Examining Political Rhetoric with Epistemic Stance Detection

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Introduction

Political discourse is often studied via labor-intensive manual content analysis.

We propose to help automate such analysis by analyzing sources' epistemic attitudes towards assertions

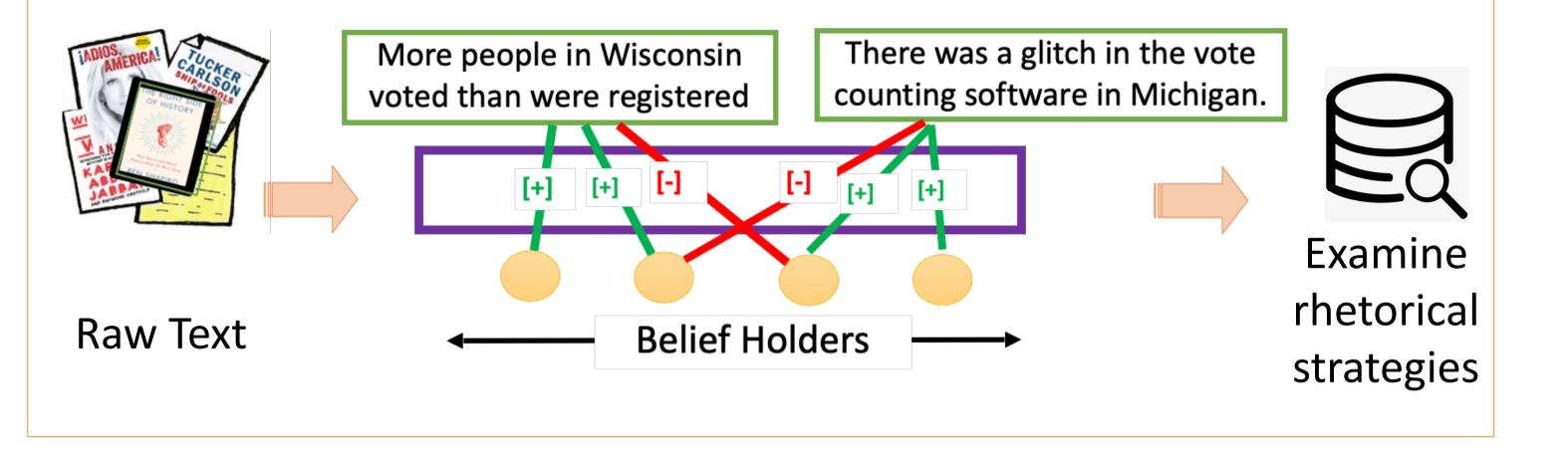
> **Epistemic Stance** "what entity believes and communicates as true"

Modelling

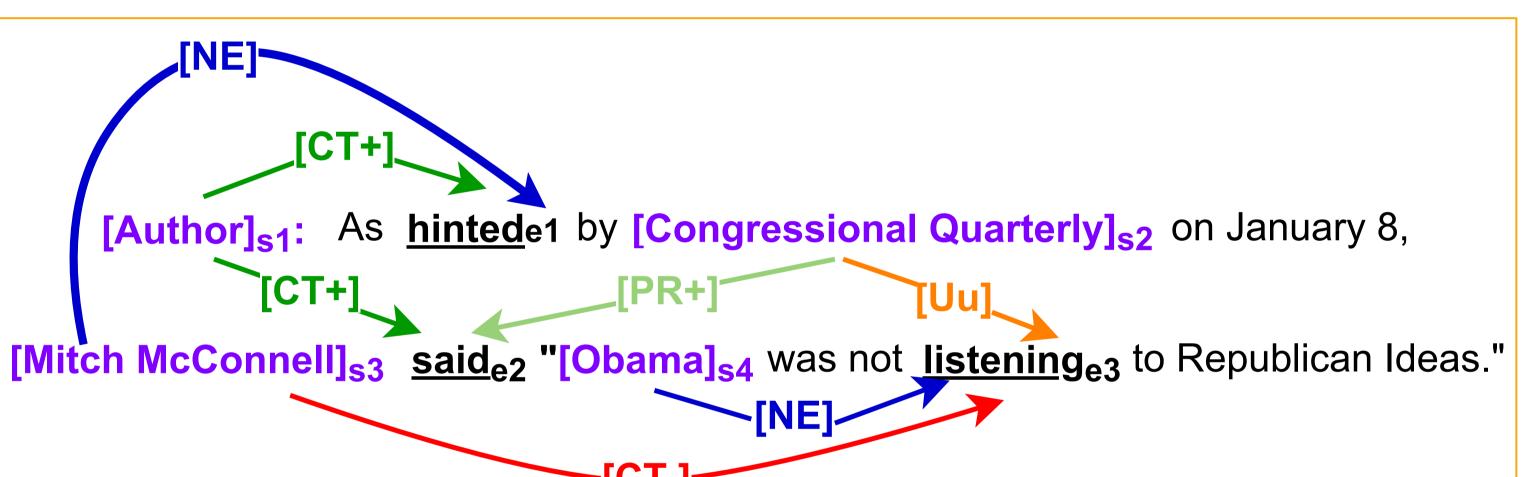
Fine-tuned RoBERTa model (Liu et al., 2019)

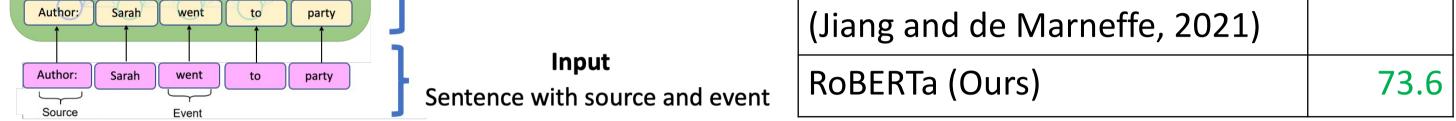
- Simple, making it accessible to social scientist users.
- Outperforms complex state-of-the-art models.

Label	Output Epistemic Stance Label	Model	F1 (%)
Linear Layer	Classification Layer	DeFacto (Saurí and Pustejovsky, 2012)	70.0
g Event Embedding		BiLSTM (Qian et al., 2018)	70.4
Sarah went to party RoBERTa	RoBERTa Model	AC-GAN (Qian et al., 2018)	72.6
	Contextual Word Embeddings	BERT	66.8









Case Study

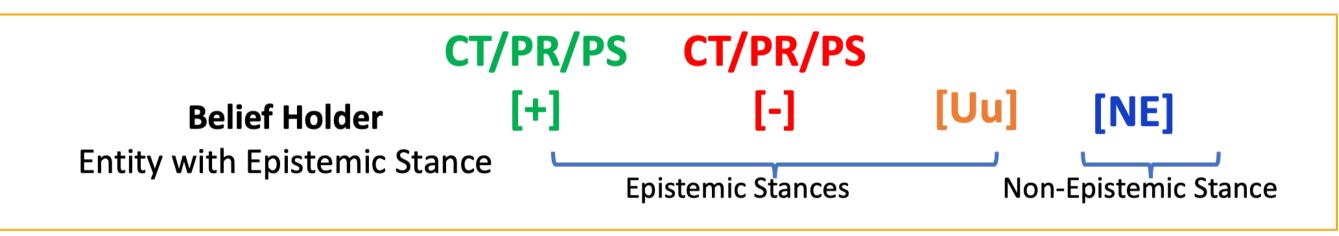
Belief Holder Identification

Analyzing rhetorical strategies require understanding belief assertions of various entities involved in political discourse.

Open Problem

How can we identify entities which hold beliefs according to the author of the text?

Belief Holder: A non-author source that holds at least one epistemic stance toward some event.

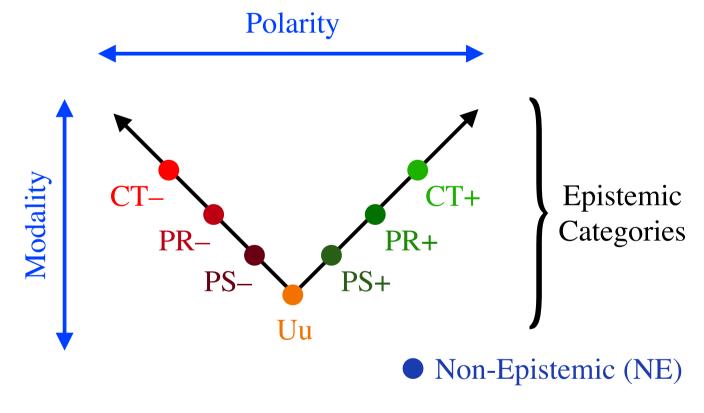


~[CT-]~

[Source] : A potential belief holder (author or an entity mentioned in text).

Event: States, processes, situations, propositions, facts, and possibilities.

Epistemic Stance: A **source's** belief about the described **events**.



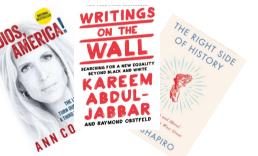
Epistemic stances characterized along two axes

- 1. Polarity: Positive (+) and negative (-)
- 2. Modality: Possible (PS), probable (PR) and certain (CT)

e.g., Certainly Positive: The source believes that the event certainly happened.

- e.g., Uncommitted: The source is unsure about the status of the event.
- e.g., Non-Epistemic: Does not make sense to assess stance of this source-event pair.

Corpus: Mass-Market Manifestos (MMM) corpus



- Political nonfiction authored by U.S. political opinion elites in English (1993-2020).
- 370 books (31.9 million tokens).
- 133 liberal, 226 conservative, and 11 independent books.



Highlighted Findings

Belief holder citation practices for each U.S. political ideology

Left Cited		Right Cited	
Economists	Studies	Founders	Democrats
Women	Research	Media	Officials
Polls	Republicans	Poll	President
Scientists	Group	Obama	Conservatives
Groups	Friend	Government	Liberals

Widely cited belief holders appearing in \geq 100 books

Connections between epistemic stances and rhetorical strategies

Highly committed CT+/CT-PR/PS Hedging Footing-shift, Citations Uu

Interesting Patterns:

Liberals respect technocratic authority (economists, scientists).

Conservative respect semi-mythical founders and show derision for the media.

Both sides frequently cite the opposition, though the right cites both conservatives and liberals.





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Paper & References:

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