#### **COLING 2012**

## 24th International Conference on Computational Linguistics

## Proceedings of the Workshop on Reordering for Statistical Machine Translation

Workshop chairs: Karthik Visweswariah, Ananthakrishnan Ramanathan and Mitesh M. Khapra

> 9 December 2012 Mumbai, India

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Proceedings of the Workshop on Reordering for Statistical Machine Translation Karthik Visweswariah, Ananthakrishnan Ramanathan and Mitesh M. Khapra (eds.)

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#### Preface

Statistical Machine Translation (SMT) is currently a very active area of research. Top NLP conferences typically include many papers on SMT, and the past decade has also seen many workshops on this topic (e.g., WMT, SSST). Results reported in papers on SMT include the influence of various components and processes, one of the most important of these being reordering (except for structurally similar language pairs like English-French). Traditional phrase-based SMT systems, which have been the state-of-the-art in the previous decade, do not handle reordering in a satisfactory manner, and various new and more sophisticated methods for reordering have been introduced in the past couple of years. However, unlike most other potential components of MT systems, such as transliteration, WSD, and anaphora resolution, reordering has not had a dedicated forum for its evaluation. The proposed workshop will be a platform to bring together different MT systems and compare how they tackle this crucial subtask.

A shared task on "learning reordering from word-alignments" will be at the heart of this workshop. Parser-based reordering has been a popular method, but many languages do not have parsers (e.g., no Indian language has a publicly available parser), and using alignments to learn parsers (and thereafter reordering) or to learn reordering models directly is an important new idea in MT. The task is to develop a system for reordering a source sentence to best match the order of the corresponding target sentence. For example, the English (SVO language) sentence "Ram drinks water" is translated into Hindi (SOV language) as "Ram paanii piitaa hai (Ram water drinks)". Thus, the correct reordering of this English sentence which matches the target (Hindi) order is "Ram water drinks".

We released high-quality word-alignments (annotated by hand) between English and 3 languages (Farsi, Italian and Urdu), and described one or two baseline techniques for reordering based on publicly available tools (such as GIZA++, Moses). We also made available part-of-speech tags for this data to enable participants to experiment with these additional features easily. The participants have to reorder the English sentences to match the order of the target language. Participants can choose either to come up with their own reordering models or tweak the baseline system to improve performance.

#### Workshop Chairs

Mitesh M. Khapra, IBM Research India Ananthakrishnan Ramanathan, IBM Research India Karthik Visweswariah, IBM Research India

## Organizers:

Mitesh M. Khapra (IBM Research India) Ananthakrishnan Ramanathan (IBM Research India) Karthik Visweswariah (IBM Research India)

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# Workshop on Reordering for Statistical Machine Translation Program

### Sunday, 9 December 2012

14:30–15:30	Invited talk: A survey of reordering for MT with a focus on pre-ordeing Karthik Visweswariah, IBM Research India
15:30–15:40	Introduction to the shared task Whitepaper for Shared Task on Learning Reordering from Word Alignments at RSMT 2012 Report of the Shared Task on Learning Reordering from Word Alignments at RSMT 2012
15:40–16:10	A Tagging-style Reordering Model for Phrase-based SMT Minwei Feng and Hermann Ney
16:10–16:30	Building a reordering system using tree-to-string hierarchical model Jacob Dlougach and Irina Galinskaya
16:30–17:00	Tea break
17:00–17:20	Learning Improved Reordering Models for Urdu, Farsi and Italian using SMT Rohit Gupta, Raj Nath Patel and Ritesh Shah
17:20–17:40	Partially modelling word reordering as a sequence labelling problem Anoop Kunchukuttan and Pushpak Bhattacharyya
17:40–18:00	Concluding remarks by workshop chairs