# MATT TADDY

#### Microsoft

# **University of Chicago Booth School of Business**

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# PROFESSIONAL POSITIONS

Principal Researcher at Microsoft Research (MSR), 2016-Present Founder and leader of the MSR ALICE Project on Economic AI

Professor of Econometrics and Statistics, Chicago Booth, 2016-Present (on leave) Fellow of the Computation Institute, University of Chicago, 2014-Present (on leave)

Associate Professor, 2012-2016 Assistant Professor, 2008-2012

Research Fellow at eBay Inc., 2014-2016

# **EDUCATION**

Ph.D. Applied Mathematics and Statistics, June 2008

University of California Santa Cruz

Baskin School of Engineering Advisor: Athanasios Kottas

'Bayesian nonparametric analysis of conditional distributions and inference for Poisson processes'

M.S. Mathematical Statistics, June 2005. McGill University, Montréal Department of Mathematics and Statistics

Advisor: Russell Steele

'Variable selection for neural network treatment classification via parallel sampling'

B.A. Philosophy and Mathematics, June 2003

McGill University, Montréal

# **PUBLICATIONS**

- M. Gentzkow, B. Kelly, and M. Taddy (2017). Text as Data. NBER working paper 23276.
- J. Hartford, G. Lewis, K. Leyton-Brown, M. Taddy (2017). Counterfactual Prediction with Deep Instrumental Variables Networks. To appear in *ICML* 2017.
- S. Upadhyay, K. Chang, M. Taddy, A. Kalai, and J. Zou (2017). Beyond Bilingual: Multi-sense Word Embeddings using Multilingual Context. To appear in 2nd Workshop on representation learning for NLP.
- M. Wan, D. Wang, M. Goldman, M. Taddy, J. Rao, J. Liu, D. Lymberopoulos, and J. McAuley (2017). Modeling consumer preferences and price sensitivities from large-scale grocery shopping transaction logs. *Proceedings of WWW 2017*.
- M. Gentzkow, J. Shapiro, and M. Taddy (2016). Measuring polarization in high dimensional data. *NBER working paper 22423*.
- M. Taddy (2016). Comment: A regularization scheme on word occurrence rates that improves estimation and interpretation of topical content (Airoldi and Bischof). To appear in the *Journal of the American Statistical Association*.
- M. Kolar and M. Taddy (2016). Comment: Coauthorship and citation networks for statisticians (Ji and Jin). To appear in the *Annals of Applied Statistics*.
- M. Taddy (2016). One-step estimator paths for concave regularization. To appear in the *Journal of Computational and Graphical Statistics*.

- M. Taddy, M. Gardner, L. Chen, and D. Draper (2016). Nonparametric Bayesian analysis of heterogeneous treatment effects in digital experimentation. To appear in the *Journal of Business and Economic Statistics*.
- M. Taddy, C. Chen, J. Yun, and M. Wyle (2015). Bayesian and empirical Bayesian forests. Proceedings of the 32nd International Conference on Machine Learning (ICML 2015).
- M. Taddy (2015). Distributed Multinomial Regression. Annals of Applied Statistics 9, 1395–1414.
- M. Taddy (2015). Document classification by inversion of distributed language representations. Proceedings of the 53rd Meeting of the Association for Computational Linguistics (ACL 2015).
- R.G. Gramacy and M. Taddy and S. Tian. Hockey player performance via regularized logistic regression. To appear in the *Handbook of statistical methods for design and analysis in sports*, CRC press.
- M. Taddy (2013). Multinomial inverse regression for text analysis. *Journal of the American Statistical Association 108*, 755–770, with discussion.
- M. Taddy (2013). Rejoinder: Efficiency and structure in MNIR. *Journal of the American Statistical Association 108*.
- R.B. Gramacy and M. Taddy and S.M. Wild (2013). Variable selection and sensitivity analysis via dynamic trees with an application to computer code performance tuning. *Ann. of Applied Stat.* 7, 51–80.
- M. Taddy (2013). Measuring political sentiment on Twitter: Factor-optimal design for multinomial inverse regression. *Technometrics* 55, 415–425.
- R.B. Gramacy and S.T. Jensen and M. Taddy (2013). Estimating player contribution in hockey with regularized logistic regression. *Journal of Quantitative Analysis of Sports* 9, 97–111.
- M. Taddy and A. Kottas (2012). Mixture modeling for marked Poisson processes. *Bayesian Analysis* 7, 335–362.
- M. Taddy (2012). On estimation and selection for topic models. Proceedings of the 15th International Conference on Artificial Intelligence and Statistics (AISTATS 2012).
- M. Taddy, R.B. Gramacy and N.G. Polson (2011). Dynamic trees for learning and design. *Journal of the American Statistical Association 106*, 109–123.
- M. Taddy (2010). An auto-regressive mixture model for dynamic spatial Poisson processes: Application to tracking the intensity of violent crime. *Journal of the American Statistical Association* 105, 1403–1417.
- M. Taddy and A. Kottas (2010). A Bayesian nonparametric approach to inference for quantile regression. *Journal of Business and Economic Statistics* 28, 357–369.
- C.M. Carvalho, H.F. Lopes, N.G. Polson, and M. Taddy (2010). Particle learning for general mixtures. *Bayesian Analysis* 5, 709–740.
- H.K.H. Lee, M. Taddy, R.B. Gramacy, and G.A. Gray (2010). Designing and analyzing a circuit device experiment using treed Gaussian processes. *Handbook of Applied Bayesian Analysis, Chap.* 28, Oxford University Press.
- R.B. Gramacy and M. Taddy (2010). Categorical inputs, sensitivity analysis, optimization and importance tempering with tgp version 2, an R package for treed Gaussian process models. *Journal of Statistical Software 33*, Issue 6.
- H.K.H. Lee, M. Taddy, and G.A. Gray (2010). Selection of a representative sample. Journal of

Classification 27, 41-53.

M. Taddy, H.K.H. Lee, G.A. Gray, and J. Griffin (2009). Bayesian guidance for robust pattern search optimization. *Technometrics* 51, 389–401.

M. Taddy and A. Kottas (2009). Markov switching Dirichlet process mixture regression. *Bayesian Analysis* 4, 793–816.

M. Taddy, B. Sansó and H.K.H. Lee (2009). Fast inference for statistical inverse problems. *Inverse Problems* 25 085001.

R.D. Morris, A. Kottas, M. Taddy, R. Furfaro and B.D. Ganapol (2008). A statistical framework for the sensitivity analysis of radiative transfer models. *IEEE Transactions on Geoscience and Remote Sensing* 46, 4062–4074.

G.A. Gray, M. Martinez-Canales, M. Taddy, H.K.H. Lee, and R.B. Gramacy (2006). Enhancing parallel pattern search optimization with a Gaussian process oracle. *Proceedings of the 14th NECDC*.

#### **TEACHING**

#### CHICAGO BOOTH

Big Data 2011+ ('Data Mining' prior to 2014). Created the course, runs annually for 200 MBAs See the teaching page on my website for materials Applied Regression Analysis 2008-2010

2013 NBER ECONOMETRICS LECTURES

Two day course with V. Chernozukov, C. Hansen, M. Gentzkow, and J. Shapiro

TEACHING ASSISTANT at UCSC and McGill in mathematics, applied math, and statistics

# **SERVICE**

Associate Editor at JASA Applications and Case Studies, 2013+

Associate Editor at Statistica Sinica, 2014+

Associate Editor at Bayesian Analysis, 2013+

Co-organizer of the Microsoft Digital Economics Conference, 2016.

Academic Advisory Board member for the National Opinion Research Center (NORC), 2014+

Conference Co-chair, Kilts center conference on Marketing and Big Data at Chicago Booth, 2015+

Academic Board member for Research Computing at the University of Chicago, 2014-2016

Program Chair, ASA section on Statistical Learning and Data Mining, 2014-15

Scientific Comittee member, ISBA 2014

# FUNDING AND AWARDS

Emory Williams teaching award (chosen by students), Chicago Booth, 2016.

McKinsey teaching award (chosen by faculty), Chicago Booth, 2016.

Neubauer Family Faculty Fellow, University of Chicago, 2011-2013, 2014-2015

NSF Grant \$403,036 over two years, Division of Social and Economic Sciences, September 2016. Bilateral Bargaining through the Lens of Big Data, with Tadelis, Larsen, and Backus.

Fama-Miller Center Research Grant, 2011-2012

Analysis of Economic and Financial News, with B.T. Kelley and R.S.J. Koijen

Robert L. Graves Scholar, University of Chicago, 2010 - 2011

ISBA Savage Award Honorable Mention, 2010

For outstanding PhD dissertation contribution in applied Bayesian methodology

IBM Corporation Scholar, University of Chicago, 2009 - 2010

Research member of the NMFS Center for Stock Assessment Research, 2007 - 2008

Fonds Québécoise de la recherche sur la nature et les technologies, 2004

Graduate Student Researcher at

R Packages

Lawrence Livermore National Laboratory, 2007, advised by Herbie Lee and Bruno Sansó

NASA Ames, 2007, advised by Athanasios Kottas and Robin Morris

Sandia National Laboratories, 2006-2007, advised by Genetha Grey and Herbie Lee

Los Alamos National Laboratory, 2006, advised by Dave Higdon, Herbie Lee, and Bruno Sansó.

Montréal Jewish General Hospital and URGENCES-SANTÉ, 2004, RA advised by Alain Vandal.

Petro-Canada Olympic Torch scholarship for student athletes, 1999-2000

Canadian 18 & under national sailing champion, men's singlehanded dinghy (laser), 1999

#### SOFTWARE

distrom: Distributed multinomial regression

gamlr: Gamma lasso concave penalty regularization paths textir: Inverse regression for analysis of sentiment in text

maptpx: MAP estimation of latent topic models

dynaTree: Dynamic treed regression and classification, with R.B. Gramacy

Bmix: Sampling algorithms for stick-breaking mixtures

tgp: Nonlinear regression with treed Gaussian processes, with R.B. Gramacy

Contributor to the gensim python library for natural language processing.

# **SEMINARS**

**2016:** EC2 Meeting, Toulouse; WU Institute for Statistics and Mathematics, Vienna; CMStatistics, Seville; Harvard CS+Econ seminar; MIT/Harvard Econometrics colloquium; NYU Stern IOMS Department, NYC; NYU Text-as-data seminar, NYC; MSR Digital Economics Conference, NYC; Discussion and invited lecture at the Joint Statistical Meetings (JSM), Chicago IL; ISBA World Meeting, Sardinia; High Dimensional Data Analysis workshop, Fields Institute, Toronto; Bank of England/LBS workshop on fintech, London UK; Becker center, University of Chicago; MIT CSAIL, Cambridge MA; Hockey analytics conference, Simon Fraser University, Vancouver

2015: Columbia University Statistics Department, NYC; University of Illinois at Chicago, Information and Decision Sciences; Big Data workshop, Insper, São Paulo BR; University of Chicago Statistics Department; Duke Statistics, Durham NC; Introductory overview lecture at the Joint Statistical Meetings (JSM), Seattle WA; Applied Topology and Statistics workshop, University of Victoria.; Association for Computational Linguistics (ACL2015), Beijing CN; International Conference on Machine Learning (ICML2015), Lille FR; ISBA Bayesian nonparametrics meeting, Raleigh NC; Conference on economic applications of Big Data, Cambridge-INET, Cambridge UK; UC Santa Cruz, Dept of Applied Math & Stats, Santa Cruz CA; Centre de recherches mathematiques workshop, Montréal QC; UC Berkeley Law and Economics Seminar; Microsoft Research, Cambridge MA; eBay research, San Jose CA; UT Dallas Jindal School of Management

**2014:** eBay research, San Jose CA; Perspectives on HD data analysis, BIRS, Banff Canada; ISBA Big Data discussion panel, Cancun MX; University of Pennsylvania, Econ Dept, Philadelphia PA; Carnegie Mellon, School of Computer Science, Pittsburgh PA; Stanford, Institute for Research in Social Sciences, Stanford CA; Georgetown, McCourt School of Public Policy, Washington DC; 'Show and Tell' seminar series, UC Research Computing Center, Chicago IL

**2013:** International Chinese Statistics Association, Hong Kong.; University of Michigan Econ + PoliSci, Ann Arbor MI; Princeton Computer Science, Princeton NJ; eBay Research Labs, San Jose CA; NYU Stern, New York NY; INFORMS Technometrics invited session, Minneapolis MN.; JASA discussion session, JSM, Montréal QC; University of Washington Statistics, Seattle WA; WCBI University of Utah, Alta UT; INFORMS Computing Society Meeting, Santa Fe NM

**2012:** SAMSI Workshop on Digital Advertising, Durham NC; ISBA, Kyoto, Japan; WU Vienna University of Economics and Business, Austria; Department of Energy CoDA, Santa Fe NM; SBIES, UC Santa Cruz, CA

**2011:** UC Santa Cruz, Dept of Applied Math & Stats, Santa Cruz CA; Brigham Young University, Statistics Dept, Provo UT; Yeditepe Conference on Bayesian Learning, Istanbul Turkey; AMA Advanced Research Techniques Tutorial, Palm Springs CA; SBIES, Washington University, St Louis MO; University of Toronto Department of Economics; Milton Friedman Institute, University of Chicago

**2010:** Wharton Statistics, Philadelphia PA; ISBA, Alicante Spain; Cambridge University Statistics Laboratory, Cambridge UK; SBIES, University of Texas, Austin TX; Duke University Department of Statistical Sciences, Durham NC; Johannes Kepler University IFAS, Linz Austria; EBEB X, Rio de Janeiro Brazil

**2009:** INFORMS, San Diego CA; BISP6, Brixen Italy; Schloss Dagstuhl, Saarland Germany; SAMSI Sequential MC workshop, Durham NC

**2006-2008:** University of Chicago Graduate School of Business, Chicago IL; London School of Economics, London UK; RAND Corporation, Santa Monica CA; Lawrence Livermore National Laboratory, Livermoretad CA; ICCOPT-II, Hamilton ON; BISP5, Valencia Spain; SIAM-CSE, Costa Mesa CA; SAMSI Computer Experiments Workshop, Vancouver BC