

Mingming Cai

Mingming's Homepage

Biography

- Ph.D. candidate in Transportation Economics and human-centered AI, with a concurrent M.S. in Statistics from UW.
- Academic journey includes applications of machine learning and deep learning methods in demand forecasting, statistical modeling of human behavior and preference, and big data mining and spatio-temporal network analysis.
- Proficient in Python (5+ years), R (5+ years), and SQL (3+ years), with dedicated experience in software system design using C++ and C# (1+ years), distributed computing using MapReduce and Spark (2+ years), Git (2+ years), and AWS (1+ year).
- · Passionate about state-of-art AI techniques and responsible AI (Interpretability, Fairness, Robustness) to promote human-centered Al products.
- A collaborative person with effective communication and contributions to diverse projects within interdisciplinary teams.

Education

University of Washington

September 2020 - May 2025 (Expected)

Ph.D. in Urban Planning and Economics (GPA: 3.9 / 4.0) - Minor: Machine Learning

Seattle, WA

 Relevant Coursework: Machine Learning for Big Data (Recommendation System, NLP, Social-Network Graph Analysis), Statistical Modeling & Prediction & Computing (TensorFlow, PyTorch), Time Series Analysis, Statistical Analysis of Social Networks

University of Washington

September 2023 - May 2025 (Expected)

M.S. in Statistics (GPA: 3.8 / 4.0) - Minor: Data Science

Seattle, WA

Relevant Coursework: Causal Modeling, Bayesian Statistics, Design and Analysis of Experiments

Wuhan University

September 2017 - June 2020

M.S. in Land Economics and Resources Management (GPA: 3.9 / 4.0) - Minor: Transportation Engineering

Wuhan, China

Relevant Coursework: Python Programming, Database System (SQL), Data Visualization (D3.js), Operational Research

Wuhan University

September 2013 - June 2017

B.E. in Environmental Science & Land Resources Management (GPA: 3.8 / 4.0) - Minor: Computer Science

Wuhan, China

 Relevant Coursework: Advanced Mathematics, Linear Algebra, Probability Theory and Statistics, Database Principles (SQL, Oracle), Programming Language Design (C), Software System Design (C, C++), Microeconomics, Macroeconomics, Data Structures and Algorithms, Systems Programming (C, C++)

Research Projects

Equity Implications of US Suburban and Rural On-Demand Mobility Services Using Explainable ML | Leading Researcher Funded by Teaching Old Models New Tricks (TOMNET) Transportation Center, U.S. Department of Transportation, ongoing

- Employed ML/DL models (XGBoost, LightGBM, Bi-RNNs) to uncover the nonlinear effects of sociodemographics, trip attributes, and the built environment characteristics on the usage of on-demand mobility services.
- Used SHapley Additive exPlanation (SHAP) values to reveal the feature importance for predictions.
- · Introduced bias-mitigation regularization into the models, which reduced the prediction error gap between income groups while making trade-offs in prediction accuracy.

Airbnb Recommender System: NLP-Driven Semantic Information Mining for User Preferences | Leading Researcher Funded by Paul G. Allen School of Computer Science & Engineering, University of Washington, 2023

- Implemented end-to-end sentiment analysis (fine-tuned BERT), topic modeling (developed and fine-tuned BERTopic, LDA), and multi-task learning (using PyTorch) to extract semantic information from millions of user review comments and develop personalized recommendations, countering popularity bias and cold-start problem.
- Efficiently preprocessed large textual data (tokenization, stopwords removal, lemmatization, etc.) by utilizing NLTK & scikit-learn.
- Tuned hyperparameters via coherence analysis and utilized Pyspark and Google Cloud to accelerate the model training process for the large dataset.

Time-series Forecasting of Real Estate Taxes using Deep Learning Techniques | Leading Researcher Funded by National Natural Science Foundation of China, 2017

- Developed time-series prediction models using ARIMA, exponential smoothing models, and <u>recurrent neural networks</u> to forecast real estate tax revenue for Shanghai pilot projects, achieving 72.9% accuracy with RNN and 5%-12% lower with the other models.
- Enhanced data pipeline and feature engineering via variable transformation, missing data imputation, and input standardization.
- Led the research and published research findings in an academic journal.

Work Experience

Data Scientist Intern

Amazon

September 2024 - December 2024

Sunnyvale, CA

- Defined the research problems and designed the scientific solutions for the performance improvement on RAG system in enhancing LLM capabilities of responding to user queries to robotic assistants.
- Applied and extended <u>state-of-art information retrieval techniques</u> to improve RAG system in guiding robot responsive behavior, achieving an increase in Recall@K for context retrieval and a reduction in latency.
- Converted the methodological innovation design into code in Python, tested it independently, and delivered it in collaboration with software engineers.

Data Analyst - Modeling Intern

June 2023 - August 2023

Chicago Metropolitan Agency for Planning

Chicago, IL

- Developed Python scripts for efficient measurement of transit accessibility index, integrating multi-source data inputs.
- Automated model deployment for computing new index values with updated datasets.
- Optimized the EMME <u>auto-routing algorithm</u> and cross-validated it with Google Maps routing, reducing the percentage of highly mismatched routes by 70% and moderately mismatched routes by 45%.
- Visualized the transit accessibility index using R and Tableau, deploying interactive online maps.

Research Scientist Intern - ML Modeling

June 2020 - August 2020

Wuhan Transportation Development Strategy Institute

Wuhan, China

- Implemented <u>Conv-LSTM neural networks</u> to predict citywide dockless bike sharing demand, capturing spatio-temporal dependencies in the demand and improving overall prediction accuracy (MAPE) by 5%-15% compared to ARIMA, LSTM, GRU.
- Developed performance-based <u>stacked tree-based models</u> (XGBoost, LightGBM, CatBoost) to predict ride-hailing travel time using city-scale mobility data, achieving a <u>MAPE of 3%-18%</u> for off-peak and peak predictions.
- Collected open data using web scraping techniques in Python (Beautiful Soup, Scrapy), acquiring real-time data of transit services.

Data Science and Big Data Analytics Intern

June 2018 - August 2018

Wuhan Geomatics Institute

Wuhan, China

- Developed spatio-temporal data mining algorithms to identify short-term and long-term citywide commute behavior patterns using cell phone signaling data, informing government decision-making on transportation investments.
- Enhanced data visualization using Vega and D3.js. Published in the 2019 annual report of the Wuhan Municipal Government.

Certificates & Awards

- 2024 Outstanding PhD Student Award for Academic Achievement and Leadership, University of Washington
- 2022 Special Student Service and Contribution, University of Washington
- 2019 Grand Prize, Geographic Information Science and Technology Innovation Contest, Ministry of Natural Resources of China
- 2018 First-level Scholarships, Wuhan University (Top 5 %)
- 2017 Outstanding Undergraduate Thesis, Department of Education of Hubei Province, China
- 2016 Honorable Mention, Interdisciplinary Contest in Modeling, Consortium for Mathematics and its Applications (COMAP)
- 2015 National Scholarship, Ministry of Education of China (Top 1 %)
- 2014 National Scholarship, Ministry of Education of China (Top 1 %)

Technical Skills

Programming Languages: Python, R, SQL, JavaScript, Html

Python Libraries for ML/DL: PyTorch, TensorFlow, Keras, Scikit-learn, SciPy, Numpy, Pandas, Geopandas

NLP: Scikit-learn, Genism, spaCy, Pyspark MLlib

Statistical Analysis: Time Series Analysis, Causal Inference, Bayesian Inference, Network Analysis, Experiment Design and Analysis

Distributed Computing: Spark, Pyspark, MapReduce, Hive, Yarn Spatial Analysis & Simulation: ArcGIS, QGIS, GeoDa, SUMO, MATSim

Data Visualization: Tableau, Power BI, Vega, D3.js, CSS