W-NUT 2017

The Third Workshop on Noisy User-generated Text (W-NUT 2017)

**Proceedings of the Workshop** 

September 7, 2017 Copenhagen, Denmark ©2017 The Association for Computational Linguistics

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ISBN 978-1-945626-94-4

# Introduction

The W-NUT 2017 workshop focuses on a core set of natural language processing tasks on top of noisy user-generated text, such as that found on social media, web forums and online reviews. Recent years have seen a significant increase of interest in these areas. The internet has democratized content creation leading to an explosion of informal user-generated text, publicly available in electronic format, motivating the need for NLP on noisy text to enable new data analytics applications. The workshop is an opportunity to bring together researchers interested in noisy text with different backgrounds and encourage crossover. The workshop this year features a shared task on Emerging and Rare entity recognition.

The workshop received 27 main track submissions, 17 of which were accepted, in addition to 6 system description papers for the shared task and a task overview paper. There are 3 invited speakers, Bill Dolan, Dirk Hovy and Miles Osborne with each of their talks covering a different aspect of NLP for user-generated text. We would like to thank the Program Committee members who reviewed the papers this year. We would also like to thank the workshop participants.

Leon Derczynski, Wei Xu, Alan Ritter and Tim Baldwin Co-Organizers

#### **Organizers:**

Leon Derczynski, The University of Sheffield Wei Xu, The Ohio State University Alan Ritter, The Ohio State University Tim Baldwin, The University of Melbourne

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#### **Invited Speakers:**

Bill Dolan, Microsoft Research Dirk Hovy, University of Copenhagen Miles Osborne, Bloomberg

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# **Conference Program**

September 7

- 9:00–9:05 Opening
- 9:05–9:50 Invited Talk: Common Sense Knowledge as an Emergent Property of Neural Conversational Models (Bill Dolan)

#### 9:50–10:35 Oral Session I

- 9:50–10:05 *Boundary-based MWE segmentation with text partitioning* Jake Williams
- 10:05–10:20 *Towards the Understanding of Gaming Audiences by Modeling Twitch Emotes* Francesco Barbieri, Luis Espinosa Anke, Miguel Ballesteros, Juan Soler and Horacio Saggion
- 10:20–10:35 Churn Identification in Microblogs using Convolutional Neural Networks with Structured Logical Knowledge Mourad Gridach, Hatem Haddad and Hala Mulki
- 10:35–11:00 Coffee Break

#### 11:00–12:30 Oral Session II

11:00–11:15 To normalize, or not to normalize: The impact of normalization on Part-of-Speech tagging Rob van der Goot, Barbara Plank and Malvina Nissim

11:15–11:30 Constructing an Alias List for Named Entities during an Event

- Anietie Andy, Mark Dredze, Mugizi Rwebangira and Chris Callison-Burch
- 11:30–11:45 *Incorporating Metadata into Content-Based User Embeddings* Linzi Xing and Michael J. Paul
- 11:45–12:00 *Simple Queries as Distant Labels for Predicting Gender on Twitter* Chris Emmery, Grzegorz Chrupała and Walter Daelemans

### September 7 (continued)

- 12:00–12:15 *A Dataset and Classifier for Recognizing Social Media English* Su Lin Blodgett, Johnny Wei and Brendan O'Connor
- 12:15–12:30 *Evaluating hypotheses in geolocation on a very large sample of Twitter* Bahar Salehi and Anders Søgaard
- 12:30-14:00 Lunch
- 14:00–14:45 Invited Talk: Tweets in Finance (Miles Osborne)

### 14:45–14:55 Lightning Talks

The Effect of Error Rate in Artificially Generated Data for Automatic Preposition and Determiner Correction Fraser Bowen, Jon Dehdari and Josef Van Genabith

An Entity Resolution Approach to Isolate Instances of Human Trafficking Online Chirag Nagpal, Kyle Miller, Benedikt Boecking and Artur Dubrawski

*Noisy Uyghur Text Normalization* Osman Tursun and Ruket Cakici

*Crowdsourcing Multiple Choice Science Questions* Johannes Welbl, Nelson F. Liu and Matt Gardner

*A Text Normalisation System for Non-Standard English Words* Emma Flint, Elliot Ford, Olivia Thomas, Andrew Caines and Paula Buttery

*Huntsville, hospitals, and hockey teams: Names can reveal your location* Bahar Salehi, Dirk Hovy, Eduard Hovy and Anders Søgaard

*Improving Document Clustering by Removing Unnatural Language* Myungha Jang, Jinho D. Choi and James Allan

### September 7 (continued)

Lithium NLP: A System for Rich Information Extraction from Noisy User Generated Text on Social Media Preeti Bhargava, Nemanja Spasojevic and Guoning Hu

### 14:55–15:30 Shared Task Session

- 14:55–15:10 *Results of the WNUT2017 Shared Task on Novel and Emerging Entity Recognition* Leon Derczynski, Eric Nichols, Marieke van Erp and Nut Limsopatham
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- 15:20–15:30 Distributed Representation, LDA Topic Modelling and Deep Learning for Emerging Named Entity Recognition from Social Media Patrick Jansson and Shuhua Liu

Multi-channel BiLSTM-CRF Model for Emerging Named Entity Recognition in Social Media Bill Y. Lin, Frank Xu, Zhiyi Luo and Kenny Zhu

Transfer Learning and Sentence Level Features for Named Entity Recognition on Tweets Pius von Däniken and Mark Cieliebak

*Context-Sensitive Recognition for Emerging and Rare Entities* Jake Williams and Giovanni Santia

A Feature-based Ensemble Approach to Recognition of Emerging and Rare Named Entities

Utpal Kumar Sikdar and Björn Gambäck

## September 7 (continued)

15:30–16:30 Poster Session

# 16:30–17:15 Invited Talk: Modeling Language as a Social Construct (Dirk Hovy)

17:15–17:30 Closing and Best Paper Awards