

ACL 2019

**Deep Learning and Formal Languages: Building Bridges**

**Proceedings of the Workshop**

August 2, 2019  
Florence, Italy

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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

While deep learning and neural networks have revolutionized the field of natural language processing, changed the habits of its practitioners and opened up new research directions, many aspects of the inner workings of deep neural networks remain unknown.

At the same time, we have access to many decades of accumulated knowledge on formal languages, grammar, and transductions, both weighted and unweighted and for strings as well as trees: closure properties, computational complexity of various operations, relationships between various classes of them, and many empirical and theoretical results on their learnability.

The goal of this workshop is to bring researchers together who are interested in how our understanding of formal languages can contribute to the understanding and design of neural network architectures for natural language processing.

All 7 accepted papers and non-archival extended abstracts explore those connections. They do this either by using results from formal languages to improve neural methods or by trying to understand better neural methods through well-studied characteristics from formal languages. Finding such bridges is also the main point of the 6 invited talks.

We would like to thank the authors and specially the programme committee for the timely and insightful reviews. We are looking forward of seeing you in Florence!

The workshop organizers:

Jason Eisner, Matthias Gallé, Jeffrey Heinz, Ariadna Quattoni, Guillaume Rabusseau



**Organizers:**

Jason Eisner, Johns Hopkins University  
Matthias Gallé, Naver Labs Europe  
Jeffrey Heinz, Stony Brook University  
Ariadna Quattoni, dMetrics  
Guillaume Rabusseau, Université de Montréal / Mila

**Program Committee:**

Raphael Bailly, Université Paris 1  
Borja Balle, Amazon  
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John Hale, University of Georgia  
Mans Hulden, University of Colorado  
Franco Luque, University of Córdoba  
Chihiro Shibata, Tokyo University of Technology  
Adina Williams, FAIR

**Invited Speaker:**

Rémi Eyraud, Aix-Marseilles University  
Robert Frank, Yale University  
John Kelleher, Technological University Dublin  
Kevin Knight, Didi  
Ariadna Quattoni, dMetrics  
Noah Smith, University of Washington / Allen Institute for Artificial Intelligence



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# Conference Program

## Friday, August, 2nd 2019

- 9:00-9:05 **Opening Remarks**
- 9:05-9:45 **Invited Talk:** *Do Simpler Automata Learn Better?*  
Kevin Knight
- 9:45-9:51 **Poster Spotlights:**  
*Sequential Neural Networks as Automata*  
William Merrill  
*Grammatical Sequence Prediction for Real-Time Neural Semantic Parsing*  
Chunyang Xiao, Christoph Teichmann and Konstantine Arkoudas  
*Siamese recurrent networks can learn first-order logic reasoning and exhibit zero-shot generalization*  
Mathijs Mul and Willem Zuidema
- 9:51-10:30 **Invited Talk:** *A story about weighted automata (WFAs), RNNs and low-rank Hankel Matrices*  
Ariadna Quattoni
- 10:30-11:00 **Break**
- 11:00-11:40 **Invited Talk:** *Distilling computational models from Recurrent Neural Networks*  
Remi Eyraud
- 11:40-11:45 **Poster Spotlights:**  
*CYK Parsing over Distributed Representations*  
Fabio Massimo Zanzotto, Giordano Cristini and Giorgio Satta  
*Relating RNN layers with the spectral WFA ranks in sequence modelling*  
Farhana Ferdousi Liza and Marek Grzes
- 11:45-12:25 **Invited Talk:** *Using formal grammars to test ability of recurrent neural networks to model long-distance dependencies in sequential data*  
John Kelleher
- 12:25-13:30 **Poster Spotlights:**  
*Using SPk Languages to Explore the Characteristics of Long-Distance Dependencies*  
Abhijit Mahalunkar and John Kelleher  
*LSTM Networks Can Perform Dynamic Counting*  
Mirac Suzgun, Yonatan Belinkov, Stuart Shieber and Sebastian Gehrmann
- 12:30-14:00 **Lunch**
- 14:00-15:30 **Poster Session**
- 15:30-16:00 **Break**
- 16:00-16:40 **Invited Talk:** *Beyond testing and acceptance: On the study of formal and natural languages in neural networks*  
Robert Frank
- 16:40-17:20 **Invited Talk:** *Rational Recurrences for Empirical Natural Language Processing*  
Noah Smith
- 17:20-17:30 **Closing Discussion**

