Mei Liu, PhD

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POSITION AND APPOINTMENTS

2022 – Present	Associate Professor with Tenure	Division of Biomedical Informatics Department of Health Outcomes and Biomedical Informatics (HOBI) University of Florida Gainesville, FL
2020 – 2022	Interim Director	Division of Medical Informatics Department of Internal Medicine University of Kansas Medical Center Kansas City, KS
2020 – 2022	Associate Professor with Tenure	Division of Medical Informatics Department of Internal Medicine University of Kansas Medical Center Kansas City, KS
2014 – 2020	Assistant Professor (tenure track)	Division of Medical Informatics Department of Internal Medicine University of Kansas Medical Center Kansas City, KS
2012 – 2014	Assistant Professor (tenure track)	Department of Computer Science New Jersey Institute of Technology Newark, NJ

EDUCATION / TRAINING

09/2009 – 06/2012	Postdoctoral Fellow	Department of Biomedical Informatics Vanderbilt University Medical Center Nashville, TN
09/2004 – 07/2009	PhD	Computer Science University of Kansas Lawrence, KS
09/2002 – 05/2004	MS	Computer Science University of Kansas Lawrence, KS
09/1998 – 05/2002	BS	Computer Science University of Kansas Lawrence, KS

RESEARCH SUMMARY

My research focus is **Artificial Intelligence and Machine Learning for P4 Medicine** (Predictive, Preventive, Personalized, and Participatory)

- Disease prediction and prevention via EHR data analysis: e.g., Acute Kidney Injury (AKI), Diabetic Kidney Disease (DKD), Diabetic Retinopathy, Sepsis
- Drug discovery and safety: drug design, drug repurposing, adverse drug reaction detection

Following highlight my work and selected publications in medical Al within the most recent 3 years:

- 1) Liu K, Zhang X, Chen W, Yu ASL, Kellum JA, Matheny ME, Simpson SQ, Hu Y, <u>Liu M</u>. Development and Validation of a Personalized Model With Transfer Learning for Acute Kidney Injury Risk Estimation Using Electronic Health Records. *JAMA Netw Open*. 2022;5(7):e2219776. (**IF 13.37**)
- 2) Bisarya R, Song X, Salle J, <u>Liu M</u>, Patel A, Simpson SQ. Antibiotic timing and progression to septic shock among emergency department patients with suspected infection. *Chest*, 2021 Jun 26: S0012-3692(21)01256-3. doi: 10.1016/j.chest.2021.06.029. Epub ahead of print. [PMID: 34186038] (**IF 10.262**)
- 3) Wang J, Abu-El-Rub N, Gray J, Pham HA, Zhou Y, Manion FJ, <u>Liu M</u>, Song X, Xu H, Rouhizadeh M, Zhang Y. COVID-19 SignSym: a fast adaptation of a general clinical NLP tool to identify and normalize COVID-19 signs and symptoms to OMOP common data model. *JAMIA*, 2021 Mar 1; ocab015. (**IF 7.942**)
- Song X, Yu ASL, Kellum JA, Waitman LR, Matheny ME, Simpson SQ, Hu Y, <u>Liu M</u>. Cross-site transportability of an explainable artificial intelligence model for acute kidney injury prediction. *Nat Commun.*, 2020 Nov 9;11(1):5668. [PMCID: PMC7653032] (IF 17.69)
- 5) Song X, Waitman LR, Hu Y, Yu ASL, Robbins DC, <u>Liu M</u>. (2019) Robust clinical marker identification for diabetic kidney disease with ensemble feature selection. *JAMIA*, 26(3), 242-253. [PMID: 30602020] (**IF 7.942**)

PROFESSIONAL ACTIVITIES

Editorial & Scientific Program Committees

2022 – Present	Frontiers Nephrology, Guest Editor for Rising Star in Critical Care Nephrology
2022 - Present	Scientific Reports, Associate Editor
2014 - Present	Associate Editor, Decision Support Systems (DSS)
2016 - Present	International Journal of Computational Intelligence in Bioinformatics and Systems Biology, Editorial Board
2019 - Present	AAAI Conference on Artificial Intelligence, Program Committee
2018 – Present	FLAIRS International Conference of the Florida Artificial Intelligence Research Society, Program Committee
2022	11 th IEEE International Conference on Health Informatics (ICHI) Poster and Demonstration Chair
2019, 2020	AMIA Annual Symposium Scientific Program Committee, Data Science track

2019, 2021 AMIA Informatics Summit Scientific Program Committee, Data Science

track

2012 Guest Editor, The Scientific World Journal special issue on Sequence-

Based Prediction of Structure and Function of Protein

Grant Proposal Reviewer

2020 – Present National Institutes of Health (NIH) Review Panel
2018 – Present National Science Foundation (NSF) Review Panel

2017 Greater Plains Collaborative (GPC) Clinical Data Research Network Inter-

Institutional Pilot Grant Program

2016 KUMC Research Institute Internal Clinical Pilot Research Grant and Lied

Basic Science Grant Programs

Conference Reviewer

AMIA – American Medical Informatics Association Annual Symposium
AMIA Joint Summits on Translational Science
MedInfo – World Congress on Medical and Health Informatics
ICHI – IEEE International Conference on Healthcare Informatics
PAKDD – Workshop on Scalable Data Analytics: Theory and Applications
ICMLA – International Conference on Machine Learning and Applications
IEEE International Workshop on Big Data in Bioinformatics and Health Informatics
BIOKDD – International Workshop on Data Mining in Bioinformatics
ICIC – International Conference on Intelligent Computing
HISB – IEEE Conference on Healthcare Informatics, Imaging, and System Biology

Journal Reviewer

2022	Kidney International
2020	Journal of the American Society of Nephrology (JASN)
2020	BMC Nephrology
2016 - Present	Applied Clinical Informatics (ACI)
2014 - Present	Data Mining and Knowledge Discovery (DMKD)
2017	Knowledge Based Systems (KBS)
2016	Artificial Intelligence in Medicine (AIM)
2013 – 2015	International Journal of Data Mining and Bioinformatics (IJDMB)
2013	IEEE Transactions on Knowledge and Data Engineering (TKDE)
2012, 2015	Journal of Web Engineering (JWE)

2015	Neural Networks
2014	Expert Systems With Applications (ESWA)
2013	Journal of the American Medical Informatics Association (JAMIA)
2013	PLoS ONE
2012, 2013	BMC Bioinformatics

HONORS & AWARDS

2017	Distinguished Paper, "Predicting inpatient acute kidney injury over different time horizons: how early and accurate?", American Medical Informatics Association (AMIA)
2017	AMIA Clinical Research Informatics Award nominee, Joint Summits on Translational Science (AMIA-CRI)
2013	Distinguished Paper, "Identifying Inconsistencies in SNOMED-CT Problem Lists using Structural Indicators", American Medical Informatics Association (AMIA)
2012	Distinguished Paper, "Large-scale Prediction of Adverse Drug Reactions by Integrating Chemical, Biological, and Phenotypic Properties of Drugs", American Medical Informatics Association (AMIA) Joint Summit on Translational Science
2009 – 2011	National Library of Medicine Postdoctoral Training Fellowship
2010	2 nd Best system in Concept Extraction task, i2b2 NLP challenge
2009	Honor Dissertation – Department of Electrical Engineering and Computer Science, University of Kansas
2007	Paul F. Huebner Memorial Award – Excellence in teaching, University of Kansas
2002	Outstanding Senior in Computer Science – Based on overall outstanding academic achievement. The award is presented to only one graduating senior in each of the three majors (i.e. Computer Science, Computer Engineering, Electrical Engineering) in the Department of Electrical Engineering and Computer Science, University of Kansas

TEACHING ACTIVITIES

Fall, 2018 – 2021	PRVM868 – Biomedical Informatics Driven Clinical Resea	arch Graduate
Spring, 2014	CS639 – Electronic Medical Records	Graduate
Fall, 2013	CS115 – Introduction to Computer Science, C++	Undergraduate
Spring, 2013	CS639 – Electronic Medical Records	Graduate
Fall, 2012	CS639 – Electronic Medical Records	Graduate

1998 – 2002 Endowment Merit Scholar, University of Kansas

STUDENT SUPERVISION

<u>Advisor</u>

2021 – Present Ho Yin Chan, Postdoctoral Fellow, Medical Informatics, University of Kansas Medical Center (KUMC)

2017 – 2019	Xing Song, Postdoctoral Fellow, Medical Informatics, University of Kansas Medical Center (KUMC)
2016 – 2017	Peng Cheng, Postdoctoral Fellow, Medical Informatics, University of Kansas Medical Center (KUMC)
2012 – 2013	Ankur Agrawal, PhD, Computer Science, New Jersey Institute of Technology (NJIT)
PhD Committee	
2021 – 2026	Liangqin Ren, Computer Science, University of Kansas (KU)
2020 – 2026	Pramil Paudel, Computer Science, University of Kansas (KU)
2020 – 2026	Sumit Bhattarai, Computer Science, University of Kansas (KU)
2019 – 2025	Zeyan Liu, Computer Science, University of Kansas (KU)
2017 – 2022	Sana Awan, Computer Science, University of Kansas (KU)
2019	Hao Xue, Computer Science, University of Kansas (KU)
2017 – 2018	Ala'a Jaber, Occupational Therapy, University of Kansas Medical Center (KUMC)
2017 – 2018	Ling Zheng, Computer Science, New Jersey Institute of Technology (NJIT)
2015	Xiang Ji, Computer Science, New Jersey Institute of Technology (NJIT)
2013	Zhe He, Computer Science, New Jersey Institute of Technology (NJIT)
Master Committee	
2014	Mengnan Gu, New Jersey Institute of Technology (NJIT)
2013	Meghanasamir Vasavada, New Jersey Institute of Technology (NJIT)

GRANT

Ongoing Research Support

NSF/Smart & Connected Health Liu (PI) 10/2020 – 09/2024

SCH: INT: Collaborative Research: Privacy-Preserving Federated Transfer Learning for Early Acute Kidney Injury Risk Prediction

Major Goals: The project is to address the computational and security challenges for building a global machine learning model to predict acute kidney injury (AKI) in hospitalized patients using EMR data located at different hospitals. The prediction model will be developed and developed using data from 12 health systems in the PCORnet Greater Plains Collaborative.

Role: Lead-PI

R01DK116986 Liu (PI) 09/2019 – 06/2023 NIH/NIDDK

Identifying Personalized Risk of Acute Kidney Injury with Machine Learning

Major Goals: This project aims to develop novel machine learning algorithms to identify risk factors of acute kidney injury in hospitalized patients using data from two PCORnet clinical data research networks (CDRNs).

Role: PI

Completed Research Support

RD-2020C2-20329 O'Rorke (PI) 07/2021 – 06/2025

Patient Centered Outcomes Research Institute (PCORI)

Comparative Effectiveness Research for Neuroendocrine Tumors (CER-NET)

Major Goals: Partner with patients on comparative effectiveness research (CER to achieve the goal of mitigating toxicity and optimizing effectiveness and sequencing of therapy for patietns with neuroendocrine tumors (NETs).

Role: Site-PI

UL1 TR002366 Castro (PI) 07/2022 – 06/2027

NIH/NCATS, Institutional Clinical and Translational Science Award (U54)

Frontiers: The Heartland Institute for Clinical and Translational Research

Major Goals: Create a new academic home with training programs for clinical and translational investigators, provide an enhanced coordinated translational research infrastructure and actively engage the community in developing, testing and disseminating translational research.

Role: Informatics Core Co-Lead

RI-CRN-2020-003-IC Waitman (PI) 01/2022 – 12/2024

Patient Centered Outcomes Research Institute (PCORI)

Advancement of PCORnet Infrastructure: Clinical Research Network

Major Goals: Advance the informatics capacity of the PCORnet Greater Plains Collaborative research network that captures complete and comprehensive data from patients at twelve medical centers.

Role: Co-I; GPC representative in the PCORnet CDM Data Workgroup

U54DK126126-01 Calvet (PI) 07/2020 - 06/2025

NIH/NIDDK

Kansas PKD Research and Translation Core Center

Major Goals: Part of a national PKD Research Consortium, to develop and share research resources, with overall goal of improving our understanding of the pathogenesis, progression, prevention and clinical management of polycystic kidney disease (PKD) through enhanced sharing of research resources, core services and expertise to ensure establishment of a robust research community.

Role: Key Personnel

U18-DP006120-01 Black & Kho (PI) 09/2015 – 09/2021

Centers for Disease Control and Prevention (CDC)

Effect of ACA Medicaid Expansion on Diabetes: Diagnosis, Treatment, Patient Compliance and Health Outcomes

Major Goals: Study the effect of the Patient Protection and Affordable Care Act of 2010 (ACA) Medicaid expansion on diabetes diagnosis, treatment, and outcomes in adults, using data from two PCORnet clinical data research networks (CDRNs).

Role: Site-PI

PCORI (#PaCR-2017C2-8153) O'Brien (PI) 10/2019 – 07/2020

Duke University/Duke Clinical Research

Using PCORnet to Compare Blood Pressure Control Strategies

Major Goals: In collaboration with the American Heart Association (AHA) and the American Medical Association (AMA), the Health eHeart Alliance and PCORnet Cardiovascular Health Collaborative Research Network propose to establish the National Blood Pressure Control Laboratory to enhance cardiovascular health and blood pressure control in the United States. The BP Control Lab will enable blood pressure control surveillance, provide feedback to healthcare systems and clinicians, and conduct efficient pragmatic comparative effectiveness research on interventions designed to enhance blood pressure control.

Role: Subaward PI-KUMC site

Kidney Health CRG Pilot

Liu (PI)

08/2018 - 03/2019

Patient Centered Outcomes Research Institute (PCORI)

Building and Validating Predictive Models for Acute Kidney Injury using PCORnet CDMMajor Goals: Develop and validate predictive models for acute kidney injury in general hospitalized patients using electronic medical record data across PCORnet.

Role: PI

BLUE KC Outcomes Research Grants

Simpson (PI)

08/2017 - 09/2018

KCALSI, Kansas City Area Life Sciences Institute

Sepsis Predictive Risk Modeling Learned from Information Security

Major Goals: Develop predictive models for patients with sepsis, assessing what clinical factors would make physicians move faster in treating patients with suspected sepsis.

Role: Co-Investigator (machine learning expert)

CDRN-1306-04631

Waitman (PI)

09/2015 - 09/2018

Patient Centered Outcomes Research Institute (PCORI)

The Greater Plains Collaborative – a PCORnet Clinical Data Research Network Phase II Major Goals: Extend the capacity of the research network that captures complete and comprehensive data from patients at twelve medical centers. Continue governance, regulatory processes, technical infrastructure, and patient engagement strategies to enable a learning health care system by integrating Comparative Effectiveness Research with clinical workflows. Develop sustainable model for this digital infrastructure.

Role: Co-Investigator

CDRN-1306-04631 Modification 003

Waitman (PI)

10/2015 - 01/2017

Patient Centered Outcomes Research Institute

The Greater Plains Collaborative Phase I Supplement – CMS Enclave Project

Major Goals: The objective of this project is to test and evaluate the process of using Medicare claims data to supplement PCORnet Clinical Data Research Network (CDRN) data.

Role: Co-Investigator

CDRN-1306-04631

Waitman (PI)

03/2014 - 09/2015

Patient Centered Outcomes Research Institute

The Greater Plains Collaborative; a PCORnet Clinical Data Research Network – Phase I Major Goals: create a research network that captures complete and comprehensive data from patients at ten medical centers. Develop the governance, regulatory processes, technical infrastructure, and patient engagement strategies to enable a learning health care system by integrating Comparative Effectiveness Research with clinical workflows.

Role: Co-Investigator

RESEARCH ACTIVITIES

Publications (in reverse chronological order)

Peer-reviewed Journal Articles

- 1. X. Zhang, K. Liu, B. Yuan, H. Wang, S. Chen, Y. Xue, W. Chen, **M. Liu**, Y. Hu. A hybrid adaptive approach for instance transfer learning with dynamic and imbalanced data. *International Journal of Intelligent Systems (IJIS)*, First published 02 September 2022; https://doi.org/10.1002/int.23055.
- 2. K. Liu, X. Zhang, W. Chen, ASL. Yu, JA. Kellum, ME. Matheny, SQ. Simpson, Y. Hu, **M. Liu**. Development and Validation of a Personalized Model With Transfer Learning for Acute Kidney Injury Risk Estimation Using Electronic Health Records. *JAMA Netw Open.* 2022;5(7):e2219776.
- 3. K. Liu, B. Yuan, X. Zhang, W. Chen, LP. Patel, Y. Hu, **M. Liu**. Characterizing the temporal changes in association between modifiable risk factors and acute kidney injury with multiview analysis. *Int J Med Inform*. 2022 July;163:104785.
- 4. L. Wu, Y. Hu, **M. Liu**, B. Yuan, X. Zhang, WQ. Chen, K. Liu. Temporal dynamics of clinical risk predictors for hospital-acquired acute kidney injury under different forecast time windows. *Knowledge-Based Systems*. 2022 June;245:108655.
- LR. Waitman, X. Song, DL. Walpitage, DC. Connolly, LP. Patel, M. Liu, MC. Schroeder, JJ. VanWormer, AS. Mosa, ET. Anye, AM. Davis. Enhancing PCORnet Clinical Research Network data completeness by integrating multistate insurance claims with electronic health records in a cloud environment aligned with CMS security and privacy requirements. *J Am Med Inform Assoc.*, 2022 Mar 15;29(4):660-670. doi: 10.1093/jamia/ocab269. PMID: 34897506; PMCID: PMC8922172.
- 6. L. Wu, Y. Hu, X. Zhang, J. Zhang, **M. Liu**. Development of a knowledge mining approach to uncover heterogeneous risk predictors of acute kidney injury across age groups. *Int J Med Inform.* 2021 Dec;158:104661. doi: 10.1016/j.ijmedinf.2021.104661.
- 7. Q. Luo, S. Mo, Y. Xue, X. Zhang, Y. Gu, L. Wu, J. Zhang, L. Sun, **M. Liu**, Y. Hu. Novel deep learning-based transcriptome data analysis for drug-drug interaction prediction with an application in diabetes. *BMC Bioinformatics*, 2021, 22:318. Doi:10.1186/s12859-021-04241-1.
- 8. A. Furmanchuk, **M. Liu**, X. Song, L.R. Waitman, J.R. Meurer, K. Osinski, A. Stoddard, E. Chrischilles, J.C. McClay, L.G. Cowell, U. Tachinardi, P.J. Embi, A.S.M. Mosa, V. Mandhadi, R.C. Shah, D. Garcia, F. Angulo, A. Patino, W.E. Trick, T.W. Markossian, L.J. Rasmussen-Torvik, A.N. Kho, B.S. Black. Effect of the affordable care act on diabetes care at major health centers: newly detected diabetes and diabetes medication management. *BMJ Open Diab Res Care*, 2021, 9:e002205. Doi:10.1136/bmjdrc-2021-002205.
- 9. R. Bisarya, X. Song, J. Salle, **M. Liu**, A. Patel, S.Q. Simpson. Antibiotic timing and progression to septic shock among emergency department patients with suspected infection. *Chest*, 2021, Jun 26:S0012-3692(21)01256-3. doi: 10.1016/j.chest.2021.06.029. Epub ahead of print. PMID: 34186038.
- 10. X. Song, **M. Liu**, L.R. Waitman, A. Patel, S.Q. Simpson. Clinical factors associated with rapid treatment of sepsis. *PLoS ONE*, 2021, 16(5):e0250923.
- 11. R. Wang, Z. Miao, T. Liu, **M. Liu**, K. Grdinovac, X. Song, Y. Liang, D. Delen, W. Paiva. Derivation and validation of essential predictors and risk index for early detection of diabetic retinopathy using electronic health records. *J. Clin. Med.*, 2021, 10, 1473.

- 12. J. Wang, N. Abu-El-Rub, J. Gray, H.A. Pham, Y. Zhou, F.J. Manion, **M. Liu**, X. Song, H. Xu, M. Rouhizadeh, Y. Zhang. COVID-19 SignSym: a fast adaptation of a general clinical NLP tool to identify and normalize COVID-19 signs and symptoms to OMOP common data model. *JAMIA*, 2021 Mar 1;ocab015.
- 13. X. Song, A.S.L. Yu, J.A. Kellum, L.R. Waitman, M.E. Matheny, S.Q. Simpson, Y. Hu, **M. Liu**. Cross-site transportability of an explainable artificial intelligence model for acute kidney injury prediction. *Nat Commun.*, 2020 Nov 9;11(1):5668.
- 14. L. Wu, Y. Hu, B. Yuan, X. Zhang, W. Chen, K. Liu, **M. Liu.** Which risk predictors are more likely to indicate severe AKI in hospitalized patients? *Int J Med Inform.*, 2020 Nov;143:104270.
- 15. L. Wu, Y. Hu, X. Zhang, W. Chen, A.S.L. Yu, J.A. Kellum, L.R. Waitman, **M. Liu**. Changing relative risk of clinical factors for hospital-acquired acute kidney injury across age groups: a retrospective cohort study. *BMC Nephrology*, 2020 Aug 2;21(1):321.
- M.T. Beauchamp, B. Regier, A. Nzuki, R.W. Romine, B. Sweeney, M. Liu, A.M. Davis. Weight change before and after adenotonsillectomy in children: an analysis based upon presurgery body mass category. *Clinical Otolaryngology*, 2020;00:1-7. DOI: 10.1111/coa.13568.
- 17. X. Song, L.R. Waitman, A.S.L. Yu, D.C. Robbins, Y. Hu, M. Liu. Longitudinal risk prediction of chronic kidney disease in diabetic patients using a temporal-enhanced gradient boosting machine: retrospective cohort study. *JMIR Med Inform*, 2020;8(1):e15510. DOI: 10.2196/15510.
- X. Song, L.R. Waitman, Y. Hu, A.S.L. Yu, D.C. Robbins, M. Liu. Robust clinical marker identification for diabetic kidney disease with ensemble feature selection. *JAMIA*, 26(3): 242-253, January 2019. DOI: 10.1093/jamia/ocy165.
- 19. J. He, Y. Hu, X. Zhang, L. Wu, L.R. Waitman, **M. Liu**. Multi-perspective predictive modeling for acute kidney injury in general hospital populations using electronic medical records. *JAMIA Open*, 00(0)1-8, November 2018. DOI: 10.1093/jamiaopen/ooy043.
- 20. L. Wu, Y. Hu, X. Liu, X. Zhang, W. Chen, A.S.L. Yu, J.A. Kellum, L.R. Waitman, **M. Liu**. Feature ranking in predictive models for hospital-acquired acute kidney injury. *Scientific Reports*, (2018)8:17298, November 2018. DOI:10.1038/s41598-018-35487-0.
- 21. X. Zhang, Y. Hu, **M. Liu**, T. Lang. Optimization of assembly pipeline may improve the sequence of the Chloroplast genome in *Quercus spinose*. *Scientific Report*, (2018)8:8906, June 2018. DOI:10.1038/s41598-018-27298-0.
- 22. W. Chen, Y. Hu, L. Wu, X. Zhang, K. Liu, J. He, Z. Tang, X. Song, L.R. Waitman, **M. Liu.** Causal risk factor discovery for severe acute kidney injury using electronic health records. *BMC Medical Informatics and Decision Making*, 18(Suppl 1):13, March 2018.
- 23. R. Cai, **M. Liu**, Y. Hu, B.L. Melton, M.E. Matheny, H. Xu, L. Duan, L.R. Waitman. Identification of adverse drug-drug interactions through causal association rule discovery from spontaneous adverse event reports. *Artificial Intelligence in Medicine*. 76:7-15, January 2017.
- 24. A. Culbertson, S.Goel, M.B. Madden, N. Safaeinili, K.L. Jackson, T. Carton, L.R. Waitman, M. Liu, A. Krishnamurthy, L. Hall, N. Cappella, S. Visweswaran, M.J. Becich, R. Applegate, E. Bernstam, R. Rothman, M. Matheny, G. Lipori, J. Bian, W. Hogan, D. Bell, S. Grannis, A. Martin, J. Klann, R. Sutphen, A.B. Ohara, A. Kho. The building blocks of interoperability: a multisite analysis of patient demographic attributes available for matching. *Applied Clinical Informatics*. 8:322-336, 2017.

- 25. A.G. Sreih, N. Annapureddy, J. Springer, G. Casey, K. Byram, A. Cruz, M. Estephan, V. Frangiosa, M.D. George, **M. Liu**, A. Parker, S. Sangani, R. Sharim, P.A. Merkel. Development and validation of case-finding algorithms for the identification of patients with ANCA-Associated Vasculitis in Large Healthcare Administrative Databases. *Pharmacoepidemiology and Drug Safety*. 25(12):1368-1374, December 2016.
- 26. Y. Tan, Y. Hu, X. Liu, Z. Yin, X-W. Chen, **M. Liu.** Improving drug safety: From adverse drug reaction knowledge discovery to clinical implementation. *Methods*. 110:14-25, November 1, 2016.
- 27. W. Chen, Z. Hao, R. Cai, X. Zhang, Y. Hu, **M. Liu**. Multiple-cause discovery combined with structure learning for high-dimensional discrete data and application to stock prediction. *Soft Computing*. 20(11):4575-4588, November 2016.
- 28. Y. Hu, K. Liu, X. Zhang, L. Su, E.W.T. Ngai, **M. Liu.** Application of evolutionary computation for rule discovery in stock algorithmic trading: a literature review. *Applied Soft Computing*. 36:534-551. November 2015.
- 29. Y. Hu, K. Liu, X. Zhang, K. Xie, W. Chen, Y. Zeng, **M. Liu**. Concept drift mining of portfolio selection factors in stock market. *Electronic Commerce Research and Applications (ECRA)*. 14(6):444-455, October-November 2015.
- 30. X. Zhang, Y. Hu, K. Xie, W. Zhang, L. Su, **M. Liu**. An Evolutionary Trend Reversion Model for Stock Trading Rule Discovery. *Knowledge-Based Systems*. 79:27-35, May 2015.
- 31. Y. Hu, B. Feng, X. Mo, X. Zhang, E.W.T. Ngai, **M. Liu**. Cost-sensitive and Ensemble-based Prediction Model for Outsourced Software Project Risk Prediction. *Decision Support Systems* (*DSS*). 72:11-23, April 2015.
- 32. Y. Hu, B. Feng, X. Zhang, E.W.T. Ngai, **M. Liu**. Stock Trading Rule Discovery with an Evolutionary Trend Following Model. *Expert Systems with Applications*. 42(1):212-222, January 2015.
- 33. Y. Hu, X. Zhang, B. Feng, K. Xie, **M. Liu**. iTrade: A Mobile Data-Driven Stock Trading System with Concept Drift Adaptation. *International Journal of Data Warehousing and Mining*. 11(1): 66-83, January 2015.
- 34. X. Zhang, Y. Hu, K. Xie, S. Wang, E.W.T. Ngai, **M. Liu**. A Causal Feature Selection Algorithm for Stock Prediction Modeling. *Neurocomputing*, 142(0):48-59, October 2014.
- 35. **M. Liu**, R. Cai, Y. Hu, M.E. Matheny, J. Sun, J. Hu, H. Xu. Determining Molecular Predictors of Adverse Drug Reactions with Causality Analysis based on Structure Learning. *Journal of the American Medical Informatics Association (JAMIA*), 21(2):245-51, Mar-April 2014.
- 36. Y. Hu, X. Zhang, E.W.T. Ngai, R. Cai, **M. Liu.** Software Project Risk Analysis using Bayesian Networks with Causality Constraints. *Decision Support Systems (DSS)*. 56:439-49, December 2013.
- 37. Y. Hu, J. Du, X. Zhang, X. Hao, E.W.T. Ngai, M. Fan, **M. Liu**. An Integrative Framework for Intelligent Software Project Risk Planning. *Decision Support Systems (DSS)*. 55(4):927-37, November 2013.
- 38. **M. Liu**, E.R. McPeek Hinz, M.E. Matheny, J.C. Denny, J.S. Schildcrout, R.A. Miller, H. Xu. Comparative Analysis of Pharmacovigilance Methods in Detection of Adverse Drug Reactions from Electronic Medical Records. *Journal of the American Medical Informatics Association (JAMIA*). 20:420-6, May 2013.

- 39. L. Duan, M. Khoshneshin, W. Street, **M. Liu**. Adverse Drug Effect Detection. *IEEE Journal of Biomedical and Health Informatics*, 17(2):305-311, March 2013.
- 40. **M. Liu**, Y. Wu, Y. Chen, J. Sun, Z. Zhao, X-W. Chen, M.E. Matheny, H. Xu. Large-scale Prediction of Adverse Drug Reactions Using Chemical, Biological, and Phenotypic Properties of Drugs. *Journal of the American Medical Informatics Association (JAMIA)*. 19(e1):e28-e35, June 2012.
- 41. Y. Lu, H. Xu, N.B. Peterson, Q. Dai, M. Jiang, J.C. Denny, **M. Liu.** Extracting Epidemiologic Exposure and Outcome Terms from Literature using Machine Learning Approaches. *International Journal of Data Mining and Bioinformatics (IJDMB)*. 6(4):447-59, 2012.
- 42. M. Jiang, Y. Chen, **M. Liu**, S.T. Rosenbloom, S. Mani, J.C. Denny, H. Xu. A study of Machine Learning Based Approaches to Extract Clinical Entities and their Assertions from Discharge Summaries. *Journal of the American Medical Informatics Association (JAMIA)*. 18(5):601-6, 2011.
- 43. Y. Hu, C. Guo, E.W.T. Ngai, **M. Liu**, S. Chen. A Scalable Intelligent Non-content-based Spam-filtering Framework. *Expert Systems with Applications*. 37(2010):8557-65, 2010.
- 44. **M. Liu**, X. Chen, R. Jothi. Knowledge-Guided Inference of Domain-Domain Interactions from Incomplete Protein-Protein Interaction Networks. *Bioinformatics*. 25(19):2492-2499, 2009.
- 45. X. Lin, **M. Liu**, X-W. Chen. Assessing Quality of Protein-Protein Interactions by Integrative Analysis of Data in Model Organisms. *BMC Bioinformatics*. 10(Suppl 4):S5 2009.
- 46. X-W. Chen, **M. Liu**, R. Ward. Protein Function Assignment through Mining Cross-Species Protein-Protein Interactions. *PLoS ONE*. 3(2): e1562, 2008.
- 47. X-W. Chen, **M. Liu**. Domain Based Predictive Models for Protein-Protein Interaction Prediction. *EURASIP Journal on Advances in Signal Processing*. 2006(1):55, 2006.
- 48. X-W. Chen, **M. Liu**. Prediction of Protein-protein Interactions Using Random Decision Forest Framework. *Bioinformatics*. 21(24):4394-4400, 2005.

Peer-reviewed Conference Articles

- 49. HY. Chan and **M. Liu**. Interpretable sub-phenotype identification in acute kidney injury. *American Medical Informatics Association Annual Symposium (AMIA 2022*), Accepted, November 2022.
- 50. K. Liu, X. Zhang, WQ. Chen, B. Yuan, Y. Hu, **M. Liu**. A patient complexity measure for subgroup prediction modeling of acute kidney injury. *The China Conference on Health Information Processing* (*CHIP 2021*). December 4-5, 2021.
- 51. X. Zhang, Y. Xue, X. Shu, S. Chen, K. Liu, WQ. Chen, **M. Liu**, Y. Hu. A transfer learning approach to correct temporal performance drift of clinical prediction on models. The China Conference on Health Information Processing (*CHIP 2021*). December 4-5, 2021, recommended for journal publication in JMIR Medical Informatics.
- 52. N. Abu-el-rub, J. Urbain, G. Kowalski, K. Osinski, R. Spaniol, **M. Liu**, B. Taylor, LR. Waitman. Natural Language Processing for Enterprise-scale De-identification of Protected Health Information in Clinical Notes. *American Medical Informatics Association Informatics Summit*, March 2022.
- 53. X. Song, L.R. Waitman, Y. Hu. B. Luo, F. Li, **M. Liu**. The impact of medical big data anonymization on early acute kidney injury risk prediction. *American Medical Informatics Association Informatics Summit*, March 2020.

- 54. X. Song, L.R. Waitman, Y. Hu, A.S.L. Yu, D.C. Robbins, **M. Liu**. An exploration of ontology-based EMR data abstraction for diabetic kidney disease prediction. *American Medical Informatics Association Informatics Summit*, March 2019.
- 55. P. Cheng, L.R. Waitman, Y. Hu, **M. Liu**. Predicting inpatient acute kidney injury over different time horizons: how early and accurate? *American Medical Informatics Association Annual Symposium (AMIA '17*), November 2017, *Distinguished Paper*.
- 56. **M. Liu**, B.L. Melton, G. Ator, L.R. Waitman. Integrating medication alert data into a clinical data repository to enable retrospective study of drug interaction alerts in clinical practice. *AMIA Joint Summits on Translational Science* (*AMIA-CRI'17*), March 2017.
- 57. W. Chen, L. Su, Z. Hao, X. Zhang, K. Liu, **M. Liu**, Y. Hu. Discovering many-to-one causality in software project risk analysis. *9*th International Conference on P2P, Parallel, Grid, Cloud and Internet Computing, November 2014.
- 58. A. Agrawal, Y. Perl, Y. Chen, G. Elhanan, **M. Liu**. Identifying Inconsistencies in SNOMED-CT Problem Lists using Structural Indicators. *American Medical Informatics Association Annual Symposium (AMIA'13)*, November 2013, *Distinguished Paper*.
- 59. Y. Hu, B. Feng, X. Zhang, K. Liu, K. Xie, **M. Liu**. iTrade: An Adaptive Risk-adjusted Intelligent Stock Trading System from the Perspective of Concept Drift, The 4th International Conference on Emerging Intelligent Data and Web Technologies (EIDWT-2013), September 2013.
- 60. M. Liu, A. Shah, N.B. Peterson, Q. Dai, M.C. Aldrich, Q. Chen, E.A. Bowton, H. Liu, J.C. Denny, H. Xu. A Study of Transportability of an Existing Smoking Status Detection Module across Institutions. *American Medical Informatics Association Annual Symposium (AMIA'12)*, 2012.
- 61. Y. Wu, **M. Liu**, W.J. Zheng, Z. Zhao, H. Xu. Ranking Gene-Drug Relationships in Biomedical Literature using Latent Dirichlet Allocation. *Pacific Symposium on Biocomputing (PSB'12)*, 2012.
- 62. J. Du, Y. Hu, C.X. Ling, M. Fan, **M. Liu**. Efficient Action Extraction with Many-to-Many Relationship between Actions and Features. The 3rd International Workshop on Logic, Rationality, and Interaction (LORI-2011), 384-385, 2011.
- 63. J. Du, Y. Hu, C.X. Ling, M. Fan, **M. Liu**. Efficient Action Extraction with Application to Software Project Risk Management Planning. The 3rd International Conference on Intelligent Computing and Intelligent Systems (ICIS-2011), 413-417, 2011.
- 64. **M. Liu**, M. Jiang, V.K. Kawai, C.M. Stein, D.M. Roden, J.C. Denny, H. Xu. Modeling Drug Exposure Data in Electronic Medical Records: an Application to Warfarin. *American Medical Informatics Association Annual Symposium* (*AMIA'11*), 2011.
- 65. H. Xu, Y. Lu, M. Jiang, **M. Liu**, J.C. Denny, Q. Dai, N.B. Peterson. Mining Biomedical Literature for Terms Related to Epidemiologic Exposures. *American Medical Informatics Association Annual Symposium* (*AMIA'10*), 2010.
- 66. W. Guo, Y. Hu, **M. Liu**, J. Yin, K. Xie. Exploring Cost-Sensitive Learning in Domain Based Protein-Protein Interaction Prediction. *The Sixth International Symposium on Neural Networks (ISNN'09*), 2009.
- 67. X. Lin, **M. Liu**, X-W. Chen. Protein-Protein Interaction Prediction and Assessment from Model Organisms. *In Proceedings of the IEEE International Conference on Bioinformatics and Biomedicine* (*BIBM'08*), 2008.

- 68. X. Chen, **M. Liu**, Y. Hu. Hierarchical Neural Network for Integrating Heterogeneous Data to Predict Human Protein Interaction Networks. *The 4th International Conference on Advanced Data Mining Applications* (**ADMA'08**) 2008, in Proceedings of Lecture Notes in Artificial Intelligence (LNAI) 5139.
- 69. Y. Hu, J. Huang, J. Chen, **M. Liu**, X. Kang. Software Project Risk Management Modeling with Neural Network and Support Vector Machine Approaches, *The 3rd International Conference on Natural Computation (ICNC'07*), 2007.
- 70. Y. Hu, J. Chen, J. Huang, **M. Liu**, X. Kang, Analyzing Software System Quality Risk Using Bayesian Belief Network, *IEEE International Conference on Granular Computing* (*ICGC'07*), 2007.
- 71. Y. Hu, J. Chen, Z. Rong, **M. Liu**, K. Xie. A Neural Networks Approach for Software Risk Analysis. In *Proceedings of the 6th IEEE International Conference on Data Mining Workshops (ICDMW'06*), 2006.

Invited Articles / Book Chapters

- 72. **M. Liu**, Y. Hu, B. Tang. Role of Text Mining in Early Identification of Potential Drug Safety Issues. In: V. Kumar and H. Tipney, ed. Biomedical Literature Mining. Humana Press, 2014.
- 73. **M. Liu**, Y. Hu, M.E. Matheny, L. Duan, H. Xu. Artificial Intelligence Approaches for Drug Safety Surveillance and Analysis. In: A. Agah, ed. Medical Applications of Artificial Intelligence. Taylor & Francis Group, 2013.
- 74. **M.** Liu, M.E. Matheny, Y. Hu, H. Xu. Data Mining Methodologies for Pharmacovigilance. *ACM SIGKDD Explorations Newsletter*, 14(1):35-42, June 2012.

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Conference Abstracts/Presentations

- 1. X. Song, L. Patel, L.R. Waitman, **M. Liu**. Multi-view gradient boosting tree for acute kidney injury prediction and modifiable risk factor identification. *AMIA Annual Symposium*, November 2020.
- 2. **M.** Liu, X. Song, C. Buller, T. Woodburn, M. Jakubauskas, B. Wolfe, B. Polivka. Environmental influences of extreme heat on the health of older adults: a retrospective study. *The Gerontological Society of America (GSA) Annual Scientific Meeting*, November 2020.
- 3. L. Wu, Y. Hu, J. Zhang, X. Zhang, W. Chen, K. Liu, A.S.L. Yu, J.A. Kellum, L.R. Waitman, **M.** Liu. Discovering risk factors associated with inpatient acute kidney injury across age groups. *The 26th International Conference on Advances in Critical Care Nephrology*, San Diego, February 2020.
- 4. X. Song, **M. Liu**, L.R. Waitman, A. Patel, S. Parashar, S.Q. Simpson. Discovery of clinical factors associated with suspected infections. *Society of Critical Care Medicine (SCCM)*, Critical Care Medicine: 48(1), 784, January 2020.
- 5. X. Song, **M. Liu**, L.R. Waitman, A. Patel, S.Q. Simpson. Discovering factors inducing rapid treatment of sepsis. *American Thoracic Society International Conference*, Dallas, May 2019.

- 6. X. Song, **M. Liu**, L.R. Waitman, A. Patel, S.Q. Simpson. An investigation of emergency treatment of sepsis-clinical intervention prediction using machine learning models. *American Thoracic Society International Conference*, Dallas, May 2019.
- 7. X. Song, **M. Liu**, L.R. Waitman, A. Patel, S.Q. Simpson. Visualization of clinical pathways for severe sepsis patients. *AMIA Informatics Summits*, San Francisco, March, 2019.
- 8. X. Song, L.R. Waitman, Y. Hu, A.S.L. Yu, D.C. Robbins, **M. Liu**. Influence of bias introduced by filtering patients with "complete" electronic health records (EHRs) on predicting diabetic kidney disease. *AMIA Informatics Summits*, San Francisco, March, 2018.
- A.G. Sreih, N. Annapureddy, J. Springer, K. Byram, G. Casey, A. Cruz, M. Estephan, V. Frangiosa, M. George, M. Liu, M. Maz, A. Parker, S. Sangani, R. Sharim, P.A. Merkel. Development and Validation of Case-Finding Algorithms for the Identification of Patients with ANCA-Associated Vasculitis and Large-Vessel Vasculitis in Healthcare Administrative Databases. American College of Rheumatology Annual Meeting (ACR/ARHP'16), Washington, DC, November, 2016.
- 10. B.L. Melton, N. Graham, L.R. Waitman, **M. Liu**. Use of EMRs to Identify Drugs that Induce Acute Kidney Injury. *AMIA Joint Summits on Translational Science* (*AMIA-CRI'16*), San Francisco, CA, USA, March 2016.
- 11. **M. Liu**. Harvesting and Mining Big Data for Biomedical Informatics Research. Big Data Symposium, Kansas City, KS, USA, August 25-26, 2015.
- 12. **M. Liu**, Y. Hu. Mining Electronic Medical Records for Adverse Drug Reactions. INFORMS Annual Meeting, Minneapolis, MN, USA, October 8, 2013.
- 13. Y. Hu, **M. Liu**. Integrative approach for intelligent software project risk management: from analysis to planning. INFORMS Annual Meeting, Minneapolis, MN, USA, October 8, 2013.
- 14. **M. Liu.** Mining EMR and Public Databases for Adverse Drug Reaction Detection. Department of Biomedical Informatics, Columbia University, New York City, NY, USA, May 2, 2013.
- 15. **M. Liu**. Technology in Personalized Medicine. Society of Information Management NJ (*SIM-NJ*) University Day, New Jersey Institute of Technology, Newark, NJ, USA, March 14, 2013.
- 16. **M. Liu**, M.E. Matheny, Y. Wu, E.R. McPeek Hinz, J.C. Denny, J.S. Schildcrout, R.A. Miller, H. Xu. Detecting Adverse Drug Reactions using Inpatient Medication Orders and Laboratory Tests Data. *The 2nd IEEE Conference on Healthcare Informatics, Imaging, and Systems Biology* (*HISB'12*), La Jolla, CA, USA, September, 2012.
- 17. M. Liu, Y. Wu, Y. Chen, J. Sun, Z. Zhao, X-W. Chen, H. Xu. Large-scale Prediction of Adverse Drug Reactions by Integrating Chemical, Biological, and Phenotypic Properties of Drugs. AMIA Joint Summits on Translational Science (AMIA-TBI'12), San Francisco, CA, USA, March, 2012.
- 18. **M. Liu**, E.R. McPeek Hinz, J.C. Denny, S. Mani, Y. Chen, J.S. Schildcrout, R.A. Miller, H. Xu. A Feasibility Study in Detection of Adverse Drug Effects using Inpatient Laboratory Test Results. *International Biomedical Informatics Summit*, Beijing, China, June, 2011.
- 19. **M. Liu**, V.K. Kawai, C.M. Stein, D.M. Roden, H. Xu. Determining Drug Exposure Status of Patients in Electronic Medical Records. *NLM Informatics Training Conference*, Bethesda, MD, USA, June, 2011.

- 20. **M. Liu**, V.K. Kawai, C.M. Stein, D.M. Roden, H. Xu. Determining Drug Exposure Status of Patients in Electronic Medical Records. *Westlake Forum III Healthcare Reform in China and US: Similarities, Differences and Challenges*, Atlanta, GA, USA, April, 2011.
- 21. **M. Liu**, E.R. McPeek Hinz, J.C. Denny, S. Mani, Y. Chen, J.S. Schildcrout, R.A. Miller, H. Xu. A Feasibility Study in Detection of Adverse Drug Effects using Inpatient Laboratory Test Results. *10th Annual UT-ORNL-KBRIN Bioinformatics Summit*, Memphis, TN, USA, April, 2011.
- 22. **M. Liu**, V.K. Kawai, C.M. Stein, D.M. Roden, H. Xu. A Framework to Determine Patient Drug Exposure from EMR: an Application to Warfarin. *AMIA Summit on Clinical Research Informatics*, San Francisco, CA, USA, March, 2011.
- 23. **M. Liu**, J.C. Denny, S. Mani, Y. Chen, Y. Hu, and H. Xu. Identifying Potential Drugs that Induce QT Prolongation using Electronic Medical Records. *9th Annual UT-ORNL-KBRIN Bioinformatics Summit*, USA, March, 2010.