# Wenhao Ding

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#### Education

Carnegie Mellon University, Pittsburgh, USA

Ph.D. Mechanical Engineering

Carnegie Mellon University, Pittsburgh, USA

M.S. Machine Leaning

Tsinghua University, Beijing, China

B.Eng. Electronic Engineering

## **Research Interests**

My research lies in closing the loop of agent and environment from the data perspective. I believe that building safe, robust, and generalizable autonomy relies on both powerful algorithms and suitable environments for training and validating the algorithms. To achieve this goal, I work on the following directions:

**Increase data coverage:** Generate critical scenarios for scaling up training and validation.

**Increase data efficiency:** Discover underlying structure for learning compositional representation.

## **Research Experience**

NVIDIA Research, Santa Clara, USA	July 2023 - Now
Research Scientist Intern, Autonomous Vehicle Group	
Amazon Lab126, Sunnyvale, USA Applied Scientist Intern	May 2022 - Aug 2022
Bosch Center for Artificial Intelligence, Pittsburgh, USA Machine Learning Research Intern	May 2021 - Aug 2021
Chinese University of HongKong, HongKong, China Research Assitant	July 2017 - Sep 2017

#### **Publication**

## **Conference and Journal Paper**

- 1. [NeurIPS'23] Seeing is not Believing: Robust Reinforcement Learning against Spurious Correlation \*Wenhao Ding, \*Laixi Shi, Yuejie Chi, Ding Zhao
- 2. [ICML'23] Bayesian Reparameterization of Reward-Conditioned Reinforcement Learning with Energy-based Models
  - \*Wenhao Ding, \*Tong Che, Ding Zhao, Marco Pavone
- 3. [ICRA'23] Learning to View: Decision Transformers for Active Object Detection Wenhao Ding, Nathalie Majcherczyk, Mohit Deshpande, Xuewei Qi, Ding Zhao, Rajasimman Madhivanan, Arnie Sen
- 4. [T-ITS'23] A Survey on Safety-critical Scenario Generation for Autonomous Driving A Methodological Perspective

Wenhao Ding, Chejian Xu, Haohong Lin, Bo Li, Ding Zhao

- 5. [CoRL'23] What Went Wrong? Closing the Sim-to-Real Gap via Differentiable Causal Discovery *Peide Huang, Xilun Zhang, Ziang Cao, Shiqi Liu, Mengdi Xu, Wenhao Ding, Jonathan Francis, Bingqing Chen, Ding Zhao*
- 6. [NeurIPS'22] Generalizing Goal-Conditioned Reinforcement Learning with Variational Causal Reasoning *Wenhao Ding*, *Haohong Lin*, *Bo Li*, *Ding Zhao*
- 7. [NeurIPS'22] SafeBench: A Benchmarking Platform for Safety Evaluation of Autonomous Vehicles \*Chejian Xu, \*Wenhao Ding, Weijie Lyu, Zuxin Liu, Shuai Wang, Yihan He, Hanjiang Hu, Ding Zhao, Bo Li
- 8. [CoRL'22] CausalAF: Causal Autoregressive Flow for Goal-Directed Safety-Critical Scenes Generation *Wenhao Ding*, *Haohong Lin*, *Bo Li*, *Ding Zhao*
- 9. [RA-L'21] Multimodal Safety-Critical Scenarios Generation for Decision-Making Algorithms Evaluation *Wenhao Ding*, *Baiminng Chen*, *Bo Li*, *Kim Ji Eun*, *Ding Zhao*
- 10. [ICRA'21] Context-Aware Safe Reinforcement Learning for Non-Stationary Environments Baiming Chen, Zuxin Liu, Jiacheng Zhu, Mengdi Xu, Wenhao Ding, Liang Li, Ding Zhao
- 11. [AISTATS'21] Deep Probabilistic Accelerated Evaluation: A Certifiable Rare-Event Simulation Methodology for Black-Box Autonomy

  Mansur Arief\*, Zhiyuan Huang\*, Guru Kumar, Yuanlu Bai, Wenhao Ding, Henry Lam, Ding Zhao
- 12. [NeurIPS'20] Task-Agnostic Online Reinforcement Learning with an Infinite Mixture of Gaussian Processes *Mengdi Xu, Wenhao Ding, Jiacheng Zhu, Zuxin Liu, Baiming Chen, Ding Zhao*
- 13. [IROS'20] Learning to Collide: An Adaptive Safety-Critical Scenarios Generating Method *Wenhao Ding*, *Baiming Chen*, *Minjun Xu and Ding Zhao*
- 14. [ICRA'20] CMTS: Conditional Multiple Trajectory Synthesizer for Generating Safety-critical Driving Scenarios
  - Wenhao Ding, Mengdi Xu and Ding Zhao
- 15. [ICRA'19] A New Multi-vehicle Trajectory Generator to Simulate Vehicle-to-Vehicle Encounters *Wenhao Ding*, *Wenshuo Wang and Ding Zhao*
- 16. [T-ASLP'19] Adaptive Multi-scale Detection of Acoustic Events *Wenhao Ding and Liang He*
- 17. [DCASE'19] Prior Knowledge-based Regularization for Sound Event Localization and Detection *Wenhao Ding\**, *Jingyang Zhang\* and Liang He*
- 18. [Interspeech'19] Multi-Scale Time-Frequency Attention for Acoustic Event Detection *Jingyang Zhang, Wenhao Ding, Jintao Kang and Liang He*
- 19. [Interspeech'18] MTGAN: Speaker Verification through Multitasking Triplet Generative Adversarial Networks
  - Wenhao Ding and Liang He
- 20. [ROBIO'18] Hierarchical Reinforcement Learning Framework towards Multi-agent Navigation *Wenhao Ding*, *Shuaijun Li and Huihuan Qian*
- 21. [ROBIO'18] Vehicle Pose and Shape Estimation through Multiple Monocular Vision *Wenhao Ding*, *Shuaijun Li*, *Guilin Zhang*, *Xiangyu Lei and Huihuan Qian* 
  - **Workshop Paper and Preprint**
- 22. Semantically Controllable Scene Generation with Guidance of Explicit Knowledge *Wenhao Ding*, *Bo Li*, *Kim Ji Eun*, *Ding Zhao*

- Environment Generation for Generalizable Robots (EGG) Workshop at **RSS** 2023 Knowledge and Logical Reasoning in the Era of Data-driven Learning Workshop at **ICML** 2023
- 23. Safety-aware Causal Representation for Trustworthy Reinforcement Learning in Autonomous Driving *Haohong Lin, \*Wenhao Ding, Zuxin Liu, Yaru Niu, Jiacheng Zhu, Yuming Niu, Ding Zhao* Preprint arXiv:2311.10747
- Your Room is not Private: Gradient Inversion Attack for Deep Q-Learning Miao Li, \*Wenhao Ding, Ding Zhao Preprint arXiv:2306.09273
- 25. Certifiable Deep Importance Sampling for Rare-Event Simulation of Black-Box Systems Mansur Arief, Yuanlu Bai, Wenhao Ding, Shengyi He, Zhiyuan Huang, Henry Lam, Ding Zhao Preprint arXiv:2111.02204
- 26. Trustworthy Reinforcement Learning Against Intrinsic Vulnerabilities: Robustness, Safety, and Generalizability \*Mengdi Xu, \*Zuxin Liu, \*Peide Huang, Wenhao Ding, Zhepeng Cen, Bo Li, Ding Zhao Preprint arXiv:2209.08025

#### **Honors & Awards**

- 2023 NeurIPS Scholar Award
- 2022 Qualcomm Innovation Fellowship Winner, North America
- 2022 CMU K&L Gates Presidential Fellowship, College of Engineering Nominee
- 2022 NeurIPS Scholar Award
- 2019 CMU Graduate Student Assembly/Provost Conference Funds
- 2018 Tsinghua University Outstanding Bachelor Thesis Award (5%)
- 2017 34th Tsinghua University Academic Challenge Cup (Second prize)
- 2016 Fellowship of Spark Talents Program (50 recipients in Tsinghua per year)

#### **Academic Services**

Conference Reviewer: ICML 22-23, ICLR 22-24, NeurIPS 21-23 (top reviewer), AISTATS 23-24,

ECCV 22, CVPR 22-24, ICCV 21-23, ICRA 20-24, IROS 20-23, ICME 20-23

Journal Reviewer: TMLR, IEEE RA-L, IEEE Access, IEEE T-ITS, IEEE TII, IEEE MM

Organizer: CVPR 2023 Secure and Safe Autonomous Driving Workshop and Challenge

ICRA 2022 SeasonDepth Challenge

**Program Committee:** NeurIPS 2022 ML4AD Workshop

NeurIPS 2022 TSRML Workshop

IJCAI 2022 AI4AD Workshop and Challenge

#### **Students Mentored**

Miao Li, Ph.D. student in CMU	Aug 2022 - Now
Haohong Lin, Ph.D. student in CMU	Aug 2021 - Now
Shuai Wang, Master's student in CMU	Aug 2021 - May 2023
Guilin Zhang, Master's student in CMU, now in Google	Aug 2021 - May 2022
Yihan He, Master's student in CMU, now in DeepRoute	Aug 2021 - May 2022
Jiayi Xia, Master's student in CMU, now in Zoox	Oct 2021 - May 2022
Minjun Xu, Master's student in CMU, now in Akuna Capital	Oct 2020 - May 2021

# **Invited Talks**

Critical Scenario Generation for Trustworthy Autonomy ZhiDongXi MOOCs (online)	June 8 2023
Critical Scenario Generation for Trustworthy Autonomy Department of Electronic Engineeing, Tsinghua, China, host by Prof. Liang He (online)	Apr 12 2023
Critical Scenario Generation for Trustworthy Autonomy AISOC Lab, CMU, USA, host by Prof. Fei Fang	Mar 21 2023
Generalizing Goal-Conditioned Reinforcement Learning with Variational Causal Reasoning AI Timer, China (online)	Feb 16 2023
Safety-critical Scenarios Generation with Causal Discovery Wayve, UK (online)	Oct 26 2022
Safety-Critical Driving Scenario Generation – and What Lessons We Have Learned University of Pennsylvania, USA (online), host by Prof. Rahul Mangharam	Feb 28 2022
Safety-critical Scenarios Generation for Autonomous Vehicles Stanford University, USA (online), host by Prof. Mykel Kochenderfer	Jan 31 2022