## Objective

I extend the paradigm of Bayesian inference to cope with the challenges posed by modern machine learning techniques, simulation models, and large scale data.

# **Education / Qualifications**

#### 2016-2021

#### PhD in Statistical Science (Oxford-Warwick Statistics Programme)

Time at Oxford (1 year), Warwick (2 years), Alan Turing Institute (2 years); research visits at Duke (4 months), Amazon Research (5 months), and DeepMind (4 months).

#### 2012-2016

**Econometrics & Operations Research, BSc & MSc (Maastricht University)** Cum laude (for both BSc & MSc), ranked in top 1%, best thesis award, honours programme, Klaus-Murmann Fellow of the Foundation of German Business

#### 2011

Abitur (Deutschorden-Gymnasium/Teutonic Order College Bad Mergentheim) Ranked in top 1% in my federal state, 4 awards for outstanding academic achievement

## **Professional History**

07/2021—present Lecturer & EPSRC Fellow, UCL, Department of Statistical Science

10/2020-07/2021

Biometrika Fellow in Statistical Science, UCL, Department of Statistical Science

03/2018-10/2020

#### Visiting Researcher at the Alan Turing Institute

Work on *Clean Air in London* (with London's Major's office) and *diabetic retinopathy* (with the Finnish Centre for AI).

## Grants

07/2022----07/2025

**EPSRC Fellow: Optimisation-centric Generalisations of Bayesian Inference** (PI) £325,660; 3-year research fellowship with 100% buyout to establish my research group on generalised Bayesian methods building on the work in my PhD thesis.

#### 03/2024----03/2025

## **EPSRC Small Grant: Robust Foundations for Bayesian Inference** (Co-I)

£59,985; 1-year project with 7.5% buyout to develop coherent and widely applicable ways of talking about, measure, and provably guarantee robustness.

10/2021-07/2022

#### Biometrika Fellowship: Generalising Bayesian Inference (PI)

£122,232; 2-year fellowship to transition to research independence.

## Publications & Preprints (2019–2023)

#### **Working Papers**

- Altamirano, M., Briol, F. -X., & **Knoblauch, J.** (2023). Robust and Conjugate Gaussian Process Regression. Submitted to *International Conference on Artificial Intelligence and Statistics* <u>10.48550/arXiv.2311.00463</u>
- Dewaskar, M., Tosh, C., **Knoblauch, J.**, & Dunson, D. B. (2023). Robustifying likelihoods by optimistically re-weighting data. Submitted to *Journal of the American Statistical Association* <u>http://arxiv.org/abs/2303.10525v1</u>
- Naslidnyk, M., Bharti, A., **Knoblauch, J.**, & Briol, F. -X. (2023). Robust Empirical Bayes for Gaussian Processes. Close to submission. <u>https://tinyurl.com/</u> <u>4sjvzbck</u>

#### Journals

- Matsubara, T., **Knoblauch, J.**, Briol, F. X., & Oates, C. J. (2023). Generalized Bayesian Inference for Discrete Intractable Likelihood. *Journal of the American Statistical Association*, 1-11.
- **Knoblauch, J.**, Jewson, J., & Damoulas, T. (2022). An Optimization-centric View on Bayes' Rule: Reviewing and Generalizing Variational Inference. *Journal* of Machine Learning Research, 23.
- Matsubara, T., **Knoblauch, J.**, Briol, F., & Oates, C. J. (2022). Robust generalised Bayesian inference for intractable likelihoods. *Journal of the Royal Statistical Society: Series B*, *84*(3), 997-1022.
- Jaskari, J., Sahlsten, J., Damoulas, T., Knoblauch, J., Sarkka, S., Karkkainen, L., Hietala, K., & Kaski, K. (2022). Uncertainty-Aware Deep Learning Methods for Robust Diabetic Retinopathy Classification. *IEEE Access*, 10, 76669-76681.

#### **Peer-Reviewed Conferences**

- Wild, V. D., Ghalebikesabi, S., Sejdinovic, D., & Knoblauch, J. (2023). A Rigorous Link between Deep Ensembles and (Variational) Bayesian Methods. In Advances in Neural Information Processing Systems. Massachusetts Institute of Technology Press.
- Altamirano, M., Briol, F. X., & Knoblauch, J. (2023). Robust and Scalable Bayesian Online Changepoint Detection. In 40th International Conference on Machine Learning, ICML 2023 (pp. 642-663).
- Dellaporta, C., Knoblauch, J., Damoulas, T., & Briol, F. -X. (2022). Robust Bayesian inference for simulator-based models via the MMD posterior bootstrap. In *International Conference on Artificial Intelligence and Statistics* (pp. 943-970).
- Husain, H., & Knoblauch, J. (2022). Adversarial Interpretation of Bayesian Inference. In *Proceedings of The 33rd International Conference on Algorithmic Learning Theory* Vol. 167 (pp. 553-572). Paris, France: Proceedings of Machine Learning Research (PMLR).
- Maroñas, J., Hamelijnck, O., **Knoblauch, J.**, & Damoulas, T. (2021). Transforming Gaussian Processes With Normalizing Flows. In

*International Conference on Artificial Intelligence and Statistics* (pp. 1081-1089).

- Schmon, S. M., Cannon, P. W., & **Knoblauch, J.** (2020). Generalized Posteriors in Approximate Bayesian Computation. In *Third Symposium on Advances in Approximate Bayesian Inference*.
- Knoblauch, J., Husain, H., & Diethe, T. (2020). Optimal Continual Learning has Perfect Memory and is NP-HARD. In 37th International Conference on Machine Learning, ICML 2020 (pp. 5283-5293).
- Knoblauch, J., Jewson, J., & Damoulas, T. (2018). Doubly robust Bayesian inference for non-stationary streaming data with β-divergences. In Advances in Neural Information Processing Systems Vol. 2018-December (pp. 64-75).
- **Knoblauch, J.**, & Damoulas, T. (2018). Spatio-temporal Bayesian on-line changepoint detection with model selection. In *35th International Conference on Machine Learning, ICML 2018* (pp. 4260-4270).

## **Technical Reports**

- Knoblauch, J. (2019). Robust Bayesian Inference for Discrete Outcomes with the Total Variation Distance. <u>https://arxiv.org/abs/2010.13456</u>
- Knoblauch, J. (2019). Robust deep gaussian processes. <u>https://arxiv.org/abs/</u> <u>1904.02303</u>
- Knoblauch, J. (2019). Frequentist Consistency of Generalised Variational Inference. <u>https://arxiv.org/abs/1912.04946</u>

## **Prizes, Awards and Other Honours**

**Facebook Fellowship Award** (10/2019—10/2021) Grant of around \$212,000 awarded to 21 of >1,000 applicants. First UK-based Fellow.

John Copas Award (05/2022) Warwick University's best PhD thesis in statistics award

Artificial Intelligence and Statistics (AISTATS) Best Paper Award (04/2022). Awarded to best paper out of 1685 submissions.

**Neural Information Processing Systems (NeurIPS) Oral (**12/2023) Awarded to <1% out of >12,000 submissions as a marker of quality and significance.

**Invitation to the Heidelberg Laureate Forum (HLF)** (09/2020) The HLF is a meeting between a hand-picked selection of young researchers, and laureates from maths and CS (winners of the Abel Prize, ACM A.M. Turing Award, ACM Prize in Computing, Fields Medal, IMU Abacus Medal and Nevanlinna Prize).

#### **Best Poster Awards**

07/2023 ICML @ G-Research

 $\pm$ 1000; > $\overline{30}$  pre-selected ICML papers; judged by senior research staff 10/2019 PhD summit @ Facebook

£500; >20 pre-selected students presenting; judged by Dr. Eytan Bakshy

# **Academic Supervision**

#### **Research group leadership**

I established a new research group on Fundamentals of Statistical Machine Learning (3 staff, 7 students). We invite external speakers and disseminate the group's research.

#### Supervision outcomes to date

In 2022/2023 alone, my students wrote 7 papers, presented at >15 occasions, and organised a 2-day workshop at UCL with >50 participants. Other achievements of note include

- William Gordon Seggie Brown Fellow at Edinburgh University [Takuo Matsubara]
- NeurIPS oral distinction [Veit Wild]
- Two Best Student Paper Awards from the ASA [Takuo Matsubara, Masha Naslidnyk];
- Early Career Contributed Paper Award from ISBA [Takuo Matsubara].
- "enrichment student" award at The Alan Turing Institute worth >£5,000 [Masha Naslidnyk].
- Winning funds for research visit to Helmholtz AI Centre worth >£10,000 [Masha Naslidnyk]
- Winning £500 poster competition with >30 participants, and judged by Prof. Guy Nason (Imperial College London) [Matias Altamirano].

#### **Primary PhD supervisor**

#### Matias Altamirano (10/2022---present)

Subsidiary supervisors: Dr. Francois-Xavier Briol. *Topic*: Robust Bayesian methods through kernel distances. *Progress*: 4 papers (including at ICML and AISTATS), 1 preprint in submission.

#### Yann McLatchie (10/2023--present)

Subsidiary supervisors: Dr. Edwin Fong (University of Hong Kong).

Topic: Predictive Bayesian methods.

Progress: 1 paper at NeurIPS workshop, 3 journal paper preprints in submission.

#### Secondary PhD supervisor

## Takuo Matsubara, The Alan Turing Institute (06/2021--06/2023)

*Primary supervisor*: Prof. Chris Oates (University of Newcastle) *Topic*: Generalised Bayesian methods for tractable computation *Progress*: Co-supervised 2/3 thesis chapters published at JRSS-B and JASA.

#### Masha Naslidnyk (10/2021-present)

Primary supervisor. Dr. Francois-Xavier Briol.
Topic: Robust Inference for Gaussian Processes
Progress: 3 papers (including at ICML and EMNLP), 2 preprints in submission.
3-month research exchange with Dr. Krikamol Muandet

Veit Wild, Oxford University (10/2022—present) Primary supervisor: Prof. Dino Sejdinovic (University of Adelaide) Topic: Infinite-dimensional Generalised Variational Inference Progress: Hosted Veit at UCL10/2022—04/2023, co-supervised 2/4 thesis chapters (1 published as NeurIPS oral, 1 about to be submitted).

#### Gerardo Duran-Martin, Google & Queen Mary University (06/2023—present) *Primary supervisors*: Dr. Kevin Murphy (DeepMind), Dr. Alex Shestopaloff (QMU) *Topic*: Robust online learning algorithms *Progress*: I am co-supervising Gerardo's third thesis chapter

# **Invited Talks**

I have given >50 invited talks in academia, industry, and at conferences.

#### **Selected Conferences**

IMS Asia Pacific Rim Meeting; Melbourne, Australia (01/2024) Neural Information Processing Systems (NeurIPS); New Orleans, USA (12/2023) Greek Stochastics; Naxos, Greece (07/2023) ELLIS Theory workshop in Tuebingen, Germany (05/2023) BayesComp in Levi, Finland (03/2023) Artificial Intelligence & Statistics (AISTATS); remotely (08/2022) Artificial Intelligence & Statistics (AISTATS); remotely (08/2021) International Conference on Machine Learning (ICML); remotely (07/2020) International Conference on Machine Learning (ICML); Stockholm, Denmark (07/2018) Neural Information Processing Systems (NeurIPS); Montreal, Canada (12/2018) Workshop for Computational Strategies for Large-Scale Statistical Data Analysis at the International Centre for Mathematical Sciences; Edinburgh, UK (06/2018)

### Selected Research Institutions & Seminars (06/2019—present)

**UK**: Bank of England, Oxford University (2x), Imperial College London (3x), Warwick University (3x), Alan Turing Institute (2x), University of Glasgow, University of Edinburgh, University of Lancaster, University of Sheffield, University of Leeds, University of Manchester

**International**: Columbia University, Cornell University, Duke University, New York University's Courant institute, Chinese University of Hong Kong, University of Adelaide, Monash University, University of Geneva, Continual AI global seminar

## **Enterprise & External Engagement**

#### **Scientific Collaborations with Industry Partners**

DeepMind (Dr. Kevin Murphy); 2023—present.

AstraZeneca (Dr. Tom Diethe); 2023—present.

Amazon (Dr. Hisham Husain); 2020-present; 2 publications

Improbable (Dr. Patrick Cannon, Dr. Sebastian Schmon); 2020/2021; **1** publication Lloyds Banking Group (Dr. Lara Vomfell); 2020/2021; **1** preprint

#### **Scientific Advisor**

**Idoven (**06/2023—present): Spanish \$19m startup developing technology that predicts heart failure days or weeks before it occurs (<u>https://www.idoven.ai/</u>). Idoven has already committed to funding a PhD studentship through the CASE scheme next year. **HopStair** (03/2022—present): Pre-seed London-based startup building a wellness app to boost user happiness via targeted nudges (<u>https://hopstair.com/</u>).

#### Invited Talks (10/2020—present)

Google Brain (Mountain View, USA), DeepMind (London, UK), Amazon Research (Cambridge, UK), Facebook [now Meta] (Menlo Park, USA + London), Improbable (London), ResistantAI (Prague, CZE), G-Research (London), Idoven (Madrid, ESP)

# **Teaching-related activities**

#### PhD-level course on report writing and presentation (departmental CDT)

I volunteered to design this training session for the departmental CDT bid & ran it in 03/2023

### Masterclass on optimisation-centric generalisations of Bayesian Inference

- I have been invited to teach optimisation-centric generalisations of Bayesian inference at
- AI CDT summit between Bristol, Bath, and UCL (2023)
- Postdoc summit for Bayes4Health & CoSInES at Cambridge (2022)
- the Alan Turing institute (2019)
- Amazon Research (2019)
- DeepMind's Theory and Foundations Team (2021).

## Mentoring of Students & BSc/MSc supervision

- I have volunteered to take on UGs as personal tutor.
- Mentored UGs from an underrepresented background via In2Research for 8 weeks.
- Thesis supervision for 2 UG and 2 MSc students.
   (1 publication, 1 PhD at Cambridge, 1 preprint in submission)

## Earlier experiences

- Bachelor's second-year Probability and Statistics tutorials (Maastricht University; 2016)
- Master's level Probability Theory tutorials (Warwick University; 2020)
- Master's level Monte Carlo methods (Warwick University; 2019-2021)

# Services to the Community

## **Editor/Area Chair**

Artificial Intelligence & Statistics (AISTATS) 2022-present

## **Organisation of Workshops & Events**

- Founder and organiser of fortnightly online seminar on generalised Bayesian methods (10/2022—present); attended by leading figures, including Prof. Chris Holmes (Oxford University), Prof. David Dunson (Duke University), Dr. Jeffrey Miller (Harvard University), Prof. Pierre Alquier (ESSEC Singapore), Prof. David Stephens (McGill), Prof. Chris Oates (Newcastle).
- Organiser of the Data-Centric Engineering (DCE) seminar series at the Alan Turing Institute 07/2020—10/2021; regularly attended by >35 mostly UK-based researchers.
- Founder & organiser of monthly drinks round of early career researchers in statistics & machine learning based at UCL, Imperial, LSE, and the Alan Turing Institute.
- Organiser of 2-day workshop in 0/42024 on variational methods with >50 participants.
- Member of the scientific committee for BAYSM 2023
- Organiser of session on approximate Bayesian inference at BayesComp 2023
- Organiser of 4 reading groups since 2021

#### Reviewer

**Journals**: Journal of the Royal Statistical Society, Series B, Journal of the American Statistical Association, Biometrika, Statistics and Computing, Bayesian Analysis, Journal of Machine Learning Research, Transactions of Machine Learning Research, Machine Learning, IEEE Transactions on Pattern Analysis and Machine Intelligence **Conferences:** Artificial Intelligence & Statistics, Neural Information Processing Systems, International Conference on Machine Learning, International Conference on Learning Representations, Advances in Approximate Bayesian Inference