CoNLL-2009

Proceedings of the Thirteenth Conference on Computational Natural Language Learning (CoNLL)

Conference Chairs: Suzanne Stevenson and Xavier Carreras

> June 4–5, 2009 Boulder, Colorado

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Introduction

The 2009 Conference on Computational Natural Language Learning is the thirteenth in the series of annual meetings organized by SIGNLL, the ACL special interest group on natural language learning. CoNLL-2009 will be held in Boulder, CO, 4–5 June 2009, in conjunction with NAACL HLT.

For our special focus this year in the main session of CoNLL, we invited papers on unsupervised, minimally supervised and semi-supervised methods in natural language learning, as well as on incremental learning methods. As with earlier CoNLLs, we encouraged papers that addressed these issues from the perspective both of human language acquisition and of NLP systems.

We received 70 submissions to the main session on these and other relevant topics, of which 11 were withdrawn. Of the remaining 59 papers, 15 were selected to appear in the conference program as oral presentations, and 10 were chosen as posters. All accepted papers appear here in the proceedings.

Our invited speakers reflect the state-of-the-art in human and machine learning of natural language, and we are grateful to Michael Frank and Andrew McCallum for agreeing to speak on their exciting new work in these areas.

As in previous years, CoNLL-2009 has a shared task, Syntactic and Semantic Dependencies in Multiple Languages. This is an extension of the CoNLL-2008 shared task to multiple languages (English plus Catalan, Chinese, Czech, German, Japanese and Spanish). Among the new features are compatible evaluation for several languages and their comparison, and learning curves for languages with large datasets. We expect that this major comparative exercise will lead to very enlightening results and discussion that will serve to move the field forward. The Shared Task papers are collected into an accompanying volume of CoNLL-2009. We thank Jan Hajic and the rest of the organizers for their great effort in running the Shared Task.

We would like to thank the members of the SIGNLL steering committee for useful discussion, especially Lluís Màrquez and Joakim Nivre, who helped us greatly with advice around the conference organization, and Erik Tjong Kim Sang, who acted as the information officer. We also appreciate the help we received from NAACL HLT organizers, including Martha Palmer, Mark Hasegawa-Johnson, Nizar Habash, Christy Doran, Eric Ringger, and Priscilla Rasmussen.

Finally, many thanks to Google for sponsoring the best paper award at CoNLL-2009.

We hope you find CoNLL-2009 a fruitful venue for discussion and interaction on the exciting topics covered by our program.

Suzanne Stevenson and Xavier Carreras

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Conference Chairs:

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Caroline Sporleder, Saarland University Richard Sproat, Oregon Health & Science University Mihai Surdeanu, Stanford University Ivan Titov, University of Illinois at Urbana-Champaign Erik Tjong Kim Sang, University of Groningen Vivian Tsang, Bloorview Research Institute Antal van den Bosch, Tilburg University Aline Villavicencio, Federal University of Rio Grande do Sul Charles Yang, University of Pennsylvania Scott Wen-tau Yih, Microsoft Research Deniz Yuret, Koç University Luke Zettlemoyer, MIT

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Invited Speakers:

Michael C. Frank, MIT Andrew McCallum, University of Massachusetts Amherst

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Interactive Feature Space Construction using Semantic Information Dan Roth and Kevin Small
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Joint Inference for Natural Language Processing Andrew McCallum

Modeling Word Learning As Communicative Inference Michael C. Frank

Thursday, June 4, 2009

9:00–9:15 Opening Remarks

Session 1: Parsing and Tagging

- 9:15–9:40 Sample Selection for Statistical Parsers: Cognitively Driven Algorithms and Evaluation Measures Roi Reichart and Ari Rappoport
- 9:40–10:05 Data-Driven Dependency Parsing of New Languages Using Incomplete and Noisy Training Data Kathrin Spreyer and Jonas Kuhn
- 10:05–10:30 *A Metalearning Approach to Processing the Scope of Negation* Roser Morante and Walter Daelemans
- 10:30–11:00 Coffee Break

Session 2: Learning Methods

- 11:00–10:25 *Efficient Linearization of Tree Kernel Functions* Daniele Pighin and Alessandro Moschitti
- 11:25–11:40 A Method for Stopping Active Learning Based on Stabilizing Predictions and the Need for User-Adjustable Stopping Michael Bloodgood and Vijay Shanker
- 11:40–12:40 **Invited Talk:** *Joint Inference for Natural Language Processing* Andrew McCallum
- 12:40–14:00 Lunch

Thursday, June 4, 2009 (continued)

Shared Task: Overview and Oral Presentations

14:00-14:20	The CoNLL-2009 Shared Task: Syntactic and Semantic Dependencies in Multiple Lan- guages
	Jan Hajič, Massimiliano Ciaramita, Richard Johansson, Daisuke Kawahara, Maria Antònia Martí, Lluís Màrquez, Adam Meyers, Joakim Nivre, Sebastian Padó, Jan Štěpánek, Pavel Straňák, Mihai Surdeanu, Nianwen Xue and Yi Zhang
14:20-14:30	An Iterative Approach for Joint Dependency Parsing and Semantic Role Labeling Qifeng Dai, Enhong Chen and Liu Shi
14:30-14:40	Joint Memory-Based Learning of Syntactic and Semantic Dependencies in Multiple Lan- guages Roser Morante, Vincent Van Asch and Antal van den Bosch
14:40-14:50	Hybrid Multilingual Parsing with HPSG for SRL Yi Zhang, Rui Wang and Stephan Oepen
14:50-15:00	A Latent Variable Model of Synchronous Syntactic-Semantic Parsing for Multiple Lan- guages Andrea Gesmundo, James Henderson, Paola Merlo and Ivan Titov
15:00-15:10	Multilingual Semantic Role Labeling Anders Björkelund, Love Hafdell and Pierre Nugues
15:10-15:20	Multilingual Dependency-based Syntactic and Semantic Parsing Wanxiang Che, Zhenghua Li, Yongqiang Li, Yuhang Guo, Bing Qin and Ting Liu
15:20–15:30	Multilingual Dependency Learning: A Huge Feature Engineering Method to Semantic Dependency Parsing Hai Zhao, Wenliang Chen, Chunyu Kity and Guodong Zhou
15:30–15:40	Multilingual Dependency Learning: Exploiting Rich Features for Tagging Syntactic and Semantic Dependencies Hai Zhao, Wenliang Chen, Jun'ichi Kazama, Kiyotaka Uchimoto and Kentaro Torisawa
15:40-16:10	Coffee Break

Thursday, June 4, 2009 (continued)

Shared Task: Poster Session (16:10–18:00)

Multilingual Semantic Role Labeling Anders Björkelund, Love Hafdell and Pierre Nugues

Efficient Parsing of Syntactic and Semantic Dependency Structures Berud Bohnet

Multilingual Dependency-based Syntactic and Semantic Parsing Wanxiang Che, Zhenghua Li, Yongqiang Li, Yuhang Guo, Bing Qin and Ting Liu

An Iterative Approach for Joint Dependency Parsing and Semantic Role Labeling Qifeng Dai, Enhong Chen and Liu Shi

A Latent Variable Model of Synchronous Syntactic-Semantic Parsing for Multiple Languages Andrea Gesmundo, James Henderson, Paola Merlo and Ivan Titov

Exploring Multilingual Semantic Role Labeling Baoli Li, Martin Emms, Saturnino Luz and Carl Vogel

A Second-Order Joint Eisner Model for Syntactic and Semantic Dependency Parsing Xavier Lluís, Stefan Bott and Lluís Màrquez

Multilingual Semantic Role Labelling with Markov Logic Ivan Meza-Ruiz and Sebastian Riedel

Joint Memory-Based Learning of Syntactic and Semantic Dependencies in Multiple Languages Roser Morante, Vincent Van Asch and Antal van den Bosch

The Crotal SRL System : a Generic Tool Based on Tree-structured CRF Erwan Moreau and Isabelle Tellier

Parsing Syntactic and Semantic Dependencies for Multiple Languages with A Pipeline Approach Han Ren, Donghong Ji, Jing Wan and Mingyao Zhang

Multilingual Semantic Parsing with a Pipeline of Linear Classifiers Oscar Täckström

Thursday, June 4, 2009 (continued)

A Joint Syntactic and Semantic Dependency Parsing System based on Maximum Entropy Models Buzhou Tong, Lu Li, Xinvin Li, Xuon Wong and Xiaolong Wong

Buzhou Tang, Lu Li, Xinxin Li, Xuan Wang and Xiaolong Wang

Multilingual Syntactic-Semantic Dependency Parsing with Three-Stage Approximate Max-Margin Linear Models Yotaro Watanabe, Masayuki Asahara and Yuji Matsumoto

A Simple Generative Pipeline Approach to Dependency Parsing and Semantic Role Labeling Daniel Zeman

Hybrid Multilingual Parsing with HPSG for SRL Yi Zhang, Rui Wang and Stephan Oepen

Multilingual Dependency Learning: Exploiting Rich Features for Tagging Syntactic and Semantic Dependencies Hai Zhao, Wenliang Chen, Jun'ichi Kazama, Kiyotaka Uchimoto and Kentaro Torisawa

Multilingual Dependency Learning: A Huge Feature Engineering Method to Semantic Dependency Parsing Hai Zhao, Wenliang Chen, Chunyu Kity and Guodong Zhou

Friday, June 5, 2009

Session 3: Learning and Semantics

- 9:00–9:25 Superior and Efficient Fully Unsupervised Pattern-based Concept Acquisition Using an Unsupervised Parser Dmitry Davidov, Roi Reichart and Ari Rappoport
- 9:25–9:50 *Representing words as regions in vector space* Katrin Erk
- 9:50–10:15 *Interactive Feature Space Construction using Semantic Information* Dan Roth and Kevin Small
- 10:15–10:40 *Mining the Web for Reciprocal Relationships* Michael Paul, Roxana Girju and Chen Li
- 10:40–11:00 Coffee Break

Friday, June 5, 2009 (continued)

Session 4: Human Behavior

- 11:00–11:25 *Minimally Supervised Model of Early Language Acquisition* Michael Connor, Yael Gertner, Cynthia Fisher and Dan Roth
- 11:25–11:40 *Learning Where to Look: Modeling Eye Movements in Reading* Mattias Nilsson and Joakim Nivre
- 11:40–12:40 **Invited talk:** *Modeling Word Learning As Communicative Inference* Michael C. Frank
- 12:40–14:00 Lunch

13:45–14:15 SIGNLL Meeting

Poster Session (14:00–15:30)

Monte Carlo inference and maximization for phrase-based translation Abhishek Arun, Chris Dyer, Barry Haddow, Phil Blunsom, Adam Lopez and Philipp Koehn

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Improving Text Classification by a Sense Spectrum Approach to Term Expansion Peter Wittek, Sándor Darányi and Chew Lim Tan

15:30–16:00 Coffee Break

Session 5: Semantic Annotation and Extraction

- 16:00–16:25 *A simple feature-copying approach for long-distance dependencies* Marc Vilain, Jonathan Huggins and Ben Wellner
- 16:25–16:50 *Fine-Grained Classification of Named Entities Exploiting Latent Semantic Kernels* Claudio Giuliano
- 16:50–17:15 Using Encyclopedic Knowledge for Automatic Topic Identification Kino Coursey, Rada Mihalcea and William Moen
- 17:15–17:40 *New Features for FrameNet WordNet Mapping* Sara Tonelli and Daniele Pighin
- 17:40–18:00 Closing remarks and best paper award