COLING 2012

# 24th International Conference on Computational Linguistics

# Proceedings of the Second Workshop on Applying Machine Learning Techniques to Optimise the Division of Labour in Hybrid MT

Workshop chairs: Josef van Genabith, Toni Badia, Christian Federmann, Maite Melero, Marta R. Costa-jussà and Tsuyoshi Okita

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## Message from the Workshop organisers

We are delighted to welcome you to the of the Second Workshop on Applying Machine Learning Techniques to Optimise the Division of Labour in Hybrid MT and associated Shared Task (ML4HMT-2012) in Mumbai.

The Shared Task is an effort to trigger systematic investigation on improving state-of-the-art Hybrid MT, using advanced machine-learning (ML) methodologies. Its main focus is trying to answer the following question: *Can Hybrid/System Combination MT techniques benefit from extra information (linguistically motivated, decoding and runtime) from the different systems involved?* 

Participants to the challenge are requested to build hybrid translations by combining the output of several MT systems of different types. Five participating combination systems, each following a different solution strategy, have been submitted to the shared task.

The Workshop will be composed of two parts. In the first part we will have an invited talk and the presentation of three research papers. In the second part, participants to the shared task will describe their systems and results. At the end of this part, there will be a presentation of the joint evaluation, followed by a discussion panel.

We are looking forward to an interesting workshop and want to thank all authors, presenters and attendees for making this a successful workshop.

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## Second Workshop on Applying Machine Learning Techniques to Optimise the Division of Labour in Hybrid MT

## Program

#### Saturday, 15 December 2012

| 09:00-09:15 | Josef van Genabith — Welcome and introductory remarks   |
|-------------|---|
| 09:15–09:40 | Hybrid Adaptation of Named Entity Recognition for Statistical Machine Translation<br>Vassilina Nikoulina, Agnes Sandor and Marc Dymetman  |
| 09:40–10:05 | Confusion Network Based System Combination for Chinese Translation Output:<br>Word-Level or Character-Level?<br>Maoxi Li and MingWen Wang   |
| 10:05–10:30 | Using Cross-Lingual Explicit Semantic Analysis for Improving Ontology Translation<br>Kartik Asooja, Jorge Gracia, Nitish Aggarwal and Asunción Gómez Pérez  |
| 10:30–10:50 | System Combination with Extra Alignment Information<br>Xiaofeng Wu, Tsuyoshi Okita, Josef van Genabith and Qun Liu  |
| 10:50–11:10 | <i>Topic Modeling-based Domain Adaptation for System Combination</i><br>Tsuyoshi Okita, Antonio Toral and Josef van Genabith  |
| 11:10–11:30 | Sentence-Level Quality Estimation for MT System Combination<br>Tsuyoshi Okita, Raphaël Rubino and Josef van Genabith  |
| 11:30–11:45 | Tea break   |
| 11:45–12:05 | Neural Probabilistic Language Model for System Combination<br>Tsuyoshi Okita  |
| 12:05–12:25 | System Combination Using Joint, Binarised Feature Vectors<br>Christian Federmann  |
| 12:25–12:30 | Results from the ML4HMT-12 Shared Task on Applying Machine Learning Techniques<br>to Optimise the Division of Labour in Hybrid Machine Translation<br>Christian Federmann, Tsuyoshi Okita, Maite Melero, Marta R. Costa-Jussa, Toni<br>Badia and Josef van Genabith |
| 12:30-12:50 | <b>Discussion Panel</b><br>Panelists: Marc Dymetman (TBC), Jan Hajič, Qun Liu (TBC), Hans Uszkoreit,<br>Josef van Genabith<br>Topics include:   |
|             | • The Future of Hybrid MT: is there a single-paradigm winner?   |
|             | Will we see increasing usage of additional, potentially highly sparse, fea-<br>tures?   |
|             | Will research efforts in Machine Translation and Machine Learning converge?   |
|             | How do we evaluate progress in terms of translation quality for Hybrid MT?  |
|             | • What are the baselines? Can Human Judgment be integrated?   |
| 12:50-13:30 | <b>Invited talk:</b><br>Deep Linguistic Information in Hybrid Machine Translation<br>Jan Hajič, Institute of Formal and Applied Linguistics, Charles University in Prague   |