**CoNLL 2015** 

# The 19th Conference on Computational Natural Language Learning

**Proceedings of the Conference** 

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# Introduction

The 2015 Conference on Computational Natural Language Learning is the nineteenth in the series of annual meetings organized by SIGNLL, the ACL special interest group on natural language learning. CONLL 2015 will be held in Beijing, China on July 30-31, 2015, in conjunction with ACL-IJCNLP 2015.

For the first time this year, CoNLL 2015 has accepted both long (9 pages of content plus 2 additional pages of references) and short papers (5 pages of content plus 2 additional pages of references). We received 144 submissions in total, of which 81 were long and 61 were short papers, and 17 were eventually withdrawn. Of the remaining 127 papers, 29 long and 9 short papers were selected to appear in the conference program, resulting in an overall acceptance rate of almost 30%. All accepted papers appear here in the proceedings.

As in previous years, CoNLL 2015 has a shared task, this year on Shallow Discourse Parsing. Papers accepted for the shared task are collected in a companion volume of CoNLL 2015.

To fit the paper presentations in a 2-day program, 16 long papers were selected for oral presentation and the remaining 13 long and the 9 short papers were presented as posters. The papers selected for oral presentation are distributed in four main sessions, each consisting of 4 talks. Each of these sessions also includes 3 or 4 spotlights of the long papers selected for the poster session. In contrast, the spotlights for short papers are presented in a single session of 30 minutes. The remaining sessions were used for presenting a selection of 4 shared task papers, two invited keynote speeches and a single poster session, including long, short and shared task papers.

We would like to thank all the authors who submitted their work to CoNLL 2015, as well as the program committee for helping us select the best papers out of many high-quality submissions. We are also grateful to our invited speakers, Paul Smolensky and Eric Xing, who graciously agreed to give talks at CoNLL.

Special thanks are due to the SIGNLL board members, Xavier Carreras and Julia Hockenmaier, for their valuable advice and assistance in putting together this year's program, and to Ben Verhoeven, for redesigning and maintaining the CoNLL 2015 web page. We are grateful to the ACL organization for helping us with the program, proceedings and logistics. Finally, our gratitude goes to our sponsors, Google Inc. and Microsoft Research, for supporting the best paper award and student scholarships at CoNLL 2015.

We hope you enjoy the conference!

Afra Alishahi and Alessandro Moschitti

CoNLL 2015 conference co-chairs

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# **Conference Program**

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*Task-Oriented Learning of Word Embeddings for Semantic Relation Classification* Kazuma Hashimoto, Pontus Stenetorp, Makoto Miwa and Yoshimasa Tsuruoka

Symmetric Pattern Based Word Embeddings for Improved Word Similarity Prediction Roy Schwartz, Roi Reichart and Ari Rappoport

A Coactive Learning View of Online Structured Prediction in Statistical Machine Translation Artem Sokolov, Stefan Riezler and Shay B. Cohen

#### **10:10-10:30** Session 1.b: Entity Linking (spotlight presentations)

A Joint Framework for Coreference Resolution and Mention Head Detection Haoruo Peng, Kai-Wei Chang and Dan Roth

Entity Linking Korean Text: An Unsupervised Learning Approach using Semantic Relations Youngsik Kim and Key-Sun Choi

*Linking Entities Across Images and Text* Rebecka Weegar, Kalle Åström and Pierre Nugues

*Recovering Traceability Links in Requirements Documents* Zeheng Li, Mingrui Chen, LiGuo Huang and Vincent Ng

#### 10:30-11:00 Coffee Break

#### 11:00-12:00 Session 2.a: Keynote Talk

On Spectral Graphical Models, and a New Look at Latent Variable Modeling in Natural Language Processing Eric Xing, Carnegie Mellon University

#### 12:00-12:30 Session 2.b: Short Paper Spotlights

Deep Neural Language Models for Machine Translation Thang Luong, Michael Kayser and Christopher D. Manning *Reading behavior predicts syntactic categories* Maria Barrett and Anders Søgaard

One Million Sense-Tagged Instances for Word Sense Disambiguation and Induction Kaveh Taghipour and Hwee Tou Ng

*Model Selection for Type-Supervised Learning with Application to POS Tagging* Kristina Toutanova, Waleed Ammar, Pallavi Choudhury and Hoifung Poon

*Feature Selection for Short Text Classification using Wavelet Packet Transform* Anuj Mahajan, Sharmistha Jat and Shourya Roy

Do dependency parsing metrics correlate with human judgments? Barbara Plank, Héctor Martínez Alonso, Željko Agić, Danijela Merkler and Anders Søgaard

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*Finding Opinion Manipulation Trolls in News Community Forums* Todor Mihaylov, Georgi Georgiev and Preslav Nakov

#### 12:30-14:00 Lunch Break

#### 14:00-15:30 Session 3: CoNLL Shared Task

*The CoNLL-2015 Shared Task on Shallow Discourse Parsing* Nianwen Xue, Hwee Tou Ng, Sameer Pradhan, Rashmi Prasad, Christopher Bryant, Attapol Rutherford

A Refined End-to-End Discourse Parser Jianxiang Wang and Man Lan

The UniTN Discourse Parser in CoNLL 2015 Shared Task: Token-level Sequence Labeling with Argument-specific Models Evgeny Stepanov, Giuseppe Riccardi and Ali Orkan Bayer

The SoNLP-DP System in the CoNLL-2015 shared Task Fang Kong, Sheng Li and Guodong Zhou

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#### 16:00-17:10 Session 4.a: Syntactic Parsing

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*Cross-lingual Transfer for Unsupervised Dependency Parsing Without Parallel Data* Long Duong, Trevor Cohn, Steven Bird and Paul Cook

Incremental Recurrent Neural Network Dependency Parser with Search-based Discriminative Training Majid Yazdani and James Henderson

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Instance Selection Improves Cross-Lingual Model Training for Fine-Grained Sentiment Analysis Roman Klinger and Philipp Cimiano

Annotation Projection-based Representation Learning for Cross-lingual Dependency Parsing Min Xiao and Yuhong Guo

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An Iterative Similarity based Adaptation Technique for Cross-domain Text Classification Himanshu Sharad Bhatt, Deepali Semwal and Shourya Roy

Making the Most of Crowdsourced Document Annotations: Confused Supervised LDA Paul Felt, Eric Ringger, Jordan Boyd-Graber and Kevin Seppi

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#### 10:30-11:00 Coffee Break

#### 11:00-12:00 Session 6.a: Keynote Talk

Does the Success of Deep Neural Network Language Processing Mean – Finally! – the End of Theoretical Linguistics? Paul Smolensky, Johns Hopkins University

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*Cross-lingual syntactic variation over age and gender* Anders Johannsen, Dirk Hovy and Anders Søgaard

A Synchronous Hyperedge Replacement Grammar based approach for AMR parsing Xiaochang Peng, Linfeng Song and Daniel Gildea

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*Learning to Exploit Structured Resources for Lexical Inference* Vered Shwartz, Omer Levy, Ido Dagan and Jacob Goldberger

*Quantity, Contrast, and Convention in Cross-Situated Language Comprehension* Ian Perera and James Allen

15:30-16:00 Coffee Break

#### 16:00-17:30 Session 8.a: Joint Poster Presentation (long, short and shared task papers)

#### **Long Papers**

A Joint Framework for Coreference Resolution and Mention Head Detection Haoruo Peng, Kai-Wei Chang and Dan Roth

Entity Linking Korean Text: An Unsupervised Learning Approach using Semantic Relations Youngsik Kim and Key-Sun Choi

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*Finding Opinion Manipulation Trolls in News Community Forums* Todor Mihaylov, Georgi Georgiev and Preslav Nakov

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A Hybrid Discourse Relation Parser in CoNLL 2015 Sobha Lalitha Devi, Sindhuja Gopalan, Lakshmi S, Pattabhi RK Rao, Vijay Sundar Ram and Malarkodi C.S.

A Minimalist Approach to Shallow Discourse Parsing and Implicit Relation Recognition Christian Chiarcos and Niko Schenk

A Shallow Discourse Parsing System Based On Maximum Entropy Model Jia Sun, Peijia Li, Weiqun Xu and Yonghong Yan

Hybrid Approach to PDTB-styled Discourse Parsing for CoNLL-2015 Yasuhisa Yoshida, Katsuhiko Hayashi, Tsutomu Hirao and Masaaki Nagata

Improving a Pipeline Architecture for Shallow Discourse Parsing Yangqiu Song, Haoruo Peng, Parisa Kordjamshidi, Mark Sammons and Dan Roth

JAIST: A two-phase machine learning approach for identifying discourse relations in newswire texts Son Nguyen, Quoc Ho and Minh Nguyen

Shallow Discourse Parsing Using Constituent Parsing Tree Changge Chen, Peilu Wang and Hai Zhao Shallow Discourse Parsing with Syntactic and (a Few) Semantic Features Shubham Mukherjee, Abhishek Tiwari, Mohit Gupta and Anil Kumar Singh

*The CLaC Discourse Parser at CoNLL-2015* Majid Laali, Elnaz Davoodi and Leila Kosseim

The DCU Discourse Parser for Connective, Argument Identification and Explicit Sense Classification Longyue Wang, Chris Hokamp, Tsuyoshi Okita, Xiaojun Zhang and Qun Liu

The DCU Discourse Parser: A Sense Classification Task Tsuyoshi Okita, Longyue Wang and Qun Liu

#### 17:30-17:45 Session 8.b: Best Paper Award and Closing

## Keynote Talk

#### On Spectral Graphical Models, and a New Look at Latent Variable Modeling in Natural Language Processing

#### **Eric Xing**

#### Carnegie Mellon University

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#### Abstract

Latent variable and latent structure modeling, as widely seen in parsing systems, machine translation systems, topic models, and deep neural networks, represents a key paradigm in Natural Language Processing, where discovering and leveraging syntactic and semantic entities and relationships that are not explicitly annotated in the training set provide a crucial vehicle to obtain various desirable effects such as simplifying the solution space, incorporating domain knowledge, and extracting informative features. However, latent variable models are difficult to train and analyze in that, unlike fully observed models, they suffer from non-identifiability, non-convexity, and over-parameterization, which make them often hard to interpret, and tend to rely on local-search heuristics and heavy manual tuning.

In this talk, I propose to tackle these challenges using spectral graphical models (SGM), which view latent variable models through the lens of linear algebra and tensors. I show how SGMs exploit the connection between latent structure and low rank decomposition, and allow one to develop models and algorithms for a variety of latent variable problems, which unlike traditional techniques, enjoy provable guarantees on correctness and global optimality, can straightforwardly incorporate additional modern techniques such as kernels to achieve more advanced modeling power, and empirically offer a 1-2 orders of magnitude speed up over existing methods while giving comparable or better performance.

This is joint work with Ankur Parikh, Carnegie Mellon University.

#### **Biography of the Speaker**

Dr. Eric Xing is a Professor of Machine Learning in the School of Computer Science at Carnegie Mellon University, and Director of the CMU/UPMC Center for Machine Learning and Health. His principal research interests lie in the development of machine learning and statistical methodology, and large-scale computational system and architecture; especially for solving problems involving automated learning, reasoning, and decision-making in high-dimensional, multimodal, and dynamic possible worlds in artificial, biological, and social systems. Professor Xing received a Ph.D. in Molecular Biology from Rutgers University, and another Ph.D. in Computer Science from UC Berkeley. He servers (or served) as an associate editor of the Annals of Applied Statistics (AOAS), the Journal of American Statistical Association (JASA), the IEEE Transaction of Pattern Analysis and Machine Intelligence (PAMI), the PLoS Journal of Computational Biology, and an Action Editor of the Machine Learning Journal (MLJ), the Journal of Machine Learning Research (JMLR). He was a member of the DARPA Information Science and Technology (ISAT) Advisory Group, a recipient of the NSF Career Award, the Sloan Fellowship, the United States Air Force Young Investigator Award, and the IBM Open Collaborative Research Award. He is the Program Chair of ICML 2014.

# Keynote Talk

### Does the Success of Deep Neural Network Language Processing Mean – Finally! – the End of Theoretical Linguistics?

#### **Paul Smolensky**

#### Johns Hopkins University

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#### Abstract

Statistical methods in natural-language processing that rest on heavily empirically-based language learning – especially those centrally deploying neural networks – have witnessed dramatic improvement in the past few years, and their success restores the urgency of understanding the relationship between (i) these neural/statistical language systems and (ii) the view of linguistic representation, processing, and structure developed over centuries within theoretical linguistics.

Two hypotheses concerning this relationship arise from our own mathematical and experimental results from past work, which we will present. These hypotheses can guide – we will argue – important future research in the seemingly sizable gap separating computational linguistics from linguistic theories of human language acquisition. These hypotheses are:

- 1. The internal representational format used in deep neural networks for language numerical vectors is covertly an implementation of a system of discrete, symbolic, structured representations which are processed so as to optimally meet the demands of a symbolic grammar recognizable from the perspective of theoretical linguistics.
- 2. It will not be successes but rather the \*failures\* of future machine learning approaches to language acquisition which will be most telling for determining whether such approaches capture the crucial limitations on human language learning limitations, documented in recent artificial-grammar-learning experimental results, which support the nativist Chomskian hypothesis asserting that
  - reliably and efficiently learning human grammars from available evidence requires
  - that the hypothesis space entertained by the child concerning the set of possible (or likely) human languages
  - be limited by abstract, structure-based constraints;
  - these constraints can then also explain (in principle at least) the many robustly-respected universals observed in cross-linguistic typology.

This is joint work with Jennifer Culbertson, University of Edinburgh.

## **Biography of the Speaker**

Paul Smolensky is the Krieger-Eisenhower Professor of Cognitive Science at Johns Hopkins University in Baltimore, Maryland, USA. He studies the mutual implications between the theories of neural computation and of universal grammar and has published in distinguished venues including Science and the Proceedings of the National Academy of Science USA. He received the David E. Rumelhart Prize for Outstanding Contributions to the Formal Analysis of Human Cognition (2005), the Chaire de Recherche Blaise Pascal (2008—9), and the Sapir Professorship of the Linguistic Society of America (2015). Primary results include:

- Contradicting widely-held convictions, (i) structured symbolic and (ii) neural network models of cognition are mutually compatible: formal descriptions of the same systems, the mind/brain, at (i) a highly abstract, and (ii) a more physical, level of description. His article "On the proper treatment of connectionism" (1988) was until recently one of the 10-most cited articles in The Behavioral and Brain Sciences, itself the most-cited journal of all the behavioral sciences.
- That the theory of neural computation can in fact strengthen the theory of universal grammar is attested by the revolutionary impact in theoretical linguistics (within phonology in particular) of Optimality Theory, a neural- network-derived symbolic grammar formalism that he developed with Alan Prince (in a book widely released 1993, officially published 2004).
- The learnability theory for Optimality Theory was founded at nearly the same time as the theory itself, in joint work of Smolensky and his PhD student Bruce Tesar (TR 1993; article in the premier linguistic theory journal, Linguistic Inquiry 1998; MIT Press book 2000). This work laid the foundation upon which rests most of the flourishing formal theory of learning in Optimality Theory.
- There is considerable power in formalizing neural network computation as statistical inference/optimization within a dynamical system. Smolensky's Harmony Theory (1981–6) analyzed network computation as Harmony Maximization (an independently-developed homologue to Hopfield's "energy minimization" formulation) and first deployed principles of statistical inference for processing and learning in the bipartite network structure later to be known as the 'Restricted Boltzmann Machine' in the initial work on deep neural network learning (Hinton et al., 2006–).
- Powerful recursive symbolic computation can be achieved with massive parallelism in neural networks designed to process tensor product representations (TR 1987; journal article in Artificial Intelligence 1990). Related uses of the tensor product to structure numerical vectors is currently under rapid development in the field of distributional vector semantics.

Most recently, as argued in Part 1 of the talk, his work shows the value for theoretical and psycholinguistics of representations that share both the discrete structure of symbolic representations and the continuous variation of activity levels in neural network representations (initial results in an article in Cognitive Science by Smolensky, Goldrick & Mathis 2014).