

Sandhya Tripathi

Department of Anesthesiology, Washington University School of Medicine, MO 63110
Email: sandhyat@wustl.edu Webpage: sandhyat.github.io

EDUCATION

Indian Institute of Technology Bombay, Mumbai, India

PhD in Operations Research (Machine learning focused) at Industrial Engineering and Operations Research (IEOR) Jul 2014 – Jan 2020

- Research Area: Design and evaluation of loss functions in classification problems.
- Supervisor: Prof. N. Hemachandra
- Teaching Assistant: Data Analytics in Operations Research, Online Machine Learning, Computer Programming & Algorithms (Lab component), Decision Analysis and Game Theory, Engineering Statistics, Optimization Techniques.
- **IEOR Alumnus Endowment: Excellence in Doctoral Dissertation Award (2020-22)**

M.Sc. in Operation Research at IEOR Jul 2012 – Jun 2014

- Research Area: Finance, Regression Analysis, Queuing Theory.
- Supervisor: Prof. N. Hemachandra
- Coursework: Engineering Statistics, Stochastic Processes, Optimization Techniques, Game Theory, Machine Learning, Foundations of Intelligent and Learning Agents, Statistical Techniques in Data Mining.
- Cumulative GPA: 8.96/10 (4.0/4.0 GPA)

Delhi University, Delhi, India

B.Sc. (Honors) in Statistics at Lady Shri Ram College for Women Jul 2009 – Jun 2012

- Cumulative GPA: 84.37% (3.0/4.0 GPA)

EXPERIENCE

Washington University School of Medicine, St. Louis, USA

Post Doctoral Research Scholar at Department of Anesthesiology Feb 2020 – Till Date

Clinical Model Development and Deployment

- Developed solutions for the problem of merging patient medical records from different hospitals or health recording systems using state-of-the-art deep learning techniques.
- Queried large open-source medical dataset MIMIC in *PostgreSQL* for solution's performance demonstration.
- Validated these techniques by implementing self-designed *PyTorch* models on high-performance computing platforms in portable *Docker* containers to demonstrate improvement over existing methods.
- Developed tailor-made code in *R* using statistical techniques to process intra-operative medication data for manual entry or drug unit mismatch errors.
- Designed supervised prediction models for post-surgical complications (such as in-hospital mortality, cardiac arrest etc) in *Python* to inform clinicians of individualized patient risk. Utilized LSTM and attention-based deep networks to process intra-operatively recorded medications and vitals for model deployment using *torch serve*.

Evaluation of clinically deployed models

- Designed risk prediction explanation methods using machine learning interpretability techniques while collaborating with domain expert colleagues on *GitHub*.
- Evaluated the deployed machine learning models that were being used in a telemedicine centre as part of a large randomized control trial for racial, sex-based or age-based discrimination.
- Conducted interviews with the clinicians to understand the impact of AI-generated risk predictions along with explanations on their decisions.

Impact of social vulnerability on surgery outcomes

- Quantified zipcode based social economic status for patients from St Louis area using *GIS* tools.
- Conducted statistical analysis to study the effect of social vulnerability on the post surgical complications.

Indian Institute of Technology Bombay, Mumbai, India

Research Scholar at IEOR Jul 2014 – Jan 2020

Learning in the presence of label/annotation noise

- Designed algorithms to learn in the presence of label noise (due to crowdsourcing or sensor breakdown) in a cost-sensitive (arise in safety-critical systems) binary classification setup.
- When either of the two label classes is corrupted/flipped with the same rate, proposed a modified version of conventional squared loss along with theoretical guarantees and empirically demonstrated its significantly better performance on a variety of real-world datasets.
- When the two label classes are corrupted/flipped with different rates, proposed an adaptation of Generative Adversarial Networks (GANs) that is robust to corrupted real-world MNIST and Fashion-MNIST image datasets.

Scalable classifiers based on exponential loss function

- Developed a theoretical framework using exponential loss for scalable binary classifiers.
- Demonstrated performance improvements in terms of accuracy and time across a large number of varying feature and sample-sized datasets.

Interpretability in classification via Shapley value of a cooperative classification game

- Modelled a novel classification game for explainable & interpretable feature selection.

PUBLICATIONS

- 1) **Tripathi, S.**, Fritz, B. A., Abdelhack, M., Avidan, M. S., Chen, Y., and King, C. R. (2024). Multi-view representation learning for tabular data integration using inter-feature relationships. *Journal of Biomedical Informatics* 2024 Feb 10;151:104602. doi: 10.1016/j.jbi.2024.104602.
- 2) **Tripathi, S.** and King, C.R. (2024). Contrastive learning: Big Data Foundations and Applications. In *Proceedings of the 7th Joint International Conference on Data Science and Management of Data (11th ACM IKDD CODS and 29th COMAD)* (pp. 493-497).
- 3) Abdelhack, M., Zhang, J., **Tripathi, S.**, Fritz, B. A., Avidan, M. S., Chen, Y., and King, C. R. (2023). A Modulation Layer to Increase Neural Network Robustness Against Data Quality Issues, *Transactions on Machine Learning Research*.
- 4) **Tripathi, S.**, Fritz, B. A., Abdelhack, M., Avidan, M. S., Chen, Y., and King, C. R. (2022). Algorithmic bias in machine learning-based delirium prediction. (Extended Abstract) *Machine Learning for Health (ML4H) symposium 2022*, November 28th, 2022, New Orleans, United States.
- 5) Hemachandra, N., Patil, K., and **Tripathi, S.** (2020). Equilibrium points and equilibrium sets of some GI/M/1 queues. *Queueing Systems*, 96(3), 245–284.
- 6) Petety, A., **Tripathi, S.**, and Hemachandra, N. (2020). Attribute noise robust binary classification (Student Abstract). In *Proceedings of the AAAI Conference on Artificial Intelligence* (Vol. 34, pp. 13897–13898).
- 7) **Tripathi, S.**, Hemachandra, N., and Trivedi, P. (2020). Interpretable feature subset selection: A Shapley value based approach. In *IEEE International Conference on Big Data (Big Data)* (pp. 5463–5472). IEEE.
- 8) **Tripathi, S.**, and Hemachandra, N. (2019). Cost sensitive learning in the presence of symmetric label noise. In *Advances in Knowledge Discovery and Data Mining* (pp. 15–28). Springer International Publishing.
- 9) **Tripathi, S.**, and Hemachandra, N. (2018). Scalable linear classifiers based on exponential loss function. In *Proceedings of the ACM India Joint International Conference on Data Science and Management of Data* (pp. 190–200).

COMMUNICATED & WORKING PAPERS

- 1) Abdelhack, M.*, **Tripathi, S.***, Chen, Y., Avidan, M. S., and King, C. R. (2023). Social Vulnerability and Surgery Outcomes: A Cross-sectional Analysis. Preprint. Under Review.
- 2) **Tripathi, S.**, Fritz, B. A., Avidan, M. S., Chen, Y., and King, C. R. (2021a). Clinical model report cards: A transparent approach for model uncertainty and fairness quantification during deployment. Working paper.
- 3) **Tripathi, S.**, Fritz, B. A., Abdelhack, M., Avidan, M. S., Chen, Y., and King, C. R. (2020). (Un) fairness in post-operative complication prediction models. arXiv preprint arXiv:2011.02036.
- 4) **Tripathi, S.**, and Hemachandra, N. (2020). GANs for learning from very high class conditional noisy labels. arXiv preprint arXiv:2010.09577.

PRESENTATIONS & POSTERS

- 1) **IEEE BigData 2020 (Virtual)** Presented our conference paper titled “Interpretable feature subset selection”. Dec 2020.
- 2) **PAKDD 2019, Macau** Presented our conference paper titled “Cost-sensitive learning in the presence of symmetric label noise”. Apr 2019.
- 3) **IRCIN, University of Tokyo** Attended and presented a poster titled “GANs based label noise robust classification” in the Neuro-inspired Computation Course. Mar 2019.
- 4) **CoDS-COMAD 2018, Goa, India** Presented the work titled “Scalable linear classifiers based on exponential loss function” in the Joint International Conference on Data Science and Management of Data. Jan 2018.
- 5) **WINE 2017, IISC Bengaluru, India** Presented poster and lightning talk about the work titled “Shapley Value based Binary Classifiers” at International Conference on Web and Internet Economics. Dec 2017.
- 6) **ECQT 2016, Toulouse** Presented the work titled “Equilibrium sets of some GI/M/1 queues” in European Conference on Queueing Theory. Jul 2016.

- 7) **MLSS 2015, University of Kyoto** Attended and presented a poster titled “Some Equilibrium Prediction Problems in $M/M/1$ Queues” at International Machine Learning Summer School. Aug 2015.

TECHNICAL SKILLS

Programming Skills: Python, Pytorch, AMPL, Docker (Proficient).
Statistical and Simulation Tools: R, SPSS, Anylogic, Scilab, Mathematica (Intermediate).
Databases & Version control: MySQL, PostgreSQL (Beginner), Github.

TEACHING & MENTORING

- 1) Organized and taught a tutorial, ‘Contrastive learning: Big Data Foundations and Applications’ to the researchers from both academia and industry at ACM CODS-COMAD 2024, Bengaluru, India. Jan 2024.
- 2) Conducted a tutorial, ‘Contrastive learning: Big Data Foundations and Applications’ at IEEE BigData 2023, Sorrento, Italy. Dec 2023.
- 3) Jointly mentored a master’s student from the WUSTL-CS program (Shuting Cui) to solve the problem of merging medical records that are structured in a time-dependent way and are very sparse. Jan 2022-Feb 2023
- 4) Organized and taught an online tutorial on ‘Label noise: Problems and solutions’ at IEEE DSAA 2020. Oct 2020.
- 5) Jointly mentored an undergraduate summer student from NISER Bhubaneswar (Aditya Petety) on the problem of learning in the presence of feature noise (sensor failures etc) leading to a student abstract presentation at AAAI 2020. May 2019-Jul 2019
- 6) Teaching Assistantship: Conducted tutorials, designed assignments, and evaluated exams for many courses including Engineering statistics, Optimization techniques, Topics in Machine learning, and Online learning. Jan 2015-May 2018

SHORT RESEARCH PROJECTS

- BB553 Bio-informatics: Course Project under guidance of Prof. P. Bhaumik**
Identification of protein-protein interface residues using ExpERM. Jul 2017 – Nov 2017
 • Explored methods for predicting protein-protein interface residues using both supervised and unsupervised machine learning approaches.
- BB607 Proteomics: Course Project under guidance of Prof. S. Srivastava**
Human Proteome Reference Maps Jul 2017 – Nov 2017
 • Presented a survey of pioneering research papers on human proteome map.
- Master’s Research Projects under guidance of Prof. N. Hemachandra**
Estimating equilibrium point in Admission Control for $M/M/1$ queue May 2014 – Dec 2014
 • Estimated the equilibrium point in a firm market setting without assuming known demand distribution.
- Biased Estimators in Regression Analysis* Jan 2014 – Apr 2014
 • Compared the intercept and non-intercept model and studied the conditions under which the biased estimators (LASSO & Ridge estimator) can be obtained from the general class of estimators.
- Option Pricing Models (Finance)* Jul 2013 – Nov 2013
 • Studied introduction about derivatives and securities and implemented Binomial Pricing Model & Black Scholes Model for Option Pricing.

LANGUAGES

Hindi, English, Japanese, Italian.

ACADEMIC SERVICES

PC member: ECML2020, IEEE BigData’20 Special Track-XAI, IJCAI-21,-22,-23, ML4H-21,-22,-23
 • Top Reviewer Award at ML4H 2021. Given to only 10 out of hundreds of reviewers.

Reviewer: SADHANA IAS journal, Journal of Biomedical Informatics, Neural Networks, Engineering Applications of Artificial Intelligence

NON-ACADEMIC ACHIEVEMENTS

- 1) Participated in ExCELS Program organized by Office of Postdoctoral affairs at Washington University in St Louis. Oct 2022
- 2) Presented with President’s Volunteer Service Award in recognition and appreciation for commitment to Gateway Pet Guardians through volunteer service. Jan 2022
- 3) Member of Indian Youth Delegation to China organized by Government of India. Jun 2016
- 4) Awarded NCC ‘C’ grade senior division certificate. Jun 2011