Zhouhao Yang

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PROFILE

- Honorary undergraduate courses, Current Ph.D. Student at the Johns Hopkins University.
- Research Interest: AI for Science, LLMs, Reinforcement Learning, Impulse Control Problems.
- Diverse research experiences (Ph.D. Candidate of Applied Mathematics and Statistics at JHU, Research Assistance of at NUS Computing, Caltech Visiting Undergraduate Research Program, and Shanghai Jiao Tong University Research Program).

EDUCATION

Johns Hopkins University

Aug 2024 – Present

Ph.D. Candidate, Department of Applied Mathematics and Statistics

Advisor: Haoyang Cao

Research Direction: Memory-Efficient LLMs, Reinforcement Learning, Impulse Control Problems.

National University of Singapore

Aug 2023 – Jun 2024

Ph.D. Candidate, Department of Computer Science

Advisor: Kenji Kawaguchi and Johnathon Scarlett

Research Direction: AI for Science, Physics-Informed Neural Networks, Memory-Efficient LLMs.

Shanghai Jiao Tong University

Sep 2019 – Jun 2023

Bachelor of Mathematics and Applied Mathematics (Zhiyuan Honors Program)

Selected Coursework: Probability, Statistics, Stochastic Process, Foundations of data science, Numerical Analysis and Scientific Computing, Partial Differential Equations, Fourier Analysis and Real Analysis, etc.

PUBLICATIONS

- Zhouhao Yang, Xingyu Xu and Yuantao Gu, "A General Framework for Accurate and Private Mean Estimation," in *IEEE Signal Processing Letters*, vol. 29, pp. 2293-2297, 2022, doi: 10.1109/LSP.2022.3219356.
- Zhouhao Yang, Yihong Guo, Pan Xu, Anqi Liu, and Anima Anandkumar, "Distributionally robust policy gradient for offline contextual bandits," in International Conference on Artificial Intelligence and Statistics, pages 6443–6462. PMLR, 2023.
- Zheyuan Hu, Zhouhao Yang, Yezhen Wang, George Em Karniadakis, Kenji Kawaguchi, "Bias-Variance Trade-off
 in Physics-Informed Neural Networks with Randomized Smoothing for High-Dimensional PDEs," under review by
 SIAM Journal on Scientific Computing.
- Qianli Shen, Yezhen Wang, Zhouhao Yang, Kenji Kawaguchi, "Memory-Efficient Gradient Unrolling for Large-Scale Bi-level Optimization," The Thirty-eighth Annual Conference on Neural Information Processing Systems. 2024..

RESEARCH EXPERIENCE

JHU: Continuous-Time Reinforcement Learning for Impulse Control Problems

Sep 2024-Present

- Professor of guidance: Haoyang Cao.
- Read intensively three textbooks on Control Theory, Stochastic Processes, and PDE.
- Literature review on continuous-time RL, which formulates stochastic control problems as randomized ones and solves with policy improvement algorithms motivated from discrete-time RL.
- Currently working on extending and designing a new randomized framework for impulse control problems.

NUS: Bias-Variance Trade-off in Physics-Informed Neural Networks with Randomized Smoothing for High-Dimensional PDEs Aug 2023-Nov 2023

- Professor of guidance: George Em Karniadakis from Brown University, Kenji Kawaguchi from NUS.
- Output: A co-first author paper under review by SIAM Journal of Scientific Computing.
- Conducted in-depth research for physics-informed neural network with randomized smoothing, a backpropagation-free method for high-dim PINN, which addresses the memory and time costs brought by curse of dimension.
- Analyzed the bias-variance trade-off in Randomized Smoothing-PINN training.
- Corrected the bias brought by randomized smoothing in non-linear MSE loss and PDE terms.
- Proposed a hybrid loss function of biased and unbiased version to accelerate convergence of training and improve
 final accuracy. Biased training loss provides faster convergence, while unbiased training loss ensures better accuracy.
- Conducted extensive experiments on various PDEs including Fokker-Planck, HJB, Allen-Cahn, Sine-Gorden, etc.

NUS: Gradient-Enhanced Physics-Informed Neural Networks with Variance Reduced Randomized Smoothing for High-Order and High-dimensional PDEs Aug 2023-Jan 2024

- Professor of guidance: George Em Karniadakis from Brown University, Kenji Kawaguchi from NUS.
- Generalized RS-PINN to high-order derivatives and various differential operators.
- Proposed variance reduction methods for randomly smoothed derivative estimators, including antithetic variate method, importance sampling, and Gaussian quadrature.
- Proved that gradient-enhanced techniques are basically free lunch under randomized smoothing, which greatly
 improves the efficiency of training.
- Conducted thorough experiments on low-dim and high-dim PDEs with RS-GPINN.

Caltech VURP (Visiting Undergraduate Research Program): Distributionally Robust Policy Gradient for Offline Contextual Bandits Mar 2022-Oct 2022

- Professor of guidance: Anima Anandkumar from Caltech, Pan Xu from Duke University.
- Output: A co-first author paper published in AISTATS 2023.
- Proposed a distributionally robust policy optimization method (DROPO) for offline contextual bandits, addressing the distributional shift between the static logging policy and the learning policy in policy gradient.
- Modelled the distributionally robust policy optimization problem as a minimax optimization problem, which has an analytical framework of solution.
- Generalized the DROPO method to contextual bandits with limited online exploration.
- Provided a generalization bound and a convergence analysis for DROPO.
- Designed and implemented experiments on *UCI Optdigits* and *MNIST*.

A General Framework for Accurate and Private Mean Estimation

July 2021-Jun 2022

- Professor of guidance: Yuantao Gu from Tsinghua University.
- Output: A first author paper published in IEEE Signal Processing Letters.
- Proposed a differentially private mean estimation algorithm for general types of distributions with given cumulative distribution function.
- Proved an upper bound for the algorithm's sample complexity, which is tailored to the cumulative distribution function of underlying population.
- Illustrated that our complexity bound is better in order for heavy-tailed distribution and at least enjoys the same order for light-tailed distribution.
- Designed and implemented experiments on Gaussian distribution and Levy-stable distribution.
- Independently studied the book "High-dimensional Probability" written by Roman Vershynin.

Bachelor's Thesis: Machine Learning Methods-Based Inverse Lithography Technology

Aug 2021-May 2023

- Professor of guidance: Dan Hu from Shanghai Jiao Tong University.
- Conducted a thorough literature review for the development of Inverse Lithography Technology over past decades.
- Proposed a complete machine learning methods-based ILT framework is proposed, which consists of a sequential framework of machine learning-based ILT and simulated annealing method-based ILT.
- Designed a convolutional neural network (UNet) to learn the mapping from on-wafer patterns to masks.
- Introduced a simulated annealing method based-ILT framework to refine the quasi-optimized masks and achieve better mask quality.
- Implemented the ML-based ILT framework and conducted experiments on ICCAD 2013 dataset.

HONORS AND AWARDS

•	Outstanding students Scholarship of Shanghai Jiao Tong University	2019-2023 (four times)
•	Honors scholarship for students of Zhiyuan College	2019-2023 (four times)

TEACHING EXPERIENCE

• Teaching Assistant for Introduction to Computational Mathematics (EN.553.385)

Aug 2024-Dec 2024