

### Abstract

The goal of Natural Language Processing (NLP) is to have computers understand human syntax and language<sup>1</sup>. This project aims to explore and design NLP and machine learning algorithms to solve novel text understanding problems. Specifically, we hope to develop automatic information extraction systems for summarization and usage on media bias and fake news analysis. Outlets with different ideologies were studied based on word usage and semantic structure to develop a framework for extraction methods.

### Background

NLP is the intersection of artificial intelligence and linguistics. Applications of NLP include voice recognition, media bias, and text summarization<sup>1</sup>. NLP is not exclusive to science. Whether politics, business, or journalism, NLP can be applied to anything involving spoken or written language.

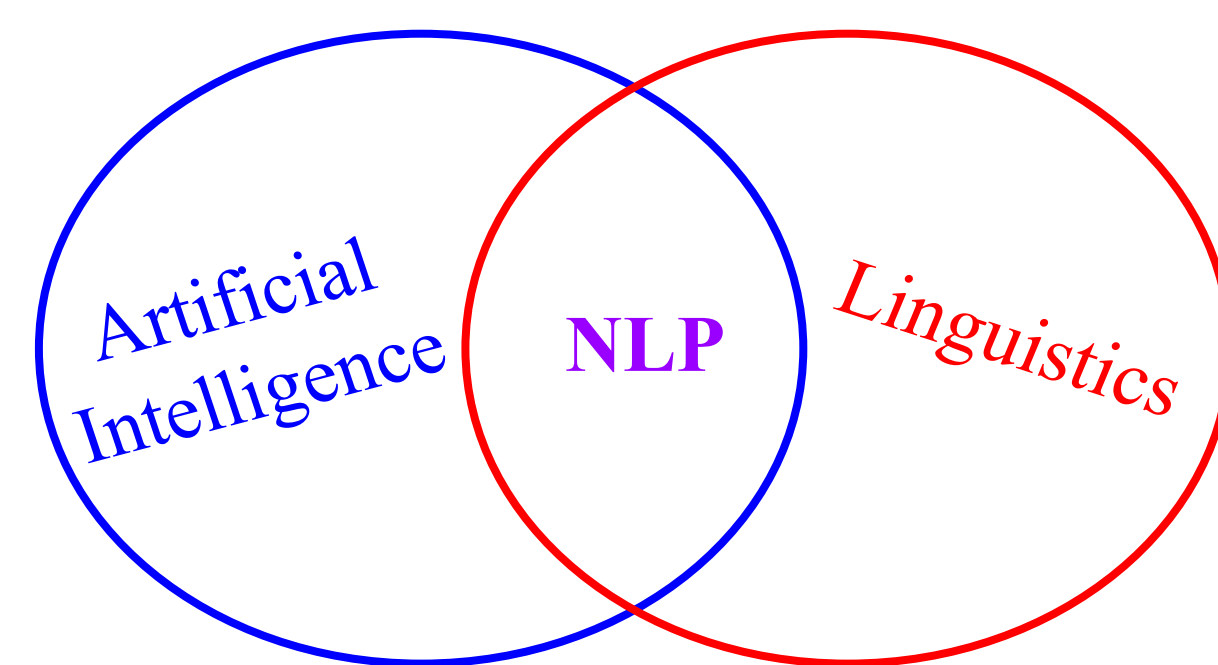


Figure 1. NLP helps computers to analyze, understand, alter, and generate human language.

### Methods

**Goals for Summarization Project:** Use NLP to understand how to generate summaries of long texts best and reformat Congressional Report Services (CRS) documents.

We used Recall-Oriented Understudy for Gisting Evaluation (ROUGE) to determine the quality of computer generated summaries by comparing them to human summaries<sup>2</sup>.

**Goal for Media Bias Project:** Use NLP to manually detect and categorize bias in news articles.

“My toy broke” vs. “I broke my toy”

Figure 2. Passive voice can be utilized to shift blame<sup>3</sup>.

We studied computational linguistics to identify frames and grammatical structures that are prone to implicit sentiment to create a framework for automatic bias detection algorithms.

### Results and Discussion

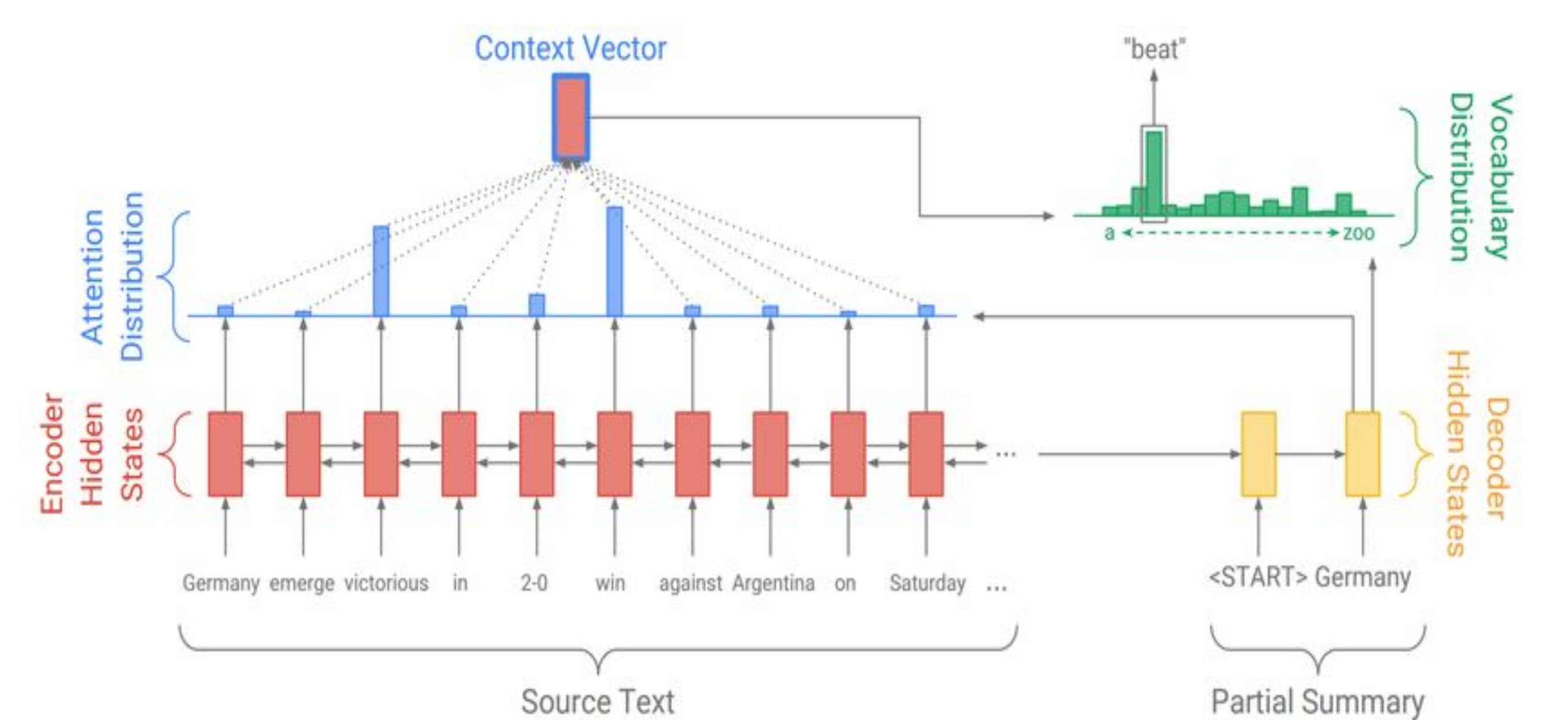


Figure 3. A sequence to sequence model takes words, and categorizes them by weight, and then tries to predict the next element of the sequence<sup>4</sup>.

**Original Text:** The 30-year-old scored four goals in 22 appearances for the Spitfires last season and spent three months on loan at Aldershot Town. Lafayette has previously had spells with Welling, Woking and Luton Town. Dover host Boreham Wood in the national league on Tuesday, having begun the 2016-17 season with a 0-0 draw at Wrexham on Saturday. Find all the latest football transfers on our dedicated page.

**Reference (human summary):** National league side Dover athletic have signed Ross Lafayette following his departure from Eastleigh.

**Lead 3 Summary (first three sentences)**  
ROUGE-1 F1 = 0.1333 ROUGE-2 F1 = 0.0285 ROUGE-L F1 = 0.0693

Figure 4. ROUGE scores are calculated based on word overlap, bigram overlap, and Longest Common Subsequence based statistics.



Figure 5. Information distributed by news outlets is not always reliable; some articles contain political bias that advocates wrong information<sup>5</sup>.

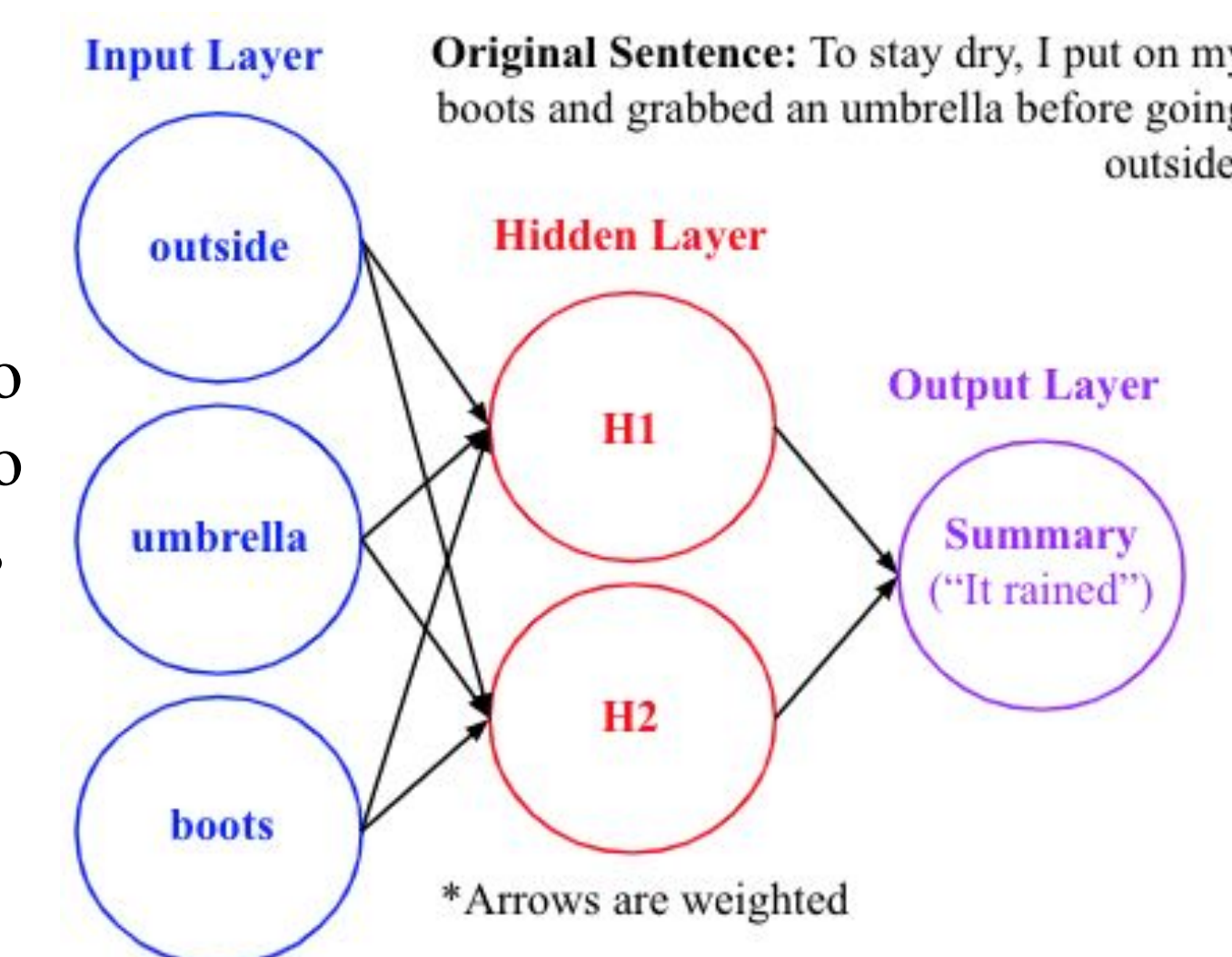
Summarized news articles help readers quickly obtain the main idea of an article without wasting time reading possibly unnecessary information. ROUGE helps indicate abstraction or lack of it in generated summaries. While many news outlets have a reputation for being biased, individual articles may not uphold the same idea.

### Future Work

#### Summarization Project

238 cleaned CRS documents will be used to develop and test abstractive summarization methods that are capable of condensing thousand-page reports into several sentences.

Figure 6. Modeled after human brains, neural networks are algorithms designed to recognize patterns. They help computers to generate summaries that contain sentences not found in the original text<sup>4</sup>.



#### Media Bias Project

The Lu Wang lab will continue investigating different bias strategies used by media outlets and create computational methods for detecting bias.

### References

1. Kiser, M. (2018, January 02). Introduction to Natural Language Processing (NLP). Retrieved from <https://blog.algorithmia.com/introduction-natural-language-processing-nlp/>
2. Lin, C. (n.d.). ROUGE: A Package for Automatic Evaluation of Summaries. Retrieved from <https://www.aclweb.org/anthology/W04-1013>
3. Greene, S., & Resnik, P. (n.d.). More than Words: Syntactic Packaging and Implicit Sentiment. Retrieved from <https://www.aclweb.org/anthology/N09-1057>
4. See, A., Lu, P. J., & Manning, C. D. (n.d.). Get To The Point: Summarization with Pointer-Generator Networks. Retrieved from <https://nlp.stanford.edu/pubs/see2017get.pdf>
5. Media Bias Chart. (2019, June 04). Retrieved from <https://www.allsides.com/media-bias/media-bias-chart>

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