Lab Experiments are a Major Source of Knowledge in the Social Sciences

Armin Falk James J. Heckman

CESIFO WORKING PAPER NO. 2894
CATEGORY 12: EMPIRICAL AND THEORETICAL METHODS
DECEMBER 2009

An electronic version of the paper may be downloaded

• from the SSRN website: www.SSRN.com • from the RePEc website: www.RePEc.org

• from the CESifo website: www.CESifo-group.org/wp

Lab Experiments are a Major Source of Knowledge in the Social Sciences

Abstract

Laboratory experiments are a widely used methodology for advancing causal knowledge in the physical and life sciences. With the exception of psychology, the adoption of laboratory experiments has been much slower in the social sciences, although during the last two decades, the use of lab experiments has accelerated. Nonetheless, there remains considerable resistance among social scientists who argue that lab experiments lack 'realism' and 'generalizability'. In this article we discuss the advantages and limitations of laboratory social science experiments by comparing them to research based on non-experimental data and to field experiments. We argue that many recent objections against lab experiments are misguided and that even more lab experiments should be conducted.

JEL-Code: C90, C91, C92, C93, D00.

Keywords: laboratory experiments, field experiments, controlled variation.

Armin Falk
Department of Economics
University of Bonn
Germany – Bonn
armin.falk@uni-bonn.de

James J. Heckman
Department of Economics
University of Chicago
USA - Chicago, Illinois 60637
jjheckman@uchicago.edu

Friday, October 30, 2009

NOTE: This is the author's version of the work. The definitive version was published in *Science*, 23 October 2009 326: 535-538 [DOI: 10.1126/science.1168244].

The social sciences have generally been less willing to use laboratory experiments than the natural sciences, and empirical social science has traditionally been considered as largely non-experimental, that is, based on observations collected in naturally occurring situations. The first lab experiments in economics were not conducted until the late 1940s. Fewer than 10 experimental papers per year were published before 1965, and about 30 per year by 1975 (1, 2). Starting from this low level, experimentation in economics greatly increased in the mid 1980s. In three well-known economics journals—the *American Economic Review*, *Econometrica* and the *Quarterly Journal of Economics*—the fraction of laboratory experimental papers in relation to all published papers was between 0.84 percent and 1.58 percent in the 1980s, between 3.06 percent and 3.32 percent in the 1990s and between 3.8 percent and 4.15 percent between 2000 and 2008 (authors' calculations). The percentages were much higher in more specialized economics journals. The first specialty journal, *Experimental Economics*, was founded in 1998. A similar increase in lab experiments has taken place in other social sciences as well, e.g., in political science (3).

Many social scientists are still reluctant to rely on laboratory evidence. Common objections are that student subject pools are unrepresentative and that sample sizes are small. There is also a widespread view that the lab produces "unrealistic" data, which lacks relevance for understanding the "real world". This notion is based on an implicit hierarchy in terms of generating relevant data, with field data being superior to lab data. We argue that this view, despite its intuitive appeal, is based on a misunderstanding of the nature of evidence in science and of the kind of data collected in the lab. We also argue that many of the objections against evidence from the lab suggest the wisdom of conducting *more* lab experiments, not fewer. While most of our examples and topics are taken from economics, the methodological points we discuss can be applied to all social sciences.

The lab provides controlled variation

Controlled variation is the foundation of empirical scientific knowledge. The laboratory allows tight control of decision environments. As an illustration, consider a simple experiment, the gift exchange game, which tests the theory that employment relationships are governed by a gift exchange, i.e., that workers reciprocate "fair" wages with high effort. A positive relationship between wages and effort is the central assumption of efficiency wage theories that have important implications for the functioning of labor markets and that can explain rigid wages and involuntary unemployment (4). Testing this class of theories with field data is notoriously difficult. For example, in firms, worker effort is not easily observed

or measured, and workers are confronted with a mix of different incentives. This makes interpretation of different effort levels difficult. An observed variation in wages may not reflect generosity but may be due to firm size, self-selection of workers, or simply productivity differences. Even if a relationship between wages and effort is detected, it may not necessarily reflect a fair-wage effort relationship; instead it could reflect strategic considerations based on reputation and repeated interactions. In the laboratory, these factors can be varied in a controlled fashion. The experimenter observes effort and wages and can rule out confounding effects such as multiple incentives, selection, productivity differences, or repeated interactions.

The first experimental test of the existence of gift exchanges in the framework of a formal game-theoretic model was designed to mimic an employment relationship. Participants assumed the roles of workers and firms (5). Firms made (binding) wage offers, which workers could accept. If a worker accepted, he or she then had to choose a costly effort level. Labor contracts are generally incomplete contracts, i.e., effort is not fully contractually enforceable. In the experiment this is reflected by the fact that workers were free to choose any effort level above the contractually enforceable level. In this framework, it is possible to test the gift-exchange hypothesis against the self-interest assumption commonly made in economics that a self-interested worker would always choose the lowest possible effort, since effort is costly and there is no punishment for minimal effort. Anticipating this, the firm has no incentive to pay an above-minimum wage, because self-interested workers work no harder if given a higher than minimum wage. Nevertheless, the results of numerous gift-exchange experiments in the lab reveal that higher wages induce workers to provide higher effort levels. The experiment is a good example of the many experiments that have challenged the assumption of a universally selfish and rational homo economicus. Systematic lab evidence shows that people are boundedly rational, prone to behavior such as loss aversion, present-bias, or judgment biases (6). Phenomena such as reciprocity or social approval, which have been largely neglected by mainstream economics, have been shown to be important in affecting economic outcomes in bargaining and market interactions (7,8).

These experiments illustrate that the lab offers possibilities to control decision environments in ways that are hard to duplicate using naturally occurring settings. In the laboratory, the experimenter knows and controls the material payoffs, the order in which the different parties can act, and the information they possess when they make choices and whether the game is repeated or one-shot. This control allows for the testing of precise predictions derived from game-theoretic models. Subjects are randomly assigned and decisions are rewarded. Payment ensures that subjects take their decisions seriously. For

example, if a firm pays a higher wage or a subject provides higher effort, costs are higher and final earnings are lower. In this sense behavior in the laboratory is reliable and "real": subjects in the lab are human beings who perceive their behavior as relevant, experience real emotions, and take decisions with real economic consequences (6, 9-12). Lab experiments can be used for testing theories and to study institutions at relatively low cost (9). This is particularly interesting for policy questions where the proposed program intervention has no counterpart in reality, and where constructing the counterfactual states of interest may be done more easily in the lab than in the field. Moreover, while existing institutions are adopted endogenously, rendering causal inferences about their effects difficult, the lab allows exogenous changes in institutions. Lab experiments have turned out to be valuable in solving practical problems that arise in implementing matching markets (13), government regulation (14) or airport time slot allocation (15). "Economic engineering", a combination of theory and experiments, has improved design and functioning of many markets (16).

Lab or field is not the choice

Resistance concerning laboratory evidence, often centers on an appeal to "realism". This skepticism has recently manifested itself in a lively debate in economics about field versus lab experiments. While some scholars have argued passionately in favor of laboratory experiments where controlled manipulations of conditions on carefully documented populations are performed (17-19), others have argued in favor of field experiments where conditions are "more realistic" though perhaps less tightly controlled and where more realism also implies greater relevance to policy (3, 20-22). These controversies appear throughout the social sciences (3, 23-26).

The casual reader may mistakenly interpret arguments about "realism" as an effective critique against the lab, potentially discouraging lab experimentation, and slowing down the production of knowledge in economics and other social sciences. The issue of "realism", however, is not a distinctive feature of lab vs. field data. The real issue is determining the best way to isolate the causal effect of interest. To illustrate this point and to structure the debate about field and lab data, we suggest the following simple model.

Consider an outcome of interest Y (e.g., effort supplied by a worker) and a list of determinants of Y, $(X_1, ..., X_N)$. For specificity, suppose that

$$Y = f(X_1, ..., X_N),$$
 (1)

which is sometimes called an "all causes model" (27,28) because it captures all possible causes of Y in $(X_1,...,X_N)$. The causal effect of X_1 on Y is the effect of varying X_1 holding

fixed $\tilde{X} = (X_2, ..., X_N)$. In the pioneering field experiments (20), X_1 was the tax rate on wages. In the laboratory gift-exchange experiment, the values of X_1 are the different wage levels paid by firms. Unless f is separable in X_1 , so that

$$Y = \phi(X_1) + g(\tilde{X}), \tag{2}$$

the level of Y response to X_1 will depend on the level of \tilde{X} . Even in the separable case, unless $\phi(X_1)$ is a linear function of X_1 , the causal effect of X_1 depends on the level of X_1 and the size of the variation of X_1 . These problems appear in both field and lab experiments, and in any estimation of the causal effect of X_1 .

Among the \tilde{X} in the gift exchange experiments described above are concrete details of market institutions such as the number of firms and workers, the order of moves, the choice set, payoff functions, information available, whether or not interactions are one-shot, and whether or not they are anonymous. More generally, \tilde{X} could be demographic characteristics of the participants, the level of observation of actions by third parties, individual preference parameters (e.g., morality, persistence, self-control, social and peer influences) and other aspects of environments.

Many laboratory experiments like the gift-exchange experiment have provided evidence of gift-exchange and social preferences in lab settings for certain values of \tilde{X} , usually, but not always, using populations of undergraduates, and different bargaining and market institutions (7, 30). The relevance of these findings has been questioned in recent field experiments analyzing behavior in a population of sports card traders in a "natural setting", i.e., for another set of conditions \tilde{X}' including, e.g., different institutional details. payoffs, and a different participant population (29). In this particular market, the evidence for social preferences is weaker. If one is interested in the effect of social preferences under a third condition (\tilde{X}''), neither the undergraduate nor the sports cards field study may identify the effect of interest. It is not obvious whether the lab \tilde{X} or the field \tilde{X}' is more informative for the third condition unless a more tightly specified economic model is postulated or a more precisely formulated policy problem is specified. Recent evidence suggests that empirical support for the existence of social preferences such as reciprocity or gift-exchange is not a matter of lab or field, but of the prevailing conditions such as the details of agent interactions (31-33). When the exact question being addressed and the population being studied are mirrored in an experiment, the information from it can be clear and informative. Otherwise, to transport experimental findings to new populations or new environments requires a model (34).

Field methods are able to obtain a universally defined causal effect only if the special functional form (2) is specified and the response of Y to X_1 is linear. If this is the case, however, lab experiments are equally able to obtain accurate inferences about universal effects. Observing behavior in the field is in general not more interesting or informative than observing behavior in the lab. The general quest for running experiments in the field to obtain more realistic data is therefore misguided. In fact, the key issue is what is the best way to isolate the effect of X_1 holding constant \tilde{X} . No greater reality is conveyed by one set of \tilde{X} than another unless the proposed use of an estimate, as well as target populations and settings are carefully specified. The pioneering field experiments (20) defined the target population and the questions sought to be answered very precisely.

The usefulness of particular methods and data is ultimately a matter of the underlying research question. Lab experiments are very powerful whenever tight control of \tilde{X} is essential. This applies in particular for testing (game theoretic) models and behavioral assumptions. The lab can also easily implement many different values of \tilde{X} , e.g., the number of buyers or sellers in market experiments, and in this way explore the issue of robustness of an estimated effect. Tight control of \tilde{X} also allows replicability of results, which is generally more difficult with field data. The field on the other hand offers a large range of variations in \tilde{X} , which are potentially relevant but hard to implement in the lab. This way field experiments can provide important complementary insights to lab findings, e.g., in the area of development economics, or by addressing specific policy questions such as testing antipoverty programs that are targeted to, and need to be evaluated on, populations in poverty (20).

Other objections

In addition to the "lack of realism" critique, other objections concerning lab evidence have been put forward. Ironically, most objections raise questions that can be very well analyzed with lab experiments, suggesting the wisdom of conducting more lab experiments, not fewer. One common objection is that lab experiments with students do not produce "representative" evidence. For the purpose of testing theories this is not a problem because most economic models derive predictions that are independent of assumptions concerning subject pools. On some aspects of behavior, however, students are not representative of the general population or a target population of interest and we would agree that a richer variation in context, populations and environments \tilde{X} should be used in future lab experiments. In this vein, the gift-exchange game has been run on non-student samples (35) yielding results similar to

those obtained using samples of students. Other studies have shown the relevance of social preferences for CEOs (36) for professional financial traders (37,38) or for the general population (39,40).

It has also been noted that (i) stakes in experiments (money paid for decisions taken) are trivial, (ii) the number of subjects or observations is too small, (iii) subjects are inexperienced, (iv) Hawthorne effects may distort experiments, or (v) self-selection into experiments may bias results.

- (i) Most of what we know about the level of stakes on outcomes is derived from controlled lab experiments. The effects of varying stake size are mixed and seem to depend on concrete experimental contexts (41). Reciprocity does not vanish if subjects in the gift-exchange experiment reported above are paid an equivalent of three months income (42). Even if stake effects are relevant, however, it is not obvious what the "right" level of stakes should be, that is, what are the right levels of X_I and \tilde{X} ? We would ask in reply how often do people make decisions involving monthly incomes, and how representative would such high-stake experiments be for the many decisions people make on a daily basis, which involve relatively small stakes? In any case, if one is seriously interested in how stakes affect behavior, one can run experiments with varying stake sizes.
- (ii) The issue of sample size is a red herring. Effective methods have been developed for analyzing small sample experiments (43-45). Moreover, many experiments nowadays are run with samples of several hundred participants, sometimes with more than 1000 participants (46).
- (iii) Experiments do not typically distinguish between experienced and inexperienced subjects. It is an empirically interesting question how experience, learning etc. affect behaviors. Failure to account for experience in some experiments is not an intrinsic weakness of the experimental method. In fact, it is common to run experiments with experienced subjects and to study learning effects. Good examples are a study on ratchet effects and incentives with Chinese managers (47) or a study comparing the behavior of workers and students (48). In a recent field experiment on gift-exchange, it was shown, for instance, that experienced donors, that is, donors who frequently donate for a particular charitable organization, reciprocally respond to gifts by donating more frequently (32).
- (iv) Another concern often raised is scrutiny, that is, the possibility that subjects in the lab behave differently because they perceive that they are observed. This is one version of a Hawthorne effect. (Parenthetically, reanalysis of the original Hawthorne data shows that no Hawthorne effect was present in the Hawthorne study. See (49).) It is a minor problem in many experiments, especially if the decision environment is interactive and "rich", such as in

sequential bargaining or market experiments. Moreover, being observed is not an exclusive feature of the laboratory: many decisions outside the lab are observed. Even on the Internet agents can be observed. In the lab, observers can be added to the experimental protocol. The lab allows the analyst to study the relevance of scrutiny by varying the degree of anonymity, e.g., contrasting video experiments where subjects are explicitly observed, with single anonymous (subject-subject anonymity) and double anonymous (full anonymity between subjects and experimenter) procedures (50-52).

(v) Many scholars have expressed concerns about self-selection of particular participants into experiments. Self-selection is not necessarily a scourge. It can be a source of information on agent preferences (27,28,34). In the lab, one can collect detailed data on the backgrounds and personality traits of participants to control for selection or to explicitly study selection in a controlled way (53,54). Selection is a feature of both field and social experiments (55) and is not a problem unique to lab experiments. Indeed problems of noncompliance, attrition and randomization bias plague many field experiments (27, 56).

Exploiting complementarities

Experiments can be productive in complementing the information obtained from other empirical methods. One can combine lab and field experiments to better understand the mechanisms observed in the field. For example, this can be done by eliciting preferences and relating these preferences to observed behavior in the field (57-58). Another example of exploiting complementarities is the experimental validation of survey instruments (59). While surveys can generate large and representative data sets that provide statistical power, experiments allow the elicitation of preferences and attitudes in a controlled and incentive compatible way, as participants have to make choices with real money at stake. Such evidence is particularly important in securing better understanding of preference heterogeneity (60-63). The evidence that people are different clashes sharply with the widely used "representative agent" model that assumes that agents are homogenous or can be represented as if they are homogenous. Accounting for heterogeneity in preference parameters enables macroeconomists to calibrate economic models in an empirically founded way (61).

We conclude by restating our argument. Causal knowledge requires controlled variation. In recent years, social scientists have hotly debated which form of controlled variation is most informative. This discussion is fruitful and will continue. In this context it is important to acknowledge that empirical methods and data sources are complements, not

substitutes. Field data, survey data, and experiments, both lab and field, as well as standard econometric methods can all improve the state of knowledge in the social sciences. There is no hierarchy among these methods and the issue of generalizability of results is universal to all of them.

References

- 1. C.A. Holt, *Markets, Games, and Strategic Behavior* (Pearson Addison Wesley, 2006).
- 2. An illustration of the view that economics is a non-experimental science is a quote from Samuelson and Nordhaus who in their famous economics textbook stated that economists "cannot perform the controlled experiments of chemists or biologists because they cannot easily control other important factors. Like astronomers or meteorologists, they generally must be content largely to observe" (P.A. Samuelson, W.D. Nordhaus, Economics, McGraw Hill, 1985, 12. ed., p. 8).
- 3. R. B. Morton, K. C. Williams, *The Oxford Handbook of Political Methodology* (Oxford University Press, 2006).
- 4. G.A. Akerlof, J.L. Yellen, *Quarterly Journal of Economics* **105**, 255 (1990).
- 5. E. Fehr, G. Kirchsteiger, A. Riedl, *Quarterly Journal of Economics* **108**, 437 (1993).
- 6. J. H. Kagel, A. E. Roth, *The Handbook of Experimental Economics*. (Princeton University Press, Princeton, NJ, 1995).
- 7. E. Fehr, S. Gächter, *Journal of Economic Perspectives* **14**, 159 (2000).
- 8. A new development in uncovering human motivation is the field of experimental neuroeconomics. The goal is to provide insights into the biological foundations of behavior in order to improve economic modeling. (C. Camerer, G. Loewenstein, D. Prelec, Journal of Economic Literature 43, 9 (2005)).
- 9. D. Friedman, S. Sunder, *Experimental Methods: A Primer for Economists*. (Cambridge University Press, Cambridge, MA, 1994).
- 10. E. Reuben, F. van Winden, *Journal of Public Economics* **92**, 34 (2008).
- 11. D.J.F. De Quervain et al., Science **305**, 1254 (2004).
- 12. E. Xiao, D. Houser, *Proceedings of the National Academy of Sciences* **102**, 7398 (2005).
- 13. J. H. Kagel, A. E. Roth, Quarterly Journal of Economics 115, 201 (2000).
- 14. C. Plott, in *Laboratory Experimentation in Economics*, A. E. Roth, Ed. (Cambridge University Press, Cambridge, 1987), pp. 193-219.

- 15. S.J. Rassenti, V.L. Smith, R.L. Bulfin, *The Bell Journal of Economics* 13, 402 (1982).
- 16. A.E. Roth, *Econometrica* **70**, 1341 (2002).
- 17. V.L. Smith, *Journal of Economic Perspectives* **8,** 113 (1994).
- 18. C. Plott, Science **232**, 4751 (1986).
- 19. V. L. Smith, American Economic Review 93, 465 (2003).
- G. G. Cain, H. W. Watts, *Income Maintenance and Labor Supply: Econometric Studies*. (Rand McNally College Publishing Company, Chicago, 1973), pp. 1-367.
- 21. S. D. Levitt, J. A. List, *Journal of Economic Perspectives* **21**, 153 (2007).
- 22. S.D. Levitt, J.A. List, European Economic Review 53, 1 (2009).
- 23. A. Aronson, T.D. Wilson, M.B. Brewer, in *The handbook of social psychology*, D. Gilbert, S. T. Fiske, G. Lindzey, Eds. (McGraw-Hill, Boston) **1**, 99 (1998).
- 24. M. Webster, J. Sell, *Laboratory Experiments in the Social Sciences* (Academic Press, Oxford) (2007).
- 25. D. G. Mook, *American Psychologist* **38**, 4 (1983).
- 26. E. Ostrom, Journal of Economic Behavior & Organization **61**, 149 (2006).
- 27. J. J. Heckman, E. J. Vytlacil, in *Handbook of Econometrics*, J. Heckman, E. Leamer, Eds. (Elsevier, Amsterdam, 2007), vol. 6B, pp. 4779-4874.
- 28. J. J. Heckman, *International Statistical Review* **76**, 1 (2008).
- 29. J. A. List, Journal of Political Economy 114, 1 (2006).
- 30. E. Fehr, U. Fischbacher, *The Economic Journal* **112**, C1 (2002).
- 31. S. Kube, C. Puppe, M.A. Maréchal, "The Currency of Reciprocity Cash, Perks and Workers' Motivation in the Field", *Working Paper*, Max Planck Institute for Research on Collective Goods, Bonn.
- 32. A. Falk, *Econometrica* **75**, 1501, (2007).
- 33. S. DellaVigna, *Journal of Economic Literature* **47**, 315 (2009).
- J.J. Heckman, in *Evaluating Welfare and Training Programs*, C. Manski, I.
 Garfinkel, Eds. (Harvard University Press, Cambridge, MA, 1992), pp. 201-230.
- 35. E. Fehr, E. Kirchler, A. Weichbold, S. Gächter, *Journal of Labor Economics* **16**, 324 (1998).
- 36. E. Fehr, J. A. List, *Journal of the European Economic Association* **2**, 743 (2004).
- 37. J. H. Kagel, D. Levin, American Economic Review 76, 894 (1986).
- 38. V.L. Smith, G.L. Suchanek, A.W. Williams, *Econometrica* **56**, 1119 (1988).
- 39. T. Dohmen, A. Falk, D. Huffman, U. Sunde *Econ. J.* **119**, 592 (2009).
- 40. C. Bellemare, S. Kroeger, A. van Soest, *Econometrica* **76**, 815 (2008).
- 41. C.F. Camerer, R. M. Hogarth, *Journal of Risk and Uncertainty* **19**, 7 (1999).

- 42. E. Fehr, U. Fischbacher, E. Tougareva, "Do High Stakes and Competition Undermine Fairness? Evidence from Russia", *Working Paper No.120*, University of Zurich.
- 43. J. J. Heckman, R. Pinto, A. M. Shaikh, A. Yavitz, "Compromised Randomization and Uncertainty of Treatment Assignments in Social Experiments: The Case of the Perry Preschool Program", *Working Paper*, University of Chicago (2009).
- 44. J. J. Heckman, S. H. Moon, R. Pinto, P. A. Savelyev, A. Yavitz, "A reanalysis of the HighScope Perry Preschool Program", *Working Paper*, University of Chicago (2009).
- 45. S. Siegel and N. J. Castellan, *Nonparametric Statistics for The Behavioral Sciences*, (McGraw-Hill, London, 1988).
- 46. B. Herrmann, C. Thöni, S. Gächter, *Science* **319**, 1362 (2008).
- 47. D.J. Cooper, J.H. Kagel, W. Lo, Q.L. Gu, *American Economic Review* **89**, 781 (1999).
- 48. J. Carpenter, S. Burks, E. Verhoogen, in *Field Experiments in Economics, Research in Experimental Economics*, J. Carpenter, G. Harrison, J. List, Eds. (Elsevier, Greenwich, Conn. and London), 261 (2005).
- 49. S. R. G. Jones American Journal of Sociology 98, 451 (1992).
- G. E. Bolton, E. Katok, R. Zwick, *International Journal of Game Theory* 27, 269 (1998).
- 51. S. K. Laury, J. M. Walker, A. W. Williams, *Journal of Economic Behavior and Organization* **27**, 365 (1995).
- 52. E. Hoffman, et al., Games and Economic Behavior 7, 346 (1994).
- 53. C. Camerer, D. Lovallo, American Economic Review 89, 306 (1999).
- 54. T. Dohmen, A. Falk, "Performance Pay and Multidimensional Sorting: Productivity, Preferences and Gender", *IZA Discussion Paper 2001* (2006).
- J. J. Heckman, R. J. LaLonde, J. A. Smith, in *Handbook of Labor Economics*, O.
 Ashenfelter, D. Card, Eds. (North-Holland, New York), 3A, 1865 (1999).
- 56. J. J. Heckman, J. A. Smith, *Journal of Economic Perspectives* **9**, 85 (Spring, 1995).
- 57. D. S. Karlan, *American Economic Review* **95**, 1688 (2005).
- 58. P. Todd, K. I. Wolpin, American Economic Review, 96, 1384 (2006).
- 59. T. Dohmen et al., "Individual Risk Attitudes: New Evidence from a Large, Representative, Experimentally-Validated Survey", forthcoming in *Journal of the European Economic Association*.
- 60. U. Fischbacher, S. Gächter, forthcoming in American Economic Review.
- M. Browning, L. P. Hansen, J. J. Heckman, in *Handbook of Macroeconomics*, J. B. Taylor, M. Woodford, Eds. (Elsevier, Amsterdam), 1A, 543 (1999).

- 62. J. J. Heckman, *Journal of Political Economy* **82**, S136 (1974).
- 63. D. Houser, M. Keane, K. McCabe, *Econometrica* **72**, 781 (2004).

CESifo Working Paper Series

for full list see www.cesifo-group.org/wp (address: Poschingerstr. 5, 81679 Munich, Germany, office@cesifo.de)

- 2833 Jean-Claude Trichet, The ECB's Enhanced Credit Support, October 2009
- 2834 Hans Gersbach, Campaigns, Political Mobility, and Communication, October 2009
- 2835 Ansgar Belke, Gunther Schnabl and Holger Zemanek, Real Convergence, Capital Flows, and Competitiveness in Central and Eastern Europe, October 2009
- 2836 Bruno S. Frey, Simon Luechinger and Alois Stutzer, The Life Satisfaction Approach to Environmental Valuation, October 2009
- 2837 Christoph Böhringer and Knut Einar Rosendahl, Green Serves the Dirtiest: On the Interaction between Black and Green Quotas, October 2009
- 2838 Katarina Keller, Panu Poutvaara and Andreas Wagener, Does Military Draft Discourage Enrollment in Higher Education? Evidence from OECD Countries, October 2009
- 2839 Giovanni Cespa and Xavier Vives, Dynamic Trading and Asset Prices: Keynes vs. Hayek, October 2009
- 2840 Jan Boone and Jan C. van Ours, Why is there a Spike in the Job Finding Rate at Benefit Exhaustion?, October 2009
- 2841 Andreas Knabe, Steffen Rätzel and Stephan L. Thomsen, Right-Wing Extremism and the Well-Being of Immigrants, October 2009
- 2842 Andrea Weber and Christine Zulehner, Competition and Gender Prejudice: Are Discriminatory Employers Doomed to Fail?, November 2009
- 2843 Hadi Salehi Esfahani, Kamiar Mohaddes and M. Hashem Pesaran, Oil Exports and the Iranian Economy, November 2009
- 2844 Ruediger Bachmann and Christian Bayer, Firm-Specific Productivity Risk over the Business Cycle: Facts and Aggregate Implications, November 2009
- 2845 Guglielmo Maria Caporale, Burcu Erdogan and Vladimir Kuzin, Testing for Convergence in Stock Markets: A Non-Linear Factor Approach, November 2009
- 2846 Michèle Belot and Jan Fidrmuc, Anthropometry of Love Height and Gender Asymmetries in Interethnic Marriages, November 2009
- 2847 Volker Nitsch and Nikolaus Wolf, Tear Down this Wall: On the Persistence of Borders in Trade, November 2009
- 2848 Jan K. Brueckner and Stef Proost, Carve-Outs Under Airline Antitrust Immunity, November 2009

- 2849 Margarita Katsimi and Vassilis Sarantides, The Impact of Fiscal Policy on Profits, November 2009
- 2850 Scott Alan Carson, The Relationship between Stature and Insolation: Evidence from Soldiers and Prisoners, November 2009
- 2851 Horst Raff and Joachim Wagner, Intra-Industry Adjustment to Import Competition: Theory and Application to the German Clothing Industry, November 2009
- 2852 Erkki Koskela, Impacts of Labor Taxation with Perfectly and Imperfectly Competitive Labor Markets under Flexible Outsourcing, November 2009
- 2853 Cletus C. Coughlin and Dennis Novy, Is the International Border Effect Larger than the Domestic Border Effect? Evidence from U.S. Trade, November 2009
- 2854 Johannes Becker and Clemens Fuest, Source versus Residence Based Taxation with International Mergers and Acquisitions, November 2009
- 2855 Andreas Hoffmann and Gunther Schnabl, A Vicious Cycle of Manias, Crashes and Asymmetric Policy Responses An Overinvestment View, November 2009
- 2856 Xavier Vives, Strategic Supply Function Competition with Private Information, November 2009
- 2857 M. Hashem Pesaran and Paolo Zaffaroni, Optimality and Diversifiability of Mean Variance and Arbitrage Pricing Portfolios, November 2009
- 2858 Davide Sala, Philipp J.H. Schröder and Erdal Yalcin, Market Access through Bound Tariffs, November 2009
- 2859 Ben J. Heijdra and Pim Heijnen, Environmental Policy and the Macroeconomy under Shallow-Lake Dynamics, November 2009
- 2860 Enrico Spolaore, National Borders, Conflict and Peace, November 2009
- 2861 Nina Czernich, Oliver Falck, Tobias Kretschmer and Ludger Woessmann, Broadband Infrastructure and Economic Growth, December 2009
- 2862 Evžen Kočenda and Martin Vojtek, Default Predictors and Credit Scoring Models for Retail Banking, December 2009
- 2863 Christian Gollier and Martin L. Weitzman, How Should the Distant Future be Discounted when Discount Rates are Uncertain?, December 2009
- 2864 Tiberiu Dragu and Mattias Polborn, Terrorism Prevention and Electoral Accountability, December 2009
- 2865 Torfinn Harding and Beata Smarzynska Javorcik, A Touch of Sophistication: FDI and Unit Values of Exports, December 2009

- 2866 Matthias Dischinger and Nadine Riedel, There's no Place like Home: The Profitability Gap between Headquarters and their Foreign Subsidiaries, December 2009
- 2867 Andreas Haufler and Frank Stähler, Tax Competition in a Simple Model with Heterogeneous Firms: How Larger Markets Reduce Profit Taxes, December 2009
- 2868 Steinar Holden, Do Choices Affect Preferences? Some Doubts and New Evidence, December 2009
- 2869 Alberto Asquer, On the many Ways Europeanization Matters: The Implementation of the Water Reform in Italy (1994-2006), December 2009
- 2870 Choudhry Tanveer Shehzad and Jakob De Haan, Financial Reform and Banking Crises, December 2009
- 2871 Annette Alstadsæter and Hans Henrik Sievertsen, The Consumption Value of Higher Education, December 2009
- 2872 Chris van Klaveren, Bernard van Praag and Henriette Maassen van den Brink, Collective Labor Supply of Native Dutch and Immigrant Households in the Netherlands, December 2009
- 2873 Burkhard Heer and Alfred Maußner, Computation of Business-Cycle Models with the Generalized Schur Method, December 2009
- 2874 Carlo Carraro, Enrica De Cian and Massimo Tavoni, Human Capital Formation and Global Warming Mitigation: Evidence from an Integrated Assessment Model, December 2009
- 2875 André Grimaud, Gilles Lafforgue and Bertrand Magné, Climate Change Mitigation Options and Directed Technical Change: A Decentralized Equilibrium Analysis, December 2009
- 2876 Angel de la Fuente, A Mixed Splicing Procedure for Economic Time Series, December 2009
- 2877 Martin Schlotter, Guido Schwerdt and Ludger Woessmann, Econometric Methods for Causal Evaluation of Education Policies and Practices: A Non-Technical Guide, December 2009
- 2878 Mathias Dolls, Clemens Fuest and Andreas Peichl, Automatic Stabilizers and Economic Crisis: US vs. Europe, December 2009
- 2879 Tom Karkinsky and Nadine Riedel, Corporate Taxation and the Choice of Patent Location within Multinational Firms, December 2009
- 2880 Kai A. Konrad, Florian Morath and Wieland Müller, Taxation and Market Power, December 2009

- 2881 Marko Koethenbuerger and Michael Stimmelmayr, Corporate Taxation and Corporate Governance, December 2009
- 2882 Gebhard Kirchgässner, The Lost Popularity Function: Are Unemployment and Inflation no longer Relevant for the Behaviour of Germany Voters?, December 2009
- 2883 Marianna Belloc and Ugo Pagano, Politics-Business Interaction Paths, December 2009
- 2884 Wolfgang Buchholz, Richard Cornes and Dirk Rübbelke, Existence and Warr Neutrality for Matching Equilibria in a Public Good Economy: An Aggregative Game Approach, December 2009
- 2885 Charles A.E. Goodhart, Carolina Osorio and Dimitrios P. Tsomocos, Analysis of Monetary Policy and Financial Stability: A New Paradigm, December 2009
- 2886 Thomas Aronsson and Erkki Koskela, Outsourcing, Public Input Provision and Policy Cooperation, December 2009
- 2887 Andreas Ortmann, "The Way in which an Experiment is Conducted is Unbelievably Important": On the Experimentation Practices of Economists and Psychologists, December 2009
- 2888 Andreas Irmen, Population Aging and the Direction of Technical Change, December 2009
- 2889 Wolf-Heimo Grieben and Fuat Şener, Labor Unions, Globalization, and Mercantilism, December 2009
- 2890 Conny Wunsch, Optimal Use of Labor Market Policies: The Role of Job Search Assistance, December 2009
- 2891 Claudia Buch, Cathérine Tahmee Koch and Michael Kötter, Margins of International Banking: Is there a Productivity Pecking Order in Banking, too?, December 2009
- 2892 Shafik Hebous and Alfons J. Weichenrieder, Debt Financing and Sharp Currency Depreciations: Wholly vs. Partially Owned Multinational Affiliates, December 2009
- 2893 Johannes Binswanger and Daniel Schunk, What is an Adequate Standard of Living during Retirement?, December 2009
- 2894 Armin Falk and James J. Heckman, Lab Experiments are a Major Source of Knowledge in the Social Sciences, December 2009