$Curriculum \ Vitae$

Zoubin Ghahramani FRS

CONTACT DETAILS

Department:	Department of Engineering		
	University of Cambridge		
	Trumpington Street		
	Cambridge CB2 1PZ, UK		
Tel:	+44 (0)1223 748 531		
Email:	zoubin@eng.cam.ac.uk		
WWW:	http://learning.eng.cam.ac.uk/zoubin/		

PRINCIPAL APPOINTMENTS

- **Chief Scientist**, Mar 2017–present Uber
- **Professor of Information Engineering**, Jan 2006–present Department of Engineering, University of Cambridge, UK
- **Turing Fellow**, Mar 2017–present Alan Turing Institute for Data Science, London, UK
- **Deputy Academic Director**, Oct 2016–present Leverhulme Centre for the Future of Intelligence, UK
- Fellow, Oct 2009–present St John's College, Cambridge, UK

OTHER APPOINTMENTS

Adjunct Faculty, Jan 2006-present Gatsby Computational Neuroscience Unit, University College London, UK

EDUCATION

Ph.D. in Cognitive Neuroscience, 1995. Department of Brain and Cognitive Sciences Massachusetts Institute of Technology, USA

Dissertation: Computation and Psychophysics of Sensorimotor Integration Supervisors: Prof Michael I. Jordan (primary) and Prof Tomaso Poggio (secondary)

- B.A. summa cum laude in Cognitive Science, 1990 Minor in Mathematics. Phi Beta Kappa University of Pennsylvania, USA
- B.S.Eng. summa cum laude in Computer Science and Engineering, 1990 University of Pennsylvania, USA

PROFESSIONAL HISTORY

Uber AI Labs Cambridge University Liaison Director, Nov 2015-Feb 2017 Alan Turing Institute for Data Science, London, UK Co-Founder and Chief Scientific Officer, May 2015-Dec 2016 Geometric Intelligence (acquired by Uber in 2016), NYC, USA Visiting Professor June 2013 Wrocław University of Technology, Poland Associate Research Professor, Apr 2003–Jul 2012 School of Computer Science, Carnegie Mellon University, USA Adjunct Professor, 2007-2010 Department of Computer Science & Engineering, Pohang University of Science and Technology (POSTECH), South Korea Reader in Machine Learning, Oct 2003–Jan 2006 Gatsby Computational Neuroscience Unit, University College London, UK Honorary Lecturer, Sep 1998–Jan 2006 Department of Computer Science and Department of Psychology, University College London, UK Lecturer, Sep 1998–Sep 2003 Gatsby Computational Neuroscience Unit, University College London, UK Visiting Fellow, February, 2003, Computer Sciences Laboratory, Research School of Information Sciences and Engineering, Australian National University, Australia Visiting Associate Professor, Jan 2002–May 2002 Center for Automated Learning and Discovery, School of Computer Science, Carnegie Mellon University, USA Visiting Researcher, September, 1999, NTT Computer Science Labs, Kyoto, Japan Postdoctoral Fellow, Sep 1995–Sep 1998 Department of Computer Science, University of Toronto, Canada Research Assistant, Summer 1991 Learning Systems Group, Siemens Corporate Research, USA Senior Staff Technologist, Summer 1989, 1990 Artificial Intelligence and Information Science Research Group, Bell Communications Research, USA Research Assistant, 1987–1990 University of Pennsylvania, Language, Information, and Computation Lab, Philadelphia, PA, USA

EDITORIAL, CONFERENCE, AND PEER REVIEWING ACTIVITIES

Editorial Board Memberships:

Co-Director, Dec 2016-March 2017

IEEE Pattern Analysis and Machine Intelligence (PAMI),¹ Associate Editor 2005-2007

 $^1 \text{Ranked } \#1 \text{ among } 209 \text{ Electrical Engineering and } \#5 \text{ among } 347 \text{ Computer Science titles in } 2004 \text{ Journal Citation Report.}$

Associate Editor-in-Chief Cambridge Series in Statistical and Probabilistic Mathematics, Series Editor Foundations and Trends in Machine Learning, Editorial Board Member, Annals of Statistics, Associate Editor Journal of Machine Learning Research ² , Action Editor (2006-) Journal of Artificial Intelligence Research, Editorial Board Member, Springer Encylopedia of Machine Learning, Editorial Board Member, Machine Learning, ³ Editorial Board Member (2000-2001), re-joined as Editor Bayesian Analysis, Associate Editor Neural Computing Surveys	2007-2011 2009-present 2007-2010 2007-2011 2000-2011 2006-2009 2005-2010 2005-2011 2004-2010 1998-2006
Scientific Advisory Boards:	
Cambridge Computational Biology Insitute, Scientific Advisory Board,	2017-present
Invenia Labs, Technical Advisor,	2016-present
BridgeU, Advisor,	2016-present
Informetis, Technical Advisor,	2015-present
Cambridge Capital Management, Advisor,	2014-present
Tractable, Advisor,	2015-present
Swhere, Advisor,	2014-present
Entrepreneur First, Science Partner,	2015-present
NIPS Foundation, Board Member,	2015-present
Echobox, Advisor,	2014-present
VocalIQ (acquired by Apple), Advisor,	2014 - 2015
Opera Solutions Scientific Advisory Board,	2011 - 2015
Microsoft Research Cambridge, Technical Advisory Board,	2006-2014
Max-Planck Institute for Intelligent Systems, Stuttgart, Germany	2012-2017
INRIA Evaluation Board, Cognitive Systems, France	2007
Max-Planck Institute for Biological Cybernetics, Tübingen, Germany	2006-2010
Austrian Research Center Seibersdorf,	2005-2010
International Machine Learning Society, Board Member,	2006-2011

Conference and Workshop Co-organiser:

Sackler Forum (joint mtg of Royal Society and National Academy of Sciences), DC,	2017
Data, Inference and Learning (DALI), Tenerife	2017
NIPS Workshop on "AI for Data Science",	2016
NIPS Workshop on "Bayesian Deep Learning",	2016
Data, Inference and Learning (DALI), Sestri Levante	2016
Information, Inference and Learning Symposium, Cambridge	2016
ATI Scoping Workshop on Probabilistic Programming	2016
Artificial Intelligence and Machine Learning in Cambridge	2016
Workshop on Black Box methods for Bayesian Inference and Learning, NIPS, Montreal,	2015
Bayesian methods for networks, Newton Institute, 2016	
Data, Inference and Learning (DALI), La Palma	2015
General Chair, Neural Information Processing Systems, Montreal	2014
Workshop on Bayesian Optimisation, NIPS, Montreal	2014
Program Chair, Neural Information Processing Systems, Lake Tahoe, USA	2013
Scientific Committee, 9th Conference on Bayesian Nonparametrics Amsterdam	2013
Workshop on Copulas and Machine Learning, NIPS, Granada,	2011
General Chair, International Conference on Machine Learning, USA	2011
Workshop on Transfer learning by learning rich generative models, NIPS, Vancouver,	2010
Machine Learning Summer School, Cambridge	2009
Workshop on Nonparametric Bayes, NIPS, Vancouver	2009

 $^{^2 \}rm Ranked$ #2 among 347 Computer Science titles in the 2004 Journal Citation Report ³ Ranked #12 among 347 Computer Science titles in the 2004 Journal Citation Report

EPSRC Symposium on Information Extraction from Complex Data Sets, Warwick	2009
Workshop on Nonparametric Bayes, ICML/UAI/COLT, Helsinki, Finland	2008
Program Chair, International Conference on Machine Learning, Oregon, USA	2007
Open Problems in Gaussian Processes for Machine Learning Workshop, NIPS, Canada,	2005
Program Co-Chair, Intern. Work. on AI & Statistics (AISTATS), Barbados,	2005
Learning Theoretic and Bayesian Inductive Principles, London, UK,	2004
Unreal Data: Learning from Nonvectorial Data, NIPS, Whistler, BC, Canada,	2002
Inference and Learning in Graphical Models, NIPS, Breckenridge, CO, USA,	1997
Conference Program Committee Member:	
Case Studies in Bayesian Analysis and Machine Learning	2009
Workshop on Learning with Nonparametric Bayesian Methods, ICML	2006
Uncertainty in Artificial Intelligence (UAI):	
2001, 2002, 2003, 2005, Senior Programme Committee	2006
IEEE Conference on Computer Vision and Pattern Recognition (CVPR): Area Chair	2006
International Conference on Machine Learning (ICML):	
1998, 2000, Area Chair 2004, Area Chair 2005, 2006, Program Chair 2007, 2008, Area G	Chair
2012	
International Joint Conference on AI (IJCAI):	2005
Workshop on "Exploiting Unlabeled Data In Machine Learning and Data Mining", ICML: Neural Information Processing Systems (NIPS):	2003
Area Chair 1999, Area Chair 2000, Publications Chair 2001, Publicity Chair	2002
Artificial Intelligence and Statistics Conference: 2001,	
European Conference on Machine Learning, Instance Selection Workshop:	2001
American Association for Artificial Intelligence:	2000
Turkish Symposium on Artificial Intelligence and Neural Networks:	1996
Grants Reviewed for: U.S. National Science Foundation (Statistics; Circuits and Signal Pro	ocess-

- Grants Reviewed for: U.S. National Science Foundation (Statistics; Circuits and Signal Processing), Canadian Natural Sciences and Engineering Research Council (Computer Science), U.K. National Endowment for Science, Technology and the Arts, U.K. Engineering and Physical Sciences Research Council (Peer Review College Member). Israel–U.S.A. Binational Science Foundation. Mathematics of Information Technology and Complex Systems (Canada). ICTP Grants for Third World Scientific Meetings (UNESCO/Italy). Council of Physical Sciences of the Netherlands Organization for Scientific Research (NWO).
- Journal Articles Reviewed for: Bayesian Analysis, BMC Bioinformatics, Cognitive Science, Exp. Brain Res., IEEE Trans. Biomed. Eng., IEEE Trans. Comp. Biol. and Bioinformatics, IEEE Trans. on Evol. Comp., IEEE Trans. Pat. Anal. & Machine Intell., IEEE Trans. on Neural Networks, IEEE Trans. in Speech & Audio Proc., J. Artif. Intell. Res., Int. J. Pattern Recognition and Artificial Intelligence, Iranian J. of Elect. and Comp. Eng. J. Exp. Psychol: Human Percept. & Perform., J. Machine Learn. Res., Machine Learning, Nature, Nature Neuroscience, Neural Computation, Neural Networks, Neurocomputing, NeuroImage, Proceedings of the National Academy of Sciences, Psychometrika, VLSI Signal Proc. Sys.
- **Conference Papers Reviewed** for: Annual Conference of the Cognitive Science Society, Neural Information Processing Systems, International Conference on Artificial Neural Networks, International Joint Conference on Artificial Intelligence (outstanding reviewer award), Workshop on AI and Statistics (outstanding reviewer award).

Invited Participant:

Isaac Newton Institute for Mathematical Sciences, Statistical Theory and Methods for Complex, High-Dimensional Data Programme, 2008, Cambridge, UK Dagstuhl International Research Center for Computer Science, 2001, Wadern, Germany Dagstuhl International Research Center for Computer Science, 1999, Wadern, Germany Isaac Newton Institute for Mathematical Sciences, Neural Networks and Machine Learning Programme, 1997 Cambridge, UK

Consultancies:

FX Concepts, USA DataPath, USA Microsoft Research Cambridge, UK Glaxo-Wellcome Medicines Research Laboratories, UK NTT Computer Science Labs, JAPAN

PRIZES, AWARDS AND OTHER HONOURS

ICML 2017 Best Paper Honourable Mention to "Lost Relatives of the Gumbel Trick."

Top Ten Most Influential Scholars in Machine Learning (2016) https://aminer.org/mostinfluentialscholar/ml

Elected Fellow of the Royal Society, 2015

2015 NIPS Posner Lecture

2013 Google Focused Research Award

2013 ICML Classic Paper Prize for our paper from ICML 2003 on "Semi-supervised learning using gaussian fields and harmonic functions"

Best Student Paper Award, 27th Conference on Uncertainty in Artificial Intelligence (UAI) 2011

Best Paper Award, International Conference on Artificial Intelligence and Statistics, 2010

Best Paper Honorable Mention, International Conference on Machine Learning, 2009

Microsoft (2010, 2006) and Google (2008, 2013) Research Awards (see below under Grants)

Innovation Award for Excellence in Strategic Research. Ontario ITRC (with G. Hinton), 1996

McDonnell-Pew Fellowship, Massachusetts Institute of Technology, 1990–1995

Dean's Scholar Award, University of Pennsylvania, 1988

University Scholar, University of Pennsylvania, 1986

25th Anniversary Scholarship, American School of Madrid, 1986

GRANTS

- Samsung Electronics grant: "Probabilistic machine learning for device data analysis", 2017-2020 £ 1,366,528 (co PI)
- NTT Grant, for "Learning intrinsic structures from large-scale complex multi-modal data", 2017-2018, \pounds 30,000

Google Award: \$12,438 for "Tensor Flow Training at University of Cambridge"

ARM Research Fellowship in Machine Learning, 2016-2019, £ 390,000

NTT Grant, "Probabilistic generative models for latent structures", 2016-2017, £ 17,000

Facebook Unrestricted Award, 2016, \$100,000

Marie Slodowska Curie International Fellowship (PI, fellowship to Dr Francisco Rodriguez Ruiz) "Probabilistic modelling of electronic health records" €269,857.80

Leverhulme Centre for the Future of Intelligence (co-I), 2016-2021 £ 10,000,000

Microsoft Donation, 2015 £ 585,000

- EPSRC Grant EP/N014162/1 "Deep Probabilistic Models for Making Sense of Unstructured Data" , 2016-2019 \pounds 974,162 (co-I)
- Facebook Unrestricted Award, 2015, \$100,000
- Future of Life Institute award for "An Investigation of Self-Policing AI Agents" (co-investigator with Adrian Weller), 2015, \$50,000
- NTT grant "Learning Latent Structure" 2015 £ 17,000
- Facebook Unrestricted Award, 2014, \$100,000
- Amazon AWS in Education Research Grant Award, 2013, \$100,000.
- NTT "Probabilistic Generative Models for learning latent structure from large-scale and complex data", 2014-2015, £ 22,000
- Facebook Unrestricted Award, 2013, \$100,000
- Google Focused Research Award for the "Automated Statistician", 2013, \$750,000
- DARPA PPAML Venture "A general purpose probabilistic programming platform with efficient stochastic inference", 2013-2017, \$638, 488
- Google European Doctoral Fellowship in Machine Learning (2012) to Yarin Gal, £ 108,000
- EPSRC "Autonomous behaviour and learning in an uncertain world", 2012-2017, £ 849,033 (co-I)
- Microsoft Research Award "Learning to Answer Natural Language Database Queries", 2012, \$100,000
- Royal Society Newton International Fellowship to Novi Quadrianto, "Nonparametric Bayesian Statistics for the Internet: Models and Algorithms" 2012-2013, £ 99,000
- Royal Society Newton International Fellowship to Daniel Roy, "Probabilistic Programming and Random Data Structures: Theory and Algorithms" 2011-2013, £ 99,000
- Infosys "Machine Learning Models for Market Basket Analysis", 2011-2013, \$296,653
- EPSRC "Advanced Bayesian Computation for Cross-Disciplinary Research" (EP/I036575/1), 2011-2015, £ 1,158,512
- Google European Doctoral Fellowship (2010) "Advanced Machine Learning for Interactive Search", \pounds 75,000
- Microsoft Research Award (2010), "Probabilistic Knowledge Bases" \$ 129,580
- EPSRC "Advanced Algorithms for Neural Prosthetic Systems" (EP/H019472/1), 2010-2013, £ 398,050
- International Foreign Exchange Concepts, "Machine Learning Methods for High Frequency Foreign Exchange Trading", 2009-2012, £ 117,426.
- Google Research Award (2008), "Google-scale non-parametric Bayesian Machine Learning", \$ 85,000
- DataPath, "Probabilistic Models for Monitoring and Control of Distributed Systems", 2008-2011, £ 136,605 (\$ 281,407)
- Microsoft Research PhD Scholarship, "Machine learning models for large-scale systems and networks", 2008-2011, £ 66,000
- EPSRC "Managing the Data Explosion in Post-Genomic Biology with Fast Bayesian Computational Methods" (EP/F027400/1), 2008-2011, £ 257,455
- EPSRC "Graphical Models for Relational Data: New Challenges and Solutions" (EP/F026641/1), 2008-2009, £ 190,576

Cambridge-MIT Institute, "Machine Learning for Autonomous Robots" (2007), £ 4,000.

Microsoft Live Labs Research Award (2006), \$ 50,000.

Microsoft Research Gift (2006), \pounds 10,000.

- Gatsby Charitable Foundation: Neural Computation grant to G Hinton (Director), P Dayan, Z Li, and Z Ghahramani (1998-2008). About £10,000,000.
- U.S. DARPA Perceptive Agent that Learns (PAL) program, "Cognitive Agent that Learns and Organizes" (CALO). (2003-2008) Subcontract from SRI to CMU. \$250,000 so far in direct costs to my group at CMU.
- E.U. PASCAL Network of Excellence on "Pattern Analysis, Statistical Modeling and Computational Learning" (2003-2007) I coordinate the UCL site, which is one of 57 sites sharing euro 5,440,000 over 5 years.
- U.S. National Institute of Health (NIH), Machine Learning Techniques for Protein Fold and Remote Homology Recognition. 2002-2007. \$286,258 direct costs to UCL. Co-applicant.
- The Wellcome Trust, Modularity of Learning in Movement Control, 2000-2003. Research grant to support Alex Korenberg's PhD studentship £13,580.
- EPSRC Life Sciences Interface Network: Processing and representation of speech and complex sounds (one of 20 members, 1999-2002, £50,000, headed by Prof. Chris Darwin, Sussex)
- EU Marie Curie Training Site, Institute of Movement Neuroscience, 2000-2004 (one of 10 participants, 2000-2003, €240,000)

MEDIA COVERAGE

- 1997 Canadian Businees Technology "Building a Better Brain" http://mlg.eng.cam.ac.uk/zoubin/misc/cover2.jpg
- 2014 BBC Radio 4 interview on "Deep Learning" http://www.bbc.co.uk/programmes/p01nph8t
- 2014 Delo (in Slovenian) "Zoubin Ghahramani: Podatki so naravnost eksplodirali" http://www.delo.si/znanje/znanost/h napredek-znanstvenih-spoznanj-z-novimi-orodji.html
- 2014 10 Machine Learning Experts you Need to Know (2014) http://dataconomy.com/2014/09/10-machinelearning-experts-you-need-to-know/
- 2015 MIT Technology Review "Automating the Data Scientists" http://www.technologyreview.com/news/535041/autom the-data-scientists/
- 2015 Significance, Royal Statistical Society (Feb 2015) "The Automatic Statistician" and "How machines learned to think statistically" http://onlinelibrary.wiley.com/doi/10.1111/j.1740-9713.2015.00796.x/abstract
- 2015 BBC Radio 4 Inside Science http://www.bbc.co.uk/programmes/b053bxy1
- 2015 BBC World Service, The Forum on "Deep Learning" (45 minutes) http://www.bbc.co.uk/programmes/p02kmqt1#auto
- 2015 Talking Machines Podcast, http://www.thetalkingmachines.com/
- 2016 The Times, Jan 1, 2016, "March of machines to save the world"
- 2016 BBC1 TV evening news, Jan 27, 2016 "Google achieves AI 'breakthrough' by beating Go champion" http://www.bbc.co.uk/news/technology-35420579
- 2016 BBC Radio Cambridgeshire Breakfast Show, Jan 28, 2016 http://www.bbc.co.uk/programmes/p03f8hz9#play
- 2016 The Register, Sept 21, 2016 http://www.theregister.co.uk/2016/09/21/ai_skepticism_analysis/

- 2016 Nature, News feature "Can we open the black box of AI?" Oct 5, 2016 http://www.nature.com/news/can-we-open-the-black-box-of-ai-1.20731
- 2016 Cambridge Research Horizons "Computer Says YES (but is it right?)" http://www.cam.ac.uk/research/features/ar intelligence-computer-says-yes-but-is-it-right
- 2016 BBC World Service, The Forum on "Do we need Artificial Intelligence?" (40 minutes) http://www.bbc.co.uk/programmes/p04c7kdx
- 2016 Coverage of Uber acquisition of Geometric Intelligence, a company I co-founded, and of the formation of Uber AI Labs, a unit I co-Direct.
 - New York Times: Uber Bets on Artificial Intelligence With Acquisition and New Lab http://www.nytimes.com/2016/12/05/technology/uber-bets-on-artificial-intelligence-with-acquisitionand-new-lab.html
 - Wall Street Journal: Uber in Artificial-Intelligence Drive After Buying Startup http://www.wsj.com/articles/uber-in-artificial-intelligence-drive-after-buying-startup-1480942804
 - WIRED: Uber Buys a Mysterious Startup to Make Itself an AI Company https://www.wired.com/2016/12/uber-buys-mysterious-startup-make-ai-company/
 - MIT Tech Review: Uber Launches an AI Lab https://www.technologyreview.com/s/603016/uber-launches-an-ai-lab/
 - BBC: Uber launches artificial intelligence lab http://www.bbc.com/news/technology-38207291
 - Bloomberg: Uber Creates AI Lab, Buying Startup Geometric Intelligence https://www.bloomberg.com/news/articles/2016-12-05/uber-creates-ai-lab-buying-startup-geometricintelligence
 - Also: VentureBeat: Uber acqui-hires Geometric Intelligence to launch its own inhouse AI lab TechPortal: Uber acquires Geometric Intelligence, creates Uber AI research labs TechCrunch: Uber acquires Geometric Intelligence to create an AI lab The Verge: Uber launches its own AI lab to make food deliveries faster and self-driving cars better
 Quartz: Ubers new AI team is looking for the shortest route to self-driving cars Buzzfeed: Uber just bought an AI startup to make its self-driving cars smarter
 Fortune: Uber just bought a startup youve never heard of. Heres why thats important. Business Insider: Uber just bought a startup to help launch the companys first artificial intelligence lab
 Engadget: Uber creates an AI lab to help fuel its self-driving dreams
 Tech Republic: With the launch of Uber AI Labs, ride-sharing giant aims to expand AI research beyond autonomous cars
 ZDNet: Uber snaps up AI startup Geometric Intelligence, forms Uber AI Labs
 Agence France-Presse: Uber steps up efforts on artificial intelligence
 - Wired: AI Is About to Learn More Like Humanswith a Little Uncertainty. 2017 https://www.wired.com/20 learn-like-humans-little-uncertainty/
 - Appointment as Uber's Chief Scientist: https://newsroom.uber.com/announcing-zoubin-ghahramanias-ubers-chief-scientist/ http://fortune.com/2017/03/16/uber-chief-scientist/ http://uk.businessinsider.com/uber-hires-cambridge-artificial-intelligence-guru-zoubin-ghahramanichief-scientist-2017-3 https://venturebeat.com/2017/03/15/uber-appoints-zoubin-ghahramani-as-chief-scientist-3-monthsafter-acquiring-his-startup-geometric-intelligence/
 - Wired: 2017 Stars of Tomorrow http://www.wired.co.uk/article/wireds-2017-smart-list?mc_cid=f6e184479

INVITED TALKS (1996-)

2017

Founders Forum, London 2017
Microsoft AI Summer School (keynote), Cambridge
China Executive Leadership Programme, Cambridge
Entrepreneur Fellows Programme, Tsinghua University - Cambridge
Amazon Machine Learning Conference (keynote), Seattle, 2017
SIAM-IMA Annual Cambridge Conference (plenary), Cambridge 2017
BT, Adastral Park, 2017
Uber Machine Learning Conference (joint keynote), San Francisco, 2017
Advances in Data Science, Manchester, 2017
Institute of Geophysics, Polish Academy of Sciences, Warsaw 2017
Ørsted Lecture, Technical University of Denmark
Strachey Lecture, Distinguished Lecture in Computer Science, Oxford University, UK
Sackler Forum, Joint meeting of US National Academy of Sciences and the Royal Society, Washington DC

2016

NIPS Royal Society Workshop, People and Machines, Barcelona, SPAIN Keynote, Bayesian Deep Learning Workshop, NIPS, Barcelona, SPAIN Alan Turing Institute, London UK Cantab Capital, Cambridge UK Keynote, Goldman Sachs Inaugural Quant Conference, London, UK Google Tech Talk, Zürich, SWITZERLAND London Machine Learning Meetup, London, UK Keynote, European Conference on Machine Learning (ECML-PKDD), ITALY Computing in Data Science, Royal Statistical Society Annual Conference, Manchester, UK Keynote, 2016 IEEE Statistical Signal Processing Workshop, Mallorca, SPAIN Cambridge Science Festival, Intelligence and learning in brains and machines, Cambridge UK Invited Talk, ARM, Cambridge UK

2015Posner Lecture (invited plenary), NIPS Conference, CANADA CSML Workshop: Autonomous citizens: algorithms for tomorrow's society, Warwick, UK The St John's Lecture, University of Hull, UK Adaptive Brains and Machines Workshop, Cambridge UK Machine Learning Summer School, Tübingen, GERMANY Bayesian Inference for Big Data, Oxford, UK Signal Processing with Adaptive Sparse Structured Representations Conference, UK Royal Statistical Society, "Statistics and Data Science: closing the gap", London UK Royal Society Meeting, "Breakthrough Science and Technology: Transforming our Future Meeting on Machine Learning", London, UK Probabilistic Numerics Workshop, DALI Conference, SPAIN Advances in Distributional Semantics Workshop, London, UK Paris Machine Learning Meetup (remote talk), Paris, FRANCE Babbage Lecture, Computer Lab, Cambridge UK The Vocabulary of Big Data, Cambridge, UK Intelligent Machines Meeting (keynote), Nijmegen, NETHERLANDS Amazon Berlin, GERMANY

2014 Workshop on Deep Probabilistic Models, Sheffield, UK

Oxford-Warwick Statistics Programme, Warwick, UK Cambridge Centre for Risk Studies 5th Risk Summit The Pulse of Risk: From Big Data to Business Value, UK Cambridge Networks Day, UK UCL-Duke Workshop on Sensing and Analysis of High-Dimensional Data, London, UK Discovery Science and Algorithmic Learning Theory (ALT) (joint-keynote), Bled, Slovenia Isaac Newton Institute, Workshop on Statistical Changepoint Modelling, UK Imperial College, Department of Computing (tutorial lectures), UK

2013 NIPS workshop on 'Probabilistic Models for Big Data', Lake Tahoe, USA Isaac Newton Institute, Workshop on Computerised Trading at Low and High Frequency, UK Workshop on Big Data, Imperial College, London, UK Machine Learning Summer School, Tübingen, GERMANY NCAF Meeting, Oxford, UK Wrocław University of Technology (5 lectures), POLAND Bayesian Nonparametrics Conference, Amsterdam, NETHERLANDS Dept of Statistics, UCL, UK Gatsby Unit, UCL, UK Dept of Statistics, Oxford University, UK Mysore Park Workshop on Understanding Big Data Analytics (keynote), Infosys Mysore INDIA Xerox Research Centre India (Distinguished Lecture), Bangalore, INDIA

2012 ETH Zürich, SWITZERLAND

Google Zürich, SWITZERLAND NIPS Workshop on Modern Nonparametric Methods in Machine Learning, Lake Tahoe USA NIPS Workshop on Social Networks and Social Media, Lake Tahoe, USA Facebook Faculty Summit, USA Department of Computer Science, Stanford University, USA Harvard University 2012 Spring Research Conference (keynote), USA Winton Capital Management, Oxford, UK Max Planck Institute for Intelligent Systems, GERMANY Department of Computing, Imperial College, UK Robotics Systems and Science (keynote), Sydney, AUSTRALIA Leeds Annual Statistics Research Workshop, UK Toyota Technological Institute, Chicago, USA **AISTATS** Conference Tutorial, Canary Islands, SPAIN Machine Learning Summer School, Canary Islands, SPAIN Royal Society Meeting on Signal Processing and Inference in the Physical Sciences, UK MIT Computer Science and AI Lab, USA MIT LIDS Student Conference (keynote), USA Centre for Reasoning, University of Kent, UK

2011 Infosys Lectures (4 lectures, webcast to IIT Madras), Bangalore, INDIA
 Dept of Computer Science, Sheffield, UK
 Xerox Research Centre Europe, Grenoble, FRANCE
 CSML Seminar, University College London, UK
 Trinity College Mathematical Society, Cambridge, UK
 Opera Solutions, San Diego, CA, USA

Bayes 250 Conference, Edinburgh, UK NIPS Workshop on Preference Learning, Granada, SPAIN NIPS Workshop on "Bayesian nonparametrics. Hope or hype?", Granada, SPAIN Machine Learning Summer School, SINGAPORE Microsoft Software Summit, Paris, FRANCE Dept of Informatics, University of Edinburgh, UK Opera Solutions, London, UK

2010 Machine Learning for Signal Processing (plenary), Kittila, FINLAND NIPS Sam Roweis Symposium, Vancouver, CANADA
Dept of Computing, Distinguished Seminar, Imperial College London, UK
NIPS Workshop on Transfer Learning Via Rich Generative Models, CANADA
European Research Network on System Identification, Cambridge UK
EURANDOM Workshop on Bayesian Nonparametric Statistics (3 lectures), NETHERLANDS
International Conference on Machine Learning and Applications (keynote), Washington DC, USA
Dept of Computer Science, University of York, UK
Dept of Engineering, Oxford University, UK
Cancer Research UK, Cambridge, UK
CEU 2010 Summer School: Beliefs and Decisions of Mind and Machines, HUNGARY
Fourteenth Conference on Computational Natural Language Learning, Uppsala, SWEDEN
ISBA Valencia Meeting, (invited discussant), SPAIN

2009 INSPIRE 2009 Conference on Statistics and Signal Processing, Imperial College London, (plenary speaker), UK
 Unilever Centre for Molecular Informatics, Dept of Chemistry, Cambridge University, UK
 Causality Group, Statistical Laboratory, Cambridge University, UK
 Bayesian Nonparametrics Workshop, Turin, ITALY
 International Computer Vision Summer School, Sicily, ITALY
 Deep Learning Workshop, Gatsby Unit, UK

2008 Dept of Statistics, Harvard University, USA Dept of Electrical Engineering and Computer Science, MIT, USA Dept of Electrical and Computer Engineering, Northeastern University, USA Dept of Computing, Imperial College, UK Learning and Inference in Computational Systems Biology Workshop, Warwick, UK Inference and Estimation in Probabilistic Time-Series Models, Isaac Newton Institute, UK European Conference on Artificial Intelligence (keynote), GREECE Dept of Computer Science, ETH Zürich, SWITZERLAND Radboud University of Nijmegen, NETHERLANDS Dept of Computer Science, University of Toronto, CANADA AT&T Shannon Labs, USA Dept of Computer Science, Princeton University, USA Yahoo! New York, USA Dept of Computer Science (Distinguished Speaker), Columbia University, USA 2008 EPSRC Winter School: Mathematics For Data Modelling, Sheffield University, UK Isaac Newton Institute for Mathematical Sciences, Cambridge, UK Horizon Meeting, Thinking Machine? University of Cambridge, UK Machine Learning, Carnegie Mellon University, USA

2007	Department of Computer Science, Brown University, USA
	Royal Bank of Scotland, London, UK
	Machine Learning Summer School, Tübingen, Germany
	IPAM Summer School, Probabilistic Models of Cognition, Los Angeles, USA
	Department of Statistics, University of Leeds, UK
	Department of Computing Science, University of Glasgow, UK
	Department of Engineering Mathematics, University of Bristol, UK
	Cambridge Statistics Discussion Group, University of Cambridge, UK
	Cambridge Statistics Discussion Group, Chrycholog of Cambridge, Chr
2006	Statistical Laboratory, University of Cambridge, UK
2000	
	Yahoo! Inc, New York, USA
	Institute of Mathematical Statistics Annual Meeting, Graphical Models Workshop, Rio, BRAZIL
	Merrill Lynch, London, UK
	MRC Cognition and Brain Sciences Unit, Cambridge, UK
	Cambridge Computational Biology Annual Symposium, Cambridge, UK
	Newton Institute Workshop, Recent Advances in Monte Carlo Based Inference, Cambridge, UK
	Bayesian Inference in Complex Stochastic Systems, Warwick, UK
	CVPR Area Chair Meeting, New York University, USA
	MaxEnt: Int. Workshop on Bayesian Inference and Maximum Entropy Methods, Paris, FRANCE
	Valencia 8: the Eighth Valencia International Meeting on Bayesian Statistics, SPAIN
	Engineering Department, Oxford University, UK
	Institute for Communicating and Collaborative Systems, University of Edinburgh, UK
2005	D E Shaw & Co, New York, USA
	Empirical Inference Group, Max Planck Institute for Biological Cybernetics, GERMANY
	Gaussian Process Round Table, Sheffield, UK
	Machine Learning Summer School, TTI, Chicago, USA
	Joint Symposium on Computational Intelligence, Jeju Island, KOREA
	Pohang University of Science and Technology (POSTECH), KOREA
	Korea Advanced Institute of Science and Technology (KAIST), KOREA,
	Engineering Department, University of Cambridge, UK
	ICML Workshop on Learning with Partially Classified Training Data, GERMANY
	ICML Workshop on Learning with Fartiany Classified Training Data, GERMANT
2004	Workshop on Kernels and Graphical Models, NIPS Conference, CANADA
	Workshop on Structured Data and Representations in Probabilistic Models for Categorization,
	NIPS Conference, CANADA
	Department of Mathematics and Statistics, University of Lancaster, UK
	Natural Computation Group, Dept Computer Science, University of Birmingham, UK
	Department of Biophysics, SNN Group, University of Nijmegen, NETHERLANDS
	Machine Learning Workshop, University of Sheffield, UK
	Learning 2004 Conference, Elx, SPAIN
	Neural Networks and Disordered Systems Group, Math Dept, Kings College London, UK
	Dept of Computing, Computational Bioinformatics Laboratory, Imperial College, London, UK
	Dept of Statistics, University of Kent, Canterbury, UK
	Image, Speech and Intelligent Systems (ISIS) Research Group, Univ of Southampton, UK
	Interdisciplinary Programme for Cellular Regulation, Statistics Department, University of War-
	wick, UK
	widt, Oit

Machine Learning in Bioinformatics Conference, (invited speaker) Brussels, BELGIUM

Empirical Inference Group, Max Planck Institute for Biological Cybernetics, GERMANY Annual Meeting of the Society for Mathematical Psychology, (invited speaker) Ogden, UT, USA Computational Sensorimotor Control Meeting, Grasse, FRANCE International Workshop on AI and Statistics (invited speaker), Florida, USA Workshop on Graph Partitioning in Vision and Machine Learning, Pittsburgh, PA, USA Spanish Pattern Recognition Network Meeting, Mallorca, SPAIN Department of Computer Science, Royal Holloway, University of London, UK Inference Group, Cavendish Laboratories, Cambridge University, UK

2002 Workshop on Modelling of Nonlinear Dynamic Systems (keynote speaker). Kildare, IRELAND Workshop on Neural Networks for Signal Processing (keynote speaker), SWITZERLAND Neural Computing Applications Forum, Sheffield, UK Department of Electrical Engineering and Computer Science, UC Berkeley, USA Department of Statistics, Carnegie Mellon University, USA Center for Neural Basis of Cognition, Carnegie Mellon University, USA Robotics Institute Retreat, Carnegie Mellon University, USA WhizBang! Research Labs, USA

 2001 International Research Center for Computer Science, Schloss Dagstuhl, GERMANY Microsoft Research, Cambridge UK
 Department of Computer Science, University of Essex, UK
 School of Cognitive and Computing Sciences, University of Sussex, UK

2000 Department of Computer Science, Carnegie Mellon University, USA
Workshop on Real-Time Modeling for Complex Learning Tasks, NIPS Conference, USA
Department of Computer Science, Technical University of Helsinki, FINLAND
Institute for Communicating and Collaborative Systems, University of Edinburgh, UK
Department of Engineering, University of Cambridge, UK
Instituto Superior Tecnico, Lisbon, PORTUGAL
20/20 Speech, Great Malvern, UK
NeuroCOLT Meeting on New Perspectives in the Theory of Neural Nets, Graz, AUSTRIA
Dept. of Experimental Math. and Stat., Vienna Univ. of Econ. and Bus. Admin., AUSTRIA
Neural Control of Movement, Computational Satellite Meeting, Key West, FL, USA
Department of Mathematical Sciences, University of Durham, UK
Institute for Adaptive and Neural Computation, University of Edinburgh, UK

 1999 Department of Statistical Science, University College London, UK Workshop on Advanced Mean Field Methods, NIPS Conference, Breckenridge, USA Department of Experimental Psychology, University of Sussex, UK ATR Human Information Processing Research Laboratories, Kyoto, JAPAN NTT Computer Science Laboratory, Kyoto, JAPAN
 Neural Networks Session, Meeting of the International Statistical Institute, Helsinki, FINLAND International Research Center for Computer Science, Schloss Dagstuhl, GERMANY
 Department of Mathematical Modelling, Technical University of Denmark, DENMARK
 PhD Course on Computational Issues in Motor Control, Aalborg University, DENMARK

Workshop on Statistical Theories of Cortical Function, NIPS Conference, Breckenridge, USA
 Workshop on Sequential Inference and Learning, NIPS Conference, Breckenridge, USA
 Workshop on Learning Relational Data Representations, NIPS Conference, Breckenridge, USA

Neural Systems Group, Imperial College, London, UK Beckman Institute, University of Illinois, IL, USA Department of Electrical and Computer Engineering, McMaster University. Hamilton, CANADA

Isaac Newton Institute for Mathematical Sciences, Cambridge, UK
 Department of Psychology, York University, Toronto, CANADA
 Annual Meeting of the Canadian Applied Math Society, Fields Institute, Toronto, CANADA
 Department of Biomedical Engineering, Johns Hopkins University, Baltimore, MD, USA
 Machine Learning and Information Retrieval, AT&T Labs – Research, Murray Hill, NJ, USA
 Workshop on Autoencoders/Autoassociators. NIPS Conference. Breckenridge, CO, USA
 Workshop on Learning Dynamical Data Structures, NIPS Conference. Breckenridge, CO, USA
 Bioinformatics Group, Glaxo-Wellcome Medicines Research. Stevenage, UK

1996 Department of Electrical and Computer Engineering, McMaster University. Hamilton, CANADA AAAI Spring Symposium on Learning Dynamical Systems. Stanford, CA, USA Department of Neurophysiology, Institute of Neurology. London, UK Department of Computer Science & Applied Mathematics. Aston University. Birmingham, UK Speech, Vision & Robotics Group. Department of Engineering. Cambridge University, UK Department of Brain and Cognitive Sciences. University of Rochester. Rochester, NY, USA Department of Electrical and Computer Engineering. University of Waterloo, CANADA

ACADEMIC SUPERVISION

		Postdoctoral Fellows	
Name	Dates	Present Position	My role
Emanuel Todorov	1999-2001	Associate Professor, Univ Washington	supervisor
Hagai Attias	1998 - 1999	Chairman, Golden Metallic Inc	co-supervisor
Sam Roweis	1999-2001	Associate Professor, NYU	co-supervisor
Carl E Rasmussen	2000-2002	Professor, Univ of Cambridge	co-supervisor
Fernando de la Torre	2002	Research Associate Professor, CMU	supervisor
Mark Andrews	2002 - 2004	Research Fellow, UCL	co-supervisor
Jasvinder Kandola	2003-2004	Merrill Lynch	supervisor
Chu Wei	2003-2005	Yahoo! Labs	supervisor
Fernando Perez-Cruz	2003-2006	Dept Chair, Univ Carlos III, Spain, now at Amazon	supervisor
Ricardo Silva	2005-2007	Lecturer in Statistics, UCL	supervisor
Karsten Borgwardt	2007-2008	Associate Professor, ETH Zürich	supervisor
Mikkel Schmidt	2008-2009	Postdoctoral Researcher, TU Denmark	supervisor
Katherine Heller	2008-2010	Assistant Professor, Duke Univ	sponsor
Simon Lacoste-Julien	2008-2011	INRIA/CNRS/ENS, Paris	supervisor
Sinead Williamson	2011	Assistant Professor, UT Austin	supervisor
Peter Orbanz	2008-2012	Assistant Professor, Columbia University	supervisor
John Cunningham	2010-2011	Assistant Professor, Columbia University	supervisor
Richard Turner	2010-2012	Lecturer, University of Cambridge	sponsor
Dan Roy	2011-2014	Assistant Professor, University of Toronto	sponsor
Jose Miguel Hernandez Lobato	2011-2014	Postdoc, Harvard Univ	supervisor
Novi Quadrianto	2012-2014	Lecturer, University of Sussex	supervisor
Sara Wade	2012-2015	Assistant Professor, U of Warwick	supervisor
Yutian Chen	2013-2015	Google DeepMind	supervisor
Christian Steinruecken	2012-	<u> </u>	supervisor
Jes Frellsen	2013-		supervisor
Matthew W. Hoffman	2013-2015	Google DeepMind	co-supervisor
Adrian Weller	2015-		supervisor
Maria Lomeli	2016-		supervisor
Yarin Gal	2016-		sponsor (research
Alexander Matthews	2016-		supervisor
Amar Shah	2016-		supervisor
Hong Ge	2016-		supervisor
Francisco J. Rodríguez Ruiz	2016-		co-supervisor

NameDatesDegreePresent PositionMatthew J Beal1998-2003PhDQuantitative Researcher, CitadelAlexander T Korenberg1998-2003PhDKilburn & Strode Patent AttorneysHyun-Chul Kim2002-2003PhD (visiting)Research Fellow, University of SurreyEric Tuttle2001-2003MPhilStanford Law SchoolEd Snelson2002-2007PhDMicrosoft Research CambridgeIain A Murray2002-2007PhDLecturer, University of EdinburghKatherine A Heller2003-2008PhDPostdoc, MIT, now Asst Prof, DukeArik Azran2005-2008PhDSandy KlemmSandy Klemm2007-2008MPhilPhD student, MITFinale Doshi-Velez2007-2009MPhilAsst Prof, Computer Science, HarvardPedro Ortega2006-2011PhDCIFAR Fellow, UBC, now at Deepmind (bought by GooglSinead Williamson2006-2011PhDPost, CMU, now Asst Prof, UT AustinJurgen Van Gael2007-2014PhDData Science Director, Rangespan, (bought by Google)Frederik Eaton2006-2011PhDElasticsearchDavid Knowles2008-2012PhDPostdoc, Stanford
Alexander T Korenberg1998-2003PhDKilburn & Strode Patent AttorneysHyun-Chul Kim2002-2003PhD (visiting)Research Fellow, University of SurreyEric Tuttle2001-2003MPhilStanford Law SchoolEd Snelson2002-2007PhDMicrosoft Research CambridgeIain A Murray2002-2007PhDLecturer, University of EdinburghKatherine A Heller2003-2008PhDPostdoc, MIT, now Asst Prof, DukeArik Azran2005-2008PhDPhDSandy Klemm2007-2008MPhilPhD student, MITFinale Doshi-Velez2007-2009MPhilAsst Prof, Computer Science, HarvardPedro Ortega2006-2011PhDCIFAR Fellow, UBC, now at Deepmind (bought by Google)Sinead Williamson2006-2011PhDPost, CMU, now Asst Prof, UT AustinJurgen Van Gael2007-2011PhDData Science Director, Rangespan, (bought by Google)Frederik Eaton2006-2011PhDElasticsearchAlex Ksikes2007-2014PhDElasticsearchDavid Knowles2008-2012PhDPostdoc, Stanford
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Frederik Eaton2006-2011PhDAlex Ksikes2007-2014PhDElasticsearchDavid Knowles2008-2012PhDPostdoc, Stanford
Alex Ksikes2007-2014PhDElasticsearchDavid Knowles2008-2012PhDPostdoc, Stanford
David Knowles 2008-2012 PhD Postdoc, Stanford
Sebastien Bratieres 2009- PhD
Yue Wu 2009-2014 PhD
Andrew Wilson 2009-2014 PhD Postdoc, CMU
Alex Davies 2010-2014 PhD
Neil Houlsby 2010-2014 PhD Google Zürich
Konstantina Palla 2010-2014 PhD Postdoc, Oxford
James Lloyd 2011-2015 PhD Qleasite
Creighton Heaukulani 2011-2015 PhD Goldman Sachs
Hong Ge 2011-2015 PhD Postdoc, Cambridge
Colorado Reed 2012-2013 MPhil PhD student, UC Berkeley
Amar Shah 2012- PhD
Alex Matthews 2012- PhD
Yarin Gal 2012- PhD
Karolina Dziugaite 2012- PhD
Maxim Rabinovich 2013-2014 MPhil PhD student, UC Berkeley
David Lopez-Paz 2013-2016 PhD Facebook AI Research
Nilesh Tripuraneni 2014-2016 MPhil PhD student, UC Berkeley
Adam Ścibior 2014- PhD
Matej Balog 2015- PhD
Dave Janz 2016- PhD
John Bradshaw 2016- PhD

Secondary Supervisor					
Name	Dates	Degree	Department	University	
Antonia Hamilton	2000	PhD	Neurophysiology	Inst of Neurology, UCL	
Philipp Vetter	2001	PhD	Neurophysiology	Inst of Neurology, UCL	
Xiaojin Zhu	2005	PhD	Computer Science	Carnegie Mellon University	
Rong Jin	2002	MSc	Computer Science	Carnegie Mellon University	
Yaron Rachlin	2002	MSc	Computer Science	Carnegie Mellon University	
Ruslan Salakhutdinov	2003	MSc	Computer Science	University of Toronto	
Andreas Argyriou	2008	PhD	Computer Science	UCL	
JaeMo Sung	2008	PhD	Computer Science	POSTECH, Korea	

Primary MSc Thesis Supervision					
Name	Dates	Degree			
Adam Pitera	2001-2002	MSc, UCL			
Aliya Paracha	2002-2003	MSc, UCL			
Christian Fisher	2002-2003	MSc, UCL			
Andreas Argyriou	2003-2004	MSc, UCL			
Anthony Demco	2003-2004	MSc, UCL			
Amit Jain	2003-2004	MSc, UCL			
Phil Williams	2004 - 2005	MSc, UCL			
Yuan Chen	2004 - 2005	MSc, UCL			
Frederik Eaton	2005-2006	MSc, UCL			

	Thesis E	xaminer	/ PhD Committee Mem	ber
Name	Dates	Degree	Department	University
Yee Whye Teh	1998	MSc	Computer Science	Univ of Toronto
Amos Storkey	1999	PhD	Electrical Engineering	Imperial College
Harri Valpola	2000	PhD	Computer Science	Tech Univ Helsinki
Olivier Dupin	2000	MSc	Neural Computing	Aston University
Andrew Brown	2001	PhD	Computer Science	Univ of Toronto
Alberto Paccanaro	2001	PhD	Computer Science	Univ of Toronto
Brian Sallans	2001	PhD	Computer Science	Univ of Toronto
Lehel Csato	2002	PhD	Neural Computing	Aston University
John Winn	2003	PhD	Physics	Univ of Cambridge
Martijn Leisink	2004	PhD	Biophysics	Univ of Nijmegen
Yuan Qi	2004	PhD	Media Arts and Sciences	MIT
Iosifina Pournara	2001	PhD	Crystallography	Birkbeck College, London
Hyun-Chul Kim	2005	PhD	Comp. Sci. & Eng.	POSTECH, Korea
Xiaojin Zhu	2005 2005	PhD	Computer Science	Carnegie Mellon University
Phil Cowans	2006	PhD	Physics	Univ of Cambridge
Jason Williams	2006	PhD	Engineering	Univ of Cambridge
Jian Zhang	2000	PhD	Computer Science	Carnegie Mellon University
Anna Goldenberg	2000 2007	PhD	Computer Science	Carnegie Mellon University
Frank Wood	2007 2007	PhD PhD	Computer Science	Brown University
Imre Risi Kondor	2007 2007	PhD PhD	Computer Science	Columbia University
Yan Karklin	2007 2007	PhD	Computer Science	Carnegie Mellon University
Lisa Wainer	2007 2007	PhD	Computer Science	University College London
	2007 2007	PhD	Engineering	University Conege London Univ of Cambridge
Tae-Kyun Kim Benjamin Marlin	2007 2008	PhD PhD	Computer Science	University of Toronto
Julia Lasserre	2008 2008	PhD	Engineering	University of Cambridge
Peter Orbanz	2008 2008	PhD PhD	Computational Science	ETH Zürich
Joris Mooij	2008 2008	PhD PhD	Dept. of Biophysics	Radboud Univ Nijmegen
Hanna Wallach	2008 2008	PhD PhD	Physics	University of Cambridge
Jason Ernst	2008 2008	PhD PhD	·	Carnegie Mellon University
		PhD PhD	Computer Science	- · ·
Jim Huang Rebecca Hutchinson	2009	PhD PhD	Elect. and Computer Eng.	University of Toronto
	2009	PhD PhD	Computer Science Computer Science	Carnegie Mellon University Carnegie Mellon University
Sajid Sidiqqi Lavi Shpigelman	$2009 \\ 2010$	PhD PhD	-	Hebrew Univ of Jerusalem
	2010 2010	PhD PhD	Neural Computation Robotics	Carnegie Mellon University
Tom Stepleton	2010 2010	PhD		
Michael Osborne Indrayana Rustandi	$2010 \\ 2010$	PhD PhD	Engineering Computer Science	Oxford University Carnegie Mellon University
Han Liu		PhD PhD	-	- ·
Hui Guo	2010		Machine Learn. and Stats	Carnegie Mellon University
	2010	PhD DhD	Statistics	University of Cambridge
Philipp Hennig	2011	PhD DhD	Physics	University of Cambridge
Amr Ahmed	2011	PhD DhD	Computer Science	Carnegie Mellon University
Kyung-Ah Sohn Iwan Carles Martinez	2011	PhD PhD	Machine Learning	Carnegie Mellon University
Juan Carlos Martinez	2011		Statistics	University of Kent
Douglas Speed Noel Welsh	2011	PhD PhD	Applied Mathematics	University of Cambridge
	2011	PhD DhD	Computer Science	University of Birmingham
Ryan Turner	2011	PhD DI D	Engineering	University of Cambridge
Yunus Saatci	2011	PhD DhD	Engineering	University of Cambridge
Finale Doshi-Velez	2011	PhD DhD	Computer Science	MIT FTH 7i-h
Kay Broderson	2012	PhD	Computer Science	ETH Zurich
DJ Strouse	2012	MPhil	Engineering	University of Cambridge
Khalid El-Arini	2013	PhD DhD	Computer Science	Carnegie Mellon University
Patrick Fox-Roberts	2013	PhD DI D	Engineering	University of Cambridge
John Reid	2013	PhD	Statistics	University of Cambridge
Yuri Perov	2016	MSc	Engineering Science	University of Oxford
Balaji Lakshminarayanan		PhD	Gatsby Unit	UCL
Valentin Dalibard	2016	PhD	Computer Lab	University of Cambridge
Advait Sarkar	2017	PhD	Computer Lab	University of Cambridge
Tom Gunter	2017	PhD	Engineering Science	University of Oxford
Kirthevasan Kandasamy	2018	PhD	Machine Learning	CMU

TEACHING ACTIVITY

Undergraduate Teaching

Signal and Pattern Processing (3F3) Cambridge University Engineering Department. 4 lectures. (2006-)

Photo Editing and Image Search (paper 8, part IB) Cambridge University Engineering Department. 4 lectures. (2007-)

Machine Learning (4F13) Cambridge University Engineering Department. 16 lectures (2006-). About 90 students.

MPhil and PhD Courses:

Advanced Machine Learning taught at Cambridge University (2015-).

Reinforcement Learning taught at Cambridge University (2015-2016).

Introduction to Machine Learning Speech and Language Technologies taught at Cambridge University (2015-2016).

Unsupervised Learning: taught at the Gatsby Computational Neuroscience Unit in the first terms of 1998 (when it was called Neural Computation), and 2000-2005. It is a core requirement of the Gatsby Computational Neuroscience PhD programme and of the MSc Intelligent Systems programme in the computer science department. Between 10-35 students per year.

Statistical Approaches to Learning and Discovery: taught at Carnegie Mellon University in 2002. It was a core requirement of the MSc and PhD in Knowledge Discovery and Data Mining and was cross listed between the Computer Science, Statistics, Philosophy Departments and the Center for Automated Learning and Discovery. About 30 students.

Statistical Machine Learning: co-taught at Carnegie Mellon University in 2008. Core requirement of PhD in Machine Learning and cross listed with Statistics.

Conference Tutorials:

Nonparametric Bayesian Methods (UAI Conference, 2005) Bayesian Methods for Machine Learning (ICML Conference, 2004) Probabilistic Models for Unsupervised Learning (ICANN Conference, 2002) Unsupervised Learning (Technical University of Denmark, 2001) Probabilistic Models for Unsupervised Learning (NIPS Conference, 1999) Neural Computation (London, 1999)

Summer School Lectures:

Machine Learning Summer School (Tübingen, 2015) Machine Learning Summer School (Tübingen, 2013) Machine Learning Summer School (La Palma, 2012) Machine Learning Summer School (Singapore, 2011) CEU School: Beliefs and Decisions of Mind and Machines (Budapest, 2010) Machine Learning Summer School (Cambridge, 2009) EPSRC Data Modelling Winter School (Sheffield, UK, 2008) IPAM Graduate Summer School: Probabilistic Models of Cognition (LA, USA, 2007) Machine Learning Summer School (Tübingen, Germany, 2007) Machine Learning Summer School (Chicago, USA, 2005) Machine Learning Summer School (Canberra, Australia, 2003) EU Advanced Course in Computational Neuroscience (Obidos, Portugal, 2002) Autumn School in Cognitive Neuroscience (Oxford, UK, 2001) EU Advanced Course in Computational Neuroscience (Trieste, Italy, 2001) Machine Learning PhD course at Carnegie-Mellon University (USA, 2000) EU Advanced Course in Computational Neuroscience (Trieste, Italy, 2000) PhD Course on Computational Motor Control (Aalborg, Denmark, 1999) Summer School on Adaptive Processing of Temporal Information (Salerno, Italy, 1997)

Teaching Assistant: Cognitive Neuroscience, MIT (1994) Computational Cognitive Science, MIT (1992) Introduction to Psychology, MIT (1991)

ENABLING ACTIVITY

Executive Board, Alan Turing Institute, 2015-Cambridge ATI Internal Steeting Committee, 2016-Science Committee, Alan Turing Institute, 2016-Goverment Office of Science roundtable on Data, Computing and Sensors, 2015 Royal Society Machine Learning Science Policy Group 2015 EPSRC, Member of Peer Review College, 2013-Selection Panel, Lectureship in Machine Learning, Oxford, 2013 EPSRC ICT Grant Review Panel, 2012 CPHC/BCS Distinguished Dissertations Panel 2009-2012 Board of Electors, Oxford Professorship in Information Engineering, 2008-2012 Selection Committee, Director of UCL Centre for Computational Statistics & Machine Learning, 2006 External Examiner, MSc Information Processing & Neural Nets, King's College London, 2005-2009 Graduate Tutor, Gatsby Computational Neuroscience Unit, 2001-2005 Selection Committee, Chair in Computational Neuroscience, UCL, 2002

PUBLICATIONS

A. BOOKS

EDITED BOOKS

- Z. Ghahramani, M. Welling, C. Cortes, N. Lawrence and K. Weinberger, editors, (2014) Advances in Neural Information Processing 27. Curran Associates, Inc. 3000+ pages.
- [2] C.J.C. Burges, L. Bottou, M. Welling, Z. Ghahramani, and K.Q. Weinberger, editors (2013) Advances in Neural Information Processing Systems 26. Curran Associates, Inc. 3000+ pages.
- [3] Z. Ghahramani, editor, (2007) Proceedings of the 24th International Conference on Machine Learning (ICML 2007). Omni Press. 1204 pages.
- [4] R. G. Cowell and Z. Ghahramani, editors, (2005) Proceedings of the 10th International Workshop on Artificial Intelligence and Statistics (AISTATS 2005). 452 pages.
- [5] T. G. Dietterich, S. Becker, and Z. Ghahramani, editors, (2002) Advances in Neural Information Processing Systems 14. MIT Press, Cambridge, MA, 2002. 1594 pages.

CHAPTERS IN BOOKS

- [6] Mohamed, S., Heller, K. A., and Ghahramani, Z. (2014) A Simple and General Exponential Family Framework for Partial Membership and Factor Analysis. In Edoardo M. Airoldi, David Blei, Elena A. Erosheva, Stephen E. Fienberg (eds) Handbook on Mixed Membership Models and Their Applications. CRC Press.
- [7] Mohamed, S., Heller, K. A. and Ghahramani, Z. (2014) Bayesian Approaches for Sparse Latent Variable Models: Reconsidering L₁ Sparsity. In Rish, I., Cecchi, G., Lozano, A. and Niculescu-Mizil (Eds.) Practical Applications of Sparse Modeling. MIT Press.
- [8] Van Gael, J and Ghahramani, Z. (2011) Nonparametric Hidden Markov Models. In Barber, D., Cemgil, A.T. and Chiappa, S. (Eds.) Bayesian Time Series Models, Chapter 15, pages 317–340. Cambridge University Press.
- [9] Pipe, A. G., Vaidyanathan, R., Melhuish, C., Bremner, P., Robinson, P., Clark, R., Lenz, A., Eder, K., Hawes, N., Ghahramani, Z., Fraser, M., Mirmehdi, M., Healey, P., Skachek, S. (2011) Affective Robotics: Human Motion and Behavioural Inspiration for Safe Cooperation between Humans and Humanoid Assistive Robots. In Y. Bar-Cohen (Ed.) *Biomimetics: Nature-Based Innovation*, CRC Press / Taylor & Francis Group
- [10] Beal, M.J., Li, J., Ghahramani, Z. and Wild, D.L. (2007) Reconstructing Transcriptional Networks using Gene Expression Profiling and Bayesian State Space Models. In Sangdun Choi (ed.) Introduction to Systems Biology, Chapter 12, pages 217–241. Humana Press.
- [11] Pérez-Cruz, F., Ghahramani, Z. and Pontil, M. (2007) Conditional Graphical Models. In Bakir, F. et al. (eds) *Predicting Structured Data*. MIT Press.
- [12] Chu, W., Keerthi, S. S., Ong, C. J., Ghahramani, Z. (2006) Bayesian support vector machines for feature ranking and selection. In Guyon, I., Gunn, S., Nikravesh, M. and Zadeh, L. *Feature extraction, Foundations and Applications.*, pages 403–418. Springer-Verlag.
- [13] Zhu, X., Kandola, J., Lafferty, J. and Ghahramani, Z. (2005) Graph Kernels by Spectral Transforms. In Chapelle, O., Schölkopf, B. and Zien, A. (eds) Semi-Supervised Learning. MIT Press.
- [14] Wolpert, D. M. and Ghahramani, Z. (2005) Bayes rule in perception, action and cognition. Gregory, R.L. (ed) The Oxford Companion to the Mind.
- [15] Rangel C., Angus J., Ghahramani Z. and Wild, D.L., (2005) Modeling genetic regulatory networks using gene expression profiling and state space models. In Husmeier, D., Dybowski,

R. and Roberts, S. (Eds): *Probabilistic Modelling in Bioinformatics and Medical Informatics*, pages 269–293. Springer Verlag.

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