

Ding Zhao | Curriculum Vitae

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Professional Interests

- **Design/Test intelligent-physical-systems** to improve safety, efficiency, cognition, and adaption
- **Build smart cities** with self-driving, connected transportation, and human machine interactions
- **Develop learning algorithms** on rare event analysis, Bayesian modeling and unsupervised learning
- **Design** virtual, augmented, and mixed reality for the development of robots

Education

University of Michigan

Ann Arbor

Ph.D. in the Department of Mechanical Engineering

2011–2016

Faculty advisor: Prof. Huei Peng

Dissertation Title: "Accelerated Evaluation of Automated Vehicles"

Jilin University

Changchun, China

Bachelor (Summa Cum Laude) in the Department of Automotive Engineering

2006–2010

Faculty advisor: Prof. Hsin Guan

Thesis Title: "Design a Full-Size Four-wheel-steering and Four-wheel-drive Vehicle"

Academic and Industrial Experience

- | | |
|--------------------------------|--|
| 2017 – Present | Assistant Research Scientist , Michigan Institute for Data Science, Ann Arbor |
| 2017 – Present | Assistant Research Scientist , Robotics Institute, University of Michigan |
| 2017 – Present | Assistant Research Scientist , Mechanical Engineering, University of Michigan |
| 2016 – 2017 | Postdoctoral Research Fellow , Transportation Research Institute, Ann Arbor |
| 2011 – 2016 | Research Assistant , Mechanical Engineering, University of Michigan |
| May 2012 – Dec 2012 (8 months) | Design Engineer (Intern) , Research and Innovation Center, Ford Motor, Dearborn, MI |

Funded Research Projects

My funding mainly comes from automotive industry and the federal government. The following tables list the ongoing or accomplished projects. **I wrote the first proposal drafts for seven out of the eight projects I led as PI or Co-PI and got \$1.29 million funding under my name.** I also have a few proposals currently under review at NSF, Ford, and Toyota as the PI.

Table I Projects led by me as PI or Co-PI

| Sponsor | Dates | Role | Project title | Budget |
|------------------------------|-----------------|-----------------|--|--------------------|
| Denso | 10/1/17-9/30/19 | Sole PI | A unified, auto-checking, and self-analyzing data platform for intelligent driving applications | \$198,445 |
| DOE ¹ | 3/1/17-2/28/20 | Project Manager | Integrated power and thermal management for connected and automated vehicles through real-time adaptation and optimization | \$1,600,000 |
| SFMotor | 1/1/17-5/10/18 | PI | Platform construction and basic function developments for autonomous vehicle | \$150,000 |
| Mcicity | 5/1/16-12/31/17 | PI | Development of evaluation approaches and the certificate system for automated vehicles based on the accelerated evaluation | \$200,000 |
| SAIC ² | 6/1/17-12/31/17 | Co-PI | Methodology on Connected and Automated Vehicles Testing and Evaluation based on Accelerated Evaluation Theory | \$118,316 |
| Toyota Research Institute | 3/1/17-2/28/19 | Co-PI | Development of a "primary other test vehicle" for the testing and evaluation of high-level automated vehicles | \$723,748 |
| Mcicity | 5/1/16-12/31/17 | Co-PI | Towards centimeter accurate localization using low cost GPS: algorithms for data fusing within V2X networks | \$200,000 |
| Accomplished Projects | | | | |
| Denso | 9/1/16-8/31/17 | Co-PI | Development of a simulation tool for AV testing and evaluation | \$83,300 |
| | | | | \$3,273,809 |

Table II Projects conducted by me as Research Fellow (RF) or Research Assistant (RA)

| Sponsor | Dates | Role | Project title | Budget |
|--------------------|-----------------|------|---|--------------------|
| Ford | 5/1/16-8/31/18 | RF | Accelerated evaluation of automated vehicles | \$200,000 |
| Toyota | 5/1/16-12/31/16 | RF | Crash avoidance systems safety evaluation of an important class of electronic control systems | \$3,000,000 |
| MTRAC ³ | 9/1/14-8/31/15 | RA | Computationally efficient and robust design codes for power-split hybrid powertrains | \$20,000 |
| NIOSH ⁴ | 5/1/16-12/31/17 | RA | Evaluation of commercial vehicle active safety systems and their effect on truck driver behaviors | \$60,000 |
| Ford | 6/1/17-12/31/17 | RA | A portable brake control and diagnosis system for stopping distance reduction and braking efficiency assessment | \$200,000 |
| | | | | \$3,480,000 |

¹ DOE: The United States Department of Energy

² SAIC: Shanghai Automotive Industry Corporation

³ MTRAC: Michigan Translational Research and Commercialization

⁴ NIOSH: National Institute for Occupational Safety and Health

Publication

Journal Papers (In Review)

* Corresponding authors.

- [J19] D. Yang*, J. Kun*, **D. Zhao***, C. Yu, C. Zhong, S. Xie, Z. Xiao, X. Jiao, S. Wang, K. Zhang, "Intelligent and Connected Vehicles: Current Status and Future Perspectives", *Science China, Technological Sciences*, (**invited paper**), 2017.
- [J18] W. Wang, **D. Zhao***, "Extracting Traffic Primitives Directly from Naturalistically Logged Data for Self-Driving Applications," *IEEE Robotics and Automation Letters*, 2017.
- [J17] W. Wang, J. Xi, **D. Zhao***, "Driving Style Analysis Using Primitive Driving Patterns With Bayesian Nonparametric Approaches," *IEEE Transactions on Intelligent Transportation Systems*, 2017.
- [J16] W. Wang, J. Xi*, J. K. Hedrick, **D. Zhao***, "Learning-Based Personalized Driver Model Using Bounded Generalized Gaussian Mixture Method," *IEEE Transactions on Cybernetics*, 2017.
- [J15] M. Shen, J. Sun, H. Peng, **D. Zhao***, "Improving Localization Accuracy in Connected Vehicle Networks Using Rao-Blackwellized Particle Filters: Theory, Simulations, and Experiments," *IEEE Transactions on Intelligent Transportation Systems*, 2017.
- [J14] W. Wang, J. Xi*, W. Han, **D. Zhao***, "A Learning-Based Approach for Lane Departure Warning Systems with a Personalized Driver Model," *IEEE Transactions on Vehicular Technology*, 2017.
- [J13] W. Wang, J. Xi*, J. K. Hedrick, **D. Zhao***, "Learning and Inferring a Driver's Brake Action in Car-Following Scenarios," *IEEE Transactions on Vehicular Technology*, 2017.
- [J12] **D. Zhao***, M. Shen, Y. Guo, B. Chen, W. Wang, "On Modeling Pedestrian Crossing and Its Application in Automated Vehicle Testing", *IEEE Transactions on Intelligent Vehicle*, 2017.

Journal Papers (Accepted)

- [J11] W. Wang, **D. Zhao***, "Evaluation of Lane Departure Correction Systems Using a Stochastic Driver Model," *IEEE Transactions on Intelligent Vehicle*, 2017.
- [J10] M. Shen, J. Sun, **D. Zhao***, "The Impact of Road Configuration in V2V-based Cooperative Localization: Mathematical Analysis and Real-world Evaluation," *IEEE Transactions on Intelligent Transportation Systems*, 2017.
- [J9] Z. Huang, H. Lam, D. J. LeBlanc, **D. Zhao***, "Accelerated Evaluation of Automated Vehicles using Piecewise Mixture Models," *IEEE Transactions on Intelligent Transportation Systems*, 2017.
- [J8] W. Wang, C. Liu, **D. Zhao***, "How Much Data is Enough? - A Statistical Approach with Case Study on Longitudinal Driving Behavior," *IEEE Transactions on Intelligent Vehicle*, 2017.
- [J7] X. Huang*, **D. Zhao***, H. Peng, "Empirical Study of DSRC Performance Based on Safety Pilot Model Deployment Data," *IEEE Transactions on Intelligent Transportation Systems*, 2017.
- [J6] **D. Zhao***, X. Huang, H. Peng, H. Lam, D. J. LeBlanc, "Accelerated Evaluation of Automated Vehicles in Car-Following Maneuvers," *IEEE Transactions on Intelligent Transportation Systems*, 2017.
- [J5] **D. Zhao***, H. Lam, H. Peng, D. J. LeBlanc, S. Bao, K. Nobukawa, C. S. Pan, "Accelerated Evaluation of Automated Vehicles Safety in Lane-Change Scenarios Based on Importance Sampling

Techniques," *IEEE Transactions on Intelligent Transportation Systems*, vol. 18, no. 3, pp. 595-607, March 2017.

- [J4] W. Zhuang*, X. Zhang, **D. Zhao**, H. Peng, L. Wang, "Optimal Design of Three-planetary-gear Power-split Hybrid Powertrains," *International Journal of Automotive Technology*, vol. 17, no. 2, pp. 299-309, Apr. 2016.
- [J3] K. Nobukawa*, S. Bao, D. J. LeBlanc, **D. Zhao**, H. Peng, C. S. Pan, "Gap Acceptance During Lane Changes by Large-Truck Drivers - An Image-Based Analysis," *IEEE Transactions on Intelligent Transportation Systems*, vol. 17, no. 3, Mar. 2016.
- [J2] **D. Zhao***, W. Cui, H. Sun, "The Design and Analysis of Integrated-wheel Drive and Electric Steering Vehicle Traveling mechanism," *Science Technology and Engineering*, vol. 10, no. 19, pp. 4687-4692, 2010.
- [J1] J. Li*, **D. Zhao**, L. Zhu, J. Liu, "Matching of Velocity Threshold for Vehicle Driving Fuel Economy Control Strategy," *Journal of Jilin University (Engineering and Technology Edition)*, vol. 40, no. 02, pp. 0320-0323, 2010.

Conferences Papers (In Review)

- [C20] Z. Huang, Y. Guo, H. Lam, **D. Zhao***, "A Versatile Approach for the Evaluation and Testing of Automated Vehicles based on Kernel Methods," *American Control Conference (ACC)*, June 27-29, Milwaukee, 2018.
- [C19] M. Shen, H. Zhao, J. Sun, **D. Zhao***, "Semi-Interpenetrating Cooperative Localization in Connected Vehicle Networks," *IEEE International Conference on Robotics and Automation (ICRA)*, Brisbane, May 21-25, 2018.
- [C18] Y. Guo, Z. Su, D. Berenson, **D. Zhao***, "Kinodynamic-based Aggressive Trajectory Planner For Narrow Passage," *IEEE International Conference on Robotics and Automation (ICRA)*, Brisbane, May 21-25, 2018.

Conferences Papers (Accepted)

- [C17] **D. Zhao***, Y. Guo, Y. J. Jia, "TrafficNet: An Open Naturalistic Driving Scenario Library," *Proceedings of the IEEE 20th International Intelligent Transportation Systems Conference (ITSC)*, Yokohama, Japan, October 16-19, 2017.
- [C16] Z. Huang, H. Lam, **D. Zhao***, "Learning the Performances of Intelligent Vehicles with Gaussian Mixture and Monotonicity Information," *Proceedings of the IEEE 20th International Intelligent Transportation Systems Conference (ITSC)*, Yokohama, Japan, October 16-19, 2017.
- [C15] Z. Huang, H. Lam, **D. Zhao***, "Towards Affordable On-track Testing for Autonomous Vehicle - A Kriging-based Statistical Approach," *Proceedings of the IEEE 20th International Intelligent Transportation Systems Conference (ITSC)*, Yokohama, Japan, October 16-19, 2017.
- [C14] M. Shen, Jin Sun, **D. Zhao***, "Optimization of Vehicle Connections in V2V-based Cooperative Localization," *Proceedings of the IEEE 20th International Intelligent Transportation Systems Conference (ITSC)*, Yokohama, Japan, October 16-19, 2017.
- [C13] Z. Huang*, H. Lam, **D. Zhao**, "Sequential Experimentation to Evaluate Automated Vehicles," *Winter Simulation Conference (WSC)*, Las Vegas, U.S.A., December 3-6, 2017.
- [C12] X. Wang, **D. Zhao***, H. Peng, D. J. LeBlanc, "Analysis and Modeling of Unprotected Intersec-

tion Left-Turn Conflicts based on Naturalistic Driving Data," *IEEE Intelligent Vehicle Symposium (IV)*, Redondo Beach, U.S.A., June 11-14, 2017.

- [C11] **D. Zhao**^{*}, W. Wang, D. J. LeBlanc, "Evaluation of Semi-autonomous Lane Departure Assistant System with Naturalistic Driving Data," *IEEE Intelligent Vehicle Symposium (IV)*, Redondo Beach, U.S.A., June 11-14, 2017.
- [C10] Y. J. Jia, **D. Zhao**^{*}, Qi A. Chen, Z. M. Mao, "Towards Secure and Safe Appified Automated Vehicles," *IEEE Intelligent Vehicle Symposium (IV)*, Redondo Beach, U.S.A., June 11-14, 2017.
- [C9] B. Chen, **D. Zhao**^{*}, H. Peng, "Evaluation of Automated Vehicles Encountering Pedestrians at Unsignalized Crossings," *IEEE Intelligent Vehicle Symposium (IV)*, Redondo Beach, U.S.A., June 11-14, 2017.
- [C8] M. Shen, **D. Zhao**^{*}, J. Sun, "Effect of Road Configurations on GNSS-based Cooperative Localization Using Map Matching," *IEEE 85th Vehicular Technology Conference (VTC)*, Sydney, Australia, June 4-7, 2017.
- [C7] Z. Huang, **D. Zhao**^{*}, H. Lam, D. J. LeBlanc, H. Peng, "Evaluation of Automated Vehicles in the Frontal Cut-in Scenario - an Enhanced Approach using Piecewise Mixture Model," *IEEE International Conference on Robotics and Automation (ICRA)*, Singapore, May 29-June 3, 2017.
- [C6] W. Wang, **D. Zhao**, J. Xi^{*}, D. J. LeBlanc, J. K. Hedrick, "Development and Evaluation of Two Learning-Based Personalized Driver Models for Car-Following Behaviors," *American Control Conference (ACC)*, Seattle, U.S.A., May 24-26, 2017.
- [C5] M. Shen, **D. Zhao**^{*}, J. Sun, "Enhancement of Low-cost GNSS Localization in Connected Vehicle Networks using Rao-Blackwellized Particle Filters," *Proceedings of the IEEE 19th International Intelligent Transportation Systems Conference (ITSC)*, Rio de Janeiro, Brazil, Nov 1-4, 2016.
- [C4] **D. Zhao**^{*}, H. Peng, H. Lam, S. Bao, K. Nobukawa, D. J. LeBlanc, C. S. Pan, "Accelerated Evaluation of Automated Vehicles in Lane Change Scenarios," in *Proceedings of the ASME 2015 Dynamic Systems and Control Conference (DSCC)*, Columbus, U.S.A., Oct 28-30, 2015.
- [C3] **D. Zhao**^{*}, H. Peng, S. Bao, K. Nobukawa, D. J. LeBlanc, C. S. Pan, "Accelerated Evaluation of Automated Vehicles using Extracted Naturalistic Driving Data," *Proceedings of the 24th Symposium of the International Association for Vehicle System Dynamics (IAVSD)*, Graz, Austria, August 17-21, 2015.
- [C2] **D. Zhao**^{*}, H. Peng, K. Nobukawa, S. Bao, D. J. LeBlanc, C. S. Pan, "Analysis of Mandatory and Discretionary Lane Change Behaviors for Heavy Trucks," in *the 14th International Symposium on Advanced Vehicle Control (AVEC)*, Tokyo, Japan, September 22-26, 2014.
- [C1] **D. Zhao**^{*}, H. Sun, and W. Cui, "Research on the Platform Design and Control System for the Wheel-side Steering-driving Coordination Vehicle," in *the 2010 IEEE International Conference on Mechatronics and Automation (ICMA)*, Xi'an, China, August 4-7, 2010.

Patents/Inventions

- [P7] "Blue Hybrid Software" (45% contribution, under review).
- [P6] CN 101973307 B, Main pin zero bias wire-controlled independent driven and steering automobile running mechanism and electric vehicle.
- [P5] CN 201842130 U, Electromobile and drive-by-wire independent driving and steering automobile

traveling mechanism with zero-offset master pin.

[P4] CN 101648573 B, Automobile traveling mechanism with wheel hub comprehensively drive and turning.

[P3] CN 201494493 U, Vehicle walking mechanism with wheel edge combination driving and steering.

[P2] CN 201198869 Y, Bidirectional bearing.

[P1] CN201187538 Y, Sliding clutch.

Invited Talks

University of California, Berkeley - Mechanical Engineering **Berkeley, USA**

"Mapping Cities into Mcity - Develop a Statistically Certified CAV Test Protocol 11/21/2017
Leveraging on Traffic Primitives, Accelerated Evaluation, and Augmented Reality"

Stanford University, - Stanford Intelligent Systems Laboratory (SISL) **Palo Alto, USA**

"Learning Methods on Rare Events and Its Application on Autonomous Evaluation" 11/20/2017

Detroit Chinese Engineers Association **Troy, USA**

"Testing and Evaluation of Automated Vehicles" 11/12/2017

The 24th World Congress on Intelligent Transport Systems **Montreal, Canada**

"Using Traffic Data to Build a Safer and Smarter Transportation" 11/2/2017

China Automotive Technology and Research Center **Tianjin, China**

"Using Traffic Data to Build a Safer and Smarter Transportation" 10/20/2017

National Intelligent Vehicles and Smart Transportation Demo Zone **Beijing, China**

"Virtual Testing, On-Road Testing, and Mixed Reality Testing" 10/20/2017

Uber **Pittsburgh, USA**

"Accelerated Evaluation Methods" 8/12/2017

GM **Webex**

"Modeling Simulation Environment for the Development and Testing of Automated Vehicles" 8/11/2017

GM **Webex**

"Towards Zero Crash - The Modern Testing of AVs" 7/29/2017

Mcity **Ann Arbor, USA**

"White Paper on Accelerated Evaluation" 7/17/2017

China Academy of Telecommunication Research **Beijing, China**

"Development of Test Scenarios for Connected and Automated Vehicles 5/17/2017

- Our Work at Mcity"

Tongji University **Shanghai, China**

"Learning the Limitations of Intelligent Agents - a New Accelerated Evaluation Approach" 4/28/2017

Shanghai Automotive Industry Corporation **Shanghai, China**

"Accelerated Evaluation, Big Naturalistic Driving Data, and How They Work Together for AV Testing" 4/29/2017

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| University of Michigan Transportation Institute <i>"OpenCAV: an Open Collaborative Platform for Connected and Autonomous Vehicle Research"</i> | Ann Arbor, USA 4/14/2017 |
| Lawrence Berkeley National Laboratory <i>"Building Trust in Connected and Automated Vehicles"</i> | Berkeley, USA 1/12/2017 |
| Tsinghua University <i>"Is an Automated Vehicle Safe? - Evaluation methods of Automated Vehicles"</i> | Beijing, China 7/6/2016 |
| Yutong Bus <i>"Test and Evaluation of Automated Vehicles"</i> | Zhengzhou, China 7/5/2016 |
| Yutong Bus <i>"Cooperative Localization in Connected Vehicle Networks"</i> | Zhengzhou, China 7/5/2016 |
| Baidu <i>"Testing Highly Intelligent Vehicles"</i> | Beijing, China 7/1/2016 |
| University of California, Berkeley - Civil Engineering <i>"Accelerated Evaluation based on Importance Sampling Theory"</i> | Berkeley, USA 5/18/2016 |

Awards

- Best poster awards, 2nd place in UMTRI Transportation Safety Research Symposium, 2015
- Fellowship Award, Mechanical Engineering, University of Michigan, Ann Arbor, 2011
- Summa Cum Laude (0.034%), highest honor among 40,000 undergraduate students in Jilin University, 2010
- Honor Student of Changchun City, Changchun city Government, China, 2010
- The Red Flag Scholarship, First Automobile Works Group Corporation, 2010
- National Scholarship, the Ministry of Education of the P.R. of China, 2010
- National Scholarship, the Ministry of Education of the P.R. of China, 2009
- Academic Research Star, Jilin University, 2009
- National Innovation Funds (highest level), "Analysis of dynamics for the next generation electric vehicle", Ministry of Education of the People's Republic of China, 2009
- National Innovation Funds (highest level), "Study on the fuel consumption of a new type of clutch", Ministry of Education of the People's Republic of China, 2007
- 8th place in the National Formula SAE competition, Society of Automotive Engineers, 2011.
- 3rd place in the National Honda Energy-Saving Sports Tournament, Honda, 2008.
- 3rd place in the National Honda Energy-Saving Sports Tournament, Honda, 2007.

Dissertation Committees (Ph.D.)

- [Proposal] Yunhan Jack Jia, "Securing Modern Appified Platform through Systematic Program Analysis and Design", Department of Electrical Engineering and Computer Sciences, University of Michigan, November 2017
- Zhiyuan Huang, "Learning-based Robust Optimization for Data Integration in Optimization under Uncertainty", Department of Industrial and Operations Engineering, University of Michigan

Professional Activities

Committees and Panels Membership:

- **Technical Program Committee** **Dynamic Systems and Control Conference, 2016**
ASME Committee on Automotive and Transportation Systems
IEEE Committee on Automotive Controls of the Control Systems Society
- **Technical Program Committee** **American Control Conference, 2017**
ASME Committee on Automotive and Transportation Systems
IEEE Committee on Automotive Controls of the Control Systems Society

Reviewer for the Following Journals and Conferences:

- IEEE Transaction on Intelligent Transportation Systems
- IEEE Transaction on Vehicular Technologies
- IEEE Transaction on Intelligent Vehicles
- IEEE Transaction on Industrial Electronics
- IEEE Transaction on Industrial Informatics
- IEEE Transaction on Human-Machine Systems
- IEEE Vehicular Technology Magazine
- IEEE Sensors Journal
- IEEE Intelligent Transportation Systems Conference
- IEEE Vehicular Technology Conference
- IEEE Intelligent Vehicle Symposium
- IET Intelligent Transport Systems
- International Journal of Vehicle Design
- Transportation Research Part C
- Applied Energy
- Traffic Injury Prevention
- Mechatronics

- Simulation Modeling Practice and Theory
- Simulation Modelling Practice and Theory
- ASME Validation and Verification Symposium
- SAE International

Teaching and Mentorship

Current Group Members:

Postdoc

- Xun Gong, @ME

Ph.D. Students, Co-supervised

- Zhiyuan Huang, @IOE, with Henry Lam
- Yunhan Jack Jia, @CS, with Morley Mao
- Xinpeng Wang, @ME, with Huei Peng
- Songan Zhang, @ME, with Huei Peng

Master Research Assistants | Independent Study

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|---------------------|-------------------------------|
| - Yaohui Guo, @Robo | - Xinzhi Fan, @Robo |
| - Kai Jia, @Robo | - Sisi Li, @Robo |
| - Zhaolun Su, @CS | - Mansur Maturidi Arief, @IOE |
| - Ping Yu, @EE | - Aditya Ramesh, @EE |
| - Xiaoshu Liu, @EE | - Ashish Sajwan, Auto@ME |
| - Huajing Zhao, @ME | - Weilun Peng, @ME |
| - Jiacheng Zhu, @ME | |

Visiting Students

- | | |
|---------------------------------------|---|
| - Zhaobin Mo, Undergrad@Auto-Tsinghua | - Wenshuo Wang, PhD@ME-BIT |
| - Zhong Cao, PHD@Auto-Tsinghua | - Junjie Chen, PhD@Electronic and Information Engineering-Beijing Jiaotong Univ |

Previous Group Members:

Macheng Shen, Master@UM → PhD@MIT

Xinpeng Wang, Undergrad@Tsinghua → PhD@UM