Daniel Russo

Education

2011 - 2015 Stanford University, Stanford, CA.

PhD in Management Science and Engineering Concentration area: Operations Research Advisor: Benjamin Van Roy

2007 - 2011 University of Michigan, Ann Arbor, MI.

Bachelor of Science in Economics (with highest honors) and Mathematics (with honors)

Employment

Since 2017 Columbia Business School, New York, NY.

Current title: Philip H. Geier Jr. Associate Professor – Decision Sciences, Risk and Operations Division

Since 2020 **Spotify**, New York, NY.

Consultant, Staff Machine Learning Engineer.

2016-2017 Kellogg School of Management, Northwestern University, Evanston, IL.

Assistant Professor – Department of Managerial Economics, Decision Sciences, and Operations

2015-2016 Microsoft Research, Cambridge, MA.

Postdoctoral Research Scientist

2013 oDesk (now Upwork), Redwood City, CA.

Research Intern

Worked on automated skills testing system to evaluate hundreds of thousands of candidates in oDesk's internet labor market. Developed algorithm for adaptively serving questions to users and a method for scoring tests.

2011 Charles River Associates, Boston, MA.

Summer Analyst – Competition and Antitrust practice

Research Interests

Sequential decision making under uncertainty, Reinforcement learning, Multi-armed bandits, Stochastic Control, Recommender systems.

Preprints.

- C. Qin and D. Russo, Adaptive Experimentation in the Presence of Exogenous Nonstationary Variation. Major revision requested at Management Science
- L. Maystre, D. Russo, and Y. Zhao, Optimizing Audio Recommendations for the Long-Term: A Reinforcement Learning Perspective. Major revision requested at Management Science.
- M. Alvo, D. Russo, and Y. Kanoria, Neural Inventory Control in Networks via Hindsight Differentiable Policy Optimization.
- C. Qin and D. Russo, Optimizing Adaptive Experiments: A Unified Approach to Regret Minimization and Best-Arm Identification. Submitted.

- S. Min, and D. Russo, An Information-Theoretic Analysis of Nonstationary Bandit Learning. Submitted.
- S. Min, C. Moallemi, D. Russo, Policy gradient optimization of Thompson sampling policies. Submitted
- D. Cheikhi and D. Russo, On the Limited Representational Power of Value Functions and its Links to Statistical (In)Efficiency. Submitted

Published Journal Papers

- J. Bhandari and D. Russo, Global Convergence Guarantees for Policy Gradient Methods. Operations Research, 2024.
- D. Russo, Approximation Benefits of Policy Gradient Methods with Aggregated States. Management Science, Vol. 69, No. 11, pp. 6898-6911, 2023.
- o D. Russo and B. Van Roy, Satisficing in Time Sensitive Bandit Learning. Mathematics of Operations Research, Vol. 47, No. 4, pp. 2815–2839, 2022.
- A. Kim, S. Balserio, D. Russo, On the Futility of Dynamics in Robust Mechanism Design. Operations Research, Vol. 69, No. 6, pp. 1767-1783, 2021
- J. Bhandari, D. Russo, and R. Singal, A Finite Time Analysis of Temporal Difference Learning with Linear Function Approximation. Operations Research, Vol. 69, No. 3, pp. 950-973, 2021.
- D. Russo, A Note on the Equivalence of Upper Confidence Bounds and Gittins Indices for Patient Agents. Operations Research, Vol. 69, No. 1, pp. 273–278, 2021.
- D. Russo, Simple Bayesian Algorithms for Best Arm Identification. Operations Research, Vol. 68, No. 6, pp. 1625–1647, 2020.
 - First place, INFORMS 2016 JFIG paper competition.
- D. Russo and J. Zou, How Much Does Your Data Exploration Overfit? Controlling Bias via Information Usage. IEEE Transactions on Information Theory, Vol. 66, No. 1, pp. 302–323, 2020.
- I. Osband, B. Van Roy, D. Russo, and Z. Wen, Deep Exploration via Randomized Value Functions. Journal of Machine Learning Research, Vol. 20, No. 124, pp. 1-62, 2019
- D. Russo, B. Van Roy, A. Kazerouni, I. Osband, and Z. Wen, A Tutorial on Thompson Sampling. Foundations and Trends in Machine Learning, Vol. 11, No. 1, pp. 1-96, 2018.
- D. Russo and B. Van Roy, Learning to Optimize via Information-Directed Sampling.
 Operations Research, Vol. 66, No. 1, pp. 230-252, 2018.
 - First place, INFORMS George Nicholson 2014 student paper competition.
- D. Russo and B. Van Roy, An Information Theoretic Analysis of Thompson Sampling. Journal of Machine Learning Research Vol. 17, pp. 1-30, 2016.
- D. Russo and B. Van Roy, Learning to Optimize via Posterior Sampling. Mathematics of Operations Research. Vol. 39, No. 4, pp. 1221-1243, 2014.

Published Conference Papers

*Papers displayed in gray are superseded by published journal papers listed elsewhere.

- D. Cheikhi, and D. Russo, On The Statistical Benefits of Temporal Difference Learning. International Conference on Machine Learning (ICML), 2023
 - Full oral presentation; top 2.2% of submissions.
 - Finalist for the INFORMS Applied Probability Society best student paper award.
- S. Min, D. Russo, An Information-Theoretic Analysis of Nonstationary Bandit Learning. International Conference on Machine Learning (ICML), 2023
- T. McDonald, L. Maystre, M. Lalmas, D. Russo, and K. Ciosek, *Impatient Bandits: Optimizing Recommendations for the Long-Term Without Delay*. Conference on Knowledge Discovery and Data Mining (KDD), 2023
- L. Maystre and D. Russo, Temporally-Consistent Survival Analysis, Advances in Neural Information Processing Systems (NeurIPS), 2022
- T. Zhang, D. Russo, A. Zeevi, Learning to Stop with Surprisingly Few Samples, Conference on Learning Theory (COLT), 2021
- J. Bhandari and D. Russo, On the Linear Convergence of Policy Gradient Methods for Finite MDPs. Artificial Intelligence and Statistics (AISTATS), 2021
- o D. Russo, Worst-Case Regret Bounds for Exploration via Randomized Value Functions. Advances in Neural Information Processing Systems (NeurIPS), 2019
- J. Bhandari, D. Russo, and R. Singal, A Finite Time Analysis of Temporal Difference Learning with Linear Function Approximation. Conference on Learning Theory (COLT), 2018.
- C. Qin, D. Klabjan and D. Russo, Improving the Expected-Improvement Algorithm. Advances in Neural Information Processing Systems (NeurIPS), 2017.
- D. Russo and J. Zou, Controlling Bias from Data Exploration via Information Usage. Artificial Intelligence and Statistics (AISTATS), 2016.
 - Full oral presentation; top 7% of submissions
- D. Russo, Simple Bayesian Algorithms for Best Arm Identification. Conference on Learning Theory (COLT), 2016.
- D. Russo and B. Van Roy, Eluder Dimension and the Sample Complexity of Optimistic Exploration. Advances in Neural Information Processing Systems (NeurIPS), 2013.
 Full oral presentation; top 1.4% of submissions.
- I. Osband, D. Russo and B. Van Roy, (More) Efficient Reinforcement Learning Via Posterior Sampling. Advances in Neural Information Processing Systems (NeurIPS), 2013.
- N. Arnosti and D. Russo, Welfare-Improving Cascades and the Effect of Noisy Reviews. Workshop on Internet & Network Economics (WINE), 2013.

Honors and Awards

- Frederick W. Lanchester Prize, 2022:
 - Awarded to 'a paper, a book, or a group of books or papers that represent the "best contribution to operations research and the management sciences published in English in the past five years"
- First place in INFORMS 2016 Junior Faculty Interest Group (JFIG) paper competition
- First place in INFORMS George Nicholson 2014 student paper competition

- Accel Fellowship 2014-2015
- o Stanford Graduate Fellowship 2011-2014
- o University of Michigan 2011 Ferrando Honors Prize:
 - "Awarded annually to the best senior pursuing honors in Economics".

Teaching Experience

2017-2022 Columbia Business School, Columbia University.

Managerial Statistics (MBA Core)

Dynamic Programming and Reinforcement Learning (PhD).

2016-2017 Kellogg School of Management, Northwestern University.

Operations Mangement (MBA Core)

Statistical Learning in Sequential Decision Making (PhD).

Invited Talks

- 2023-2024 University of Southern California Marshall School of Business; MIT Data Science Lab; Kellogg School of Management;
- 2022-2023 Simons Institute for the Theory of Computing at UC Berkeley; ACM Conference on Recommender Systems RecSys; MIT Conference on Digital Experimentation; Hong Kong University of Science and Technology; Carnegie Mellon Operations Research; Columbia Data Science Institute; Winter Operations Conference; McCombs School of Business, UT Austin; University of Chicago Booth School of Business;
- 2021-2022 INSEAD Technology and Operations Management; Penn State Operations Research; National University of Singapore Young Mathematicians Lecture Series; University of Minnesota ISyE; Stanford Information Systems Laboratory; Stochastic Networks, Applied Probability, and Performance (SNAPP) Virtual Seminar; Cornell Tech; Stanford GSB (OIT group); Reinforcement Learning Theory Seminar; University of Washington; Linkedin
- 2020-2021 UC Berkeley Simons Institute for the Theory of Computing Workshop on Mathematics of Online Decision Making; University of Illinois Institute for Data Science and Dynamical Systems; MIT Operation Research Center Colloquium; Data Science Lab; Georgia Tech Machine Learning Seminar; Cornell Tech; Reinforcement Learning Theory Seminar
- 2019-2020 Cornell ORIE; University of Washington ADSI Workshop on Learning and Control; Mostly OM workshop; Microsoft Research New York; Spring talks canceled due to COVID-19 Pandemic
- 2018-2019 Columbia Economics; Two Sigma; Michigan EECS; Institute for Mathematics and its Applications; Princeton ECE;
- 2017-2018 MIT LIDS; Columbia DRO; Netflix;
- 2016-2017 National University of Singapore Decision Sciences department; Google Deep Mind; Uber Data Science; Stanford RL Forum;
- 2015-2016 Duke Decision Sciences; Microsoft Research New York; Chulalongkorn University; Stanford GSB; Harvard SEAS; Michigan IOE; Georgia Tech ISYE; Chicago Booth; USC Marshall; UT Austin ECE; Microsoft Research New England; Columbia IEOR; Columbia DRO; NYU Stern;

2014-2015 Kellogg School of Management; Microsoft Research Redmond; Stanford Information Theory Forum; Allerton Conference—invited session showcasing the "Class of 2014"; NIPS Bayesian Optimization Workshop - speaker and panelist;

2013-2014 NIPS Oral Presentation

Professional Service

- Associate Editor for: *Management Science*, *Operations Research*, and *Stochastic Systems*.
- Ad-hoc Reviewer for:
 - Academic Journals: Operations Research; Management Science; Journal of Machine Learning Research; Stochastic Systems; Electronic Journal of Statistics; Journal of Applied Probability; Computational Optimization and Applications; Production and Operations Management; IEEE Transaction on Information Theory;
 - Machine Learning Conferences: NEURIPS; ICML; COLT; ALT; AISTATS; ICLR (area chair in 2023)

Outside Activities

Columbia Business School requires faculty members to disclose any activities that might present a real or apparent conflict of interest. I currently consult for Spotify.