Research Scientist

Machine Learning and Inference Research Team

Netflix Research

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PHONE: +1 (607) 442 2517

Research Interests

Machine Learning to improve Decision-Making for User-Interactive Systems Reinforcement Learning • Causal Reasoning • Machine Learning Applications

Education

2011-2017 Cornell University

Ph.D. in Computer Science

- Graduate Minor in Applied Math
- · Advisor: Thorsten Joachims
- Thesis: Counterfactual Evaluation and Learning from Logged User Feedback
- Grade Point Average: 4.187 / 4.3
- Committee: Thorsten Joachims, Johannes Gehrke, Éva Tardos, Robert Kleinberg

2014 Cornell University

M.Sc. in Computer Science

2006-2010 Indian Institute of Technology, Bombay

B.Tech. in Computer Science & Engineering

- Thesis: Learning Many-Many Matchings
- Advisor: Soumen Chakrabarti
- Cumulative Performance Index : 9.32 / 10

Awards

2020	Best Paper at ICLR Workshop on Trustworthy Machine Learning
2017	Nominated by Cornell University for The ACM Doctoral Dissertation Award
2017	Best Paper at The 10th ACM International Conference on Web Search and Data Mining
2009	OP Jindal Scholarship for excellence in leadership
2006	CBSE Merit Scholarship for excellence in All India Engineering Entrance Examinations

Industry Experience

Research Scientist, Machine Learning and Inference Research Team at Netflix Research
Principal Researcher, Augmented Learning and Reasoning Group at Microsoft Research

- Designed learning algorithms for AI systems using rich feedback
- Developed techniques to personalize multi-stakeholder, teachable AI copilots
- Senior Researcher, Augmented Learning and Reasoning Group at Microsoft Research @ Redmond
- Pioneered Causal RL algorithms for resource allocation, which can save Azure \$50M+ annually
- Modularized ML pipelines using new causal ML insights, and earned Bing Ads \$60M+ annually

Researcher, Reinforcement Learning group at Microsoft Research AI

- Founded the Reinforcement Learning group in Redmond
- Designed RL-powered videogame AI shipped with Xbox games like Forza Motorsport 6 and Minecraft; spotlighted and reviewed by Bill Gates and Satya Nadella
- Causal ML for slate recommendation, used by Netflix, Spotify, etc. and available in Personalizer Research Intern, Machine Learning group at Microsoft Research NYC
- Developed off-policy estimators that evaluate policies for contextual combinatorial bandits
- Mentor: Miroslav Dudík and John Langford

2015

2020-2023

2017-2020

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Research Intern, Computer Human Interactive Learning group at Microsoft Research Redmond 2013 • Created interpretable text classification models that are teachable by novice users • Mentor: David Grangier and Carlos Garcia Research Intern, Search Labs at Microsoft Research Silicon Valley Center 2012 • Explored methods to automatically augment textbooks with relevant high quality videos · Mentor: Krishnaram Kenthapadi, and Rakesh Agrawal, Sreenivas Gollapudi and Anitha Kannan Strategist, Tower Research Capital 2010-2011 · Conceptualized and implemented several profitable automated high frequency trading systems • Wrote high performance protocol implementations for many electronic trading exchanges · Created critical monitoring, alerting and broadcasting systems Software Development Engineer (Testing) Intern, Microsoft R& D India Development Center 2009 · With the Office Mobile team, in charge of Excel Mobile testing and performance benchmarking · Automated stress-tests on my own initiative that improved test team productivity many-fold Teaching Summer Graduate School on Mathematics of Machine Learning 2019 · Co-organized with Sébastien Bubeck, Anna Karlin Microsoft AI-611 Advanced Projects 2017-2019 • Instructor, multi-part lectures on Bandits and Reinforcement Learning • Mentored 10 product teams to execute high-impact ML projects Microsoft edX course on Reinforcement Learning 2017 · Instructor, Bandits module Tutorial at The 39th International ACM SIGIR Conference 2016 · Counterfactual Evaluation and Learning for Search, Recommendation and Ad Placement · Co-taught with Thorsten Joachims Teaching Assistant for CS 4780/5780/6780: Machine Learning, Advanced Machine Learning 2014-2015 • Was awarded both years for exemplary performance as a Graduate Teaching Assistant 2012 Teaching Assistant for CS 2110: Object-Oriented Programming and Data Structures • Homework Czar, in charge of creating, grading and quality control of all homeworks **Publications IOURNALS** Recommendations as Treatments 2021 • Thorsten Joachims, Ben London, Yi Su, Adith Swaminathan, Lequn Wang • AI Magazine by The Association for Advancement of Artificial Intelligence Batch Learning from Logged Bandit Feedback through Counterfactual Risk Minimization 2015 · Adith Swaminathan, Thorsten Joachims • Journal of Machine Learning Research Special Issue in memory of Alexey Chervonenkis Conferences Trace is the New AutoDiff: Unlocking Efficient Optimization of Computational Workflows 2024 • Ching-An Cheng, Allen Nie, Adith Swaminathan • In proceedings of The 38th Annual Conference on Neural Information Processing Systems How to Solve Contextual Goal-Oriented Problems with Offline Datasets? 2024 • Ying Fan, Jingling Li, Adith Swaminathan, Aditya Modi, Ching-An Cheng • In proceedings of The 38th Annual Conference on Neural Information Processing Systems On Overcoming Miscalibrated Conversational Priors in LLM-based ChatBots 2024 • Christine Herlihy, Jennifer Neville, Tobias Schnabel, Adith Swaminathan • In proceedings of The 40th Conference on Uncertainty in Artificial Intelligence Hindsight Learning for MDPs with Exogenous Inputs 2023 · Sean R. Sinclair, Felipe Vieira Frujeri, Ching-An Cheng, Luke Marshall, Hugo Barbalho, Jingling Li, Jennifer Neville, Ishai Menache, Adith Swaminathan • In proceedings of The 40th International Conference on Machine Learning

Improving Long-Term Metrics for Recommendation using Short-Horizon Reinforcement Learning 2022 · Bogdan Mazoure, Paul Mineiro, Pavithra Srinath, Reza Sharifi Sedeh, Doina Precup, Adith Swaminathan In proceedings of The European Conference on Machine Learning and Principles and Practice of Knowledge Discovery in Databases Heuristic-Guided Reinforcement Learning 2021 · Ching-An Cheng, Andrey Kolobov, Adith Swaminathan In proceedings of The 35th Annual Conference on Neural Information Processing Systems Provably Good Batch Off-Policy Reinforcement Learning Without Great Exploration 2020 • Yao Liu, Adith Swaminathan, Alekh Agarwal, Emma Brunskill • In proceedings of The 34th Annual Conference on Neural Information Processing Systems 2020 Active Learning for ML-Enhanced Database Systems • Lin Ma, Bailu Ding, Sudipto Das, Adith Swaminathan • In proceedings of The ACM SIGMOD/PODS International Conference on Management of Data Learning Calibratable Policies using Programmatic Style-Consistency 2020 • Eric Zhan, Albert Tseng, Yisong Yue, Adith Swaminathan, Matthew Hausknecht • In proceedings of The 37th International Conference on Machine Learning Working Memory Graphs 2020 · Ricky Loynd, Roland Fernandez, Asli Celikyilmaz, Adith Swaminathan, Matthew Hausknecht • In proceedings of The 37th International Conference on Machine Learning Metareasoning in Modular Systems: On-the-Fly Configuration using Reinforcement Learning 2020 · Aditya Modi, Debadeepta Dey, Alekh Agarwal, Adith Swaminathan, Besmira Nushi, Sean Andrist, Eric Horvitz • In proceedings of The 34th AAAI Conference on Artificial Intelligence Off-Policy Policy Gradient with Stationary Distribution Correction 2019 • Yao Liu, Adith Swaminathan, Alekh Agarwal, Emma Brunskill • In proceedings of The Conference on Uncertainty in Artificial Intelligence A Distillation Approach to Data Efficient Individual Treatment Effect Estimation 2019 • Maggie Makar, Adith Swaminathan, Emre Kıcıman • In proceedings of The 33rd AAAI Conference on Artificial Intelligence Deep Learning with Logged Bandit Feedback 2018 • Thorsten Joachims, Adith Swaminathan, Maarten de Rijke • In proceedings of The 6th International Conference on Learning Representations Unbiased Learning-to-Rank with Biased Feedback 2017 • Thorsten Joachims, Adith Swaminathan, Tobias Schnabel Best Paper Award • In proceedings of The 10th ACM International Conference on Web Search and Data Mining 2017 Off-Policy Evaluation for Slate Recommendation · Adith Swaminathan, Akshay Krishnamurthy, Alekh Agarwal, Miroslav Dudík, John Langford • In proceedings of The 31st Annual Conference on Neural Information Processing Systems Unbiased Comparative Evaluation of Ranking Functions 2016 • Tobias Schnabel, Adith Swaminathan, Peter Frazier, Thorsten Joachims · Best Presentation Award • In proceedings of The 2nd International Conference on the Theory of Information Retrieval Counterfactual Evaluation and Learning for Search, Recommendation and Ad Placement 2016 • Adith Swaminathan, Thorsten Joachims • Tutorial and in proceedings of The 39th International ACM SIGIR Conference on Research and Development in Information Retrieval Recommendations as Treatments: Debiasing Learning and Evaluation 2016 Tobias Schnabel, Adith Swaminathan, Ashudeep Singh, Navin Chandak, Thorsten Joachims • In proceedings of The 33rd International Conference on Machine Learning The Self-Normalized Estimator for Counterfactual Learning 2015 · Adith Swaminathan, Thorsten Joachims • In proceedings of The 29th Annual Conference on Neural Information Processing Systems Counterfactual Risk Minimization: Learning from Logged Bandit Feedback 2015 · Adith Swaminathan, Thorsten Joachims In proceedings of The 32nd International Conference on Machine Learning

Mining Videos from the Web for Electronic Textbooks 2014 • Rakesh Agrawal, Maria Christoforaki, Sreenivas Gollapudi, Anitha Kannan, Krishnaram Kenthapadi, Adith Swaminathan • In proceedings of The 12th International Conference on Formal Concept Analysis Beyond Myopic Inference in Big Data Pipelines 2013 • Karthik Raman, Adith Swaminathan, Johannes Gehrke, Thorsten Joachims • In proceedings of The ACM SIGKDD Conference on Knowledge Discovery and Data mining Temporal Corpus Summarization using Submodular Word Coverage 2012 • Ruben Sipos, Adith Swaminathan, Pannaga Shivaswamy, Thorsten Joachims • In proceedings of The International Conference on Information and Knowledge Management Workshops LLF-Bench: Benchmark for Interactive Learning from Language Feedback 2024 • Ching-An Cheng, Andrey Kolobov, Dipendra Misra, Allen Nie, Adith Swaminathan • In ICLR Workshop on LLM Agents 2024 Combining Open-box Simulation and Importance Sampling for Tuning Large-Scale Recommenders · Kaushal Paneri, Michael Munje, Kailash Singh Maurya, Adith Swaminathan, Yifan Shi • In RecSys Workshop on Causality, Counterfactuals and Sequential Decision-Making The Importance of Directional Feedback for LLM-based Optimizers 2023 • Allen Nie, Ching-An Cheng, Andrey Kolobov, Adith Swaminathan • In NeurIPS Workshop on Foundation Models for Decision Making Interactive Robot Learning from Verbal Correction 2023 • Huihan Liu, Alice Chen, Yuke Zhu, Adith Swaminathan, Andrey Kolobov, Ching-An Cheng • In CoRL Workshop on Language and Robot Learning Towards Modular Machine Learning Pipelines 2023 • Aditya Modi, Jivat Neet Kaur, Maggie Makar, Pavan Mallapragada, Amit Sharma, Emre Kıcıman, Adith Swaminathan • In ICML Workshop on Localized Learning Improved Image Wasserstein Attacks and Defenses 2020 • J. Edward Hu, Adith Swaminathan, Hadi Salman, Greg Yang Best Paper Award • In ICLR Workshop on Trustworthy ML Customizing Scripted Bots: Sample-Efficient Imitation Learning for Human-like Behavior in Minecraft 2019 • Brian Broll, Matthew Hausknecht, Dave Bignell, Adith Swaminathan • In AAMAS Workshop on Adaptive and Learning Agents Multi-Preference Actor Critic 2018 • Ishan Durugkar, Matthew Hausknecht, Adith Swaminathan, Patrick MacAlpine • In NeurIPS Workshop on Deep Reinforcement Learning Large-scale Validation of Counterfactual Learning Methods: A Test-Bed 2016 • Damien Lefortier, Adith Swaminathan, Xiaotao Gu, Thorsten Joachims, Maarten de Rijke • In NeurIPS Workshop on Inference and Learning of Hypothetical and Counterfactual Interventions in Complex Systems Unbiased Ranking Evaluation on a Budget 2015 • Tobias Schnabel, Adith Swaminathan, Thorsten Joachims • In proceedings of The 24th International Conference on World Wide Web PRE-PRINTS AutoAttacker: An LLM-guided System to Implement Automatic Cyber-attacks 2024 · Jiacen Xu, Jack W. Stokes, Geoff McDonald, Xuesong Bai, David Marshall, Siyue Wang, Adith Swaminathan, Zhou Li NAIL: A General Interactive Fiction Agent 2019

· Matthew Hausknecht, Ricky Loynd, Greg Yang, Adith Swaminathan, Jason D. Williams

• Winner of the CIG 2018 Text-Based Adventure AI Competition

	Patents
2024	Updating Computational Workflow using Trace Feedback
•	Ching-An Cheng, Allen Nie, Adith Swaminathan, Ahmed Awadallah
2023	Cybersecurity Engine in a Security Management System
	• Jack W. Stokes, Geoff McDonald, David Marshall, Siyue Wang, Jiacen Xu, Adith Swaminathan
2020	Leveraging Query Executions to Improve Index Recommendations
	• Bailu Ding, Sudipto Das, Surajit Chaudhuri, Vivek R Narasayya, Ryan Marcus, Lin Ma, <i>Adith Swaminathan</i>
2017	Computational Query Modeling and Action Selection
	• Alekh Agarwal, Miroslav Dudík, Akshay Krishnamurthy, John Langford, <i>Adith Swaminathan</i>
	Invited Talks
2023	Learning Algorithms for LLM-Augmented Systems
	Impromptu Talk and Fireside Chat with Soumen Chakrabarti
	At Indian Symposium on Machine Learning; Mumbai, India
2022	Hindsight Learning for Adaptive Systems
	At Toyota Technological Institute Beyond RL Workshop; Chicago, U.S.A.
2021	Designer-friendly Machine Learning and Reinforcement Learning for Videogames
	At AI and Gaming Research Summit; Redmond, U.S.A.
2020	Doing the Best with the Data we Have
	At Rossi Seminar at Booth School; Chicago, U.S.A.
2020	Evaluating and Optimizing Recommender Systems with Logged User Behavior
	At Emory University; Atlanta, U.S.A.
2019	Some Recent Advances in Learning from User Behavior
	At Indian Institute of Technology Bombay; Mumbai, India
2019	Bandits, Reinforcement Learning and Causal Inference
	At INFORMS Annual Meeting; Seattle, U.S.A.
2019	Counterfactual Reasoning for Recommendation
	At Next Generation Recommender Systems Workshop; Mountain View, U.S.A.
2019	Data Efficient Causal Effect Estimation
	At ICERM Tripods Workshop on Machine Learning in Health Research; Providence, U.S.A.
2018	Fixing Biases in Extreme Classification
2019	At The Dagstuhl Seminar on Extreme Classification; Wadern, Germany BanditNet: Deep Learning from Logged Bandit Feedback
2018	
	At California Institute of Technology; Pasadena, U.S.A. At Spotify Machine Learning Day; Stockholm, Sweden
	At Workshop on Personalization, Recommendation and Search; Los Gatos, U.S.A.
2017	Building Recommenders and Search Engines by Re-using Logged User Feedback
2017	Keynote
	At Workshop on Machine Learning Methods for Recommender Systems; Houston, U.S.A.
2017	Causal Data Mining
2017	At INFORMS Annual Meeting; Houston, U.S.A.
2016	Preferences and Counterfactuals
_010	At The 28th European Conference on Operational Research; Poznan, Poland
2016	Counterfactual Risk Minimization for Interactive Learning Systems
	At The Search Engines Amsterdam Meetup; Amsterdam, The Netherlands
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	Community Activities

Co-organized RecSys REVEAL Workshops on Reinforcement Learning for Recommendation
Co-organized NeurIPS, ICML Workshops on Causality and Machine Learning
Co-organized ICML 2019 Workshop on Real-world Sequential Decision Making
Co-organized CrowdAI Challenge on Counterfactual Policy Learning for Display Advertising
Senior Area Chair: AAAI

Area Chair: ICML, NeurIPS, ICLR 2021-2025 Reviewer: NeurIPS, KDD, ICML, AISTATS, AAAI 2014-2020 Reviewer: ICLR, WSDM, JAIR, ALT, WIML 2018-2020 Reviewer: ICTIR, EVIA, DIR 2015-2016

Other Activities

Created and co-organized the Microsoft Redmond Campus Photo Challenge to foster inclusion 2022 among interns during the COVID-19 pandemic

Organized the Microsoft Research Reinforcement Learning Reading Group 2017-2022 Created the Microsoft Research AI Seminar and the Distinguished Lecture Series 2017-2018

Board Member and Webmaster of the Society for the Promotion of Indian Classical Music And 2012-2015

Culture Amongst Youth (SPICMACAY) Cornell Chapter

Placed 3rd in the Computer Science Engineering Association Programming Contest, IIT Bombay 2009 2007-2008 Coordinator of the Pro-Nites concerts at Mood Indigo, IIT Bombay's cultural festival

Trained Carnatic singer (a style of Indian Classical Music) 2007-2017

Represented IIT Bombay in Mumbai Division Football Association League (Soccer) and in the Inter-2006-2007 IIT Tournament, and won the Institute Football League twice

Won the Division 2 title in the Mumbai School Sports Association Soccer tournament

Graduate Coursework

Cornell University

2004

- Data-Sparse Matrix Computations
- Algorithmic Game Theory
- · Analysis of Algorithms
- Bayesian Statistics and Data Analysis
- Optimal Learning
- · Advanced Topics in Machine Learning
- Machine Learning Theory
- Counterfactual Machine Learning
- Structure of Information Networks
- Advanced Topic Modeling
- Advanced Language Technologies
- Advanced Database Systems
- Advanced Programming Languages

IIT Bombay

- · Foundations of Machine Learning
- Information Retrieval & Mining for the Web
- New Trends in Information Technology
- · Organization of Web Information
- · Machine Learning: Theory and Methods
- · Statistical Relational Learning
- Advanced Machine Learning
- · Decision Analysis and Game Theory
- Program Analysis

References

Paul Bennett

- Director of Research
- Spotify, Boston
- email: paulb@alumni.cmu.edu

Jennifer Neville

- Partner Research Manager
- Microsoft Research, Redmond
- email: jenneville@microsoft.com