## NAACL HLT 2016

# The Eleventh Workshop on Innovative Use of NLP for Building Educational Applications

**Proceedings of the Workshop** 

June 16, 2016 San Diego, California, USA

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## Introduction

We are excited to be holding the 11th edition of the BEA workshop. Since starting in 1997, the BEA workshop, now one of the largest workshops at NAACL/ACL, has become one of the leading venues for publishing innovative work that uses NLP to develop educational applications. The consistent interest and growth of the workshop has clear ties to challenges in education, especially with regard to supporting literacy. The research presented at the workshop illustrates advances in the technology, and the maturity of the NLP/education field that are responses to those challenges with capabilities that support instructor practices and learner needs. NLP capabilities now support an array of learning domains, including writing, speaking, reading, and mathematics. In the writing and speech domains, automated writing evaluation (AWE) and speech assessment applications, respectively, are commercially deployed in high-stakes assessment and instructional settings, including Massive Open Online Courses (MOOCs). We also see widely-used commercial applications for plagiarism detection and peer review. There has been a renewed interest in spoken dialog and multi-modal systems for instruction and assessment as well as feedback. We are also seeing explosive growth of mobile applications for game-based applications for instruction and assessment. The current educational and assessment landscape, especially in the United States, continues to foster a strong interest and high demand that pushes the state-of-the-art in AWE capabilities to expand the analysis of written responses to writing genres other than those traditionally found in standardized assessments, especially writing tasks requiring use of sources and argumentative discourse.

The use of NLP in educational applications has gained visibility outside of the NLP community. First, the Hewlett Foundation reached out to public and private sectors and sponsored two competitions: one for automated essay scoring, and another for scoring of short answer, subject-matter-based response items. The motivation driving these competitions was to engage the larger scientific community in this enterprise. MOOCs are now beginning to incorporate AWE systems to manage the thousands of constructed-response assignments collected during a single MOOC course. Learning@Scale is another venue that discusses NLP research in education. The Speech and Language Technology in Education (SLaTE), now in its seventh year, promotes the use of speech and language technology for educational purposes. Another breakthrough for educational applications within the CL community is the presence of a number of shared-task competitions over the last three years. There have been four shared tasks on grammatical error correction with the last two held at CoNLL (2013 and 2014). In 2014 alone, there were four shared tasks for NLP and Education-related areas. We are pleased to announce a unique shared task at BEA this year: Automated Evaluation of Scientific Writing.

As a community, we continue to improve existing capabilities, and to identify and generate innovative ways to use NLP in applications for writing, reading, speaking, critical thinking, curriculum development, and assessment. Steady growth in the development of NLP-based applications for education has prompted an increased number of workshops, typically focusing on one specific subfield. In this workshop, we present papers from the following subfields: tools for automated scoring of text and speech, automated test-item generation, curriculum development, collaborative problem solving, content evaluation in text, dialogue and intelligent tutoring, evaluation of genres beyond essays, feedback studies, and grammatical error detection.

This year we received a record 46 submissions, and accepted 8 papers as oral presentations and 20 as poster presentation and/or demos, for an overall acceptance rate of 61%. Each paper was reviewed by three members of the Program Committee who were believed to be most appropriate for each paper. We continue to have a very strong policy to deal with conflicts of interest. First, we made a concerted effort to not assign papers to reviewers to evaluate if the paper had an author from their institution. Second, with respect to the organizing committee, authors of papers for which there was a conflict of interest recused themselves from the discussions.

While the field is growing, we do recognize that there is a core group of institutions and researchers who work in this area. With a higher acceptance rate, we were able to include papers from a wider variety of topics and institutions. The papers accepted were selected on the basis of several factors, including the relevance to a core educational problem space, the novelty of the approach or domain, and the strength of the research. The accepted papers were highly diverse – an indicator of the growing variety of foci in this field. We continue to believe that the workshop framework designed to introduce work in progress and new ideas needs to be revived, and we hope that we have achieved this with the breadth and variety of research accepted for this workshop, a brief description of which is presented below:

For *automated writing evaluation*, Meyer & Koch investigate how users of intelligent writing assistance tools deal with correct, incorrect, and incomplete feedback; Rei & Cummins investigate the task of assessing sentence-level prompt relevance in learner essays; Cummins et al focus on determining the topical relevance of L2 essays to the prompt; Loukina & Cahill investigate how well systems developed for automated evaluation of written responses perform when applied to spoken responses; Beigman Klebanov et al address the problem of quantifying the overall extent to which a test-taker's essay deals with the topic it is assigned; King & Dickinson investigate questions of how to reason about learner meaning in cases where the set of correct meanings is never entirely complete, specifically for the case of picture description tasks; Madnani et al present preliminary work on automatically scoring tests of proficiency in music instruction; Rahimi & Litman automatically extract and investigate the usefulness of topical components for scoring the Evidence dimension of an analytical writing in response to text assessment; Ledbetter & Dickinson describe the development of a morphological analyzer for learner Hungarian, outlining extensions to a resource-light system that can be developed by different types of experts.

For *short-answer scoring*, Horbach & Palmer explore the suitability of active learning for automatic short-answer assessment on the ASAP corpus; Banjade et al present a corpus that contains student answers annotated for their correctness in context, in addition to a baseline for predicting the correctness label; and Rudzewitz explores the practical usefulness of the combination of features from three different fields – short answer scoring, authorship attribution, and plagiarism detection – for two tasks: semantic learner language classification, and plagiarism detection for evaluating short answers.

For grammar and spelling error detection, Madnani et al discuss a classifier approach that yields higher

precision and a language modeling approach that provides better recall; Beinborn et al discuss a model that can predict spelling difficulty with a high accuracy, and provide a thorough error analysis that takes the L1 into account and provides insights into cross-lingual transfer effects; Napoles et al estimate the deterioration of NLP processing given an estimate of the amount and nature of grammatical errors in a text; and, Yuan et al develop a supervised ranking model to re-rank candidates generated from an SMT-based grammatical error correction system.

For *text difficulty and curriculum development*, Xia et al address the task of readability assessment for texts aimed at L2 learners; Reynolds investigates Russian second language readability assessment using a machine-learning approach with a range of lexical, morphological, syntactic, and discourse features; Chen & Meurers study the frequency of a word in common language use, and systematically explore how such a word-level feature is best used to characterize the reading levels of texts; Yoon et al present an automated method for estimating the difficulty of spoken texts for use in generating items that assess non-native learners' listening proficiency; Milli & Hearst explore the automated augmentation of a popular online learning resource – Khan Academy video modules – with relevant reference chapters from open access textbooks; and Chinkina & Meurers present an IR system for text selection that identifies the grammatical constructions spelled out in the official English language curriculum of schools in Baden-Württemberg (Germany) and re-ranks the search results based on the selected (de)prioritization of grammatical forms.

For *item generation*, Hill & Simha propose a method to automatically generate multiple-choice fill-in-the-blank exercises from existing text passages that challenge a reader's comprehension skills and contextual awareness; Wojatzki et al present the concept of bundled gap filling, along with an efficient computational model for automatically generating unambiguous gap bundle exercises, and a disambiguation measure for guiding the construction of the exercises and validating their level of ambiguity; and Pilán explores the factors influencing the dependence of single sentences on their larger textual context in order to automatically identify candidate sentences for language learning exercises from corpora which are presentable in isolation.

For *collaborative problem solving*, Flor et al present a novel situational task that integrates collaborative problem solving behavior with testing in a science domain.

For *accessibility*, Martinez-Santiago et al discuss computer-designed tools in order to help people with Autism Spectrum Disorder to palliate or overcome such verbal limitations.

As noted earlier, this year we are excited to host the first Shared Task in *Automated Evaluation of Scientific Writing* (http://textmining.lt/aesw/index.html). The task involves automatically predicting whether sentences found in scientific language are in need of editing. Six teams competed and their system description papers are found in these proceedings and are presented as posters in conjunction with the BEA11 poster session. A summary report of the shared task (Daudaravicius et al) is also found in the proceedings and will be presented orally.

We wish to thank everyone who showed interest and submitted a paper, all of the authors for their

contributions, the members of the Program Committee for their thoughtful reviews, and everyone who attended this workshop. We would especially like to thank our sponsors; at the Gold Level: American Institutes for Research (AIR), Cambridge Assessment, Educational Testing Service, Grammarly, Pacific Metrics and Turnitin / Lightside, and at the Silver Level: Cognii and iLexIR. Their contributions allow us to subsidize students at the workshop dinner, and make workshop t-shirts! We would like to thank Joya Tetreault for creating the t-shirt design (again!).

Joel Tetreault, Yahoo Jill Burstein, Educational Testing Service Claudia Leacock, Grammarly Helen Yannakoudakis, University of Cambridge

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## **Conference Program**

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- 09:00–09:15 Opening Remarks
- 09:15–09:40 *The Effect of Multiple Grammatical Errors on Processing Non-Native Writing* Courtney Napoles, Aoife Cahill and Nitin Madnani
- 09:40–10:05 *Text Readability Assessment for Second Language Learners* Menglin Xia, Ekaterina Kochmar and Ted Briscoe
- 10:05–10:30 Automatic Generation of Context-Based Fill-in-the-Blank Exercises Using Cooccurrence Likelihoods and Google n-grams Jennifer Hill and Rahul Simha

## 10:30-11:00 Break

- 11:00–11:25 Automated classification of collaborative problem solving interactions in simulated science tasks
  Michael Flor, Su-Youn Yoon, Jiangang Hao, Lei Liu and Alina von Davier
- 11:25–11:50 *Computer-assisted stylistic revision with incomplete and noisy feedback. A pilot study* Christian M. Meyer and Johann Frerik Koch
- 11:50–12:15 *A Report on the Automatic Evaluation of Scientific Writing Shared Task* Vidas Daudaravicius, Rafael E. Banchs, Elena Volodina and Courtney Napoles
- 12:25-02:00 Lunch

## 02:00–02:45 Poster and Demo Session A

*Topicality-Based Indices for Essay Scoring* Beata Beigman Klebanov, Michael Flor and Binod Gyawali

*Predicting the Spelling Difficulty of Words for Language Learners* Lisa Beinborn, Torsten Zesch and Iryna Gurevych

## Thursday June 16, 2016 (continued)

*Characterizing Text Difficulty with Word Frequencies* Xiaobin Chen and Detmar Meurers

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*Feature-Rich Error Detection in Scientific Writing Using Logistic Regression* Madeline Remse, Mohsen Mesgar and Michael Strube

Bundled Gap Filling: A New Paradigm for Unambiguous Cloze Exercises Michael Wojatzki, Oren Melamud and Torsten Zesch

### 02:45–03:30 Poster and Demo Session B

Evaluation Dataset (DT-Grade) and Word Weighting Approach towards Constructed Short Answers Assessment in Tutorial Dialogue Context Rajendra Banjade, Nabin Maharjan, Nobal Bikram Niraula, Dipesh Gautam, Borhan Samei and Vasile Rus

## Thursday June 16, 2016 (continued)

Linguistically Aware Information Retrieval: Providing Input Enrichment for Second Language Learners Maria Chinkina and Detmar Meurers

Enhancing STEM Motivation through Personal and Communal Values: NLP for Assessment of Utility Value in Student Writing

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Automatically Extracting Topical Components for a Response-to-Text Writing Assessment Zahra Rahimi and Diane Litman

03:30-04:00 Break

## Thursday June 16, 2016 (continued)

- 04:00–04:20 Sentence Similarity Measures for Fine-Grained Estimation of Topical Relevance in Learner Essays Marek Rei and Ronan Cummins
- 04:20–04:45 Insights from Russian second language readability classification: complexitydependent training requirements, and feature evaluation of multiple categories Robert Reynolds
- 04:45–05:10 *Investigating Active Learning for Short-Answer Scoring* Andrea Horbach and Alexis Palmer
- 05:10–05:25 Closing Remarks