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# Summary

Ph.D. student in Computer Science with expertise in Large Language Models (LLMs), Large Multi-modal Models (LMMs), and Trustworthy Machine Learning. Specialized in developing interpretable and reliable Al systems, with extensive experience in foundation model post-training (instruction fine-tuning, PPO/DPO training), multi-modal synthetic data generation, RAG, and foundation model interpretability. Published ML research at top-tier conferences (NeurIPS, WWW, CIKM, AAAI, ECML-PKDD, ICDM, AMIA).

## **Education**

## **University of Georgia**

Ph.D. in Computer Science (Advisor: Ninghao Liu)

Jan 2022 - Present

### **North China Electric Power University**

B.Eng. and M.S. in Renewable Energy Science and Engineering

Sep 2014 - Jun 2021

# **Experience**

### **Harvard Medical School**

Research Intern (Mentor: Xiang Li)

May 2024 - Sept 2024

- Developed MGH Radiology LLM by further pre-training a LLaMA-70B on 6.5M+ radiology reports with DeepSpeed accelerators, achieved 93% improvement in ROUGE compared to original LLaMA model.
- Proposed a RAG system that decomposes complex medical questions into search-engine-friendly synthetic queries for improved retrieval, enhancing LLaMA-8B's accuracy by 11% on USMLE dataset.

# Research Topics

- Large Foundation Model Post-training [arxiv2024a1, arxiv2024a2]:
  - Designed a novel multi-modal data-synthesis pipeline for LLaVA, incorporating rejection sampling
    to generate high-quality interpretable training data, significantly improving the model's expert-level
    visual entity identification and explanation capabilities on benchmarks from multiple domains.
  - Built medical domain-specific LLM using LLaMA-3-70B with ZeRO-3 Offload techniques.
  - o Currently advancing **DPO/KTO** on LLaVA models using model internal states for better alignment.
- Advanced RAG Systems [CIKM2024, AMIA2024]:
  - Proposed a novel RAG system for multi-hop model editing by next fact prediction on a knowledge graph containing over 5 million facts, achieving SOTA performance on the MQUAKE benchmark.
  - o Designed a dense retrieval-based medical RAG, improving 8% in medical QA accuracy with Vicuna.
- Trustworthy AI Framework [NIPS2023, arxiv2024a3, ICDM2023, arxiv2024a4, arxiv2023, AAAI2024]:
  - Designed a backdoor attack defense strategy using zero-shot purification with diffusion models.
  - Developed a novel interpretability framework for VQ-GAN that identifies concept-specific visual token combinations, enabling transparent analysis and targeted image editing capabilities.
  - Proposed a post-hoc explanation framework leveraging foundation models for automated semantic interpretation of neural network neurons, enabling scalable analysis without human intervention.
  - Built interpretation pipelines to explain LLMs and LMMs decisions at token/feature level.
- Graph Self-supervised Learning [CIKM2023, ECML-PKDD2023]:
  - Developed novel GNNs combining contrastive learning with explanation-guided augmentation.
  - Designed generalizable graph masked autoencoder supporting multi-task learning such as node classification/clustering and link prediction tasks.

# Selected Publications (Full List)

Multi-modal Models: [1,2,16]; LLMs: [3, 4, 7, 8, 14]; RAG: [5,6]; Trustworthy AI: [9, 10, 11, 12].

### First-authored and Co-first-authored Papers

- 1. Enhancing Cognition and Explainability of Multimodal Foundation Models with Self-Synthesized Data, [Under Review], 2024
- 2. CORTEX: Concept-Oriented Token Explanation in Vector-Quantized Generative Model, [Under Review], 2024
- 3. MGH Radiology Llama: A Llama 3 70B Model for Radiology, [arXiv], 2024
- 4. Usable Interpretability for Large Language Models, [ICHI], Tutorial, 2024
- 5. Retrieval-enhanced Knowledge Editing for Multi-hop Question Answering in Language Models, [CIKM], 2024
- 6. MKRAG: Medical Knowledge Retrieval Augmented Generation for Medical Question Answering, [AMIA], 2024
- 7. Usable XAI: 10 Strategies Towards Exploiting Explainability in the LLM Era, [Under Review], 2024
- 8. Chatgraph: Interpretable Text Classification by Converting Chatgpt Knowledge to Graphs, [ICDM], workshop, 2023
- 9. Black-box Backdoor Defense via Zero-shot Image Purification, [NeurIPS], 2023
- 10. GiGaMAE: Generalizable Graph Mask Autoencoder via Collaborative Latent Space Reconstruction, [CIKM], 2023
- 11. ENGAGE: Explanation Guided Data Augmentation for Graph Representation Learning, [ECML-PKDD], 2023
- 12. Interpretation of Time-Series Deep Models: A Survey, [Arxiv], 2023
- 13. Expected output calculation based on inverse distance weighting and its application in anomaly detection of distributed photovoltaic power stations, [JCP], 2020

### Other Co-authored Papers

- 14. Could Small Language Models Serve as Recommenders? Towards Data-centric Cold-Start Recommendation, [WWW], 2024
- 15. Leveraging Large Language Models with Chain-of-Thought and Prompt Engineering for Traffic Crash Severity Analysis and Inference, [Computers], 2024
- 16. Automated Natural Language Explanation of Deep Visual Neurons with Large Models, [AAAI], Student Abstract, 2024
- 17. Quantifying Multilingual Performance of Large Language Models Across Languages, [Arxiv], 2024

## **Technical Skills**

- Programming: Python, PyTorch, JAX, Shell Scripting, MySQL.
- LLMs/LMMs Development: Transformers, PEFT, TRL, vLLM, Flash Attention.
- ML Infrastructure: Linux, Git, Docker, Slurm, Distributed Training (DeepSpeed, FSDP, Accelerate).

### Activities

- Talk at Harvard Medical School AlxMed Seminar (Aug 2023).
  - -Topic: LLMs editing with external knowledge graphs for medical QA.
- Talk at Harvard Medical School AlxMed Seminar (Oct 2024).
  - -Topic: Self-synthesized data can help improve cognition and explainability of LMMs.
- Reviewers at top ML conferences and journals (NeurIPS, ICLR, WWW, AISTAT, IEEE TNNLS).

#### Awards

- 370+ citations on Google Scholar.
- NeurIPS 2023 Scholar Award.
- China National Scholarship (2020).
- Pacemaker to Graduate Student (top 0.8%) (2020).
- First-class Scholarships (2019, 2020).