# ACL 2016

### **BioNLP 2016**

# Proceedings of the 15th Workshop on Biomedical Natural Language Processing

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### Introduction

The past year has been an exciting and productive time for biomedical natural language processing. A search for natural language processing or text mining in PubMed<sup>®</sup>/MEDLINE<sup>®</sup> limited to 2015 and 2016 returns over 800 results. The number of corpora available in the domain continues to increase, and the past year has seen two hackathons devoted to biomedical corpora, with another two planned for this coming year. A variety of shared tasks have led to increases in the shared knowledge of the community, with more to come.

The high level of activity in biomedical natural language processing includes a number of good conferences. Among those, the BioNLP meeting has now been ongoing for 15 years, and the quality of submissions continues to impress the program committee and the organizers—and to increase. BioNLP 2016 received 38 exceptional submissions, of which 13 were accepted for oral presentation and 15 as poster presentations; increasing the rejection rate to 30% this year.

The themes in this year's papers and posters continue showing equal interest in clinical text and in biological language processing. The morning sessions focus on extraction of entities, relations and events. The afternoon sessions present disambiguation, classification, vocabulary development and syntactic analysis. The invited talks present overviews of two community-wide evaluations: BioNLP-ST 2016 and BioASQ 2016.

As always, we are profoundly grateful to the authors who chose BioNLP as venue for presenting their innovative research. The authors' willingness to continue sharing their work through BioNLP consistently makes the workshop noteworthy and stimulating. We are equally indebted to the program committee members (listed elsewhere in this volume) who produced three thorough reviews per paper on a tight review schedule and with an admirable level of insight.

# **Invited Talks**

#### The BioNLP-ST challenges on information extraction and knowledge acquisition in biology

Speakers: Robert Bossy and Jin-Dong Kim

Robert Bossy is a research engineer at INRA, the French national institute for agronomy, agriculture and food science. His main interests are the design of Natural Language Processing, Information Extraction, Information Retrieval, and Knowledge Acquisition methods and services in the domains of biology and food science. His domains of expertise are NLP workflows and software development for knowledge engineering. He also has a wide experience in the dialogue between biology experts and NLP method providers. He has organized the Bacteria Biotope and Bacteria Genic Interaction tasks in the BioNLP-ST challenges 2011 and 2013. He has a MSc in Populations Biology and Taxonomy and a PhD in bioinformatics from Pierre et Marie Curie (Paris, France).

Jin-Dong Kim is a project associate professor of DBCLS (Database Center for Life Science). He received his Ph.D from Korea University in 2001. He is the main author of Genia resources and a regular organizer of BioNLP Shared Task series. He is also the chief organizer of the BLAH (annual Biomedical Linked Annotation Hackathon) series. His recent projects include PubAnnotation, TextAE and LODQA.

#### BioASQ: A challenge on large-scale biomedical semantic indexing and question answering

Speaker: Anastasia Krithara

Dr. Anastasia Krithara has been a post-doctoral researcher in the Institute of Informatics and Telecommunications at National Center for Scientific Research (NCSR) "Demokritos" since 2008, where she is involved in national and international projects. Before, she was a research engineer in Xerox Research Centre Europe, in Grenoble, France, where she carried out research in the area of machine learning. She holds a BSc in Informatics from Athens University of Economics and Business, an MSc in Machine Learning and Data Mining from University of Bristol and a PhD in Machine Learning from Pierre and Marie Curie University (Paris VI). Her research interests include Machine Learning, Information Retrieval, Bioinformatics and Natural Language Processing. She is a program committee member of several international conferences and workshops and her work has been published in international journals, conferences and books. She is co-organizing the BioASQ challenges.

#### **Organizers:**

Kevin Bretonnel Cohen, University of Colorado School of Medicine, USA Dina Demner-Fushman, US National Library of Medicine Sophia Ananiadou, National Centre for Text Mining and University of Manchester, UK Jun-ichi Tsujii, National Institute of Advanced Industrial Science and Technology, Japan

#### **Program Committee:**

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- 12:20–12:40 *Character based String Kernels for Bio-Entity Relation Detection* Ritambhara Singh and Yanjun Qi
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