
The Experimental Study of Asset Pricing Theory

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The Experimental Study of Asset Pricing Theory

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Abstract

This monograph sets the stage for experiments by first examining a sample data set that looks very much like the typical historical data one gathers from the field, only it was actually generated in the laboratory so that we know what really went on. The example demonstrates how misleading the traditional analysis can be. It then moves on to discuss risk aversion, since asset pricing theory builds on risk aversion. The issue is — is there enough risk aversion in the laboratory given typical levels of compensation? Asset pricing theory also builds on competitive markets and competitive equilibrium, but these are actually purely abstract notions, without any suggestion of how to generate them in practice. The article builds on the path-breaking experimental work of Vernon Smith and Charles Plott who demonstrated that certain trading institutions indeed allow us to bring about competitive markets and competitive equilibrium. The author presents the main findings — first concerning simple static asset pricing models, moving on to dynamic pricing theory, and the implications of ambiguity aversion. Asset pricing theory rarely discusses how markets reach equilibrium, but experiments shed new light on price behavior during equilibration, as well as

on off-equilibrium allocation dynamics. This monograph also examines information aggregation and competitive markets for loan and insurance contracts, where adverse selection may preclude equilibration, and even when not, the resulting allocations may be Pareto sub-optimal.

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1

Introduction

This monograph is devoted to the experimental study of asset pricing theory. It is based on a series of lectures I gave at the Austrian Central Bank in June of 2009, which themselves were distilled from lecture notes I have been using for Ph.D. classes in asset pricing at the California Institute of Technology (Caltech) and the Ecole Polytechnique Fédérale Lausanne (EPFL).

Experimentation in asset pricing is both rare and novel, so some justification is in order before we start. The goal of experimentation is twofold. First, experimentation is meant to evaluate the science behind asset pricing theory. Indeed, complete scientific validation at some point does require experimentation, otherwise, to quote the late Hannes Alfvén (Nobel prize in physics), we are "likely to go completely astray into imaginary conjecture." I will give a pointed example of this in Section 2, not in physics, but in the domain of asset pricing. It is interesting to note that Alfvén was an astrophysicist, and astrophysicists, like finance scholars, get most of their data from the field. But unlike the latter, astrophysicists do insist on verifying the principles behind their attempts to interpret field data using laboratory experiments, even if the latter are only miniscule compared

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to real-world (or should I say real-universe?) phenomena. Like astrophysicists, finance scholars interpret field data through the lens of particular theory (e.g., competitive equilibrium), without being able to verify independently that this lens is appropriate. Only laboratory experiments can give us the confidence that our inference is correct.

The second goal of experimentation is to come to a deeper understanding of asset pricing theory. My own experience with experiments confirms that one cannot appreciate all the ramifications (and the beauty) of asset pricing theory without thinking through how one could generate it in the laboratory. To paraphrase the late Richard Feynman (another Nobel prize in physics): “One cannot understand theory if one cannot create it.” Indeed, my own attempts to “create” the Lucas equilibrium (Lucas, 1978) in the laboratory led me to realize that some claims in the literature about it (Judd et al., 2003) were misguided (Bossaerts and Zame, 2006). While others (Berrada et al., 2007) evidently did not need experiments to realize the same, in my experience, few students of asset pricing theory appreciate the true nature of our asset pricing theory. For instance, equivalence results like the claim that static, complete-markets allocations can be implemented in incomplete markets by allowing re-trading (Duffie and Huang, 1985), are really not “equivalent,” because vastly different notions of competitive equilibrium are being compared. (We shall discuss this very example in more detail later on.)

To set the stage, we first discuss, in the next section, a sample data set that looks very much like the typical data set finance scholars gather from the field; only, it was actually generated in the laboratory. We shall attempt to interpret these data as we would do with field data, only to realize that our interpretation is completely false. We know this because we know how the data were generated in the laboratory.

The subsequent section will discuss risk aversion. Asset pricing theory builds on risk aversion. Without risk aversion, models like the CAPM or Lucas’ dynamic asset pricing model are vacuous. The issue is: will there be enough risk aversion in the laboratory given typical levels of compensation? And if so, how do we interpret this in view of Rabin’s theoretical claim (Rabin, 2000) that we should *not* see risk aversion, or, to put it differently, that it *cannot* be risk aversion?

Section 4 is equally foundational. Asset pricing theory builds on competitive equilibrium. Competitive equilibrium is an abstract notion; it does not tell us how we can get there. How, then, will we get to it in the laboratory? Here, we will build on the path-breaking work of Vernon Smith and Charles Plott who demonstrated that certain trading institutions indeed allow us to generate competitive equilibrium [while prior attempts, with different institutions, had failed (Chamberlin, 1948)]. As it turns out, the successful trading institutions are complex, and require powerful software that only recently has become available. (It will be interesting to note that many real-world financial markets have been adopting the very trading mechanisms that we have been using in the laboratory.)

After that, we will be ready to discuss the main findings, first concerning simple static asset pricing models, moving on to dynamic pricing theory, and the implications of ambiguity aversion. Asset pricing theory rarely discusses how markets reach equilibrium (although market microstructure purports to shed light on it), but, as we shall see next, experiments shed new light on price behavior during equilibration, as well as on off-equilibrium allocation dynamics. We will also discuss information aggregation (although I prefer to call it information “amplification” for a reason that I will make clear), and, lastly, markets for loan and insurance contracts, where adverse selection may preclude equilibration, and even when not, the resulting allocations may be Pareto sub-optimal.

The review ends with concluding remarks.

References

- Anderson, C. M., C. R. Plott, K.-I. Shimomura, and S. Granat (2004), ‘Global instability in experimental general equilibrium: The Scarf example’. *Journal of Economic Theory* **115**, 209–249.
- Angerer, M., J. Huber, and M. Kirchler (2009), ‘Experimental asset markets with endogenous choice of costly heterogeneous information’. Working paper.
- Arrow, K. J. (1964), ‘The role of securities in the optimal allocation of risk-bearing’. *The Review of Economic Studies* **31**, 91–96.
- Asparouhova, E. (2006), ‘Competition in lending: Theory and Experiments’. *Review of Finance* **10**, 189–219.
- Asparouhova, E. and P. Bossaerts (2009), ‘Modelling price pressure in financial markets’. *Journal of Economic Behavior & Organization* **72**, 119–130.
- Asparouhova, E., P. Bossaerts, and C. Plott (2003), ‘Excess demand and equilibration in multi-security financial markets: The empirical evidence’. *Journal of Financial Markets* **6**, 1–21.
- Barberis, N., M. Huang, and T. Santos (2001), ‘Prospect theory and asset prices*’. *Quarterly Journal of Economics* **116**, 1–53.
- Barner, M., F. Feri, and R. C. Plott (2005), ‘On the microstructure of price determination and information aggregation with sequential

- and asymmetric information arrival in an experimental asset market'. *Annals of Finance* **1**, 73.
- Berrada, T., J. Hugonnier, and M. Rindisbacher (2007), 'Heterogeneous preferences and equilibrium trading volume'. *Journal of Financial Economics* **83**, 719–750.
- Biais, B., L. Glosten, and C. Spatt (2005), 'Market microstructure: A survey of microfoundations, empirical results, and policy implications'. *Journal of Financial Markets* **8**, 217–264.
- Black, F. and M. Scholes (1973), 'The pricing of options and corporate liabilities'. *The Journal of Political Economy* **81**, 637–654.
- Bossaerts, P. (1998), 'Rational expectations equilibrium when priors are inconsistent'. SS Working Paper Caltech.
- Bossaerts, P. (2002), *The Paradox of Asset Pricing*. Princeton: Princeton University Press.
- Bossaerts, P. (2004), 'Experiments with financial markets: Implications for asset pricing theory'. In: M. Szenberg and L. Ramrattan (eds.): *New Frontiers in Economics*. Cambridge: Cambridge University Press.
- Bossaerts, P. (2009), 'What decision neuroscience teaches us about financial decision making'. *Annual Review of Financial Economics* p. 1.
- Bossaerts, P., P. Ghirardato, S. Guarnaschelli, and W. R. Zame (2009a), 'Ambiguity in asset markets: Theory and experiment'. *Review of Financial Studies*, In Press.
- Bossaerts, P. and P. Hillion (2001), 'IPO Post-Issue Markets: Questionable predilections but diligent learners?'. *Review of Economics and Statistics* **83**, 333–347.
- Bossaerts, P. and O. J. Ledyard (2009), 'Equilibration under competition in smalls: Theory and experimental evidence'. *In Preparation*.
- Bossaerts, P., D. Meloso, and W. Zame (2009b), 'Dynamically complete experimental asset markets'. Under Review.
- Bossaerts, P. and C. Plott (2002), 'The CAPM in thin experimental financial markets'. *Journal of Economic Dynamics and Control* **26**, 1093–1112.
- Bossaerts, P. and C. Plott (2004), 'Basic principles of asset pricing theory: Evidence from large-scale experimental financial markets'. *Review of Finance* **8**, 135–169.

- Bossaerts, P., C. Plott, and W. Zame (2007a), 'Prices and portfolio choices in financial markets: Theory, econometrics, experiment'. *Econometrica* **75**, 993–1038.
- Bossaerts, P., C. Plott, and W. Zame (2007b), 'Prices and portfolio choices in financial markets: Theory, econometrics, experiments'. *Econometrica* **75**, 993–1038.
- Bossaerts, P., C. R. Plott, P. R. Charles, and S. L. Vernon (2008), 'Chapter 2 from market jaws to the newton method: The geometry of how a market can solve systems of equations'. *Handbook of Experimental Economics Results*, Elsevier.
- Bossaerts, P., R. C. Plott, and W. Zame (2007c), 'Prices and portfolio choices in financial markets: Theory, econometrics, experiments'. *Econometrica* **75**, 993–1038.
- Bossaerts, P. and R. W. Zame (2006), 'Asset trading volume in infinite-horizon economies with dynamically complete markets and heterogeneous agents: Comment'. *Finance Research Letters* **3**, 96–101.
- Bruguier, A., S. Quartz, and P. Bossaerts (2009), 'Exploring the nature of "Trading Intuition"'. *Under Review*.
- Camerer, C. and K. Weigelt (1991), 'Information mirages in experimental asset markets'. *The Journal of Business* **64**, 463–493.
- Chamberlin, E. H. (1948), 'An experimental imperfect market'. *The Journal of Political Economy* **56**, 95–108.
- Constantinides, G. M. (1990), 'Habit formation: A resolution of the equity premium puzzle'. *The Journal of Political Economy* **98**, 519–543.
- Cox, C. J. and G. W. Harrison (eds.) (2008), *Risk Aversion in Experiments*. Bingley, UK: Emerald.
- Crockett, S., R. Oprea, and C. Plott (2009), 'Stability in laboratory markets revisited: The gale example'. *Under Review*.
- Dasgupta, P. and E. Maskin (1986), 'The existence of equilibrium in discontinuous economic games, II: Applications'. *The Review of economic studies* **53**, 27–41.
- Debreu, G. (1959), *Theory of Value*. New York: Wiley.
- Dubey, P. and J. Geanakoplos (2002), 'Competitive pooling: Rothschild-stiglitz reconsidered'. *Quarterly Journal of Economics* **117**, 1529–1570.

- Duffie, D. and C.-F. Huang (1985), 'Implementing arrow — Debreu equilibria by continuous trading of few long-lived securities'. *Econometrica* **53**, 1337–1356.
- Duffie, D., S. Malamud, and G. Manso (2009), 'Information percolation with equilibrium search dynamics'. *Econometrica*, In Print.
- Duffy, J., A. Matros, and T. Temzelides (2009), 'Competitive behavior in market games: Evidence and theory'. *Under Review*.
- Easley, D. and O. J. Ledyard (1993), 'Theories of price formation and exchange in double oral auctions'. In: D. Friedman and J. Rust (eds.): *The Double Auction Market. Institutions, Theories, and Evidence*. Santa Fe: Santa Fe Institute, 2 edition.
- Ellsberg, D. (1961), 'Risk, ambiguity, and the savage axioms'. *The Quarterly Journal of Economics* **75**, 643–669.
- Epstein, G. L. and T. Wang (1994), 'Intertemporal asset pricing under knightian uncertainty'. *Econometrica* **62**, 283–322.
- Fama, E. F. (1991), 'Efficient Capital Markets: II'. *The Journal of Finance* **46**, 1575–1617.
- Fama, F. E. and R. K. French (1996), 'Multifactor explanations of asset pricing anomalies'. *The Journal of Finance* **51**, 55–84.
- Fiorillo, D. C., N. P. Tobler, and W. Schultz (2003), 'Discrete coding of reward probability and uncertainty by dopamine neurons'. *Science* **299**, 1898–902.
- Forsythe, R., R. T. Palfrey, and R. C. Plott (1982), 'Asset valuation in an experimental market'. *Econometrica* **50**, 537–567.
- Forsythe, R., R. T. Palfrey, and R. C. Plott (1984), 'Futures markets and informational efficiency: A laboratory examination'. *The Journal of Finance* **39**, 955–981.
- Fostel, A. and J. Geanakoplos (2008), 'Leverage cycles and the anxious economy'. *The American Economic Review* **98**, 1211.
- Gale, D. (1963), 'A note on global instability of competitive equilibrium'. *Naval Research Logistics Quarterly* **10**, 81–87.
- Geanakoplos, J. and W. Zame (2007), 'Collateralized Asset Markets'. UCLA Economics Working Paper.
- Ghirardato, P., F. Maccheroni, and M. Marinacci (2004), 'Differentiating ambiguity and ambiguity attitude'. *Journal of Economic Theory* **118**, 133–173.

- Gode, K. D. and S. Sunder (1993), 'Allocative efficiency of markets with zero-intelligence traders: Market as a partial substitute for individual rationality'. *The Journal of Political Economy* **101**, 119–137.
- Grossman, J. S. and E. J. Stiglitz (1976), 'Information and competitive price systems'. *The American Economic Review* **66**, 246–253.
- Guesnerie, R. (1992), 'An exploration of the educative justifications of the rational-expectations hypothesis'. *American Economic Review* **82**, 1254–1278.
- Harrison, H., D. J. Kubik, and C. J. Stein (2004), 'Social interaction and stock-market participation'. *The Journal of Finance* **59**, 137–163.
- Heaton, J. (1995), 'An empirical investigation of asset pricing with temporally dependent preference specifications'. *Econometrica* **63**, 681–717.
- Holt, A. C. and K. S. Laury (2002), 'Risk aversion and incentive effects'. *American Economic Review* **92**, 1644–1655.
- Hussam, N. R., D. Porter, and L. V. Smith (2008), 'Thar she blows: Can bubbles be rekindled with experienced subjects?'. *The American Economic Review* **98**, 924.
- Judd, L. K. and S.-M. Guu (2001), 'Asymptotic methods for asset market equilibrium analysis'. *Economic Theory* **18**, 127–157.
- Judd, L. K., F. Kubler, and K. Schmedders (2003), 'Asset trading volume with dynamically complete markets and heterogeneous agents'. *The Journal of Finance* **58**, 2203–2217.
- Kluger, D. B. and B. S. Wyatt (2004), 'Are judgment errors reflected in market prices and allocations? Experimental evidence based on the monty hall problem'. *The Journal of Finance* **59**, 969–997.
- Knetsch, L. J. and A. J. Sinden (1984), 'Willingness to pay and compensation demanded: Experimental evidence of an unexpected disparity in measures of value'. *The Quarterly Journal of Economics* **99**, 507–521.
- Kocherlakota, N. R. (1996), 'The equity premium: It's still a puzzle'. *Journal of Economic Literature* **34**, 42–71.
- Kroll, Y., H. Levy, and R. Amnon (1988), 'Experimental tests of the separation theorem and the capital asset pricing model'. *The American Economic Review* **78**, 500–519.

- Lei, V., N. C. Noussair, and R. C. Plott (2001), 'Nonspeculative bubbles in experimental asset markets: Lack of common knowledge of rationality vs. actual irrationality'. *Econometrica* **69**, 831–859.
- Lintner, J. (1965), 'The valuation of risk assets and the selection of risky investments in stock portfolios and capital budgets'. *The Review of Economic Statistics* **47**, 13–37.
- Lucas JR., E. R. (1978), 'Asset prices in an exchange economy'. *Econometrica* **46**, 1429–1445.
- Mossin, J. (1966), 'Equilibrium in a capital asset market'. *Econometrica: Journal of the Econometric Society* **34**, 768–783.
- Noussair, C., S. Robin, and B. Ruffieux (2001), 'Price bubbles in laboratory asset markets with constant fundamental values'. *Experimental Economics* **4**, 87–105.
- Plott, C. R. (2000), 'Market stability: Backward-bending supply in a laboratory experimental market'. *Economic Inquiry* **38**.
- Plott, R. C. and G. George (1992), 'Marshallian vs. Walrasian stability in an experimental market'. *The Economic Journal* **102**, 437–460.
- Plott, R. C. and L. V. Smith (1978), 'An experimental examination of two exchange institutions'. *The Review of economic studies* **45**, 133–153.
- Plott, R. C. and S. Sunder (1982), 'Efficiency of experimental security markets with insider information: An application of rational-expectations models'. *The Journal of Political Economy* **90**, 663–698.
- Plott, R. C. and S. Sunder (1988), 'Rational expectations and the aggregation of diverse information in laboratory security markets'. *Econometrica* **56**, 1085–1118.
- Plott, R. C., J. Wit, and C. W. Yang (2003), 'Parimutuel betting markets as information aggregation devices: experimental results'. *Economic Theory* **22**, 311–351.
- Porter, P. D. and V. L. Smith (1995), 'Futures contracting and dividend uncertainty in experimental asset markets'. *The Journal of Business* **68**, 509–541.
- Preuschoff, K., P. Bossaerts, and S. Quartz (2006), 'Neural differentiation of expected reward and risk in human subcortical structures'. *Neuron* **51**, 381–390.

- Rabin, M. (2000), 'Risk aversion and expected-utility theory: A calibration theorem'. *Econometrica* **68**, 1281–1292.
- Radner, R. (1972), 'Existence of equilibrium of plans, prices, and price expectations in a sequence of markets'. *Econometrica* **40**, 289–303.
- Radner, R. (1979), 'Rational expectations equilibrium: Generic existence and the information revealed by prices'. *Econometrica* **47**, 655–678.
- Roll, R. (1977), 'A critique of the asset pricing theory's tests'. *Journal of Financial Economics* **4**, 129–176.
- Rothschild, M. and J. Stiglitz (1976), 'Equilibrium in competitive insurance markets: An essay on the economics of imperfect information'. *The Quarterly Journal of Economics* **90**, 629–649.
- Saari, G. D. and P. C. Simon (1978), 'Effective price mechanisms'. *Econometrica* **46**, 1097–1125.
- Scarf, H. (1960), 'Some examples of global instability of the competitive equilibrium'. *International Economic Review* **1**, 157–172.
- Sharpe, W. F. (1964), 'Capital asset prices: A theory of market equilibrium under conditions of risk'. *Journal of Finance* **19**, 425–442.
- Smale, S. (1976a), 'A convergent process of price adjustment and global newton methods'. *Journal of Mathematical Economics* **3**, 107–120.
- Smale, S. (1976b), 'Exchange processes with price adjustment'. *Journal of Mathematical Economics* **3**, 211–226.
- Smith, V. L. (1962), 'An experimental study of competitive market behavior'. *The Journal of Political Economy* **70**, 111–137.
- Smith, V. L. (1991), *Papers In Experimental Economics*. Cambridge: Cambridge University Press.
- Smith, V. L., L. G. Suchanek, and W. W. Arlington (1988), 'Bubbles, crashes, and endogenous expectations in experimental spot asset markets'. *Econometrica* **56**, 1119–1151.
- Sundaresan, S. M. (1989), 'Intertemporally dependent preferences and the volatility of consumption and wealth'. *The Review of Financial Studies* **2**, 73–89.
- Sunder, S. (1992), 'Market for information: Experimental evidence'. *Econometrica* **60**, 667–695.