ISAAC LIAO

EDUCATION

Massachusetts Institute of Technology

Master of Engineering, Electrical Engineering and Computer Science Advisor: Max Teqmark

Massachusetts Institute of Technology GPA: 5.0/5.0

Bachelor of Science, Double major in Computer Science and Physics

Classes (*Graduate): Bayesian Modeling and Inference*, Statistical Learning Theory*, Information Theory^{*}, Quantum Physics I-III, Computer Vision, Statistical Mechanics I, Experimental Physics I.

RESEARCH EXPERIENCE

Researcher - Tegmark AI Safety Group

Advisor: Max Teqmark

- Design of algorithms for proving the validity of a bijection between recurrent neural networks and finite state machines, for AI safety purposes.
- Construction of systems for simplification of neural networks, to facilitate mechanistic interpretation.

Researcher - Beneficial AI Foundation

Advisor: Max Teqmark

- Introduction of a novel hypernetwork architecture for generative modeling of mechanistically interpretable neural networks.
- Architecture is a merge of Pareto hypernetworks, hierarchical VAEs, and graph transformers.
- Reverse-engineering of 4 learned algorithms, with algorithmic phase transitions using order parameters and visualization via force-directed graph drawing.

Researcher - Soljacic Group

Advisor: Marin Soljacic

- Invented a novel machine learning optimization algorithm which blends learn to optimize (L2O) metalearning techniques, quasi-Newton optimization methods, and sparse neural networks.
- Theoretical results regarding convex and nonconvex stochastic convergence, and sparse neural network expressiveness, both with experimental support.

PROJECTS

Bayesian Recommender Systems

Class Final Project: Graduate Bayesian Modeling and Inference

- Probabilistic reformulation of the alternating least squares algorithm for low rank approximations in large matrix completion problems.
- Extension of algorithm from within the Bayesian framework to accommodate an expanded posterior class, using coordinate ascent variational inference and mean-field approximation.
- Experiments to support over a 2% improvement in Netflix Prize Dataset RMSE, and ablative analyses of structures in the learned posterior.

Parameter-Efficient Approximation by Exploitation of Sparsity

Class Final Project: Graduate Statistical Learning Theory

- Novel theorems regarding the expressiveness sparse neural network architectures, more specifically their ability to parameter-efficiently replicate any other sparse architecture. Proofs draw from ideas about the Pinsker inequality, Cheeger inequality, card shuffling, algrebraic connectivity, and transposition graphs.
- Experimental evaluation of the ability of sparse architectures to perform compositionally sparse linear operations.

A Perturbative Approach to Random Matrix Spectra

Class Final Project: Quantum Physics III

Sep 2022 - Dec 2022

Feb 2023 - May 2023

Sep 2019 - Jun 2023

Sep 2023 - Jun 2024 (Expected)

Sep 2023 - Present

Jul 2023 - Aug 2023

Jun 2020 - Jun 2023

- Derivation of the joint eigenvalue distribution of random Hermitian matrices and the Wigner semicircle law, using a combination of second-order quantum perturbation theory, Metropolis-Hastings, and Brownian motion.
- Simulation-based exploration of connections to chaotic quantum billiards and application to emission spectra of quantum dots.

Swarm Intelligence for MIT Battlecode AI Programming Competition Jan 2020 - Jan 2022

- Developed novel swarm intelligence algorithms to play multi-agent incomplete information real time strategy games.
- Championed the tournament in 2022 on a one person undergraduate team up against \sim 200 teams of up to four graduate students from MIT, other top institutions in the US, and around the world.
- Won a total of \$9500.

Differential Entropy Codes for Trained Image Compression

Class Final Project: Computer Vision

- Development of neural network based image compression techniques.
- Use of information theory to develop channel codes for compression that resemble the forward passes of VAEs and BNNs.
- Reinvented reparameterization gradients, hierarchical depth, and KL annealing schedules in the process, without prior knowledge of variational inference.

TEACHING EXPERIENCE

Teaching Assistant - MIT 8.01 Classical Mechanics I

- Ideation, prototyping, and testing of novel methods for making use of language models for teaching purposes. Collaborative construction of a large language model for generating physics problems used to teach \sim 700 students and for answering student questions.
- Drafting of manuscripts for publication in journals on physics education.
- Office hours, grading, exam proctoring, review of course websites and other materials for errors.

PUBLICATIONS AND PREPRINTS

- Isaac Liao, Rumen Dangovski, Jakob Nicolaus Foerster, and Marin Soljačić. Learning to optimize quasi-newton methods. *Transactions on Machine Learning Research*, 2023a. ISSN 2835-8856. URL https://openreview.net/forum?id=Ns2X7Azudy
- Isaac Liao, Ziming Liu, and Max Tegmark. Generating interpretable networks using hypernetworks, 2023b. URL https://arxiv.org/abs/2312.03051

INVITED TALKS

• Massachusetts Institute of Technology SuperUROP Showcase, "Learning to Optimize Quasi-Newton Methods (LODO)", Cambridge, MA, May 2023.

AWARDS AND HONORS

MIT Battlecode Competition: Champion. \$8000 prize.	Jan 2022
MIT Battlecode Competition: 7th place. \$1000 prize.	Jan 2021
MIT Battlecode Competition: Champion of Newbie division. \$500 prize.	Jan 2020
International Physics Olympiad: Silver Medal.	Jul 2019
International Physics Olympiad: Honorable Mention.	Jul 2018

Sep 2023 - Present

Feb 2021 - May 2021