Adeesh Kolluru

Interests. AI for Science and Climate Change, Deep Learning, Graph Neural Networks, Multi-task Learning, Transfer Learning, Diffusion Models, Molecular and Material Discovery, Density Functional Theory.

EDUCATION

Carnegie Mellon University

Pittsburgh, PA

Ph.D. in Chemical Engineering

Aug 2020 - May 2025 (Expected)

Thesis: Towards building foundation models across atomic domains

Advisors: John Kitchin, Zachary Ulissi

Indian Institute of Technology (IIT) Delhi

Delhi, India

B. Tech in Chemical Engineering

August 2016 – July 2020

Thesis: Machine learning for bioprocess control

Advisor: Anurag Rathore

Industry Experience

Machine Learning Research Intern

London, UK (Remote)

Orbital Materials

May 2023 - August 2023

- Worked with the founding team; Mark Neumann (Head of ML), Jonathan Godwin (CEO, Co-founder)
- Worked on developing generative foundation model for material design in the application of porous materials.

Research Intern (AI)

Menlo Park, CA

Meta

May 2022 – August 2022

- Worked with Brandon Wood, Larry Zitnick from Open Catalyst Project team at FAIR, Meta AI.
- Worked on developing a foundation model that works across molecules, materials, and proteins.
- Created graph neural network benchmark for Open Catalyst 2022 Dataset; Paper, Code
- Contributed to developing novel Graph Neural Network for atomic interaction; Paper, Code

Publications

Google Scholar; 8 publications; Citations: 120; h-index: 5; i10-index: 5, * represents equal contribution

From Molecules to Materials: Pre-training Large Generalizable Models for Atomic Property Prediction N Shoghi*, A Kolluru*, J Kitchin, ZW Ulissi, CL Zitnick, BM Wood

Submitted to NeurIPS 2023

Materials cartography: A forward-looking perspective on materials representation and devising better maps SB Torrisi, MZ Bazant, AE Cohen, MG Cho, JS Hummelshøj, L Hung, G Kamat, A Khajeh, A Kolluru, X Lei, et al APL Machine Learning 2023

The Open Catalyst 2022 (OC22) Dataset and Challenges for Oxide Electrocatalysis

R Tran*, J Lan*, M Shuaibi*, BM Wood*, S Goyal*, A Das, J Heras-Domingo, A Kolluru, A Rizvi, N Shoghi, et al ACS Catalusis 2023

Spherical Channels for Modeling Atomic Interactions

CL Zitnick, A Das, **A Kolluru**, J Lan, M Shuaibi, A Sriram, ZW Ulissi, B Wood NeurIPS 2022

Open Challenges in Developing Generalizable Large Scale Machine Learning Models for Catalyst Discovery A Kolluru*, M Shuaibi*, A Palizhati, N Shoghi, A Das, BM Wood, L Zitnick, JR Kitchin, ZW Ulissi ACS Catalysis 2022

Transfer Learning using Attentions across Atomic Systems with Graph Neural Networks (TAAG)

A Kolluru, N Shoghi, M Shuaibi, S Goyal, A. Das, L. Zitnick, ZW Ulissi

The Journal of Chemical Physics 2022

The Open Catalyst Challenge 2021: Competition Report

A Das, M Shuaibi, A Palizhati, S Goyal, A Grover, **A Kolluru**, J Lan, A Rizvi, A Sriram, B Wood, et al NeurIPS 2021 Competitions and Demonstrations Track

Rotation Invariant Graph Neural Network using Spin Convolution

M Shuaibi, A Kolluru, A Das, A Grover, A Sriram, Z Ulissi, CL Zitnick

 $arxiv\ preprint\ 2021$

Fellowships, Awards & Recognitions

Phillips and Huang Family Fellowship in Energy from CMU College of Engineering

Merit Award for being in the Top 7% of Chemical Engineering batch of IIT Delhi

Distinctive Performance in Overall Activities from Chemical Engineering Society, IIT Delhi

Colors Award for being a promising sportsperson of IIT Delhi

KVPY Fellowship: Awarded by Govt. of India for being in the Top 1% in math and science across the country

National Science Talent Search Exam (NSTSE): Awarded gold medal, tablet for securing All India Rank 1

PROJECTS

Foundation model development, multi-task learning and transfer learning

- Developed a novel transfer learning framework using attention framework across different layers of the model that gives improved results on out-of-domain molecular datasets. Paper, Code
- Worked on developing a foundation model using supervised multi-task pretraining and demonstrated state-of-the-art results on datasets across molecules, materials, and proteins.

Developing novel graph neural network architectures for representing atoms

- A novel approach to achieving rotation invariance in a graph neural network by incorporating a per-edge local coordinate frame and a novel spin convolution to effectively model angular information between sets of neighboring atoms in the network's edge messages. Paper, Code
- A graph neural network architecture, for modeling atomic energies and forces, leveraging atom embeddings
 represented by spherical functions (spherical channels) using spherical harmonics, and incorporating rotation of
 embeddings based on 3D edge orientation to enhance information utilization while preserving rotational
 equivariance of messages.

 Paper, Code
- Both models were state-of-the-art methods for predicting atomic energies and forces on large scale OC20 dataset.

Large scale dataset development and benchmarking

- Contributed to developing the Open Catalyst 2022 (OC22) dataset, consisting of 62,331 Density Functional Theory (DFT) relaxations (9M single point calculations) across a range of oxide materials, coverages, and adsorbates.
- We tested baseline performance of several graph neural networks; and provided predefined dataset splits to establish clear benchmarks for future efforts. Paper, Code

SKILLS

Programming: Python, MATLAB, SQL; Frameworks: Kubernetes, AWS, GCP, git

Deep Learning / Data Science: PyTorch, PyTorch Geometric, DGL, Tensorflow, Numpy, Pandas, Scikitlearn

Packages: ASE, VASP, Gromacs, Ansys, Fluent

Professional Activities

Reviewing

NeurIPS 2022-23, Learning on Graphs 2022-23

Talks

Transfer Learning with Large Scale GNNs across Molecular Datasets - AIChE 2021, TRI Workshop 2022 Open Challenges in developing generalizable ML models for material discovery - AIChE 2022

Teaching assistantship

Mathematical Methods of Chemical Engineering - Spring 2021, Spring 2022 Advanced Chemical Engineering Thermodynamics - Fall 2021

Challenge organization

Open Catalyst Challenge - NeurIPS 2021-23

Tutorials

Open Catalyst Project Tutorial - Climate Change with AI workshop - NeurIPS 2021-22

Extra-curricular Activities

- Served as Sports Secretary of the Board for Sports Activities, IIT Delhi
- Captained the Aquatics and Water polo team in Intra-College competitions of IIT Delhi
- Conducted various National debating tournaments as Representative of Debating Club, IIT Delhi
- Volunteered for Humanity Foundation that works for the welfare of visually impaired students