# Jason Naradowsky

Associate Research Scientist Human Language Technology Center of Excellence Johns Hopkins University Baltimore, MD 21211 http://narad.github.io/ jason.narad@gmail.com

## Research Interests

Machine Reading, Imitation Learning, Graphical Models, Joint inference, Machine Translation, Morphologically-rich Languages, Language Acquisition, Generative Audio Models, Computational Creativity

# 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

#### 2017-current Associate Research Scientist

Human Language Technology Center of Excellence Johns Hopkins University, Baltimore, Maryland

## 2016–2017 Senior 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

#### 2012 Visiting Researcher

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

Advisor: Yuji Matsumoto

#### 2010 Research Intern

Microsoft Research, Redmond, WA

Advisor: Kristina Toutanova

#### 2008-2011 Research Assistant

Computer Science Department, University of Massachusetts Amherst

Advisors: Andrew McCallum and David A. Smith

## 2008 Google Summer of Code 2008

Project: Dependency Parsing in the Natural Language Toolkit

Advisors: Sebastian Riedel and Jason Baldridge

#### 2005-2006 Research Assistant

Psychology Department, State University of New York at Oswego

Advisors: Lin Qiu and Songmei Han

# 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, 2016

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] Eliminating Misinformation in Machine Reading with Aggregation Kurohashi-Kawahara-ken, Kyoto University, May 12th, 2017
- [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

#### Journal Publications

[1] Daniela Gerz, Ivan Vulić, Eduardo Ponti, Jason Naradowsky, Roi Reichart, and Anna Korhonen. Language modeling for morphologically rich languages: Character-aware modeling for word-level prediction. *Transactions of the Association for Computational* 

Linguistics, 2018.

Refereed Conference Proceedings

- [1] Rachel Rudinger, Jason Naradowsky, Brian Leonard, and Benjamin Van Durme. Gender bias in coreference resolution. In NAACL, 2018.
- [2] Matko Bosnjak, Tim Rocktäschel, Jason Naradowsky, and Sebastian Riedel. Programming with a differentiable forth interpreter. In *International Conference on Machine Learning (ICML)*, 2017.
- [3] Lucas Sterckx, Jason Naradowsky, Bill Byrne, Thomas Demeester, and Chris Develder. Break it down for me: A study in automated lyric annotation. In *Conference on Empirical Methods in Natural Language Processing (EMNLP)*, 2017.
- [4] 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.
- [5] 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.
- [6] 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.
- [7] Jason Naradowsky, Tim Vieira, and David A. Smith. Grammarless parsing for joint inference. In 24th International Conference on Computational Linguistics (COLING), Mumbai, India, 2012.
- [8] John Lee, Jason Naradowsky, and David Smith. A discriminative model for joint morphological disambiguation and dependency parsing. In Association for Computational Linguistics (ACL), 2011.
- [9] 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.
- [10] 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.
- [11] 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] Adam Poliak, Jason Naradowsky, Aparajita Haldar, Rachel Rudinger, and Benjamin Van Durme. Hypothesis only baselines in natural language inference. In *Proceedings of the 7th Joint Conference on Lexical and Computational Semantics*, \*SEM s2018, New Orleans, Louisiana, June 2018. Association for Computational Linguistics.

- [2] Jason Naradowsky and Sebastian Riedel. Modeling exclusion with a differentiable factor graph constraint. In Workshop on Deep Structured Prediction, International Conference on Machine Learning (ICML), 2017.
- [3] Matko Bošnjak, Tim Rocktäschel, Jason Naradowsky, and Sebastian Riedel. A neural forth abstract machine. In *Neural Abstract Machines & Program Induction (NAMPI)*, Barcelona, 2016.
- [4] Matko Bošnjak, Tim Rocktäschel, Jason Naradowsky, and Sebastian Riedel. A neural forth abstract machine. In *RNN Symposium*, Barcelona, 2016.
- [5] 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.
- [6] 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.
- [7] 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 Linguistics (NAACL), 2015.

## Professional Service

## Program Committee

- 2018 ACL, CoNLL, EMNLP, NAACL
- 2017 ACL, CoNLL, EACL, EMNLP, EthNLP, 1stDeepStructWS, LGNL
- 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

## Standing Reviewer

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: PyTorch, TensorFlow