Manqing Liu

Summary

I am currently a 4th year PhD Candidate at Harvard studying causal machine learning. My research interests include using deep learning models to estimate causal effects, and how causality can be used to improve the **reasoning** capabilities and **safety** of multimodal LLMs. I am co-advised by Dr. Andrew Beam and Dr. James Robins. I am also a member of the Causal Lab.

Education

2021-Present Ph.D. in Causal Machine Learning, Harvard University

2022-Present Secondary field in Computer Science and Engineering, Harvard University

2021-Present M.Sc in Biostatistics, Harvard University

2017-2020 Post-Baccalaureate Studies in Maths/Statistics, University of Pennsylvania

2014–2016 MHS in Epidemiology, Johns Hopkins University

Relevant Coursework

Causality Advanced Epidemiologic Methods, Models for Causal Inference

Maths and (MIT) Matrix Methods in Data Analysis & Signal Processing, (MIT) Introduction Statistics to Functional Analysis, Probability, Statistical Inference, Advanced Regression and

Statistical Learning, Bayesian Inference

Computer Systems Development for Computational Science, High Performance Computing

Science for Science and Engineering, Stochastic Methods for Data Analysis, Inference and

Optimization

Machine (MIT) Machine Learning, (MIT) Quantitative Methods for NLP, Deep Learning for

Learning Biomedical Data, Geometric Methods for Machine Learning, Algorithms for Data

Science

Research Experience

Feb 2025 - Projected Causal Alignment: Scaling Boundless DAS for LLMs

Present Optimizing Boundless DAS through Johnson-Lindenstrauss transformations, significantly reducing computational overhead while enabling cross-scale analysis of causal mechanisms in LLMs. This approach investigates the neural representations of counting and arithmetic operations, exploring why mathematical reasoning deficiencies persist even as models scale to larger parameter counts and demonstrate enhanced capabilities in other reasoning domains.

- Oct 2024 Doubly Robust MCTS for LLM reasoning
 - Jan 2025 Integrated doubly robust estimator into Monte Carlo Tree Search (MCTS), enabling large language models to perform complex, multi-step reasoning and planning with higher accuracy in real-world scenarios.
- June 2023 **DAG aware Transformer**
 - Dec 2024 Engineered a noval DAG-aware transformer model to precisely estimate causal effects, addressing foundational challenges in unifying causal effect estimation under various scenarios.

Publications

- 2025 **Doubly Robust Monte Carlo Tree Search**, *Liu M.*, Beam A. Under review at ICML. Available at: arXiv:2502.01672
- 2024 DAG-Aware Transformer for Causal Effect Estimation, Liu M., Bellamy D., Robins J., Beam A. Causal Representation Learning workshop at NeurIPS 2024. Available at: arXiv:2410.10044
- 2022 Development of Machine Learning Algorithms Incorporating Electronic Health Record Data, Patient-Reported Outcomes, or Both to Predict Mortality for Outpatients with Cancer, Parikh R.B., Hasler J.S., Zhang Y., *Liu M.*, Chivers C., et al., *JCO Clinical Cancer Informatics*, 6.
- 2021 Trajectories of Mortality Risk Among Patients with Cancer and Associated End-of-Life Utilization, Parikh R.B., Liu M., Li E., Li R., Chen J., npj Digital Medicine, 4(1):104.
- Validation of a Machine Learning Algorithm to Predict 180-Day Mortality for Outpatients with Cancer, Manz C.R., Chen J., *Liu M.*, Chivers C., Regli S.H., et al., *JAMA Oncology*, 6(11):1723-1730.
- 2019 Assessment of Inpatient Time Allocation Among First-Year Internal Medicine Residents Using Time-Motion Observations, Chaiyachati K.H., Shea J.A., Asch D.A., Liu M., Bellini L.M., et al., JAMA Internal Medicine, 179(6):760-767.

Professional Experience

2024 summer **Technical AI safety Fellowship**, AI safety student team

Attended a 8-week reading group on AI safety, covering topics like neural network interpretability, learning from human feedback, goal misgeneralization in reinforcement learning agents, and eliciting latent knowledge.

Skills

Programming Python, C++, R, SAS, STATA

Languages

Libraries and PyTorch, Tensorflow, Pandas, NumPy

Frameworks

Others Causal Inference, Machine Learning, Deep Learning