Friedkin (1995).

We proved that the *minimal* networks consisting of dyads were socially efficient and stable for a large range of link costs regardless of how the payoffs were distributed. Moreover, if the link costs were positive, the only socially efficient networks were the minimal networks. So, in any stable network other than the minimal one, social inefficiencies occurred. Our calculations for networks of up to size eight showed that only a very small number of networks were stable. Almost all the stable networks could be categorized into two types: the minimal networks and odd-sized cycles. Remarkably, the even-sized minimal networks and the odd-sized cycles were also egalitarian, and Pareto efficient. We also found social dilemmas at low link costs in even-sized networks; at low link costs, no stable network was Pareto efficient.

Our results suggest two new research topics to further our understanding of stable networks. The first is the study of exchange networks in the laboratory. In our

study we found that most stable networks are egalitarian. So, it would be interesting to study whether networks tend to evolve towards *égalité* in the laboratory or in real life. The evolution towards an egalitarian distribution can be in two ways; it might be that players tend to distribute the surplus equally regardless of the network structure, or that players move away from stable networks that are unequal. Also, the existence of social dilemmas poses new research questions. How players react to the social dilemmas can be investigated via experiments. Trust might be an important issue for moving towards an efficient but unstable network. Especially if more than two players are needed to form the efficient set of links, it might not be possible for players to move out of the inefficient stable network. A second direction of future research is to investigate properties of stable networks. Some stable networks might be more likely to stay stable if agents make errors, i.e., these would require more errors to evolve into another stable network. So, which stable network or networks can be expected to be in the steady state requires a further study. An important feature of the stable networks that we found was that most of them were egalitarian. However, we did not investigate the properties of egalitarian networks in general. It might be the case that under mild assumptions on payoff distributions, egalitarian networks are stable in a wide range of costs.

The general result of this study is that keeping the number of connections to a minimum is necessary to achieve social efficiency. Such minimal connections can be observed in real life especially in long-run partnerships among firms, or people even if costs of establishing new connections are low. Such relationships help achieve social efficiency as well as equal distribution of benefits. So, it can be argued that minimal connections are not necessarily unstable if agents maximize their long-run benefits or if there are societal norms on what is right or wrong.

In Chapter 5, we analyzed behavior in pure exchange situations by using the experimental data of Michener et al. (1975, 1977). We compared the pure exchange data to the predictions of various cooperative bargaining models from economics, and to the predictions of a bilateral exchange model adapted from sociology.

We found that the bilateral exchange model fitted the data better than all the other models considered. We argued that the success of the bilateral exchange model was due to the lack of generalized exchange. The results further suggested that easily detectable exchanges were more likely to be carried out than those that were more difficult to detect, suggesting that agents used heuristics in exchange. To what extent task complexity affects exchange behaviour cannot be concluded from this study and requires future work. One way to study this is to systematically vary the complexity of the exchange situation and see how it affects both agents' detection of profitable exchange opportunities and exchange outcomes. Furthermore, that agents engage in exchange that is easier to carry out rather than that is more profitable might also have repercussions for the study of networks. It is of interest to empirically study whether the link formation choices of agents as well as an agent's outcome in a particular network position are mostly determined by the complexity of such decisions.

The lack of generalized exchange observed in this study does not necessarily imply that social inefficiencies are common in most markets. In an established market, it would be enough to sell one's good in exchange of money, and then buy whatever one wishes to buy instead of engaging in generalized exchange. However, if there is no market for a good or if goods are not exchangeable for money, then the lack of generalized exchange implies overall efficiency losses. For instance, for goods such as water, natural resources, know-how or knowledge produced in one country, generalized exchange among countries might not be easily carried out which lessens the overall welfare of these countries.

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Samenvatting in Nederlands*

Het uitwisselen van goederen en diensten, alsmede ideeën, gunsten en geschenken vormt een fundamenteel onderdeel van het menselijk bestaan. Dergelijke uitwisselingen zijn uitvoerig bestudeerd in de economie sinds het baanbrekende werk van Edgeworth (1881). In de sociale psychologie en sociologie verkreeg onderzoek op het gebied van uitwisseling een vooraanstaande positie nadat Homans (1958) het idee van het uitwisselen van sociaal gedrag introduceerde.

In veel situaties moeten betrokkenen relaties vaststellen en onderhouden alvorens over te gaan tot de uitwisseling. Denk hierbij voorbeelden aan de arbeidsmarkt, woningmarkt, vriendschap en samenwerking tussen wetenschappers. Op de arbeidsmarkt is er eerst een link tussen de potentiële werknemer en de werkgever in de vorm van een sollicitatieprocedure, alvorens er over de baan wordt onderhandeld. Ook op de woningmarkt is het registreren bij een makelaar een voorwaarde voor een koper om te beginnen met het bezichtigen van beschikbare huizen. Met vrienden en in familie kringen betreft de uitwisseling vaak geschenken en gunsten en tussen wetenschappers gaat het vaak over het uitwisselen van ideeën op bijvoorbeeld congressen.

Vaak hangt er een prijskaartje aan het vormen of het onderhouden van een relatie en houden relaties enkel stand als de betrokkenen profiteren van de relatie. Het netwerk van betrokkenen kan dus een belangrijke rol spelen bij het bepalen van de uitkomst van de uitwisseling. De relaties binnen dit netwerk bepalen niet alleen de mogelijke voordelen voor de betrokkenen, maar ook hoe de winsten verdeeld worden. Normaal gesproken is een betrokkenen met veel relaties in een betere onderhandelingspositie dan de meer geïsoleerde betrokkenen. Daarom kan een studie over uitwisselingen niet los staan van het netwerk waarin de betrokkenen zich bevinden.

Het rendement van de betrokkenen is afhankelijk van hun positie in het netwerk en

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dit kan de betrokkenen stimuleren om de structuur van het netwerk te veranderen. Dus, niet van elk netwerk wordt verwacht dat het ook een stabiel netwerk is, dat wil zeggen, sommige netwerken zijn onderhevig aan veranderingen. Daarbij zijn er ook netwerken die zouden kunnen leiden tot inefficiënties in de uitwisselingen. De studie van stabiele en efficiënte netwerken staat centraal in de studie van sociale netwerken in de economie. In verschillende modellen voor de vorming van netwerken spelen de kosten van relaties een prominente rol bij het bepalen of een netwerk stabiel en efficiënt is. Daarentegen zijn in de sociologie bijna alle theoretische en empirische studies over uitwisselingen gericht op het bepalen van het effect van een bepaald netwerk structuur op de resultaten van betrokkenen op verschillende posities in dat netwerk.

De literatuur over het vormen van netwerken in de economie gaat voorbij aan veel van de empirisch bevindingen in de sociologie. Er zijn slechts enkele studies die experimenteel onderzoek doen naar de voorspellingen van de economische modellen. In dit proefschrift dragen we op twee manieren bij aan deze literatuur over de vorming van netwerken. In hoofdstuk 2 bestuderen we experimenteel welke strategieën spelers gebruiken in een spel waarbij spelers herhaaldelijk netwerken moeten vormen. We zijn vooral geïnteresseerd in strategieën waarbij spelers moeten coördineren. Bovendien willen we weten wat de invloed is van het introduceren van kosten om een relatie vast te stellen. In tegenstelling tot wat we zouden verwachten, blijkt uit onze resultaten dat de kosten om een relatie vast te stellen geen invloed heeft op het coördinatie gedrag van de spelers.

De tweede bijdrage van dit proefschrift, hoofdstuk 3, is een experimenteel onderzoek naar het gedrag van spelers in een spel waarbij het zowel gaat over het vormen van een netwerk als over de uitwisseling binnen het gevormde netwerk. Het wordt vaak verondersteld dat de uiteindelijke uitwisseling onafhankelijk is van de kosten die gepaard gaan met het tot stand komen van het netwerk. Uit de resultaten van ons onderzoek blijkt dit in algemene zin niet op te gaan.

Naast een bijdrage aan de literatuur in de economie, draagt dit proefschrift ook bij aan de sociologische literatuur over het vormen van netwerken en uitwisseling. In

hoofdstuk 4 bestuderen we de stabiliteit en efficiëntie van netwerken, ongeacht de grootte van het netwerk. Bovendien karakteriseren we alle stabiele netwerken tot grootte acht en bestuderen we netwerken met kosten voor de relaties op basis van een model voor uitwisseling.

Ten slotte, in het hoofdstuk 5 van dit proefschrift trachten we de experimentele resultaten over de uitwisselingen te verklaren met het oog op de efficiëntie van de uitwisseling. Hier vergelijken we het voorspellend vermogen van de verschillende modellen uit de economie en sociologie. Met name het gedrag dat niet verklaard kan worden door de modellen is van belang. Geen van de modellen weet irrationele keuzes goed te kunnen verklaren. Het lijkt erop dat spelers gebruik maken van verschillende heuristieken om tot een beslissing te komen.