# LILLIAN J. RATLIFF

Curriculum Vitae

Electrical and Computer Engineering EE426, box: 352500 185 W Stevens Way NE, Seattle, WA 98195 Email: ratliffl@uw.edu ratlifflj.b@gmail.com faculty.washington.edu/ratliffl google scholar profile

## **Educational History**

• Ph.D., Electrical Engineering and Computer Sciences University of California, Berkeley, CA	2015
• M.S., Electrical Engineering	2010
University of Nevada, Las Vegas, NV	
• B.S., Mathematics	2008
summa cumme laude	
University of Nevada, Las Vegas, NV	
• B.S., Electrical Engineering	2008
summa cumme laude	
University of Nevada, Las Vegas, NV	

## **Research Area**

- **Expertise**: core areas of Learning and Decision-Making, Game Theory and Economics, Control Theory, Statistics and Optimization, and at their intersection.
- Application areas: currently include intelligent infrastructure systems (e.g., urban mobility, curb-side management, autonomous vehicles, congestion modeling), supply chain and logistics, human-machine and machine-machine interaction, mechanism design, multi-agent reinforcement learning, online optimization and sequential decision-making in multi-sided platforms and digitally mediated marketplaces.

## **Academic Experience**

• Associate Professor, Electrical and Computer Engineering University of Washington, Seattle, WA	Sept 2022–
<ul> <li>Adjunct Associate Professor, Allen School of Computer Science and Engineering University of Washington, Seattle, WA</li> </ul>	Sept 2022–
• Adjunct Associate Professor, Aeronautics & Astronautics University of Washington, Seattle, WA	Sept 2022–
• Adjunct Assistant Professor, Aeronautics & Astronautics University of Washington, Seattle, WA	Jan–Sept 2022
• Adjunct Assistant Professor, Allen School of Computer Science and Engineering University of Washington, Seattle, WA	2020-2022
• Assistant Professor, Electrical and Computer Engineering University of Washington, Seattle, WA	2016-2022

• Affiliate Assistant Professor, Electrical and Computer Engineering University of Washington, Seattle, WA	2015-2016
• Postdoctoral Researcher, Electrical Engineering and Computer Sciences University of California, Berkeley, Berkeley, CA	2015-2016
• Graduate Student Researcher, Electrical Engineering and Computer Sciences University of California, Berkeley, Berkeley, CA	2010 - 2015

# Honors and Awards

• Junior Faculty Award College of Engineering, UW	2021
• Recipient of the Dhanani Endowed Faculty Fellowship	2020
• Office of Naval Research Young Investigator Award	2020
• National Academy of Engineering, China-America Frontiers of Engineering, Invited Speaker	2019
• National Science Foundation CAREER Award	2019
• National Science Foundation CISE Research Initiation Initiative Award	2017
• National Science Foundation Graduate Research Fellowship	2009

# **Industry Experience**

• Visiting Researcher, Microsoft Research, Research for Industry Team	2021-present
• C3.AI, Consulting, Machine Learning and Decision Making	2014
• Cirque du Soleil, Engineering Consulting	2009-2010
• Team Consulting, LLC	2008-2010

# Publications

**Key**: <sup>*a*</sup>students significantly advised; <sup>*b*</sup>postdoctoral researchers significantly advised; <sup>*c*</sup>UW collaborator; <sup>*d*</sup>external collaborator; <sup>*\**</sup>equal contribution google scholar #: number of citations reported on Google Scholar.

number of citations is only reported only if > 10

<sup>L</sup>: lead faculty on paper; <sup>CL</sup>: co-lead faculty on paper

Current *h*-index: 21 (Google Scholar)

## Journal Quality Publications (Top Tier CS Conferences):

Publications in this section are designated journal quality publications in that they are at top tier conferences where papers are viewed as the end product of the research.

- [JQ15] Tanner Fiez<sup>a</sup>, Chi Jin<sup>d</sup>, Praneeth Netrapalli<sup>d</sup>, Lillian J. Ratliff. Minimax Optimization with Smooth Algorithmic Adversaries. Proceedings of the International Conference on Learning Representations (ICLR), 2022 [acceptance rate 30%]
- [JQ14] Chinmay Maheshwari<sup>a</sup>, Chih-Yuan (Frank) Chiu<sup>a</sup>, Eric Mazumdar<sup>a,d</sup>, S. Shankar Sastry<sup>d</sup>, Lillian J. Ratliff<sup>L</sup>. Zeroth-Order Methods for Convex-Concave Minmax Problems: Applications to Decision-Dependent Risk Minimization, Proceedings of the Artificial Intelligence and Statistics Conference (AISTATS) 2022. [acceptance rate 29%] arXiv: 2106.09082

- [JQ13] Adhyyan Narang<sup>a,\*</sup>, Evan Faulkner<sup>a,\*</sup>, Dmitriy Drusvyatskiy<sup>c</sup>, Maryam Fazel<sup>c</sup>, Lillian J. Ratliff<sup>L</sup>. Learning in Decision Dependent Montone Games. Proceedings of the Artificial Intelligence and Statistics Conference (AISTATS), 2022. [acceptance rate 29%] [Alt. Title: Multiplayer Performative Prediction: Learning in Decision-Dependent Games] arXiv: 2201.03398
- [JQ13] Liyuan Zheng<sup>a</sup>, Tanner Fiez<sup>a</sup>, Zane Alumbaugh<sup>a</sup>, Benjamin Chasnov<sup>a</sup>, Lillian J. Ratliff<sup>L</sup>. Stackelberg Actor-Critic: Game-Theoretic Reinforcement Learning Algorithm. Proceedings of the AAAI Conference on Artificial Intelligence (AAAI), 2022. [acceptance rate 15%]
- [JQ12] Mitas Ray, Lillian J. Ratliff<sup>L</sup>, Maryam Fazel<sup>c</sup>, Dmitriy Drusvyatskiy<sup>c</sup>. Decision-Dependent Risk Minimization in Geometrically Decaying Dynamic Environments, Proceedings of the AAAI Conference on Artificial Intelligence (AAAI), 2022. [acceptance rate 15%]
- [JQ11] Tanner Fiez<sup>a,\*</sup>, Lillian J. Ratliff<sup>\*</sup>, Eric Mazumdar<sup>a,d</sup>, Adhyyan Narang<sup>a</sup>, Evan Faulkner<sup>a</sup>. Global Convergence in Nonconvex-Nonconcave Games, Advances in Neural Information Processing Systems (NeurIPS), 2021. [acceptance rate 26%]
- [JQ10] Tanner Fiez<sup>a</sup>, Ryann Sim<sup>a</sup>, Stratis Skoulakis, Georgios Piliouras<sup>CL</sup>, Lillian J. Ratliff<sup>CL</sup>. Online Learning in Periodic Zero-Sum Games, Advances in Neural Information Processing Systems (NeurIPS), 2021. [acceptance rate 26%]
- [JQ9] Tanner Fiez<sup>a,\*</sup>, Lillian J. Ratliff<sup>\*</sup>. Local Convergence Analysis of Gradient Descent Ascent with Finite Timescale Separation, International Conference on Learning Representations (ICLR), 2021. [acceptance rate 28%] arXiv: 2009.14820 (Alt Title: Gradient Descent-Ascent Provably Converges to Strict Local Minmax Equilibria with a Finite Timescale Separation) google scholar #: 26
- [JQ8] Stratis Skoulakis, Tanner Fiez<sup>a</sup>, Ryann Sim, Georgios Piliouras<sup>CL</sup>, and Lillian J. Ratliff<sup>CL</sup>. Evolutionary Game Theory Squared: Evolving Agents in Endogenously Evolving Games, AAAI Conference on Artificial Intelligence, 2021. arXiv: 2012.08382 [acceptance rate 21.4%]
- [JQ7] Tanner Fiez<sup>a</sup>, Benjamin Chasnov<sup>a</sup>, and Lillian J. Ratliff. Implicit Learning Dynamics in Stackelberg Games: Equilibria Characterization, Convergence Analysis, and Empirical Study. International Conference on Machine Learning (ICML), arXiv: 1906.01217, 2020. google scholar #: 92 [acceptance rate 21.8%]
- [JQ6] Tanner Fiez<sup>a</sup>, Nihar Shah<sup>d,CL</sup>, and Lillian J. Ratliff<sup>CL</sup>. A Super<sup>\*</sup> Algorithm to Determine Orderings of Items to Show Users. Uncertainty in Artificial Intelligence (UAI), 2020. google scholar #: 32 [acceptance rate 27%]
- [JQ5] Eric Mazumdar\*, Lillian J. Ratliff\*,<sup>L</sup>, Shankar Sastry<sup>d</sup>, Michael I. Jordan<sup>d</sup>. Policy Gradient in Linear Quadratic Dynamic Games Has No Convergence Guarantees. International Conference on Autonomous Agents and Multi-Agent Systems (AAMAS), 2020. google scholar #: 24 [acceptance rate 24%]
- [JQ4] Tanner Fiez<sup>a</sup>, Lalit Jain<sup>c</sup>, Kevin Jamieson<sup>c,CL</sup>, and Lillian J. Ratliff<sup>CL</sup>. Sequential Experimental Design for Transductive Linear Bandits. Advanced in Neural Information Processing Systems (NeurIPs), arXiv: 1906.08399, 2019. google scholar #: 61 [acceptance rate 21%]
- [JQ3] Benjamin Chasnov<sup>a,\*</sup>, Lillian J. Ratliff<sup>\*,L</sup>, Eric Mazumdar<sup>a</sup>, and Samuel Burden<sup>c</sup>. Convergence Guarantees for Gradient-Based Learning in Continuous Games. Uncertainty in Artificial Intelligence (UAI), 2019. [acceptance rate 26%] google scholar #: 27
- [JQ2] Tanner Fiez<sup>a</sup>, Shreyas Sekar<sup>b</sup>, Liyuan Zheng<sup>a</sup>, Lillian J. Ratliff. Combinatorial Bandits for Incentivizing Agents with Dynamic Preferences. Uncertainty in Artificial Intelligence (UAI), 2018. [acceptance rate 30%]
- [JQ1] Ming Jin, Lillian J. Ratliff, Ioannis C. Konstantakopoulos, Costas Spanos, S. Shankar Sastry. REST: A Reliable Estimation and Stopping Time Algorithm for Social Game Experiments. In: Proceedings of the ACM/ IEEE International Conference on Cyber-Physical Systems, pp. 90–99, 2015. doi: 10.1145/2735960.2735974 [acceptance rate 26%]

#### Journal publications:

- [J15] Yue Yu<sup>a</sup>, Daniel Calderone, Sarah Li<sup>a</sup>, Lillian J. Ratliff, Behcet Acikmese<sup>c</sup>. Variable Demand and Multicommodity Flow in Markovian Network Equilibrium. Automatica, 2022 doi: 10.1016/j.automatica.2022.110224
- [J14] Lillian J. Ratliff, Tanner Fiez<sup>a</sup>. Adaptive Incentive Design. IEEE Transactions on Automatic Control, submitted Jan. 2018; accepted for publication Oct. 2020. doi: 10.1109/TAC.2020.3027503; google scholar #: 17
- [J13] Esther Ling, Liyuan Zheng<sup>a</sup>, Lillian J. Ratliff<sup>CL</sup>, Samuel Coogan<sup>d,CL</sup>. Koopman Operator Applications in Signalized Traffic Systems. IEEE Transactions on Intelligent Transportation Systems, submitted Jan. 2019; accepted for publication Oct. 2020. doi: 10.1109/TITS.2020.3032880; arXiv: 1803.04008
- [J12] Sarah Li<sup>a</sup>, Lillian J. Ratliff<sup>L</sup>, Behçet Açikmeşe<sup>c</sup>. Disturbance Decoupling for Gradient-based Multi-Agent Learning with Quadratic Costs. IEEE Control Systems Letters (L-CSS), Vol. 5, No. 1, 2020. doi: 10.1109/LCSYS.2020.3001240
- [J11] Shreyas Sekar<sup>b</sup>, Liyuan Zheng<sup>a</sup>, Lillian J. Ratliff<sup>CL</sup>, Baosen Zhang<sup>c,CL</sup>. Uncertainty in Multi-Commodity Routing Networks: When does it help?. IEEE Transactions on Automatic Control, (accepted Dec.), 2019. doi: 10.1109/TAC.2019.2962102; arXiv: 1709.08441 google scholar #: 13
- [J10] Eric Mazumdar<sup>a,\*</sup>, Lillian J. Ratliff<sup>\*,L</sup>, S. Shankar Sastry<sup>d</sup>. On Gradient-Based Learning in Continuous Games. SIAM Journal on Mathematics of Data Science (SIMODS), Vol. 1, No. 2, 2019, doi: 10.1137/18M1231298; arXiv: 1804.05464; google scholar #: 95
- [J9] Tanner Fiez<sup>a</sup>, Lillian J. Ratliff. Gaussian Mixture Models of Parking Demand. IEEE Transactions on Intelligent Transportation Systems, 2019. doi: 10.1109/TITS.2019.2939499; arXiv: 1712.01263
- [J8] Lillian J. Ratliff, Eric Mazumdar<sup>a</sup>. Inverse Risk-Sensitive Reinforcement Learning. IEEE Transactions on Automatic Control, 2019. doi: 10.1109/TAC.2019.2926674; arXiv: 1703.09842v3; google scholar #: 14
- [J7] Tyler Westenbroek<sup>a</sup>, Roy Dong<sup>d</sup>, Lillian J. Ratliff<sup>L</sup>, S. Shankar Sastry<sup>d</sup>. Competitive Statistical Estimation with Strategic Data Sources. IEEE Transactions on Automatic Control, Vol. 65, No. 4, 2020 (submitted 2018) doi: 10.1109/TAC.2019.2922190; arXiv: 1704.01195; google scholar #: 11
- [J6] Chase Dowling<sup>a</sup>, Lillian J. Ratliff<sup>CL</sup>, Baosen Zhang<sup>CL,c</sup>. Modeling Curbside Parking as a Network of Finite Capacity Queues, IEEE Transactions on Intelligent Transportation Systems, published 8 March 2019. doi: 10.1109/TITS.2019.2900642; google scholar #: 11
- [J5] Lillian J. Ratliff, Roy Dong<sup>d</sup>, Shreyas Sekar<sup>b</sup>, Tanner Fiez<sup>a</sup>. A Perspective on Incentive Design: Challenges and Opportunities, Annual Review of Control, Robotics, and Autonomous Systems, Vol. 2, No. 1, 2019. doi: 10.1146/annurev-control-053018-023634; google scholar #: 19
- [J4] Roy Dong<sup>d</sup>, Alvaro A. Cárdenas<sup>d</sup>, Lillian J. Ratliff, Henrik Ohlsson<sup>d</sup>, S. Shankar Sastry<sup>d</sup>. Quantifying the Utility-Privacy Tradeoff in the Smart Grid, ACM Transactions on Cyber-Physical Systems, Vol. 2, No. 2, June 2018. doi: 10.1145/3185511; arXiv: 1406.2568; google scholar #: 21
- [J3] Ioannis Konstantakopoulos\*, Lillian J. Ratliff\*, Ming Jin, S. Shankar Sastry<sup>d</sup>, and Costas Spanos<sup>d</sup>. A Robust Utility Learning Framework via Inverse Optimization. IEEE Transactions on Control Systems Technology, PP(99):1–17, May 2017. doi: 10.1109/TCST.2017.2699163; google scholar #: 30
- [J2] Lillian J. Ratliff, Samuel A. Burden<sup>c</sup>, S. Shankar Sastry<sup>d</sup>. On the Characterization of Local Nash Equilibria in Continuous Games. IEEE Transactions on Automatic Control, 16(8):2301-2307, Aug. 2016. doi: 10.1109/TAC.2016.2583518; google scholar #: 112
- [J1] Pushkin Kachroo, Lillian J. Ratliff, and S. Shankar Sastry<sup>d</sup>. Analysis of the Godunov Based Hybrid Model for Ramp Metering and Robust Feedback Control Design. IEEE Transactions on Intelligent Transportation Systems, 15(5):2132—2142, Oct. 2014. doi: 10.1109/TITS.2014.2310736

#### Journal publications under review:

- [JS4] Adhyyan Narang<sup>a,\*</sup>, Evan Faulkner<sup>a,\*</sup>, Dmitriy Drusvyatskiy<sup>c</sup>, Maryam Fazel<sup>c</sup>, Lillian J. Ratliff<sup>L</sup>. Multi-Learner Performative Prediction: Learning in Decision-Dependent Games, submitted to JMLR, Jan. 2022.
- [JS3] Sarah H.Q. Li<sup>a</sup>, Yue Yu<sup>a</sup>, Daniel Calderone<sup>c</sup>, Bechet Acikmese<sup>c,CL</sup>, Lillian J. Ratliff<sup>CL</sup>. Adaptive Constraint Satisfaction for Markov Decision Process Congestion Games: Application to Transportation Networks, Automatica, under review, 2020.
- [JS2] Yue Yu<sup>a</sup>, Daniel Calderone<sup>c</sup>, Sarah H.Q. Li<sup>a</sup>, Bechet Acikmese<sup>c,CL</sup>, Lillian J. Ratliff<sup>CL</sup>. Variable Demand and Multicommodity Flow in Markovian Network Equilibrium, Automatica, under review, July. 2020.
- [JS1] Mitas Ray<sup>a</sup>, Omid Sadeghi, Lillian J. Ratliff<sup>CL</sup>, Maryam Fazel<sup>c,CL</sup>. Function Design for Improved Competitive Ratio in Online Resource Allocation with Procurement Costs, submitted to INFORMS Journal on Optimization, 2020. arXiv: 2012.12457

#### **Conference publications:**

Note: includes articles from workshops that were both peer-reviewed and archived.

- [C49] Liyuan Zheng<sup>a</sup>, Yuanyuan Shi<sup>a</sup>, Baosen Zhang<sup>CL</sup>, Lillian J. Ratliff<sup>CL</sup>. Safe Reinforcement Learning of Control-Affine Systems with Vertex Networks (L4DC), 2021.
- [C48] Tanner Fiez<sup>a</sup>, Ryann Sim, Stratis Skoulakis, Georgios Piliouras<sup>CL</sup> and Lillian Ratliff<sup>CL</sup>, Lillian J. Ratliff. Online Learning in Periodic Zero-Sum Games: von Neumann vs Poincare, Adaptive and Learning Agents (ALA2021 peer-reviewed workshop), 2021.
- [C47] Stratis Skoulakis, Tanner Fiez<sup>a</sup>, Ryann Sim, Georgios Piliouras<sup>CL</sup> and Lillian J. Ratliff<sup>CL</sup>. Evolutionary Game Theory Squared: Evolving Agents in Endogenously Evolving Zero-Sum Games, Adaptive and Learning Agents (ALA2021 peer-reviewed workshop), 2021.
- [C46] Liyuan Zheng<sup>a</sup>, Tanner Fiez<sup>a</sup>, Zane Alumbaugh<sup>a</sup>, Benjamin Chasnov<sup>a</sup>, Lillian J. Ratliff. Stackelberg Actor-Critic: A Game-Theoretic Perspective, AAAI Reinforcement Learning and Games Workshop, 2021. (peer reviewed)
- [C45] Tanner Fiez<sup>a</sup>, Lillian J. Ratliff. Gradient Descent-Ascent Provably Converges to Strict Local Minmax Equilibria with a Finite Timescale Separation, AAAI Reinforcement Learning and Games Workshop, 2021. arXiv: https://arXiv.org/abs/2009.14820 (peer reviewed)
- [C44] Sarah Li<sup>a</sup>, Lillian J. Ratliff<sup>L</sup>, Behçet Açikmeşe<sup>c</sup>. Disturbance Decoupling for Gradient-based Multi-Agent Learning with Quadratic Costs. IEEE Conference on Decision and Control (CDC), 2020.
- [C43] Benjamin Chasnov<sup>a</sup>, Daniel Calderone<sup>b</sup>, Behçet Açikmeşe<sup>c</sup>, Sam Burden<sup>c</sup> and Lillian J. Ratliff<sup>L</sup>. The Local Stability of Equilibria in Two-Player Continuous Games. IEEE Conference on Decision and Control (CDC), 2020.
- [C42] Liyuan Zheng<sup>a</sup>, Lillian J. Ratliff. Constrained Upper Confidence Reinforcement Learning. Learning for Dynamics and Control (L4DC), 2020. arXiv: 2001.09377 google scholar #: 34
- [C41] Tanner Fiez<sup>a</sup>, Benjamin Chasnov<sup>a</sup>, Lillian J. Ratliff. Convergence of Learning in Stackelberg Games. Smooth Games Optimization and Machine Learning Workshop: Bridging Game Theory and Deep Learning, NeuRIPS, 2019. (peer reviewed, selected for presentation, 1 of 4 selected out of 34 papers).
- [C40] Benjamin Chasnov<sup>a</sup>, Tanner Fiez<sup>a</sup>, Lillian J. Ratliff. Opponent Anticipation via Conjectural Variations. Smooth Games Optimization and Machine Learning Workshop: Bridging Game Theory and Deep Learning, NeuRIPS, 2019. (peer reviewed)
- [C39] Eric Mazumdar<sup>\*,a</sup>, Lillian J. Ratliff<sup>\*,L</sup>, Shankar Sastry<sup>d</sup>, Michael I. Jordan<sup>d</sup>. Policy Gradient in Linear Quadratic Dynamic Games Has No Convergence Guarantees. Smooth Games Optimization and Machine Learning Workshop: Bridging Game Theory and Deep Learning, NeuRIPS, 2019. (peer reviewed)
- [C38] Tanner Fiez<sup>a</sup>, Nihar Shah<sup>d,CL</sup>, and Lillian J. Ratliff<sup>CL</sup>. A Super<sup>\*</sup> Algorithm to Determine Orderings of Items to Show Users. workshop paper for Real-world Sequential Decision Making workshop at ICML, 2019. (peer reviewed)

- [C37] Tyler Westenbroek<sup>a</sup>, Roy Dong<sup>d</sup>, Lillian J. Ratliff. Competitive Statistical Estimation with Strategic Data Sources. ACM Conference on Economics and Computation (EC) Workshop: Learning in the Presence of Strategic Behavior, 2019. (peer reviewed)
- [C36] Shahriar Talebi<sup>a</sup>, Siavash Alemzadeh, Lillian J. Ratliff<sup>CL</sup>, and Mehran Mesbahi<sup>c,CL</sup>. Distributed Learning in Network Games: A Dual Averaging Approach. In Proceedings of the IEEE Conference on Decision and Control, 2019.
- [C35] Sarah H.Q. Li<sup>a</sup>, Daniel Calderone<sup>b</sup>, Lillian J. Ratliff<sup>CL</sup>, and Behcet Acikmese<sup>c,CL</sup>. Sensitivity Analysis for Markov Decision Process Congestion Games. In Proceedings of the IEEE Conference on Decision and Control, 2019. doi: 10.1109/CDC40024.2019.9028933
- [C34] Yagiz Savas<sup>a</sup>, Vijay Gupta<sup>d,CL</sup>, Melkior Ornik<sup>d</sup>, Lillian J. Ratliff<sup>CL</sup>, and Ufuk Topcu<sup>d,CL</sup>. Incentive Design for Temporal Logic Objectives. In Proceedings of the IEEE Conference on Decision and Control, 2019. doi: 10.1109/CDC40024.2019.9029287
- [C33] Eric Mazumdar<sup>a</sup> and Lillian J. Ratliff. Local Nash Equilibria are Isolated, Strict Local Nash Equilibria in 'Almost All' Zero-Sum Continuous Games. In Proceedings of the IEEE Conference on Decision and Control, 2019. doi: 10.1109/CDC40024.2019.9030203
- [C32] Daniel Calderone<sup>b</sup> and Lillian J. Ratliff. Multi-Dimensional Continuous Type Population Potential Games. IEEE Conference on Decision and Control, 2019. doi: 10.1109/CDC40024.2019.9029519
- [C32] Benjamin Chasnov<sup>a</sup>, Momona Yamagami, Behnoosh Parsa, Lillian J. Ratliff, Samuel Burden<sup>L,c</sup>. Experiments with sensorimotor games in dynamic human/machine interaction, SPIE, 2019.
- [C31] Hui (Sarah) Li<sup>a</sup>, Yue Yu<sup>a</sup>, Daniel Calderone<sup>b</sup>, Lillian J. Ratliff<sup>CL</sup>, Behcet Acikmese<sup>c,CL</sup>. Tolling for Constraint Satisfaction in Markov Decision Process Congestion Games. Proceedings of the American Control Conferences, 2019. doi: 10.23919/ACC.2019.8814925
- [C30] Benjamin Chasnov<sup>a,\*</sup>, Lillian J. Ratliff<sup>L,\*</sup>, Daniel Calderone<sup>b</sup>, Eric Mazumdar<sup>a</sup>, Sam Burden<sup>c</sup>. Finite-Time Convergence of Gradient-Based Learning in Continuous Games, AAAI Workshop on Reinforcement Learning in Games, Jan. 2019. (peer reviewed, selected for presentation)
- [C29] Tanner Fiez<sup>a</sup>, Lillian J. Ratliff<sup>L</sup>, Chase Dowling<sup>a</sup>, and Baosen Zhang<sup>c</sup>. Data-Driven Spatio-Temporal Modeling of Parking Demand. In:Proceedings of the American Control Conference, 2018. doi: 10.23919/ACC.2018.8431681; google scholar #: 14
- [C28] Shreyas Sekar<sup>b</sup>, Liyuan Zheng<sup>a</sup>, Lillian J. Ratliff<sup>CL</sup>, and Baosen Zhang<sup>c,CL</sup>. Uncertainty in Multi-Commodity Routing Networks: When does it help? In: Proceedings of the American Control Conference, 2018. doi: 10.23919/ACC.2018.8430756
- [C27] Eric Mazumdar<sup>\*,a</sup>, Lillian J. Ratliff<sup>\*,L</sup>, Tanner Fiez<sup>a</sup>, and S. Shankar Sastry<sup>d</sup>. Gradient-Based Inverse Risk-Sensitive Reinforcement Learning with Applications. Proceedings of the 56th IEEE Conference on Decision and Control, pp. 5796–5801, 2017. doi: 10.1109/CDC.2017.8264535; google scholar #: 17
- [C26] Chase Dowling<sup>a</sup>, Tanner Fiez<sup>a</sup>, Lillian J. Ratliff<sup>CL</sup>, and Baosen Zhang<sup>c,CL</sup>. Optimizing Curbside Parking Resources Subject to Congestion Constraints. In: Proceedings of the 56th IEEE Conference on Decision and Control, pp. 5080–5085, 2017. doi: 10.1109/CDC.2017.8264412; google scholar #: 13
- [C25] Tyler Westenbroek<sup>a</sup>, Roy Dong<sup>d</sup>, Lillian J. Ratliff<sup>L</sup>, and S. Shankar Sastry<sup>d</sup>. Statistical Estimation in Competitive Settings with Strategic Data Sources. In: Proceedings of the 56th IEEE Conference on Decision and Control, pp. 4994–4999, 2017. doi: 10.1109/CDC.2017.8264398
- [C24] Kamil Nar<sup>\*,a</sup>, Lillian J. Ratliff<sup>\*</sup>, and S. Shankar Sastry<sup>d</sup>. Learning Prospect Theory Value Function and Reference Point of a Sequential Decision Maker. In: Proceedings of the 56th IEEE Conference on Decision and Control, pp. 5770–5775, 2017. doi: 10.1109/CDC.2017.8264531
- [C23] Ioannis Konstantakopoulos<sup>a,\*</sup>, Lillian J. Ratliff<sup>\*</sup>, Ming Jin<sup>a</sup>, and Costas Spanos<sup>d</sup>. Leveraging Correlations in Utility Learning. In: Proceedings of the American Control Conference, pp. 5249– 5256, 2017. doi: 10.23919/ACC.2017.7963770

- [C22] Lillian J. Ratliff, Chase Dowling<sup>a</sup>, Eric Mazumdar<sup>a</sup>, and Baosen Zhang<sup>c</sup>. To observe or not to observe: Queuing game framework for urban parking. Proceedings of the IEEE 55th Conference on Decision and Control, pp. 5286–5291, 2016. doi: 10.1109/CDC.2016.7799079; google scholar #: 16
- [C21] Daniel Calderone, Eric Mazumdar, Lillian J. Ratliff, and S. Shankar Sastry. Understanding the impact of parking on urban mobility via routing games on queue-flow networks. Proceedings of the IEEE 55th Conference on Decision and Control, pp. 7605–7610, 2016. doi: 10.1109/CDC.2016.7799444
- [C20] Ioannis C. Konstantakopoulos<sup>a</sup>, Lillian J. Ratliff, Ming Jin, Costas Spanos, and S. Shankar Sastry. Smart building energy efficiency via social game: a robust utility learning framework for closingthe-loop. In: Proceedings of the 1st International Workshop on Science of Smart City Operations and Platforms Engineering in partnership with Global City Teams Challenge, pp. 1–6, 2016. doi: 10.1109/SCOPE.2016.7515054; google scholar #: 19
- [C19] Ioannis C. Konstantakopoulos<sup>a</sup>, Lillian J. Ratliff, Ming Jin, Costas J. Spanos, and S. Shankar Sastry. Inverse modeling of non-cooperative agents via mixture of utilities. In: Proceedings of the IEEE 55th Conference on Decision and Control, pp. 6327–6334, 2016. doi: 10.1109/CDC.2016.7799243; google scholar #: 18
- [C18] Daniel Calderone, Lillian J. Ratliff, S. Shankar Sastry. Lane Pricing via Decision-Theoretic Lane Changing Model of Driver Behavior, In: Proceedings of the 54th IEEE Conference on Decision and Control, pp. 3457–3462, 2015. doi: 10.1109/CDC.2015.7402754
- [C17] Dexter Scobee, Lillian J. Ratliff, Roy Dong, Henrik Ohlsson, M. Verhaegen, S. Shankar Sastry. Nuclear Norm Minimization for Blind Subspace Identification (N2BSID), In: Proceedings of the 54th IEEE Conference on Decision and Control, pp. 2127–2132, 2015. doi: 10.1109/CDC.2015.7402521 google scholar #: 12
- [C16] Lillian J. Ratliff, Ming Jin, Ioannis Konstantakopoulos, Costas Spanos, and S. Shankar Sastry. Social Game for Building Energy Efficiency: Incentive Design. In: Proceedings of the 52nd Allerton Conference on Communication, Control, and Computing, pp. 1011–1018, 2014. doi: 10.1109/ALLER-TON.2014.7028565; google scholar #: 47
- [C15] Lillian J. Ratliff, Roy Dong, Henrik Ohlsson, Alvaro A. Cardenas, and S. Shankar Sastry. Privacy and Customer Segmentation in the Smart Grid. In: Proceedings of the 53rd IEEE Conference on Decision and Control, pp. 2136–2141, 2014. doi: 10.1109/CDC.2014.7039714
- [C14] Lillian J. Ratliff, Roy Dong, Henrik Ohlsson, and S. Shankar Sastry. Incentive Design and Utility Learning via Energy Disaggregation. In: Proceedings of the International Federation of Automatic Control, vol. 47, no. 3, pp. 3158–3163, 2014. doi: 10.3182/20140824-6-ZA-1003.02557; google scholar #: 32
- [C13] Daniel Calderone, Lillian J. Ratliff, and S. Shankar Sastry. Pricing for Coordination in Open-Loop Differential Games. In: Proceedings of the International Federation of Automatic Control, vol. 47, no. 3, pp. 9001–9006, 2014. doi: 10.3182/20140824-6-ZA-1003.02655
- [C12] Henrik Ohlsson, Lillian J. Ratliff, Roy Dong, and S. Shankar Sastry. Blind Identification via Lifting. In: Proceedings of the International Federation of Automatic Control, vol. 47, no. 3, pp. 10367–10372, 2014. doi: 10.3182/20140824-6-ZA-1003.02567; google scholar #: 12
- [C11] Roy Dong, Lillian J. Ratliff, Henrik Ohlsson, and S. Shankar Sastry. Fundamental Limits of Non-Intrusive Load Monitoring. Proceedings of the 3rd ACM Conference on High Confidence Networked Systems, pp. 11–18, 2014. doi: 10.1145/2566468.2566471; google scholar #: 37
- [C10] Lillian J. Ratliff, Samuel Burden, and S. Shankar Sastry. Genericity and Structural Stability of Non-Degenerate Differential Nash Equilibria. Proceedings of the American Control Conference, pp. 3990–3995, 2014. doi: 10.1109/ACC.2014.6858848; google scholar #: 30
- [C9] Lillian J. Ratliff, Samuel Burden, and S. Shankar Sastry. Characterization and Computation of Local Nash Equilibria in Continuous Games. Proceedings of the 51st Annual Allerton Conference on Communication, Control, and Computing, pp. 917–924, 2013. doi: 10.1109/Allerton.2013.6736623; google scholar #: 178

- [C8] Roy Dong, Lillian J. Ratliff, Henrik Ohlsson, and S. Shankar Sastry. Energy Disaggregation via Adaptive Filtering. Proceedings of the 51st Annual Allerton Conference on Communication, Control, and Computing, pp. 173–180, 2013. doi: 10.1109/Allerton.2013.6736521; google scholar #: 62
- [C7] Roy Dong, Lillian J. Ratliff, Henrik Ohlsson, and S. Shankar Sastry. A Dynamical Systems Approach to Energy Disaggregation. Proceedings of the 52nd IEEE Conference on Decision and Control, pp. 6335–6340, 2013. doi: 10.1109/CDC.2013.6760891; google scholar #: 32
- [C6] Daniel Calderone, Lillian J. Ratliff, and S. Shankar Sastry. Pricing Design for Robustness in Linear-Quadratic Dynamic Games. Proceedings of the 52nd IEEE Conference on Decision and Control, pp. 4349–4354, 2013. doi: 10.1109/CDC.2013.6760558
- [C5] Aaron Bestick, Lillian J. Ratliff, Pan Yan, Ruzena Bajcsy, and S. Shankar Sastry. An Inverse Correlated Equilibrium Framework for Utility Learning in Multiplayer, Noncooperative Settings. Proceedings of the ACM Conference on High Confidence Networked Systems, pp. 9–16, 2013. doi: 10.1145/2461446.2461449
- [C4] Samuel Coogan, Lillian J. Ratliff, Daniel Calderone, Claire Tomlin, S. Shankar Sastry. Energy Management via Pricing in LQ Dynamic Games. Proceedings of the American Controls Conference, pp. 443–448, 2013. doi: 10.1109/ACC.2013.6579877; google scholar #: 39
- [C3] Lillian J. Ratliff, Samuel Coogan, Daniel Calderone, S. Shankar Sastry. Pricing in Linear-Quadratic Dynamic Games. Proceedings of the 50th Annual Allerton Conference on Communication, Control, and Computing, pp. 1798–1805, 2012. doi: 10.1109/Allerton.2012.6483440; google scholar #: 21
- [C2] Lillian J. Ratliff and P. Kachroo. Validating numerically consistent macroscopic traffic models using microscopic data. In: Proceedings of the Transportation Research Board 89th Annual Meeting, 2010. 17p. paper no. 10-2633
- [C1] Daniel P. Cook, Yitung Chen, Lillian J. Ratliff, Huajun Chen, and Jian Ma. Numerical Modeling of EM Pump Efficiency. Proceedings of the ASME Conference, pp. 775–780, 2006. doi: 10.1115/IMECE2006-15174

#### **Conference & journal quality publications under review:**

- [CS2] Sara Dean, Mihaela Curmei, Lillian J. Ratliff, Jamie Morgenstern, Maryam Fazel. Multi-learner risk reduction under endogenous participation dynamics, submitted to NeurIPS, 2022. arXiv: 2206.02667
- [CS1] Dmitriy Druvsyatskiy\*, Maryam Fazel, Lillian J. Ratliff\*. Improved Rates for Derivative Free Gradient Play in Monotone Games, submitted to CDC, 2022. arXiv: 2111.09456

#### Technical Reports not included above:

- [A9] Roy Dong<sup>d</sup>, Lillian J. Ratliff. Approximate Regions of Attraction in Learning with Decision-Dependent Distributions, arXiv: 2107.00055
- [A8] Jingjing Bu, Lillian J. Ratliff<sup>L</sup>, Mehran Mesbahi. Global Convergence of Policy Gradient for Sequential Zero-Sum Linear Quadratic Differential Games, arXiv: 1911.04672, 2019. google scholar #: 24
- [A7] Benjamin Chasnov, Tanner Fiez, Lillian J. Ratliff. Gradient Conjectures for Strategic Multi-Agent Learning. Available Online: Working Paper, 2019.
- [A6] Tanner Fiez<sup>a</sup>, Shreyas Sekar<sup>b</sup>, Lillian J. Ratliff. Correlated Markovian Bandits with Smoothed Reward Feedback, 2018. arXiv: 1803.04008
- [A5] Clay Campaigne, Maximilian Balandat, Lillian J. Ratliff. Welfare Effects of Dynamic Electricity Pricing. 2016. Working Paper, UC Berkeley Tech. Report.
- [A4] Chase Dowling, Tanner Fiez, Lillian J. Ratliff, Baosen Zhang. How much urban traffic is searching for parking? 2017. arXiv: 1702.06156v2; google scholar #: 31
- [A3] Ioannis C. Konstantakopoulos, Lillian J. Ratliff, Ming Jin, S. Shankar Sastry, Costas Spanos. Social game for building energy efficiency: Utility learning, simulation, and analysis. 2014. arXiv: 1407.0727
- [A2] Lillian J. Ratliff, Carlos Barreto, Roy Dong, Henrik Ohlsson, Alvaro A. Cárdenas, and S. Shankar Sastry. Effects of Risk on Privacy Contracts for Demand-Side Management. 2014. arXiv: 1409.7926v3

[A1] Henrik Ohlsson, Lillian J. Ratliff, Roy Dong, Shankar Sastry. Blind Identification of ARX Models with Piecewise Constant Inputs. 2013. arXiv: 1303.6719

#### Chapters in edited books:

- [B1] Roy Dong, Lillian J. Ratliff. Energy Disaggregation and the Utility-Privacy Tradeoff in Big Data Analytics for Power Systems. Editor: Reza Arghandehr and Yuxun Zhou. Elsevier, 2017.
- Theses:
- [T2] Lillian J. Ratliff. Incentivizing Efficiency in Societal-Scale Cyber-Physical Systems. Ph.D. Thesis, University of California, Berkeley, 2015. UC Berkeley Tech Report No.: UCB/EECS-2015-178
- [T1] Lillian J. Ratliff. Conservation-Based Uncertainty Propagation in Dynamic Systems. MS Thesis, University of Nevada, Las Vegas, 2010 UNLV Tech Report No.: 867

## Invited Lectures, Seminars, Panels and Workshops

- 1. Invited talk at American Control Conference on Safety Critical Learning-Based Systems, June 2022
- 2. Invited talk at ICLR workshop on "Gameification and Multi-agent Solutions" April 2022
- 3. Invited talk at UC Berkeley EECS Seminar series, March 2022
- 4. Invited talk at Simons Institute workshop on Learning in the Presence of Strategic Behavior, March 31, 2022: "Beyond Open Loop Algorithm Design: Learning from Decision-Dependent Data"
- 5. Invited talk at UT Austin Seminar Feb 2, 2022: "Closing the Loop in ML: A prelude to learning-based intelligent systems"
- 6. Invited talk at IPAM workshop entitled Mathematics of Collective Intelligence, Feb 15-19 2022: "Learning via Conjectural Variations: A differential perspective on bounded rationality"
- 7. Invited long-term participant in Simons Institute program on "Learning and Games", Spring 2022.
- Invited long-term participant in Simons Institute program on "Learning and Games", Spring 2022. Speaker in Learning and Games Reading group.
- 9. Invited talk at NeurIPS workshop on "Learning in the presence of strategic behavior", Dec. 2021
- 10. Invited talk at MIT OPTML++ Seminar April 21, 2021: "Beyond Open Loop Thinking: A prelude to learning-based intelligent systems"
- 11. Invited panel participant for NSF-PIRE Workshop on NSF-PIRE Workshop: US-Germany CPS Collaborations Assured CPS Autonomy for 3D Urban Transportation: Drones, Flying Cars and Beyond, June 2021
- 12. Invited panel participant on resilient infrastructure systems with AI/IoT in workshop on "Control for societal-scale challenges: Future Directions", June 2021
- Panel: "Theme 3, Resilient infrastructure-systems with AI and IoT"
  - 13. UW ECE Colloquium April 6, 2021 "Beyond Open Loop Thinking: A prelude to learning-based intelligent systems"
  - 14. Invited talk at C3.AI Digital Transformation Institute, March 4th 2021, "Beyond Open Loop Thinking: A prelude to learning-based intelligent systems"
  - 15. Invited talk at AAAI-21 Workshop on Reinforcement Learning in Games
  - 16. Invited talk at UC Berkeley: "Learning-Based Intelligent Systems: Dynamics, Algorithms, Markets", Dec 2020
  - 17. Invited Speaker at INFORMS 2020 Annual Meeting; workshop on 'Online learning and games in electricity networks: from theory to practice', Talk title: Viewing Learning In Markets Through The Lens Of Dynamical Systems,
  - 18. Invited Speaker at Simon's Institute program on Theory of Reinforcement Learning, workshop on Mathematics of Online Decision Making, Fall 2020; Talk Title: Gradient Descent-Ascent Provably Convergences to Strict Local Minmax with Finite Timescale Separation.

- ITA Workshop, Session on 'People, AI, and Fairness': 'Sequential Decision-Making in Two-Sided Platforms: Balancing Competing Objectives', Feb. 2020
- University of California, Berkeley, 'Modeling On-Street Parking: Challenges and Opportunities', Nov. 2019
- 21. NSF CPS PI Meeting, Workshop on Smart and Connected Communities, 'Intelligent Infrastructure and the Digital Transformation: Challenges and Opportunities,' 2019
- 22. University of California, Berkeley, 'Learning in Stackelberg Games: An Implicit Approach with Provable Guarantees', 2019 Nov. 15
- 23. University of Illinois, Urbana-Champaign, DCL Seminar, 'Learning in Stackelberg Games: An Implicit Approach with Provable Guarantees', 2019 Nov. 6
- National Academy of Engineering, China-America Frontiers of Engineering 2019 Meeting, 'Intelligent Infrastructure & the Digital Transformation: Improving Lives Through Automation', San Diego, CA July 2019
- 25. University of California, Berkeley, Center for Human Artificial Intelligence (CHAI), 'Learning via Consistent Conjectures', April 24 2019.
- 26. National Science Foundation (NSF), Smart & Connected Communities principal investigator meeting and workshop, 'Data Informed Modeling and Correct-by-Design Control Protocols for Personal Mobility in Intelligent Urban Transportation Systems', 2019 April 1
- 27. University of Michigan, EECS Control Theory Seminar, 'Learning in Non-Stationary Environments: Near-Optimal Guarantees', March 29 2019.
- 28. University of California, Berkeley, Controls Seminar, 'Learning in Non-Stationary Environments: Near-Optimal Guarantees', Feb 2019. S. Shankar Sastry]
- 29. Stanford University, ISL Seminar, 'Learning in Non-Stationary Environments: Near-Optimal Guarantees', Jan 24th 2019.
- 30. C3 AI, 'Learning in Non-Stationary Environments: Near-Optimal Guarantees', Jan 25th 2019.
- 31. University of Texas, Austin, Control Theory Seminar, 'Learning in Non-Stationary Environments: Near-Optimal Guarantees', Oct. 2018 Ufuk Topcu]
- 32. Workshop on Learning and Decision Making, 'Learning, Decision-Making, & Incentives using Mobility Data: Case Studies, Challenges, and Opportunities', ACC 2018
- 33. National Science Foundation (NSF), Smart & Connected Communities principal investigator meeting and workshop, 'Data Informed Modeling and Correct-by-Design Control Protocols for Personal Mobility in Intelligent Urban Transportation Systems', 2018 March 26
- NSF, Cyber-Physical Systems (CPS) meeting principal investigator meeting and workshop, 'Emerging Markets and Myopic Decision-Making in Multi-Modal Transportation Systems: Models and Validation', 2017 November 12
- Vanderbilt Initiative for Smart-City Operations Research (VISOR) Multi-Modal Mobility Workshop, 'Learning, Decision-Making, and Incentives using Mobility Data: Case Studies, Challenges, and Opportunities', 2018 January 19 [Host: Abhishek Dubey]
- 36. University of Washington, College of Engineering Lecture Series, 'Making Cities Smarter for Drivers: Using Data to Improve Urban Congestion', 2017 November 7
- 37. University of Notre Dame, 'Learning to Prospect—New Algorithms for Modeling Risk-Sensitive Decision-Making', 2017 March 24
- NSF, CPS Award Foundations on Resilient Cyber-Physical Systems Review, 'New Vistas in Urban Infrastructures', 2017 January 25
- 39. NSF CPS Award Foundations on Resilient Cyber-Physical Systems Review, 'Urban Mobility: Learning, Behavioral Modeling, and Incentives', 2017 January 25
- University of Washington (EE Colloquium), 'The Emerging Data Market—Adaptive Incentives for Smart, Connected Infrastructure', 2016 November 29
- 41. NSF CPS Award Foundations of Resilient Cyber Physical Systems Review, Beyond FORCES: The Emerging Data Market and Sharing Economy, 2016 June 16

- 42. Celebration of Shankar Sastry 60th Birthday and 10 Years of CPS, University of California, Berkeley, 'Next Generation Urban Ecosystem and The Emerging Data Market', 2016 May 26
- 43. UK cyber security delegation visit to UC Berkeley, 'Privacy Aware Monetization of Data', 2016 May10
- 44. ONR Embedded Humans MURI review at University of California, Berkeley, 'Prospecting for Autonomy: Closing-the-Loop via Mechanism Design', 2016 February 24
- 45. California Institute of Technology, 'The Emerging Data Market—Adaptive Incentives for Smart, Connected Infrastructure', 2016 February 2
- 46. Siebel Energy Institute, RWE Visit, 'Emerging Data Market', 2015 November 10
- 47. KTH Sweden, 'NEXt–generation Urban ecoSystem: Smart, Connected Infrastructure & Communities', 2015 September 17
- NSF CPS Award Foundations of Resilient Cyber Physical Systems Review, 'Emerging Data Market', 2015 September 17
- Privacy Lab at University of California, Berkeley, 'New Vulnerabilities Lead to the Need for New Service Models', 2015 May 26
- 50. University of California, Santa Barbara, 'Incentivizing Efficiency in Societal-Scale Cyber-Physical Systems', 2015 March 11
- University of Washington, 'Incentivizing Efficiency in Societal-Scale Cyber-Physical Systems', 2015 March 3
- 52. University of California, San Diego, 'Incentivizing Efficiency in Societal-Scale Cyber-Physical Systems', 2015 February 9
- 53. Stanford, 'Game Theoretic Tools for Societal Scale Cyber-Physical Systems', 2014 May 30
- University of Michigan, 'Game Theoretic Tools for Societal Scale Cyber-Physical Systems', 2014 March 24 [Host: Demos Teneketzis]
- 55. CDC Workshop on Big Data Analytics for Societal Scale Cyber-Physical Systems: Energy Systems, Privacy Based Service Contracts and Insurance, 2014 December
- 56. NSF Team for Research in Ubiquitous Secure Technology (TRUST) site visit, 'Characterization and Computation of Local Nash Equilibria in Continuous Games', 2013 October 10

## Graduate Students and Postdoctoral Scholars

#### Past Graduate Students and Postdocs:

- Tanner Fiez, PhD, UW ECE 2021 [Current]: Amazon
- Liyuan Zheng, PhD, UW ECE 2021 [Current]: Microsoft
- Mitas Ray, MS, UW ECE, 2020 [Current]: FICC.AI
- Shreyas Sekar, Postdoc, 2017-2018 [Current]: Asst. Prof., U. Toronto
- Daniel Calderone, Postdoc 2017-2019 [Current]: Lecturer, UW AA

#### Current Graduate Students and Postdocs :

- Adhyyan Narang, 2nd Yr UW ECE (co-advisor M. Fazel)
- Evan Faulkner, 2nd Yr UW ECE
- Jaiyi Li, 2nd Yr UW ECE (co-adviser B. Zhang)
- Benjamin Chasnov, 5th Yr UW ECE (co-advisor S. Burden)
- Arnab Maiti, 1st Yr UW CSE (co-advisor K. Jamieson)
- Avinandan Bose, 1st Yr UW CSE
- Ross Boczar, Postdoc, 2021–present
- Daniel Calderone, Postdoc 2022–present

# Funding

<ul> <li>Computing for the Environment Initiative @UW</li> <li>Role: Co-Lead: 06/10/2022-06/09/2023</li> <li>UW Co-Lead: Anne Goodchild</li> </ul>	\$50,000
• NSF: SCC-IRG Track 1: Mobility for all—Harnessing E Communities	merging Transit Solutions for Underserved
<b>Role: Co-PI</b> : 10/2020–10/2024 Collaborative Proposal: joint with Abhishek Dubey, Vande	\$399,276 total: \$2,878,094
• ONR YIP: Algorithmic Competition, Cooperation, and Co Role: Single PI: 2020–2023, 36 Month	llusion: Heterogeneous Learning \$510,000
<ul> <li>Amazon Faculty Research Award</li> <li>Role: Co-Lead: 2018</li> <li>UW Lead: Kevin Jamieson</li> </ul>	\$40,000 total: \$80,000+AWS time
<ul> <li>NSF CPS: SMALL: Collaborative Research: Information for Cyber-Physical Systems with Learning Agents</li> <li>Role: Pl: 9/2019–9/2022</li> <li>UW Co-PI: Baosen Zhang</li> </ul>	\$298,788
Collaborative proposal: Joint with Ramesh Johari, Stanfor	
<ul> <li>NSF RI: III: SMALL: Robust Inference and Influence in D; Role: PI: 9/2019–9/2022 UW Co-PI: Kevin Jamieson</li> </ul>	ynamic Environments \$365,958
• NSF CAREER:Co-Design of Information and Incentives in Role: Single PI: 9/2019–9/2024	Societal-Scale Cyber-Physical Systems total: \$515,959 (\$499,959+\$16000 REU)
• NSF CPS: Medium: Collaborative Research: Convergent, for CPS	correct, and scalable reinforcement learning
<b>Role: Co-Pl</b> : 9/2018–8/2022 Collaborative Proposal: joint UW PI: Sam Burden	with Sam Coogan, GaTech total: \$998,000 UW total: \$666,254
• NSF SCC: IRG Track 2: Data Informed Modeling and Corre Mobility in Intelligent Urban Transportation Systems	ect-by-Design Control Protocols for Personal
<b>Role: Pl</b> : 8/2017–8/2022 UW Co-PI: Behçet Açikmeşe Gatech Co-PI: Samuel Coogan	total: \$1,022,619 (\$996,619+\$26,000 REU)
• NSF SCC-RCN: MOHERE: Mobility, Health, and Resilience	e in SCC: Building Capacities and Expanding
Impact <b>Role: Senior Personnel</b> : 10/2017–10/2021 UW PI: Radha Poovendran	total: \$500,000
• NSF CRII: CPS: Emerging Markets and Myopic Decision-I tems: Modeling and Validation	
<b>Role: Single PI</b> : 6/2017–6/2021	total: \$190,878 (\$174,878+\$16,000 REU)
• NSF US Ignite: Collaborative Research: Focus Area 1: Social Computing Platform for Multi-Modal Transit	
<b>Role: Co-Pl</b> : 9/2016–8/2020 UW PI: Baosen Zhang	UW total \$300,000
Collaborative Proposal: joint with Abhishek Dubey, Vande	total: \$600,000

• NSF EAGER: Congestion Mitigation via Better Parking: New Fundamental Models and A Living Lab **Role: Co-PI**: 7/2016–6/2018 UW PI: Baosen Zhang

# Teaching

• EE445 Foundations of Optimization and Machine Learning	Sp '22
• EE 341 Discrete Time Linear Systems Theory	Fa '21, Sp '21, Sp '20, Sp '19
• EE/AA 547 Linear Systems Theory I	Wi '22, Wi '20, Fa '18, Fa '17
• EE/AA 510 Mathematical Foundations of Systems Theory	Fa '19
• EE 546 Learning in Games	Wi '21, Wi '19, Fa '16
• EE/AA/ME 548 Linear Systems Theory II	Wi '18
• EE/AA/ME 549 System Identification	Sp '17

#### Course Design:

• Co-creator (w/ Maryam Fazel) of undergraduate course "EE 446: Fundamentals of Optimization and Machine Learning" to be taught Spring 2022

**Overview**: Fundamentals of Optimization and Machine Learning is an introduction to optimization and machine learning models motivated by their application in areas including statistics, decision-making and control, and communication and signal processing. The goal is to give ECE undergraduate students at the junior/senior level the foundational mathematical concepts and theory that underpins modern optimization and machine learning algorithms. In particular, students will be able to model basic machine learning algorithms using the language of convex optimization. The course will also be a cornerstone course for the new data science option for undergraduates.

• Creator of graduate course "EE546: Learning in Games"

**Overview**: Learning in games is an introduction to game theory and learning algorithms used in game theory. The course is designed as a split course with one part lecture and one part discussion of papers. In the second part, classical or seminal papers are paired with very modern/recent papers on core topics in learning in games, where students sign up to present in discussant/critic pairs. This process gives students a historical perspective, broadens their knowledge of the literature across time and domain, and enables students to learn to read and synthesize information in technical papers.

## Service

### Service Conferences and Journals

- ML: Program Committee/Reviewer for International Conference on Machine Learning (ICML), Advances in Neural Information Processing Systems (NeurIPS)
- Al: Program Committee/Reviewer for AAAI Conference on Artificial Intelligence (AAAI), International Joint Conference on Artificial Intelligence (IJCAI), Conference on Uncertainty in Artificial Intelligence (UAI)
- Control: Program Committee/Reviewer for Learning for Dynamics and Control (L4DC), American Control Conference (ACC), IEEE Conference on Decision and Control (CDC)
- CPS & Game Theory: Program Committee/Reviewer for International Conference on Cyber-Physical Systems, Conference on Decision and Game Theory for Security (GameSec)

- Journals: IEEE Transactions on Automatic Control (TAC), IEEE Transactions on Intelligent Transportation Systems (Trans. ITS), Automatica, IEEE Transactions on Control of Networked Systems (TCNS), IEEE Transactions on Smart Grid
- Organizing Committee: ICCPS (2018, 2019), GameNet (2019), GameSec (2018), ACC (2019), IJCAI (2019,2020)

### Departmental Service.

• Creating the Department NSF Broadening Participation	in Computing/Engineering Plan	2022
• Fellowship Committee	2016-2017, 2018-2019, 201	9-2020
• Qualifying Exam Committee		2017
• Space Committee	$2016\text{-}2017,\ 2017\text{-}2018,\ 2018\text{-}2019,\ 2019$	9-2020
• Concentration Area Panel	Fa	all 2017
• ECE Chair Search Committee	2019-2020 Acade	emic Yr
• Committee for Assessing Lecturer Pool (w/ Scott Hauck,	Tai-Cheng Chen)202	20-2021
• IEEE/HKN ECE Concentration Panel (for Controls and	Robotics),	2020

## College Service.

• College of Engineering Award Committee	2021 - 2022
• Participant in CoE STARS recruiting event as EE faculty representative,	Winter 2018
• Gave a lecture as part of the UW Lecture Series, open to the general public	Dec, $2017$
Title: 'Making Cities Smarter for Drivers: Using Data to Improve Urban Congestion and	l Parking'
• Panel participant for "ENGR 598A: Preparing for Academic Careers in Engineering,"	Fall 2016
• Participant in CoE STARS recruiting event as EE faculty representative,	Fall 2016
• Participant in CoE STARS EE Panel with the STARS Students,	Winter 2017
• CoE STARS Mentor (7 students)	
• Host and mentor NSF REUs every summer and during the academic year	2016-present

## Professional Society and Other Service.

- NSF Panel Reviewer for various programs in both CISE and ENG directorates ( $\sim 15$  panels) 2015–2020
- Invited panelist for the "Resilient infrastructure-systems with AI and IoT" hosted by IEEE Control Systems Society (CSS) as part of the workshop on Control for Societal Challenges June 2021 Provides the opportunity to contribute to the 2030 Roadmap for the CSS.

• Mentor to Organizers of the NSF CPS PI Meeting	2022
Organizer UW ECE Colloquium Series	Spring 2021
• Lead Organizer for NSF CPS PI Meeting	2018
• Co-Organizer for NSF CPS PI Meeting	2017, 2019
• Lead Organizer for NSF SCC PI Meeting	2018
• Co-Organizer for NSF SCC PI Meeting	2018, 2019
• Co-organizer Equity, Diversity and Inclusion Luncheon at NSF CPS PI Meeting	2017 - 2019

Role: Creator in 2017, recruited other faculty members to help organize; Co-Organizer in 2017–2019

- Co-organizer for ADSI workshop on Learning and Control at UW, Summer 2019
- Co-organizer for workshop at University of Washington, Smart Cities Visioning Workshop, January 2016
- Co-Organizer of Workshop on 'Big Data Analytics for Societal Scale Cyber-Physical Systems: Energy Systems,' at IEEE Conference on Decision and Control, Los Angeles, CA, 2014 December
- Co-Organizer of Workshop on 'Smart Cities: Service Models, Vulnerabilities, and Resilience' at IEEE Conference on Decision and Control', Osaka, Japan, 2014 December

## Service Related to Diversity, Equity, Inclusion, Justice & Belonging.

• Creating the Department NSF Broadening Participation in Computing/Engineering Plan 2022

• CoE UW STARS Mentor (7 students)

**Description**: Funded by the NSF and Washington State Opportunity Scholarship, STARS provides students a specialized first-year curriculum designed to build learning skills and academic preparation. Students are selected for being highly motivated, being low-income, and coming from target high schools in Washington State that have high populations of free and reduced-price lunch. To date, 85% of STARS students hold Pell Grants, 71% are first-generation college students, over half are underrepresented minorities, and 41% are women.

**students**: Kiana Peterson (2016-2018), Grace Kariuki (2016-2018), Jyoti Lama (2017-2018), Tevin Stanley (2017-2018), Kisanet Gebrehiwet (2017-2018) and Samuel Awuah (2016–present); Benjamin Azevedo (2016-2017)

• Creator and Co-Organizer of the Diversity, Equity and Inclusion Luncheon at the Annual NSF CPS PI Meeting

- Years active: 2018, 2019, 2021 (virtual), 2022

• Mentor for undergraduates participating in NSF funded research experience for undergrads (REUs)2016–present

students: 29 in total

**current students**: Samuel Awuah (UW, 2016–present, UW STARS), Avi Mittal (UW AA, 2021–present), Arnav Mahajan (UW CSE, 2021–present), Ryan Ching (UW, 2020–present), Quanchen (Peter) Ding (UW, 2020–present)