# Ziyang Li

https://liby99.github.io/; https://liby.me

### Education

•	University of Pennsylvania	Philadelphia, PA
	Ph.D. Computer and Information Science, Advisor: Mayur Naik; GPA: 4.0	Jul 2019 – Present
•	University of California – San Diego B.S. Computer Science (3.9/4.0); B.S. Mathematics (3.7/4.0); GPA: 3.6	La Jolla, CA Sep 2015 – Jun 2019

## RESEARCH INTEREST

My research spans the fields of programming languages (PL) and machine learning (ML). I am particularly interested in neurosymbolic approaches which integrates traditional symbolic reasoning frameworks with machine learning models, jointly improving natural perception and reasoning capabilities. I design the programming language, Scallop, which is a neurosymbolic language based on Datalog, that can be integrated with PyTorch framework, supporting differentiable logical reasoning. I apply neurosymbolic methods to various domains including computer vision (CV), natural language processing (NLP), program analysis, computer security, robotics, and etc.

### PUBLICATIONS

• Understanding the Effectiveness of Large Language Models in Detecting Security Vulnerabilities

Avishree Khare, Saikat Dutta, <u>Ziyang Li</u>, Alaia Solko-Breslin, Rajeev Alur, Mayur Naik [arXiv]

• LASER: Neuro-Symbolic Learning of Semantic Video Representations Jiani Huang, Ziyang Li, Mayur Naik, David Jacobs, Sernam Lim [arXiv]

## • Relational Programming with Foundation Models

Ziyang Li, Jiani Huang, Jason Liu, Felix Zhu, Eric Zhao, William Dodds, Neelay Velingker, Rajeev Alur, Mayur Naik

AAAI Conference on Artificial Intelligence (AAAI 2024)

• Improved Logical Reasoning of Language Models via Differentiable Symbolic Programming

Jiani Huang<sup>\*</sup>, Hanlin Zhang<sup>\*</sup>, <u>Ziyang Li</u>, Mayur Naik, Eric Xing ACL-Findings 2023

- Scallop: a Language for Neurosymbolic Programming <u>Ziyang Li</u>, Jiani Huang, Mayur Naik Programming Language Design and Implementation (PLDI 2023). [Code] [arXiv]
- Scallop: From Probabilistic Deductive Databases to Scalable Differentiable Reasoning Jiani Huang<sup>\*</sup>, Ziyang Li<sup>\*</sup>, Binghong Chen, Karan Samel, Mayur Naik, Le Song, Xujie Si NeurIPS 2021. [Code]
- ARBITRAR: User-Guided API Misuse Detection <u>Ziyang Li</u>, Aravind Machiry, Binghong Chen, Mayur Naik, Ke Wang, Le Song IEEE Security and Privacy (S&P) 2021. [Paper] [Code] [Talk]
- HOPPITY: Learning Graph Transformations to Detect and Fix Bugs in Programs Elizabeth Dinella, Hanjun Dai, Ziyang Li, Mayur Naik, Le Song, Ke Wang International Conference on Learning Representations (ICLR) 2020, Spotlight. [Paper]

Workshop Papers:

- Scallop: From Probabilistic Deductive Databases to Scalable Differentiable Reasoning Jiani Huang<sup>\*</sup>, Ziyang Li<sup>\*</sup>, Binghong Chen, Karan Samel, Mayur Naik, Le Song, Xujie Si AIPLANS Workshop @ NeurIPS 2021
- Numerical Reasoning over Legal Contracts via Relational Database Jiani Huang, <u>Ziyang Li</u>, Ilias Fountalis, Mayur Naik DBAI Workshop @ NeurIPS 2021

In Submission:

- Beyond Differentiability: Neurosymbolic Learning with Black-Box Programs Alaia Solko-Breslin, Ziyang Li, Neelay Velingker, Rajeev Alur, Mayur Naik In Submission
- DISCRET: A Self-Interpretable Framework for Treatment Effect Estimation Yinjun Wu, Neelay Velingker, Ziyang Li, Kan Chen, Mayank Keoliya, Mayur Naik, Qi Long, Eric Wong, Emily Getzen, Ravi Parikh In Submission
- Bityr: A Pluggable Framework for Learning Types from Binaries Ziyang Li, Anton Xue, Hanjun Dai, Rajeev Alur, Aravind Machiry, Mayur Naik In Submission
- Weighted Contrastive Learning for Scene Graph Generation Yinjun Wu, Adam Stein, Ziyang Li, Mayur Naik In Submission

#### RESEARCH EXPERIENCES

•	Research Assistant, UPenn PEARL Advisor: Mayur Naik	University of Pennsylvania July 2019 – Present
•	Undergraduate Research Assistant, UCSD PL Advisor: Sorin Lerner	Univerysity of California – San Diego Sep 2018 – Jun 2019
•	Undergraduate Research Assistant, UCSD VISCOM	<b>P</b> Univerysity of California – San Diego Mar 2018 – Jun 2019
•	Undergraduate Research Intern, UCSD Design Lab Advisor: Scott Klemmer	Univerysity of California – San Diego Jun 2017 – Jun 2018
W	ORKING EXPERIENCES	
•	Relational AI Research Intern	Virtual, May 2021 – August 2021
•	Visa, Inc. Research Intern, Mentor: Ke Wang	Virtual, May 2020 – July 2020
•	Coursera, Inc. Front-end Engineer Intern	Mountain View, CA, Jun 2018 - Sep 2018
•	Deep Media, Ltd. Full-stack Engineer Intern	Shenzhen, China, Sep 2016 – Jan 2017
•	Yobs Technology Full-stack Engineer Intern	Los Angeles, CA, Jan 2016 – Sep 2016
•	Easyhin Front-end Engineer Intern	Shenzhen, China, Aug 2015 – Sep 2015
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## Fellowships

• KPCB Fellows 2018 Engineering Fellows (<2%)

San Francisco, June 2018

- Teaching Assistant CIS 547, Software Analysis
- Tutor CSE 190, Virtual Reality Technology
- Tutor CSE 165, 3D User Interaction
- Tutor CSE 130, Programming Language
- Tutor CSE 163, Advanced Computer Graphics
- Tutor CSE 167, Intro to Computer Graphics
- Tutor CSE 12, Data Structure

#### Selected Side-Projects

# University of Pennsylvania, Fall 2020, Fall 2021 University of California – San Diego, Spring 2019 University of California – San Diego, Winter 2019 University of California – San Diego, Fall 2018 University of California – San Diego, Spring 2018 University of California – San Diego, Winter 2018 University of California – San Diego, Winter 2017

#### Rendering, Animation, and Simulations:

- Fourier Depth of Field: Fourier transform based depth of field analysis for RayTracer. [Github]
- Rotamina: Character animator and simulator with GUI. Written in C++. [Github]
- MPM-RS: Material point method for simulating fluid and soft-body dynamics. Written in Rust. [Github]
- AoSoA Storage: Array-of-struct-of-array storage system for high performance parallel computing with Kokkos and Cabana. Designed for physics simulation applications. Used by UPenn CG Group. [Github]

#### Video Games and VR Applications:

- VR Piano: VR Application for recording virtual characters playing the Piano, connecting MIDI keyboards and body tracking systems. Written in Unity.
- Naruhodo: An 3D story puzzle game engine made in Unity for easy level design. [Github]
- Neon Ping Pong: VR Ping Pong Game written in C++. [Website] [Video]
- **Space Escape**: VR Room Escape Puzzle Game settled in Space Station. Developed in Unity. [Website] [Video]

#### Web Applications:

- inso.link: A mirror download site for OSU! beatmaps for Chinese players. Hosted and maintained since 2016 and has 30K users while supporting >2M downloads. [Website] [Status Site]
- saemanga.com: A minimalistic online manga reader. Had >1K users. (2016-2020, currently out-of-service)

## **Programming Languages and Program Analysis Tools**

- **Probabilistic DataLog Engine**: A probabilistic datalog engine with high performance optimizations oriented towards machine learning applications. Written in Rust.
- Under-constrained Symbolic Execution Engine: High performance under-constrained symbolic execution engine for LLVM IR written in Rust. Used in Arbitrar.
- LLVM IR Binding for Rust: Safe LLVM Binding for Rust. Used in Arbitrar. [Github]
- Geometry Sketchpad: Geometry sketching GUI application written in Rust. [Github]
- Menhera: A TypeScript-like functional programming language compiler written in OCaml. [Github]

#### Skills

- Languages: Rust, C++/C, Python, C#, TypeScript/JavaScript, OCaml, Java, Haskell, Coq
- Libraries/Engines/Tools: PyTorch, Unity, Unreal Engine 4/5, React, ExpressJs, Asp.net
- Design: Adobe Photoshop, Final Cut Pro, Premiere, After Effects, Illustrator, Blender, Cinema 4D
- Audio/Music: Logic Pro, Ableton