e.t.nalisnick@uva.nl enalisnick.github.io

## **Academic Employment**

Assistant Professor, Tenure TrackUniversity of AmsterdamAmsterdam Machine Learning LabSeptember 2020 - present

Postdoctoral Research AssociateUniversity of CambridgeComputational and Biological Learning LaboratorySeptember 2018 to September 2020

Graduate Student ResearcherUniversity of California, IrvineSmyth DataLabOctober 2013 to June 2018

## **Industrial Employment**

Research ScientistGoogle DeepMindPart time, one day per week (20% FTE)February 2019 to January 2020Research Scientist InternGoogle DeepMind

Supervisor: Balaji Lakshminarayanan Summer 2018

Applied Scientist InternAmazonSupervisors: Vijai Mohan, Eiman ElnahrawyFall 2016

Research Intern
Supervisor: Hugo Larochelle
Summer 2016

**Research Intern**Supervisors: Rich Caruana, Nick Craswell
Summer 2015

Research Scientist InternAmazonSupervisors: Vijai Mohan, Rahul BhagatSummer 2014

## Education

Ph.D. Computer Science 2013 - 2018

University of California, Irvine

M.S. Computer Science 2012 - 2013

Lehigh University

**B.S.** Computer Science & English Literature 2008 - 2012

Lehigh University

### **Academic Honors and Awards**

Veni Laureate, Dutch Research Council (NWO)

2021

ELLIS Scholar, European Lab for Learning and Intelligent Systems Society

2021

Top / Best Reviewer

NeurIPS 2017, ICML 2019, ICML 2020

## **Research Funding**

PRINCIPAL INVESTIGATOR

Continual Learning under Human Guidance

June 2022 - 2026

€280,000

Veni, Talent Programme, Dutch Research Council (NWO): Science Domain

Single Principal Investigator, Acceptance Rate: 16%.

Co-Investigator

UvA-Bosch Delta Lab November 2021 - 2026

Gift funding for 10 PhD students from the Bosch Group.

Role: Supervisor for 4 PhD students.

PIs: Theo Gevers, Jan-Willem van de Meent.

Hybrid Intelligence Centre

January 2020 - 2030

University of Amsterdam, 2021 -

Gravitation Programme, Dutch Research Council (NWO)

Role: Co-supervisor for 2 PhD students.

Putra Manggala (with Holger Hoos)

PIs: F. v. Harmelen, C. Jonker, M. d. Rijke, R. Verbrugge, P. Vossen, M. Welling.

## **Academic Supervision**

PhD Candidates

Alexander Timans University of Amsterdam, 2022 -

Metod Jazbec University of Amsterdam, 2022 -

Mona Schirmer University of Amsterdam, 2022 -

Dharmesh Tailor University of Amsterdam, 2021 -

Saba Amiri (with Adam Belloum and Sander Klous)

University of Amsterdam, 2021 -

Urja Khurana (with Antske Fokkens)

Vrije University Amsterdam, 2020 -

Mrinank Sharma (with Tom Rainforth and Yee Whye Teh)

University of Oxford, 2020 -

MASTERS STUDENTS

Nils Lehmann University of Amsterdam, 2022

Shuai Wang University of Amsterdam, 2022

Rajeev Verma	University of Amsterdam, 2022	
Arsen Sheverdin	University of Amsterdam, 2021 -	
Daniël Nobbe	University of Amsterdam, 2021	
Teaching		
Introduction to Machine Learning (Leren), University of Amsterdam $\sim$ 180 Undergraduate Students, $\sim$ 12 Teaching Assistants	2020 - 2022	
Bayesian Deep Learning Module, Deep Learning II, University of Am 123 Graduate Students, 5 Teaching Assistants	sterdam 2022	
Project in AI, University of Amsterdam	2021	
Professional Service		
Organization		
Anomaly Detection for Scientific Discovery	2021 - present	
Tractable Probabilistic Modeling, UAI Workshop	2022	
Bayesian Deep Learning, NeurIPS Workshop	2021	
Bayesian Deep Learning, ELLIS Workshop / NeurIPS Meetup	2020	
Bayesian Deep Learning, NeurIPS Workshop	2019	
Area Chair / Senior Program Committee		
Uncertainty in Artificial Intelligence (UAI)	2021 - present	
Neural Information Processing Systems (NeurIPS)	2021 - present	
International Conference on Machine Learning (ICML)	2021 - present	
Artificial Intelligence and Statistics (AIStats)	2022	
International Conference on Learning Representations (ICLR)	2021	
Editorial Board		
Editor, Probabilistic Methods for Deep Learning, Special Issue of Entr	тору 2021	
Journal Reviewing		
American Statistical Association (JASA)	2020 - present	
Machine Learning Research (JMLR)	2018 - present	
Advances in Statistical Analysis	2020 - present	

#### Conference Reviewing

Neural Information Processing Systems (NeurIPS)	2016 - 2021
International Conference on Learning Representations (ICLR)	2018 - present
International Conference on Machine Learning (ICML)	2018 - 2023
Artificial Intelligence and Statistics (AIStats)	2019 - 2022
Uncertainty in Artificial Intelligence (UAI)	2019 - 2020
Hybrid Human-Artificial Intelligence (HHAI)	2022
Association for the Advancement of Artificial Intelligence (AAAI)	2020 - 2022
International Joint Conference on Artificial Intelligence (IJCAI)	2019

## **Departmental / Institute Service**

Education program committee for Bachelors and Masters of AI	2021 - present
Hiring committee for one AMLab / ELLIS unit faculty position	2021
Hiring committee for two AMLab faculty positions	2021

## **Doctoral Committees**

Shi Hu, Uncertainty, Robustness and Safety in Artificial Intelligence

2022

## **Publications**

#### PRE-PRINTS / WORKING PAPERS

- 1. R. Verma\*, D. Barrejón\*, and **E. Nalisnick**. Learning to Defer to Multiple Experts: Consistent Surrogate Losses, Confidence Calibration, and Conformal Ensembles.
- 2. D. Tailor, M. E. Khan, and E. Nalisnick. Exploiting Inferential Structure in Neural Processes.
- 3. J. Antoran\*, S. Padhy\*, R. Barbano, **E. Nalisnick**, D. Janz, and J. M. Hernández-Lobato. Sampling-Based Inference for Large Linear Models, with Application to Linearised Laplace.

#### JOURNAL ARTICLES

- 1. **E. Nalisnick**, P. Smyth, and D. Tran. A Brief Tour of Deep Learning from a Statistical Perspective. *Annual Review of Statistics and Its Application*, 2023 (to appear).
- 2. G. Papamakarios\*, E. Nalisnick\*, D. J. Rezende, S. Mohamed, and B. Lakshminarayanan. Normalizing Flows for Probabilistic Modeling and Inference. *Journal of Machine Learning Research* (JMLR), 2021.

<sup>\*</sup> Denotes equal contribution

#### Conference Articles

3. R. Verma and **E. Nalisnick**. Calibrated Learning to Defer with One-vs-All Classifiers. In *Proceedings* of the 39th International Conference on Machine Learning (ICML), 2022.

- 4. J. Antoran, D. Janz, J. U. Allingham, E. Daxberger, R. Barbano, E. Nalisnick, and J. M. Hernández-Lobato. Adapting the Linearised Laplace Model Evidence for Modern Deep Learning. In *Proceedings of the 39th International Conference on Machine Learning* (ICML), 2022.
- E. Daxberger, E. Nalisnick\*, J. U. Allingham\*, J. Antoran\*, and J. M. Hernández-Lobato. Expressive
  yet Tractable Bayesian Deep Learning via Subnetwork Inference. In *Proceedings of the 38th Interna-*tional Conference on Machine Learning (ICML), 2021.
- 6. **E. Nalisnick**, J. Gordon, and J. M. Hernández-Lobato. Predictive Complexity Priors. In *Proceedings* of the 24th International Conference on Artificial Intelligence and Statistics (AISTATS), 2021.
- 7. R. Pinsler, J. Gordon, **E. Nalisnick**, and J. M. Hernández-Lobato. Bayesian Batch Active Learning as Sparse Subset Approximation. In *Advances in Neural Information Processing Systems* (NeurIPS), 2019.
- 8. **E. Nalisnick**, J. M. Hernández-Lobato, and P. Smyth. Dropout as a Structured Shrinkage Prior. In *Proceedings of the 36th International Conference on Machine Learning* (ICML), 2019.
- 9. **E. Nalisnick**\*, A. Matsukawa\*, Y. W. Teh, D. Gorur, and B. Lakshminarayanan. Hybrid Models with Deep and Invertible Features. In *Proceedings of the 36th International Conference on Machine Learning* (ICML), 2019.
- 10. **E. Nalisnick**, A. Matsukawa, Y. W. Teh, D. Gorur, and B. Lakshminarayanan. Do Deep Generative Models Know What They Don't Know? In *Proceedings of the 7th International Conference on Learning Representations* (ICLR), 2019.
- 11. D. Ji, **E. Nalisnick**, Y. Qian, R. Scheuermann, and P. Smyth. Bayesian Trees for Automated Cytometry Data Analysis. In *Proceedings of Machine Learning for Healthcare* (MLHC), 2018.
- 12. **E. Nalisnick** and P. Smyth. Learning Priors for Invariance. In *Proceedings of the 21st International Conference on Artificial Intelligence and Statistics* (AISTATS), 2018.
- 13. **E. Nalisnick** and P. Smyth. Learning Approximately Objective Priors. In *Proceedings of the 33rd Conference on Uncertainty in Artificial Intelligence* (UAI), 2017.
- 14. **E. Nalisnick** and P. Smyth. Stick-Breaking Variational Autoencoders. In *Proceedings of the 5th International Conference on Learning Representations* (ICLR), 2017.
- 15. **E. Nalisnick**, B. Mitra, N. Craswell, and R. Caruana. Improving Document Ranking with Dual Word Embeddings. In *Proceedings of the 25th World Wide Web Conference* (WWW), 2016.
- E. Nalisnick and H. Baird. Character-to-Character Sentiment Analysis in Shakespeare's Plays. In Proceedings of the 51st Annual Meeting of the Association for Computational Linguistics (ACL), 2013.
- 17. **E. Nalisnick** and H. Baird. Extracting Sentiment Networks from Shakespeare's Plays. In *Proceedings* of the 12th International Conference on Document Analysis and Recognition (ICDAR), 2013.

## PEER-REVIEWED WORKSHOP ARTICLES (WITHOUT CONFERENCE VERSION)

18. J. U. Allingham, J. Antoran, S. Padhy, **E. Nalisnick**, and J. M. Hernández-Lobato. Learning Generative Models with Invariance to Symmetries. *Symmetry and Geometry in Neural Representations*, NeurIPS 2022.

- 19. S. Wang and **E. Nalisnick**. Active Learning for Multilingual Fingerspelling Corpora. *Adaptive Experimental Design and Active Learning in the Real World*, ICML 2022.
- 20. R. Verma, D. Barrejón, and **E. Nalisnick**. On the Calibration of Learning to Defer to Multiple Experts. *Human-Machine Collaboration and Teaming*, ICML 2022.
- 21. J. U. Allingham and **E. Nalisnick**. A Product of Experts Approach to Early-Exit Ensembles. *Dynamic Neural Networks*, ICML 2022.
- 22. P. Manggala, H. Hoos, and **E. Nalisnick**. Bayesian Weak Supervision via an Optimal Transport Approach. *Human-Machine Collaboration and Teaming*, ICML 2022.
- 23. U. Khurana, I. Vermeulen, **E. Nalisnick**, M. van Noorloos, and A. Fokkens. Hate Speech Criteria: A Modular Approach to Task-Specific Hate Speech Definitions. *Online Abuse and Harms*, NAACL 2022.
- 24. S. Amiri, A. Belloum, **E. Nalisnick**, S. Klous, and L. Gommans. On the Impact of Non-IID Data on the Performance and Fairness of Differentially Private Federated Learning. *Dependable and Secure Machine Learning*, DSN 2022.
- 25. U. Khurana, **E. Nalisnick**, and A. Fokkens. How Emotionally Stable is ALBERT? Testing Robustness with Stochastic Weight Averaging on a Sentiment Analysis Task. *Evaluation and Comparison of NLP Systems*, EMNLP 2021.
- 26. P. Manggala, H. Hoos, and **E. Nalisnick**. Bayesian Regression from Multiple Sources of Weak Supervision. *Machine Learning for Data*, ICML 2021.
- 27. Y. Zhang and E. Nalisnick. On the Inconsistency of Bayesian Inference for Misspecified Neural Networks. *Symposium on Advances in Approximate Bayesian Inference*, 2021.
- 28. **E. Nalisnick**, A. Matsukawa, Y. W. Teh, and B. Lakshminarayanan. Detecting Out-of-Distribution Inputs to Deep Generative Models Using Typicality. *Bayesian Deep Learning*, NeurIPS 2019.
- 29. **E. Nalisnick** and J. M. Hernández-Lobato. Automatic Depth Determination for Bayesian ResNets. *Bayesian Deep Learning*, NeurIPS 2018.
- 30. O. Rybakov, V. Mohan, A. Misra, S. LeGrand, R. Joseph, K. Chung, S. Singh, Q. You, **E. Nalisnick**, L. Dirac, and R. Luo. The Effectiveness of a Two-Layer Neural Network for Recommendations. Workshop Track, ICLR 2018.
- 31. D. Ji, **E. Nalisnick**, and P. Smyth. Mondrian Processes for Flow Cytometry Analysis. *Machine Learning for Health*, NeurIPS 2017.
- 32. **E. Nalisnick** and P. Smyth. Variational Inference with Stein Mixtures. *Advances in Approximate Bayesian Inference*, NIPS 2017.
- 33. E. Nalisnick and P. Smyth. The Amortized Bootstrap. Implicit Models, ICML 2017.

34. **E. Nalisnick**, L. Hertel, and P. Smyth. Approximate Inference for Deep Latent Gaussian Mixtures. *Bayesian Deep Learning*, NeurIPS 2016.

35. J. Park, M. Blume-Kohout, R. Krestel, **E. Nalisnick**, and P. Smyth. Analyzing NIH Funding Patterns over Time with Statistical Text Analysis. *Scholarly Big Data*, AAAI 2016.

#### THESES

- 1. **E. Nalisnick**. On Priors for Bayesian Neural Networks. *Doctoral Dissertation*, University of California, Irvine, 2018.
- 2. **E. Nalisnick**. Automatic Methods for Tracking Sentiment Dynamics in Plays. *Master's Thesis*, Lehigh University, 2013.
- 3. **E. Nalisnick**. A Combinatorial Explanation for a Conjecture of Fomin and Zelevinsky. *Honors Thesis*, Lehigh University, 2012.

#### **PATENTS**

1. E. M. H. Elnahrawy, V. Mohan, and **E. Nalisnick**. Generation and Use of Model Parameters in Cold-Start Scenarios. U.S. Patent Number 10,726,334. 28 July 2020.

## **Invited Talks**

1.	On the Calibration of Learning-to-Defer Systems, Univ. of California, Riverside	2022
2.	Towards Informative Priors for Bayesian Deep Learning, Dagstuhl Seminar	2022
3.	On the Calibration of Learning-to-Defer Systems, Univ. of Manchester, Stat. Seminar	2022
4.	Predictive Complexity Priors, University of Edinburgh, ANC Seminar	2021
5.	Predictive Complexity Priors, Generative Models and Uncertainty Quantification	2021
6.	Predictive Complexity Priors, Imperial College Statistics Seminar	2021
7.	Predictive Complexity Priors, Alan Turing Institute	2020
8.	Detecting Distribution Shift with Deep Generative Models, Sydney ML Meetup	2020
9.	Detecting Distribution Shift with Deep Generative Models, INNF+, ICML Workshop	2020
10.	Building and Critiquing Models for Probabilistic Deep Learning, Gatsby Unit, UCL	2020
l1.	Building and Critiquing Models for Probabilistic Deep Learning, Carnegie Mellon Univ.	2020
12.	Building and Critiquing Models for Probabilistic Deep Learning, Univ. of North Carolina	2020
13.	Deep Learning & Statistics: Bridging the Gap with Prob. Structure, Univ. of Amsterdam	2020
14.	Deep Learning & Statistics: Bridging the Gap with Prob. Structure, UC Santa Barbara	2020
15.	Deep Learning Under Covariate Shift, UCI AI/ML SEMINAR	2019
16.	Normalizing Flows for Tractable Probabilistic Modeling and Inference, T-PRIME, NEURIPS	2019

17.	Deep Learning: A Synthesis from Probabilistic Foundations, RAND CORP STATS. SEMINAR	2019
18.	$\label{thm:condition} \textbf{Evaluating Deep Generative Models on Out-of-Distribution Inputs, Oxford Stats. Seminar}$	2019
19.	Do Deep Generative Models Know What They Don't Know?, CAMAIML (MSR CAMBRIDGE)	2019
20.	Do Deep Generative Models Know What They Don't Know?, Cambridge LTL Seminar	2019
21.	Structured Shrinkage Priors for Neural Networks, Imperial College Statistics Seminar	2018
22.	Deep Learning: A Synthesis from Probabilistic Foundations, UCI Statistics Seminar	2018
23.	Approximate Inference for Frequentist Uncertainty Estimation, SoCal ML Symposium	2017
24.	Deep Generative Models with Stick-Breaking Priors, UCI AI/ML SEMINAR	2017
25.	Alternative Priors for Deep Generative Models, OpenAI	2017