

NAACL HLT 2019

**Structured Prediction for NLP**

**Proceedings of the Third Workshop**

June 7, 2019  
Minneapolis, Minnesota, USA

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209 N. Eighth Street  
Stroudsburg, PA 18360  
USA  
Tel: +1-570-476-8006  
Fax: +1-570-476-0860  
[acl@aclweb.org](mailto:acl@aclweb.org)

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## Introduction

Welcome to the Third Workshop on Structured Prediction for NLP!

Structured prediction has a strong tradition within the natural language processing (NLP) community, owing to the discrete, compositional nature of words and sentences, which leads to natural combinatorial representations such as trees, sequences, segments, or alignments, among others. It is no surprise that structured output models have been successful and popular in NLP applications since their inception. Many other NLP tasks, including, but not limited to: semantic parsing, slot filling, machine translation, or information extraction, are commonly modeled as structured problems, and accounting for said structure has often lead to performance gain.

Of late, continuous representation learning via neural networks has been a significant complementary direction, leading to improvements in unsupervised and semi-supervised pre-training, transfer learning, domain adaptation, *etc.* Using word embeddings as features for structured models such as part-of-speech taggers count among the very first uses of continuous embeddings in NLP, and the symbiosis between the two approaches is an exciting research direction today.

The five papers (as well as three additional non-archival papers) accepted for presentation in this edition of the workshop, after double-blind peer review, all explore this interplay between structure and neural data representations, from different, important points of view. The program includes work on structure-informed representation learning, transfer learning, partial supervision, and parallelization of computation in structured computation graphs. Our program also includes six invited presentations from influential researchers.

Our warmest thanks go to the program committee – for their time and effort providing valuable feedback, to all submitting authors – for their thought-provoking work, and to the invited speakers – for doing us the honor of joining our program. We are looking forward to seeing you in Minneapolis!

Zornitsa Kozareva  
Julia Kreutzer  
Gerasimos Lampouras  
André Martins  
Vlad Niculae  
Sujith Ravi  
Andreas Vlachos



**Organizers:**

Zornitsa Kozareva, Google, USA  
Julia Kreutzer, Heidelberg University, Germany  
Gerasimos Lampouras, University of Cambridge, UK  
André F.T. Martins, Unbabel & University of Lisbon, Portugal  
Vlad Niculae, University of Lisbon, Portugal  
Sujith Ravi, Google, USA  
Andreas Vlachos, University of Cambridge, UK

**Program Committee:**

Yoav Artzi, Cornell University, USA  
Wilker Aziz, University of Amsterdam, Netherlands  
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Ivan Titov, University of Edinburgh, Scotland  
Luke Zettlemoyer, University of Washington, USA

**Invited Speakers:**

Claire Cardie, Cornell University, USA  
Chris Dyer, DeepMind, UK  
Jason Eisner, Johns Hopkins University, USA  
Hannaneh Hajishirzi, University of Washington, USA  
He He, Stanford University, USA  
Andrew McCallum, University of Massachusetts Amherst, USA



## Table of Contents

<i>Parallelizable Stack Long Short-Term Memory</i>	
Shuoyang Ding and Philipp Koehn .....	1
<i>Tracking Discrete and Continuous Entity State for Process Understanding</i>	
Aditya Gupta and Greg Durrett .....	7
<i>SPARSE: Structured Prediction using Argument-Relative Structured Encoding</i>	
Rishi Bommasani, Arzoo Katiyar and Claire Cardie .....	13
<i>Lightly-supervised Representation Learning with Global Interpretability</i>	
Andrew Zupon, Maria Alexeeva, Marco Valenzuela-Escárcega, Ajay Nagesh and Mihai Surdeanu .....	18
<i>Semi-Supervised Teacher-Student Architecture for Relation Extraction</i>	
Fan Luo, Ajay Nagesh, Rebecca Sharp and Mihai Surdeanu .....	29





# Workshop Program

**Friday, June 7, 2019**

**9:00–9:10**     *Opening Remarks*

9:10–9:50     *Invited Talk: Andrew McCallum*

9:50–10:30   *Invited Talk: Hannaneh Hajishirzi*

**10:30–11:00**   *Coffee Break*

11:00–11:40   *Invited Talk by He He*

**11:40–12:10**   *Session 1: Contributed Talks*

11:40–11:55   *Parallelizable Stack Long Short-Term Memory*  
Shuoyang Ding and Philipp Koehn

11:55–12:10   *Tracking Discrete and Continuous Entity State for Process Understanding*  
Aditya Gupta and Greg Durrett

**12:10–14:00**   *Lunch*

14:00–14:40   *Invited Talk: Chris Dyer*

**14:40–15:00**   *Poster Spotlight*

**15:00–16:00**   *Poster Session (and non-archival papers)*

*SPARSE: Structured Prediction using Argument-Relative Structured Encoding*  
Rishi Bommasani, Arzoo Katiyar and Claire Cardie

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

*Lightly-supervised Representation Learning with Global Interpretability*

Andrew Zupon, Maria Alexeeva, Marco Valenzuela-Escárcega, Ajay Nagesh and Mihai Surdeanu

*Semi-Supervised Teacher-Student Architecture for Relation Extraction*

Fan Luo, Ajay Nagesh, Rebecca Sharp and Mihai Surdeanu

**15:30–16:00** *Coffee Break (With Posters)*

16:00–16:40 *Invited Talk: Claire Cardie*

16:40–17:20 *Invited Talk: Jason Eisner*