

CSCE 771: Computer Processing of Natural Language

Lecture 22: Summary Generation

PROF. BIPLAV SRIVASTAVA, AI INSTITUTE

3RD NOVEMBER, 2022

Carolinian Creed: “I will practice personal and academic integrity.”

Organization of Lecture 22

- Opening Segment
 - Announcements

- Main Lecture



Main Section

- Summary generation
- Methods
 - Extractive - traceable to original content
 - Abstractive – non traceable to original content
 - Compressive – remove content but not information
- Applications

- Concluding Segment
 - About Next Lecture – Lecture 23

Recent Classes

| | |
|-------------------------|--|
| Nov 1 (Tu) | NLP Task: Sentiment |
| Nov 3 (Th) | NLP Task: Summarization |
| Nov 8 (Tu) | |
| Nov 10 (Th) | Conversation Agents |
| Nov 15 (Tu) | Ethical Concerns with NLP, Trusted AI and Societal Impact |
| Nov 17 (Th) | Working with LLMs for NLP Tasks - programming, Quiz |
| Nov 22 (Tu) | Paper presentations |
| Thanksgiving Holiday | |
| Nov 29 (Tu) | Project presentations |
| Dec 1 (Th) | Project presentations |
| Dec 8 (Tu) | Quiz |

Review of Lecture 21

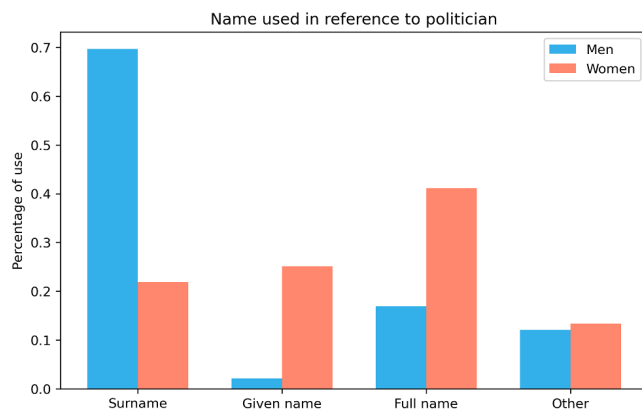
- Sentiment Analysis
- Methods
 - Lexicon-based Methods
 - Learning-based Methods
- Usability considerations - Ethical Issues

<https://journals.plos.org/plosone/article?id=10.1371/journal.pone.0274317>

"Discussion board comments were analyzed using statistical algorithms.

The researchers analyzed a total of 10 million English-language comments in conversations about male and female politicians from 312 different countries.

About half of Reddit users are from the United States, followed by UK and Canadian users with roughly 7.5% each. 90% of the politicians mentioned in the study are from the United States."



<https://journals.plos.org/plosone/article?id=10.1371/journal.pone.0274317>

OPEN ACCESS PEER-REVIEWED

RESEARCH ARTICLE

Quantifying gender biases towards politicians on Reddit

Sara Marjanovic, Karolina Stařczak , Isabelle Augenstein

Published: October 26, 2022 • <https://doi.org/10.1371/journal.pone.0274317>

| Article | Authors | Metrics | Comments | Media Coverage | Peer Review |
|---|---------|---------|----------|----------------|-------------|
|  | | | | | |

Abstract

- 1 Introduction
- 2 Data
- 3 Analyses
- 4 Results
- 5 Discussion
- 6 Conclusion
- Supporting information
- Acknowledgments
- References

Reader Comments
Figures

Abstract

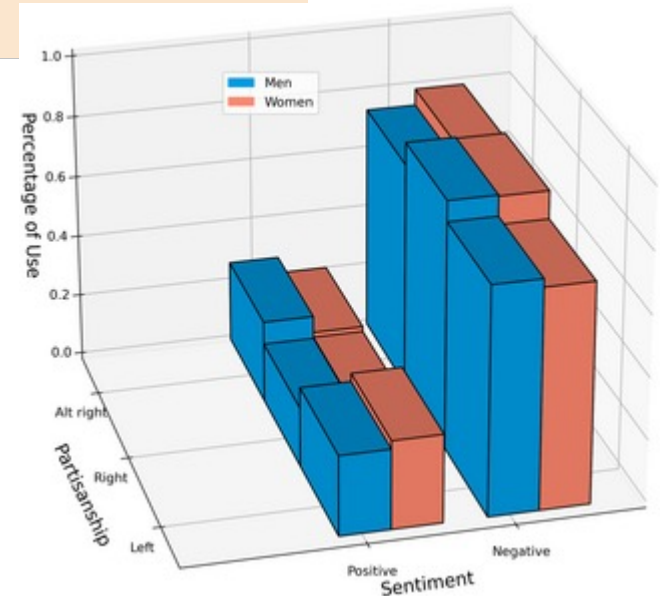
Despite attempts to increase gender parity in politics, global efforts have struggled to ensure equal female representation. This is likely tied to implicit gender biases against women in authority. In this work, we present a comprehensive study of gender biases that appear in online political discussion. To this end, we collect 10 million comments on Reddit in conversations *about* male and female politicians, which enables an exhaustive study of automatic gender bias detection. We address not only misogynistic language, but also other manifestations of bias, like benevolent sexism in the form of seemingly positive sentiment and dominance attributed to female politicians, or differences in descriptor attribution. Finally, we conduct a multi-faceted study of gender bias towards politicians investigating both linguistic and extra-linguistic cues. We assess 5 different types of gender bias, evaluating coverage, combinatorial, nominal, sentimental and lexical biases extant in social media language and discourse. Overall, we find that, contrary to previous research, coverage and sentiment biases suggest equal public interest in female politicians. Rather than overt hostile or benevolent sexism, the results of the nominal and lexical analyses suggest this interest is not as professional or respectful as that expressed about male politicians. Female politicians are often named by their first names and are described in relation to their body, clothing, or family; this is a treatment that is not similarly extended to men. On the now banned far-right subreddits, this disparity is greatest, though differences in gender biases still appear in the right and left-leaning subreddits. We release the curated dataset to the public for future studies.

Analysis of Bias

Sentimental Biases

When people discuss male and female politicians, do they express equal sentiment and power levels in the words chosen?

- **Coverage biases** – the amount of interest devoted.
- **Combinatorial biases** – are female politicians given a different role than male ones – are they mentioned, for example, in the context of other women, or as the one woman among many men?
- **Nominal biases** – how a politician is addressed (madam, minister, Mette, Hillary etc.) and what types of words are used to describe them?
- **Sentimental biases** – are equal sentiments and levels of power expressed in word choice regarding male and female politicians? – e.g., the quantity of positive words vs. negative as well as neutral words (such as 'goddess/dumb/republican').
- **Lexical biases** – what categories of words do people use to describe male and female politicians? For example, categories such as family, body and dress or profession.



<https://journals.plos.org/plosone/article?id=10.1371/journal.pone.027>

“Though gender differences are significant in both left-leaning and alt-right subreddits, the association strength is negligible, like the differences measured via the sentiment lexicon.”

Announcements

Reference: Project Rubric

- **Project results – 60%**
 - Working system ? – 30%
 - Evaluation with results superior to baseline? – 20%
 - Considered related work? – 10%
- **Project efforts – 40%**
 - Project report – 20%
 - Project presentation (updates, final) – 20%
- **Bonus**
 - Challenge level of problem – 10%
 - Instructor discretion – 10%
- **Penalty**
 - Lack of timeliness as per announced policy (right) - up to 60%

Milestones

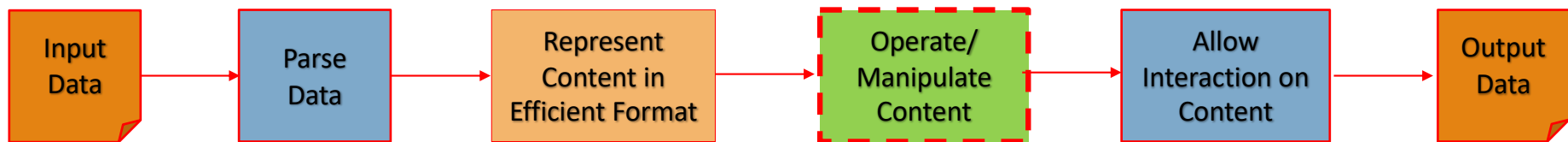
- Penalty: **not** ready by Sep 15, 2022 **[-20%]**
- Project report **not** ready by Nov 10, 2022 **[-20%]**
- Project presentations **not** ready by Nov 15, 2022 **[-10%]**

Project Report Guidelines

- Use template of ACM Computing Surveys – Latex or Word - <https://www.acm.org/publications/authors/submissions>
- Consider your report as a paper. Sections to have will be similar
 - **Abstract**: 1-line each on what, how, result // Optional
 - **Introduction**: motivation for the work // Optional
 - **Problem** // Clearly state input and output
 - **Related Work** // What are closely related work?
 - **Approach** // How does your system work?
 - **Evaluation** // How is the result better than a baseline? What better could have been done ?
 - **Discussion** // About results, what more could be done, anything else interesting
 - **Conclusion** // Optional
 - **References**

Main Lecture

Text Summarization



Motivation

- We have a variety of data around
 - Volume: Single document, Multiple documents
 - Variety: Text, numbers/ tables, figures, ...
 - Languages
- Can one get a quick insight about the data ? Meaning ?
 - Choice 1: **Important** ideas in the input
 - Choice 2: **Representative** ideas in the input
 - Choice 3: **Example** ideas in the input
 - Random selection is sufficient?

Example Text

1. <https://www.nytimes.com/article/2020-nobel-prize-winners.html>
2. 2020 Nobel Prize Winners: Full List
3. Nobel Prize season begins every October as committees in Sweden and Norway name laureates in a variety of prizes in the sciences, literature and economics, as well as peace work. The announcements started last week with the awarding of the prize in Physiology or Medicine. They wrapped up on Monday, when the Sveriges Riksbank Prize in Economic Sciences in Memory of Alfred Nobel was announced.
4. The Nobel Prizes most years are presented to recipients in Stockholm and Oslo in December. Because of the coronavirus pandemic, the committees are changing their approaches. Some of the events in Stockholm will be canceled in favor of a digital ceremony for the Nobelists, and medals and diplomas are to be distributed to the recipients' embassies and handed over in their home countries. Recipients may be invited to the award ceremony for 2021, if possible.
5. The Oslo ceremony for the peace prize will be smaller than in most years, with a limited audience.
6. The Nobel committee also announced another change last month: Each prize will rise to 10 million Swedish krona, 1 million more than in the previous year. That's a hike in the prize value of about \$112,000 in current exchange rates.
7. The 2020 Winners
8. Physiology or Medicine
9. Drs. Harvey J. Alter, Michael Houghton and Charles M. Rice on Monday received the prize for their discovery of the hepatitis C virus. The Nobel committee said the three scientists had "made possible blood tests and new medicines that have saved millions of lives."
10. Physics
11. Roger Penrose, Reinhard Genzel and Andrea Ghez are the recipients of the Nobel Prize in Physics for 2020. Credit: Pool photo by Fredrik Sandberg
12. Roger Penrose, Reinhard Genzel and Andrea Ghez received the prize on Tuesday for their discoveries that have improved understanding of the universe, including work on black holes.
13. Chemistry
14. The Nobel Prize in Chemistry was jointly awarded on Wednesday to Emmanuelle Charpentier and Jennifer A. Doudna for their work on the development of Crispr-Cas9, a method for genome editing.
15. Literature
16. The Nobel Prize in Literature was awarded on Thursday to Louise Glück, one of America's most celebrated poets, "for her unmistakable poetic voice that with austere beauty makes individual existence universal."
17. Peace Prize
18. The Nobel Peace Prize was awarded on Friday to the World Food Program for its efforts to combat a surge in global hunger amid the coronavirus pandemic, which has swept around the world with devastating impact.
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A Few Ways to Generate Insights

- Word tag cloud (textual data; based on frequency)
 - Important
- Topic analysis (textual data, based on learned patterns)
 - Important
- **Summary generation** – formal study
 - Representative
 - Important
 - Example

Example Text

Summary Generated

1. 2020 Nobel Prize Winners: Full List Nobel Prize season begins every October as committees in Sweden and Norway name laureates in a variety of prizes in the sciences, literature and economics, as well as peace work. ?
2. Peace Prize The Nobel Peace Prize was awarded on Friday to the World Food Program for its efforts to combat a surge in global hunger amid the coronavirus pandemic, which has swept around the world with devastating impact.
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Summarizing Weather of a Place

Week 1 [103-107; 79-88]

Week 2 [105-112; 84-88]

Week 3 [111-115; 88-92]

<https://www.accuweather.com/en/us/tempe/85281/july-weather/336877?year=2022>

Thunderstorm outbreak to threaten full spectrum of severe weather dangers, including tornadoes. Get the

AccuWeather Tempe, AZ 71° F ☁

July ▾ 2022 ▾ DAILY →

| S | M | T | W | T | F | S |
|-------------|-------------|-------------|-------------|-------------|-------------|-------------|
| 26 | 27 | 28 | 29 | 30 | 1 | 2 |
| 107° 80° | 103° 79° | 107° 87° | 109° 89° | 105° 87° | 108° 88° | 105° 88° |
| 3 | 4 | 5 | 6 | 7 | 8 | 9 |
| 109° 87° | 105° 84° | 105° 87° | 107° 84° | 107° 84° | 112° 87° | 110° 88° |
| 10 | 11 | 12 | 13 | 14 | 15 | 16 |
| 113° 89° | 115° 91° | 112° 93° | 113° 93° | 111° 88° | 112° 88° | 114° 92° |

<https://www.accuweather.com/en/us/tempe/85281/july-weather/336877?year=2022>

Summarizing Weather – Appropriate?

Week 1 [103-107; 79-88]:

The minimum temp varied more than max

Week 2 [105-112; 84-88]:

The max temp varied more than temp

Week 3 [111-115; 88-93]:

Both temps varied about the same

<https://www.accuweather.com/en/us/tempe/85281/july-weather/336877?year=2022>

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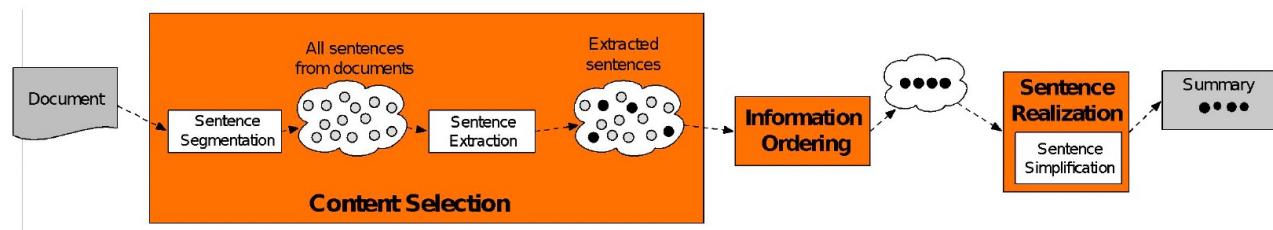
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Summarization Type and Methods

- **Extractive:** extract summary **with** content in the input
 - Should be able to trace output back to the input
 - Interpretability is easy to show
- **Abstractive:** create summary **from ideas** in the content in the input
 - but using at least some different words
 - Useful in creative task – digital journalism
- **Compressive:** remove redundant from input
 - shorter sentence by removing redundant information
 - Preserve grammar and important content in the input

Generic Summarization Approach

1. **content selection**: choose sentences to extract from the document
2. **information ordering**: choose an order to place them in the summary
3. **sentence realization**: clean up the sentences



Credit: Chan Young Park's slides

Evaluation of Text Summarization

- **Intrinsic** – How good is the output ?
- Considerations
 - Quality of output - readability
 - Coherence of information – out of context sentences ?
 - Compression of information

Comparison against a reference summary

- Is this the only summary possible?
- A scale of what summary should contain
- Constraints on summary characteristics.
E.g., number of words

Where is the reference summary?

- **Experts do not agree on summaries**
 - Variance between experts
 - Not even their when separated 8-weeks apart nearly 50% times
- **But experts often agree on important sentences** that make up into a summary

Summarization Evaluation: An Overview, Inderjeet Mani,
<http://research.nii.ac.jp/ntcir/workshop/OnlineProceedings2/sum-mani.pdf> 2019

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Automatic Evaluation

- Against a set of criteria
- Criteria can be task independent or task-dependent
- Can also be about sentences to include and their rank
- Can also be about topics in content and in summary

Metrics

- ROUGE (Recall Oriented Understudy for Gisting Evaluation) score
- METEOR (Metric for Evaluation of Translation with Explicit Ordering) score
- BLEU (bilingual evaluation understudy) score
- SUMMAC summary automatic scoring

Summarization Evaluation: An Overview, Inderjeet Mani,
<http://research.nii.ac.jp/ntcir/workshop/OnlineProceedings2/sum-mani.pdf> 2019

Evaluation of Text Summarization

- **Extrinsic** – What is the impact of the output ?
- Overall idea
 - Describe a task that a person wants to do with a summary
 - Given the generated summary, how well can a person do that job
- Comments
 - Extrinsic useful for business sponsor but not directly to technical developer

Summarization Evaluation: An Overview, Inderjeet Mani,
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Coding Illustration - Extractive

<https://github.com/biplav-s/course-nl/tree/master/l20-textsumm>

Coding Illustration – LLM Based

<https://github.com/biplav-s/course-nl-f22/blob/main/sample-code/l21-24-llm-tasks/Summarization-withTransformers.ipynb>

Evaluation in Example Text

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Learning for Extractive Summarization

- **Neural Extractive Text Summarization with Syntactic Compression**
 - <https://arxiv.org/abs/1902.00863>
- Extracting candidates and learning to score importance in single documents
- Specifically,
 - choose sentences from the document
 - identify possible compressions based on constituency parses
 - scores compressions with a neural model to produce the final summary

Detailed Review of Summarization Methods

Chan Young Park's slides: <http://demo.clab.cs.cmu.edu/algo4nlp19/slides/summarization.pdf>

Coding Illustration - Abstractive

<https://github.com/biplav-s/course-nl/tree/master/l20-textsumm>

Discussion: State of Art and Metrics

<http://nlpprogress.com/english/summarization.html>

Compressive Summarization

- Summary as a content deletion task preserving crucial information in the input
- Metrics
 - F1 score – for measuring content quality
 - Compression factor – for measuring compression efficiency
- Sanity check – baseline – method
 - Random word chooser/ remover !

Reference:

<http://nlpprogress.com/english/summarization.html>

Lecture 22: Concluding Comments

- We looked at Summary generation
- Methods
 - Extractive - traceable to original content
 - Abstractive – non traceable to original content
 - Compressive – remove content but not information
- Applications

About Next Lecture – Lecture 23

Lecture 23 Outline

- Conversation Agents
 - Rule based methods
 - (Deep) learning based methods
- Applications
- Ethical Issues