### **EMNLP 2018**

**Proceedings of the 2018 EMNLP Workshop SMM4H:** 

# 3rd Social Media Mining for Health Applications Workshop & Shared Task

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#### **Preface**

Welcome to the 3rd Social Media Mining for Health Applications Workshop and Shared Task - SMM4H.

The total number of users of social media continues to grow worldwide, resulting in the generation of vast amounts of data. With nearly half of adults worldwide and two-thirds of all American adults using social networking, the latest Pew Research Report estimates that 26% of the total users have discussed health information and, of those, 42% have even discussed current medical conditions. Advances in automated NLP and machine learning present the possibility of utilizing this massive data source for biomedical and public health applications, if researchers address the methodological challenges unique to this media.

For its third iteration, the SMM4H workshop takes place in Brussels, Belgium, on November 1, 2018, and is co-located with the 2018 Conference on Empirical Methods in Natural Language Processing (EMNLP). Following on the success of a session and accompanying Workshop on the topic that was hosted at the Pacific Symposium in Biocomputing (PSB) in 2016 and the AMIA Annual Conference in 2017, this workshop aims to provide a forum for the ACL community members to present and discuss NLP advances specific to social media use in the particularly challenging area of health applications, with a special focus given to automatic methods for the collection, extraction, representation, analysis, and validation of social media data for health informatics.

As for the previous years, the workshop includes shared tasks with a particular interest on social media mining for pharmacovigilance. This third execution of the SMM4H shared tasks comprises four subtasks. These subtasks involve annotated user posts from Twitter (tweets) and focus on the (i) automatic classification of tweets mentioning a drug name, (ii) automatic classification of tweets containing reports of first-person medication intake, (iii) automatic classification of tweets presenting self-reports of adverse drug reaction (ADR) detection, and (iv) automatic classification of vaccine behavior mentions in tweets. A total of 14 teams participated and 78 system runs were submitted. Deep learning-based classifiers were the primary approach, but feature-based classifiers and a few ensemble learning systems were also used.

We received very high quality submissions, and present 19 as long and short talks and posters. The organizing committee would like to thank the program committee, consisting of 13 researchers, for their thoughtful input on the submissions, as well as the organizers of EMNLP for their support and management. Finally, a huge thanks to all authors who submitted a paper for the workshop or participated in the shared tasks; this workshop would not have been possible without them and their hard work.

Graciela, Davy, Abeed, Michael

#### **Organizing Committee:**

Graciela Gonzalez-Hernandez, University of Pennsylvania Davy Weissenbacher, University of Pennsylvania Abeed Sarker, University of Pennsylvania Michael Paul, University of Colorado-Boulder Karen O'Connor, University of Pennsylvania

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9:50–10:10	Identifying Depression on Reddit: The Effect of Training Data Inna Pirina and Çağrı Çöltekin
10:30-11:00	Tea Break and Poster Session
11:00–11:20	Overview of the Third Social Media Mining for Health (SMM4H) Shared Tasks at EMNLP 2018  Davy Weissenbacher, Abeed Sarker, Michael J. Paul and Graciela Gonzalez-Hernandez
11:20–11:40	Changes in Psycholinguistic Attributes of Social Media Users Before, During, and After Self-Reported Influenza Symptoms Lucie Flekova, Vasileios Lampos and Ingemar Cox
11:40–12:00	Thumbs Up and Down: Sentiment Analysis of Medical Online Forums Victoria Bobicev and Marina Sokolova
12:00–12:20	Identification of Emergency Blood Donation Request on Twitter  Puneet Mathur, Meghna Ayyar, Sahil Chopra, Simra Shahid, Laiba Mehnaz and Rajiv Shah
12:20–12:30	Dealing with Medication Non-Adherence Expressions in Twitter  Takeshi Onishi, Davy Weissenbacher, Ari Klein, Karen O'Connor and Graciela Gonzalez-Hernandez
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14:40–15:00	Shot Or Not: Comparison of NLP Approaches for Vaccination Behaviour Detection Aditya Joshi, Xiang Dai, Sarvnaz Karimi, Ross Sparks, Cecile Paris and C Raina MacIntyre
15:00–15:10	Neural DrugNet Nishant Nikhil and Shivansh Mundra
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