# Jason Naradowsky

Department of Computer Science

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#### Research Interests

Machine Reading, Imitation Learning, Graphical Models, Joint inference, Machine Translation, Morphologically Rich Languages, Language Acquisition

## Education

2008–2014 PhD in Computer Science, University of Massachusetts Amherst.

Advisor: David A. Smith

Certificate in Cognitive Science

2011–2014 PhD in Computer Science, Macquarie University.

Advisor: Mark Johnson

2008 MSc, Artificial Intelligence, University of Edinburgh.

Thesis: Improving Morphology Induction with Phonological Rules

Advisor: Sharon Goldwater

2007 MS, Computational Linguistics, State University of New York at Buffalo.

Thesis: The Effect of Frequencies and Unseen Events on Parser Portability

Advisor: Doug Roland

2006 MA, Human Computer Interaction, State University of New York at Oswego.

Thesis: Neural Networks for Automated Design Evaluation

Advisor: Craig Graci

2001-2005 BS, Computer Science, State University of New York at Oswego.

2001-2005 BA, Linguistics, State University of New York at Oswego.

Specialization: Artificial Intelligence, with Honors

Thesis: Baroque Music Generation using Genetic Algorithms with Theory-based

Crossover

Minor: Cognitive Science

#### Summer Schools

2007 Linguistic Society of America Summer Institute 2007 Stanford University, Palo Alto, CA

#### **Doctoral Thesis**

Title Learning with Joint Inference and Latent Linguistic Structure in Graphical Models

Supervisors David A. Smith and Mark Johnson

Committee 1 Ben Marlin, Andrew McCallum, Joe Pater, and Kristina Toutanova

Committee 2 Tiberio Caetano, Ben Marlin, Luke Zettlemoyer

Description Developed a modeling framework for constructing joint factor graph models of NLP problems, and described how latent combinatorially-constrained syntactic representations can be marginalized over during training to produce task-specific syntactic distributions without the need for treebanks.

## Research Experience

#### 2016-current Research Associate

Supervisor: Anna Korhonen

University of Cambridge, Cambridge, England

#### 2016 Senior Research Associate

#### 2014–2016 Research Associate

Supervisor: Sebastian Riedel

University College London, London, England

Developed techniques for event extraction with distance supervision, matrix factorization, and pointer networks. The resulting system improved upon the state-of-the-art on an established dataset by over 35% while requiring less linguistic annotation and pre-processing. Made connections between  $\alpha$ -bound theory and regularisation for cost-sensitive imitation learning, which led to improvements in both AMR parsing and coreference. Also explored multilingual word representations, task-directed parsing, and exam question answering.

#### 2012 Visiting Researcher

Nara Institute of Science and Technology (NAIST), Nara, Japan

Advisor: Yuji Matsumoto

Explored techniques of incorporating syntactic information into sequence models for part-of-speech tagging in inflectional languages. Developed novel coarse-to-fine approach based on relaxations to marginal inference.

#### 2010 Research Intern

Microsoft Research, Redmond, WA

Advisor: Kristina Toutanova

Research in morpheme-based alignment models for machine translation. Resulted in a model for joint morpheme segmentation and alignment based on the HMM alignment model which improved alignment quality and outperformed all previous results on monolingual morphological segmentation for Arabic.

#### 2008-2011 Research Assistant

Computer Science Department, University of Massachusetts Amherst

Advisors: Andrew McCallum and David A. Smith

Research in unsupervised language learning, topic-modeling, parsing, named entity recognition, graphical models, and joint inference.

#### 2008 Google Summer of Code 2008

Project: Dependency Parsing in the Natural Language Toolkit

Advisors: Sebastian Riedel and Jason Baldridge

Implemented a suite of four dependency parsers, relevant interfaces, and readers for commonly-used corpora.

#### 2005-2006 Research Assistant

Psychology Department, State University of New York at Oswego

Advisors: Lin Qiu and Songmei Han

Research on cross-cultural HCI and adaptive feedback systems. Developed web applications for testing interface usability and, in a separate project, augmented a program to provide adaptive natural language critiques for Java code. Conducted a set of experiments using undergraduate student participants for both projects.

## Teaching Experience

Fall 2009 Grader, Computer Science Department, University of Massachusetts Amherst

Class: CMPSCI 585: Introduction to Natural Language Processing

Instructor: David A. Smith

## Advising

**Masters Students** 

Chris Loy, University College London, 20165

Thesis: Deep Hierarchical Architectures for Polyphonic Music Transcription

James Goodman, Co-advised with Andreas Vlachos, University College London, 2015

Thesis: Semantic Parsing from English to AMR using Imitation Learning

Undergraduate Committee

Elias Zeidan, Marlboro College, 2013

#### **Tutorials**

Matrix and Tensor Factorization Methods for Natural Language Processing Presented at ACL 2015

#### Invited Talks

- [1] Distantly Supervised Event Extraction with Pointer Networks Komachi-ken, Tokyo Metropolitan University, June 9th, 2016
- [2] Computers that Read: Uncovering the Structure of Language with Deep Learning Presented with Pontus Stenetorp Artificial Intelligent Association, Osaka University, June 6th, 2016
- [3] Distantly Supervised Event Extraction with Pointer Networks Matsumoto-ken, NAIST, June 3rd, 2016
- [4] Artificial Intelligence: A Rationalist Perspective on the Past and Future of AI PechaKucha, presented with Sebastian Riedel Embassy of Japan, London, March 23rd, 2016

- [5] Deep Sequence Models, Multimodality & Conversational Agents Miyake-ken, Osaka University, Nov 5th, 2015
- [6] Learning Latent Syntactic Representations with Joint Models
   Xerox Research Center, Grenoble, April 16th, 2015
- [7] Learning Latent Syntactic Representations with Joint Models Cambridge University, March 13th, 2015

#### **Publications**

## Refereed Conference Proceedings

- [1] James Goodman, Andreas Vlachos, and Jason Naradowsky. Noise reduction and targeted exploration in imitation learning for abstract meaning representation parsing. In Association for Computational Linguistics (ACL), 2016.
- [2] James Goodman, Andreas Vlachos, and Jason Naradowsky. Ucl+sheffield at semeval-2016 task 8: Imitation learning for amr parsing with an alpha-bound. In *Proceedings* of the 10th International Workshop on Semantic Evaluation, 2016.
- [3] Jason Naradowsky, Sebastian Riedel, and David Smith. Improving nlp through marginalization of hidden syntactic structure. In *Conference on Empirical Methods in Natural Language Processing (EMNLP)*, 2012.
- [4] Jason Naradowsky, Tim Vieira, and David A. Smith. Grammarless parsing for joint inference. In 24th International Conference on Computational Linguistics (COLING), Mumbai, India, 2012.
- [5] John Lee, Jason Naradowsky, and David Smith. A discriminative model for joint morphological disambiguation and dependency parsing. In *Association for Computational Linguistics (ACL)*, 2011.
- [6] Jason Naradowsky and Kristina Toutanova. Unsupervised bilingual morpheme segmentation and alignment with context-rich hidden semi-markov models. In *Association for Computational Linguistics (ACL)*, 2011.
- [7] David Mimno, Hanna Wallach, Jason Naradowsky, David Smith, and Andrew Mc-Callum. Polylingual topic models. In *Conference on Empirical Methods in Natural Language Processing (EMNLP)*, 2009.
- [8] Jason Naradowsky and Sharon Goldwater. Improving morphology induction by learning spelling rules. In *International Joint Conference on AI (IJCAI)*, pages 1531–1537, 2009.

#### Workshop Proceedings

- [1] Jason Naradowsky, Joe Pater, and David Smith. Feature induction for online constraint-based phonology acquisition. In *The Northeast Computational Phonology Workshop (NECPhon)*, New Haven, Connecticut, 2011.
- [2] Jason Naradowsky, Joe Pater, David Smith, and Robert Staubs. Learning hidden metrical structure with a log-linear model of grammar. In *Computational Modelling of Sound Pattern Acquisition*, pages 59–60, Edmonton, 2010.

[3] David Mimno, Hanna Wallach, Limin Yao, and Jason Naradowsky. Polylingual topic models. In *The Learning Workshop (Snowbird)*, Clearwater, Florida, 2009.

Demo Proceedings

[1] Sameer Singh, Tim Rocktäschel, Luke Hewitt, Jason Naradowsky, and Sebastian Riedel. WOLFE: An NLP-friendly Declarative Machine Learning Stack. In Annual Conference of the North American Chapter of the Association for Computational Linquistics (NAACL), 2015.

## Professional Service

Program Committee

- 2017 EACL
- 2016 ACL, AKBC, COLING, EMNLP
- 2015 ACL, AKBC
- 2014 ACL, EMNLP
- 2013 ACL, IJCNLP
- 2012 ACL, ACL-SRW, EACL, EMNLP
- 2011 ACL, CoNLL, EMNLP, IJCNLP
- 2010 EMNLP, NESCAI

Action Editor

2016- Transactions of the American Association for Computational Linguistics (TACL)

Journal Reviewer

2015 Transactions on Audio, Speech and Language Processing (T-ASL)

Organizer

2016 AI4Exams, with Yusuke Miyao & Sebastian Riedel

#### Awards and Achievements

- 2015 Daiwa Foundation Small Grant Award
- 2014 Best Reviewer, ACL 2014
- 2012 East Asia and Pacific Summer Institute (EAPSI) Fellowship National Science Foundation
- 2012 Best Reviewer, EMNLP 2012
- 2011 Cotutelle International Macquarie University Research Scholarship (iMQRES)
  Macquarie University
- 2011 Institute for Computational and Experimental Study of Language (ICESL) Seed Grant University of Massachusetts Amherst
- 2005 Oebele Van Dyk Outstanding Senior in Computer Science Award State University of New York at Oswego
- 2001-2005 Presidential Scholarship State University of New York at Oswego

## Personal Details

Citizenship: USA

Date of Birth: July 9th, 1983

Languages: English (native), Latin (reading), Japanese (beginner) Programming Languages: Scala, Java, Python, Ruby, LISP, Clojure

Notable Packages: TensorFlow