



GNN XAI 学习提纲

<https://hustwj.github.io/notes/>

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Papers

XAI papers

- [“Why Should I Trust You?”: Explaining the Predictions of Any Classifier](#), KDD 2016, Marco Tulio Ribeiro et al.
Note: 本文提出的LIME是最经典的XAI post analysis方法。
- [A Unified Approach to Interpreting Model Predictions](#), NIPS 2017, Scott M. Lundberg et al.
Note: 该论文的网页中还列出和对比了其他常见的多种XAI方法，相关论文也请仔细阅读并比较。
- [Beyond Accuracy: Behavioral Testing of NLP models with CheckList](#), ACL 2020, Marco Tulio Ribeiro et al.
Note: LIME作者另一篇XAI论文，获得ACL2020最佳论文。
- [A Survey of the State of Explainable AI for Natural Language Processing](#), AACL 2020
- [Towards better understanding of gradient-based attribution methods for Deep Neural Networks](#), ICLR 2018
- [Learning to Explain: An Information-Theoretic Perspective on Model Interpretation](#), ICML 2018

- [L-Shapley and C-Shapley: Efficient Model Interpretation for Structured Data](#), ICLR 2019

还有几篇NeurIPS2020收录的以及 ICLR2021 submission的论文稍后列出。

Rationale-based XAI papers

- [Rationalizing Neural Predictions](#), EMNLP 2016, Tao Lei et al.
Note: 本文为基于Rationale方法的开山之作。
- [Interpretable Neural Predictions with Differentiable Binary Variables](#), ACL 2019, Jasmijn Bastings, Wilker Aziz, **Ivan Titov**
- [Rationalizing Text Matching: Learning Sparse Alignments via Optimal Transport](#), ACL 2020, Tao Lei et al.
Note: 本文是Tao Lei的另外一篇最新相关论文，所以也列出参阅。
- [How do Decisions Emerge across Layers in Neural Models? Interpretation with Differentiable Masking](#), EMNLP 2020, Nicola De Cao, Michael Sejr Schlichtkrull, Wilker Aziz, **Ivan Titov**
- [Learning to Faithfully Rationalize by Construction](#), ACL 2020, Sarthak Jain et al.
Note: 作者声称是对Tao Lei EMNLP2016论文的改进。
- [Towards Explainable NLP: A Generative Explanation Framework for Text Classification](#), Hui Liu, Qingyu Yin, William Yang Wang
- [Towards Interpretable Natural Language Understanding with Explanations as Latent Variables](#), NeurIPS 2020
- [Interpreting Image Classifiers by Generating Discrete Masks](#), TPAMI 2020, Hao Yuan et al.
Note: 将基于Rationale的方法用于图像，输出hard mask。

GNN XAI Papers

- [GNExplainer: Generating Explanations for Graph Neural Networks](#), NeurIPS 2019, **Rex Ying, Dylan Bourgeois, Jiaxuan You, Marinka Zitnik, Jure Leskovec**
Note: Stanford发的第一篇GNN XAI的论文。
- [XGNN: Towards Model-Level Explanations of Graph Neural Networks](#), KDD 2020, Hao Yuan et al.
Note: TAMU通过生成实现最大化预测值的input graph来解释GNN模型。
- [Multi-Objective Molecule Generation using Interpretable Substructures](#), ICML 2020, **Wengong Jin, Regina Barzilay, Tommi Jaakkola**
Note: MIT新药发现研究
- [Drug discovery with explainable artificial intelligence](#), Nature Machine Intelligence volume 2, pages573–584(2020)
- [A Deep Learning Approach to Antibiotic Discovery](#), Cell 2020
- [Parameterized Explainer for Graph Neural Network](#), NeurIPS 2020, Dongsheng Luo, Wei Cheng, Dongkuan Xu, Wenchao Yu, Bo Zong, Haifeng Chen, Xiang Zhang
- [Hard Masking for Explaining Graph Neural Networks](#), ICLR 2021 Submission
- [Interpreting Graph Neural Networks for NLP With Differentiable Edge Masking](#), ICLR 2021 Submission, Michael Sejr Schlichtkrull, Nicola De Cao, **Ivan Titov**
- [Explainability in Graph Neural Networks: A Taxonomic Survey](#), Group of Prof. Ji, TAMU
- [Interpreting and Unifying Graph Neural Networks with An Optimization Framework](#), Group of Prof. Peng Cui, Tsinghua
- [On Explainability of Graph Neural Networks via Subgraph Explorations](#), Group of Prof. Ji, TAMU

- [CF-GNNExplainer: Counterfactual Explanations for Graph Neural Networks](#)
- [Parameterized Explainer for Graph Neural Network](#), NeurIPS 2020
- [PGM-Explainer: Probabilistic Graphical Model Explanations for Graph Neural Networks](#), NeurIPS 2020

GNN Self-Supervised Learning Papers

- [Graph Self-Supervised Learning: A Survey](#), Group of Prof. Philip S. Yu, UIC
- [Self-Supervised Learning of Graph Neural Networks: A Unified Review](#), Group of Prof. Ji, TAMU
- [Motif-Driven Contrastive Learning of Graph Representations](#), Group of Prof. Yizhou Sun, UCLA

Recent tutorials

XAI tutorials

- [Tutorial on Explaining ML Predictions: State-of-the-art, Challenges, and Opportunities](#), NeurIPS 2020, Himabindu Lakkaraju, Julius Adebayo, Sameer Singh
- [Tutorial on Interpreting Predictions of NLP Models](#), EMNLP 2020, Eric Wallace, Matt Gardner, Sameer Singh
- [Interpretability and Analysis in Neural NLP](#), ACL 2020
- [Interpreting and Explaining Deep Neural Networks: A Perspective on Time Series Data](#), KDD 2020

- [Human-Centered Explainability for Healthcare](#), KDD 2020

GNN tutorials

- [Advanced Deep Graph Learning: Deeper, Faster, Robuster, and Unsupervised](#), KDD 2020
- [Multi-modal Network Representation Learning: Methods and Applications](#), KDD 2020
- [Recent Advances on Graph Analytics and Its Applications in Healthcare](#), KDD 2020
- [Graph Neural Networks: Models and Applications](#), AAAI 2020/2021

GNN for NLP tutorials

- [Graph Neural Networks in NLP](#), CCL2019, Yue Zhang
- [A Tutorial on Graph Neural Networks for Natural Language Processing](#), EMNLP2019

Note: 上面大部分GNN for NLP的方法在后BERT时代都显得过时了。

Resources

Courses on XAI

- [Interpretability and Explainability in Machine Learning](#), COMPSCI 282BR, Harvard University by **Hima Lakkaraju**

Courses on GNN

- [CS224W: Machine Learning with Graphs](#), [Jure Leskovec](#)
- [Machine Learning for Graphs and Sequential Data \(MLGS\)](#), Stephan Günnemann, *TU Munich*

Talks on XAI

- [DARPA's Explainable Artificial Intelligence \(XAI\) Program](#), Dave Gunning
- [Please Stop Doing "Explainable" ML](#), Cynthia Rudin

Talks on GNN

- [AI Cures Drug Discovery Conference](#), MIT

Talk by Lee Hungyi

- [Generation by RL and GAN](#), and - [video](#)

GNN books

- [Deep Learning on Graphs](#), Yao Ma and Jiliang Tang
- [Graph Representation Learning Book](#), William L. Hamilton, McGill University

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