# LINGXIAO ZHAO

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## **EDUCATION**

• Carnegie Mellon University	Pittsburgh, PA, USA
Ph.D. in Machine Learning Joint Public Policy	Aug. 2018 to Now
Advisors: Prof. Leman Akoglu, Prof. Aarti Singh	
• Carnegie Mellon University	Pittsburgh, PA, USA
M.S. in Electrical and Computer Engineering	Aug. 2016 to Dec. 2017
GPA: 3.90/4.00	
• Xi'an Jiaotong University	Xi'an, Shaanxi, China
B.S. in Electrical Engineering	Aug. 2012 to July 2016
GPA: 91.05/100, Rank: 7/370	
VORKING EXPERIENCE	

### WORKING EXPERIENCE

• Reserach Intern at Nvidia Advised by Dr. Haggai Maron.	May 2022 to Aug. 2022
• Reserach Intern at Snap Inc. Advised by Dr. Neil Shah.	May 2021 to Aug. 2021
• Research Intern at IBM Advised by Dr. Charu Aggarwal.	May 2020 to Aug. 2020

## RESEARCH INTEREST

Graph is a powerful representation that captures interactions between identities. GNNs achieve stateof-art performance in a variety of graph-based tasks, while being not well-understood. My work focuses on solving some fundamental problems of GNNs, such as breaking depth-limitation, relaxing homophily requirement, learning better structure, and improving expressiveness.

### **PUBLICATIONS**

#### **Preprint Papers**

1. Sign and Basis Invariant Networks for Spectral Graph Representation Learning, 2022 Derek Lim\*, Joshua Robinson\*, Lingxiao Zhao, Tess Smidit, Suvrit Sra, Haggai Maron, Stefanie Jegelka. (\* equal contribution)

#### **Published Papers**

- 1. A Practical, Progressively-Expressive GNN, 2022 NeurIPS Lingxiao Zhao, Neil Shah, and Leman Akoglu
- 2. Hyperparameter Sensitivity in Deep Outlier Detection: Analysis and a Scalable Hyper-Ensemble Solution, 2022 NeurIPS

Xueying Ding, Lingxiao Zhao, Leman Akoglu

- 3. Graph-level Anomaly Detection with Unsupervised GNNs, 2022 ICDM Lingxiao Zhao, Saurabh Sawlani, Arvind Srinivasan, Leman Akoglu
- 4. Density of States for Fast Embedding Node-Attributed Graphs 2022 Knowledge and Information System Joural Lingxiao Zhao, Saurabh Sawlani, Leman Akoglu
- 5. From Stars to Subgraphs: Uplifting Any GNN with Local Structure Awareness, 2022 ICLR Lingxiao Zhao, Wei Jin, Leman Akoglu, Neil Shah
- 6. Graph Condensation for Graph Neural Networks, 2022 ICLR Wei Jin, Lingxiao Zhao, Shichang Zhang, Yozen Liu, Jiliang Tang, Neil Shah
- 7. On Using Classification Datasets to Evaluate Graph Outlier Detection: Peculiar Observations 2021 Big Data Journal

Lingxiao Zhao, Leman Akoglu

- 8. Fast Attributed Graph Embedding via Density of States , **2021 ICDM** Saurabh Sawlani, **Lingxiao Zhao**, Leman Akoglu
- 9. Graph unrolling networks: Interpretable neural networks for graph signal denoising 2021 IEEE Transactions on Signal Processing Siheng Chen, Yonina C. Eldar, Lingxiao Zhao
- 10. Beyond Homophily in Graph Neural Networks: Limitations and Effective Designs, **2020 NeurIPS**Jiong Zhu, Yujun Yan, **Lingxiao Zhao**, Mark Heimann, Leman Akoglu, Danai Koutra
- 11. Connecting Graph Convolutional Net and Graph-Regularized PCA, **2020 ICML Workshop** Lingxiao Zhao, Leman Akoglu
- 12. PairNorm: Tackling Oversmoothing in GNNs, **2020 ICLR** Lingxiao Zhao, Leman Akoglu
- 13. A Quest for Structure: Jointly Learning Graph and Semi-Supervised Classification, 2018 CIKM Xuan Wu\*, Lingxiao Zhao\*, Leman Akoglu. (\* equal contribution)

#### SELECTED RESEARCH PROJECTS

From Stars to Subgraphs: Uplifting Any GNN

Mar. 2021 to Oct. 2021

Proposed the first general framework to boost expressiveness of any GNN

- Designed a general framework to uplift any GNN, by generalizing MPNN's aggregation field from stars to subgraphs and encoding subgraphs with the (base) GNN.
- Proved the expressiveness is strictly better than 1-WL, while being not less powerful than 3-WL.
- Designed effective and efficient realizations: different encodings and distance-to-centroid feature.
- Designed SubgraphDrop that greatly reduces memory cost and still keeps same performance.

# Tackling oversmoothing problem in $\operatorname{GNNs}$

March 2019 to Sept. 2019

Proposed the first normalization layer in GNNs, with Prof. Leman Akoglu

- Studied oversmoothing thoroughly with SGC, which decouples the effect of oversmoothing on performance drop of increasing layers from overfitting and vanishing gradient problems.
- Proposed an efficient and effective normalization layer, PairNorm, that "pushes" oversmoothed node representations away from each other. PairNorm greatly improves robustness of depth.
- Studied a new setting: Semi-Supervised Learning with large percentage missing feature problem, where PairNorm greatly boost performance for all three types of GNN (SGC,GCN,GAT).

Optimal Graph Learning for Semi-Supervised Learning Sep. 2017 to Feb. 2018 Supervised By Prof. Leman Akoglu, Project Link: https://pg-learn.github.io

- Designed a hyper-loss over validation set measuring task-based "optimal" graph for SSL.
- Proposed an algorithm minimizing the hyper-loss based on hyper-gradient of the graph.
- Boosted the runtime 10x faster by using tensor-form update and efficient sparse operation.
- Paralleled it by incorporating and modifying HyperBand, an adaptive resource allocation alg.

## **HONORS** and **AWARDS**

SIGIR Student Travel Grant for attending CIKM 2018
2<sup>nd</sup> Prize in Challenge Cup (National Innovation Competition)
Outstanding Student Pacesetter (Only 10 students in 3800 undergraduates)
National Scholarship (Rank 4/370 and 5/370, respectively)
Oct. 2015, Oct. 2014

• Outstanding Winner (highest) In MCM/ICM<sup>1</sup> (Only 19 teams (0.19%) worldwide) April. 2014

<sup>&</sup>lt;sup>1</sup>The Mathematical Contest in Modeling/The Interdisciplinary Contest in Modeling: comap.com