

Shangtong Zhang

Department of Computer Science
School of Engineering and Applied Science
University of Virginia
Charlottesville, VA, 22903

Rice Hall 422
85 Engineer's Way
Charlottesville, VA, 22903
shangtong@virginia.edu

RESEARCH INTEREST

The goal of my research is to solve sequential decision making problems in a scalable and reliable way. Currently, I focus on Reinforcement Learning (RL) as a solution method. In particular, I work on stochastic approximations for RL, theories and algorithms of RL, and applications by RL.

ACADEMIC EMPLOYMENTS

Assistant Professor Department of Computer Science University of Virginia, VA, United States	Aug 2022 - Present
Research Scientist Interns Microsoft Research Montreal DeepMind London Microsoft Research Montreal	Jun 2021 - Sep 2021 Feb 2021 - Jun 2021 Jun 2020 - Aug 2020

EDUCATION

Doctor of Philosophy , Computer Science University of Oxford, Oxford, United Kingdom Advisor: Prof. Shimon Whiteson Thesis: Breaking the Deadly Triad in Reinforcement Learning	Oct 2018 - Jul 2022
Master of Science , Computer Science University of Alberta, Edmonton, Canada Advisor: Prof. Richard S. Sutton Thesis: Learning with Artificial Neural Networks	Sep 2016 - Jul 2018
Bachelor of Science , Computing Science Fudan University, Shanghai, China	Sep 2012 - Jul 2016

HONORS

- Cisco Faculty Research Award, 2025
NSF CAREER Award, 2025
QuantCo Spotlight Award at the ICML In-Context Learning Workshop, 2024
Rising Stars in AI by KAUST AI Initiative, 2024
AAAI New Faculty Highlights, 2023
IFAAMAS Victor Lesser Dissertation Award (Runner-Up), 2022

Alf Weaver Junior Faculty Fellowship, UVA, 2022 - 2025
 ICLR Outstanding Reviewer, 2021
 NeurIPS Reviewer Award, 2020
 ICML Reviewer Award, 2020
 AAMAS Best Paper Award, 2020
 Light Senior Scholarship, St Catherine's College, University of Oxford, 2020
 EPSRC Studentship, University of Oxford, 2018 - 2022
 EMC Scholarship, Fudan University, 2014

PUBLICATIONS

Advisees of SZ are underlined; * indicates equal contribution; † indicates equal supervision.

Preprints

- (P1) *Towards Formalizing Reinforcement Learning Theory.*
Shangtong Zhang.
 ArXiv Preprint 2025.
- (P2) *Extensions of Robbins-Siegmund Theorem with Applications in Reinforcement Learning.*
Xinyu Liu, Zixuan Xie, **Shangtong Zhang.**
 ArXiv Preprint 2025.
- (P3) *Safe In-Context Reinforcement Learning.*
Amir Moeini*, Minjae Kwon*, Alper Kamil Bozkurt, Yuichi Motai, Rohan Chandra, Lu Feng,
Shangtong Zhang.
 ArXiv Preprint 2025.
- (P4) *Reward Is Enough: LLMs Are In-Context Reinforcement Learners.*
Kefan Song, Amir Moeini, Peng Wang, Lei Gong, Rohan Chandra, Yanjun Qi, **Shangtong Zhang.**
 ArXiv Preprint 2025.
- (P5) *Experience Replay Addresses Loss of Plasticity in Continual Learning.*
Jiuqi Wang, Rohan Chandra, **Shangtong Zhang.**
 ArXiv Preprint, 2025.
- (P6) *A Survey of In-Context Reinforcement Learning.*
Amir Moeini, Jiuqi Wang, Jakob Beck, Ethan Blaser, Shimon Whiteson, Rohan Chandra,
Shangtong Zhang.
 ArXiv Preprint, 2025.
- (P7) *Almost Sure Convergence Rates and Concentration of Stochastic Approximation and Reinforcement Learning with Markovian Noise.*
Xiaochi Qian*, Xinyu Liu*, Zixuan Xie*, **Shangtong Zhang.**
 ArXiv Preprint, 2024.
- (P8) *Almost Sure Convergence of Linear Temporal Difference Learning with Arbitrary Features.*
Jiuqi Wang, **Shangtong Zhang.**
 ArXiv Preprint, 2024.
- (P9) *AlphaStar Unplugged: Large Scale Offline Reinforcement Learning.*
 Michael Mathieu*, Sherjil Ozair*, Srivatsan Srinivasan*, Caglar Gulcehre*, **Shangtong Zhang***,
 Ray Jiang*, Tom Le Paine*, Richard Powell, Konrad Zolna, Julian Schrittwieser, David Choi, Petko
 Georgiev, Daniel Kenji Toyama, Aja Huang, Roman Ring, Igor Babuschkin, Timo Ewalds, Mahyar
 Bordbar, Sarah Henderson, Sergio Gomez Colmenarejo, Aaron van den Oord, Wojciech M. Czarnecki,
 Nando de Freitas, Oriol Vinyals.
 ArXiv Preprint, 2023

Invited Articles

- (I1) *A New Challenge in Policy Evaluation.*
Shangtong Zhang.
AAAI Conference on Artificial Intelligence (**AAAI**), 2023
New Faculty Highlights Program.

Refereed Journals

- (J1) *The ODE Method for Stochastic Approximation and Reinforcement Learning with Markovian Noise.*
Shuze Liu, Shuhang Chen, **Shangtong Zhang**.
Journal of Machine Learning Research (**JMLR**), 2025.
- (J2) *Global Optimality and Finite Sample Analysis of Softmax Off-Policy Actor Critic under State Distribution Mismatch.*
Shangtong Zhang, Remi Tachet des Combes[†], Romain Laroche[‡].
Journal of Machine Learning Research (**JMLR**), 2022.
- (J3) *Truncated Emphatic Temporal Difference Methods for Prediction and Control.*
Shangtong Zhang, Shimon Whiteson.
Journal of Machine Learning Research (**JMLR**), 2022.
- (J4) *MLPack 3: A Fast, Flexible Machine Learning Library.*
Ryan Curtin, Marcus Edel, Mikhail Lozhnikov, Yannis Mentekidis, Sumedh Ghaisas, **Shangtong Zhang**
Journal of Open Source Software (**JOSS**), 2018.

Refereed Conference Papers

- (C1) *Asymptotic and Finite Sample Analysis of Nonexpansive Stochastic Approximations with Markovian Noise.*
Ethan Blaser, **Shangtong Zhang**.
AAAI Conference on Artificial Intelligence (**AAAI**), 2026
Acceptance rate: 17.6%
- (C2) *GameChat: Multi-LLM Dialogue for Safe, Agile, and Socially Optimal Multi-Agent Navigation in Constrained Environments.*
Vagul Mahadevan, **Shangtong Zhang**, Rohan Chandra.
IEEE International Symposium on Multi-Robot and Multi-Agent Systems (**MRS**), 2025
Acceptance rate: 47.8%
- (C3) *Towards Provable Emergence of In-Context Reinforcement Learning.*
Jiuqi Wang, Rohan Chandra, **Shangtong Zhang**.
Conference on Neural Information Processing Systems (**NeurIPS**), 2025
Acceptance rate: 24.52%
- (C4) *Finite Sample Analysis of Linear Temporal Difference Learning with Arbitrary Features.*
Zixuan Xie^{*}, Xinyu Liu^{*}, Rohan Chandra, **Shangtong Zhang**.
Conference on Neural Information Processing Systems (**NeurIPS**), 2025
Acceptance rate: 24.52%
- (C5) *Counterfactual Explanations for Continuous Action Reinforcement Learning.*
Shuyang Dong, **Shangtong Zhang**, Lu Feng.
International Joint Conference on Artificial Intelligence (**IJCAI**), 2025
Acceptance rate: 19.3%
- (C6) *Towards Large Language Models that Benefit for All: Benchmarking Group Fairness in Reward Models.*
Kefan Song, Jin Yao, Runnan Jiang, Rohan Chandra, **Shangtong Zhang**.

Reinforcement Learning Conference (**RLC**), 2025
Acceptance rate: 39%

- (C7) *Linear Q-Learning Does Not Diverge in L^2 : Convergence Rates to a Bounded Set.*
Xinyu Liu*, Zixuan Xie*, **Shangtong Zhang**.
International Conference on Machine Learning (**ICML**), 2025.
Acceptance rate: 26.9%
- (C8) *Transformers Can Learn Temporal Difference Methods for In-Context Reinforcement Learning.*
Jiuqi Wang*, Ethan Blaser*, Hadi Daneshmand, **Shangtong Zhang**.
International Conference on Learning Representations (**ICLR**), 2025.
Acceptance rate: 32.08%.
QuantCo Spotlight Award at the ICML Workshop on In-Context Learning, 2024.
- (C9) *Revisiting a Design Choice in Gradient Temporal Difference Learning.*
Xiaochi Qian, **Shangtong Zhang**.
International Conference on Learning Representations (**ICLR**), 2025.
Acceptance rate: 32.08%.
- (C10) *Efficient Policy Evaluation with Safety Constraint for Reinforcement Learning.*
Claire Chen*, Shuze Liu*, **Shangtong Zhang**.
International Conference on Learning Representations (**ICLR**), 2025.
Acceptance rate: 32.08%.
- (C11) *Doubly Optimal Policy Evaluation for Reinforcement Learning.*
Shuze Liu, Claire Chen, **Shangtong Zhang**.
International Conference on Learning Representations (**ICLR**), 2025.
Acceptance rate: 32.08%.
- (C12) *Efficient Multi-Policy Evaluation for Reinforcement Learning.*
Shuze Liu, Claire Chen, **Shangtong Zhang**.
AAAI Conference on Artificial Intelligence (**AAAI**), 2025.
Acceptance rate: 23.4%. **Oral presentation (4.6%)**.
- (C13) *Efficient Policy Evaluation with Offline Data Informed Behavior Policy Design.*
Shuze Liu, **Shangtong Zhang**.
International Conference on Machine Learning (**ICML**), 2024.
Acceptance rate: 27.5%
- (C14) *On the Convergence of SARSA with Linear Function Approximation.*
Shangtong Zhang, Remi Tachet des Combes, Romain Laroche.
International Conference on Machine Learning (**ICML**), 2023.
Acceptance rate: 28%
- (C15) *A Deeper Look at Discounting Mismatch in Actor-Critic Algorithms.*
Shangtong Zhang, Romain Laroche, Harm van Seijen, Shimon Whiteson, Remi Tachet des Combes.
International Conference on Autonomous Agents and Multiagent Systems (**AAMAS**), 2022.
Acceptance rate: 26%. **Oral presentation**.
- (C16) *Learning Expected Emphatic Traces for Deep RL.*
Ray Jiang, **Shangtong Zhang**, Veronica Chelu, Adam White, Hado van Hasselt.
AAAI Conference on Artificial Intelligence (**AAAI**), 2022.
Acceptance rate: 15%.
- (C17) *Breaking the Deadly Triad with a Target Network.*
Shangtong Zhang, Hengshuai Yao, Shimon Whiteson.
International Conference on Machine Learning (**ICML**), 2021.
Acceptance rate: 21.5%.
- (C18) *Average-Reward Off-Policy Policy Evaluation with Function Approximation.*
Shangtong Zhang*, Yi Wan*, Richard S. Sutton, Shimon Whiteson.

- International Conference on Machine Learning (**ICML**), 2021.
Acceptance rate: 21.5%.
- (C19) *Mean-Variance Policy Iteration for Risk-Averse Reinforcement Learning.*
Shangtong Zhang, Bo Liu, Shimon Whiteson.
AAAI Conference on Artificial Intelligence (**AAAI**), 2021.
Acceptance rate: 21.4%.
- (C20) *Learning Retrospective Knowledge with Reverse Reinforcement Learning.*
Shangtong Zhang, Vivek Veeriah, Shimon Whiteson.
Conference on Neural Information Processing Systems (**NeurIPS**), 2020.
Acceptance rate: 20.1%.
- (C21) *GradientDICE: Rethinking Generalized Offline Estimation of Stationary Values.*
Shangtong Zhang, Bo Liu, Shimon Whiteson.
International Conference on Machine Learning (**ICML**), 2020.
Acceptance rate: 21.8%.
- (C22) *Provably Convergent Two-Timescale Off-Policy Actor-Critic with Function Approximation.*
Shangtong Zhang, Bo Liu, Hengshuai Yao, Shimon Whiteson.
International Conference on Machine Learning (**ICML**), 2020.
Acceptance rate: 21.8%.
- (C23) *Deep Residual Reinforcement Learning.*
Shangtong Zhang, Wendelin Boehmer, Shimon Whiteson.
International Conference on Autonomous Agents and Multiagent Systems (**AAMAS**), 2020.
Acceptance rate: 23%. **Best Paper Award**.
- (C24) *Mega-Reward: Achieving Human-Level Play without Extrinsic Rewards.*
Yuhang Song, Jianyi Wang, Thomas Lukasiewicz, Zhenghua Xu, **Shangtong Zhang**, Andrzej Wojcicki, Mai Xu.
AAAI Conference on Artificial Intelligence (**AAAI**), 2020.
Acceptance rate: 20.6%.
- (C25) *DAC: The Double Actor-Critic Architecture for Learning Options.*
Shangtong Zhang, Shimon Whiteson.
Conference on Neural Information Processing Systems (**NeurIPS**), 2019.
Acceptance rate: 21.2%.
- (C26) *Generalized Off-Policy Actor-Critic.*
Shangtong Zhang, Wendelin Boehmer, Shimon Whiteson.
Conference on Neural Information Processing Systems (**NeurIPS**), 2019.
Acceptance rate: 21.2%.
- (C27) *Distributional Reinforcement Learning for Efficient Exploration.*
Borislav Mavrin, **Shangtong Zhang**, Hengshuai Yao, Linglong Kong, Kaiwen Wu, Yaoliang Yu
International Conference on Machine Learning (**ICML**), 2019.
Acceptance rate: 22.6%.
- (C28) *ACE: An Actor Ensemble Algorithm for Continuous Control with Tree Search.*
Shangtong Zhang, Hao Chen, Hengshuai Yao.
AAAI Conference on Artificial Intelligence (**AAAI**), 2019.
Acceptance rate: 16.2%. **Spotlight presentation**.
- (C29) *QUOTA: The Quantile Option Architecture for Reinforcement Learning.*
Shangtong Zhang, Borislav Mavrin, Linglong Kong, Bo Liu, Hengshuai Yao.
AAAI Conference on Artificial Intelligence (**AAAI**), 2019.
Acceptance rate: 16.2%. **Oral presentation**.
- (C30) *Crossprop: Learning Representations by Stochastic Meta-Gradient Descent in Neural Networks.*
Vivek Veeriah*, **Shangtong Zhang***, Richard S. Sutton.
European Conference on Machine Learning and Principles and Practice of Knowledge Discovery in

Databases (**ECML-PKDD**), 2017.

Acceptance rate: 27.1%.

- (C31) *A Deep Neural Network for Modeling Music.*

Pengjing Zhang, Xiaoqing Zheng, Wenqiang Zhang, Siyan Li, Sheng Qian, Wenqi He, **Shangtong Zhang**, Ziyuan Wang

International Conference on Multimedia Retrieval (**ICMR**), 2015.

Acceptance rate: 31%.

Refereed Workshop Papers (Non-Archival)

- (W1) *CRASH: Challenging Reinforcement-Learning Based Adversarial Scenarios For Safety Hardening.*

Amar Kulkarni, **Shangtong Zhang**, Madhur Behl.

ML for Autonomous Driving Workshop at AAAI, 2025.

- (W2) *A Deeper Look at Experience Replay.*

Shangtong Zhang, Richard S. Sutton.

Deep RL Symposium at NIPS, 2017.

- (W3) *Comparing Deep Reinforcement Learning and Evolutionary Methods in Continuous Control.*

Shangtong Zhang, Osmar R. Zaiane

Deep RL Symposium at NIPS, 2017

- (W4) *A Demon Control Architecture with Off-Policy Learning and Flexible Behavior Policy.*

Shangtong Zhang, Richard S. Sutton.

Hierarchical RL Workshop at NIPS, 2017.

Technical Reports

- (T1) *Group Fairness in Multi-Task Reinforcement Learning.*

Kefan Song, Runnan Jiang, Rohan Chandra, **Shangtong Zhang**.

ArXiv Preprint, 2025.

GRANTS

- (G1) *Continual Skill Acquisition through In-Context Reinforcement Learning.*

Cisco Research, **PI**, Total \$75,000, My Share \$75,000

2025 - 2026

- (G2) *Reinforced Sensory Intelligence for Safe Autonomous Driving.*

CCI Central Virginia Node, **PI**, Total \$100,000, My Share \$60,000

2025 - 2026

- (G3) *CAREER: Revolutionizing the Evaluation of AI Agents with Online and Offline Data.*

NSF 2442098, **PI**, Total \$600,000, My Share \$600,000

2025 - 2030

- (G4) *Revolutionizing Domain Generalization with In-Context Reinforcement Learning.*

Nvidia Academic Grant, **PI**, 16,000 A100 Hours

2025

- (G5) *Enhancing the Security of Large Language Models Against Persuasion-Based Jailbreak Attacks in Multi-Turn Dialogues.*

CCI Coastal Virginia Node, **Co-PI**, Total \$60,000, My Share \$20,000

2025 - 2026

- (G6) *RAMPART: Reinforcement Against Malicious Penetration by Adversaries in Realistic Topologies.*

DARPA HR001123S0002, **Co-PI** of UVA subaward, Total \$2,150,000, My Share \$77,000 2023 - 2027

- (G7) *SLES: CRASH: Challenging Reinforcement-Learning Based Adversarial Scenarios for Safety Hardening.*

NSF 2331904, **Co-PI**, Total \$800,000, My Share \$400,000

2023 - 2026

- (G8) *III: Small: Moving Offline Learning to Rank Online, from Theory to Practice.*

NSF 2128019, **PI**, Total \$500,000, My Share \$500,000

2021 - 2026

SERVICES

Organizers

CPS Rising Star Workshop 2024, Co-Chair

Panelists

National Science Foundation (NSF), 2024

Virginia's Commonwealth Cyber Initiative (CCI), 2024

Meta Meta Reviewer

RL Conference 2025 (Senior Area Chair)

Meta Reviewer

NeurIPS 2025 (Area Chair)

ICML 2025 (Area Chair)

ICLR 2024, 2025, 2026 (Area Chair)

AISTATS 2024, 2025, 2026 (Area Chair)

L4DC 2025 (Program Committee)

AAMAS 2025 (Senior Program Committee)

RL Conference 2024 (Area Chair)

ACML 2022, 2023, 2024 (Area Chair)

Reviewer

Transactions on Pattern Analysis and Machine Intelligence (1)

Transaction of Machine Learning Research (2)

Journal of Machine Learning Research (3)

Artificial Intelligence Journal (2)

Transactions on Intelligent Systems and Technology (2)

IJCAI 2023

AISTATS 2022

NeurIPS 2020, 2021, 2022, 2023

ICML 2020, 2021, 2022, 2023

AAAI 2020, 2021, 2022, 2023

ICLR 2021, 2022, 2023

SIGCOMM 2022

Offline Reinforcement Learning Workshop at NeurIPS 2020, 2021, 2022

Deep Reinforcement Learning Workshop at NeurIPS 2019, 2020, 2021, 2022

Adaptive and Learning Agents Workshop at AAMAS 2019, 2020

Optimization Foundations for Reinforcement Learning Workshop at NeurIPS 2019

Reinforcement Learning for Real Life Workshop at ICML 2019, 2021

Reinforcement Learning for Real Life Workshop at NeurIPS 2022

Conference Session Chair

AAAI 2023, "Reinforcement Learning Theory & Algorithms"

SUPERVISION

Doctoral Students

Ethan Blaser, NSF Graduate Research Fellowship

2023 - Now

Jiuqi Wang

2023 - Now

Xinyu Liu

2024 - Now

Zixuan Xie, UVA Provost's Fellowship, UVA Engineering Distinguished Fellowship

2024 - Now

Amir Moeini

2024 - Now

Alumni with Theses or Publications

Shuze Liu, PhD → Research Scientist at Meta	2022 - 2025
Kefan Song, Master → PhD at UVA	2023 - 2025
Licheng Luo, Master → PhD at UC Riverside	2023 - 2024
Claire Chen, Undergraduate → Undergraduate at Caltech	2023 - 2025
Vikram Ostrander, Undergraduate (DMP thesis) → Software Engineer at Palantir	2024 - 2025
Vagul Mahadevan, Undergraduate (DMP thesis) → Software Engineer at Metron	2023 - 2025
Steve Zhou, Undergraduate (DMP thesis) → Master at MIT	2023 - 2024
Xiaochi Qian, Undergraduate (Oxford) → Quantitative Researcher at Marshall Wace	2022 - 2024

PhD Dissertation Examination Committees

Fengdi Che (U of Alberta, by Prof. Rupam Mahmood and Prof. Dale Schuurmans)
Shohaib Mahmud (by Prof. Haiying Shen)
Suraiya Tairin (by Prof. Haiying Shen)
Tao Jin (by Prof. Farzad Farnoud)
Fan Yao (by Prof. Hongning Wang and Prof. Haifeng Xu)
Ingy ElSayed-Aly (by Prof. Lu Feng)
Sudhir Shenoy (by Prof. Afsaneh Doryab)
Chuanhao Li (by Prof. Hongning Wang)

INVITED TALKS

Convergence of Value-Based Reinforcement Learning: Advances and Open Problems	
Workshop on Advances in ML Theory, Canada, by Prof. Csaba Szepesvari	May 2025
Understanding the Training and Inference of Reinforcement Learning	
Tsinghua University, hosted by Prof. Hongning Wang	June 2024
On the Cheating of Offline Reinforcement Learning	
KAUST Rising Stars in AI Symposium	Feb 2024
Offline Reinforcement Learning: Current and Future	
AAAI New Faculty Highlight Program	Feb 2023
Breaking the Deadly Triad in Off-Policy Reinforcement Learning	
Department of Computer Science, University of Virginia	Mar 2022
School of Computing Science, Simon Fraser University	Feb 2022
Department of Electrical & Computer Engineering, University of Waterloo	Feb 2022
School of Informatics, University of Edinburgh	Oct 2021
Breaking the Deadly Triad with a Target Network	
Microsoft Research Summit	Oct 2021
Breaking the Deadly Triad in Reinforcement Learning	
RL team, DeepMind, hosted by Dr. Hado van Hasselt	Sep 2021
Off-Policy Evaluation	
Data Fest 2020, Open Data Science	Oct 2020
Off-Policy Evaluation and Control	
ByteDance AI Lab, Shanghai	Oct 2020
Coding Deep RL Papers	
NIPS MLTrain Workshop, Long Beach	Dec 2019
Off-Policy Actor-Critic Algorithms	
Latent Logic LTD, Oxford	Apr 2019

TEACHING & OUTREACH

University of Virginia

CS 6771: Reinforcement Learning	Spring 2026
CS 4771: Reinforcement Learning	Fall 2025
CS 6316: Machine Learning	Spring 2024, Spring 2025
CS 4501: Reinforcement Learning	Fall 2024
CS 4501: Optimization	Fall 2023
CS 6501: Topics in Reinforcement Learning	Fall 2022
Tutorial: What GenAI Can and Cannot Do?	
UVA Innovation Hub at Charlottesville Middle School	July 2025
Charlottesville High School – Link Lab Mentorship Program	
Gravity Battery & Wearable GPS	Fall 2024

OPEN SOURCE CODE

GitHub Repo: PyTorch Deep RL

A zoo of popular deep RL algorithms in PyTorch with **3k stars**.

GitHub Repo: Reinforcement Learning: An Introduction

Python implementation of the book *Reinforcement Learning: An Introduction* with **13.8k stars**.

Google Summer of Code (GSoC)

MLPack

2017

The Xapian Project

2014