



Peter Bossaerts

	Brain, Mind and Markets Laboratory Room 12.040 198 Berkeley Street Parkville, VIC 3010		
	Laboratory web site: <u>http://bmmlab.org/</u>		
Honors	Fellow of The Econometric Society (Elected 2010)		
	Fellow of The Society for the Advancement of Economic Theory (Elected 2011)		
	Redmond Barry Distinguished Professor at The University of Melbourne (Elected 2016)		
	Fellow of the Academy of Social Sciences in Australia (Elected 2017)		
Academic Appointments – Primary	Professor, Experimental Finance & Decision Neuroscience, <i>The University of Melbo</i> Honorary Professorial Fellow, <i>The Florey Institute of Neuroscience and Mental Hea</i> David Eccles Professor of Finance		
	& Adjunct Professor of Neurology, University of Utah	2013 - 2015	
	William D Hacker Professor of Economics and Management, <i>Caltech</i>	2003 -2013	
	Swiss Finance Institute Professor, EPFL	2007 - 2012	
	Professor of Finance, Caltech	1998 - 2013	
	Associate Professor of Finance, Caltech	1994 - 1998	
	Research Professor of Investments Analysis, Tilburg University	1994 - 1996	
	Assistant Professor of Finance, Caltech	1990 - 1994	
	Assistant Professor of Finance, Carnegie Mellon University	1987 - 1990	
Academic	Visiting Associate in Finance, Caltech	2013 -	
Appointments	Visiting Professor, Cambridge University	2012 - 2014	
– Secondary	Honorary Professorial Fellow, University of Melbourne	2012 - 2013	
	Fellow, UTS Market Design Centre	2014 -	
	Research Fellow, Centre for Economic Policy Research	1995 - 2014	
	Fellow, University of Zurich Center for Engineering Social and Economic Institutions2012 - 2014		
	Affiliate, USC Theoretical Research in Neuroeconomic Decision Making (TREND)	2012 -	
	Member of the Computation and Neural Systems faculty, Caltech	2006 - 2013	
	Swiss Finance Institute Visiting Professor, University of Lausanne	2006 - 2007	
	Fellow, Center of Excellence, Kobe University	2006	
	Guest Professor, University of Zurich	2004	
	Leif Johansen Distinguished Visiting Scholar, Norwegian School of Management	1999	

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Visiting Associate Professor of Finance, Yale University	1998
Postdoctoral Research Fellow, Carnegie Mellon University	1986 – 1987

Academic Appointments – Executive	Director, <i>R. and M. Linde Institute of Economic and Management Sciences, Caltech</i> Co-Dean, <i>College of Management, EPFL</i> Founding Program Chair, Master in Financial Engineering, <i>EPFL</i> Chair, Division of The Humanities and Social Sciences, <i>Caltech</i> Executive Officer for the Social Sciences, <i>Caltech</i>	2011-12 2008 2007-8 2006-7 2002-5
Industry Experience	 Executive Education, Behavioral Finance, Foundation William E. Simon Graduate S Business Administration in Switzerland Advisory Board, Dysrupt Labs (Melbourne, Australia) Scientific Committee, Geneva Institute for Wealth Management Lectures, several organizations: Willis Towers Watson (Australia), i3 (Australia), CL Kong), KBC (Belgium), BayernLB (Germany), Julius Baer (Zurich), Pictet (Geneval York), Nokia (Helsinki), 	2015 – 2017 – 2017 – LSA (Hong
Education	 Ph.D. (Management), UCLA Coursework, Master's Program in Statistics, Free University Brussels Doctorandus (Applied Economics), UFSIA (Summa Cum Laude) Licenciaat (Applied Economics), UFSIA (Cum Laude) 	1983 – 1986 1982 – 1982 1981 – 1982 1977 – 1981
Grants	 Australian Research Council, for the discovery project "A New Framework to Improve Human-Robot Interaction in Financial Markets," 2018-20. National Science Foundation, for the project "Price Quality in Dark Markets: Tests of the Duffie-Malamud-Manso Theory Using Controlled Experiments," 2014-6, with Elena Asparouhova (University of Utah) National Science Foundation, for the project "Workshop for the Promotion of Experimental Validation of the Theory of Asset Pricing," 2014-5, with Elena Asparouhova (University of Utah) Fondation Banque de France, for the project "Price Quality in Dark Markets," 2014-5, with Elena Asparouhova (University of Utah) National Science Foundation, for the project "US-German Collaboration: Computational and Neural Mechanisms of Inference over Decision-Structure," 2012-15, joint with John O'Doherty (Caltech) and Jan Gläscher (University Medical Center Hamburg). National Science Foundation, for the project "Market Bubbles As Expression Of Social Norms: Experiments," 2011-13, Grant #SES-1061824, with Elena Asparouhova (University of Utah) Swiss National Science Foundation, for the SystemX.ch project "Neural Correlates of Collective Decision Making: From Molecules to Minds," 2008-12 (co-PI) 	





Swiss National Science Foundation, NCCR Finrisk 3rd Phase, for the project "Behavioural Finance," 2008-13 (with Ernst Fehr and Thorsten Hens)

AXA Foundation Grant For A Postdoctoral Student, 2006-8.

Inquire Europe, for the project "Will Equilibrium-Induced Predictability Survive Undoing By The Uninitiated And Skeptical?" 2006-8.

Co-Principal, Tamagawa University-Caltech Center of Excellence grant

Moore Foundation grant to Caltech, for the project "Experimentation with Large, Diverse and Interconnected Socio-Economic Systems," 2006-11.

National Science Foundation, for the project "Experiments on Information and Information Processing in Financial Markets," 2006-11, Grant #SES-0616431, with Elena Asparouhova (University of Utah) and William Zame (UCLA)

National Science Foundation, for the project "How Asset Markets Assist Complex Problem Solving: Identifying The Cues Through Neurocorrelates," 2005-2010, Grant #SBE-0527491

National Science Foundation, for the project "The Evolution of Prices and Allocations in Markets: Theory and Experiment," 2003-2006, Grant #SES-0317715, with William Zame (UCLA)

National Science Foundation, for the project "Perfectly Rational Markets, Imperfectly Rational Traders: Theory and Experiment," 2000-2003, Grant #SES-0079374, with William Zame (UCLA)

Grant to support research on financial markets from the R.G. Jenkins Family Fund of the Fidelity Investments Charitable Gift Fund, 2000

Research Grant from State Street Bank to Caltech for the Proposal "Assessing The Severity of the Absence of 'Packaging' Possibilities At the NYSE Open," 1999

Research Grant, "Participation of Boundedly Rational Agents in Financial Markets: Effects on Speculation, Trading Volume and Price Volatility," European Union, Grant #ERB4001GT950936, 1995-6

Grant, "Local Parametric Analysis of Hedging In Discrete Time," Royal Dutch Academy of Sciences, 1995.

Research Grant from First Quadrant to Caltech for the Proposal "Forecasting Non-Stationary Financial Return Data," August 93-July 94

Standard Oil Research Chair Award, Summer 1987

Awards2018 Best Paper Award, Behavioral Finance and Capital Markets Conference, Latrobe
University (September 2018), for "Building Financial Skills Training Schemes"

2017 Financial Management Association Best Paper Award (Markets & Institutions) for: "Costly Information Acquisition in Decentralized Markets: An Experiment," with Elena Asparouhova and Wenhao Yang

2014 Pagano and Zechner Prize for Best Non-Investments Article Published in the Prior Year in the Review of Finance, for: "The Speed of Information Revelation and Eventual Price Quality in Markets with Insiders: Comparing Two Theories"

Doctoral Faculty 2014 Teaching Excellence Award, David Eccles School of Business, University of Utah

2013 Best Paper Award, Behavioral Finance and Capital Markets Conference, *Centre for Applied Financial Studies* of *The University of Adelaide* (August 2013), for: "Lucas' in the Laboratory"





Lloyd's Science of Risk 2011 Prize for "Hedging your bets by learning about reward correlations in the human brain," published in *Neuron*

Review of Finance 2004 Goldman Sachs Asset Management Best Research Paper Award for the paper "Basic Principles of Asset Pricing Theory: Evidence From Large-Scale Experimental Financial Markets"

Journal of Financial Markets 2003 Best Paper Award for the paper "Excess Demand and Equilibration in Multi-Security Financial Markets: The Empirical Evidence"

Mathematical Finance 1993 Best Paper Award (Third Prize) for the paper "A Test of a General Equilibrium Stock Option Pricing Model"

Keynote"Towards Biological Foundations of Decisions with Uncertainty: A Mission Incomplete,"Lectures -Melbourne Brain Symposium, October 2018Since 2007"Modeling Ignorance: Uncertainty or Complexity?" Research in Behavioral Finance

Conference, Amsterdam, September 2018

"Modeling Ignorance: Uncertainty or Complexity?" Experimental Finance Workshop, Max Planck Institute (Bonn, Germany), June 2018

"Human-Robot Interaction in Financial Markets: Experiments," Workshop on Algorithmic Trading, *University of Luxemburg*, June 2018

"Modeling Ignorance: Uncertainty or Complexity?" *The Computational Neuroscience of Prediction*, Federation of European Neuroscience Societies, Rungstedgaard, Denmark, April 2018.

"How Neurobiology Can Inform Decision Science," Asia-Pacific Meetings of the Economic Science Association Meetings, Brisbane, 2018.

"Towards an Experimental Framework to Study and Improve Human-Robot Interaction in Financial Markets," *Market Design and Regulation in The Presence of High-Frequency Trading*, Hong Kong, December 2017

"Fact and Fiction in Finance: The Scientist's View," 24th CLSA Investors' Forum, Hong Kong, September 2017.

"How Neurobiology Can Inform Decision Science: The Case of Trading Skill," 2017 *Conference of the Association for NeuroPsychoEconomics*, Antwerp (Belgium).

"How Do Humans Perceive Financial Risks?" 2016 North-American Meetings of the Society for Experimental Finance, Tucson AR (USA).

"Neuro-biological Foundations of Financial Market Psychology," *Sixth Behavioural Finance and Capital Markets Conference*, Adelaide (Australia), September 2016

"Using Alpha to Generate Alpha," *CIFR Conference on Investment Management and Markets*, Sydney (Australia), May 2016.

"Neuro-biological Foundations of Financial Market Psychology," *Auckland Finance Meeting*, December 2015

"Human Reaction To Leptokurtosis and Its Biological Foundations," Australasian Society for Cognitive Science, Monash University, December 2014

"Human Reaction To Leptokurtosis and Its Biological Foundations," *Financial Management Association European Meetings, Maastricht (The Netherlands)*, June 2014

"Outlier Risks," *Third Behavioral Finance and Capital Markets Conference*, Adelaide (Australia), August 2013

"Outlier Risks," World Meetings of the Economic Science Association, Zurich, July 2013





"The Neurobiology Behind Human Decision Making," 2013 Finance Down Under Conference, Melbourne (Australia), March 2013

"The human brain behind financial skill," *Joint Symposium, National Taiwan University, National Chengchi University, National Yang-Ming University*, Taipei (Taiwan), March 2012

"The human brain behind financial skill." *Second Miami Behavioral Finance Conference*, December 2012

"The human brain behind financial skill." Swiss Finance Institute Annual Meeting, November 2011

"Double-Sided Markets," C-Suite Lunch Talk, Australian Graduate School of Management, University of New South Wales, April 2011

"Neurobiological Foundations of Decision Making under Uncertainty," *Finance Down Under*, *University of Melbourne*, March 2011

"Experimental Finance," Finance Down Under, University of Melbourne, March 2011

"Market Bubbles and Crashes as an Expression of Tension between Social and Individual Rationality: Theory and Experiments," *WISE International Workshop on Experimental Economics and Finance, Xiamen University, China*, December 2010

"Experiments on Market Dynamics," *Experimental Finance 2010 Conference, University of Gothenburg, Sweden*, October 2010

"What Decision Neuroscience Teaches Us about Financial Decision Making," Marian Miner Cook Athenaeum Lecture, Claremont McKenna College, March 2010

"Neuroscience and Decision Making," at: A Birdseye View of Finance: Past, Present, and Future Frontiers, Conference organized in honor of Haim Levy, Jerusalem, August 2009

"Experimenting With Financial Markets," Austrian Central Bank, June 2009

"Strategic Uncertainty In Games and Markets: A Neuroeconomic Perspective," at: 5th International Meeting On Experimental And Behavioral Economics, Granada (Spain), April 2009

"Potential Policy Implications of Neuroeconomics," at: *The Social Brain*, symposium organized by the Royal Academy of Arts, Manufacture and Commerce (RSA) and the Wellcome Trust, London, January 2009

"Decision Making under Uncertainty: Risk and Risk Learning," *Building Bridges in Medical Sciences, Cambridge University Medical School*, November 2008

"The Neuroeconomics of Decision Making," World Economic Forum, Geneva, September 2008.

"Neurobiological Foundations of Perception and Decision under Uncertainty," 2008 International Economic Science Association Conference, California Institute of Technology, June 2008

"Neurobiological Foundations of Perception and Decision under Uncertainty," *Fourth Asia Pacific Meeting of the Economic Science Association, National University of Singapore*, February 2008

"Neurobiological Foundations of Perception and Decision under Uncertainty," 9th Biennial Symposium "Neuroeconomics: Decision Making and the Brain," New York University Center for Neural Science, January 2008

"The Neuroeconomics of Decision Making," 30th Annual Meeting of Japan Neuroscience Society, September 2007

"The Neuroeconomics of Decision Making," Second ESA Asia-Pacific Regional Meeting, Osaka (Japan), February 2007





Engagement

Workshop for the Promotion of Experimental Validation of the Theory of Asset Pricing, Sundance Resort, Utah, October 2015; co-organiser (with Elena Asparouhova); workshop funded by the U.S. National Science Foundation, Fondation Banque de France, a grant from the Moore Foundation to Caltech, and The University of Utah.

Society for Neuroeconomics, President (2011-2), Board member (2007-2014), Council member (2015-16)

Society for Experimental Finance, President (2017-8), Founding member (2011), Chief Organizer of 2018 Asia Pacific regional meetings

Australian Research Council, member of the College of Experts (2018-)

Co-Editor: Review of Finance (2005-2009)

Ad-hoc Acting Editor: Journal of Finance

Ad-hoc Acting Editor: Proceedings of The National Academy of Sciences (PNAS)

Associate Editor: Review of Financial Studies (1994-7), Journal of Finance (2015-2017), Journal of Financial Markets (1997-), Journal of Financial Econometrics (2001-2012), Mathematical Finance (2002-5), Review of Finance (2003-5; 2009-), Annals of Finance (2004-2007), Foundations and Trends in Economic Theory (2006-), Journal of Neuroscience, Psychology and Economics (2009-11, 2018-), Algorithmic Finance (2010-), Frontiers in Decision Neuroscience (2010-), Frontiers in Integrative Neuroscience (2018-)

Referee: American Economic Review, The American Journal of Psychiatry, Behavioral and Brain Sciences, Cerebral Cortex, Cognition, Current Biology, Econometrica, Economic Journal, Economics Letters, Economic Theory, European Economic Review, Finance, Frontiers in Behavioral Neuroscience, Frontiers in Decision Neuroscience, International Economic Review, Journal of The American Statistical Association, Journal of Business, Journal of Business and Economic Statistics, Journal of Econometrics, Journal of Economic Behavior and Organization, Journal of Economic Dynamics and Control, Journal of Empirical Finance, Journal of Experimental Psychology, Journal of Finance, Journal of Financial Economics, Journal of Financial and Quantitative Analysis, Journal of International Money and Finance, Journal of Money, Credit and Banking, Journal of Neuroscience, Psychology, and Economics, Journal of Political Economy, Management Science, Nature Neuroscience, NeuroImage, Neuron, PLoS (Biology; Computational Biology; Neuroscience and Psychiatry), Philosophical Transactions B of the Royal Society (Biological Sciences), Proceedings of the National Academy of Sciences, Psychological Science, Rand Journal of Economics, Review of Economics and Statistics, Review of Economic Studies, Review of Financial Studies, Science, Utah Winter Finance Conferences, Western Finance Association, Miami Behavioral Finance Conferences.

Neuroeconomics Symposium, Co-Organizer (APESA, Singapore, February 2008)

Neuro-Finance Symposium, Co-Organizer (Zurich, Switzerland, July 2007)

European Neuroeconomics Association, Member of the Scientific Council (2009-)

European Finance Association, Director, Executive Committee, 2010-12

Economic Science Association, Officer (Section Head, Finance; 2004-2005)

American Finance Association, member of the 2002 & 2016 Nominating Committees

Financial Management Association, Member of the Doctoral Consortium mentoring advanced Ph.D. students (2015)

Member of Review Panels (Committees of Experts), European Research Council Advanced Grants (2008-9); National Science Foundation (2010-12).

Reviewer of Grant Applications: national (U.S., Australia, Canada, Switzerland, U.K, Belgium, France, Germany) and international (European Union) public and private (e.g., AXA)





foundations, including the U.S. NIH

Member: American Finance Association, Association for Psychological Science, Econometric Society, Economic Science Association, European Finance Association, Society for Neuroeconomics, Society for Neuroscience, Society for the Promotion of Financial Studies, Western Finance Association

Asset Pricing Theory – Articles

- 1. "Common Nonstationary Components of Asset Prices," *Journal of Economic Dynamics and Control* 12 (1988), 347-364.
- 2. "A General Equilibrium Model of Changing Risk Premia: Theory and Tests," with Richard C. Green, *Review of Financial Studies* 2 (1989), 467-493.
- 3. "A Test of a General Equilibrium Stock Option Pricing Model," with Pierre Hillion, *Mathematical Finance* 3 (1993), 311-347.
- 4. "Transaction Prices When Insiders Trade Portfolios," *Finance* 14 (1993); Summary appeared in *Journal of Finance* 48 (1993), 1069-1070.
- 5. "Tax-Induced Intertemporal Restrictions on Security Returns," with Robert Dammon, *Journal of Finance* 49 (1994):,1347-1372.
- "Asset Prices and Volume in a Beauty Contest," with Bruno Biais, *Review of Economic Studies* 65 (1998), 307-340; Summary appeared in *Journal of Finance* 49 (1994), reprinted in *Advances in Financial Modeling*, B. Biais and M. Pagano, eds., Oxford University Press, 2001.
- 7. "Speculative Behavior and the Functioning of Financial Markets: Discussion," (in Spanish), *Moneda y Credito* 200 (1995), 39-44.
- 8. "Expectations and Learning in Iowa," with Oleg Bondarenko, *Journal of Banking and Finance* 24 (2000), 1535-1555.
- 9. "An Exploration of Neo-Austrian Theory Applied To Financial Markets," with Harald Benink, *Journal of Finance* 54 (2001), 1011-1028.
- 10. "An Optimal IPO Mechanism," with Bruno Biais and Jean-Charles Rochet, *Review of Economic Studies* 69 (2002) 117-146.
- 11. "Filtering Returns for Unspecified Biases in Priors when Testing Asset Pricing Theory," *Review of Economic Studies* 70 (2003), 1-24.
- 12. "Asset Trading Volume in Infinite-Horizon Economies with Dynamically Complete Markets and Heterogeneous Agents: Comment," with William Zame, *Finance Research Letters* 3 (2006), 96-101.
- 13. "Prices and Allocations in Financial Markets: Theory, Econometrics, and Experiments," with Charles Plott and William Zame, *Econometrica* 75 (2007), 993-1038.
- 14. "Modeling Price Pressure in Financial Markets," with Elena Asparouhova, *Journal of Economic Behavior and Organization* 72 (2009), 119-130.
- 15. "Equilibrium Asset Pricing Under Heterogeneous Information," with Bruno Biais and Chester Spatt, *Review of Financial Studies* 23 (2010), 1503-43.
- 16. "Ambiguity in Asset Markets: Theory and Experiment," with Paolo Ghirardato, Serena Guarnaschelli and William Zame, *Review of Financial Studies* 23 (2010), 1325-59.
- "Competition in Portfolio Management: Theory and Experiment," with Elena Asparouhova, Jernej Copic, Brad Cornell, Jaksa Cvitanic and Debrah Meloso, *Management Science* 61(2015), 1868-1888.
- 18. "Asset Pricing and Asymmetric Reasoning," with Elena Asparouhova, Jon Eguia and





William Zame, Journal of Political Economy 123 (2015), 66-122.

 The Paradox of Asset Pricing (Princeton: Princeton University Press, 2002; Paperback version appeared 2005; Asian version appeared 2007). Lecture Notes in Corporate Finance, with Bernt Arne Ødegaard (Singapore: World Scientific Publishing, 2001; Second, Revised Edition 2007).
 "Has the Cross-Section of Average Returns Always Been The Same? Evidence from Germany, 1881-1913," with Caroline Fohlin, Caltech Social Science Working Paper 1084: 2000.
 "Rational Expectations Equilibria When Priors are Inconsistent," 1998 – In preparation for submission to <i>Critical Finance Review</i>.
 "Arbitrage-Based Pricing When Volatility is Stochastic," with Eric Ghysels and Christian Gouriéroux, October 1997.
4. "Price Formation in Continuous Double Auctions, with Implications for Asset Pricing," with Elena Asparouhova and John Ledyard, 2018 (presented at 2009 SAET Conference, Ischia, Italy; presented at the Australian School of Business, University of New South Wales; revise-and-resubmit).
5. "Voting to ensure existence and Pareto-optimality of insurance and loan markets," with Michèle Itten (2009) (SURF project Summer 2011).
6. "The Role of Financial Markets in Mitigating Credit Market Bubbles," with Elena Asparouhova, Dan Lu and Anh Tran, 2017 (presented at the 2010 Conference in Experimental Finance, Gothenburg, Sweden, and the 2018 Asia-Pacific Conference of the Society for Experimental Finance, keynote presentation at the 2010 Conference in Experimental Economics and Finance, Xiamen, China, and presented at UCLA, the University of Technology Sydney and the University of Utah).
 "Tracking the Tangency Portfolio with Alpha," with Wenhao Yang, Yang Chen, Nitin Yadav and Carsten Murawski, 2017 (prepared for submission).
1. "Price Discovery in Financial Markets: The Case of the CAPM," with D. Kleiman, and C. Plott, in Charles R. Plott, <i>Collected papers on the Foundations of Experimental Economics and Political Science</i> : Information, Finance and General Equilibrium, vol. 3, Edwin Elgar Publishers, 2004.
 "Experiments With Financial Markets: Implications For Asset Pricing Theory," <i>The</i> <i>American Economist</i>, Spring 2001. Reprint in <i>Shifting Paradigms, New Directions in</i> <i>Economics</i>, Cambridge, UK: Cambridge University Press (2004).
3. "The CAPM in Thin Experimental Financial Markets," with Charles Plott, <i>Journal of Economic Dynamics and Control</i> 26 (2002), 1093-1112.
 "Inducing Liquidity in Thin Financial Markets Through Combined-Value Trading Mechanisms," with Leslie Fine and John Ledyard, <i>European Economic Review</i> 46 (2002), 1671-95.
 "Excess Demand and Equilibration In Multi-Security Financial Markets: The Empirical Evidence," with Elena Asparouhova and Charles Plott, <i>Journal of Financial Markets</i> 6 (2003), 1-22.
6. "Basic Principles of Asset Pricing Theory: Evidence From Large-Scale Experimental Financial Markets," with C. Plott, <i>Review of Finance</i> 8 (2004), 135-169.

7. "Asset Pricing," in Handbook of Experimental Economics Results, Charles R. Plott and





Vernon L. Smith, eds., Amsterdam: North-Holland (2008).

- 8. "From Market Jaws to the Newton Method: The Geometry of How a Market Can Solve Systems of Equations," with Charles R. Plott; in *Handbook of Experimental Economics Results*, Charles Plott and Vernon L. Smith, eds, Amsterdam: North-Holland (2008).
- 9. "Risk Aversion in Laboratory Asset Markets," with William Zame, in: *Risk Aversion in Experiments*, Ed. J. Cox and G. Harrison, Greenwich, CT: JAI Press, Research in Experimental Economics, (12), 2008.
- 10. "Promoting Intellectual Discovery: Patents vs. Markets," with Jernej Copic and Debrah Meloso, *Science*, 323 (2009), 1335-1339.
- 11. "The Experimental Study of Asset Pricing Theory," *Foundations and Trends in Finance* 3 (2009), 289-361.
- 12. "Excessive Volatility Is Also A Feature Of Individual Level Forecasts," with A. Nursimuli, *Journal of Behavioral Finance* 15 (2014), 16-29.
- 13. "The Speed of Information Revelation and Eventual Price Quality in Markets with Insiders," with Cary Frydman and John Ledyard, *Review of Finance* 18 (2014), 1-22.
- 14. "Lucas In The Laboratory," with Elena Asparouhova, Nilanjan Roy and William Zame, *Journal of Finance* 71 (2016) 2727-2780.
- 15. "Experiments on Percolation of Information in Dark Markets," with Elena Asparouhova, *The Economic Journal* 127 (2017) F518-F544.
- "Perception of Intentionality in Investor Attitudes towards Financial Risks," with S. Suzuki and J. O'Doherty, *Journal of Behavioral and Experimental Finance*, in press (<u>https://doi.org/10.1016/j.jbef.2017.12.011</u>).

Experimental Finance – Working Papers

- 1. "Prices and Allocations in Dynamically Complete Markets: Experimental Evidence," with Debrah Meloso and William Zame, 2013 (Caltech SURF project Summer 2011).
- 2. "Gauging Financial Market Participants' Awareness of Imperfect Foresight," with Debrah Meloso, Wenhao Yang and William Zame, 2015
- 3. "Costly Information Acquisition in Decentralized Markets: An Experiment," with Elena Asparouhova and Wenhao Yang, working paper, 2017 (Best paper award for Financial Markets & Institutions, 2017 Meetings of the Financial Management Association)
- "Is Academic Finance Really that Wrong?" 2017. Available at SSRN: <u>https://ssrn.com/abstract=3122143</u> (Transcript of keynote speech at 24^a CLSA Investors' Forum, Hong Kong,)
- "Information Aggregation under Varying Levels of Computational Complexity: Experiments," with E. Bowman, S. Huang, C. Murawski, S. Tang, N. Yadav, working paper, 2018 (under review)
- 6. "Humans in Charge of Algorithmic Trading: The First Experiment," with E. Asparouhova, T. Wang, N. Yadav and W. Yang (in preparation)
- 7. "Cognitive Biases in Group Investment Decision-Making: The Disposition Effect," with E. Wang (in preparation).
- 8. "Modeling Financial Market Participants' Awareness of Resale Price Forecast Mistakes," with Felix Fattinger, Frans van den Bogaerde and Wenhao Yang (in preparation).
- 9. "Building Financial Skills Training Schemes," with Petko Kalev, Kristian Rotaru and Nitin Yadav, 2018 (To be presented at the 2018 Miami Behavioral Finance conference).





Decision Neuroscience – Articles

- 1. "Neural Differentiation of Expected Reward and Risk in Human Subcortical Structures," with Kerstin Preuschoff and Steve Quartz, *Neuron* 51 (2006), 381-390.
- 2. "The Role of Ventromedial Prefrontal Cortex in Abstract State-Based Inference During Decision Making in Humans," with Alan Hampton and John O'Doherty, *The Journal of Neuroscience* 26 (2006), 8360-8367.
- 3. "Adding Prediction Risk to the Theory of Reward Learning," with Kerstin Preuschoff, *Annals of the New York Academy of Sciences* 1104 (2007), 135-146.
- 4. "Neural Antecedents of Financial Decisions," with B. Knutson, *Journal of Neuroscience* 27 (2007), 8174-8177.
- "Towards a Mechanistic Understanding of Human Decision Making: Contributions of Functional Neuroimaging," with J. O'Doherty, *Current Directions in Psychological Science* (Special Issue on The Interface Between Neuroscience and Psychological Science), 17 (2008).
- 6. "Human Insula Activation Reflects Risk Predictions Errors As Well As Risk," with Kerstin Preuschoff and Steve Quartz, *Journal of Neuroscience*, 28 (2008), 2745-2752.
- 7. "Markowitz in the Brain?" with Kerstin Preuschoff and Steve Quartz, *Revue d' Economie Politique* 2008, 75-96.
- "Investigating Signal Integration with Canonical Correlation Analysis of fMRI Brain Activation Data," with A. Bruguier, K. Preuschoff and S. Quartz, *NeuroImage* 41 (2008), 35-44.
- 9. "Neural Correlates of Mentalizing-Related Computations During Strategic Interactions in Humans," with A. Hampton and J. O'Doherty, *Proceedings of the National Academy of Sciences* 105 (2008), 6741-6746.
- "The Neurobiological Foundations of Valuation in Human Decision Making under Uncertainty," with Ming Hsu and K. Preuschoff, in: *Neuroeconomics: Decision Making and the Brain*, Ed. P.W. Glimcher, C.F. Camerer, E.Fehr, R.A. Poldrack, New York: Academic Press (2008).
- 11. "Neurobiological Studies of Risk Assessment: A Comparison of Expected Utility and Mean-Variance Approaches," with M. d'Acremont, *Journal of Cognitive, Affective and Behavioral Neuroscience* 8 (2008), 363-374.
- "Explicit Neural Signals Reflecting Reward Uncertainty," with W. Schultz, K. Preuschoff, C. Camerer, M. Hsu, C.D. Fiorillo, and P. Tobler, *Philosophical Transactions of the Royal Society B: Biological Sciences* 363 (2008), 3801-3811.
- 13. "Predicting Risk in a Multiple Stimulus Multiple Reward Environment," with Mathieu d'Acremont and Manfred Gilli, in: *Reward And Decision Making*, ed. J.C. Dreher and L. Tremblay, Academic Press (2009).
- "Encoding of marginal utility across time in the human brain," with A. Pine, B. Seymour, J. Roiser, K. Friston, H.V. Curran and Ray Dolan, *Journal of Neuroscience* 29 (2009), 9575-9581.
- 15. "Decision Making in Financial Markets," in: *Encyclopedia of Neuroscience*, Eds. L. Squire, T. Albright, F. Bloom, F. Gage and N. Spitzer, Elsevier (2009).
- 16. "Neural Correlates of Value, Risk and Risk Aversion Contributing to Decision Making under Risk," with G. Christopoulos, P. Tobler, R. Dolan and W. Schultz, *Journal of Neuroscience* 29 (2009), 12574-83.
- 17. "What Decision Neuroscience Teaches Us About Financial Decision Making," Annual Review of Financial Economics 1 (2009), 383-404. Reprinted in: Biological Economics,





Andrew W. Lo and Ruixun Zhang, eds., Edward Elgar, 2016.

- 18. "Exploring the Nature of Trading Intuition," with Antoine Bruguier and Steve Quartz, *Journal of Finance*, 65 (2010), 1703-23.
- 19. "Risk and Risk Prediction Error Signals in Anterior Insula," *Brain Structure and Function* 214 (2010) 645-653.
- 20. "A Behavioral and Neural Evaluation of Prospective Decision-Making under Risk," with Mkael Symmonds and Ray Dolan, *Journal of Neuroscience* 30 (2010), 14380-9.
- "Risk, Unexpected Uncertainty, and Estimation Uncertainty: Bayesian Learning in Unstable Settings," with Elise Payzan, *PLoS Computational Biology* 7 (2011), e1001048.
- 22. "MAOA-L carriers are better at making optimal financial decisions under risk," with Cary Frydman, Antonio Rangel and Colin Camerer, *Proceedings of The Royal Society B: Biological Sciences* 278 (2011), 2053-2059.
- 23. "The Impact of Disappointment in Decision Making: Inter-Individual Differences and Electrical Neuroimaging," with Hélène Tzieropoulos, Rolando Grave de Peralta and Sara L. Gonzalez, *Frontiers in Human Neuroscience* 4 (2011), 1-19.
- 24. "Positive temporal dependence of the biological clock implies hyperbolic discounting," with Debajyoti Ray, *Frontiers in Decision Neuroscience* 5 (2011); Reprinted in: The Neurobiology of Choice, Daeyeol Lee, Paul Glimcher, Julia Trommershäuser. Frontiers Media SA (Frontiers Research Topic Ebook), 2012.
- 25. "The Affective Impact of Financial Skewness on Neural Activity and Choice," with C. Wu and B. Knutson, *PLoS One* 6 (2011), e16838.
- 26. "Differentiable Contributions of Human Amygdalar Subregions in the Computations Underlying Reward and Avoidance Learning," with C. Prévost, J.A. McCabe, R.K. Jessup and J. O'Doherty, *European Journal of Neuroscience* 2011 (34), 1-12 (featured article).
- 27. "The human prefrontal cortex mediates integration of potential causes behind observed outcomes," with Klaus Wunderlich, Ulrik Beierholm and John O'Doherty, *Journal of Neurophysiology* 106 (2011), 1558-1569.
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Development of Instruments	1. <i>jMarkets</i> 1.0 (2005), 1.5 (2006), 2.0 (2008): Scientific project supervisor; jMarkets is a pure-Java, J2EE-compliant open-source software tool to run large-scale internet-based experiments with multiple interconnected markets (source and binary code published at <u>http://jmarkets.ssel.caltech.edu</u>); joint with Walter Yuan, Raj Advani and William Zame.
	 U.S. Patents 7,853,514 (Issued: 12/14/2010) and 8,386,370 (Issued: 2/26/2013): Method and Apparatus For Providing A Market Environment, with Walter Yuan and Raj Advani.
	3. <i>Flex-E-Markets</i> (2007-): Scientific project supervisor; "software-on-demand" tool for flexible and easy deployment of internet-based double-sided markets; Software as a Service; recipient of a Caltech Grubstake development grant; <u>www.flexemarkets.com</u>
	4. <i>DG</i> (2014-): Software suite for standalone, online and phone-based games in behavioral finance and neuroeconomics using the Unity platform (<u>uleef.business.utah.edu/games/</u>)
	 Algohost (2017-): Python Client and Server Software for Algorithmic Traders interfacing with Flex-E-Markets (<u>http://algohost.bmmlab.org/</u>)
PhD Advisees	• Past PhD students (first appointments in parentheses):
and Postdocs	 <i>Economics & Finance</i>: Kaoru Kato (McKinsey), Oleg Bondarenko (University of Illinois), Serena Guarnaschelli (McKinsey), Elena Asparouhova (University of Utah), Debrah Meloso (Bocconi University), Ming Hsu (UC Berkeley), Nilanjan Roy (City University of Hong Kong), Cary Frydman (USC), Wenhao Yang (University of Southern Carolina)
	 Decision Neuroscience: Kerstin Preuschoff (EPFL), Ulrik Beierholm (University of Birmingham), Antoine Bruguier (Google), Alan Hampton (McKinsey), Klaus Wunderlich (Ludwig Maximilians Universitaet Munich), Elise Payzan (University of New South Wales), Anjali Nursimulu (EPFL), Yutaka Kayaba (University of Tokyo)
	• Past Postdocs (some co-mentored; first subsequent appointment in parentheses):
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