

EMNLP-IJCNLP 2019

**Deep Learning Approaches for  
Low-Resource Natural Language Processing  
(DeepLo)**

**Proceedings of the Second Workshop**

November 3, 2019  
Hong Kong, China

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## Introduction

The EMNLP-IJCNLP 2019 Workshop on Deep Learning Approaches for Low-Resource Natural Language Processing (DeepLo) takes place on Sunday, November 3rd, in Hong Kong, China, immediately before the main conference.

Natural Language Processing is being revolutionized by deep learning with neural networks. However, deep learning requires large amounts of annotated data, and its advantage over traditional statistical methods typically diminishes when such data is not available; for example, SMT continues to outperform NMT in many bilingually resource-poor scenarios. Large amounts of annotated data do not exist for many low-resource languages, and for high-resource languages it can be difficult to find linguistically annotated data of sufficient size and quality to allow neural methods to excel. Our workshop aimed to bring together researchers from the NLP and ML communities who work on learning with neural methods when there is not enough data for those methods to succeed out-of-the-box. Techniques of interest include self-training, paired training, distant supervision, semi-supervised and transfer learning, and human-in-the-loop algorithms such as active learning.

Our call for papers for this second workshop met with a strong response. We received 85 paper submissions, of which 10 were “extended abstracts” with non-archival status—work that will be presented at the workshop, but will not appear in the proceedings in order to allow it to be published elsewhere. We accepted 32 papers and 7 extended abstracts.

Our program covers a broad spectrum of applications and techniques. It is augmented by invited talks from Heng Ji, Barbara Plank, Dan Roth, Kristina Toutanova, and Luke Zettlemoyer.

We would like to thank the members of our Program Committee for their timely and thoughtful reviews.

*Colin Cherry, Greg Durrett, George Foster, Reza Haffari, Shahram Khadivi, Nanyun Peng, Xiang Ren, and Swabha Swayamdipta*



**Organizers:**

Colin Cherry, Google  
Greg Durrett, University of Texas, Austin  
George Foster, Google  
Gholamreza (Reza) Haffari, Monash University  
Shahram Khadivi, eBay  
Nanyun Peng, University of Southern California  
Xiang Ren, University of Southern California  
Swabha Swayamdipta, Allen Institute for Artificial Intelligence

**Invited Speakers:**

Heng Ji, University of Illinois Urbana-Champaign  
Barbara Plank, IT University of Copenhagen  
Dan Roth, University of Pennsylvania  
Kristina Toutanova, Google AI Language  
Luke Zettlemoyer, University of Washington / Facebook AI Research

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Parnia Bahar	



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# Conference Program

Sunday, November 3, 2019

7:30–8:50 *Breakfast*

8:50–9:00 *Opening Remarks*

9:00–9:45 *Invited Talk 1: Heng Ji*

9:45–10:30 **Poster Session 1**

*A Closer Look At Feature Space Data Augmentation For Few-Shot Intent Classification*

Varun Kumar, Hadrien Glaude, Cyprien de Lichy and William Campbell

*A Comparative Analysis of Unsupervised Language Adaptation Methods*

Gil Rocha and Henrique Lopes Cardoso

*A logical-based corpus for cross-lingual evaluation*

Felipe Salvatore, Marcelo Finger and Roberto Hirata Jr

*Adaptively Scheduled Multitask Learning: The Case of Low-Resource Neural Machine Translation*

Poorya Zareemoodi and Gholamreza Haffari

*Bad Form: Comparing Context-Based and Form-Based Few-Shot Learning in Distributional Semantic Models*

Jeroen Van Hautte, Guy Emerson and Marek Rei

*Bag-of-Words Transfer: Non-Contextual Techniques for Multi-Task Learning*

Seth Ebner, Felicity Wang and Benjamin Van Durme

*BERT is Not an Interlingua and the Bias of Tokenization*

Jasdeep Singh, Bryan McCann, Richard Socher and Caiming Xiong

*Building Bilingual Pre-trained Models In A Day*

Ke Tran

**Sunday, November 3, 2019 (continued)**

*Byte-Pair encoding for text-to-SQL generation*

Samuel Müller and Andreas Vlachos

*Cross-lingual Joint Entity and Word Embedding to Improve Entity Linking and Parallel Sentence Mining*

Xiaoman Pan, Thamme Gowda, Heng Ji, Jonathan May and Scott Miller

*Deep Bidirectional Transformers for Relation Extraction without Supervision*

Yannis Papanikolaou, Ian Roberts and Andrea Pierleoni

*Domain Adaptation with BERT-based Domain Classification and Data Selection*

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Avik Ray, Yilin Shen and Hongxia Jin

*Few-Shot and Zero-Shot Learning for Historical Text Normalization*

Marcel Bollmann, Natalia Korchagina and Anders Søgaard

*From Monolingual to Multilingual FAQ Assistant using Multilingual Co-training*

Mayur Patidar, Surabhi Kumari, Manasi Patwardhan, Shirish Karande, Puneet Agarwal, Lovekesh Vig and Gautam Shroff

*Generation-Distillation for Efficient Natural Language Understanding in Low-Data Settings*

Luke Melas-Kyriazi, George Han and Celine Liang

*H-FND: Hierarchical False-Negative Denoising for Robust Distantly-Supervised Relation Extraction*

Tsu-Jui Fu and Wei-Yun Ma

**10:30–11:00** *Break*

**11:00–11:45** *Invited Talk 2: Barbara Plank*

**Sunday, November 3, 2019 (continued)**

**11:45–12:30 Contributed Talks**

11:45–12:00 *Unlearn Dataset Bias in Natural Language Inference by Fitting the Residual*

He He, Sheng Zha and Haohan Wang

12:00–12:15 *Metric Learning for Dynamic Text Classification*

Jeremy Wohlwend, Ethan R. Elenberg, Sam Altschul, Shawn Henry and Tao Lei

12:15–12:30 *Evaluating Lottery Tickets Under Distributional Shifts*

Shrey Desai, Hongyuan Zhan and Ahmed Aly

**12:30–14:00 Lunch Break**

**14:00–14:45 Invited Talk 3: Dan Roth**

**14:45–15:30 Poster Session 2**

*Cross-lingual Parsing with Polyglot Training and Multi-treebank Learning: A Faroese Case Study*

James Barry, Joachim Wagner and Jennifer Foster

*Inject Rubrics into Short Answer Grading System*

Tianqi Wang, Naoya Inoue, Hiroki Ouchi, Tomoya Mizumoto and Kentaro Inui

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*Natural Language Generation for Effective Knowledge Distillation*

Raphael Tang, Yao Lu and Jimmy Lin

**Sunday, November 3, 2019 (continued)**

*Neural Rule Grounding for Low-Resource Relation Extraction*

Wenxuan Zhou, Hongtao Lin, Ziqi Wang, Leonardo Neves and Xiang Ren

*Neural Unsupervised Parsing Beyond English*

Katharina Kann, Anhad Mohananeey, Samuel R. Bowman and Kyunghyun Cho

*Pseudolikelihood Reranking with Masked Language Models*

Julian Salazar, Davis Liang, Toan Q. Nguyen and Katrin Kirchhoff

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*XLDA: Cross-Lingual Data Augmentation for Natural Language Inference and Question Answering*

Jasdeep Singh, Bryan McCann, Nitish Shirish Keskar, Richard Socher and Caiming Xiong

*Zero-Shot Cross-lingual Name Retrieval for Low-Resource Languages*

Kevin Blissett and Heng Ji

**Sunday, November 3, 2019 (continued)**

*Zero-shot Dependency Parsing with Pre-trained Multilingual Sentence Representations*

Ke Tran and Arianna Bisazza

**15:30–16:00** *Break*

**16:00–16:45** *Invited Talk 4: Kristina Toutanova*

**16:45–17:30** *Invited Talk 5: Luke Zettlemoyer*

**17:30–17:40** *Closing Remarks*

