**CoNLL-2010: Shared Task** 

Fourteenth Conference on Computational Natural Language Learning

**Proceedings of the Shared Task** 

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## Introduction

This volume consists of the descriptions of the CoNLL-2010 Shared Task and the participating systems. The shared task was dedicated to the detection of uncertainty cues and their linguistic scope in natural language text. The motivation behind this task was that distinguishing factual and uncertain information in texts is of essential importance in information extraction.

The shared task addressed the detection of uncertainty in two domains. As uncertainty detection is extremely important for biomedical information extraction and most existing approaches have targeted such applications, participants were asked to develop systems for hedge detection in biological scientific articles. Uncertainty detection is also important, e.g. in encyclopedias, where the goal is to collect reliable world knowledge about real-world concepts and topics.

Two uncertainty detection tasks, sentence classification and in-sentence hedge scope detection were given to the participants. A total of 23 teams participated in the shared task. Those who participated in both tasks were invited to write a paper up to 8 pages. The page limit for those who participated only in the first task was 6 pages.

Although several approaches were introduced by the participants of the shared task and we believe that the ideas described in this proceedings can serve as an excellent starting point for the development of an uncertainty detector, there is a lot of room for improving such systems. The manually annotated datasets and software tools developed for the shared task may act as benchmarks for these future experiments and they are freely available at http://www.inf.u-szeged.hu/rgai/conll2010st.

Szeged, May, 2010

Richárd Farkas, for the Shared Task organizers

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### **Conference Program**

### Thursday, July 15, 2010

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- 16:20–16:30 *A Cascade Method for Detecting Hedges and their Scope in Natural Language Text* Buzhou Tang, Xiaolong Wang, Xuan Wang, Bo Yuan and Shixi Fan
- 16:30–16:40 Detecting Speculative Language Using Syntactic Dependencies and Logistic Regression
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- 16:40–16:50 *A Hedgehop over a Max-Margin Framework Using Hedge Cues* Maria Georgescul
- 16:50–17:00 *Detecting Hedge Cues and their Scopes with Average Perceptron* Feng Ji, Xipeng Qiu and Xuanjing Huang
- 17:00–17:10 *Memory-Based Resolution of In-Sentence Scopes of Hedge Cues* Roser Morante, Vincent Van Asch and Walter Daelemans
- 17:10–17:20 *Resolving Speculation: MaxEnt Cue Classification and Dependency-Based Scope Rules* Erik Velldal, Lilja Øvrelid and Stephan Oepen
- 17:20–17:30 Combining Manual Rules and Supervised Learning for Hedge Cue and Scope Detection Marek Rei and Ted Briscoe

Shared Task Discussion Panel (17:30-18:00)

### Friday, July 16, 2010

Shared Task Session 2: Poster Session (11:00-12:30)

(Systems for both Task1 and Task2)

*Hedge Detection Using the RelHunter Approach* Eraldo Fernandes, Carlos Crestana and Ruy Milidiú

A High-Precision Approach to Detecting Hedges and their Scopes Halil Kilicoglu and Sabine Bergler

*Exploiting Rich Features for Detecting Hedges and their Scope* Xinxin Li, Jianping Shen, Xiang Gao and Xuan Wang

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*Exploiting Multi-Features to Detect Hedges and their Scope in Biomedical Texts* Huiwei Zhou, Xiaoyan Li, Degen Huang, Zezhong Li and Yuansheng Yang

### Friday, July 16, 2010 (continued)

(Systems for Task1)

A Lucene and Maximum Entropy Model Based Hedge Detection System Lin Chen and Barbara Di Eugenio

*HedgeHunter: A System for Hedge Detection and Uncertainty Classification* David Clausen

*Exploiting CCG Structures with Tree Kernels for Speculation Detection* Liliana Mamani Sánchez, Baoli Li and Carl Vogel

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