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# REAL OPTIONS AND GAME THEORETICAL APPROACHES TO REAL ESTATE DEVELOPMENT PROJECTS: MULTIPLE EQUILIBRIA AND THE IMPLICATIONS OF DIFFERENT TIE-BREAKING RULES

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## ABSTRACT.

This paper builds on a fast growing literature which introduces game theory in the analysis of real option investments in a competitive setting. Specifically, in this paper we focus on the issue of multiple equilibria and on the implications that different equilibrium selections may have for the pricing of real options and for subsequent strategic decisions.

We present some theoretical results of the necessary conditions to have multiple equilibria and we show under which conditions different tie-breaking rules result in different economic decisions. We then present a numerical exercise using the information set obtained on a real estate development in South London. We find that risk aversion reduces option value and this reduction decreases marginally as negative externalities decrease.

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## 1. INTRODUCTION

This paper wants to contribute to a novel and fast growing literature which introduces game theory in the analysis of real options investments in competitive settings. Specifically, in this paper we focus on the issue of multiple equilibria and on the implications that different equilibrium selections may have for the valuation of real options. We present some theoretical results and we apply our analysis to the valuation of a real estate development in South London.

The application of real options theory to commercial real estate has developed rapidly during the last 15 years and various pricing models have been applied to real estate developments to value embedded real options (see for example Titman (1985), Grenadier (1996), Williams (1991) and Williams (1993)). The combination of game and real options theory has proved to offer useful insights for the valuation of real estate developments in markets where different developers are in competition. As far as the pricing of real options is concerned, the existing contributions have used either the binomial option valuation method of Rubinstein, Cox and Ross (1979) in discrete time (see for example the early contribution of Smith and Ankum (1993)) or an equilibrium approach in continuous time (see for example Grenadier (1996)). In both approaches to the valuation of real options, the introduction of game theoretical settings – in order to model the competition between developers – implies the possibility of multiple equilibria (i.e. multiple optimal investment decisions) and such multiplicity is problematic for the option pricing methods.

In a set-up with continuous time, it may be the case that two developers find optimal to invest at the same time, but in order to value the option to invest it is necessary to have a first mover (the leader) and a follower. Grenadier proposed a simple tie- breaking rule (toss of a coin) to solve this problem and Huisman et al. (2003) have proposed a more sophisticated solution based on the use of mixed strategies.

In a discrete time framework, developers play a simultaneous game (invest or defer) at the beginning of each period and there can be multiple equilibria in which either developer invests while the other defers. This is problematic because in order to value an investment, it is necessary to have single equilibrium outcomes at each node of the game and it is not a priori clear how to select between multiple equilibria.

In this paper we propose various tie-breaking (or equilibrium selection) rules which are standard in game theory (min-max payoff, coin-toss, mixed strategy) and we show how the use of different tie breaking rules can imply different valuations and economic conclusions. For example, selecting between multiple equilibria with the min-max payoff rather than using a coin-toss rule implies a more pessimistic valuation of the future payoff from deferring and hence it may imply that investing becomes optimal when deferring would instead be optimal under a coin-toss rule (i.e. a min-max payoff brings the investment decision forward because it gives preference to earlier cash flows).

The possibility of multiple equilibria in set-up with discrete time has been mentioned by Trigeorgis (1996) and Marcato and Limentani (2008), but to our knowledge, no other paper has so far investigated different tie-breaking rules and the relative implications. This paper is organized in a theoretical analysis and an application of the theory to a case study. We show the necessary conditions to have multiple equilibria and we show under which conditions different tie-breaking rules result in different economic conclusions. We apply the theoretical results to the valuation of a mixed-use Development Project in South London and we show how different tie-breaking rules imply different valuations and investment decisions.

## 2. NASH EQUILIBRIUM AND THE CASE OF MULTIPLE EQUILIBRIA

Game theory is a discipline that studies situations of strategic interaction, i.e. situations (*games*) in which the action of an individual (*player*) affects the utility (*pay-off*) of other individuals and in which individuals (*players*) behave strategically taking this interdependence into account. In game theory, a *solution concept* is a formal rule predicting which strategies will be adopted by players, therefore predicting the result of the game. A *strategy* consists of a rule specifying which actions a player should take given the actions taken by other players. The most commonly used solution concepts are equilibrium concepts. Loosely speaking, an *equilibrium* consists of a strategy profile (one for each player) such that each player should not have any advantage by changing her strategy. The seminal Nash (1950) equilibrium consists in a strategic profile such that each player's strategy is a best response to the strategies chosen by the other players. Given a set of feasible strategies for a player  $i$  and the strategies

chosen by the other players, a best response is the strategy associated to highest payoff for player  $i$ . In order to clarify these concepts, we introduce the following game in which two players decide whether to invest (I) or defer (D).

**Game 1:** *Payoffs.*

	$I$	$D$
$I$	2 , 2	4 , 3
$D$	3 , 4	1 , 1

The game matrix describes four possible outcomes, where the first and second number in each cell respectively represents the payoff for the player which moves along the rows (the “row” player) and the payoff for the player which moves along the columns (the “column” player). If both players invest, each of them gets a payoff equal to 2; if the “row” player invests while the “column” player defers they respectively get a payoff equal to 4 and 3; if the “row” player defers while the “column” player invests they respectively get a payoff equal to 3 and 4; if both players defer each of them gets a payoff equal to 1. This is a *symmetric* game, because for both players a specific action I (D) gives the same payoff, given the action of the other player. In other words symmetry implies that the identities of the players can be changed without changing the payoffs associated to the strategies. In Game 1, given that one player invests, for the other player it is optimal to defer, because deferring gives a payoff equal to 3, whereas investing gives a lower payoff equal to 2. Likewise, given that one player defers, the optimal choice of the other player is to invest because investing gives a payoff equal to 4, whereas deferring would give a lower payoff equal to 1. In a Nash equilibrium every player maximizes her own payoff function, given all the other players strategies, hence in Game 1 there exist two Nash equilibria. The two equilibria are respectively one in which the row player invests while the column player defers and a symmetric one in which the row player defers while the column player invests. An intuitive method to find the Nash equilibria of such a 2-players games is to underline the payoffs corresponding to the best responses. Looking at the payoffs of the row player, if the column player plays  $I$  the best response payoff is 3, if the column player plays  $D$  the best response payoff is 4. The best response payoffs are identical for the column player given the symmetry of the game. As the game matrix shows, underlying the payoffs which correspond

to the best responses we can easily identify the two Nash equilibria of the game as those situations in which both players play the best responses to each other.

**Game 1: Nash Equilibria.**

	<i>I</i>	<i>D</i>
<i>I</i>	2 , 2	<u>4</u> , <u>3</u>
<i>D</i>	<u>3</u> , <u>4</u>	1 , 1

This is not the only possible case of multiple equilibria. Consider the same game with modified payoffs.

**Game 2: Payoffs.**

	<i>I</i>	<i>D</i>
<i>I</i>	<u>4</u> , <u>4</u>	2 , 1
<i>D</i>	1 , 2	<u>3</u> , <u>3</u>

Looking at the payoffs of the row player, if the column player plays *I* the best response for the row player is to invest, as investing gives a payoff of 4 while deferring would give a payoff of 1. If the column player plays *D* the best response for the row player is to defer, as deferring gives a payoff of 3 while investing would give a lower payoff of 2. The best response payoffs are identical for the column player given the symmetry of the game. As the game matrix shows, underlying the payoffs which correspond to best responses we can easily identify the two Nash equilibria of the game, respectively “invest, invest”(I,I) and “defer, defer”(D,D). It is useful to look at a generalized version of the same game.

**Game 3: Generalized Payoffs.**

	<i>I</i>	<i>D</i>
<i>I</i>	<i>a</i> , <i>a</i>	<i>b</i> , <i>c</i>
<i>D</i>	<i>c</i> , <i>b</i>	<i>d</i> , <i>d</i>

Notice that the symmetry of the game implies that for both players a specific action *I* (*D*) gives the payoff *a* (*c*) given that the other player plays *I* and it gives the payoff *b* (*d*) given that the other player plays *D*. Assuming that *a*, *b*, *c*, *d* are all different payoffs, we can identify two conditions:

(i)  $a > c, d > b$

and

(ii)  $a < c, d < b$ .

either of which is necessary and sufficient for the existence of multiple equilibria.

If  $a > c$  and  $d > b$ , as the matrix game below shows, the two underlined Nash equilibria are I,I and D,D.

**Game 3a.** *Generalized Nash equilibria if  $a > c$  and  $d > b$ .*

	<i>I</i>	<i>D</i>
<i>I</i>	<u><i>a</i></u> , <u><i>a</i></u>	<i>b</i> , <i>c</i>
<i>D</i>	<i>c</i> , <i>b</i>	<u><i>d</i></u> , <u><i>d</i></u>

If  $a < c, d < b$ , as the matrix game below shows, the two underlined Nash equilibria are I,D and D,I.

**Game 3b.** *Generalized Nash equilibria if  $a < c, d < b$ .*

	<i>I</i>	<i>D</i>
<i>I</i>	<i>a</i> , <i>a</i>	<u><i>b</i></u> , <u><i>c</i></u>
<i>D</i>	<u><i>c</i></u> , <u><i>b</i></u>	<i>d</i> , <i>d</i>

Each of the two conditions is necessary for the existence of multiple equilibria as it is immediate that if  $a > c, d < b$  the unique equilibrium is I,I and that if  $a < c, d > b$  the unique equilibrium is D,D.

In the case of multiple equilibria there is a natural problem of equilibrium selection.<sup>1</sup> We hereby introduce three very simple selection (i.e. tie-breaking) rules. The main point we want to illustrate is that different tie-breaking rules may imply sensible differences in valuations and therefore it is very important to know the implications of different decision rules.

**Expected payoff rule.** In the case of two equilibria this rule implies that the two equilibria have equal probability (i.e. 50% probability each). Intuitively, given that the two equilibria are exactly symmetric, according to this rule the equilibrium effectively taking place is decided by the toss of a fair coin. Going back to the previous

<sup>1</sup>The literature on equilibrium selections is quite vast and we can refer the interested readers to the seminal contribution of Harsanyi and Selten (1988).

example of game 3, if  $a < c$ ,  $d < b$ , as the matrix game shows, the two Nash equilibria are I,D and D,I. Under the expected pay-off rule, for each player the expected pay-off from taking part in the game is  $\frac{b+c}{2}$ .

**Min-max payoff rule.** In the case of two equilibria the rule implies that a player who wants to value the payoff from participating in the game, assigns probability one to the equilibrium in which she gets the lowest payoff. This rule is known as min-max because this is the minimum payoff that will be achieved playing rationally (i.e. playing the best response). It is intuitive that such valuation of the game's payoff is more "pessimistic" than the one of the expected payoff rule and could possibly imply more risk aversion. Going back again to game 3b, given  $a < c$ ,  $d < b$  and in addition  $b > c$  ( $b < c$ ), for each player the expected payoff from participating in the game is equal to  $c$  ( $b$ ).

**Max-max payoff rule.** In the case of two equilibria the rule implies that a player who wants to value the payoff from participating in the game, assigns probability one to the equilibrium in which she gets the highest payoff. This rule is known as min-max because this is the maximum payoff that will be achieved playing rationally (i.e. playing the best response). It is intuitive that such valuation of the game's payoff is the more "optimistic" than the one of the expected payoff rule and could possibly imply a move towards a more aggressive risk taking position. Going back again to game 3b, given  $a < c$ ,  $d < b$  and in addition  $b > c$  ( $b < c$ ), for each player the expected payoff from participating in the game is equal to  $b$  ( $c$ ).

It is worthy to specify that we have decided to focus on those three simple rules because they are intuitive from the valuation point of view.<sup>2</sup> Moving from the min-max rule to the max-max rule can be intuitively interpreted to move from the most risk averse valuation to the least risk aversion valuation as the certainty equivalent that an investor should to take part in the game decreases. The expected payoff rule averages with equal weights the valuations of the two extreme rules, we could think about other cases in which the min-max and the max-max valuations are averaged with different weights.

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<sup>2</sup>The theory of equilibrium selection is quite vast and more sophisticated –or complicated– rules could in principle be used.



### 3. MULTIPLE EQUILIBRIA AND DIFFERENT TIE-BREAKING RULES IN THE BINOMIAL VALUATION MODEL

Smit and Ankum (1993) merge game theory with real option analysis in order to model competition between two investors who both have the option to defer a project. We present a simple version of their model including all the necessary features in order to illustrate our contribution. We consider two investors  $A$  and  $B$  that are potentially equal and therefore can be modeled through a symmetric game. Each investor has a strategy set  $X_i = \{I, D\}$  with  $i = A, B$ , where ( $I$ ) is the decision to invest in the project, while ( $D$ ) is the decision to defer the investment. The decision to defer  $D$ , according to the real option analysis, can be modeled as a call option  $C$ . Smit and Ankum (1993) consider the binomial model of Rubinstein, Cox and Ross (1979) in order to value the option to defer the investment. Following their model, we label with  $S_{t,h}$  the underlying value of the asset at time  $t$  after  $h$  upwards movements along the binomial tree and  $K_c$  stands for the investment costs. Since we only consider the pure strategies to invest versus defer (i.e. I and D are mutually exclusive), the symmetry of the game implies three possible outcomes in each period:

- When both investors  $A$  and  $B$  invest, the game ends. In this situation we start to note the first novelty that the addition of competition brings: instead of the usual intrinsic value  $S_{t,h} - K_C$  each investor gets a payoff equal to  $\nu S_{t,h} - K_C$ , where  $\nu$  is the proportion of value when both competitors invest.
- When both investors defer, nature ( $N$ ) moves (we can have either an upward movement  $u$  or a downward movement  $d$ ) along the binomial tree and the game is repeated.
- When one investor (leader) invests first and the other (follower) decides to invest later, i.e. defers. In this case the payoff of the leader is  $\theta S_{t,h} - K_C$ . When the follower starts to invest her payoff will be the proportion of the value left by the other competitor, hence  $(1 - \theta) S_{t,h} - K_C$ .

In the case of Smit and Ankum (1993),  $\theta > \nu$  because investing earlier gives more market power. In our numerical examples we do not only consider this standard case but also the case where  $\theta < \nu$  which is a case where two development projects started at the same time produce positive externalities. Such case is interesting for many real estate projects as the construction of complementary complexes of buildings (e.g.

housing block and shopping centre) may result in higher individual values for the benefit obtained by the presence of the other property. If we take a housing block and a shopping centre as an example, we see that houses will be worth more if there is an accessible shopping centre in the area. And on the other hand, a centre is more valuable if there are new houses built in the area as they determine an increase of potential customers for the same shopping centre's radius. This argument is also true in the case of the development of two similar properties. If we consider the construction of two shopping centres with slightly different focus and tenancy mix, they may attract a bigger number of customers because customers may be willing to travel a longer distance should they find two malls not far from each other. This would increase the radius the two shopping centres serve and then augment the retail spending and, along with it rents (through revenue-related rents) and hence capital values. Finally, for a similar reason we also consider non standard cases in which the proportion of the value left to the follower differs from  $(1 - \theta)$ . Figure 1 illustrates a two period version of this game<sup>3</sup>.

*Insert figure 1 here.*

We can give the payoff matrix of the game played at time  $t$  in state of nature  $h$ .

**Game 4.** *Generalized game in node  $t, h$ .*

	Invest	Defer
Invest	$\nu S_{t,h} - K_C e^{-r(T-t)}$ , $\nu S_{t,h} - K_C e^{-r(T-t)}$	$\theta S_{t,h} - K_C e^{-r(T-t)}$ , $C_{t,h}^{post}$
Defer	$C_{t,h}^{post}$ , $\theta S_{t,h} - K_C e^{-r(T-t)}$	$C_{t,h}$ , $C_{t,h}$

<sup>3</sup>Investment costs are not discounted in the figure but are discounted at the exponential rate in the remaining of the analysis.

where:

$$S_{t,h} = S_0 u^h d^{t-h}$$

$$C_{t,h}^{post} = \max \left( (1 - \theta) S_{t,h} - K_C e^{-r(T-t)}, \frac{1}{e^{r(T-t)}} [q C_{t+1,h+1}^{post} + (1 - q) C_{t+1,h}^{post}] \right)$$

$$C_{t,h}^i = \frac{1}{e^{r(T-t)}} (q E_{t+1,h+1}^i + (1 - q) E_{t+1,h}^i)$$

$$q = \frac{e^r - d}{u - d}$$

$\forall t = 0, \dots, T, \forall h = 0, \dots, T$  and  $i = A, B$ .

$E_{t,h}^i$  indicates the Nash equilibrium payoff for player  $i$  in the game played at time  $t$  and state of nature  $h$ . Notice that the fact it is possible to have equilibria I,D or D,I in which one player gets a different payoffs from the other implies that  $E_{t,h}^i$  – and recursively  $C_{t,h}^i$  – are indexed by the player's identity  $i$ .

In order to complete the formulation we remember that at maturity  $T$  we have the following values:

$$\begin{aligned} S_{T,h} &= S_0 u^h d^{T-h} \\ C_{T,h}^{post} &= 0 \\ C_{T,h}^i &= 0. \end{aligned}$$

Once given the binomial tree with games in each node, it will be easy to set a strategic tree for each investor. In order to value the option to defer, it is necessary to assign a value to each game-node. Which value should be assigned in the case of multiple equilibria?<sup>4</sup>

Generally, following the analysis of game 3 in section 2 we have the following two necessary and sufficient conditions for the existence of multiple equilibria at a generic node  $t, h$ : either (i)  $\theta S_{t,h} - K_C e^{r(T-t)} > C_{t,h}$ ,  $C_{t,h}^{post} > \nu S_{t,h} - K_C e^{r(T-t)}$  where equilibria are both I,D and D,I or (ii)  $\theta S_{t,h} - K_C e^{r(T-t)} < C_{t,h}$ ,  $C_{t,h}^{post} < \nu S_{t,h} - K_C e^{r(T-t)}$  where equilibria are both I,I and D,D.

In order to illustrate the possibility of multiple equilibria it is useful to analyze the game matrix at maturity. The first reason for doing this is that the binomial

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<sup>4</sup>Smit and Ankum (1993) ignore this case, Trigeorgis (1996) mentions this possibility but rules it out, Limentani and Marcato (2008) mention this possibility but modify the payoff function in such a way to rule it out.

valuation model imposes to start at maturity and to move backwards. The second reason is that the condition for multiple equilibria at a generic node  $t, h$  cannot say much on the values of the parameters which will imply multiple equilibria, given that  $S_{t,h}$ ,  $C_{t,h}$  and  $C_{t,h}^{post}$  are endogenous variables which depend on the parameters and on the equilibria in the future periods. Instead studying the game at maturity  $T$  implies that both  $C_{T,h}$  and  $C_{T,h}^{post}$  are equal to zero and hence we can find precise conditions on the parameters for multiple equilibria. Consider the following payoff matrix for the game at maturity.

**Game 5.** *Generalized game in node  $T, h$ .*

	Invest	Defer
Invest	$\nu S_{T,h} - K_C$ , $\nu S_{T,h} - K_C$	$\theta S_{T,h} - K_C$ 0 , 0
Defer	0 , $\theta S_{T,h} - K_C$	0 , 0

We have the following proposition.

**Proposition 1.** *A sufficient condition to have multiple equilibria is  $\theta > \frac{K_C}{S_{T,h}} > \nu$ .*

*Proof.* Start from the sufficient condition for multiple equilibria I,D and D,I at maturity  $T$  (as illustrated in game 3 in section 2):  $\theta S_{T,h} - K_C e^{r(T-t)} > 0, \nu S_{T,h} - K_C e^{r(T-t)} < 0$ . Together the two inequalities imply the condition in proposition 1.  $\square$

The economic intuition behind proposition 1 is that given the extent of first mover advantage –measured by  $\theta$  and  $\mu$ – the ratio between development cost  $K_C$  and investment value  $S_{T,h}$  must be large enough so that the best response to an investment of the competitor is to defer, and at the same time small enough so that the best response to a deferral of the competitor is to invest.

Following the analysis of section 2, we can formally introduce the discussed tie-breaking rules from the perspective of time  $t$ :<sup>5</sup>

- Expected payoff rule:  $E_{t+1,h}^i = \frac{1}{2} \sum_i E_{t+1,h}^i$ .
- Min-max payoff rule:  $E_{t+1,h}^i = \min_{w.r.t.i} \{E_{t+1,h}^i\}$ .
- Max-max payoff rule:  $E_{t+1,h}^i = \max_{w.r.t.i} \{E_{t+1,h}^i\}$ .

<sup>5</sup>Notice that the rules respectively average, minimize and maximize the equilibrium payoffs with respect to the players' identity  $i$  because payoffs are symmetric across players.

In general terms, given a node  $t + 1, h + 1$  in which there are two equilibria, respectively with payoff  $E_{t+1,h+1}^1$  and  $E_{t+1,h+1}^2$ , and a node  $t + 1, h$  with a unique equilibrium with payoff  $E_{t+1,h}^i$ , we can identify a necessary condition such that different tie-breaking rules in node  $t + 1, h + 1$  imply different equilibrium choices in node  $t, h$ . Considering only the expected payoff versus min-max rule, referring to game 4 we find the following conditions:

- (i) under expected utility rule  $C_{t,h} > \theta S_{t,h} - K_C e^{-r(T-t)}$  and  $C_{t,h}^{post} > \nu S_{t,h} - K_C e^{-r(T-t)}$ . This implies that under the expected utility rule the unique equilibrium is D,D. Also notice that under the expected utility rule,  $C_{t,h} = \frac{1}{e^{r(T-t)}} \left( q \left( \frac{E_{t+1,h+1}^1 + E_{t+1,h+1}^2}{2} \right) + (1 - q) E_{t+1,h} \right)$ .
- (ii) under min-max rule,  $C_{t,h} < \theta S_{t,h} - K_C e^{-r(T-t)}$  and  $C_{t,h}^{post} > \nu S_{t,h} - K_C e^{-r(T-t)}$ . This implies that under the min-max rule the equilibria are D,I and I,D. Also notice that under the min-max rule,  $C_{t,h} = \frac{1}{e^{r(T-t)}} \left( q \min(E_{t+1,h+1}^1, E_{t+1,h+1}^2) + (1 - q) E_{t+1,h} \right)$ .

The intuition for which this is a necessary condition such that different tie-breaking rules in node  $t + 1, h + 1$  imply different equilibrium choices (and hence different investment/defer economic decisions) in node  $t, h$  is as follows: different tie-breaking rules only impact the payoff of the cell D,D in game 4, therefore in order to have different equilibria it must be that under one rule D,D is an equilibrium while under the other it is not. Given that the payoffs in the the cell D,D are higher under the expected utility rule, then in order to have different equilibria it must be the case that D,D is an equilibrium only under the expected utility rule.

Once again, in order to illustrate more precise conditions on the parameters, it is useful to take the game matrix at maturity. Take a node  $T, h$  in which the condition of proposition 1 is satisfied and therefore there are two equilibria D,I and I,D. Also assume that at node  $T, h - 1$  the unique equilibrium is D,D (hence with payoffs  $E_{T,h-1}^i = 0$  for each player  $i$ ). Consider the following matrix game at node  $T - 1, h - 1$  for the case of expected payoff valuation of the payoff at  $T, h$ :

**Game 6.** *Generalized game at node  $T - 1, h - 1$  in the case of expected utility rule at node  $T, h$ .*

	Invest	Defer
Invest	$\nu S_{T-1,h-1} - K_C e^{-r}$ , $\nu S_{T-1,h-1} - K_C e^{-r}$	$\theta S_{T-1,h-1} - K_C e^{-r}$ , 0
Defer	0 , $\theta S_{T-1,h-1} - K_C e^{-r}$	$\frac{q}{2}(\theta S_T - K_C)e^{-r}$ , $\frac{q}{2}(\theta S_T - K_C)e^{-r}$

In this case the condition to have an equilibrium D,D is that  $\frac{q}{2}(\theta S_T - K_C)e^{-r} > \theta S_{T-1,h-1} - K_C e^{-r}$ , which can be rewritten as  $K_C > (\frac{2}{2-q})(\theta S_{T-1,h-1}e^r - \frac{q}{2}\theta S_T)$ . Consider now the following matrix game at node  $T - 1, h - 1$  for the case of min-max valuation of the payoff at  $T, h$ :

**Game 7.** Generalized game at node  $T - 1, h - 1$  in the case of min-max rule at node  $T, h$ .

	Invest	Defer
Invest	$\nu S_{T-1,h-1} - K_C e^{-r}$ , $\nu S_{T-1,h-1} - K_C e^{-r}$	$\theta S_{T-1,h-1} - K_C e^{-r}$ , 0
Defer	0 , $\theta S_{T-1,h-1} - K_C e^{-r}$	0 , 0

In this case the conditions to have two equilibria (I,D) (D,I) are that (i)  $K_C > \nu S_{T-1,h-1}e^r$  and (ii)  $\theta S_{T-1,h-1} - K_C e^{-r} > 0$ , which can be rewritten as  $\nu S_{T-1,h-1}e^r < K_C < \theta S_{T-1,h-1}e^r$ .

We have the following proposition.

**Proposition 2.** *If the condition of proposition 1 is satisfied, a sufficient condition to have that different tie-breaking rules imply different investment decisions is  $\frac{\theta e^r}{u} > \frac{K_c}{S_{T,h}} > \frac{2\theta}{2-q} \left( \theta \frac{e^r}{u} - \frac{q}{2} \right)$ .*

*Proof.* Proposition 1 shows that the condition  $\theta S_{T,h} > K_C > \nu S_T$  is sufficient to have multiple equilibria at maturity node  $T, h$ . The analysis of games 6 and 7 shows, given multiple equilibria at node  $T, h$ , the conditions such that expected payoff rule and min-max payoff rule result in different investment decisions (i.e. equilibria) in node  $T - 1, h - 1$ . After noticing that condition (i) of game 7 is already satisfied under the condition of proposition 1, the conditions can be rewritten as  $\theta S_{T-1,h-1}e^r > K_C > (\frac{2}{2-q})(\theta S_{T-1,h-1}e^r - \frac{q}{2}\theta S_T)$ . According to the binomial valuation model  $S_{T,h} = u S_{T-1,h-1}$ , plugging this in the last inequality and dividing by  $S_{T,h}$ , it can be rewritten as  $\frac{\theta e^r}{u} > \frac{K_c}{S_{T,h}} > \frac{2\theta}{2-q} \left( \theta \frac{e^r}{u} - \frac{q}{2} \right)$ .  $\square$

The economic intuition behind proposition 2 is that given the extent of first mover advantage –measured by  $\theta$  and  $\mu$ – the ratio between development cost  $K_c$  and investment value  $S_{T,h}$  must be large enough so that in the case of expected payoff valuation it is a dominant strategy to defer and at the same time small enough so that in the case of min-max payoff valuation the best response to a deferral of the competitor is to invest. It is also important to notice that the min-max valuation of

the future is more pessimistic and therefore implies that it is optimal to invest given that the competitor defers, whereas the expected payoff valuation of the future is more optimistic and therefore implies that it is always optimal to defer.

In the following section we apply the analysis to the valuation of a real estate development in South London. We consider various values of the parameters  $\theta$  and  $\nu$  in order to model different types of competition across developers. The cases in which different tie-breaking rules imply different investment decisions satisfies the conditions of propositions 1 and 2.

#### 4. NUMERICAL EXERCISE

**Development Project in South London, United Kingdom.** As a numerical example, we use a development project based on a 6 acres land South of London. Planning permission The scheme have been already granted for offices (1,350k sqm), retail space [supermarket (830 sqm) and retail units (680k sqm)], a 500 space car park and a leisure component [restaurants and bar (830k sqm), swimming pool and health club (480k sqm), casino (259 sqm) and night club (400k sqm)]. The site was acquired at the price of £12.78 million and all data is available to us. Since the difference between the annual cost of £150,000 to keep the strategic option open, and the annual income generated by a car park managed on the site is marginal, we assume that there is no either cost or income in deferment other than financial costs related to discounting (i.e. the dividend is equal to zero). The local authority wishes to see the site completely developed and consequently has already granted planning permissions for the actual development to be started within the next five years.

**Traditional NPV Approach and Real Option Analysis.** In this study, we want to compare our game-theoretical real option results with the value obtained through a static NPV (i.e. Net Present Value) approach. The development phase lasts 39 months, which correspond to  $m = 13$  periods of 3 months each. We obtain the Net Present Value by discounting the expected cash flows back to period 0 (i.e.  $t = 0$ ) using an appropriate discount rate calculated as weighted average cost of capital (i.e. WACC)  $k$ . For both cash flows and WACC, we use the information set provided by the investor. Applying a DCF model, we find the NPV of the project as follows:

$$(1) \quad NPV = \sum_{t=0}^m \frac{CF_t}{(1 + k_q)^t}$$

where  $CF_t$  is the expected free cash flow at time  $t$  and  $k_q$  is the quarterly WACC. More specifically, the cash flow at time  $t$  is computed as follows:

$$CF_t = INC_t - LAND_t - DEV_t$$

where  $INC_t$ ,  $LAND_t$  and  $DEV_t$  respectively refer to income, land acquisition costs and development expenses, all at time  $t$ . Note that there is no income in all  $t$  except when the completed building (i.e.  $t = m$ ) is sold. By contrast, land acquisition costs are null in every period, except in the first one. If we discount the cash flows provided by the investor, we obtain the following static NPV of the project as:

$$NPV_p = £79.93 - £59.19 - £12.78 = £7.26 \text{ million}$$

where £79.93 million is the present value of the selling price at completion, £59.19 million is the present value of all development costs and £12.78 million is the acquisition price of the land. Clearly, according to the NPV rule, the project should be accepted.

In addition, as the company already possesses the land, the option to defer is a function of the construction outcome only (i.e. it does not refer to the overall project which also include the land value). Therefore the static NPV of the construction phase only (i.e.  $NPV_t$ ) is obtained by adding the land cost to the static NPV of the project:

$$NPV_{cp} = £79.93 - £56.95 = £22.98 \text{ million} = NPV_p + LAND_0$$

**Parameters Estimation.** The value of our option directly depends on 5 parameters: initial value of the selling price  $S_0$ , strike price  $K_C$ , volatility of selling price  $\sigma$ , maturity time  $T$  and risk-free rate  $rfr$ . According to the available information set, we can easily set 4 out of 5 of these parameters:

$$\begin{aligned} S_0 &= 79.93m & K_C &= 76m & T &= 5 \\ rfr &= 5\% \end{aligned}$$

As in Marcato *et al.* (2008) and Limentani and Marcato (2008), and knowing that the selling price at completion is computed as a perpetuity of market rents (i.e.  $Rent_t$ ) discounted at the relative cap rate (i.e.  $cap$ ), we estimate the volatility of our development project (i.e.  $\sigma$ ) by applying the theory of uncertainty propagation to the volatilities of the growth rates of market rents (i.e.  $h$ ) and cap rates (i.e.  $g$ ) and their correlation from historical time series:



$$\begin{aligned}
\sigma^2 &= \left(\frac{\partial f}{\partial g}\right)^2 \sigma_g^2 + \left(\frac{\partial f}{\partial h}\right)^2 \sigma_h^2 + 2 \frac{\partial f}{\partial g} \frac{\partial f}{\partial h} \rho_{gh} \sigma_g \sigma_h \\
(2) \quad &= \frac{1}{(1+h)^2} \sigma_g^2 + \frac{(1+g)^2}{(1+h)^4} \sigma_h^2 + 2 \frac{1+g}{(1+h)^3} \rho_{gh} \sigma_g \sigma_h
\end{aligned}$$

We use 1981 to 2007 time series data provided by a worldwide real estate brokerage firm - CB Richard Ellis (i.e. CBRE) - which gave us access to their UK Average Cap Rate and Rental Index. The two quarterly measures indicate respectively the cap rate and market rent of hypothetical fully rented properties with standard specifications (i.e. a CBRE valuer is asked to give the rent and cap rate of the hypothetical property identified by certain specific criteria, with each valuer reporting on the same property every quarter). The following parameters are estimated:

$$g = 6.79\% \quad \sigma_g = 10.11\% \quad \sigma_h = 7.14\% \quad \rho_{gh} = -0.03$$

while  $h$  is assumed to be equal to zero. The corresponding annual volatility is  $\sigma = 12.84\%$ .

Since the maturity  $T$  is 5 years, we develop the exercise strategy of the option using a 5-step binomial model, corresponding to a strategy model whereby the investor can reset the strategy annually.

**Negative and Positive Externalities.** We compute three numerical examples for each tie breaking rule by using a varying parameter  $\nu$  indicating the percentage of final price the developer manages to achieve when the competitor also decides to invest. In this case, the normal approach - Grenadier (1996) and Akum and Smit (1993) - is to assume a fifty-fifty split between the two players. However, in a real world, we may expect this percentage to be different from 0.5. In the case of positive externalities in fact, the developer may benefit from the investment decision taken by the competitor. If we take the example of a residential development built next to the mixed-used property we analyze, we immediately see the positive effect of having a bigger number of people served within the same radius. Another example is given by the construction of another mixed-used complex with types of retailing units and leisure components which increase the offer made by the local authority. People may be more willing to travel to this area because they also have the choice between two

different properties offering complementary goods. Not necessarily a positive externality means a parameter greater than one, but it also means a parameter which improves the fifty-fifty split normally assumed as being the norm.

**Valuation Results.** We begin with the case in which  $\nu = 0.5, \theta = 0.55$  and the follower gets  $(1 - \theta=0.45)$  of the final price. The strategic tree of the option is in figure 2 for the case of expected payoff tie breaking rule, figure 3 for the case of min-max tie breaking rule and figure 4 for the case of max-max payoff tie breaking rule.

*Insert figure 2 here.*

*Insert figure 3 here.*

*Insert figure 4 here.*

Not only the rules imply different valuations but the expected payoff and the min-max rule also imply different investment decisions. Shaded regions show best-response payoffs. Under the expected payoff rule D,D is the unique equilibrium at node 4,4 while under the min-max rule I,D D,I are equilibria at node 4,4. The intuition is that the min-max rule is more “pessimistic” about the future outcomes and hence decreases the attractiveness of deferring to the future. In other words the probability associated to the future outcome is smaller in a min-max rule, with the expected value of our option falling as a consequence.

We report the results for the case in which  $\nu = 0.7, \theta = 0.8$  and the follower gets  $(1 - \theta=0.2)$  of the final price. The strategic tree of the option is represented in figure 5 for the case of expected payoff tie breaking rule, in figure 6 for the case of min-max tie breaking rule and figure 7 for the case of max-max payoff tie breaking rule. Shaded regions show best-response payoffs.

*Insert figure 5 here.*

*Insert figure 6 here.*

*Insert figure 7 here.*

The rules imply different valuations. It is important to notice that if compared to the case where  $\nu = 0.5$ , investment for both players is an equilibrium strategy in a larger number of nodes and may lead to an early exercise of the option to develop.

Finally, we report the results for the case where  $\nu = 1.2$ ,  $\theta = 1$  and the follower gets 1.1 of the final price. The strategic tree of our option is represented in figure 8 for the case of expected payoff tie breaking rule, in figure 9 for min-max rule and figure 10 for max-max tie breaking rule. Shaded regions show best-response payoffs.

*Insert figure 8 here.*

*Insert figure 9 here.*

*Insert figure 10 here.*

The rules imply different valuations. We hereby notice that in comparison with previous cases, investing immediately in the second period is always an equilibrium strategy for both players.

We can now summarize our results in table 1, which reports the values of our option according to the change in  $\nu$  and tie breaking rule. Firstly, passing from a min-max to a max-max tie breaking rule (i.e. changing the certainty equivalent of the payoff by reducing the weight given to the lowest payoff in a multiple equilibria and by so increasing the weight given to the highest payoff in a multiple equilibria situation), the option value increases.

**Table 1.** *Main results by  $\nu$  and tie-breaking rule.*

	Min-Max	Expected	Max-Max
$\nu = 0.5$	0.00	0.30	0.65
$\nu = 0.7$	0.80	1.10	1.50
$\nu = 1.2$	36.00	37.00	37.00

Moving horizontally in table 1, if we assume the probability assigned to the lowest score in a multiple equilibria case to be a proxy for risk aversion (i.e. the higher the probability, the higher the risk aversion), we see that the value of our option to defer the investment decreases as the perception of risk to defer increases. In a competitive market, in fact, a more risk averse investor will value the option to defer less than a less risk averse investor because to defer increases the risk - and this has a higher price for the more risk averse investor.

If we then move vertically within table 1, we notice that decreasing the negative externalities associated with competition (i.e. increasing  $\nu$ ) induces an exponential growth in the option value. This means that, for growing negative externalities, the deferral option is seen as a loss of market power through a possible decrease in the future payoff. On the contrary, for reduced negative externalities, whatever tie-breaking rule is used to decide in a multiple equilibria situation, we see an increase in the option value because payoffs benefit from a competitor's investment decision.

Normally two forces are fighting against each other. On one hand, the option to defer allows the investor to get access to the potential price uplift if real estate markets are growing (and it does increase the negative effect because of the truncated form of the binomial tree). On the other hand this potential uplift is eroded by a competitor which may pre-empt the investor's action and obtain the biggest share of the cake by anticipating the investment decision. Instead, in the case of positive externalities, the option to defer has two positive effects: the first one on the potential uplift in the market price, and the second one on the increased value of the project determined by the development of complementary buildings (e.g. houses or offices if shopping centre) by competitors in the area.

Finally, if we jointly consider a move from a min-max to a max-max tie breaking rule and a decrease of negative externalities, we notice that payoff gains are increasing at a decreasing rate. This means that the function of the marginal risk aversion effect afore mentioned is decreasing and has a smaller effect on the option value for higher  $\nu$  and lower probability assigned to future payoff outcomes. In other words, the effect of a reduction in negative externalities is, at the margin, greater for a more risk averse investor than for a less risk averse investor. This effect is determined by the advantage of deferral for a more risk averse investor and its power to assign a smaller price to market competition.

## 5. CONCLUSIONS

This paper has built on previous literature on real option pricing and game theory and contributed to shed light upon the presence of multiple equilibria situations where investors have to choose a decision rule. Along with presenting some theoretical results, we apply three different decision rules (i.e. min-max payoff, coin-toss, max-max strategy) to the valuation of a development project in South London using a binomial option valuation model in a discrete time framework.

We show how the use of different tie breaking rules can imply different valuations and economic conclusions. We interpret the possibility of using different rules as a way to differentiate between different levels of risk aversion. We find that risk aversion reduces option value (i.e. the value is higher for a max-max than for a min-max strategy) and this reduction decreases marginally as negative externalities (i.e. disincentives to defer) decrease.

These results are economically important because investors with different risk aversions may decide to use different rules (i.e. weighting between deferral and investment payoffs) and then obtain significantly different option values. This result has important economic implications and we envisage a need to move from a discrete to a continuous time framework to identify the relationship between risk aversion, speed of reaction and consequent economic and strategic decisions in a competitive development market.

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APPENDIX: FIGURES

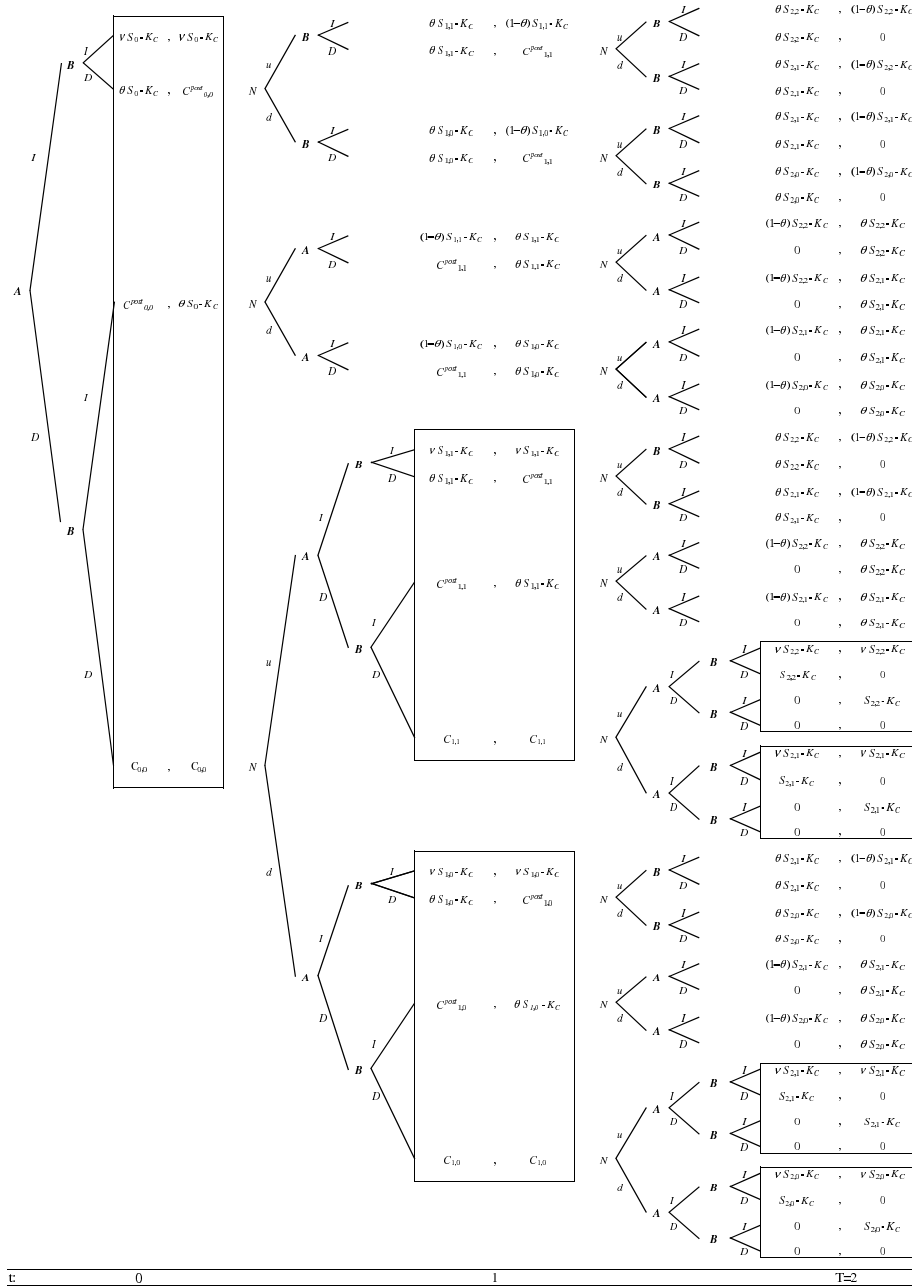


FIGURE 1. Two period strategic game Investment, Defer. Source: Li-mentani and Marcato (2008).

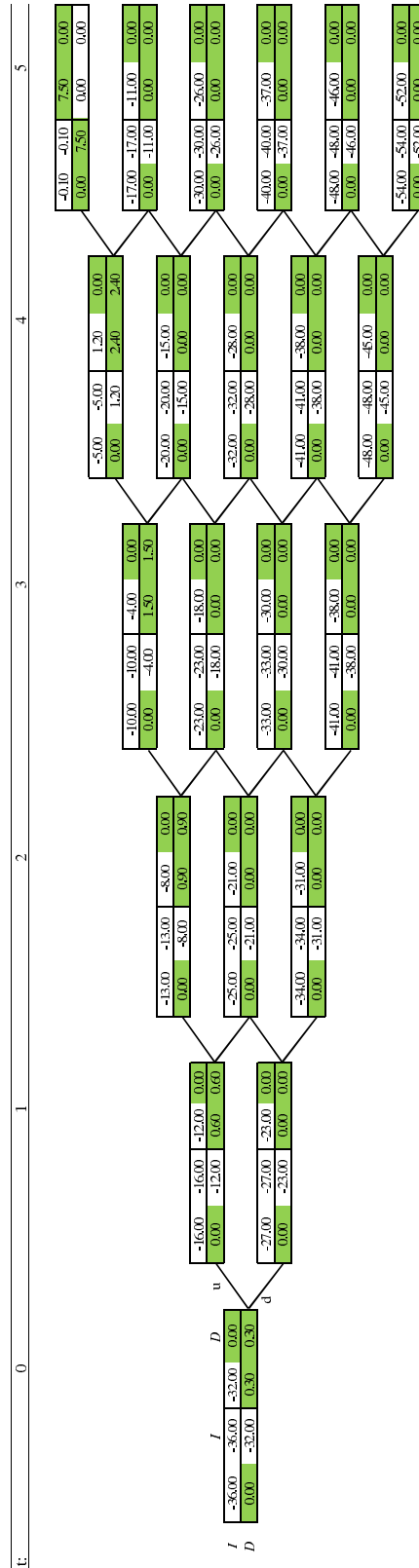


FIGURE 2.  $\nu = 0.5, \theta = 0.55$ , Expected payoff rule.



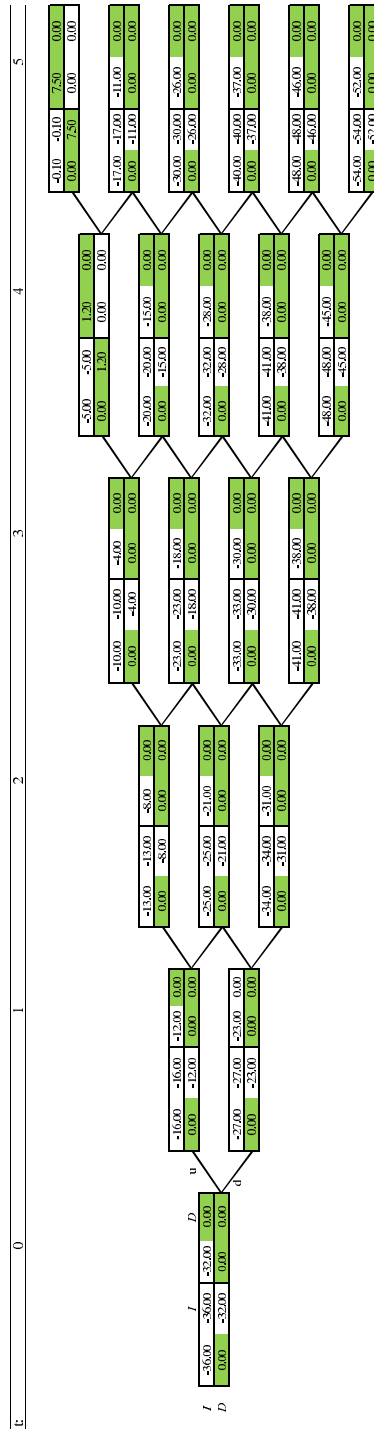


FIGURE 3.  $\nu = 0.5, \theta = 0.55$ , min-max payoff rule.

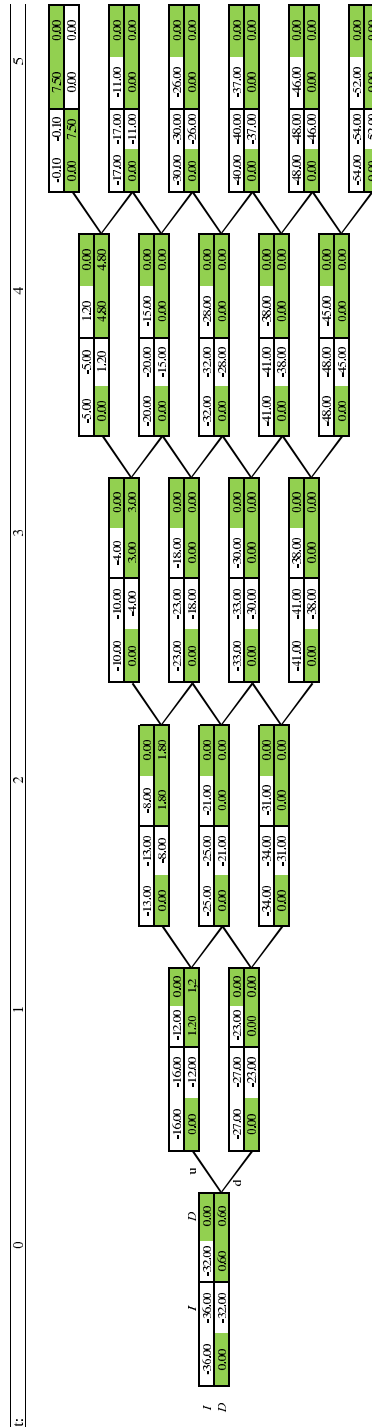


FIGURE 4.  $\nu = 0.5, \theta = 0.55$ , max-max payoff rule.

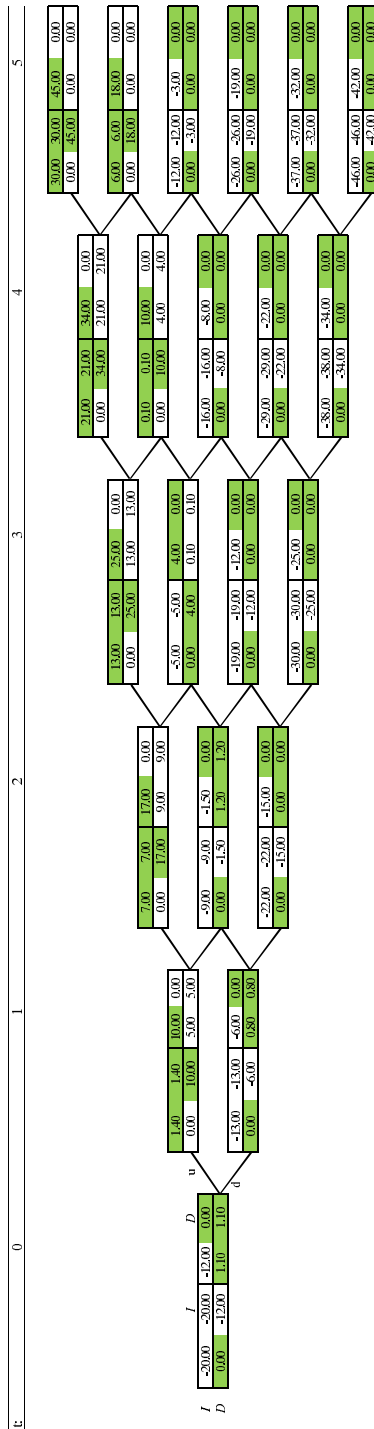


FIGURE 5.  $\nu = 0.7, \theta = 0.8$ , Expected payoff rule.

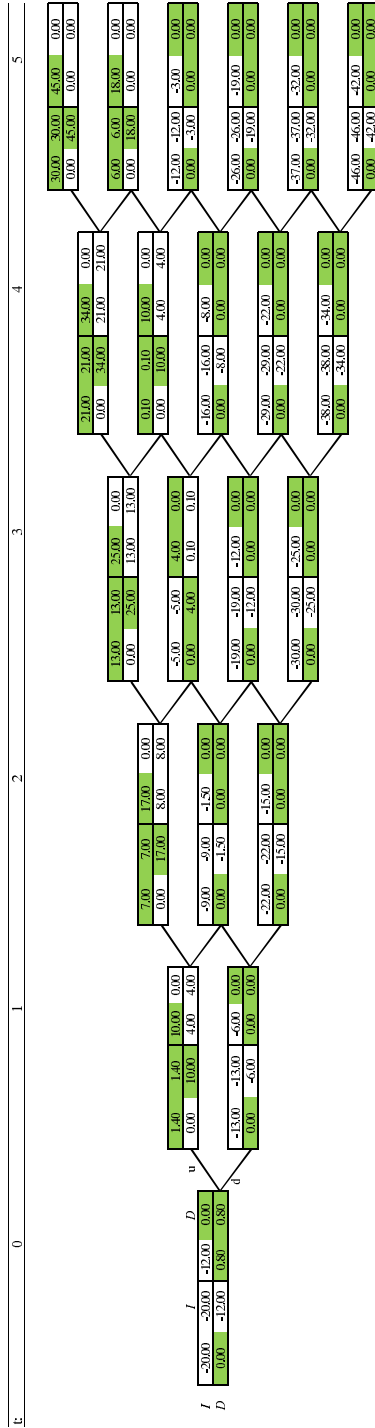


FIGURE 6.  $\nu = 0.7, \theta = 0.8$ , min-max payoff rule.

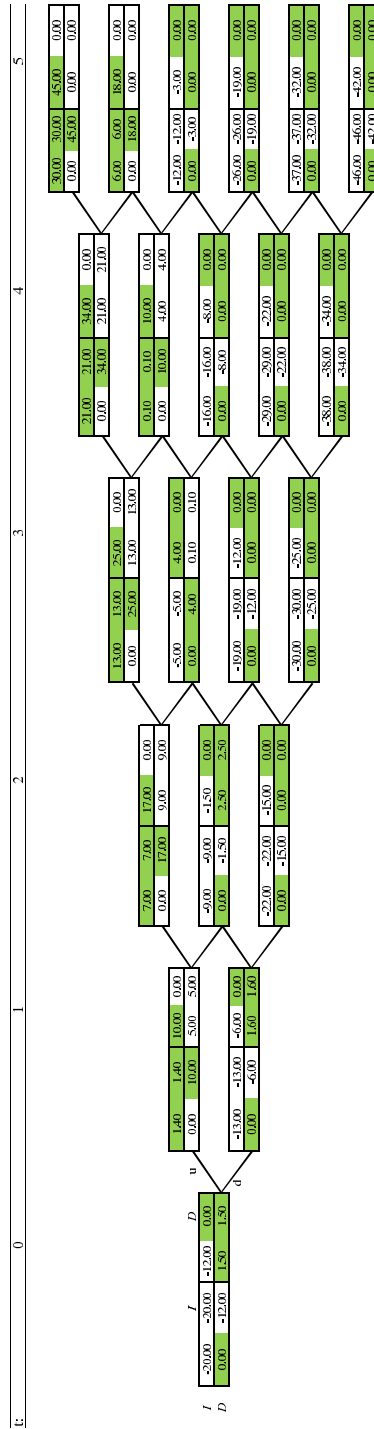


FIGURE 7.  $\nu = 0.7, \theta = 0.8$ , max-max payoff rule.

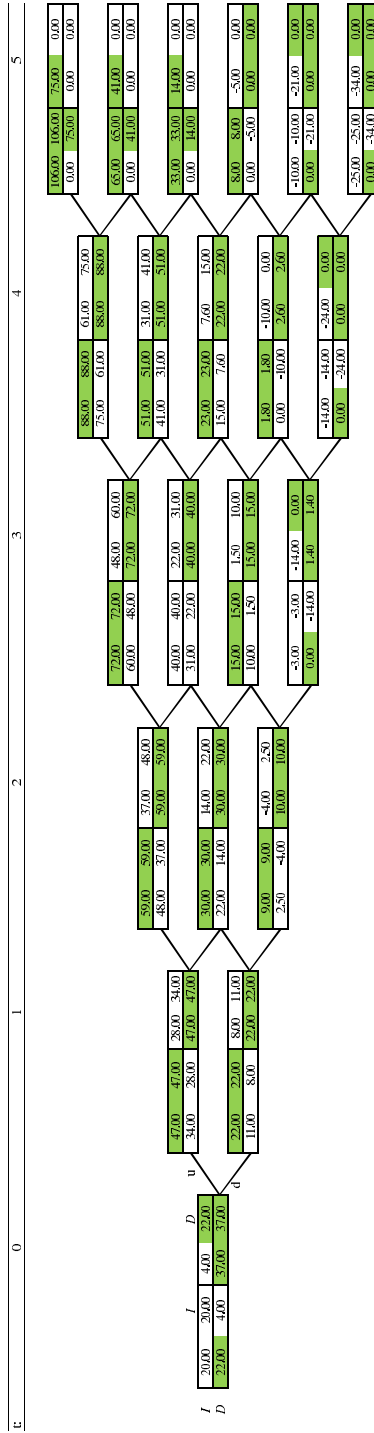


FIGURE 8.  $\nu = 1.2, \theta = 1$ , Expected payoff rule.

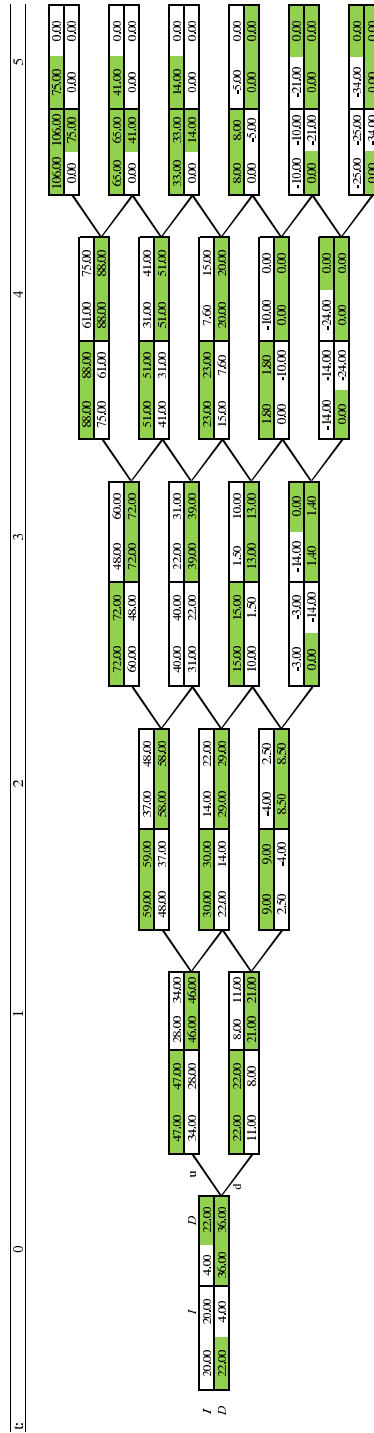


FIGURE 9.  $\nu = 1.2, \theta = 1$ , Min-max payoff rule.

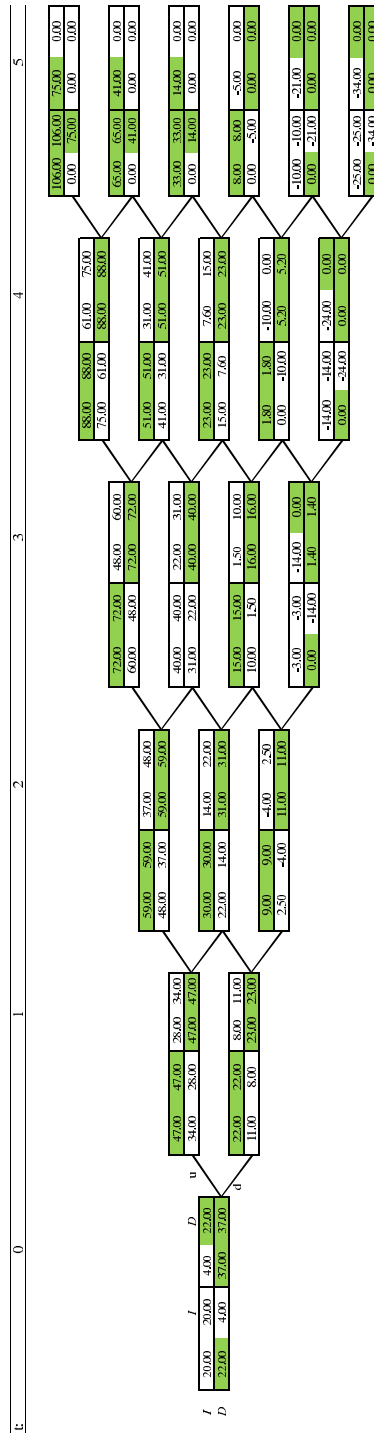


FIGURE 10.  $\nu = 1.2, \theta = 1$ , max-max payoff rule.