# **WEILI**

Northeastern University Mechanical and Industrial Engineering 360 Huntington Avenue Boston, MA 02115 

#### **EDUCATION**

Ph.D., Tsinghua University, School of Vehicle and Mobility, China

Sep 2014 - Jul 2019

- Thesis: Study on lithium-ion battery deformation and failure based on detailed modeling
- One-year visiting study at MIT during 2017-2018

B.E., Hunan University, College of Mechanical and Vehicle Engineering, China

Sep 2010 - Jul 2014

- Thesis: Development of a full vehicle crash test database and feature analysis of crash pulse (Best Bachelor's Thesis Award)
- National Fellowship (Ranked #1 in College of Mech. and Veh. Engineering)

### RESEARCH INTERESTS

My research focuses on developing *scientific machine learning* techniques to model and simulate *electro-chemo-mechanical systems*. Specifically, I am interested in two areas:

- **Intelligent physics-data integration**: I aim to overcome the *curse of dimensionality* by developing physics-informed neural networks that can integrate physical constraints and laws into the learning process. My goal is to create new tools that can model and simulate complex electro-chemo-mechanical systems with high accuracy and efficiency.
- **Highly-coupled multiphysics system modeling**: I specialize in using *deep operator learning* to improve the accuracy and speed of multiphysics simulations. By developing novel deep learning techniques, I aim to enable *fast identification* of coupled systems, which can be applied to a wide range of applications, from energy systems to biomedicine.

Overall, my research interests lie at the intersection of machine learning, physics, and engineering, and I strive to advance the field of scientific machine learning and provide new tools for modeling and simulating complex electrochemo-mechanical systems.

#### RESEARCH EXPERIENCE

Associate Research Scientist— Mech. & Ind. Eng., Northeastern University, US

Jan 2023 — Present

Supervisor: Juner Zhu

- Develop physics-informed neural networks for complex multi-physics battery systems
- Investigate pressure effect and lithium penetration mechanisms of Lithium-metal solid-state batteries

Postdoctoral Associate— Chemical Engineering, MIT, US

Oct 2022 — Jan 2023

Supervisor: Martin Z. Bazant

- Phase-field deep operator neural network for electrochemical systems
  - Phase-Field Deep Operator Neural Network (DeepONet): Developed a physics-informed DeepONet
    with a free energy-based loss function that solves phase-field equations (Allen-Cahn and Cahn-Hilliard
    equations)

**Postdoctoral Associate**— Mechanical Engineering, MIT, US

Jan 2020 — Oct 2022

Supervisor: Tomasz Wierzbicki

Physics-informed machine learning applications in battery modeling

- Physics-informed machine learning (PINN): Developed and compared the PDE-based and energy-based PINN frameworks for solving the plate theory
- Inverse learning: Integrated both experimental data and partially known physics into a PINN framework to
  inversely learn the fluid flow parameters for the fluid-solid interaction problem
- New CAE tools for batteries, (MIT Industrial Battery Consortium)
  - Computational mechanics: Developed high-efficiency battery models and implemented large deformation plasticity and fracture theories into FE codes
  - Next-generation batteries: Developed models for Li-metal batteries and all-solid-state batteries

**Research Assistant** — School of Vehicle and Mobility, Tsinghua University, China

Sep 2014 - Jul 2019

Supervisor: Qing Zhou and Yong Xia

## • Data-driven safety envelope of lithium-ion batteries for electric vehicles

Aug 2018 — Mar 2019

- Dig data: generated a big database for the impact safety of batteries based on high-fidelity FE models
- Data-driven safety envelop: Generated safety envelops utilizing machine learning algorithms

### • Detailed modeling of lithium-ion batteries

Oct 2017 — Aug 2018

- Large-deformation plasticity: Characterized the mechanical properties of electrode coatings and developed both continuum and discrete particle models
- Structural mechanics: Developed a detailed multi-layer FE model that accurately predicts the large deformation and fracture behaviors of batteries

### • Mechanical-electrical-thermal responses of lithium-ion batteries

*Mar* 2017 — Oct 2017

- Multi-physics analysis: Experimentally compared the electrical, thermal, and mechanical responses under mechanical loadings for the pouch, prismatic, and cylindrical cells
- Failure mechanism analysis: Observed and summarized the fracture patterns and the correlations between fracture modes and the thermal-electrical behaviors after short circuit

#### State-of-charge dependence of mechanical response of lithium-ion batteries

Aug 2016 — Mar 2017

- Experimental design: Designed different experimental setups to measure the contained reaction force and free expansion of batteries
- Mechanism analysis: Analyzed and experimentally confirmed that the SOC-effect is due to the internal stress

### • Fracture mode transition of lap-shear spot-welded joints under dynamic loading

Jan 2015 — Jul 2016

- Mechanics of materials: Characterized the large deformation plasticity and fracture behavior and the ratedependence for the base metals and SW joint
- Experimental techniques: In-house designed light-weight force sensor in dynamic tests; miniature specimens to test mechanical properties of SW joint
- Finite element modeling: Developed detailed FE model for the spot-welded joints to reproduce the fracture transition under dynamic loading

### TEACHING EXPERIENCE

### Kaufman Teaching Certificate Program, MIT

Sep 2021 - Dec 2021

• Practice-based workshop series for designing and teaching a course

• Developed a course for Finite Element Method and delivered two microteaching sessions

**Teaching assistant** of Fundamentals of Vehicle Crash Safety course, Tsinghua University 2015 Fall & 2016 Fall

- Lectures given in English
- Support in-class activities, exams, and grading

#### **PUBLICATIONS**

### **First-author Journal Publications** ( = Authors with equal contribution)

- [1] <u>W. Li</u>, M. Z. Bazant, and J. Zhu. Phase-Field DeepONet: Physics-informed deep operator neural network for fast simulations of pattern formation governed by gradient flows of free-energy functionals. **Comp. Meth. in App. Mech. and Eng**, 416: 116299, 2023.
- [2] W. Li, B Xing, et al. Damage of prismatic lithium-ion cells subject to bending: Test, model, and detection. EcoMat, 4(6):e12257, 2022.
- [3] **R. Li** w. Li , et al. Effect of external pressure and internal stress on battery performance and lifespan, **Energy Storage Materials**, (52) 395-429, 2022.
- [4] W. Li, J. Zhu, & M. Z. Bazant. A Physics-Guided Neural Network Framework for Elastic Plates: Comparison of Governing Equations-Based and Energy-Based Approaches. Comp. Meth. in App. Mech. and Eng, 383: 113933, 2021.
- [5] W. Li, & J. Zhu. A large deformation and fracture model of lithium-ion battery cells treated as a homogenized medium. Journal of The Electrochemical Society, 167(12), 120504, 2020.
- [6] W. Li<sup>=</sup>, J. Zhu<sup>=</sup>, Y. Xia, et al. Data-driven safety envelope of lithium-ion batteries for electric vehicles, **Joule**, 2019.
- [7] J. Zhu<sup>=</sup>, W. Li <sup>=</sup>, et al. Deformation and failure of lithium-ion batteries treated as a discrete layered structure. International Journal of Plasticity, 2019.
- [8] W. Li, Y. Xia, et al. Comparative study of mechanical-electrical-thermal responses of pouch, cylindrical, and prismatic lithium-ion cells under mechanical abuse. Science China Technological Sciences, 2018, 61 (10), 1472-1482.
- [9] <u>W. Li</u>, Y. Xia, et al. State-of-charge dependence of mechanical response of lithium-ion batteries: A result of internal stress. **Journal of The Electrochemical Society**, 2018, 165 (7), A1537-A1546.
- [10] J. Zhu<sup>=</sup>, W. Li<sup>=</sup>, Y. Xia, and E. Sahraei, Testing and modeling the mechanical properties of the granular materials of graphite anode, **Journal of The Electrochemical Society**, 165 (5), A1160, 2018.
- [11] <u>W. Li</u>, J. Zhu, et al. Testing and modeling the effect of strain-rate on plastic anisotropy for a traditional High Strength Steel. ASME 2015 International Mechanical Engineering Congress and Exposition, 2015

### **Co-authored Journal Publications**

- [1] D. Cao, K. Zhang, <u>W. Li</u>, et al. Nondestructively Visualizing and Understanding the Mechano-Electro-chemical Origins of "Soft Short" and "Creeping" in All-Solid-State Batteries. **Advanced Functional Materials**. 2307998, 2023.
- [2] L. Zhao, W. Li, C. Wu, et al. Taming Metal–Solid Electrolyte Interface Instability via Metal Strain Hardening. Advanced Energy Materials. 13(34), 2300679, 2023.
- [3] Y. Wang, J. Sun, <u>W. Li</u>, Z. Lu, Y. Liu. CENN: Conservative energy method based on neural networks with subdomains for solving variational problems involving heterogeneous and complex geometries. Comp. Meth. in App. Mech. and Eng. 400:115491, 2022.
- [4] J. Zhu, I. Mathews, D. Ren, <u>W. Li</u>, D. Cogswell, B. Xing, T. Sedlatschek, N. Kantareddy, M. Yi, T. Gao, Y. Xia, Q. Zhou, T. Wierzbicki, M. Z. Bazant, End-of-life or second-life options for retired electric vehicle batteries, Cell Reports Physical Science, 2 (8), 100537, 2021.
- [5] H. Xu, J. Zhu, W. Li, M. Z. Bazant. et al., Guiding the Design of Heterogeneous Electrode Microstructures for Li-Ion Batteries: Microscopic Imaging, Predictive Modeling, and Machine Learning, Advanced Energy Materials, 11 (19), 2003908, 2021.
- [6] T. Wierzbicki, W. Li, Y. Liu, and J. Zhu, Effect of receptors on the resonant and transient harmonic vibrations of Coronavirus, Journal of the Mechanics and Physics of Solids, 150, 104369, 2021.
- [7] T. Sedlatschek, J. Lian, <u>W. Li</u>, et al., Large-deformation plasticity and fracture behavior of pure lithium under various stress states, Acta Materialia, 208, 116730, 2021.

- [8] D. P. Finegan, J. Zhu, X. Feng, <u>W. Li</u>, et al., The application of data-driven methods and physics-based learning for improving battery safety, **Joule**, 5 (2), 316–329, 2021.
- [9] J. Zhu, M. M. Koch, J. Lian, <u>W. Li</u>, and T. Wierzbicki, Mechanical deformation of lithium-ion pouch cells under in-plane loads—Part I: experimental investigation, *Journal of The Electrochemical Society*, 167 (9), 090533, 2020.
- [10] Z. Pan, J. Zhu, H. Xu, T. Sedlatschek, X. Zhang, <u>W. Li</u>, T. Gao, Y. Xia, T. Wierzbicki, Microstructural deformation patterns of a highly orthotropic polypropylene separator of lithium-ion batteries: Mechanism, model, and theory, **Extreme Mechanics Letters**, 37, 100705, 2020.
- [11] Z. Pan, W. Li, and Y. Xia, Experiments and 3D detailed modeling for a pouch battery cell under impact loading, **Journal of Energy Storage**, 27, 101016, 2020.
- [12] J. Lian, M. Koch, <u>W. Li</u>, T. Wierzbicki, and J. Zhu, Mechanical deformation of Lithium-ion pouch cells under in-plane loads—Part II: Computational modeling, **Journal of The Electrochemical Society**, 167(9), 090556, 2020.
- [13] J. Zhu, H. Luo, <u>W. Li</u>, T. Gao, Y. Xia, and T. Wierzbicki, Mechanism of strengthening of battery resistance under dynamic loading, **International Journal of Impact Engineering**, 131, 78–84, 2019.
- [14] J. Lian, T. Wierzbicki, J. Zhu, and <u>W. Li</u>, Prediction of shear crack formation of lithium-ion batteries under rod indentation: Comparison of seven failure criteria, **Engineering Fracture Mechanics**, 217, 106520, 2019.
- [15] J. Zhu, T. Wierzbicki, and <u>W. Li</u>, A review of safety-focused mechanical modeling of commercial lithium-ion batteries, **Journal of Power Sources**, 378, 153–168, 2018.
- [16] Z. Qin, J. Zhu, W. Li, Y. Xia, and Q. Zhou, System ringing in impact test triggered by upper-and-lower yield points of materials, International Journal of Impact Engineering, 108, 295–302, 2017.
- [17] G. Chen, <u>W. Li</u>, H. Luo, and Y. Xia, Influence of mechanical interaction between lithium-ion pouch cells in a simplified battery module under impact loading, **ASME** 58493, V014T11A029, 2017.
- [18] Z. Qin, W. Li, J. Zhu, and Y. Xia, Experimental and numerical analysis of the system ringing in intermediate strain rate tests, ASME, 50633, V009T12A031, 2016.

#### ORAL PRESENTATIONS

#### **Invited Talks**

- Scientific Machine Learning Modeling of Batteries. **Microsoft Research Asia, AI4Science, Frontier Sharing**, 2022.
- Physics-informed neural network framework for multi-physics modeling of battery. **Engineering and Applied Science Forum (EASF)**, 2021.
- Physics-guided machine learning modeling of battery. Automotive & Battery Safety Conference (ABSC), 2021
- Mechanical Failure of Lithium-Ion Batteries, 9th Annual Battery Safety Conference, 2019.

### **Conference Presentation**

- Phase-Field DeepONet: Physics-informed deep operator neural network for fast simulations of pattern formation governed by gradient flows of free-energy functionals, **3rd ICMAMS**, 2023
- Deep operator machine learning framework for modeling all-solid-state batteries, 3rd ICMAMS, 2023
- Energy-Based Deep Operator Learning for Solving Battery Physics Equations, AIAA SciTech, NASA 2040 Vision IV, 2023
- Variational Principle Neural Network for dynamics of conservative physical systems solving the phase-field model of dynamic fracture, USNC/TAM 2022.
- Damage of prismatic lithium-ion cells subject to bending: test, model, and detection, USNC/TAM 2022.
- Identify fluid flow parameters in porous media using physics-informed machine learning. Mechanistic Machine Learning and Digital Twins Conference (MMLDT), 2021
- Mechanical Testing and Modeling of the Graphite Anode of Lithium-ion Batteries, ASME International Mechanical Eng. Congress & Exposition, 2019
- State-of-Charge Dependence of Mechanical Response of Lithium-ion Batteries, ASME International Mechanical Eng. Congress & Exposition, 2019

### REFEREES

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