# ACL 2018

**Computational Approaches to Linguistic Code-Switching** 

**Proceedings of the Third Workshop** 

July 19, 2018 Melbourne, Australia Workshop Sponsor:



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# 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 16 regular workshop submissions of which we accepted 11 for publication, five of them as workshop talks and six as posters.

Another component of the workshop is the First Shared Task on Named Entity Recognition (NER) of CS Data. The shared task focused on social media and included two language pairs: Modern Standard Arabic-Dialectal Arabic and English-Spanish. We had a total of 9 participants from which we received 8 submissions on English-Spanish and 6 submissions on Modern Standard Arabic-Dialectal Arabic. We received papers from all these submissions. All shared task systems will be presented during the workshop poster session and two 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 NER in code-switched data. We also thank the program committee members for their help in providing meaningful reviews. Lastly, we thank the ACL 2018 organizers for the opportunity to put together this workshop and Amazon for their generous sponsorship.

See you all in Melbourne, Australia at ACL 2018!

Workshop co-chairs, Gustavo Aguilar Fahad AlGhamdi Victor Soto Thamar Solorio Mona Diab Julia Hirschberg

### Workshop Co-Chairs:

Gustavo Aguilar, University of Houston Fahad AlGhamdi, George Washington University Victor Soto, Columbia University Thamar Solorio, University of Houston Mona Diab, George Washington University Julia Hirschberg, Columbia University

## Shared Task Co-Chairs:

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#### **Invited Speakers:**

Pascale Fung, Hong Kong University of Science & Technology Melinda Fricke, University of Pittsburgh

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# Workshop Program

# Thursday, July 19, 2018

## 09:00–10:30 Session 1 Invited Talk and Oral Presentations

- 9:00–9:05 *Opening Remarks* Thamar Solorio
- 9:05–9:50 Invited Talk: Learning to Codeswitch Pascale Fung
- 9:50–10:10 Joint Part-of-Speech and Language ID Tagging for Code-Switched Data Victor Soto and Julia Hirschberg
- 10:10–10:30 *Phone Merging For Code-Switched Speech Recognition* Sunit Sivasankaran, Brij Mohan Lal Srivastava, Sunayana Sitaram, Kalika Bali and Monojit Choudhury
- 10:30–11:00 Coffee Break
- 11:00–12:00 Session 2 Oral Presentations
- 11:00–11:20 Improving Neural Network Performance by Injecting Background Knowledge: Detecting Code-switching and Borrowing in Algerian texts Wafia Adouane, Jean-Philippe Bernardy and Simon Dobnik
- 11:20–11:40 *Code-Mixed Question Answering Challenge: Crowd-sourcing Data and Techniques* Khyathi Chandu, Ekaterina Loginova, Vishal Gupta, Josef van Genabith, Günter Neuman, Manoj Chinnakotla, Eric Nyberg and Alan W. Black
- 11:40–12:00 Transliteration Better than Translation? Answering Code-mixed Questions over a Knowledge Base Vishal Gupta, Manoj Chinnakotla and Manish Shrivastava

#### Thursday, July 19, 2018 (continued)

### 12:00–13:30 Lunch Break

### 13:30–14:15 Session 3 Invited Talk

13:30–14:15 Invited Talk: Variation in Codeswitched Language: a Psycholinguistic Approach to What, When, and Why Melinda Fricke

### 14:15–15:30 Session 4 Poster Session

*Language Identification and Analysis of Code-Switched Social Media Text* Deepthi Mave, Suraj Maharjan and Thamar Solorio

*Code-Switching Language Modeling using Syntax-Aware Multi-Task Learning* Genta Indra Winata, Andrea Madotto, Chien-Sheng Wu and Pascale Fung

*Predicting the presence of a Matrix Language in code-switching* Barbara Bullock, Wally Guzman, Jacqueline Serigos, Vivek Sharath and Almeida Jacqueline Toribio

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- 15:30–16:00 Coffee Break
- 16:00–17:00 Session 5 Shared Task Talks
- 16:00–16:10 Named Entity Recognition on Code-Switched Data: Overview of the CALCS 2018 Shared Task
   Gustavo Aguilar, Fahad AlGhamdi, Victor Soto, Mona Diab, Julia Hirschberg and Thamar Solorio
- 16:10–16:30 *IIT (BHU) Submission for the ACL Shared Task on Named Entity Recognition on Code-switched Data* Shashwat Trivedi, Harsh Rangwani and Anil Kumar Singh
- 16:30–16:50 *Code-Switched Named Entity Recognition with Embedding Attention* Changhan Wang, Kyunghyun Cho and Douwe Kiela
- 16:50–17:00 Closing Remarks Victor Soto