# **EMNLP 2017**

# Second workshop on Natural Language Processing meets Journalism

**Proceedings of the Workshop** 

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Tel: +1-570-476-8006 Fax: +1-570-476-0860 acl@aclweb.org

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## Introduction

During the years NLP has matured a suites of technologies able to cope with many problems raised by the contemporary need of global information, and so, it is the high time for the NLP to get engaged in the mass media process as an active partner for both journalists and readers. The EMNLP workshop - at its second edition after the IJCAI-2016 workshop held on July 10th, 2016 in New York - has the potential to attract the interest of researchers both in computational linguistics and journalism, and of professionals in the news production system. The main goal is to have a forum in which it will be possible to share and discuss advancements in natural language processing and real needs in the field of journalism. The workshop received an unexpected number of submissions and the program committee identified 19 papers of high quality. We are happy to notice that papers submitted to this second edition display a large variety of topics that we consider at the core of our initiative. Many interesting aspects of journalism in mass-media age, from discovering bias and incongruent headlines in news to analyzing the content of social media in order to capture hot topics and trends are present. We can confidently say that fundamental topics of natural language processing have been covered this year, a fact that makes all the effort of organizing this workshop worthwhile. There are four excellent papers running for the best paper award and we already know it is a close call. Some of the accepted papers are likely to stir vivid debates, which, as the last year experience proves it, will turn into papers next year. In fact, we can see that some of the ideas that emerged from the papers and the discussions we carried out in the first edition are properly represented in this second edition. While we cannot partition the papers into three or four well defined classes, we can see that the NLP researchers have understood and have developed technologies able to cope with bias detection, sentiment analysis and relevance of specific information.

In an era in which there is no single point of view and the "objectiveness of information" lacks a unilateral standard, playing with language register and clarity in a piece of news are powerful instruments at journalist disposal. NLP may raise some flags on details, and papers such as "Tracking Bias in News Sources Using Social Media: the Russia-Ukraine Maidan Crisis of 2013–2014", "Incongruent Headlines: Yet Another Way to Mislead Your Readers", "Fake news stance detection using stacked ensemble of classifiers", "From Clickbait to Fake News Detection: An Approach based on Detecting the Stance of Headlines to Articles", "An NLP Analysis of Exaggerated Claims in Science News" present interesting and efficient ways to warn the reader against possible abuses in the media.

Sentiment analysis is an important component in understanding the impact of a piece of news and few papers at this workshop focus on this aspect: "Comparing Attitudes to Climate Change in the Media using sentiment analysis based on Latent Dirichlet Allocation", "Improved Abusive Comment Moderation with User Embeddings", "Deception Detection in News Reports in the Russian Language: Lexics and Discourse", "Using New York Times Picks to Identify Constructive Comments", "Using New York Times Picks to Identify Constructive Comments", "Predicting News Values from Headline Text and Emotions".

A group of papers deals with a crucial issue of modern journalism, i.e., how to manage the enormous flow of available information: "What to Write? A topic recommender for journalists", "Data-to-text generation for tailored soccer journalism", "Language-based Construction of Explorable News Graphs for Journalists", "Storyteller: Visual Analytics of Perspectives on Rich Text Interpretations", "Analyzing the Revision Logs of a Japanese Newspaper for Article Quality Assessment", "Unsupervised Event Clustering and Aggregation from Newswire and Web Article", "Semantic Storytelling, Cross-lingual Event Detection and other Semantic Services for a Newsroom Content Curation Dashboard", "A News Chain Evaluation Methodology along with a Lattice-based Approach for News Chain Construction".

In conclusion, we are very happy and proud about the high quality papers dealing with essential topics in modern journalism. We believe that more and more NLP will have an impact on journalism, the force that truly and directly represents all us in the confrontation with the social problems.

Octavian Popescu and Carlo Strapparava

### **Organizers:**

Octavian Popescu, IBM Watson Research Center, USA Carlo Strapparava, FBK-irst, Italy

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### Predicting User Views in Online News

Daniel Hardt and Owen Rambow

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Peter Potash, Alexey Romanov, Mikhail Gronas, Anna Rumshisky and Mikhail Gronas

### What to Write? A topic recommender for journalists

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# Comparing Attitudes to Climate Change in the Media using sentiment analysis based on Latent Dirichlet Allocation

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### Analyzing the Revision Logs of a Japanese Newspaper for Article Quality Assessment

Hideaki Tamori, Yuta Hitomi, Naoaki Okazaki and Kentaro Inui

### Improved Abusive Comment Moderation with User Embeddings

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Cristian Danescu-Niculescu-Mizil - Cornell University

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An NLP Analysis of Exaggerated Claims in Science News YINGYA LI, Jieke Zhang and Bei Yu

**Best paper announcement and Conclusions**