# NAACL-HLT 2021

# Graph-Based Methods for Natural Language Processing

# **Proceedings of the Fifteenth Workshop**

June 11, 2021

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## Introduction

Welcome to TextGraphs, the Workshop on Graph-Based Methods for Natural Language Processing. The fifteenth edition of our workshop is being organized online on June 11, 2021, in conjunction with the 2021 Annual Conference of the North American Chapter of the Association for Computational Linguistics (NAACL-2021).

The workshops in the TextGraphs series have published and promoted the synergy between the field of Graph Theory (GT) and Natural Language Processing (NLP). The mix between the two started small, with graph theoretical frameworks providing efficient and elegant solutions for NLP applications. Graphbased solutions initially focused on single-document part-of-speech tagging, word sense disambiguation, and semantic role labeling, and became progressively larger to include ontology learning and information extraction from large text collections. Nowadays, graph-based solutions also target on Web-scale applications such as information propagation in social networks, rumor proliferation, e-reputation, multiple entity detection, language dynamics learning, and future events prediction, to name a few.

The target audience comprises researchers working on problems related to either Graph Theory or graphbased algorithms applied to Natural Language Processing, Social Media, and the Semantic Web.

This year, we received 22 submissions and accepted 17 of them for oral presentation (12 long papers and 5 short papers). Similarly to the last year, we organized a shared task on Multi-Hop Inference for Explanation Regeneration. The goal of the task was to provide detailed gold explanations for standardized elementary science exam questions by selecting facts from a knowledge base. This year's shared task on multi-hop explanation regeneration attracted four teams. Three participants' reports along with the shared task overview by its organizers are also presented at the workshop.

We would like to thank our invited speakers Laura Dietz (University of New Hampshire) and Jure Leskovec (Stanford University) for their talks. We are also thankful to the members of the program committee for their valuable and high-quality reviews. All submissions have benefited from their expert feedback. Their timely contribution was the basis for accepting an excellent list of papers and making the fourteenth edition of TextGraphs a success.

Alexander Panchenko, Fragkiskos D. Malliaros, Varvara Logacheva, Abhik Jana, Dmitry Ustalov, Peter Jansen.

TextGraphs-15 Organizers

June 2021

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### **Workshop Program**

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- 11:15-11:30 Break
- 11:30–13:10 Oral Presentation Session 1
- 11:30–11:50 Bootstrapping Large-Scale Fine-Grained Contextual Advertising Classifier from Wikipedia Yiping Jin, Vishakha Kadam and Dittaya Wanvarie
- 11:50–12:10 Modeling Graph Structure via Relative Position for Text Generation from Knowledge Graphs
   Martin Schmitt, Leonardo F. R. Ribeiro, Philipp Dufter, Iryna Gurevych and Hinrich Schütze
- 12:10–12:30 *Entity Prediction in Knowledge Graphs with Joint Embeddings* Matthias Baumgartner, Daniele Dell'Aglio and Abraham Bernstein
- 12:30–12:50 Hierarchical Graph Convolutional Networks for Jointly Resolving Cross-document Coreference of Entity and Event Mentions Duy Phung, Tuan Ngo Nguyen and Thien Huu Nguyen
- 12:50–13:10 *GENE: Global Event Network Embedding* Qi Zeng, Manling Li, Tuan Lai, Heng Ji, Mohit Bansal and Hanghang Tong
- 13:10-13:25 Break

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- 13:45–14:05 *WikiGraphs: A Wikipedia Text Knowledge Graph Paired Dataset* Luyu Wang, Yujia Li, Ozlem Aslan and Oriol Vinyals
- 14:05–14:20 Selective Attention Based Graph Convolutional Networks for Aspect-Level Sentiment Classification
  Xiaochen Hou, Jing Huang, Guangtao Wang, Peng Qi, Xiaodong He and Bowen Zhou
- 14:20–14:45 *Keyword Extraction Using Unsupervised Learning on the Document's Adjacency Matrix* Eirini Papagiannopoulou, Grigorios Tsoumakas and Apostolos Papadopoulos
- 14:45–15:05 *Improving Human Text Simplification with Sentence Fusion* Max Schwarzer, Teerapaun Tanprasert and David Kauchak
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- 15:40–16:40 Invited Talk by Prof. Laura Dietz (University of New Hampshire)
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- 17:20–17:35 *Fine-grained General Entity Typing in German using GermaNet* Sabine Weber and Mark Steedman
- 17:35–17:50 On Geodesic Distances and Contextual Embedding Compression for Text Classification
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- 17:50–18:05 *Semi-Supervised Joint Estimation of Word and Document Readability* Yoshinari Fujinuma and Masato Hagiwara

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