

Ph. D. Student
Tsinghua University
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#### **EDUCATION**

Southwest University, School of Computer and Information Science

Bachelor of Engineering

Tsinghua University, Department of Automation

Ph. D. Candidate in Engineering

Chongqing, P.R. China

Beijing, P.R. China

Sept. 2021 - Present

#### EXPERIENCE

Research Assistant

UESTC, Institute of Fundamental and Frontier Sciences

Research Assistant

Tsinghua University, Department of Automation

Research Assistant

Chengdu, Sichuan Province, P.R. China

Beijing, P.R. China

Beijing, P.R. China

Jun. 2021 – Aug. 2021

Chongqing University, School of Big Data and Software Engineering

Chongqing, P.R. China

#### Projects

National Natural Science Foundation of China under Grant 61573290, 61503237, 61733009, 61973332 (Participant) National Key Research and Development Program of China under Grant 2017YFA0700300 (Participant) Key Project from Natural Sciences Foundation of Guangdong Province under Grant 2018B030311054 (Participant) Innovative Entrepreneurial Training Plan Program of College Students in Chongqing (Hoster)

#### AWARDS

#### **Tsinghua University**

National Scholarship of P. R. China for Graduates (2022)

### **Southwest University**

Candidate for the 12-th China Youth Science and Technology Innovation Award of Chongqing District

Outstanding Graduates of Colleges and Universities in Chongqing (2021)

Outstanding Graduates of Southwest University (2021)

Model to 2019-2020 Academic Year Outstanding Student of Southwest University (2020)

Merit Student Award, Academic Technology Award, Innovation and Entrepreneurship Award (2020)

National Scholarship of P. R. China for Undergraduate Students (2020)

Special Prize Scholarship and First Prize Scholarship of Southwest University (2020, 2019)

TangLiXin Scholarship (2019)

The  $5^{th}$  China College Students Internet + Innovation and Entrepreneurship Competition: National Silver Award

The  $28^{th}$  National Mathematical Contest in Modeling: National Second Prize

MCM/ICM in 2020: Meritorious Winner

# RESEARCH FIELDS

Real-time Safety Assessment Approaches of Dynamic Systems in Non-stationary Environment

- 1) Online active learning methods and its optimization
- 2) Detection and adaptation methods of concept drift
- 3) Incremental learning and continual learning technology

Real-time Multi-mode Fault Diagnosis of Dynamic Systems under Variable Operating Conditions

- 1) Online semi-supervised learning methods and its optimization
- 2) Imbalance problem in the framework of online learning
- 3) eXplainable artificial intelligence (XAI) technology

### RESEARCH STATS

Google Citation: 220

H-index: 9 i10-index: 9

### JOURNAL PUBLICATIONS

- 1. **Z. Liu**, X. He, Dynamic submodular-based learning strategy in imbalanced drifting streams for real-time safety assessment in nonstationary environments, *IEEE Transactions on Neural Networks and Learning Systems*, In Press, JCR Q1, *IF*: 10.4, CAA-A, CCF-B.
- 2. M. Xu, G. Zeng, Y. Song, Y. Cao, **Z. Liu**, X. He, Ivrr-PPG: an illumination variation robust remote-PPG algorithm for monitoring heart rate of drivers, *IEEE Transactions on Instrumentation and Measurement*, vol. 72, no. 3515510, pp. 1-10, 2023, JCR Q1, *IF*: 5.6, CAA-B.
- 3. **Z. Liu**, X. He, Real-time safety assessment for dynamic systems with limited memory and annotations, *IEEE Transactions on Intelligent Transportation Systems*, vol. 23, no. 9, pp. 10076-10086, 2023, In Press, JCR Q1, *IF*: 8.5, CAA-A, CCF-B.
- 4. **Z. Liu**, Y. Zhang, Z. Ding, X. He, An online active broad learning approach for real-time safety assessment of dynamic systems in nonstationary environments, *IEEE Transactions on Neural Networks and Learning Systems*, 2022, In Press, JCR Q1, *IF*: 10.4, CAA-A, CCF-B.
- 5. **Z. Liu**, J. Zhang, X. He, Q. Zhang, G. Sun, D.-H. Zhou, Fault diagnosis of rotating machinery with limited expert interaction: a multi-criteria active learning approach based on broad learning system, *IEEE Transactions on Control Systems Technology*, vol. 31, no. 2, pp. 953-960, 2023, JCR Q1, *IF*: 4.8, CAA-A.
- 6. **Z. Liu**, Y. Deng, R. R. Yager, Measure-based group decision making with principle-guided social interaction influence for incomplete information: a game theoretic perspective, *IEEE Transactions on Fuzzy Systems*, vol. 30, no. 4, pp. 1149-1163, 2022, JCR Q1, *IF*: 11.9, CAA-A, CCF-B.
- 7. **Z. Liu**, Y. Deng, Y. Zhang, Z. Ding, X. He, Evidential group interaction-based safety assessment for deepsea manned submersibles, *IEEE Transactions on Instrumentation and Measurement*, vol. 70, no. 3523014, pp. 1-14, 2021, JCR Q1, *IF*: 5.6, CAA-B.
- 8. **Z. Liu**, F. Xiao, C.-T. Lin, B. Kang, Z. Cao, A generalized golden rule representative value for multiple-criteria decision analysis, *IEEE Transactions on Systems, Man, and Cybernetics: Systems*, vol. 70, no. 5, pp. 3193-3204, 2021, JCR Q1, *IF*: 8.7, CAA-A, CCF-B.
- 9. **Z. Liu**, X. He, Y. Deng, Network-based evidential three-way theoretic model for large-scale group decision analysis, *Information Sciences*, vol. 547, pp. 689-709, 2021, JCR Q1, *IF*: 8.1, CAA-A<sup>+</sup>, CCF-B.
- 10. R. Tao, **Z. Liu**, R. Cai, K. Cheong, A dynamic group MCDM model with intuitionistic fuzzy set: perspective of alternative queuing method, *Information Sciences*, vol. 555, pp. 85-103, 2021, JCR Q1, *IF*: 8.1, CAA-A<sup>+</sup>, CCF-B.

- 11. **Z. Liu**, F. Xiao, An intuitionistic linguistic MCDM model based on probabilistic exceedance method and evidence theory, *Applied Intelligence*, vol. 50, pp. 1979-1995, 2020, JCR Q1, *IF*: 5.3, CCF-C.
- 12. **Z. Liu**, F. Xiao, An interval-valued exceedance method in MCDM with uncertain satisfactions, *International Journal of Intelligent Systems*, vol. 34, no. 10, pp. 2676-2691, 2019, JCR Q1, *IF*: 7.0, CAA-A, CCF-C.
- 13. **Z. Liu**, F. Xiao, An intuitionistic evidential method for weight determination in FMEA based on belief entropy, *Entropy*, vol. 21, no. 211, pp. 1-16, 2019. JCR Q1, *IF*: 2.7.
- 14. **Z. Liu**, F. Xiao. An evidential aggregation method of intuitionistic fuzzy sets based on belief entropy, *IEEE Access*, vol. 34, no. 10, pp. 68905-68916, 2019, JCR Q1, *IF*: 3.9.

# **COMFERENCE PUBLICATIONS**

- 1. M. Mao, **Z. Liu**, X. He. A bearing fault diagnosis method based on active learning by feature interpolation, *The 33rd Chinese Process Control Conference*, 2022, in Jul., Urumqi, Xinjiang, China, CAA-A.
- 2. S. Hu, **Z. Liu**, X. He. Confusion model for real-drift detection in chunk data streams, *Proceedings of 13th EAI International Conference on Sensor Systems and Software*, 2022, in Dec., Dalian, Liaoning, China.
- 3. **Z. Liu**, S. Hu, X. He. Real-time safety assessment of dynamic systems in non-stationary environments: A review of methods and techniques, *CAA Symposium on Fault Detection, Supervision, and Safety for Technical Processes (SAFEPROCESS)*, 2023, in Sept., Yibin, Sichuan, China, CAA-A.
- 4. C. Li, **Z. Liu**, X. He. An evidential real-time multi-mode fault diagnosis approach based on broad learning system, *The 34th Chinese Process Control Conference*, 2023, in Jul., Guiyang, Guizhou, China, CAA-A.

# **PATENTS**

- 1. X. He, **Z. Liu**, A real-time safety assessment method based on dynamic submodular learning framework.
- 2. X. He, **Z. Liu**, A real-time safety assessment method guided by the interpretability of dynamic models.
- 3. X. He, P. Han, **Z. Liu**, An online semi-supervised fault diagnosis method based on few pseudo-label-first strategy.
- 4. X. He, C. Li, **Z. Liu**, A real-time fault diagnosis method based on latent variables and broad learning system.
- 5. X. He, S. Hu, Z. Liu, A real-time safety assessment method based on distributional confusion.
- 6. S. Chen, **Z. Liu**, *et al.*, A dynamic adaptive health status prediction method based on incremental broad learning system.
- 7. D. Cai, **Z. Liu**, *et al.*, A human-in-the-loop-based dynamic threshold adjustment approach for virtual health indicators.
- 8. D. Zou, **Z. Liu**, *et al.*, A multi-step prediction method for remaining useful life based on weighted broad learning system.

# REVIEW ACTIVITIES

IEEE Transactions on on Pattern Analysis and Machine Intelligence (IEEE TPAMI)	2022 - Present
IEEE Transactions on Neural Networks and Learning Systems (IEEE TNNLS)	2022 - Present
IEEE Transactions on Cybernetics (IEEE TCYB)	2022 - Present
Journal of Computational and Cognitive Engineering (JCCE)	2022 - Present
Systems Science and Control Engineering (SSCE)	2022 - Present
Journal of Engineering (JoE)	2021 – Present
IEEE Congress on Evolutionary Computation (IEEE CEC)	2022, 2023

IEEE Conference on Fuzzy Systems (FUZZ-IEEE)	2022, 2023
International Joint Conference on Neural Network (IJCNN)	2022
Chinese Control Conference (CCC)	2022, 2023
China Automation Congress (CAC)	2022
SOCIAL MEMBERSHIPS	
Chinese Association of Automation	Member
Chinese Association for Artificial Intelligence	Member
STUDENT MENTORING	
Chen Li	M.E. Candidate
Tsinghua University, Department of Automation	May. 2022 - Present
Songqiao Hu	Research Assistant
Beijing Institute of Technology, School of Automation	Jul. 2022 - Present
Pengyu Han	Research Assistant
Beijing Institute of Technology, School of Automation	Sept. 2022 - Present
Jinghao Yang	Research Assistant
Tsinghua University, Department of Automation	Oct. 2022 - May. 2023
Mengfei Mao	Research Assistant
Chongqing University, College of Automation	Apr. 2022 – Jun. 2022
Guokai Yan	Research Assistant

May. 2022 - Jul. 2022

Tsinghua University, Department of Automation