

# WILKER FERREIRA AZIZ

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## EDUCATION

2010–2014

### **Ph.D. Computational Linguistics**

Research Institute in Information and Language Processing University of Wolverhampton

**Thesis:** Exact Sampling and Optimisation in Statistical Machine Translation

**Supervisors:** Dr. Lucia Specia (University of Sheffield)

Dr. Marc Dymetman (Xerox Research Centre in Europe)

Prof. Dr. Ruslan Mitkov (University of Wolverhampton)

**Summary:** In statistical machine translation, inference is performed over a high-complexity discrete distribution defined by the intersection between a translation hypergraph and a target language model. This distribution is too complex to be represented exactly and one typically resorts to approximation techniques either to perform optimisation – the task of searching for the optimum translation derivation – or sampling – the task of finding a subset of translation derivations that is statistically representative of the goal distribution. This thesis introduces an approach to exact optimisation and sampling based on a form of adaptive rejection sampling. In this view, the intractable goal distribution is upperbounded by a simpler, thus tractable, proxy distribution which is then incrementally refined to be closer to the goal until the maximum is found, or until the sampling performance exceeds a certain level.

2005–2010

### **B.Sc. Computer Engineering (overall mark 83/100)**

Escola de Engenharia de São Carlos - Universidade Estadual de São Paulo (USP)

**Monograph:** Lexical Substitution for Statistical Machine Translation

**Summary:** I proposed a context model based on word co-occurrence to perform cross-language lexical substitution. I used passive-aggressive supervised learning to fit a linear model to rank translation alternatives in context. The results of this work were reported in the Cross-Language Lexical Substitution Task at SemEval-2010.

**Research experience:** I spent one year (from March 2009 to February 2010) at the Xerox Research Centre in Europe (Grenoble, France) where I worked on the use of context models and textual entailment to handle out-of-vocabulary words in SMT. My project was supervised by Dr. Marc Dymetman and funded by the Pascal-2 European Network of Excellence.

## EMPLOYMENT

- 01/2015–present      **Research Associate, Institute for Logic, Language and Computation, Universiteit van Amsterdam, Netherlands**  
**Summary:** I am joining the Statistical Language Processing and Learning Lab led by Professor Khalil Sima'an in January 2015.
- 11/2013–12/2014      **Research Associate, Department of Computer Science, University of Sheffield, UK**  
**Summary:** My work was funded by EPSRC under the MODIST (MOdelling DIscourse in Statistical Translation) project led by Dr. Lucia Specia. Discourse information typically requires nonlocal forms of parameterisation that go beyond the narrow context window managed by traditional decoders (such as required by a finite-state language model). I developed better decoding algorithms for SMT aiming at incorporating wider dependencies, particularly, I worked on a lazy incorporation of nonlocal parameterisation using a form of adaptive rejection sampling.
- 08/2013–12/2013      **Internship, Xerox Research Centre Europe (XRCE), Grenoble, France**  
**Summary:** I worked with the Machine Learning for Document Access and Translation group under supervision of Dr. Marc Dymetman and Dr. Sriram Venkatapathy on developing an exact decoder/sampler for phrase-based SMT. Exact inference is achieved with the OS\* algorithm (a technique previously developed at Xerox), a form of adaptive rejection sampling that can also be used for optimisation.
- 03/2010–06/2010      **Tutoring, Instituto de Ciências Matemáticas e de Computação - USP**  
**Summary:** I gave weekly tutoring sessions on Automata Theory, Formal Language and Theory of Computation to computer science undergraduates.
- 03/2009–02/2010      **Internship, Xerox Research Centre Europe (XRCE), Grenoble, France**  
**Summary:** I worked with the Cross-Language Technologies group under supervision of Dr. Marc Dymetman and Dr. Lucia Specia on the use of context models and textual entailment to improve statistical machine translation coverage and quality. My project on “Context Models for Textual Entailment and their Application to Statistical Machine Translation” was part of a project funded by Pascal-2 European Network of Excellence and it was granted the first prize of the September 2009’s XRCE Intern’s Day.
- 07/2006–12/2006      **Tutoring, Instituto de Ciências Matemáticas e de Computação - USP**  
**Summary:** I gave weekly tutoring sessions on Linear Algebra and Ordinary Differential Equations for computer science and chemistry undergraduates.

## RESEARCH INTERESTS

Automata theory and formal languages, machine learning (particularly for structured prediction). NLP applications such as machine translation, parsing and paraphrasing.

## RESEARCH AND TECHNICAL SKILLS

Some experience in teaching statistical machine translation to postgraduate students.

Experience in research and development of SMT algorithms, e.g. grammar extraction (via pattern matching) and decoding (optimisation and sampling), MT evaluation as well as other NLP applications such as sentence- and word-alignment, word-sense disambiguation, lexical substitution and paraphrasing through pivoting.

Experience in exploiting machine learning techniques to model natural language tasks such as named-entity recognition and semantic role labelling.

**Programming languages:** C/C++, Python, Perl, Java.

**Code:** github (wilkeraziz), bitbucket (wilkeraziz)

**Language skills:** Portuguese (native), English (fluent) and French (basic).

## AWARDS AND SCHOLARSHIPS

RILP (UK) PhD scholarship (10/2010–10/2013)

XRCE best internship award (09/2009)

FAPESP (Brazil) scientific initiation scholarship (02/2008–02/2009)

FAPESP (Brazil) scientific initiation scholarship (01/2007–01/2008)

## TALKS

- 04/2014      Invited talk, University of Amsterdam, Amsterdam, The Netherlands  
**Title:** Exact Inference for Statistical Machine Translation  
**Summary:** In this presentation I talk about exact decoding and unbiased sampling for hierarchical and phrase-based SMT based on a coarse-to-fine strategy. In this view the intractable intersection between the translation forest and the language model is replaced by a simpler, thus tractable, intersection with a lower-order upperbound on the true LM distribution. The resulting distribution is then incrementally refined in an adaptive rejection sampling fashion.
- 05/2013      Invited talk, University of Sheffield, Sheffield, UK  
**Title:** Exact Optimisation and Sampling for Statistical Machine Translation  
**Summary:** Preliminary findings of my PhD where I present the OS\* algorithm (Dymetman et al, 2012) and how this algorithm can be used to perform exact optimisation and sampling for SMT.
- 09/2011      Tutorial, RANLP, Hissar, Bulgaria  
**Summary:** Together with Lucia Specia I gave a 3-hour tutorial on SMT.
- 10/2011      Invited Talk, Universidade de São Paulo, São Carlos, Brazil  
**Title:** Improving Chunk-based Semantic Role Labelling with Lexical Features  
**Summary:** Findings of my investigation on improving semantic role labelling by using lexical features published at RANLP-2011.
- 01/2010      Invited talk, University of Wolverhampton, Wolverhampton, UK  
**Title:** Learning an Expert from Human Annotations in Statistical Machine Translation: the Case of Out-of-Vocabulary Words  
**Summary:** Findings of the work I developed at XRCE on handling unknown words using Textual Entailment and incorporating an expert model into a standard SMT system.

## PUBLICATIONS

- [1] Aziz, W., Dymetman, M., and Specia, L., Exact decoding for phrase-based statistical machine translation, in *Proceedings of the 2014 Conference on Empirical Methods in Natural Language Processing (EMNLP)*, pages 1237–1249, Doha, Qatar, 2014, Association for Computational Linguistics.
- [2] Aziz, W. F., *Exact Sampling and Optimisation in Statistical Machine Translation*, PhD thesis, University of Wolverhampton, 2014.
- [3] Aziz, W., Koponen, M., and Specia, L., Sub-sentence level analysis of machine translation post-editing effort, in *Post-editing of Machine Translation: Processes and Applications*, edited by O’Brien, S., Balling, L. W., Carl, M., Simard, M., and Specia, L., chapter 8, Cambridge Scholars Publishing, 2014.
- [4] Aziz, W., Dymetman, M., and Venkatapathy, S., Investigations in exact inference for hierarchical translation, in *Proceedings of the Eighth Workshop on Statistical Machine Translation*, pages 472–483, Sofia, Bulgaria, 2013, Association for Computational Linguistics.
- [5] Aziz, W. and Specia, L., Multilingual wsd-like constraints for paraphrase extraction, in *Proceedings of the Seventeenth Conference on Computational Natural Language Learning*, pages 202–211, Sofia, Bulgaria, 2013, Association for Computational Linguistics.

- [6] Aziz, W., Mitkov, R., and Specia, L., Ranking machine translation systems via post-editing, in *In Proceedings of Text, Speech and Dialogue (TSD)*, volume 8082 of *Lecture Notes in Computer Science*, pages 410–418, Pilsen, Czech Republic, 2013, Springer Berlin Heidelberg.
- [7] Maarit Koponen, Wilker Aziz, L. R. and Specia, L., Post-editing time as a measure of cognitive effort, in *AMTA 2012 Workshop on Post-Editing Technology and Practice (WPTP 2012)*, pages 11–20, San Diego, USA, 2012, Association for Machine Translation in the Americas (AMTA).
- [8] Rios, M., Aziz, W., and Specia, L., UOW: Semantically informed text similarity, in *\*SEM 2012: The First Joint Conference on Lexical and Computational Semantics – Volume 1: Proceedings of the main conference and the shared task, and Volume 2: Proceedings of the Sixth International Workshop on Semantic Evaluation (SemEval 2012)*, pages 673–678, Montréal, Canada, 2012, Association for Computational Linguistics.
- [9] Aziz, W., de Sousa, S. C. M., and Specia, L., PET: a tool for post-editing and assessing machine translation, in *Proceedings of the Eight International Conference on Language Resources and Evaluation (LREC'12)*, Istanbul, Turkey, 2012, European Language Resources Association (ELRA).
- [10] Aziz, W. and Specia, L., PET: a tool for post-editing and assessing machine translation, in *The 16th Annual Conference of the European Association for Machine Translation, EAMT '12*, page 99, Trento, Italy, 2012.
- [11] Aziz, W., de Sousa, S. C. M., and Specia, L., Cross-lingual sentence compression for subtitles, in *The 16th Annual Conference of the European Association for Machine Translation, EAMT '12*, pages 103–110, Trento, Italy, 2012.
- [12] Specia, L., Hajlaoui, N., Hallett, C., and Aziz, W., Predicting machine translation adequacy, in *Proceedings of the 13th Machine Translation Summit*, pages 513–520, Xiamen, China, 2011.
- [13] Aziz, W., Rios, M., and Specia, L., Shallow semantic trees for smt, in *Proceedings of the Sixth Workshop on Statistical Machine Translation*, pages 316–322, Edinburgh, Scotland, 2011, Association for Computational Linguistics.
- [14] Rios, M., Aziz, W., and Specia, L., TINE: A metric to assess mt adequacy, in *Proceedings of the Sixth Workshop on Statistical Machine Translation*, pages 116–122, Edinburgh, Scotland, 2011, Association for Computational Linguistics.
- [15] Aziz, W., Rios, M., and Specia, L., Improving chunk-based semantic role labeling with lexical features, in *Proceedings of the International Conference Recent Advances in Natural Language Processing 2011*, pages 226–232, Hissar, Bulgaria, 2011, RANLP 2011 Organising Committee.
- [16] de Sousa, S. C. M., Aziz, W., and Specia, L., Assessing the post-editing effort for automatic and semi-automatic translations of DVD subtitles, in *Proceedings of the International Conference Recent Advances in Natural Language Processing 2011*, pages 97–103, Hissar, Bulgaria, 2011, RANLP 2011 Organising Committee.
- [17] Aziz, W. and Specia, L., Fully automatic compilation of a Portuguese-English parallel corpus for statistical machine translation, in *Proceedings of the 8th Brazilian Symposium in Information and Human Language Technology*, Cuiabá, MT, 2011.
- [18] Aziz, W. et al., Learning an expert from human annotations in statistical machine translation: the case of out-of-vocabulary words, in *14th Annual Conference of the European Association for Machine Translation, EAMT '10*, pages 28–35, Saint-Raphael, France, 2010.
- [19] Aziz, W. and Specia, L., USPwlv and WLVuep: Combining dictionaries and contextual information for cross-lingual lexical substitution, in *Proceedings of the 5th International Workshop on Semantic Evaluation, SemEval '10*, pages 117–122, Stroudsburg, PA, USA, 2010, Association for Computational Linguistics.

## PATENTS

U.S. Patent Application Filing: SAMPLING AND OPTIMIZATION IN PHRASED-BASED MACHINE TRANSLATION USING AN ENRICHED LANGUAGE MODEL REPRESENTATION

Inventor(s): Marc Dymetman; Wilker Aziz; Sriram Venkatapathy

U.S. Ser. No.: 13/750,338

Filed on: 01/25/2013

U.S. Patent Application Filing: DYNAMIC BI-PHRASES FOR STATISTICAL MACHINE TRANSLATION  
Inventor(s): Marc Dymetman; Wilker Aziz; Nicola Cancedda; Jean-Marc Coursimault; Vassilina Nikoulina;  
Lucia Specia.  
U.S. Ser. No.: 12/780,040  
Filed on: 05/20/2010