EMNLP 2014

# First Workshop on Computational Approaches to Code Switching

**Proceedings of the Workshop** 

October 25, 2014 Doha, Qatar Production and Manufacturing by Taberg Media Group AB Box 94, 562 02 Taberg Sweden

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ISBN 978-1-937284-96-1

## Introduction

Code-switching (CS) is the phenomenon by which multilingual speakers switch back and forth between their common languages in written or spoken communication. CS is pervasive in informal text communications such as news groups, tweets, blogs, and other social media of multilingual communities. Such genres are increasingly being studied as rich sources of social, commercial and political information. Apart from the informal genre challenge associated with such data within a single language processing scenario, the CS phenomenon adds another significant layer of complexity to the processing of the data. Efficiently and robustly processing CS data presents a new frontier for our NLP algorithms on all levels. The goal of this workshop is to bring together researchers interested in exploring these new frontiers, discussing state of the art research in CS, and identifying the next steps in this fascinating research area.

The workshop program includes exciting papers discussing new approaches for CS data and the development of linguistic resources needed to process and study CS. We received a total of 17 regular workshop submissions of which we accepted eight for publication (47% acceptance rate), five of them as workshop talks and three as posters. The accepted workshop submissions cover a wide variety of language combinations from languages such as English, Hindi, Bengali, Turkish, Dutch, German, Italian, Romansh, Mandarin, Dialectical Arabic and Modern Standard Arabic. Although most papers focus on some kind of social media data, there is also work on more formal genres, such as that from the Canadian Hansard.

Another component of the workshop is the First Shared Task on Language Identification of CS Data. The shared task focused on social media and included four language pairs: Mandarin-English, Modern Standard Arabic-Dialectal Arabic, Nepali-English, and Spanish-English. We received a total of 42 system runs from seven different teams. Each team submitted a shared task paper describing their system. All shared task systems will be presented during the workshop poster session and a subset of them will also present a talk.

We would like to thank all authors who submitted their contributions to this workshop and all shared task participants for taking on the challenge of language identification in code switched data. We also thank the program committee members for their help in providing meaningful reviews. Lastly, we thank the EMNLP 2014 organizers for the opportunity to put together this workshop.

See you all in Qatar, see ypu al in Qatar at EMNLP 2014! Workshop co-chairs,

Mona Diab Julia Hirschberg Pascale Fung Thamar Solorio

#### Workshop Co-Chairs:

Mona Diab, George Washington University Julia Hirschberg, Columbia University Pascale Fung, Hong Kong University of Science and Technology Thamar Solorio, University of Houston

#### **Program Committee:**

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### **Workshop Program**

#### Saturday, October 25, 2014

#### Session 1: Workshop talks

- 09:00–09:10 Welcome Remarks The organizers
- 09:10–09:30 Foreign Words and the Automatic Processing of Arabic Social Media Text Written in Roman Script Ramy Eskander, Mohamed Al-Badrashiny, Nizar Habash and Owen Rambow
- 09:30–09:50 Code Mixing: A Challenge for Language Identification in the Language of Social Media Utsab Barman, Amitava Das, Joachim Wagner and Jennifer Foster
- 09:50–10:10 *Detecting Code-Switching in a Multilingual Alpine Heritage Corpus* Martin Volk and Simon Clematide
- 10:10–10:30 Exploration of the Impact of Maximum Entropy in Recurrent Neural Network Language Models for Code-Switching Speech Ngoc Thang Vu and Tanja Schultz
- 10:30–11:00 Coffee Break

#### Session 2: Workshop Talks and Shared Task Systems

- 11:00–11:20 Predicting Code-switching in Multilingual Communication for Immigrant Communities Evangelos Papalexakis, Dong Nguyen and A. Seza Doğruöz
- 11:20–11:40 *Twitter Users #CodeSwitch Hashtags! #MoltoImportante #wow* David Jurgens, Stefan Dimitrov and Derek Ruths
- 11:40–11:50 Overview for the First Shared Task on Language Identification in Code-Switched Data
   Thamar Solorio, Elizabeth Blair, Suraj Maharjan, Steven Bethard, Mona Diab, Mahmoud Ghoneim, Abdelati Hawwari, Fahad AlGhamdi, Julia Hirschberg, Alison Chang and Pascale Fung
- 11:50–12:10 Word-level Language Identification using CRF: Code-switching Shared Task Report of MSR India System
   Gokul Chittaranjan, Yogarshi Vyas, Kalika Bali and Monojit Choudhury

#### Saturday, October 25, 2014 (continued)

12:10–12:30 The CMU Submission for the Shared Task on Language Identification in Code-Switched Data Chu-Cheng Lin, Waleed Ammar, Lori Levin and Chris Dyer

#### 12:30–14:00 Lunch break

#### Session 3: Shared Task and Next Steps

- 14:00–14:20 *Language Identification in Code-Switching Scenario* Naman Jain and Riyaz Ahmad Bhat
- 14:20–14:40 *AIDA: Identifying Code Switching in Informal Arabic Text* Heba Elfardy, Mohamed Al-Badrashiny and Mona Diab
- 14:40–15:00 The IUCL+ System: Word-Level Language Identification via Extended Markov Models Levi King, Eric Baucom, Timur Gilmanov, Sandra Kübler, Dan Whyatt, Wolfgang Maier and Paul Rodrigues
- 15:00–15:30 Panel Discussion: Next Steps in CS Research Group Discussion
- 15:30–16:00 Coffee Break (Posters set up time)

#### Session 4: Poster Session

16:00–17:30 Workshop and Shared Task Posters Multiple presenters

> *Mixed Language and Code-Switching in the Canadian Hansard* Marine Carpuat

"I am borrowing ya mixing ?" An Analysis of English-Hindi Code Mixing in Facebook

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