LINYING ZHANG

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EDUCATION

Columbia University 2018 - 2023

PhD in Biomedical Informatics

Advisors: George Hripcsak and David Blei

Thesis: Causal machine learning for reliable real-world evidence generation in healthcare.

Harvard University 2016 - 2018

MS in Computational Biology and Quantitative Genetics

Advisor: Giovanni Parmigiani

Thesis: Interactions between multiple myeloma cells and bone marrow stromal cells impact epigenetic profiles of multiple myeloma.

Boston University 2011 - 2014

BA with Honors (Summa Cum Laude) in Biochemistry and Molecular Biology

Advisor: Ulla Hansen

Thesis: Establishing hepatocellular carcinoma cell lines with inducible expression of degradable LSF to investigate LSF regulation in cell cycle.

APPOINTMENT

Washington University in St. Louis

October 2023 - Present

Assistant Professor of Biostatistics

Institute for Informatics, Data Science, and Biostatistics (I2DB)

HORNORS & AWARDS

• Edward H. Shortliffe Doctoral Dissertation Award Nominee	2024
\bullet Symposium on Artificial Intelligence in Learning Health Systems (SAIL) Travel Award	2024
• OHDSI Best Community Contribution Award in Methodological Research	2022
• Women in Machine Learning Travel Award	2019
• Senior Book Award. Boston University.	2014
• Dean's List. Boston University.	2011-2014

PUBLICATIONS

- 1. Hripcsak G, **Zhang L**, Li K, Suchard MA, Ryan PB, Schuemie MJ. Assessing Covariate Balance with Small Sample Sizes. *medRxiv* 2024.04.23.24306230, 2024. [Under review]
- 2. Pang C, Jiang X, Pavinkurve NP, Kalluri KS, Minto EL, Patterson J, **Zhang L**, Hripcsak G, Elhadad N, Natarajan K. CEHR-GPT: Generating Electronic Health Records with Chronological Patient Timelines. *arXiv:2402.04400*, 2024. [Under review]
- 3. Jeong H, Jabbour S, Yang Y, Thapta R, Mozannar H, Han WJ, Mehandru N, Wornow M, Lialin V, Liu X, Lozano A, Zhu J, Kocielnik RD, Harrigian K, Zhang H, Lee E, Vukadinovic M, Balagopalan A, Jeanselme V, Matton K, Demirel I, Fries J, Rashidi P, Beaulieu-Jones B, Xu XO, McDermott M,

- Naumann T, Agrawal M, Zitnik M, Ustun B, Choi E, Yeom K, Gursoy G, Ghassemi M, Pierson E, Chen G, Kanjilal S, Oberst M, **Zhang L**, Singh H, Hartvigsen T, Zhou H, Okolo CT. Recent Advances, Applications, and Open Challenges in Machine Learning for Health: Reflections from Research Roundtables at ML4H 2023 Symposium. *arXiv:2403.01628*, 2024.
- 4. Cai CX, Nishimura A, Bowring MG, Westlund E, Tran D, Ng JH, Nagy P, Cook M, McLeggon JA, DuVall SL, Matheny ME, Golozar A, Ostropolets A, Minty E, Desai P, Bu F, Toy B, Hribar M, Falconer T, **Zhang L**, Lawrence-Archer L, Boland MV, Goetz K, Hall N, Shoaibi A, Reps J, Sena AG, Blacketer C, Swerdel J, Jhaveri KD, Lee E, Gilbert Z, Zeger SL, Crews DC, Suchard MA, Hripcsak G, Ryan PB. Similar risk of kidney failure among patients with blinding diseases who receive ranibizumab, aflibercept, and bevacizumab: an OHDSI Network Study. *Ophthalmology Retina*, 2024.
- 5. **Zhang L**, Richter LR, Kim T, Hripcsak G. Evaluating and improving performance and racial fairness of algorithms for GFR estimation. *IEEE International Conference on Artificial Intelligence* × *Medicine*, *Health*, *and Care (AIMHC)*, 2024.
- Zhang L, Richter LR, Wang Y, Ostropolets A, Elhadad N, Blei DM, Hripcsak G. Causal fairness assessment of treatment allocation with electronic health records. *Journal of Biomedical Infor*matics, 2024.
- 7. Song W, Liu L, Rice H, Sainlaire M, Min L, **Zhang L**, Thai T, Kang MJ, Li S, Tejeda C, Lipsitz S, Samal L, Carroll D, Adkison L, Herlihy L, Ryan V, Bates D, Latham N, Dykes P. From traditional fall injury risk screening to a temporal machine learning-based approach: improving algorithm generalizability and clinical action. *Journal of the American Geriatrics Society*, 2024.
- 8. Ostropolets A, Albogami Y, Conover M, Banda JM, Baumgartner WA Jr, Blacketer C, Desai P, DuVall SL, Fortin S, Gilbert JP, Golozar A, Ide J, Kanter AS, Kern DM, Kim C, Lai L.Y.H, Li C, Liu F, Lynch K.E, Minty E, Ins Neves M, Ng DQ, Obene T, Pera V, Pratt N, Rao G, Rappoport N, Reinecke I, Saroufim P, Shoaibi A, Simon K, Suchard MA, Swerdel JN, Voss EA, Weaver J, **Zhang L**, Hripcsak G, and Ryan PB. Reproducible Variability: Assessing investigator discordance across nine research teams attempting to reproduce the same observational study. **JAMIA**, 2023.
- 9. **Zhang L**, Wang Y, Schuemie MJ, Blei DM, and Hripcsak G. Adjusting for indirectly measured confounding using large-scale propensity score. *Journal of Biomedical Informatics*, 2022.
- Richter LR, Albert BI, Zhang L, Ostropolets A, Zitsman JL, Fennoy I, Albers D, Hripcsak G. Data assimilation on mechanistic models of glucose metabolism predicts glycemic states in adolescents following bariatric surgery. *Frontiers in Physiology*, 2022.
- 11. Song W, **Zhang L**, Liu L, Sainlaire M, Karvar M, Kang M, Pullman A, Lipsitz S, Massaro A, Patil N, Jasuja R, Dykes PC. Predicting hospitalization of COVID-19 positive patients using clinician-guided machine learning methods. *JAMIA*, 2022.
- 12. Song W, Kang MJ, **Zhang L**, Jung W, Song J, Bates DW, Dykes PC. Predicting pressure injury using nursing assessment phenotypes and machine learning methods. *JAMIA*, 2021.
- 13. Ostropolets A, **Zhang L**, and Hripcsak G. A scoping review of clinical decision support tools that generate new knowledge to support decision making in real time. **JAMIA**, 2020.
- 14. Ostropolets A, Chen R, **Zhang L**, and Hripcsak G. Characterizing physicians information needs related to a gap in knowledge unmet by current evidence. *JAMIA Open*, 2020.
- 15. **Zhang L**, Wang Y, Ostropolets A, Mulgrave JJ, Blei DM, and Hripcsak G. The medical deconfounder: Assessing treatment effects with electronic health records. *Machine Learning for Healthcare Conference (MLHC)*, 2019.

16. Gottesman O, Johansson F, Meier J, Dent J, Lee D, Srinivasan S, **Zhang L**, Ding Y, Wihl D, Peng X, Yao J, Lage I, Mosch C, Lehman L.H, Komorowski M, Faisal A, Celi L, Sontag D, and Doshi-Velez F. Evaluating reinforcement learning algorithms in observational health settings. *arXiv preprint*, 2018.

CONFERENCE ABSTRACTS (PEER-REVIEWED)

- 1. Fan R, Banks D, Song W, Wilcox A, **Zhang L**. Real-world Comparative Effectiveness of Pharmacological Treatments for Opioid Use Disorder. In *OHDSI Global Symposium*, 2024. [Submitted]
- Lee H, Gupta S, Blacketer C, Cook M, Naka S, Fan R, Martin B, Aziz K, Zhang L, Nagy P. Comparative Analysis of OMOP CDM Profiles Across Institutions and Future Research Implications. In OHDSI Global Symposium, 2024. [Submitted]
- Zhang L, Jiang X, Natarajan K, Hripcsak G. Causal Fairness for Decomposing Racial and Sex Disparities in Treatment Allocation Using Real-World Data. In AMIA Annual Symposium, 2024. [Presentation]
- 4. Fan R, Banks D, Song W, Wilcox A, **Zhang L**. Real-world Comparative Effectiveness of Pharmacological Treatments for Opioid Use Disorder. In *AMIA Annual Symposium*, 2024. [Poster]
- Chen HY, Zhang L, Hripcsak G. Learning Latent Confounding Representation in High-dimensional Observational Studies with EHRs via Variational Autoencoder. In AMIA Annual Symposium, 2024. [Poster]
- 6. Song W, Kang MJ, Liu L, Sainlaire M, Lowenthal G, Baris VK, Cho S, Carroll D, Furlong D, Gilles-Fowler W, Goncalves L, Lipsitz S, Melanson B, Morrow L, Massaro J, Martel T, Wolski P, Zhang L, Dykes PC. Multi-state Modeling of Pressure Injury Staging Transition Trajectories. In AMIA Annual Symposium, 2024. [Presentation]
- Zhang L, Jiang X, Natarajan K, Hripcsak G. Building Causally Explainable Fair Learning Health System. In Symposium on Artificial Intelligence in Learning Health Systems (SAIL), 2024.
 [Poster]
- 8. **Zhang L**, Jiang X, Natarajan K, Hripcsak G. Explaining Treatment Disparities from a Causal Perspective with EHRs. In *AMIA Annual Symposium*, 2023. [Presentation]
- 9. Schuemie M, Suchard MA, Nishimura A, **Zhang L**, Hripcsak G. Evaluating Confounding Adjustment When Sample Size is Small. In *OHDSI Global Symposium*, 2023. [Poster]
- Sena AG, Reps J, Kim C, Brewster J, Black A, Zhang L, Cook M, Phuc PH, Suchard MA. Save Our Sisyphus Challenge: Lessons learned from Strategus execution on the OHDSI Network. In OHDSI Global Symposium, 2023. [Presentation]
- 11. Song W, Liu L, Sainlaire M, Cho S, Furlong D, Gilles-Fowler W, Herlihy L, Kang M.J, Lipsitz S, Melanson B, Massaro J, Martel T, Wolski P, **Zhang L**, Dykes P. An EHR-based Comparative Analysis of the Distribution of Pressure Injury Anatomical Locations and Stages and Associated Disparities Across a Large Healthcare System. In *AMIA Annual Symposium*, 2023. [Presentation]
- 12. **Zhang L**, Richter LR, Wang Y, Ostropolets A, Elhadad N, Blei DM, and Hripcsak G. A Bayesian causal inference approach for assessing fairness in clinical decision-making. In *Algorithmic Fairness through the Lens of Causality and Privacy Workshop, NeurIPS*, 2022. [Poster]
- 13. **Zhang L**, Richter LR, Blei DM, Wang Y, Ostropolets A, Elhadad N, and Hripcsak G. Assessing racial fairness of dialysis allocation in end-stage renal disease. In *OHDSI Global Symposium*, 2022. [Presentation]

- 14. **Zhang L**, Richter LR, Hripcsak G. Assessing the impact of race on glomerular filtration rate (GFR) prediction. In *OHDSI Global Symposium*. 2021. [Presentation]
- 15. Song W, **Zhang L**, Sainlaire M, Karvar M, Kang M, Pullman A, Massaro A, Patil N, Jasuja R, Dykes PC. Predicting hospitalization of COVID-19 positive patients using machine learning methods. In *AMIA Annual Symposium*. 2021. [Presentation]
- 16. **Zhang L**, Wang Y, Ostropolets A, Chen R, Blei DM, and Hripcsak G. The Multi-Outcome Medical Deconfounder: Assessing Treatment Effects on Multiple Renal Measures. In *AMIA Annual Symposium*. 2020. [Poster]
- 17. **Zhang L**, Wang Y, Ostropolets A, Chen R, Blei DM, and Hripcsak G. The multi-outcome medical deconfounder: assessing treatment effects on multiple renal measures. In *OHDSI Global Symposium*. 2020. [Poster]
- 18. Chen R, Schuemie M, Suchard M, Ostropolets A, **Zhang L**, Ryan P, Hripcsak G. Evaluation of large-scale propensity score modeling and covariate balance on potential unmeasured confounding in observational research. In *AMIA Annual Symposium*. 2020. [Poster]
- 19. **Zhang L**, Wang Y, Ostropolets A, Mulgrave JJ, Blei DM, and Hripcsak G. The medical deconfounder: assessing treatment effects with electronic health records. In *Women in Machine Learning (WiML) Workshop*. Vancouver, Canada. 2019. [Poster]
- 20. Zhang L, Wang Y, Ostropolets A, Mulgrave JJ, Blei DM, and Hripcsak G. The medical deconfounder: assessing treatment effects with electronic health records. In *Machine Learning for Health Workshop*. Vancouver, Canada. 2019. [Poster]
- 21. Ostropolets A, **Zhang L**, Mulgrave JJ, Hripcsak G. Investigating female-male differences in risk factors for myocardial infarction using OHDSI tools. In **AMIA Annual Symposium**. 2019. [Poster]
- 22. Song W, **Zhang L**, E. Gill, J.Z. Liu, A. Wright. Personalized treatment for type 2 diabetes using weighted k-nearest neighbors. In *AMIA Annual Symposium*. 2019. [Poster]
- 23. Szalat R, Samur MK, Ott CJ, Lawlor M, Epstein C, Abraham BJ, Lin CY, **Zhang L**, Prabhala R, Farrell N, Wes K, Tai YT, Fulciniti M, Parmigiani G, Young RA, Anderson KC, and Munshi NC. Integrative oncogenomic analysis combining whole genome, transcriptome and epigenome identifies altered chromatin accessibility landscape in multiple myeloma. In *American Society of Hematology Annual Meeting*. 2018. [Presentation]
- 24. **Zhang L**, Samur MK, Szalat R, Epstein CB, Prabhala R, Fulciniti M, Munshi NC.*, Parmigiani G.*. Interactions between multiple myeloma cells and bone marrow stromal cells impact epigenetic profiles of multiple myeloma. In *Program in Quantitative Genomics Conference*. Boston, MA. 2017. [Poster]
- 25. **Zhang L**, Samur MK, Szalat R, Epstein CB, Prabhala R, Fulciniti M, Munshi NC.*, Parmigiani G.*. Interactions between multiple myeloma cells and bone marrow stromal cells impact epigenetic profiles of multiple myeloma. In *Dana-Farber/Harvard Cancer Center Celebration of Junior Investigators*. Boston, USA. 2017. [Poster]

INVITED TALKS

Washington University in St. Louis
 CS531a AI for Health Guest Lecture
 Reliable real-world evidence for equitable health care

2.	Washington University in St. Louis Institute for Informatics, Data Science, and Biostatistics Research Seminar Reliable real-world evidence with EHR	2024
3.	Washington University in St. Louis CSE521S Wireless Sensor Networks Guest Lecture Causal machine learning for real-world evidence generation	2024
4.	International Chinese Statistical Association (ICSA) International Conference Probabilistic machine learning on unstructured data Adjusting for indirectly measured confounding using large-scale propensity score	2023
5.	University of Colorado School of Medicine Department of Biomedical Informatics Special Seminar Improving the Reliability of Real-World Evidence Generation from Large-Scale Observational D	2023 ata
6.	Ohio State University College of Medicine Department of Biomedical Informatics Special Seminar Improving the Reliability of Real-World Evidence Generation from Large-Scale Observational D	2023 ata
7.	Vanderbilt University Department of Biomedical Informatics Special Seminar Improving the Reliability of Real-World Evidence Generation from Large-Scale Observational D	2023 ata
8.	Washington University in St. Louis Institute for Informatics, Data Science, and Biostatistics Special Seminar Improving the Reliability of Real-World Evidence Generation from Large-Scale Observational D	2023 ata
9.	Northeastern University Department of Health Sciences Special Seminar Improving the Reliability of Real-World Evidence Generation from Large-Scale Observational D	2023 ata
10.	OHDSI Global Symposium Lightening talk When does statistical equality meet health equity: developing analytical pipelines to compare a ational and causal fairness in their application to EHR data.	2022 ssoci-
l1.	OHDSI Global Symposium Health Equity Workgroup Evaluating and improving performance and racial fairness of algorithms for GFR estimation.	2022
12.	OHDSI Global Symposium Population-Level Estimation Workgroup Adjusting for indirectly measured confounding using large-scale propensity score.	2022
13.	Columbia University Department of Biomedical Informatics Research Seminar Algorithmic fairness in medicine: A case study in glomerular filtration rate (GFR) prediction.	2021
14.	OHDSI Health Equity Workgroup Monthly Meeting Assessing the impact of race on glomerular filtration rate (GFR) prediction.	2021
15.	Columbia University Department of Biomedical Informatics Research Seminar Adjusting for unobserved confounding using large-scale propensity score.	2020

• Mark-Daniels Tamkloe, PhD student

Jun 2024-present

16. AMIA Annual Symposium 2020 Causal Inference Panel The medical deconfounder: assessing treatment effects with electronic health records. 17. University of Pennsylvania School of Medicine 2020 SC-TRM Working Group Meeting The medical deconfounder: assessing treatment effects with electronic health records. PROFESSIONAL ACTIVITIES Conference & Workshop Organizing • Scientific program committee member, AMIA Annual Symposium 2024 • Workshop organizer, OHDSI Global Symposium Tutorial: An Introduction to the Journey 2024 • Workshop chair, International Conference on AI in Medicine (AIME) Reliable and Equitable Real-World Evidence Generation Workshop 2024 • Co-chair, I2BD Annual Symposium 2024 • Committee member, IEEE Conference on AI x Medicine, Health, and Care (AIMHC) 2024 • Session chair, Machine Learning for Health (ML4H) Symposium 2023 Causality in Health AI Research Roundtable • Session chair, AMIA Annual Symposium 2023 Precision Medicine and Disease Subtyping Grant Reviewing • Reviewer, Patient-Centered Outcomes Research Institute (PCORI) 2024-Present Journal & Conference Reviewing • JAMIA Open 2024-Present • Journal of Biomedical Informatics (JBI) 2023-Present 2023-Present • Journal of Medical Internet Research (JMIR) 2022-Present • Health Informatics Journal • AMIA Annual Symposium 2019-Present 2022-Present • Applied Clinical Informatics Journal (ACI) • American Causal Inference Conference (ACIC) 2024 • Machine Learning for Healthcare (MLHC) 2020, 2022, 2023 • International Conference on Machine Learning (ICML) 2020 • Women in Machine Learning (WiML) Workshop 2019 • Machine Learning for Health (ML4H) Workshop 2019, 2020 TRAINEE MENTORSHIP • Siqi Sun, postdoctoral fellow Aug 2024-present

• Hsin Yi (Cindy) Chen, MD/PhD student	Sep 2023-present
• Zhen Luo, Master's student	Jun 2024-present
• Yiou Zhang, Master's student	Jun-Aug 2024
• Ayushman Choudhury, undergraduate student	May-Aug 2024
• Anand Ramabadran, undergraduate student	May-Aug 2024
• Yichen Sun, PhD student	Feb-Apr 2024
• Tevin Kim, high school student	$\operatorname{Jun-Aug}\ 2022$
UNIVERSITY SERVICE	
• Member, Biomedical Informatics and Data Science (BIDS) PhD Admission Com- Division of Biology & Biomedical Sciences (DBBS), WashU Medicine	amittee 2023-present
• Member, BIDS@I2 Summer Research Internship Admission Committee I2DB, WashU Medicine	2023-present
• Reviewer, Geospatial Research Initiative Washington University	2024
TEACHING	
• Computational Methods. Columbia University.	Spring 2020
\bullet Computer Applications in Health Care and Biomedicine. Columbia University.	Fall 2019
• Principles of Biostatistics I&II. Harvard T.H.Chan School of Public Health.	Summer 2017
• General Physics I&II. Boston University.	2012-2013
COMMUNITY OUTREACH & VOLUNTEER ACTIVITIES	
• Mentor, AMIA Annual Symposium Career Development for Women Event	2022
• Mentor, Columbia DBMI Summer Research Program	2022
• Volunteer, OHDSI Global Symposium	2022
• Volunteer, NeurIPS	2022