# NAACL HLT 2015

2nd Workshop on Argumentation Mining

**Proceedings of the Workshop** 

June 4, 2015 Denver, Colorado, USA ©2015 The Association for Computational Linguistics

Order print-on-demand copies from:

Curran Associates 57 Morehouse Lane Red Hook, New York 12571 USA Tel: +1-845-758-0400 Fax: +1-845-758-2633 curran@proceedings.com

ISBN 978-1-941643-34-1

# Background

The goal of this workshop is to provide a follow-on forum to last year's very successful Argumentation Mining workshop at ACL, the first research forum devoted to argumentation mining in all domains of discourse.

Argumentation mining is a relatively new challenge in corpus-based discourse analysis that involves automatically identifying argumentative structures within a document, e.g., the premises, conclusion, and argumentation scheme of each argument, as well as argument-subargument and argument-counterargument relationships between pairs of arguments in the document. To date, researchers have investigated methods for argumentation mining of legal documents (Mochales and Moens 2011; Bach et al. 2013; Ashley and Walker 2013; Wyner et al. 2010), on-line debates (Cabrio and Villata 2012), product reviews (Villalba and Saint-Dizier 2012; Wyner et al. 2012), user comments on proposed regulations (Park and Cardie 2014), newspaper articles and court cases (Feng and Hirst 2011). A related older strand of research (that uses the term 'argumentative structure' in a related but different sense than ours) has investigated automatically classifying the sentences of a scientific article's abstract or full text in terms of their contribution of new knowledge to a field (e.g., Liakata et al. 2012, Teufel 2010, Mizuta et al. 2005). In addition, argumentation mining has ties to sentiment analysis (e.g., Somasundaran and Wiebe 2010). To date there are few corpora with annotations for argumentation mining research (Reed et al. 2008) although corpora with annotations for argument analysis (e.g., Park and Cardie 2014).

Proposed applications of argumentation mining include improving information retrieval and information extraction as well as end-user visualization and summarization of arguments. Textual sources of interest include not only the formal writing of legal text, but also a variety of informal genres such as microtext, spoken meeting transcripts, product reviews and user comments. In instructional contexts where argumentation is a pedagogically important tool for conveying and assessing students' command of course material, the written and diagrammed arguments of students (and the mappings between them) are educational data that can be mined for purposes of assessment and instruction (see e.g., Ong, Litman and Brusilovsky 2014). This is especially important given the wide-spread adoption of computer-supported peer review, computerized essay grading, and large-scale online courses and MOOCs.

As one might expect, success in argumentation mining will require interdisciplinary approaches informed by natural language processing technology, theories of semantics, pragmatics and discourse, knowledge of discourse of domains such as law and science, artificial intelligence, argumentation theory, and computational models of argumentation. In addition, it will require the creation and annotation of high-quality corpora of argumentation from different types of sources in different domains.

We are looking forward to a full day workshop to exchange ideas and present onging research on all of the above!!!

#### **Organizers:**

Claire Cardie (Chair), Cornell University, USA Nancy Green, University of North Carolina Greensboro, USA Iryna Gurevych, Technische Universität Darmstadt, Germany Graeme Hirst, University of Toronto, Canada Diane Litman, University of Pittsburgh, USA Smaranda Muresan, Columbia University, USA Georgios Petasis, N.C.S.R. "Demokritos", Greece Manfred Stede, Universität Potsdam, Germany Marilyn Walker, University of California Santa Cruz, USA Janyce Wiebe, University of Pittsburgh, USA

### **Program Committee:**

Stergos Afantenos, IRIT Toulouse, France Kevin Ashley, University of Pittsburgh, USA Floris Bex, University of Utrecht, The Netherlands Elena Cabrio, INRIA Sophia-Antipolis Méditerranée, France Claire Cardie, Cornell University, USA Chrysanne Dimarco, University of Waterloo, Canada Debanjan Ghosh, Rutgers University, USA Massimiliano Giacomin, University of Brescia, Italy Matthias Grabmair, University of Pittsburgh, USA Floriana Grasso, University of Liverpool, UK Nancy Green, University of N.C. Greensboro, USA Iryna Gurevych, Universität Darmstadt, Germany Ivan Habernal, DIPF institute Frankfurt, Germany Graeme Hirst, University of Toronto, Canada Vangelis Karkaletsis, N.C.S.R., Greece Valia Kordoni, Humboldt Universität zu Berlin, Germany Joao Leite, FCT-UNL - Universidade Nova de Lisboa, Portugal Beishui Liao, Zhejiang University, China Maria Liakata, University of Warwick, UK Diane Litman, University of Pittsburgh, USA Bernardo Magnini, FBK Trento, Italy Robert Mercer, University of Western Ontario, Canada Marie-Francine Moens, Katholieke Universiteit Leuven, Belgium Smaranda Muresan, Columbia University, USA Fabio Paglieri, CNR, Italy Alexis Palmer, Saarland University, Germany Joonsuk Park, Cornell University, USA Simon Parsons, University of Liverpool, UK

Carolyn Penstein Rosé, Carnegie Mellon University, USA Georgios Petasis, N.C.S.R. "Demokritos", Greece Craig Pfeifer, MITRE, USA Chris Reed, University of Dundee, UK Ariel Rosenfeld, Bar-Ilan University, Israel Patrick Saint-Dizier, IRIT Toulouse, France Christian Schunn, University Pittsburgh, USA Jodi Schneider, INRIA Sophia-Antipolis Méditerranée, France Noam Slonim, IBM, Israel Steffen Staab, University of Koblenz, Germany Manfred Stede, Universität Potsdam, Germany Simone Teufel, University of Cambridge, UK Serena Villata, INRIA Sophia-Antipolis Méditerranée, France Marilyn Walker, University of California Santa Cruz, USA Vern Walker, Hofstra University, USA Lu Wang, Cornell University, USA Janyce Wiebe, University of Pittsburgh, USA Adam Wyner, University Aberdeen, UK

# **Table of Contents**

Linking the Thoughts: Analysis of Argumentation Structures in Scientific Publications Christian Kirschner, Judith Eckle-Kohler and Iryna Gurevych
Identifying Argumentation Schemes in Genetics Research Articles Nancy Green
<i>Extracting Argument and Domain Words for Identifying Argument Components in Texts</i> Huy Nguyen and Diane Litman
Towards relation based Argumentation Mining         Lucas Carstens and Francesca Toni       29
A Shared Task on Argumentation Mining in Newspaper Editorials Johannes Kiesel, Khalid Al Khatib, Matthias Hagen and Benno Stein
Conditional Random Fields for Identifying Appropriate Types of Support for Propositions in Online User Comments Joonsuk Park, Arzoo Katiyar and Bishan Yang
A Computational Approach for Generating Toulmin Model Argumentation Paul Reisert, Naoya Inoue, Naoaki Okazaki and Kentaro Inui
Argument Extraction from News Christos Sardianos, Ioannis Manousos Katakis, Georgios Petasis and Vangelis Karkaletsis 56
<i>From Argumentation Mining to Stance Classification</i> Parinaz Sobhani, Diana Inkpen and Stan Matwin
Argument Discovery and Extraction with the Argument Workbench Adam Wyner, Wim Peters and David Price
Automatic Claim Negation: Why, How and When         Yonatan Bilu, Daniel Hershcovich and Noam Slonim
Learning Sentence Ordering for Opinion Generation of Debate Toshihiko Yanase, Toshinori Miyoshi, Kohsuke Yanai, Misa Sato, Makoto Iwayama, Yoshiki Niwa, Paul Reisert and Kentaro Inui94
Towards Detecting Counter-considerations in Text         Andreas Peldszus and Manfred Stede         104
Identifying Prominent Arguments in Online Debates Using Semantic Textual Similarity Filip Boltužić and Jan Šnajder
And That's A Fact: Distinguishing Factual and Emotional Argumentation in Online Dialogue Shereen Oraby, Lena Reed, Ryan Compton, Ellen Riloff, Marilyn Walker and Steve Whittaker116

ombining Argument Mining Techniques	
John Lawrence and Chris Reed	127

## **Conference Program**

Thursday, June 4, 2015

- 07:30-08:45 Breakfast
- 08:45–09:00 Introductions
- 09:00–09:40 Setting the Stage: Overview on Argumentation Mining by Manfred Stede, Nancy Green and Ivan Habernal
- 09:40–10:05 *Linking the Thoughts: Analysis of Argumentation Structures in Scientific Publications* Christian Kirschner, Judith Eckle-Kohler and Iryna Gurevych
- 10:05–10:30 *Identifying Argumentation Schemes in Genetics Research Articles* Nancy Green

## 10:30-11:00 Break

- 11:00–11:20 Extracting Argument and Domain Words for Identifying Argument Components in Texts Huy Nguyen and Diane Litman
- 11:20–11:30 Poster Madness: 1-minute presentation for each poster
- 11:30–12:30 Poster Session

*Towards relation based Argumentation Mining* Lucas Carstens and Francesca Toni

A Shared Task on Argumentation Mining in Newspaper Editorials Johannes Kiesel, Khalid Al Khatib, Matthias Hagen and Benno Stein

Conditional Random Fields for Identifying Appropriate Types of Support for Propositions in Online User Comments Joonsuk Park, Arzoo Katiyar and Bishan Yang

A Computational Approach for Generating Toulmin Model Argumentation Paul Reisert, Naoya Inoue, Naoaki Okazaki and Kentaro Inui

### Thursday, June 4, 2015 (continued)

#### Argument Extraction from News

Christos Sardianos, Ioannis Manousos Katakis, Georgios Petasis and Vangelis Karkaletsis

*From Argumentation Mining to Stance Classification* Parinaz Sobhani, Diana Inkpen and Stan Matwin

Argument Discovery and Extraction with the Argument Workbench Adam Wyner, Wim Peters and David Price

### 12:30–2:00 Lunch

- 02:00–02:25 *Automatic Claim Negation: Why, How and When* Yonatan Bilu, Daniel Hershcovich and Noam Slonim
- 02:25–02:50 *Learning Sentence Ordering for Opinion Generation of Debate* Toshihiko Yanase, Toshinori Miyoshi, Kohsuke Yanai, Misa Sato, Makoto Iwayama, Yoshiki Niwa, Paul Reisert and Kentaro Inui
- 02:50–03:10 *Towards Detecting Counter-considerations in Text* Andreas Peldszus and Manfred Stede
- 03:10–03:30 Identifying Prominent Arguments in Online Debates Using Semantic Textual Similarity Filip Boltužić and Jan Šnajder

#### 03:30-04:00 Break

- 04:00–04:25 And That's A Fact: Distinguishing Factual and Emotional Argumentation in Online Dialogue Shereen Oraby, Lena Reed, Ryan Compton, Ellen Riloff, Marilyn Walker and Steve Whittaker
- 04:25–04:50 *Combining Argument Mining Techniques* John Lawrence and Chris Reed
- 04:50–05:30 Wrap-up Discussion