## ACL 2016

# The 54th Annual Meeting of the Association for Computational Linguistics

**Proceedings of the 1st Workshop on Representation Learning for NLP** 

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### Introduction

Welcome to the 1st Workshop on Representation Learning for NLP (RepL4NLP), held on August 11, 2016 and hosted by the 54th Annual Meeting of the Association for Computational Linguistics (ACL) in Berlin, Germany. The workshop is sponsored by DeepMind, Facebook AI Research, and Microsoft Research.

Representation Learning for NLP aims to continue the spirit of previously successful workshops at ACL/NAACL/EACL, namely VSM at NAACL'15 and CVSC at ACL'13/EACL'14/ACL'15, which focussed on vector space models of meaning, compositionality, and the application of deep neural networks and spectral methods to NLP. It provides a forum for discussing recent advances on these topics, as well as future research directions in linguistically motivated vector-based models in NLP.

#### **Organizers:**

Phil Blunsom, DeepMind and Oxford University Kyunghyun Cho, New York University Shay Cohen, University of Edinburgh Edward Grefenstette, DeepMind Karl Moritz Hermann, DeepMind Laura Rimell, University of Cambridge Jason Weston, Facebook Scott Yih, Microsoft

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# **Table of Contents**

Leila Arras, Franziska Horn, Grégoire Montavon, Klaus-Robert Müller and Wojciech Samek 1
Joint Learning of Sentence Embeddings for Relevance and Entailment Petr Baudiš, Silvestr Stanko and Jan Šedivý
A Joint Model for Word Embedding and Word Morphology  Kris Cao and Marek Rei
On the Compositionality and Semantic Interpretation of English Noun Compounds  Corina Dima
Functional Distributional Semantics Guy Emerson and Ann Copestake
Assisting Discussion Forum Users using Deep Recurrent Neural Networks  Jacob Hagstedt P Suorra and Olof Mogren
Adjusting Word Embeddings with Semantic Intensity Orders  Joo-Kyung Kim, Marie-Catherine de Marneffe and Eric Fosler-Lussier
Towards Abstraction from Extraction: Multiple Timescale Gated Recurrent Unit for Summarization  Minsoo Kim, Dennis Singh Moirangthem and Minho Lee
An Empirical Evaluation of doc2vec with Practical Insights into Document Embedding Generation  Jey Han Lau and Timothy Baldwin
Quantifying the Vanishing Gradient and Long Distance Dependency Problem in Recursive Neural Networks and Recursive LSTMs  Phong Le and Willem Zuidema
LSTM-Based Mixture-of-Experts for Knowledge-Aware Dialogues Phong Le, Marc Dymetman and Jean-Michel Renders
Mapping Unseen Words to Task-Trained Embedding Spaces Pranava Swaroop Madhyastha, Mohit Bansal, Kevin Gimpel and Karen Livescu
Multilingual Modal Sense Classification using a Convolutional Neural Network  Ana Marasović and Anette Frank
Towards cross-lingual distributed representations without parallel text trained with adversarial autoencoders  Antonio Valerio Miceli Barone
Decomposing Bilexical Dependencies into Semantic and Syntactic Vectors  Jeff Mitchell
Learning Semantic Relatedness in Community Question Answering Using Neural Models  Henry Nassif, Mitra Mohtarami and James Glass
Learning Text Similarity with Siamese Recurrent Networks Paul Neculoiu, Maarten Versteegh and Mihai Rotaru

Thien Huu Nguyen, Lisheng Fu, Kyunghyun Cho and Ralph Grishman	158
Parameterized context windows in Random Indexing Tobias Norlund, David Nilsson and Magnus Sahlgren	166
Making Sense of Word Embeddings  Maria Pelevina, Nikolay Arefiev, Chris Biemann and Alexander Panchenko	174
Pair Distance Distribution: A Model of Semantic Representation  Yonatan Ramni, Oded Maimon and Evgeni Khmelnitsky	184
Measuring Semantic Similarity of Words Using Concept Networks Gábor Recski, Eszter Iklódi, Katalin Pajkossy and Andras Kornai	193
Using Embedding Masks for Word Categorization Stefan Ruseti, Traian Rebedea and Stefan Trausan-Matu	201
Sparsifying Word Representations for Deep Unordered Sentence Modeling Prasanna Sattigeri and Jayaraman J. Thiagarajan	206
Why "Blow Out"? A Structural Analysis of the Movie Dialog Dataset Richard Searle and Megan Bingham-Walker	215
Learning Word Importance with the Neural Bag-of-Words Model Imran Sheikh, Irina Illina, Dominique Fohr and Georges Linarès	222
A Vector Model for Type-Theoretical Semantics  Konstantin Sokolov	230
Towards Generalizable Sentence Embeddings  Eleni Triantafillou, Jamie Ryan Kiros, Raquel Urtasun and Richard Zemel	239
Domain Adaptation for Neural Networks by Parameter Augmentation Yusuke Watanabe, Kazuma Hashimoto and Yoshimasa Tsuruoka	249
Neural Associative Memory for Dual-Sequence Modeling  Dirk Weissenborn	258

## **Conference Program**

#### Thursday, August 11, 2016

9:30-9:40	Welcome and Opening Remarks
9:40-10:30	Keynote: Katrin Erk (University of Texas at Austin)
10:30-11:00	Coffee Break
11:00-11:50	Keynote: Animashree Anandkumar (University of California, Irvine)
11:50-12:10	Best Papers
12:10-13:30	Lunch Break
13:30–14:20	Keynote: Hal Daumé III (University of Maryland)
14:20–15:10	Keynote: Raia Hadsell (DeepMind)

#### 15.10-15.30 **Poster Session**

Decoding Neural Activity Patterns Associated with Sentences by Combining Experiential Attribute and Text-Based Semantic Models

Andrew Anderson, Jeffrey Binder, Leonardo Fernandino, Colin Humphries, Lisa

Conant, Katrin Erk and Rajeev Raizada

#### Explaining Predictions of Non-Linear Classifiers in NLP

Leila Arras, Franziska Horn, Grégoire Montavon, Klaus-Robert Müller and Wojciech Samek

#### Joint Learning of Sentence Embeddings for Relevance and Entailment

Petr Baudiš, Silvestr Stanko and Jan Šedivý

Combining String Kernels and Gaussian Processes for Richer Text Representations. Daniel Beck

A Joint Model for Word Embedding and Word Morphology

Kris Cao and Marek Rei

Learning Word Representations from Multiple Information Sources Yunchuan Chen, Lili Mou, Yan Xu, Ge Li and Zhi Jin

On the Compositionality and Semantic Interpretation of English Noun Compounds Corina Dima

Functional Distributional Semantics

Guy Emerson and Ann Copestake

Improving Preposition Sense Disambiguation with Representations Learned from Mutilingual Data

Hila Gonen and Yoav Goldberg

Assisting Discussion Forum Users using Deep Recurrent Neural Networks
Jacob Hagstedt P Suorra and Olof Mogren

Adjusting Word Embeddings with Semantic Intensity Orders

Joo-Kyung Kim, Marie-Catherine de Marneffe and Eric Fosler-Lussier

Towards Abstraction from Extraction: Multiple Timescale Gated Recurrent Unit for Summarization

Minsoo Kim, Dennis Singh Moirangthem and Minho Lee

An Empirical Evaluation of doc2vec with Practical Insights into Document Embedding Generation

Jey Han Lau and Timothy Baldwin

Quantifying the Vanishing Gradient and Long Distance Dependency Problem in Recursive Neural Networks and Recursive LSTMs

Phong Le and Willem Zuidema

LSTM-Based Mixture-of-Experts for Knowledge-Aware Dialogues

Phong Le, Marc Dymetman and Jean-Michel Renders

Learning Phone Embeddings for Word Segmentation of Child-Directed Speech Jianqiang Ma, Çağrı Çöltekin and Erhard Hinrichs

Mapping Unseen Words to Task-Trained Embedding Spaces

Pranava Swaroop Madhyastha, Mohit Bansal, Kevin Gimpel and Karen Livescu

Multilingual Modal Sense Classification using a Convolutional Neural Network Ana Marasović and Anette Frank

Towards cross-lingual distributed representations without parallel text trained with adversarial autoencoders

Antonio Valerio Miceli Barone

Decomposing Bilexical Dependencies into Semantic and Syntactic Vectors
Jeff Mitchell

Distilling Word Embeddings: An Encoding Approach Lili Mou, Ran Jia, Yan Xu, Ge Li, Lu Zhang and Zhi Jin

Learning Semantic Relatedness in Community Question Answering Using Neural Models

Henry Nassif, Mitra Mohtarami and James Glass

Learning Text Similarity with Siamese Recurrent Networks
Paul Neculoiu, Maarten Versteegh and Mihai Rotaru

A Two-stage Approach for Extending Event Detection to New Types via Neural Networks

Thien Huu Nguyen, Lisheng Fu, Kyunghyun Cho and Ralph Grishman

Parameterized context windows in Random Indexing

Tobias Norlund, David Nilsson and Magnus Sahlgren

Making Sense of Word Embeddings

Maria Pelevina, Nikolay Arefiev, Chris Biemann and Alexander Panchenko

Pair Distance Distribution: A Model of Semantic Representation

Yonatan Ramni, Oded Maimon and Evgeni Khmelnitsky

Measuring Semantic Similarity of Words Using Concept Networks

Gábor Recski, Eszter Iklódi, Katalin Pajkossy and Andras Kornai

Using Embedding Masks for Word Categorization

Stefan Ruseti, Traian Rebedea and Stefan Trausan-Matu

Sparsifying Word Representations for Deep Unordered Sentence Modeling

Prasanna Sattigeri and Jayaraman J. Thiagarajan

Why "Blow Out"? A Structural Analysis of the Movie Dialog Dataset Richard Searle and Megan Bingham-Walker

Learning Word Importance with the Neural Bag-of-Words Model Imran Sheikh, Irina Illina, Dominique Fohr and Georges Linarès

A Vector Model for Type-Theoretical Semantics Konstantin Sokolov

Towards Generalizable Sentence Embeddings

Eleni Triantafillou, Jamie Ryan Kiros, Raquel Urtasun and Richard Zemel

Domain Adaptation for Neural Networks by Parameter Augmentation Yusuke Watanabe, Kazuma Hashimoto and Yoshimasa Tsuruoka

Neural Associative Memory for Dual-Sequence Modeling
Dirk Weissenborn

MuFuRU: The Multi-Function Recurrent Unit Dirk Weissenborn and Tim Rocktäschel

15.30–16.00 Poster Session Continues and Coffee break

**16.00–17.20** Panel Discussion

17.20–17.30 Closing Remarks