

## **Summary & Future Directions**

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**Tutorial Website:** 



### **Our Roadmap of This Tutorial**



Part III: Text Mining with Structure Information

### Summary: bridging Text data and Graph data

- Leverage the Power of (Large) Language Models to Transform Unstructured Text into Graphs for Knowledge Discovery
- Mining Graphs with LLMs
  - LLM-based Graph Reasoning
  - □ Joint Graph/Text Representation Learning and Generation
- **Text Mining with Structure-information** 
  - Classification/QA/Pretraining with Structured Information
- Still a lot of work to do on the topic of "LLMs on graphs"

### **Future Directions**

#### Better Benchmark Datasets

More diverse datasets from multiple domains are needed (e.g., legal and healthcare).

Text.	Data	Year	Task	# Nodes	# Edges	Domain	Source & Notes
Node	ogb-arxiv ogb-products ogb-papers110M ogb-citation2 Cora Citeseer DBLP MAG Goodreads-books Amazon-items SciDocs PubMed Wikidata5M Twitter	2020.5 2020.5 2020.5 2000 1998 2023.1 2020 2018 2018 2020 2020 2020 2021 2023	NC NC NC LP NC NC, LP NC, LP, Rec RG NC, LP, Rec NC, LP, Rec NC, UAP, LP, Rec NC LP NC, LP	169,343 2,449,029 111,059,956 2,927,963 2,708 3,312 5,259,858 ~ 10M ~ 2M ~ 15.5M - 19,717 ~ 4M 176,279	1,166,243 61,859,140 1,615,685,872 30,561,187 5,429 4,732 36,630,661 ~ 50M ~ 20M ~ 100M - 44,338 ~ 20M 2,373,956	Academic E-commerce Academic Academic Academic Academic Academic Books E-commerce Academic Academic Wikipedia Social	OGB [188] OGB [188] OGB [188] [10] [11] www.aminer.org/citation multiple domains [12] [13] multiple domains [14] multiple domains [15] [51] [16] [17] [53]
Edge	Goodreads-reviews Amazon-reviews Stackoverflow	2018 2018 2023	EC, LP EC, LP EC, LP	~ 3M ~ 15.5M 129,322	$\sim 100 { m M}$ $\sim 200 { m M}$ 281,657	Books E-commerce Social	multiple domains [14] multiple domains [15] [74]

Data collection in Section 5 for text-attributed graphs. Task: "NC", "UAP", "LP", "Rec", "EC", "RG" denote node classification, user activity prediction, link prediction, recommendation, edge classification, and regression task.

### **Future Directions**

Multi-Modal Learning on Graphs with Vision-Language Models

Multi-Modal data (e.g., image, text, audio, etc) are linked as a graph.



Song, et al. How to Bridge the Gap between Modalities: A Comprehensive Survey on Multimodal Large Language Model. Arxiv. 2023.11.

### **Future Directions**

#### □ LLM Agent on Graphs







Graphs as the Environment; LLMs as the agents

### **More Resources and Future Directions**

#### □ A survey paper of LLM & graphs



#### □ A resource repo of LLM & graphs







paper



Jin, et al. Large Language Model on Graphs: A Comprehensive Survey. Arxiv. 2023.12.

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# Thank you ! Q&A

