

NAACL HLT 2019

**The 2nd Clinical Natural Language Processing Workshop**

**Proceedings of the Workshop**

June 7, 2019  
Minneapolis, Minnesota, USA

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## Preface

This volume contains papers from the 2nd Workshop on Clinical Natural Language Processing (ClinicalNLP), held at NAACL 2019.

Clinical text offers unique challenges that differentiate it not only from open-domain data, but from other types of text in the biomedical domain as well. Notably, clinical text contains a significant number of abbreviations, medical terms, and other clinical jargon. Clinical narratives are characterized by non-standard document structures that are often critical to overall understanding. Narrative provider notes are designed to communicate with other experts while at the same time serving as a legal record. Finally, clinical notes contain sensitive patient-specific information that raise privacy and security concerns that present special challenges for natural language systems. This workshop focuses on the work that develops methods to address the above challenges, with the goal to advance state-of-the-art in clinical NLP.

This year, we received the total of 28 submissions, out of which 10 were accepted as oral presentations and 10 as posters.



**Organizers:**

Anna Rumshisky, UMass Lowell  
Kirk Roberts, University of Texas Health Science Center at Houston  
Steven Bethard, University of Arizona  
Tristan Naumann, Microsoft Research

**Program Committee:**

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Karin Verspoor, The University of Melbourne  
Byron Wallace, Northeastern University  
Ben Wellner, The MITRE Corporation  
Jenna Wiens, University of Michigan  
Stephen Wu, University of Texas Health Science Center at Houston

**Invited Speaker:**

Heng Ji, University of Illinois at Urbana-Champaign

**Invited Panelists:**

Hongfang Liu, Mayo Clinic  
Piet de Groen, University of Minnesota  
Elmer Bernstam, University of Texas Health Science Center at Houston



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# Conference Program

## Friday, June 7, 2019

09:00–09:15 *Opening remarks*

09:15–10:30 *Invited speaker: Heng Ji*

10:30–11:20 *Coffee break*

### 11:20–12:30 *Oral session 1*

11:20–11:40 *Effective Feature Representation for Clinical Text Concept Extraction*  
Yifeng Tao, Bruno Godefroy, Guillaume Genthial and Christopher Potts

11:40–11:55 *An Analysis of Attention over Clinical Notes for Predictive Tasks*  
Sarthak Jain, Ramin Mohammadi and Byron C. Wallace

11:55–12:10 *Extracting Adverse Drug Event Information with Minimal Engineering*  
Timothy Miller, Alon Geva and Dmitriy Dligach

12:10–12:25 *Hierarchical Nested Named Entity Recognition*  
Zita Marinho, Afonso Mendes, Sebastião Miranda and David Nogueira

12:30–14:00 *Lunch*

### 14:00–15:30 *Oral session 2*

14:00–14:20 *Towards Automatic Generation of Shareable Synthetic Clinical Notes Using Neural Language Models*  
Oren Melamud and Chaitanya Shivade

14:20–14:40 *A Novel System for Extractive Clinical Note Summarization using EHR Data*  
Jennifer Liang and Ching-Huei Tsou

**Friday, June 7, 2019 (continued)**

14:40–14:55 *Study of lexical aspect in the French medical language. Development of a lexical resource*  
Agathe Pierson and Cédric Fairon

14:55–15:10 *A BERT-based Universal Model for Both Within- and Cross-sentence Clinical Temporal Relation Extraction*  
Chen Lin, Timothy Miller, Dmitriy Dligach, Steven Bethard and Guergana Savova

15:10–15:25 *Publicly Available Clinical BERT Embeddings*  
Emily Alsentzer, John Murphy, William Boag, Wei-Hung Weng, Di Jindi, Tristan Naumann and Matthew McDermott

15:30–16:00 *Coffee break*

**16:00–16:45 *Poster session***

*A General-Purpose Annotation Model for Knowledge Discovery: Case Study in Spanish Clinical Text*  
Alejandro Piad-Morffis, Yoan Guitérrez, Suilan Estevez-Velarde and Rafael Muñoz

*Predicting ICU transfers using text messages between nurses and doctors*  
Faiza Khan Khattak, Chloe Pou-Prom, Robert Wu and Frank Rudzicz

*Medical Entity Linking using Triplet Network*  
Ishani Mondal, Sukannya Purkayastha, Sudeshna Sarkar, Pawan Goyal, Jitesh Pillai, Amitava Bhattacharyya and Mahanandeeshwar Gattu

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*Attention Neural Model for Temporal Relation Extraction*

Sijia Liu, Liwei Wang, Vipin Chaudhary and Hongfang Liu

*Automatically Generating Psychiatric Case Notes From Digital Transcripts of Doctor-Patient Conversations*

Nazmul Kazi and Indika Kahanda

*Clinical Data Classification using Conditional Random Fields and Neural Parsing for Morphologically Rich Languages*

Razieh Ehsani, Tyko Niemi, Gaurav Khullar and Tiina Leivo

16:45–17:30 *Panel discussion: NLP vs. structured data in the clinical domain (with panelists: Hongfang Liu, Piet de Groen, Elmer Bernstam)*

17:30–17:45 *Closing remarks*

