Linyi Li

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Ph.D. candidate in computer science with research interests in **machine learning** and **computer security**, especially in building **certifiably trustworthy** deep learning systems

- by providing rigorous guarantees of various trustworthy properties (robustness, fairness, reliability, etc) for a given deep neural network model;
- by improving such guaranteed trustworthiness for machine learning via strategic architecture design, dataset building, model training, post-processing, etc.

Education

University of Illinois Urbana-Champaign

- Ph.D. Candidate (since May 2020) in Computer Science
 - Advisor: Prof. Bo Li Co-advisor: Prof. Tao Xie
 - Thesis proposal: Enabling large-scale certifiably trustworthy deep learning systems

Tsinghua University

- Bachelor of Computer Science and Technology
 - GPA: Major: 91.6/100 Overall: 90.1/100
 - Advisor: Prof. Xiaoying Bai
 - Thesis: Model-Based Automated Web API Test Generation.
 - Tsinghua University Outstanding Undergraduate, Class of 2018
 - Excellent Undergraduate, Department of Computer Science and Technology

Selected Publications

(* stands for equal contribution)

- 1. Linyi Li, Tao Xie, Bo Li. SoK: Certified Robustness for Deep Neural Networks. *IEEE Symposium on Security* and Privacy (SP) 2023.
- Mintong Kang*, Linyi Li*, Maurice Weber, Yang Liu, Ce Zhang, Bo Li. Certifying Some Distributional Fairness with Subpopulation Decomposition. *Advances in Neural Information Processing Systems (<u>NeurIPS</u>) 2022.*
- 3. Linyi Li, Jiawei Zhang, Tao Xie, Bo Li. Double Sampling Randomized Smoothing. *International Conference on Machine Learning (ICML) 2022.*
- Fan Wu*, Linyi Li*, Chejian Xu, Huan Zhang, Bhavya Kailkhura, Krishnaram Kenthapadi, Ding Zhao, Bo Li. COPA: Certifying Robust Policies for Offline Reinforcement Learning against Poisoning Attacks. *International Conference on Learning Representations (ICLR)* 2022.
- Zhuolin Yang*, Linyi Li*, Xiaojun Xu, Bhavya Kailkhura, Tao Xie, Bo Li. On the Certified Robustness for Ensemble Models and Beyond. *International Conference on Learning Representations* (*ICLR*) 2022.
- Zhuolin Yang*, Linyi Li*, Xiaojun Xu*, Shiliang Zuo, Qian Chen, Benjamin Rubinstein, Ce Zhang, Bo Li. TRS: Transferability Reduced Ensemble via Encouraging Gradient Diversity and Model Smoothness. *Advances in Neural Information Processing Systems (<u>NeurIPS</u>) 2021.*
- 7. Jiawei Zhang*, Linyi Li*, Huichen Li, Xiaolu Zhang, Shuang Yang, Bo Li. Progressive-Scale Boundary

Aug 2018 – Jul 2023 (expected)

Beijing, China Aug 2014 – Jul 2018 Blackbox Attack via Projective Gradient Estimation. International Conference on Machine Learning (<u>ICML</u>) 2021.

- 8. Linyi Li*, Maurice Weber*, Xiaojun Xu, Luka Rimanic, Bhavya Kailkhura, Tao Xie, Ce Zhang, Bo Li. TSS: Transformation-Specific Smoothing for Robustness Certification. *ACM Conference on Computer and Communications Security* (*CCS*) 2021.
- Huichen Li*, Linyi Li*, Xiaojun Xu, Xiaolu Zhang, Shuang Yang, Bo Li. Nonlinear Projection Based Gradient Estimation for Query Efficient Blackbox Attacks. *International Conference on Artificial Intelligence* and Statistics (<u>AISTATS</u>) 2021.
- 10. Linyi Li*, Zexuan Zhong*, Bo Li, Tao Xie. Robustra: Training Provable Robust Neural Networks over Reference Adversarial Space. *International Joint Conference on Artificial Intelligence (IJCAI)* 2019.

Selected Awards

0	2022 AdvML Rising Star Award	2022
0	1st Place, 3rd International Verification of Neural Networks Competition (VNN-COMP'22)	2022
0	Qualcomm Innovation Fellowship Finalist (among 44 in North America)	2022
0	Two Sigma PhD Fellowship Finalist (among 13 worldwide)	2022
0	ACM CCS Travel Conference Award	2021
0	2nd Place, ICPC Mid-Central USA Regional Contest	2019
0	3rd Place, ICPC Mid-Central USA Regional Contest	2018
0	Wing Kai Cheng Fellowship	2018
0	Tsinghua University Outstanding Undergraduate, Class of 2018 (301 of 3555)	2018
0	Excellent Undergraduate, Department of Computer Science and Technology at Tsinghua	2018
0	Academic Excellence Award with HUAWEI Scholarship	2017
0	"Sogou Cup" Artificial Intelligence Programming Contest Top 16	2015
0	Top 0.03% in the National College Entrance Exam	2014
0	National Olympics in Informatics, Bronze Medal	2013
0	National Olympics in Informatics in Provinces, First Prize	2012

Invited Talks

0	Webinar at TrustML Young Scientist Seminars, RIKEN-AIP	Aug 2022
0	Talk at 4th Workshop on Adversarial Learning Methods for Machine Learning and Data Mining KDD 2022	(AdvML), Aug 2022
0	Virtual Talk at AI Time platform	Aug 2022
0	Webinar at Jiangmen platform	Feb 2022
0	Virtual Talk at Visual Informatics Group, University of Texas at Austin	Oct 2021
0	Webinar at Safe AI, Bilibili	Mar 2021
0	Virtual Talk at Safe AI Lab, Carnegie Mellon University	Mar 2021
0	Virtual Talk at Workshop on Robust Artificial Intelligence, Lorentz Center	Jan 2021

Teaching and Mentorship Experiences

Logic and AI (Graduate Level)

- University of Illinois Urbana-Champaign
 - Lead the course project design and grading.
 - Setup infrastructure and help the lecture design of the new course.

Data Structure (Undergraduate Level)

- Tsinghua University
- Host two seminar for homework problem discussions.
- Contribute several original problems for assignments and exams.

Undergraduate Research Intern Co-Mentorship

- Mentored students:
- Mintong Kang Nov 2021 - May 2022 Paper published at NeurIPS 2022 on certified fairness. Now a PhD student at UIUC. - Chenhui Zhang Dec 2021 – May 2022 Paper submitted on ensemble pruning for certified robustness. Now an undergraduate student at UIUC. - Jiawei Zhang Aug 2020 – Feb 2021 Paper published at ICML 2021 on black-box neural network attacks. Now a master student at UIUC. - Wenda Chu Nov 2021 – Feb 2022 Paper published at ICML 2022 on certification of point cloud models. Now an undergraduate student at Tsinghua University.

Student mentor for new PhD students in computer science at UIUC. Fall 2022 Graduate ambassador for prospective PhD students in computer science at UIUC. Spring 2021

Internship Experiences

Microsoft Research Lab - New England

- Research Intern mentored by Dr. Adam Kalai
- Program synthesis by finetuning from large language models with a handcrafted distributed training framework.

Fujitsu Laboratories of America

- Research Intern mentored by Dr. Mukul Prasad
- Program Synthesis for AutoML based on learning from mined corpus and static analysis based data augmentation.
- Lead to a paper accepted by ICSE 2022.

Microsoft 0

- Data Scientist Intern mentored by Dr. Neel Sundaresan
- Build an efficient search engine for PR comments and commits.
- Utilize transformer models for unsupervised commit classification and code change pattern extraction.

Carnegie Mellon University

- Undergrad Research Intern mentored by Prof. Matt Fredrikson
- Apply integrated gradients to explain and visualize convolutional neural networks.
- Develop an automatic method to capture vital lesions for diabetic retinopathy diagnosis, leading to a paper accepted by ITC 2018.

Sogou Inc.

- 0 Back-end Engineer Intern
 - Design the interfaces between back-end and front-end for a tutor ordering platform.
 - Implement an efficient and advanced tutor search module that supported multiple keys.

Teaching Assistant

Sept 2015 – Jan 2016

Lead Teaching Assistant Aug 2021 – Dec 2021

May 2022 – Aug 2022

Redmond, WA

Pittsburgh, PA

Jun 2017 – Sept 2017

Jun 2019 – Aug 2019

Beijing, China Aug 2015 – Oct 2015

3/6

Cambridge, MA

Remote

May 2021 – Aug 2021

Selected Open-Source Projects

• Developer of leaderboard on provable training and verification approaches for DNNs. ≈ 100 stars https://github.com/AI-secure/Provable-Training-and-Verification-Approaches-Towards-Robust-Neural-Networks https://github.com/sokcertifiedrobustness/sokcertifiedrobustness.github.io • Developer of VeriGauge: unified toolbox for representative robustness verification approaches for deep neural networks. ≈ 80 stars https://github.com/AI-secure/VeriGauge https://github.com/sokcertifiedrobustness/certified-robustness-benchmark - Over 20 verification approaches are reliably reproduced. - Accompanying paper published at SP 2023. • Developer of TSS: transformation-specific smoothing-based robustness certification against geometric perturbations. ≈ 20 stars https://github.com/AI-secure/semantic-randomized-smoothing - State-of-the-art verification approach for robustness against geometric perturbations. - Accompanying paper published at CCS 2021. • Key contributor of α - β -CROWN (alpha-beta-CROWN), a scalable neural network verifier. ≈ 100 stars

https://github.com/huanzhang12/alpha-beta-CROWN

- 2x winner of International Verification of Neural Networks Competition (VNN-COMP'21, '22).
- Accompanying paper published at NeurIPS 2022.

Services

• NeurIPS 2022, Workshop on Trustworthy and Socially Responsible Machine Learning	Organizer
o NeurIPS (2021-)	PC Member
o ICML (2022-)	PC Member
• ICLR (2021-)	PC Member
o AAAI (2022-)	PC Member
o UAI (2021-)	PC Member
• AISTATS (2021-)	PC Member
o TPAMI	Reviewer
o TMLR	Reviewer
o Neurocomputing	Reviewer
o ICML 2022, Workshop on Formal Verification of Machine Learning	PC Member
• KDD (2020-). Workshop on Adversarial Learning Methods for Machine Learning and Data 1	Mining PC Mem-

- o KDD (2020-), workshop on Adversarial Learning Methods for Machine Learning and Data Mining PC Mem ber
- ICML 2019, Workshop on the Security and Privacy of Machine Learning (SPML) PC Member
- CVPR 2019, Workshop on Adversarial Machine Learning in Real-World Computer Vision Systems (AdvMLCV)
 PC Member

Full Publication List

(* stands for equal contribution)

- 1. Linyi Li, Tao Xie, Bo Li. SoK: Certified Robustness for Deep Neural Networks. *IEEE Symposium on Security* and Privacy (SP) 2023.
- Mintong Kang*, Linyi Li*, Maurice Weber, Yang Liu, Ce Zhang, Bo Li. Certifying Some Distributional Fairness with Subpopulation Decomposition. *Advances in Neural Information Processing Systems (<u>NeurIPS</u>) 2022.*
- 3. Xiaojun Xu, Linyi Li, Bo Li. LOT: Layer-wise Orthogonal Training on Improving 12 Certified Robustness. Advances in Neural Information Processing Systems (NeurIPS) 2022.
- Bhaskar Ray Chaudhury, Linyi Li, Mintong Kang, Bo Li, Ruta Mehta. Fairness in Federated Learning via Core-Stability. Advances in Neural Information Processing Systems (<u>NeurIPS</u>) 2022.
- Huan Zhang*, Shiqi Wang*, Kaidi Xu*, Linyi Li, Bo Li, Suman Jana, Cho-Jui Hsieh, J. Zico Kolter. General Cutting Planes for Bound-Propagation-Based Neural Network Verification. Advances in Neural Information Processing Systems (<u>NeurIPS</u>) 2022.
- Zhuolin Yang*, Zhikuan Zhao*, Boxin Wang, Jiawei Zhang, Linyi Li, Hengzhi Pei, Bojan Karlaš, Ji Liu, Heng Guo, Ce Zhang, Bo Li. Improving Certified Robustness via Statistical Learning with Logical Reasoning. Advances in Neural Information Processing Systems (<u>NeurIPS</u>) 2022.
- Hanjiang Hu, Zuxin Liu, Linyi Li, Jiacheng Zhu, Ding Zhao. Robustness Certification of Visual Perception Models via Camera Motion Smoothing. 6th Annual Conference on Robot Learning (CoRL 2022).
- 8. Linyi Li, Jiawei Zhang, Tao Xie, Bo Li. Double Sampling Randomized Smoothing. *International Conference on Machine Learning (ICML) 2022.*
- 9. Wenda Chu, Linyi Li, Bo Li. TPC: Transformation-Specific Smoothing for Point Cloud Models. *International Conference on Machine Learning* (*ICML*) 2022.
- 10. Maurice Weber, Linyi Li, Boxin Wang, Zhikuan Zhao, Bo Li, Ce Zhang. Certifying Out-of-Domain Generalization for Blackbox Functions. *International Conference on Machine Learning (ICML)* 2022.
- Fan Wu*, Linyi Li*, Chejian Xu, Huan Zhang, Bhavya Kailkhura, Krishnaram Kenthapadi, Ding Zhao, Bo Li. COPA: Certifying Robust Policies for Offline Reinforcement Learning against Poisoning Attacks. *International Conference on Learning Representations (<u>ICLR</u>) 2022.*
- 12. Zhuolin Yang*, Linyi Li*, Xiaojun Xu, Bhavya Kailkhura, Tao Xie, Bo Li. On the Certified Robustness for Ensemble Models and Beyond. *International Conference on Learning Representations (ICLR)* 2022.
- 13. Fan Wu, Linyi Li, Zijian Huang, Yevgeniy Vorobeychik, Ding Zhao, Bo Li. CROP: Certifying Robust Policies for Reinforcement Learning through Functional Smoothing. *International Conference on Learning Representations* (*ICLR*) 2022.
- Ripon Saha, Akira Ura, Sonal Mahajan, Chenguang Zhu, Linyi Li, Yang Hu, Hiroaki Yoshida, Sarfraz Khurshid, Mukul R. Prasad. SapientML: Synthesizing Machine Learning Pipelines by Learning from Human-Written Solutions. *International Conference on Software Engineering* (ICSE) 2022.
- Zhuolin Yang*, Linyi Li*, Xiaojun Xu*, Shiliang Zuo, Qian Chen, Benjamin Rubinstein, Ce Zhang, Bo Li. TRS: Transferability Reduced Ensemble via Encouraging Gradient Diversity and Model Smoothness. *Advances in Neural Information Processing Systems (NeurIPS)* 2021.
- Jiawei Zhang*, Linyi Li*, Huichen Li, Xiaolu Zhang, Shuang Yang, Bo Li. Progressive-Scale Boundary Blackbox Attack via Projective Gradient Estimation. *International Conference on Machine Learning* (<u>ICML</u>) 2021.

- 17. Linyi Li*, Maurice Weber*, Xiaojun Xu, Luka Rimanic, Bhavya Kailkhura, Tao Xie, Ce Zhang, Bo Li. TSS: Transformation-Specific Smoothing for Robustness Certification. *ACM Conference on Computer and Communications Security* (<u>CCS</u>) 2021.
- 18. Huichen Li*, Linyi Li*, Xiaojun Xu, Xiaolu Zhang, Shuang Yang, Bo Li. Nonlinear Projection Based Gradient Estimation for Query Efficient Blackbox Attacks. *International Conference on Artificial Intelligence and Statistics (AISTATS) 2021*.
- 19. Linyi Li, Zhenwen Li, Weijie Zhang, Jun Zhou, Pengcheng Wang, Jing Wu, Guanghua He, Xia Zeng, Yuetang Deng, Tao Xie. Clustering Test Steps in Natural Language toward Automating Test Automation. ACM Joint European Software Engineering Conference and Symposium on the Foundations of Software Engineering (<u>ESEC/FSE</u>) 2020, Industry Track.
- 20. Linyi Li*, Zexuan Zhong*, Bo Li, Tao Xie. Robustra: Training Provable Robust Neural Networks over Reference Adversarial Space. *International Joint Conference on Artificial Intelligence (IJCAI)* 2019.
- 21. Klas Leino, Shayak Sen, Anupam Datta, Matt Fredrikson, Linyi Li. Influence-Directed Explanations for Deep Convolutional Networks. *International Test Conference* (*ITC*) 2018.
- 22. Junyi Wang, Xiaoying Bai, Linyi Li, Zhicheng Ji, Haoran Ma. A Model-Based Framework For Cloud API Testing. *Computer Software and Applications Conference (COMPSAC)* 2017.
- 23. Junyi Wang, Xiaoying Bai, Haoran Ma, Linyi Li, Zhicheng Ji. Cloud API Testing. *IEEE International Conference on Software Testing, Verification and Validation Workshops (ICSTW)* 2017.

Preprints

- 1. Jiawei Zhang, Linyi Li, Ce Zhang, Bo Li. CARE: Certifiably Robust Learning with Reasoning via Variational Inference. *arXiv:* 2209.05055.
- 2. Wenda Chu*, Chulin Xie*, Boxin Wang, Linyi Li, Lang Yin, Han Zhao, Bo Li. FOCUS: Fairness via Agent-Awareness for Federated Learning on Heterogeneous Data. *arXiv: 2207.10265*.
- 3. Zhangheng Li, Tianlong Chen, Linyi Li, Bo Li, Zhangyang Wang. Can pruning improve certified robustness of neural networks. *arXiv: 2206.07311*.
- 4. Zhonghan Niu, Zhaoxi Chen, **Linyi Li**, Yubin Yang, Bo Li, Jinfeng Yi. On the Limitations of Denoising Strategies as Adversarial Defenses. *arXiv: 2012.09384*.