# LSDSem 2017

# **2nd Workshop on Linking Models of Lexical, Sentential and Discourse-level Semantics**

**Proceedings of the Workshop** 

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#### Introduction

Welcome to the 2nd Workshop on Linking Models of Lexical, Sentential and Discourse-level Semantics.

This workshop takes place for the second time, with the goal of gathering and showcasing theoretical and computational approaches to joint models of semantics, and applications that incorporate multi-level semantics. Improved computational models of semantics hold great promise for applications in language technology, be it semantics at the lexical level, sentence level or discourse level. This year we have an additional focus on the comprehensive understanding of narrative structure in language. Recently a range of tasks have been proposed in the area of learning and applying commonsense/procedural knowledge. Such tasks include, for example, learning prototypical event sequences and event participants, modeling the plot structure of novels, and resolving anaphora in Winograd schemas.

This year's workshop further includes a shared task, the Story Cloze Test—a new evaluation for story understanding and script learning. This test provides a system with a four-sentence story and two possible endings, and the system must choose the correct ending to the story. Successful narrative understanding (getting closer to human performance of 100%) requires systems to link various levels of semantics to commonsense knowledge. A total of eight systems participated in the shared task, with a variety of approaches including end-to-end neural networks, feature-based regression models, and rule-based methods. The highest performing system achieves an accuracy of 75.2%, a substantial improvement over the previous state-of-the-art of 58.5%.

We received 19 papers in total, out of which we accepted 13. These papers are presented as talks at the workshop as well as in a poster session. In addition, the workshop program features talks from two invited speakers who work on different aspects of semantics. The day will end with a discussion session where invited speakers and workshop participants further discuss the insights gained during the workshop.

Our program committee consisted of 23 researchers who provided constructive and thoughtful reviews. This workshop would not have been possible without their hard work. Many thanks to you all. Finally, a huge thank you to all the authors who submitted papers to this workshop and made it a big success.

Michael, Nasrin, Nate, and Annie

### **Organizers:**

Michael Roth, University of Illinois and Saarland University Nasrin Mostafazadeh, University of Rochester Nate Chambers, United States Naval Academy Annie Louis, University of Essex

#### **Program Committee:**

Omri Abend, The Hebrew University of Jerusalem Tim Baldwin, University of Melbourne Johan Bos, University of Groningen Ido Dagan, Bar Ilan University Vera Demberg, Saarland University Katrin Erk, University of Texas at Austin Anette Frank, Heidelberg University Aurelie Herbelot, University of Trento Graeme Hirst, University of Toronto Sebastian Martschat, Heidelberg University Philippe Muller, Toulouse University Beata Beigman Klebanov, Educational Testing Service Hwee Tou Ng, National University of Singapore Vincent Ng, University of Texas at Dallas Jan Snajder, University of Zagreb Swapna Somasundaran, Educational Testing Service Caroline Sporleder, Göttingen University Christian Stab, Technische Universität Darmstadt Manfred Stede, University of Potsdam Joel Tetreault, Grammarly Lucy Vanderwende, Microsoft Research Luke Zettlemoyer, University of Washington Heike Zinsmeister, Universität Hamburg

#### **Invited Speakers:**

Johan Bos, University of Groningen Hannah Rohde, University of Edinburgh

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# **Conference Program**

## Monday, April 3, 2017

09:30-11:00	Morning Session
9:30–9:40	Introduction Michael Roth
9:40–10:40	Invited talk: Integrating Lexical and Discourse Semantics in the Parallel Meaning Bank Johan Bos
10:40–11:00	Inducing Script Structure from Crowdsourced Event Descriptions via Semi- Supervised Clustering Lilian Wanzare, Alessandra Zarcone, Stefan Thater and Manfred Pinkal
11:00-11:30	Coffee break
11:30-12:40	Pre-lunch Session
11:30–11:50	A Consolidated Open Knowledge Representation for Multiple Texts  Rachel Wities, Vered Shwartz, Gabriel Stanovsky, Meni Adler, Ori Shapira, Shyam Upadhyay, Dan Roth, Eugenio Martínez-Cámara, Iryna Gurevych and Ido Dagan
11:50–12:05	Event-Related Features in Feedforward Neural Networks Contribute to Identifying Causal Relations in Discourse Edoardo Maria Ponti and Anna Korhonen
12:05–12:25	Stance Detection in Facebook Posts of a German Right-wing Party Manfred Klenner, Don Tuggener and Simon Clematide
12:25–12:40	Behind the Scenes of an Evolving Event Cloze Test Nathanael Chambers
12:40-14:30	Lunch Break

## Monday, April 3, 2017 (continued)

16:00–16:30 Coffee Break

14:30–15:30	Post-lunch Session
14:30–14:45	LSDSem 2017 Shared Task: The Story Cloze Test Nasrin Mostafazadeh, Michael Roth, Annie Louis, Nathanael Chambers and James Allen
14:45–15:00	Story Cloze Task: UW NLP System Roy Schwartz, Maarten Sap, Ioannis Konstas, Leila Zilles, Yejin Choi and Noah A. Smith
15:00–15:15	LSDSem 2017: Exploring Data Generation Methods for the Story Cloze Test Michael Bugert, Yevgeniy Puzikov, Andreas Rücklé, Judith Eckle-Kohler, Teresa Martin, Eugenio Martínez-Cámara, Daniil Sorokin, Maxime Peyrard and Iryna Gurevych
15:15–15:30	Sentiment Analysis and Lexical Cohesion for the Story Cloze Task Michael Flor and Swapna Somasundaran
15:30–16:30	Poster Session (all papers)
15:30–16:30	Resource-Lean Modeling of Coherence in Commonsense Stories Niko Schenk and Christian Chiarcos
15:30–16:30	An RNN-based Binary Classifier for the Story Cloze Test Melissa Roemmele, Sosuke Kobayashi, Naoya Inoue and Andrew Gordon
15:30–16:30	IIT (BHU): System Description for LSDSem'17 Shared Task Pranav Goel and Anil Kumar Singh
15:30–16:30	Story Cloze Ending Selection Baselines and Data Examination Todor Mihaylov and Anette Frank

## Monday, April 3, 2017 (continued)

## 16:30-18:00 Afternoon Session

16:30–17:30 Invited talk: Using Story Continuations to Model Discourse Expectations Hannah Rohde

## 17:30–18:00 *Open Discussion*