

Yarin Gal

Contact Details

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Principal Appointments

- 2017–present **Associate Professor of Machine Learning**, University of Oxford Department of Computer Science, Oxford, UK.
- 2018-present **Group Lead**, Oxford Applied and Theoretical Machine Learning Group (OATML), Department of Computer Science, Oxford, UK, http://oatml.cs.ox.ac.uk/.
- 2017-present Tutorial Fellow, Christ Church College, Oxford, UK.
- 2017-present Turing Fellow, Alan Turing Institute for Data Science, London, UK.

Previous Appointments

- 2017–2018 Visiting Researcher, Machine Learning Group, University of Cambridge, UK.
- 2016–2017 Research Fellow, Alan Turing Institute for Data Science, London, UK.
- 2016–2017 **Research Fellow in Computer Science (JRF)**, *St Catharine's College, University of Cambridge*, Cambridge, UK.

Education

- 2012–2016 **PhD, Information Engineering, Machine Learning Group**, *University of Cambridge*, Cambridge, UK, supervised by Prof Zoubin Ghahramani FRS. Supported by the Google European Doctoral Fellowship; Qualcomm Innovation Fellowship; Cambridge trusts honorary scholar.
- 2011–2012 **MSc, Computer Science with focus on Machine Learning**, *University of Oxford*, Oxford, UK, supervised by Prof Phil Blunsom. *Graduated with distinction*.
- 2004–2009 BSc, double degree in Mathematics and Computer Science, The Open University of Israel, Israel, Graduated with distinction.
 Ranked in the top 10% of graduates in 2009 (90.8 percentile); Dean's List for the years 2007-2009; Graduated at 18 years old.

Research Interests

Bayesian deep learning • deep learning • approximate Bayesian inference • Gaussian processes • Bayesian modelling • Bayesian non-parametrics • scalable MCMC • generative modelling; Applications including AI safety • ML interpretability • reinforcement learning • active learning • natural language processing • computer vision • medical analysis.

Conferences and Peer Reviewing Activities

Lead Workshop Organiser:

- 2018 Third NIPS Workshop on "Bayesian Deep Learning".
- 2017 **Second NIPS Workshop on "Bayesian Deep Learning"**, (second largest workshop at NIPS with >2000 attendees, sponsorships from Google, Uber, Qualcomm, Microsoft Ventures).
- 2016 First NIPS Workshop on "Bayesian Deep Learning", (second largest workshop at NIPS with >2000 attendees).

Workshops Chair for:

2018 Uncertainty in Artificial Intelligence (UAI).

Area Chair for:

- 2018 International Conference on Machine Learning (ICML).
- 2018 International Conference for Learning Representations (ICLR).
- 2018 Artificial Intelligence and Statistics (AISTATS, Senior PC).
- 2017 Artificial Intelligence and Statistics (AISTATS, Senior PC). Grant Reviewing for:
- 2018 European Research Council (ERC, Advanced Grant).
- 2017 Israeli Science Foundation (ISF).

Program Committee Member:

- 2017 Workshop on Human Interpretability in Machine Learning (ICML workshop).
- 2017 Workshop on Principled Approaches to Deep Learning (ICML workshop).
- 2016 The 54th Annual Meeting of the Association for Computational Linguistics (ACL conference, for the area Machine Learning).
- 2015 Advances in Approximate Bayesian Inference (NIPS workshop).
- 2015 Bayesian Nonparametrics: The Next Generation (NIPS workshop).
- 2014 Advances in Variational Inference (NIPS workshop).

Journal Articles Reviewing for:

- 2017 American Astronomical Society, The Astrophysical Journal, Letters.
- 2017 Nature.
- 2016 Journal of the Royal Statistical Society (RSS).
- 2016 Journal of Machine Learning Research (JMLR).
- 2015 IEEE Transactions on Neural Networks and Learning Systems (IEEE TNNLS). Conference Papers Reviewing for:
- 2018 International Conference on Machine Learning (ICML).
- 2017 Neural Information Processing Systems (NIPS).

- 2017 International Conference on Machine Learning (ICML).
- 2017 International Conference on Learning Representations (ICLR, conference).
- 2017 International Conference on Learning Representations (ICLR, workshop).
- 2016 Neural Information Processing Systems (NIPS).
- 2016 International Conference on Machine Learning (ICML).
- 2016 International Conference on Learning Representations (ICLR, conference).
- 2016 International Conference on Learning Representations (ICLR, workshop).
- 2016 Association for Computational Linguistics (ACL).
- 2015 Artificial Intelligence and Statistics (AISTATS).
- 2015 Neural Information Processing Systems (NIPS).
- 2015 International Conference on Machine Learning (ICML). Invited Participant:
- 2018 UK-Japan AI Research delegation and workshop, British Embassy, Tokyo.
- 2017 UK-Canada AI Research delegation, British Embassy, Montreal.
- 2017 UK-Japan AI Research delegation and workshop, British Embassy, Tokyo.
- 2017 Google Machine Learning Summit, Zurich.
- 2016 **GCHQ round-table discussion leader on machine learning**, *Government Communications Headquarters, UK*.
- 2016 NASA-SETI machine learning think-tank, NASA's Ames Research Center / SETI Institute.
- 2016 NVIDIA GPU machine learning tech summit, Santa Clara.
- 2015 First Deep Learning Symposium at NIPS 2015, Montreal.
- 2015 Alan Turing Institute Scoping Workshop on Deep Learning, Edinburgh.
- 2015 Google NLP PhD Summit, Zurich.
- 2015 "Bayesian Nonparametrics in the North" workshop, Ecole Centrale de Lille.
- 2015 Google Doctoral Fellowship Forum, Zurich.
- 2013 Google Doctoral Summit, Zurich.

Prizes and Scholarships

- 2016–2019 The Michael and Morven Heller Research Fellowship in Computer Science.
 - 2015 Alan Turing Institute Travel Award.
- 2015–2016 Qualcomm Innovation Fellowship, press release, media coverage.
 - 2015 BNP 2015 Travel Award.
 - 2014 Google DeepMind 2014 Travel Award.
 - 2014 Art of Engineering photo competition.
 - 2014 NIPS 2014 Travel Award.
 - 2014 ISBA 2014 Travel Award.
 - 2013 Tübingen MLSS grant, press release (German).
- 2012–2015 Google European Doctoral Fellowship full PhD scholarship, press release.
 - 2012 Cambridge overseas trusts offer of PhD scholarship.

- 2012 Oxford-MAN Institute offer of PhD scholarship.
- 2012 Karten Scholarship an offer of a £2,000 prize.
- 2004–2009 Merit based scholarship for high-school students studying for a BSc.

Recent Invited Talks

- 2018 Robotics Vision Summer School, Australia.
- 2018 ISM workshop, Tokyo, Japan.
- 2018 CMS, Cambridge, UK.
- 2017 Preferred Networks, Tokyo, Japan.
- 2017 Riken, Tokyo, Japan.
- 2017 34th International Conference on Machine Learning, Sydney, Australia.
- 2017 **Robotics: Science and Systems (RSS) Conference**, New Frontiers for Deep Learning in Robotics workshop and panel discussion, Massachusetts, US.
- 2017 NASA AMES, Mountain View.
- 2017 O'Reilly Artificial Intelligence, New York, US.
- 2017 British Embassy, Tokyo, Japan.
- 2017 SoftBank, Tokyo, Japan.
- 2017 Preferred Networks, Tokyo, Japan.
- 2017 Fujitsu, Tokyo, Japan.
- 2017 Department of International Trade event, Nagoya, Japan.
- 2016 NASA AMES, Mountain View.
- 2016 Alan Turing Institute Deep Generative Models Workshop, Royal Society, London.
- 2016 Adaptive Brain Lab, Department of Psychology, Cambridge.
- 2016 MRC Cognition and Brain Science Unit, Cambridge.
- 2016 London Machine Learning Meetup, London.
- 2016 **OpenAI**, San Francisco.
- 2016 Google, Mountain View.
- 2016 33rd International Conference on Machine Learning, New York City, NY.
- 2016 Natural Language and Information Processing seminar series, University of Cambridge, Cambridge.
- 2015 Microsoft Research, Cambridge.
- 2015 Alan Turing Institute Deep Learning Open Workshop, Edinburgh University, Edinburgh.
- 2015 ATI Scoping Workshop, Edinburgh University, Edinburgh.
- 2015 ML Seminar series, ETH, Zurich.
- 2015 Computational Statistics and Machine Learning seminar series, UCL, London.
- 2015 Bayesian Nonparametrics in the North meeting, Ecole Centrale de Lille, Lille.
- 2015 Trinity College Mathematical Society, University of Cambridge, Cambridge.
- 2015 Gonville and Caius College, University of Cambridge, Cambridge.
- 2015 32nd International Conference on Machine Learning, Lille.

- 2015 NTT Labs, Kyoto, Japan.
- 2015 Microsoft Research, Cambridge.
- 2015 32nd International Conference on Machine Learning, Lille.
- 2015 10th Conference on Bayesian Nonparametrics, Raleigh, NC.
- 2014 NTT Labs, Kyoto, Japan.
- 2014 Workshop on New Learning Models and Frameworks for Big Data, ICML, *Beijing, China*.
- 2013 Workshop on Big Learning, NIPS, Lake Tahoe.
- 2013 Association for Computational Linguistics (NA-ACL), Atlanta.

Seminar Talks and Reading Groups

- 2016 "Differentiable Data Structures (and POMDPs)", MLG Seminar.
- 2014 "Symbolic Differentiation for Rapid Model Prototyping in Machine Learning and Data Analysis – a Hands-on Tutorial", *MLG Seminar*.
- 2014 "Rapid Prototyping of Probabilistic Models using Stochastic Variational Inference", *Short talk.*
- 2014 "Emergent Communication for Collaborative Reinforcement Learning", *MLG Seminar*.
- 2014 "The Borel-Kolmogorov paradox", Short talk.
- 2013 "Bayesian Nonparametrics in Real-World Applications: Statistical Machine Translation and Language Modelling on Big Datasets", *MLG Seminar*.

Academic Supervision

- 2018–2019 Zac Kenton, *Postdoc supervisor*, funded by the Centre for Effective Altruism, University of Oxford.
 - 2018– Aidan Gomez, PhD supervisor, Clarendon Scholar, University of Oxford.
 - 2018- Joost Van Amersfoort, PhD supervisor, DeepMind Scholar, University of Oxford.
 - 2018- Angelos Filos, PhD supervisor, funded by JP Morgan, University of Oxford.
 - 2018– Andreas Kirsch, *PhD supervisor*, Clarendon Scholar, Autonomous Intelligent Machines and Systems Centre for Doctoral Training, University of Oxford.
 - 2018– **Tim Rudner**, *PhD supervisor*, **Rhodes Scholar**, Autonomous Intelligent Machines and Systems Centre for Doctoral Training, University of Oxford.
 - 2018- Clare Lyle, PhD co-supervisor, Rhodes Scholar, University of Oxford.
 - 2017– Milad Alizadeh, PhD co-supervisor, University of Oxford.
 - 2017- Sebastian Farquhar, *PhD supervisor*, Cyber Security Centre for Doctoral Training, University of Oxford.
 - 2017– Lewis Smith, *PhD supervisor*, Autonomous Intelligent Machines and Systems Centre for Doctoral Training, University of Oxford.
- 2017–2018 **Jean-Francois Ton**, *CDT project supervisor*, Oxford-Warwick Statistics Programme Centre for Doctoral Training, University of Oxford.
- 2017–2018 Mark Bromley, MSc supervisor, Computer Science department, University of Oxford.

- 2017–2018 Arnoud De Kroon, *MSc supervisor*, Computer Science department, University of Oxford. (Went on to do a PhD at Amsterdam)
- 2017–2018 Jishnu Mukhoti, MSc supervisor, Computer Science department, University of Oxford.
- 2016–2017 **Piotr Dabkowski**, *Primary MPhil Thesis Supervision*, Computer Laboratory, University of Cambridge. (Went on to work at Google)
- 2016–2017 **Jiří Hron**, *Research Assistant Supervision*, Department of Engineering, University of Cambridge.
- 2015–2016 Riashat Islam, Primary MPhil Thesis Supervision, Department of Engineering, University of Cambridge.
 (Went on to do a PhD at Montreal (MILA))
- 2015–2016 Jiří Hron, Primary MSc Thesis Supervision, Department of Computer Science, University College London (UCL).
 (Went on to do a PhD at Cambridge)
- 2015–2016 Ambrish Rawat, Primary MPhil Thesis Supervision, Department of Engineering, University of Cambridge.
 (Went on to work at IBM)

Select Publications (more on Google Scholar)

- [1] Alex Kendall, Yarin Gal, and Roberto Cipolla. Multi-Task Learning Using Uncertainty to Weigh Losses for Scene Geometry and Semantics. In *CVPR*, 2018.
- [2] Piotr Dabkowski and Yarin Gal. Real Time Image Saliency for Black Box Classifiers. In *NIPS*, 2017.
- [3] Yarin Gal, Jiri Hron, and Alex Kendall. Concrete Dropout. In NIPS, 2017.
- [4] Alex Kendall and Yarin Gal. What Uncertainties Do We Need in Bayesian Deep Learning for Computer Vision? In *NIPS*, 2017.
- [5] Yarin Gal, Riashat Islam, and Zoubin Ghahramani. Deep Bayesian Active Learning with Image Data. In *Proceedings of the 34th International Conference on Machine Learning (ICML-17)*, 2017.
- [6] Yingzhen Li and Yarin Gal. Dropout Inference in Bayesian Neural Networks with Alphadivergences. In Proceedings of the 34th International Conference on Machine Learning (ICML-17), 2017.
- [7] Rowan McAllister, Yarin Gal, Alex Kendall, Mark van der Wilk, Amar Shah, Roberto Cipolla, and Adrian Vivian Weller. Concrete problems for autonomous vehicle safety: Advantages of Bayesian deep learning. In *IJCAI*, 2017.
- [8] Yarin Gal. Uncertainty in Deep Learning. PhD thesis, Cambridge University, 2016.
- [9] Yarin Gal and Zoubin Ghahramani. A theoretically grounded application of dropout in recurrent neural networks. In Advances in Neural Information Processing Systems 29 (NIPS), 2016.

- [10] Yarin Gal, Rowan McAllister, and Carl E. Rasmussen. Improving PILCO with Bayesian neural network dynamics models. In *Data-Efficient Machine Learning workshop*, *ICML*, April 2016.
- [11] Yarin Gal and Zoubin Ghahramani. Dropout as a Bayesian approximation: Representing model uncertainty in deep learning. In *Proceedings of the 33rd International Conference* on Machine Learning (ICML-16), 2016.
- [12] Yarin Gal and Zoubin Ghahramani. On modern deep learning and variational inference. In Advances in Approximate Bayesian Inference workshop, NIPS, 2015.
- [13] Yarin Gal. Rapid prototyping of probabilistic models: Emerging challenges in variational inference. In Advances in Approximate Bayesian Inference workshop, NIPS, 2015.
- [14] Yarin Gal and Zoubin Ghahramani. Bayesian convolutional neural networks with Bernoulli approximate variational inference. In 4th International Conference on Learning Representations (ICLR) workshop track, 2016.
- [15] Yarin Gal and Zoubin Ghahramani. Dropout as a Bayesian approximation: Insights and applications. In *Deep Learning Workshop, ICML*, 2015.
- [16] Yarin Gal and Richard Turner. Improving the Gaussian process sparse spectrum approximation by representing uncertainty in frequency inputs. In *Proceedings of the 32nd International Conference on Machine Learning (ICML-15)*, 2015.
- [17] Yarin Gal, Yutian Chen, and Zoubin Ghahramani. Latent Gaussian processes for distribution estimation of multivariate categorical data. In *Proceedings of the 32nd International Conference on Machine Learning (ICML-15)*, 2015.
- [18] Hong Ge, Yarin Gal, and Zoubin Ghahramani. Dirichlet fragmentation processes. In arXiv:1509.04781, 2015.
- [19] Yarin Gal, Tomoharu Iwata, and Zoubin Ghahramani. An infinite product of sparse Chinese restaurant processes. In 10th Conference on Bayesian Nonparametrics (BNP), 2015.
- [20] Yarin Gal, Yutian Chen, and Zoubin Ghahramani. Latent Gaussian processes for distribution estimation of multivariate categorical data. In Workshop on Advances in Variational Inference, NIPS, 2014.
- [21] Yarin Gal, Mark van der Wilk, and Carl Rasmussen. Distributed variational inference in sparse Gaussian process regression and latent variable models. In Advances in Neural Information Processing Systems 27 (NIPS). 2014.
- [22] Yarin Gal, Mark van der Wilk, and Carl E. Rasmussen. Distributed variational inference in sparse Gaussian process regression and latent variable models. In *Workshop on New Learning Models and Frameworks for Big Data, ICML*, 2014.
- [23] Yarin Gal and Zoubin Ghahramani. Feature partitions and multi-view clusterings. International Society for Bayesian Analysis (ISBA), 2014.
- [24] Yarin Gal and Zoubin Ghahramani. Pitfalls in the use of parallel inference for the Dirichlet process. In Proceedings of the 31th International Conference on Machine Learning (ICML-14), 2014.

- [25] Yarin Gal and Zoubin Ghahramani. Pitfalls in the use of parallel inference for the Dirichlet process. In *Workshop on Big Learning*, *NIPS*, 2013.
- [26] Yarin Gal and Mark van der Wilk. Variational inference in the Gaussian process latent variable model and sparse GP regression a gentle tutorial. *arXiv:1402.1412*, 2014.
- [27] Yarin Gal. Semantics, modelling, and the problem of representation of meaning a brief survey of recent literature. Technical report, University of Cambridge, 2013.
- [28] Yarin Gal and Phil Blunsom. A systematic Bayesian treatment of the IBM alignment models. In Proceedings of the 2013 Conference of the North American Chapter of the Association for Computational Linguistics: Human Language Technologies, Atlanta, Georgia, June 2013. Association for Computational Linguistics.
- [29] Yarin Gal. Relaxing HMM alignment model assumptions for machine translation using a Bayesian approach. Master's thesis, University of Oxford, 2012.
- [30] Yarin Gal and Mireille Avigal. Overcoming Alpha-Beta limitations using evolved artificial neural networks. In Ninth International Conference on Machine Learning and Applications (ICMLA). IEEE, 2010.

Open Source Activities

GitHub, https://github.com/yaringal.

Contributor:

2015–2016 **Keras**, *Deep learning package*, Contributions including: Transposed convolutions, RNN dropout, Deconvolutional VAE example.

Industrial Experience

Committees:

- 2018 NASA Frontier Development Lab Technical Committee, Co-chair.
- 2017-2018 **NASA Frontier Development Lab Steering Committee**, *Machine learning incubator for space mission projects*.

Consultancies:

- 2018- ESA, Data Science Coach, Frontier Development Lab Europe.
- 2016– NASA, Data Science Coach, NASA Frontier Development Lab.
- 2017 blank.ai, Machine learning advisory.

Vocational

- 2015 **Google Zurich**, *Research Engineer Intern*, Natural Language Processing group, 08/2015 to 01/2016.
- 2008–2011 Software Engineer, head of Mobile Platforms development, *IDesia Biometrics*, Caesarea, Israel.

A software company developing ECG based biometrics and consumer healthcare solutions. Projects:

- $_{\rm +}\,$ UX and UI logic design;
- + SDK development and code porting for mobile platforms:
- MTK (Nucleus based embedded OS), Linux (Android, Maemo), Symbian, Windows mobile;
- $_{\pm}\,$ QA tools development, offline simulation tools for the National Physical Laboratory (NPL).

2006–2007 **Web development**, *The TAO Centre*. Commercial ASP web programming.

Volunteer work

- 2014-2016 **Member of Gonville and Caius College MCR committee**, *Computing officer*, Designed and deployed MCR website.
- 2013-2014 **Member of Gonville and Caius College MCR committee**, *Dining officer*, Initiated MCR dinners at Caius.
 - 2007 Teaching computer skills to the elderly.

Interests

computing Computational aspects of pretty proofs, reverse engineering (windows platforms).

cool projects extrapolated art – winner of the Art of Engineering photo competition (2nd prize; media coverage: IFLScience, The Telegraph, Daily Mail, Wolfram blog, Hacker News, Kottke, Boing Boing (by Cory Doctorow), Gigazine, Habrahabr).

Origami model design, autonomous game playing (2009), automated arbitrage search (2007), Java based database system (2006), web controlled robotic camera (2004).

Languages

English Excellent Hebrew Native Japanese Studying