

# ACL 2007

## **Proceedings of the Second Workshop** on Statistical Machine Translation

June 23, 2007 Prague, Czech Republic



The Association for Computational Linguistics

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## Preface

The ACL 2007 Workshop on Statistical Machine Translation (WMT-07) took place on Saturday, June 23 in Prague, Czech Republic, immediately preceding the annual meeting of the Association for Computational Linguistics, which was hosted by Charles University. This was the second time this workshop had been held, following the first workshop at the 2006 HLT-NAACL conference. But its ancestry can be traced back farther to the ACL 2005 Workshop on Building and Using Parallel Texts (when we started our evaluation campaign on European languages), and even the ACL 2001 Workshop on Data-Driven Machine Translation (which was the first ACL workshop mostly directed at statistical machine translation).

Over the last years, interest in statistical machine translation has been risen dramatically. We received an overwhelming number of full paper submission for a one-day workshop, 38 in total. Given our limited capacity, we were only able to accept 12 full papers for oral presentation and 9 papers for poster presentation, an acceptance rate of 55%. In a second poster session, 16 additional shared task papers were presented. The workshop also featured an invited talk by Jean Senellart of SYSTRAN Language Translation Technology, Paris.

Prior to the workshop, in addition to soliciting relevant papers for review and possible presentation we conducted a shared task that brought together machine translation systems for an evaluation on previously unseen data. This year's task resembled the shared tasks of previous years in many ways. Its focus was again the translation of European languages, using a relatively large training corpus. This year, we included a variety of manual evaluations of the MT systems' outputs, and a variety of automated evaluation metrics. Also, as a special challenge this year, we posed the problem of domain adaptation.

The results of the shared task were announced at the workshop, and these proceedings also include an overview paper for the shared task that summarizes the results, as well as provides information about the data used and any procedures that were followed in conducting or scoring the task. In addition, there are short papers from each participating team that describe their underlying system in some detail.

We would like to thank the members of the Program Committee for their timely reviews. We also would like to thank the participants of the shared task, the participants of the MT Marathon, which was organized by the University of Edinburgh in March this year, and all the other volunteers who helped with the manual evaluations. We also acknowledge financial support for the manual evaluation by the EuroMatrix project (funded by the European Commission under the Framework Programme 6).

Chris Callison-Burch, Philipp Koehn, Christof Monz, and Cameron Shaw Fordyce

**Co-Organizers** 

## Organizers

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Chris Callison-Burch (Johns Hopkins University) Philipp Koehn (University of Edinburgh) Christof Monz (Queen Mary, University of London) Cameron Shaw Fordyce (Center for the Evaluation of Language and Communication Technologies)

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Jean Senellart (SYSTRAN Language Translation Technology, Paris)

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Additional Reviewers: Joshua Albrecht, Marine Carpuat, Hirofumi Yamamoto, and Keiji Yasuda.

## **Table of Contents**

Using Dependency Order Templates to Improve Generality in Translation Arul Menezes and Chris Quirk1
CCG Supertags in Factored Statistical Machine Translation Alexandra Birch, Miles Osborne and Philipp Koehn9
Integration of an Arabic Transliteration Module into a Statistical Machine Translation System Mehdi M. Kashani, Eric Joanis, Roland Kuhn, George Foster and Fred Popowich
Exploring Different Representational Units in English-to-Turkish Statistical Machine Translation         Kemal Offazer and Ilknur Durgar El-Kahlout         25
Can We Translate Letters? David Vilar, Jan-Thorsten Peter and Hermann Ney
A Dependency Treelet String Correspondence Model for Statistical Machine Translation Deyi Xiong, Qun Liu and Shouxun Lin
Word Error Rates: Decomposition over POS classes and Applications for Error Analysis           Maja Popovic and Hermann Ney         48
Speech-Input Multi-Target Machine Translation           Alicia Pérez, M. Teresa González, M. Inés Torres and Francisco Casacuberta           56
Meta-Structure Transformation Model for Statistical Machine Translation         Jiadong Sun, Tiejun Zhao and Huashen Liang
Training Non-Parametric Features for Statistical Machine Translation         Patrick Nguyen, Milind Mahajan and Xiaodong He         72
Using Word-Dependent Transition Models in HMM-Based Word Alignment for Statistical Machine Trans- lation
Xiaodong He
<i>Efficient Handling of N-gram Language Models for Statistical Machine Translation</i> Marcello Federico and Mauro Cettolo
Human Evaluation of Machine Translation Through Binary System ComparisonsDavid Vilar, Gregor Leusch, Hermann Ney and Rafael E. Banchs96
Labelled Dependencies in Machine Translation Evaluation Karolina Owczarzak, Josef van Genabith and Andy Way
An Iteratively-Trained Segmentation-Free Phrase Translation Model for Statistical Machine Translation Robert Moore and Chris Quirk

Using Paraphrases for Parameter Tuning in Statistical Machine Translation Nitin Madnani, Necip Fazil Ayan, Philip Resnik and Bonnie Dorr
Mixture-Model Adaptation for SMT         George Foster and Roland Kuhn         128
(Meta-) Evaluation of Machine Translation Chris Callison-Burch, Cameron Fordyce, Philipp Koehn, Christof Monz and Josh Schroeder136
Context-aware Discriminative Phrase Selection for Statistical Machine Translation Jesús Giménez and Lluís Màrquez
Ngram-Based Statistical Machine Translation Enhanced with Multiple Weighted Reordering Hypotheses Marta R. Costa-jussià, Josep M. Crego, Patrik Lambert, Maxim Khalilov, José A. R. Fonollosa, José B. Mario and Rafael E. Banchs
Analysis of Statistical and Morphological Classes to Generate Weigthed Reordering Hypotheses on a Statistical Machine Translation System Marta R. Costa-jussià and José A. R. Fonollosa
Domain Adaptation in Statistical Machine Translation with Mixture Modelling         Jorge Civera and Alfons Juan       177
Getting to Know Moses: Initial Experiments on German-English Factored Translation Maria Holmqvist, Sara Stymne and Lars Ahrenberg
<i>NRC's PORTAGE System for WMT 2007</i> Nicola Ueffing, Michel Simard, Samuel Larkin and Howard Johnson
Building a Statistical Machine Translation System for French Using the Europarl Corpus         Holger Schwenk         189
Multi-Engine Machine Translation with an Open-Source SMT Decoder         Yu Chen, Andreas Eisele, Christian Federmann, Eva Hasler, Michael Jellinghaus and         Silke Theison       193
<i>The ISL Phrase-Based MT System for the 2007 ACL Workshop on Statistical Machine Translation</i> Matthias Paulik, Kay Rottmann, Jan Niehues, Silja Hildebrand and Stephan Vogel
Rule-Based Translation with Statistical Phrase-Based Post-Editing         Michel Simard, Nicola Ueffing, Pierre Isabelle and Roland Kuhn         203
The "Noisier Channel": Translation from Morphologically Complex Languages      Christopher J. Dyer
UCB System Description for the WMT 2007 Shared Task Preslav Nakov and Marti Hearst

The Syntax Augmented MT (SAMT) System at the Shared Task for the 2007 ACL Workshop on Statistical Machine Translation
Andreas Zollmann, Ashish Venugopal, Matthias Paulik and Stephan Vogel
Statistical Post-Editing on SYSTRAN's Rule-Based Translation System         Loïc Dugast, Jean Senellart and Philipp Koehn       220
<i>Experiments in Domain Adaptation for Statistical Machine Translation</i> Philipp Koehn and Josh Schroeder
METEOR: An Automatic Metric for MT Evaluation with High Levels of Correlation with Human Judg- ments Alon Lavie and Abhaya Agarwal
English-to-Czech Factored Machine Translation         Ondřej Bojar.
Sentence Level Machine Translation Evaluation as a Ranking           Yang Ye, Ming Zhou and Chin-Yew Lin
Localization of Difficult-to-Translate Phrases Behrang Mohit and Rebecca Hwa
Linguistic Features for Automatic Evaluation of Heterogenous MT Systems Jesús Giménez and Lluís Màrquez

## **Conference Program**

### Saturday, June 23, 2007

8:30-8:35	Opening Remarks
	Full Paper Session 1
8:35–8:55	Using Dependency Order Templates to Improve Generality in Translation Arul Menezes and Chris Quirk
8:55–9:15	CCG Supertags in Factored Statistical Machine Translation Alexandra Birch, Miles Osborne and Philipp Koehn
9:15–9:35	Integration of an Arabic Transliteration Module into a Statistical Machine Transla- tion System Mehdi M. Kashani, Eric Joanis, Roland Kuhn, George Foster and Fred Popowich
9:35–9:55	Exploring Different Representational Units in English-to-Turkish Statistical Ma- chine Translation Kemal Oflazer and Ilknur Durgar El-Kahlout
9:55–10:15	<i>Can We Translate Letters?</i> David Vilar, Jan-Thorsten Peter and Hermann Ney
	Poster Session for Full Papers
10:15-10:45	Boaster session for full paper posters
10:45-11:45	Coffee break + full paper poster session
	A Dependency Treelet String Correspondence Model for Statistical Machine Trans- lation Deyi Xiong, Qun Liu and Shouxun Lin
	Word Error Rates: Decomposition over POS classes and Applications for Error

*Analysis* Maja Popovic and Hermann Ney

*Speech-Input Multi-Target Machine Translation* Alicia Pérez, M. Teresa González, M. Inés Torres and Francisco Casacuberta

#### Saturday, June 23, 2007 (continued)

*Meta-Structure Transformation Model for Statistical Machine Translation* Jiadong Sun, Tiejun Zhao and Huashen Liang

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Using Word-Dependent Transition Models in HMM-Based Word Alignment for Statistical Machine Translation Xiaodong He

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*Labelled Dependencies in Machine Translation Evaluation* Karolina Owczarzak, Josef van Genabith and Andy Way

#### **Invited Talk**

11:45–12:30 Invited Talk by Jean Senellart, Systran

#### Lunch

#### **Full Paper Session 2**

- 14:00–14:20 An Iteratively-Trained Segmentation-Free Phrase Translation Model for Statistical Machine Translation Robert Moore and Chris Quirk
- 14:20–14:40 Using Paraphrases for Parameter Tuning in Statistical Machine Translation Nitin Madnani, Necip Fazil Ayan, Philip Resnik and Bonnie Dorr
- 14:40–15:00 *Mixture-Model Adaptation for SMT* George Foster and Roland Kuhn

#### Saturday, June 23, 2007 (continued)

#### **Shared Task**

- 15:00–15:15 (Meta-) Evaluation of Machine Translation Chris Callison-Burch, Cameron Fordyce, Philipp Koehn, Christof Monz and Josh Schroeder
- 15:15–15:45 Boaster session for shared task posters
- 15:45–16:45 Coffee break + shared task poster session

*Context-aware Discriminative Phrase Selection for Statistical Machine Translation* Jesús Giménez and Lluís Màrquez

#### Ngram-Based Statistical Machine Translation Enhanced with Multiple Weighted Reordering Hypotheses

Marta R. Costa-jussià, Josep M. Crego, Patrik Lambert, Maxim Khalilov, José A. R. Fonollosa, José B. Mario and Rafael E. Banchs

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METEOR: An Automatic Metric for MT Evaluation with High Levels of Correlation with Human Judgments Alon Lavie and Abhaya Agarwal

#### **Full Paper Session 4**

- 16:45–17:05 *English-to-Czech Factored Machine Translation* Ondřej Bojar
- 17:05–17:25 *Sentence Level Machine Translation Evaluation as a Ranking* Yang Ye, Ming Zhou and Chin-Yew Lin
- 17:25–17:45 *Localization of Difficult-to-Translate Phrases* Behrang Mohit and Rebecca Hwa
- 17:45–18:05 *Linguistic Features for Automatic Evaluation of Heterogenous MT Systems* Jesús Giménez and Lluís Màrquez