

# CHRIS KEDZIE

## PERSONAL INFORMATION

*Made in California, January 29<sup>th</sup>, 1986*

*web* [www.cs.columbia.edu/~kedzie](http://www.cs.columbia.edu/~kedzie)

*email* [kedzie@cs.columbia.edu](mailto:kedzie@cs.columbia.edu)

*github* <https://github.com/kedz>

*phone* +1 (925) 323 1837

## ABOUT

I am currently a 5<sup>th</sup> year Ph.D. student in the Department of Computer Science at Columbia University, working in the field of Natural Language Processing under Prof. KATHLEEN McKEOWN. My research has focused on applied machine learning for large scale, streaming news summarization. I am currently working on deep learning methods for content selection in text summarization problems. In general, I am interested in deep learning methods for text generation and text understanding.

## PUBLICATIONS

*Nov. 2018* Chris Kedzie, Kathleen McKeown, and Hal Daumé III. *Content Selection in Deep Learning Models of Summarization*

*Proceedings of the  
2018 Conference  
on Empirical  
Methods in  
Natural Language  
Processing*

Abstract: We carry out experiments with deep learning models of summarization across the domains of news, personal stories, meetings, and medical articles in order to understand how content selection is performed. We find that many sophisticated features of state of the art extractive summarizers do not improve performance over simpler models. These results suggest that it is easier to create a summarizer for a new domain than previous work suggests and bring into question the benefit of deep learning models for summarization for those domains that do have massive datasets (i.e., news). At the same time, they suggest important questions for new research in summarization; namely, new forms of sentence representations or external knowledge sources are needed that are better suited to the summarization task.

*July 2016* Chris Kedzie, Fernando Diaz, and Kathleen McKeown. *Real-Time Web Scale Event Summarization Using Sequential Decision Making*

*Proceedings of the  
25th International  
Joint Conference  
on Artificial  
Intelligence*

Abstract: We present a system based on sequential decision making for the online summarization of massive document streams, such as those found on the web. Given an event of interest (e.g. "boston marathon bombing"), our system is able to filter the stream for relevance and produce a series of short text updates describing the event as it unfolds over time. Unlike previous work, our approach is able to jointly model the relevance, comprehensiveness, novelty, and timeliness required by time-sensitive queries. We demonstrate a 28.3% improvement in summary  $F_1$  and a 43.8% improvement in time-sensitive  $F_1$  metrics.

*July 2015* Chris Kedzie, Kathleen McKeown, and Fernando Diaz. *Predicting Salient Updates for Disaster Summarization*

*Proceedings of the  
53rd Annual  
Meeting of the  
Association for  
Computational  
Linguistics*

Abstract: During crises such as natural disasters or other human tragedies, information needs of both civilians and responders often require urgent, specialized treatment. Monitoring and summarizing a text stream during such

an event remains a difficult problem. We present a system for update summarization which predicts the salience of sentences with respect to an event and then uses these predictions to directly bias a clustering algorithm for sentence selection, increasing the quality of the updates. We use novel, disaster-specific features for salience prediction, including geo-locations and language models representing the language of disaster. Our evaluation on a standard set of retrospective events using ROUGE shows that salience prediction provides a significant improvement over other approaches.

## TALKS

### *Nov. 2018* Content Selection in Deep Learning Models of Summarization

*Empirical Methods  
in Natural  
Language  
Processing*

I presented our long-paper submission at the 2018 meeting of the Conference on Empirical Methods in Natural Language Processing in Brussels. See associated paper abstract.

### *Oct. 2016* Machine Learning and Friends Lunch: Real-Time Web Scale Event Summarization Using Sequential Decision Making

*UMass Amherst*

I presented our recent summarization research at the CS department's weekly machine learning talk. See associated paper abstract.

### *July. 2016* Real-Time Web Scale Event Summarization Using Sequential Decision Making

*International Joint  
Conference on  
Artificial  
Intelligence*

I presented our long-paper submission at the 2016 meeting of the International Joint Conference on Artificial Intelligence in New York City. See associated paper abstract.

### *Nov. 2015* Learning 2 Summarize: TREC 2015

*Temporal  
Summarization  
Track, TREC 2015*

Abstract: In this talk, I present an overview of our participation in the temporal summarization track at the 2015 Text Retrieval Conference. Most of the available training data for this task consists of static judgments on returned updates, making it difficult to make use of sequential predictions in a learned model. I show how we used learning based search (SEARN, Learning2Search, LOLS) to sample realistic runs over the training streams and learn from dynamic features like previous update decisions and rolling stream observations. Our resulting system is able to build an event summary in an online fashion avoiding latency penalties while still outperforming retrospective approaches (e.g. clustering).

Joint work with FERNANDO DIAZ.

### *July 2015* Predicting Salient Updates for Disaster Summarization

*Association of  
Computational  
Linguistics*

I presented our long-paper submission at the 2015 meeting of the Association for Computational Linguistics in Beijing, China. See associated paper abstract.

### *Nov. 2014* Columbia U. at TREC: Temporal Summarization

*Temporal  
Summarization  
Track, TREC 2014*

Abstract: In this talk, I present an overview of our participation in the temporal summarization track at the 2014 Text Retrieval Conference. Our submission was one of the top overall submissions for this track. Our performance gain came largely from our precision in the summary update selection stage; I outline the details of our salience regression model and affinity propagation clustering architecture, including their effect on our scores. I also address our current system shortcomings, especially our inability to explicitly control for redundancy.

Joint work with FERNANDO DIAZ & KATHLEEN MCKEOWN.

### *Aug. 2014* Summarizing Disasters Over Time

Abstract: We have developed a text summarization system that can generate summaries over time from web crawls on disasters. We show that our method of identifying exemplar sentences for a summary using affinity propagation clustering produces better summaries than clustering based on K-medoids as measured using Rouge on a small set of examples. A key component of our approach is the prediction of salient information using event related features based on location, temporal changes in topic, and two different language models.

Joint work with FERNANDO DIAZ & KATHLEEN McKEOWN.

## DEMOS

*April 2016*      Monitoring Large Scale Disasters, DATA SCIENCE  
DAY

Columbia  
University's Data  
Science Institute

During crises such as natural disasters or other human tragedies, information needs of both civilians and responders often require urgent, specialized treatment. Monitoring and summarizing important information during such an event remains a difficult problem. We present a system for monitoring online news for such disasters. Given a query: e.g. "Hurricane Sandy," our system analyzes the web, and produces a sequence of updates, brief textual descriptions about the current state of the event, as that event unfolds over time. We use novel, disaster-specific features for generating updates, including geo-locations and language models representing the language of disaster. Our demo will allow users to see updates generated for pre-run queries including: Hurricane Sandy, the Boston Marathon bombing, and 40 other large scale disasters.

## DOCTORAL CONSORTIUM

*July 2016*      Extractive and Abstractive Event Summarization  
over Streaming Web Text, 25TH INTERNATIONAL JOINT  
CONFERENCE ON ARTIFICIAL INTELLIGENCE

## SUMMER SCHOOLS

*August 2016*      Deep Learning Summer School at the University  
of Montreal

## DEPARTMENTAL ACTIVITIES

*Sept. 2014 –*      Organizer, Columbia NLP Talks  
*Sept. 2017*

Coordinate and plan internal and visiting speakers to the NLP group at Columbia.

*June 2016 –*      Organizer, Columbia NLP Reading Group  
*Present*

Coordinate and plan weekly reading group on current research in NLP.

## WORK EXPERIENCE

*Summer 2017*      Research Intern, FACEBOOK Applied Machine  
Learning (AML)

I interned with Umut Ozertem in the AML group, focusing on click bait and hate speech detection. During my project, I developed an adversarial training method to improve performance of our convolutional neural network text classifiers. I implemented this architecture in PyTorch and Caffe2, and integrated it into the internal FBLeanner system for tracking and running experiments. My project is currently in use by several teams in the AML group, and is currently under submission for a patent.

MSR-NYC

#### Summer 2015 Research Intern, MICROSOFT RESEARCH

I interned with Fernando Diaz at Microsoft Research in New York City, continuing our collaboration on streaming news summarization. I developed scalable summarization systems to provide users with brief updates of news events as they were unfolding. Our work was submitted to the Temporal Summarization Track of the 2015 Text Retrieval Conference, where we were a top performer and invited to give a talk.

Columbia University

#### Spring 2014 Teacher's Assistant, COLUMBIA UNIVERSITY

I was the TA for the class *Semantic Technologies in IBM Watson*, taught by IBM researcher ALFIO GLIOZZO. The class covered the various inner workings of the Jeopardy playing computer. My responsibilities included teaching several lectures on foundational natural language processing tasks and problems, and an overview of the semantic web. Along with Dr. GLIOZZO, I helped guide and supervise the various student projects, one of which led to a publication at EMNLP 2014.

Stimmung  
stimmung.tv

#### 2008–2011 Composer's Assistant, STIMMUNG — New York

Performed audio engineering/mixing/editing and sheet music preparation for staff composers in a busy commercial music and sound post-production studio. Posted and presented work to clients. Provided general office support and correspondence. Organized and archived audio and video assets. Coordinated asset delivery to clients/post-production services. Worked on many CLEO and Emmy award winning commercial campaigns including several Super Bowl spots for such clients as: Coca-Cola, Mercedes-Benz, Kia, Levi's, and Monster.com. In addition to commercials, I also helped produce music for several independent films, documentaries, and television shows including *Reagan* (HBO), *The Rising: Rebuilding Ground Zero* (Discovery Communications), and *Journey to the Stars* (Hayden Planetarium, American Museum of Natural History).

KXLU 88.9FM  
kxlu.com

#### 2006–2008 Production Director, KXLU — Los Angeles

Worked with station directors and staff to plan concerts and events in the Los Angeles area, as well as the annual fundraiser. Supervised implementation of a new website. Coordinated the recording and broadcast of all live and pre-recorded performances and interviews at the station. Managed and researched equipment upgrades for the KXLU Production Studio.

## EDUCATION

PhD

#### 2014–Present Columbia University

*Natural Language Processing* · Dept. of Computer Science ·  
Fu Foundation School of Engineering & Applied Science  
Adviser: Prof. KATHLEEN MCKEOWN

Master of Science

#### 2013–2014 Columbia University

GPA: 3.87 · *Natural Language Processing* · Dept. of Computer Science ·  
Fu Foundation School of Engineering & Applied Science  
Adviser: Prof. KATHLEEN MCKEOWN

#### 2012–2013 Columbia University

GPA: 3.95 · *Post Baccalaureate Studies* · School of Continuing Education  
 Description: While taking introductory courses in computer science, I also worked as a research assistant for Prof. KATHLEEN McKEOWN and her student, SARA ROSENTHAL. Responsibilities included annotating research corpora for supervised learning systems, developing web crawlers to extract user discussions from online forums, and building research corpora for studies in automatic influence and agreement detection in natural language.

2011 Baruch College, CUNY

GPA: 4.0 · Continuing & Professional Studies  
 Description: I took two classes on Java and Oracle SQL development.

2004-2008 Loyola Marymount University

*Bachelor of Arts*

GPA: 3.34 · *Music/Recording Arts Double Major* · College of Communication and Fine Arts/School of Film and Television

#### COMPUTER SKILLS

<i>Languages (Adept)</i>	English, C/C++, PYTHON, LUA, JAVA, PERL, HTML, L <sup>A</sup> T <sub>E</sub> X
<i>Languages (Familiar)</i>	Latin, MATLAB, X10, JAVASCRIPT, SQL, SPARQL, LINUX/BASH/shell scripting
<i>Machine Learning Frameworks</i>	PyTorch, LuaTorch, TensorFlow, Caffe2, Theano, Scientific Python Stack (Numpy, Scipy, SciKit-Learn, iPython/Jupyter Notebook, etc.), VowpalWabbit

#### OTHER INFORMATION

*Interests* Experimental Music · Pop Music · Punk Rock

November 26, 2018