# Sebastian Ruder

sebastianruder.com • ruder.sebastian@gmail.com +353 89 237 9192 • 9 New Bride Street • Dublin, Ireland

# Experience

• AYLIEN
Research Scientist

Dublin, Ireland
10/2015 – Present

 Developed aspect-based sentiment analysis (ABSA) endpoint<sup>1</sup> and created sentiment analysis on-par with state-of-the-art<sup>2</sup>.

 My current work focuses on developing efficient domain adaptation and semi-supervised learning algorithms as well as developing state-of-the-art models for applications such as stance detection and emotion detection.

• IBM Munich, Germany

Extreme Blue Intern, Watson

08/2015 - 09/2015

- Design and implementation of text analysis ML components applied to customer data of leading German insurance company *Versicherungskammer Bayern*; automatically identifies structural semantics and sentiment of incoming e-mails, e.g. complaints and classifies email based on reason for complaint.
- Pitched project to audience at European Expo and was chosen as one of eight teams to pitch to IBM customers; project was referred to as a "lighthouse project for Watson in Europe" by jury members.
- Project was awarded Digital Thought Leadership award in leading contest of German insurance industry by leading German newspaper Süddeutsche Zeitung and Google<sup>3</sup> and covered by Süddeutsche Zeitung<sup>4</sup>.

• Microsoft Dublin, Ireland

Linguistic Engineering Intern, XBox

02/2015 - 06/2015

- Contributed to developing an ML system for analyzing linguistic complexity of strings in C# for localization prioritization during testing; performed feature analysis and framed problem as anomaly detection.
- Created proof of concept and implemented morphology-based terminology validation algorithm.
- Evangelized customer sentiment analysis efforts, drove cross-team collaboration, and provided insights to stakeholders.

# • The OpenCog Foundation

Google Summer of Code Intern

opencog.org
Summer 2014

- Enabled system to make common-sense inferences using deductive reasoning, e.g. *All men are mortal. Socrates is a man.* → *Socrates is mortal.*
- Applied inference using probabilistic logic networks on the output of a relationship extractor.
- Documented and extended Python code for temporal inference.

#### Lingenio GmbH

Software Engineering Intern

Spring 2014

Heidelberg, Germany

- Created a converter from TBX to Lingenio native format and vice versa.
- Integrated TBX term bases in Dictionary Server; created localized web service using Jinja2, Flask-Babel, and lighttpd.

• SAP Walldorf, Germany

Working Student, Development University

02/2013 - 02/2014

- Created content for internal programming and Design Thinking courses.
- Automated reporting processes, e.g. reduced expenditure of work for monthly training report by > 75%,
   i.e. from 8 hours to 2 hour using Excel / VBA scripts.

• TEMIS

Freelancing Developer

Heidelberg, Germany
02/2013 – 10/2013

<sup>1</sup>https://developer.aylien.com/text-api-demo?tab=absa

<sup>&</sup>lt;sup>2</sup>https://developer.aylien.com/text-api-demo?tab=sentiment

 $<sup>^3 \</sup>texttt{https://www.sv-veranstaltungen.de/site/fachbereiche/versicherungs-leuchtturm}$ 

 $<sup>^4</sup>$ http://www.sueddeutsche.de/wirtschaft/kuenstliche-intelligenz-aerger-fuer-watson-1.2772927

 Created a cosine metric-based word sense disambiguation system leveraging text extracted from Wikipedia and DBpedia dumps; achieved performance comparable to the state-of-the-art.

#### Education

#### • National University of Ireland

Galway, Ireland

College of Engineering and Informatics, Ph.D. Natural Language Processing

10/2015 - Present

 I am interested in creating methods that allow efficient adaptation to novel domains and tasks in realworld scenarios. My research areas are domain adaptation, transfer learning, and multi-task learning for Natural Language Processing.

# • University of Copenhagen

Copenhagen, Denmark

Natural Language Processing Group, Department of Computer Science

04/2017 - 06/2017

- Research visit invited by Anders Søgaard.
- Research on multi-task learning, cross-lingual and cross-domain learning.

#### • Ruprecht-Karls-Universität Heidelberg

Heidelberg, Germany

Institute of Computational Linguistics, B.A. Computational Linguistics, English Linguistics

10/2012 - 09/2015

- Final grade: 1.0 (German scale), i.e. GPA 4.0; thesis: Construction and Analysis of an Emotion Proposition Store
- Relevant courses: Statistics, Algorithms and Data Structures, Machine Learning, Formal Syntax & Semantics
- Relevant online courses: Machine Learning (Stanford), AI (MIT), Into to Algorithms (Berkeley), Deep Learning for NLP (Stanford), Deep Learning (Oxford)

• Trinity College

Dublin, Ireland

School of Computer Science and Statistics, Computer Science and Language

09/2014 - 01/2015

- Semester abroad
- relevant courses: AI, Fuzzy Logic, High-Tech Entrepreneurship

# **Awards**

• Scholarship of the Irish Research Council

10/2015 – Present

• Cusanuswerk scholarship of the German state

04/2014 - 09/2015

Microsoft Certified Professional (Programming in C#)

06/2015

• Best Delegate award in various Model United Nations conferences

11/2012 - 01/2014

## Languages and Technologies

Programming Languages: Python, Java, C#, R, C, LATEX, Prolog, JavaScript, SPARQL

**Technologies:** SciPy, NumPy, Keras, TensorFlow, DyNet, scikit-learn, NLTK, CoreNLP, MALLET, Weka, UNIX, Git

**Natural Languages:** Fluent in German and English, advanced in French and Spanish, beginner in Portuguese and Latin

**Open Source Contributions:** The OpenCog Foundation

# Other activities

#### • Natural Language Processing Dublin organizer

08/2016 - Present

 Organized 7 events so far. Meetup<sup>5</sup> has 450+ members and connects students, researchers, and industry professionals.

 $<sup>^5</sup>$ https://www.meetup.com/NLP-Dublin/

### **Publications**

- 1. Sebastian Ruder, Barbara Plank (2017). Learning to select data for transfer learning with Bayesian Optimization. In *Proceedings of the 2017 Conference on Empirical Methods in Natural Language Processing*, Copenhagen, Denmark
- 2. Sebastian Ruder (2017). An Overview of Multi-Task Learning in Deep Neural Networks. arXiv preprint arXiv:1706.05098.
- 3. Sebastian Ruder (2017). A survey of cross-lingual embedding models. arXiv preprint arXiv:1706.04902.
- 4. Sebastian Ruder, Joachim Bingel, Isabelle Augenstein, Anders Søgaard (2017). Sluice networks: Learning what to share between loosely related tasks. arXiv preprint arXiv:1705.08142.
- 5. Sebastian Ruder, Parsa Ghaffari, John G. Breslin (2017). Data Selection Strategies for Multi-Domain Sentiment Analysis. arXiv preprint arXiv:1702.02426.
- 6. Sebastian Ruder, Parsa Ghaffari, John G. Breslin (2017). Knowledge Adaptation: Teaching to Adapt. arXiv preprint arXiv:1702.02052.
- 7. Sebastian Ruder, Parsa Ghaffari, John G. Breslin (2016). Towards a continuous modeling of natural language domains. In *Proceedings of EMNLP 2016 Workshop on Uphill Battles in Language Processing: Scaling Early Achievements to Robust Methods*, pages 53-57, Austin, Texas, US.
- 8. Sebastian Ruder, Parsa Ghaffari, John G. Breslin (2016). A Hierarchical Model of Reviews for Aspect-based Sentiment Analysis. In *Proceedings of the 2016 Conference on Empirical Methods in Natural Language Processing*, pages 999–1005, Austin, Texas, US.
- 9. Ian D. Wood and Sebastian Ruder (2016). Emoji as emotion tags for tweets. In *Emotion and Sentiment Analysis Workshop*, LREC, Portorož, Slovenia.
- 10. Sebastian Ruder, Peiman Barnaghi, John G. Breslin (2016). Analysis and Applications of a Novel Corpus of Influencers on Twitter. In *Twitter for Research Conference*, Galway, Ireland.
- 11. Sebastian Ruder, Parsa Ghaffari, John G. Breslin (2016). INSIGHT-1 at SemEval-2016 Task 4: Convolutional Neural Networks for Sentiment Classification and Quantification. In *Proceedings of the 10th International Workshop on Semantic Evaluation (SemEval 2016)*, San Diego, US.
- 12. Sebastian Ruder, Parsa Ghaffari, John G. Breslin (2016). INSIGHT-1 at SemEval-2016 Task 5: Convolutional Neural Networks for Multilingual Aspect-based Sentiment Analysis. In *Proceedings of the 10th International Workshop on Semantic Evaluation (SemEval 2016)*, San Diego, US.
- 13. Sebastian Ruder (2016). An overview of gradient descent optimization algorithms. arXiv preprint arXiv:1609.04747.

# **Talks**

- Natural Language Processing Copenhagen Meetup Talk, May 2017: Transfer Learning for NLP<sup>6</sup>
- Accenture Tech Talk, March 2017: Transfer Learning The Next Frontier for Machine Learning
- LinkedIn Tech Talk, March 2017: Transfer Learning The Next Frontier for Machine Learning<sup>7</sup>
- NLP Dublin meetup, December 2016: NIPS 2016 Highlights<sup>8</sup>
- INSIGHT SIG NLP meetup, August 2016: A Hierarchical Model of Reviews for Aspect-based Sentiment Analvsis<sup>9</sup>
- NLP Dublin meetup, August 2016: Softmax Approximations for Learning Word Embeddings and Language Modelling<sup>10</sup>

 $<sup>^6</sup>$ https://www.slideshare.net/SebastianRuder/transfer-learning-for-natural-language-processing

 $<sup>^{7}</sup> https://www.slideshare.net/SebastianRuder/transfer-learning-the-next-frontier-for-machine-learning$ 

<sup>8</sup>http://www.slideshare.net/SebastianRuder/nips-2016-highlights-sebastian-ruder

<sup>9</sup>http://www.slideshare.net/SebastianRuder/a-hierarchical-model-of-reviews-for-aspectbased-sentiment-analysis

 $<sup>^{10}</sup>$ http://www.slideshare.net/SebastianRuder/softmax-approximations-for-learning-word-embeddings-and-language-modeling-sebastian-ru