## PHASE ONE

**Project 15: Web search with linguistic expansions from Term-Frequency Histograms** 

Sean Ellis Yu Hang Lee

## **Objective and Learning Goals**

- 1. Explore how starting from a given query, alternative query formulations can be devised that can help improve information retrieval on the web
- 2. Involve the use of WordBars System
- 3. Implement the WordBars methodology
- 4. Identify the high frequency terms
- 5. Explore how well different senses of these terms can help refine the query information by using WordNet



Most Important Terms with Different Type of Data Representation

### **Keywords/Phrases**

#### WordBars

- Present the distribution of results in relation to the terms of the corresponding query and facilitate browsing of the results.
- Present with a list or bar-graph of the most frequently occurring terms in the result set of a given query

### Term-Frequencies

- Represent documents as a collection of terms
- How often a term occurs in the documents

### TF-IDF (Term Frequency/Inverse Document Frequency)

- weighting scheme that adjusts each frequency value by taking its product with the inverse document frequency of the term. This approach separates individual documents that may not be distinguishable from other documents that include the same term(s).

#### WordNet

- Online lexical reference system whose design is inspired by current psycholinguistic theories of human lexical memory
- Different relations link the synonym sets

## Languages/APIs: What Will Help Us Achieve Our Program Goals?

<u>Bootstrap Framework</u> - main source to establish the User Interface using Hypertext Markup Language/Cascading Style Sheets/JavaScript.

### **Python** - primary back-end language for:

- Hosting the Web Server
- Handling all Web Server Requests made by the user
- Retrieving/Manipulating Data Queries

**WordNet API** - Help with refining the query to search for different relationships and words.

**BeautifulSoup API** - Python API that will assist in pulling Data from the found HTML Pages.

**NLTK API** - API that will help tokenize words, and conduct pre-filtering techniques.

### **Projected User Interface**



by T Rus - Cited by 2 - Related articles

# A ≡

### **Optimizations**

• Implementing Singular Value Decomposition (SVD)

Recall that the purpose of SVD is to bring forth *latent*, or hard-to-see relationships within the data.

• Pre-Filter with Stop-List/Stemming

*Note:* Pre-filtering may cause slower execution and data retrieval if not implemented correctly.

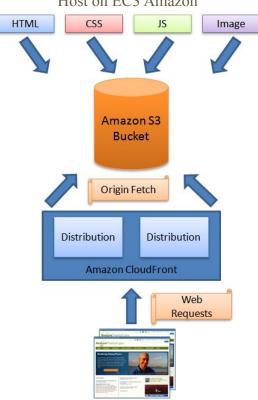
#### Example of Pre-defined Stop Words with NLTK:

```
print(stopwords.words('english'))

['i', 'me', 'my', 'myself', 'we', 'our', 'ours', 'ourselves', 'you',
'yours', 'yourself', 'wey, 'them', 'their', 'theirs', 'themselves
t', 'its', 'itself', 'they', 'them', 'their', 'theirs', 'themselves
t', "that'll", 'these', 'those', 'am', 'is', 'are', 'was', 'were', 'k
ng', 'do', 'does', 'did', 'doing', 'a', 'an', 'the', 'and', 'but', 'i
f', 'at', 'by', 'for', 'with', 'about', 'against', 'between', 'into',
e', 'below', 'to', 'from', 'up', 'down', 'in', 'out', 'on', 'off', 'c
e', 'here', 'there', 'when', 'where', 'why', 'how', 'all', 'any', 'bc
me', 'such', 'no', 'nor', 'not', 'only', 'own', 'same', 'so', 'than',
'don', "don't", 'should', "should've", 'now', 'd', 'll', 'm', 'o', 'r
n', "couldn't", 'didn', "didn't", 'doesn', "doesn't", 'hadn', "hadn't
"isn't", 'ma', 'mightn', "mightn't", "mustn't", 'mustn't", 'wouldn',
"t", 'wasn', "wasn't", 'weren', "weren't", 'won', "won't", 'wouldn',
```

## **Bonus Challenge**

Host on EC3 Amazon



#### References

- 1. O. Hoeber and X. D. Yang, Evaluating the effectiveness of term frequency histograms for supporting interactive Web search tasks, In Proceedings of the ACM Conference on Designing Interactive Systems, pp. 360-368, 2008
- 2. R. Singh, Ya-Wen Hsu, and N. Moon, "Multiple-Perspective Interactive Search: A Paradigm for Exploratory Search and Information Retrieval on the Web", Journal of Multimedia Tools and Applications, Vol. 62, pp. 507-543, 2013
- 3. Rahul, S. (2021). MULTIMEDIA INFORMATION SYSTEMS. *MULTIMEDIA INFORMATION SYSTEMS*, 29–80. https://ilearn.sfsu.edu/ay2021/pluginfile.php/1068666/mod\_resource/content/1/MULTIMEDIA-LectureNotes-Class.pd f
- 4. Create a Python Web Server Python Tutorial. (2020). Python. https://pythonbasics.org/webserver/
- 5. Otto, M. J. T. (2021). *Bootstrap*. Bootstrap. https://getbootstrap.com/

# **PHASE TWO**

Project 15: Web search with linguistic expansions from Term-Frequency Histograms

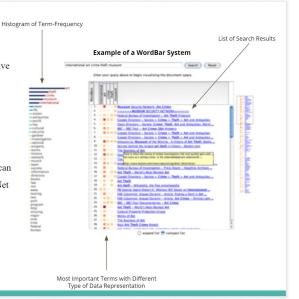
Sean Ellis Yu Hang Lee

# **Phase One Summary**



#### **Objective and Learning Goals**

- Explore how starting from a given query, alternative query formulations can be devised that can help improve information retrieval on the web
- 2. Involve the use of WordBars System
- 3. Implement the WordBars methodology
- 4. Identify the high frequency terms
- Explore how well different senses of these terms can help refine the query information by using WordNet



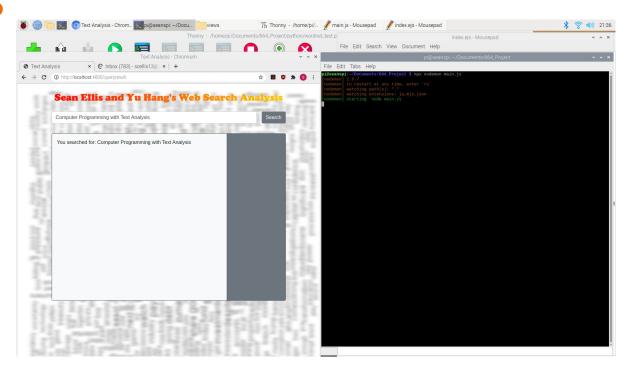
# **Front End Progress**

#### **Current Features:**

- Using ExpressJS with EJS
- Hosting as Localhost
- Can serve data from server to client
- Can process search request.

#### **Challenges with Front-End**

- Accessing Python/JSON elements
- Keeping design simple
- Connecting it to Python Scripts for Query Analysis
- \*\*\*Finding a simple API to conduct
   Web Searches\*\*\*



## **Beginnings of Text Analysis: Pre-processing/Filtering**

```
Switch to
                                                                                                                                                                       regular
                                                                                                                                                                        mode
wordnet_test.py ×
     from nltk.corpus import wordnet
     from nltk.corpus import stopwords
     from nltk.stem import PorterStemmer
     from nltk.tokenize import word tokenize
     import requests
     searchQuery = "Computer Programming with Text Analysis"
     queryTokens step1 = []
 10 queryTokens step2 = []
    queryTokens step3 = []
    minRead = 0
     maxRead = 100000
    stop words = set(stopwords.words("english")) #list of stop words by default from NLTK
    ps = PorterStemmer()
17
18 #Pre-processing:
 19 def tokenizeAndFilter(text):
         ##Step 1: Tokenize
20
21
22
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29
30
31
32
         queryTokens step1 = word tokenize(text)
         ##Step 2: Stop Words
         for token in queryTokens step1:
             if token not in stop words:
                 queryTokens step2.append(token)
         ##Step 3: Stemming
         for token in queryTokens step2:
             queryTokens step3.append(ps.stem(token))
         return queryTokens step3
```

#### **Current Features:**

- Using NLTK and Python Scripting
- Pre-processing given text through:
  - Tokenizing
  - Filtering (Stop-List, Stem)
- Word Counting

#### **Challenges with Back-End**

- Properly utilizing WordNet to optimize results.
- Single thread use is increasing process time
- \*\*\*Connecting Python script to the Web Server JavaScript\*\*\*

## Beginnings of Text Analysis: Pre-processing/Filtering - Code Continued

```
wordnet_test.py ¾
 18 #Pre-processing:
 19 def tokenizeAndFilter(text):
        queryTokens_step1 = word_tokenize(text)
        ##Step 2: Stop Words
        for token in queryTokens step1:
            if token not in stop words:
                queryTokens_step2.append(token)
        ##Sten 3. Stemming
        for token in queryTokens step2:
             queryTokens step3.append(ps.stem(token))
        return queryTokens step3
    print("First five search results with Query: ", searchQuery)
    url1 = "https://monkeylearn.com/text-analysis/
    url2 = "https://matrix.berkeley.edu/research/tips-computational-text-analysis/"
    url3 = "https://www.predictiveanalyticstoday.com/top-free-software-for-text-analysis-text-mining-text-analytics/"
    url4 = "https://guides.temple.edu/corpusanalysis"
    url5 = "https://uk.sagepub.com/en-gb/eur/computer-assisted-text-analysis/book205979"
    unfilteredTokens = word tokenize(searchQuery)
    print("\n\nCounting Words from with unfiltered query: ", unfilteredTokens)
 45 def count tokens(textList, tokenList):
        wordFreq = []
         for word in tokenList:
             wordFreq.append(textList.count(word))
         return str(list(zip(tokenList, wordFreq)))
```

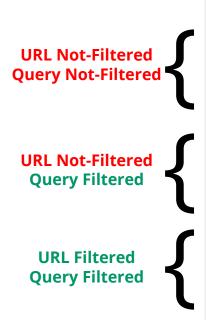
#### **Current Features:**

- Using NLTK and Python Scripting
- Pre-processing given text through:
  - Tokenizing
  - Filtering (Stop-List, Stem)
- Word Counting

#### **Challenges with Back-End**

- Properly utilizing WordNet to optimize results.
- Single thread use is increasing process time
- \*\*\*Connecting Python script to the Web Server JavaScript\*\*\*

## **Beginnings of Text Analysis: Test 1 - Small Range of Characters**



```
>>> %Run wordnet test.py
First five search results with Ouery: Computer Programming with Text Analysis
 Counting Words from with unfiltered query: ['Computer', 'Programming', 'with', 'Text', 'Analysis']
          https://monkeylearn.com/text-analysis/
          [('Computer', 0), ('Programming', 0), ('with', 0), ('Text', 0), ('Analysis', 0)]
          https://matrix.berkeley.edu/research/tips-computational-text-analysis/
          [('Computer', 0), ('Programming', 0), ('with', 0), ('Text', 1), ('Analysis', 1)]
           https://www.predictiveanalyticstoday.com/top-free-software-for-text-analysis-text-mining-text-analytics/
          [('Computer', 0), ('Programming', 0), ('with', 0), ('Text', 0), ('Analysis', 0)]
          https://guides.temple.edu/corpusanalysis
          [('Computer', 0), ('Programming', 0), ('with', 0), ('Text', 0), ('Analysis', 3)]
          https://uk.sagepub.com/en-gb/eur/computer-assisted-text-analysis/book205979
          [('Computer', 0), ('Programming', 0), ('with', 0), ('Text', 0), ('Analysis', 0)]
 Counting Words from with filtered tokens: ['comput', 'program', 'text', 'analysi']
          https://monkeylearn.com/text-analysis/
          [('comput', 0), ('program', 0), ('text', 0), ('analysi', 0)]
          https://matrix.berkeley.edu/research/tips-computational-text-analysis/
          [('comput', 0), ('program', 0), ('text', 0), ('analysi', 0)]
          https://www.predictiveanalyticstoday.com/top-free-software-for-text-analysis-text-mining-text-analytics/
          [('comput', 0), ('program', 0), ('text', 0), ('analysi', 0)]
          https://quides.temple.edu/corpusanalysis
          [('comput', 0), ('program', 0), ('text', 0), ('analysi', 0)]
          https://uk.sagepub.com/en-gb/eur/computer-assisted-text-analysis/book205979
          [('comput', 0), ('program', 0), ('text', 0), ('analysi', 0)]
 Counting Words with filtered tokens AND filtered text tokens: ['comput', 'program', 'text', 'analysi']
          https://monkeylearn.com/text-analysis/
          [('comput', 2), ('program', 2), ('text', 2), ('analysi', 2), ('comput'.
          https://matrix.berkeley.edu/research/tips-computational-text-analysis/
          [('comput', 4), ('program', 3), ('text', 4), ('analysi', 4), ('comput'
          https://www.predictiveanalyticstoday.com/top-free-software-for-text-analysis-text-mining-text-analytics/
          [('comput', 6), ('program', 4), ('text', 6), ('analysi', 6), ('comput' ...
          https://guides.temple.edu/corpusanalysis
          [('comput', 11), ('program', 5), ('text', 8), ('analysi', 11), ('compu
          https://uk.sagepub.com/en-gb/eur/computer-assisted-text-analysis/book205979
          [('comput', 16), ('program', 6), ('text', 10), ('analysi', 16), ('comp
```

## **Beginnings of Text Analysis: Test 2 - Large Range of Characters**

**URL Not-Filtered Query Not-Filtered URL Not-Filtered Query Filtered URL Filtered Query Filtered** 

```
>>> %Run wordnet test.py
 First five search results with Query: Computer Programming with Text Analysis
 Counting Words from with unfiltered query: ['Computer', 'Programming', 'with', 'Text', 'Analysis']
           https://monkeylearn.com/text-analysis/
           [('Computer', 0), ('Programming', 0), ('with', 0), ('Text', 0), ('Analysis', 0)]
           https://matrix.berkeley.edu/research/tips-computational-text-analysis/
           [('Computer', 1), ('Programming', 0), ('With', 9), ('Text', 14), ('Analysis', 13)]
           https://www.predictiveanalyticstoday.com/top-free-software-for-text-analysis-text-mining-text-analytics/
[('Computer', 0), ('Programming', 0), ('with', 0), ('Text', 0), ('Analysis', 0)]
           https://quides.temple.edu/corpusanalysis
           [('Computer', 0), ('Programming', 0), ('with', 9), ('Text', 1), ('Analysis', 9)]
           https://uk.sagepub.com/en-gb/eur/computer-assisted-text-analysis/book205979
           [('Computer', 4), ('Programming', 0), ('with', 11), ('Text', 11), ('Analysis', 18)]
 Counting Words from with filtered tokens: ['comput', 'program', 'text', 'analysi']
           https://monkeylearn.com/text-analysis/
           [('comput', 0), ('program', 0), ('text', 6), ('analysi', 0)]
           https://matrix.berkeley.edu/research/tips-computational-text-analysis/
           [('comput', 0), ('program', 3), ('text', 34), ('analysi', 0)]
           https://www.predictiveanalyticstoday.com/top-free-software-for-text-analysis-text-mining-text-analytics/
           [('comput', 0), ('program', 0), ('text', 0), ('analysi', 0)]
           https://guides.temple.edu/corpusanalysis
           [('comput', 0), ('program', 0), ('text', 14), ('analysi', 0)]
           https://uk.sagepub.com/en-gb/eur/computer-assisted-text-analysis/book205979
           [('comput', 0), ('program', 0), ('text', 7), ('analysi', 0)]
 Counting Words with filtered tokens AND filtered text tokens: ['comput', 'program', 'text', 'analysi']
           https://monkeylearn.com/text-analysis/
           [('comput', 2), ('program', 2), ('text', 8), ('analysi', 2), ('comput' ...
           https://matrix.berkeley.edu/research/tips-computational-text-analysis/
           [('comput', 46), ('program', 19), ('text', 79), ('analysi', 40), ('com ...
           https://www.predictiveanalyticstoday.com/top-free-software-for-text-analysis-text-mining-text-analytics/
           [('comput', 90), ('program', 36), ('text', 150), ('analysi', 78), ('co.
           https://quides.temple.edu/corpusanalysis
           [('comput', 154), ('program', 54), ('text', 255), ('analysi', 139), ('
           https://uk.sagepub.com/en-gb/eur/computer-assisted-text-analysis/book20597
           [('comput', 224), ('program', 73), ('text', 378), ('analysi', 224), ('
```

Test Difference: More words to compare at the start of the HTML Document.

URL Result #5 matches best so far by Word Count/Filtering alone.

# **New Challenges Arise**

- 1. How are we going to <u>efficiently tokenize and filter, and return results</u> back to the user in a *reasonable time*?
- 2. How are we going to connect our Python data to our Web Server?
- 3. How can we <u>utilize WordNet and Synsets</u> to optimize the results?
- 4. What <u>better API's/Languages</u> can we code with/instead to be more productive in Text Analysis?
- 5. How can we use <u>NLTK's Word Similarities Percentages</u>, and use it to our advantage when comparing results, or tokens?

## References

- 1. O. Hoeber and X. D. Yang, Evaluating the effectiveness of term frequency histograms for supporting interactive Web search tasks, In Proceedings of the ACM Conference on Designing Interactive Systems, pp. 360-368, 2008
- 2. NLTK Toolkit. *Natural Language Toolkit*. <a href="https://www.nltk.org/">https://www.nltk.org/</a>. Accessed on 4/1/2021.

## **Project Contributions**

Sean Ellis

Yu Hang Lee

Web Server Hosting, NLTK Implementation/Importing, Python Scripting, ExpressJS/EJS, Slideshow Organization

WordNet Application, Python Scripting, Slideshow Organization, Project Overview

# **Final Phase**

**Project 15: Web search with linguistic expansions from Term-Frequency Histograms** 

Sean Ellis Yu Hang Lee

# **End Goal In Sight?**



### **Initial Discoveries:**

- Calculating query refinement comes at a major sacrifice to time/performance, if performed in real-time.
- \*Figuring out the right combination of Synset values can be complex.
- 3. <u>Performing mathematical calculations</u> without libraries is troublesome.

# **Major Question**

The assignment focuses on identifying high frequency terms, and to explore how well different senses of these terms can help refine the query formulation . But the questions still arise...



# **Potential Case Studies**

## **Compare/Analyze the Results**

$$w_{i,j} = tf_{i,j} \times \log_2(\frac{N}{df_i})$$

 $tf_{i,j}$  = number of occurrences of i in j  $df_i$  = number of documents containing iN = total number of documents



#### **How We Will Handle Including Tokens to Compare Text**

| Case 1:         | Case 2:        | Case 3:        |
|-----------------|----------------|----------------|
| Original Query  | Original Query | Original Query |
| Original Tokens | Synset Tokens  | Combine Tokens |
| Case 4:         | Case 5:        | Case 6:        |
| New Query       | New Query      | New Query      |
| Original Tokens | Synset Tokens  | Combine Tokens |
| Case 7:         | Case 8:        | Case 9:        |
| Combine Query   | Combine Query  | Combine Query  |
| Original Tokens | Synset Tokens  | Combine Tokens |

How We Will Handle the Web Engine Search

## References

- 1. O. Hoeber and X. D. Yang, Evaluating the effectiveness of term frequency histograms for supporting interactive Web search tasks, In Proceedings of the ACM Conference on Designing Interactive Systems, pp. 360-368, 2008
- 2. NLTK Toolkit. *Natural Language Toolkit*. <a href="https://www.nltk.org/">https://www.nltk.org/</a>. Accessed on 4/1/2021.
- 3. O. Hoeber and X. D. Yang, Evaluating the effectiveness of term frequency histograms for supporting interactive Web search tasks, In Proceedings of the ACM Conference on Designing Interactive Systems, pp. 360-368, 2008
- 4. R. Singh, Ya-Wen Hsu, and N. Moon, "Multiple-Perspective Interactive Search: A Paradigm for Exploratory Search and Information Retrieval on the Web", Journal of Multimedia Tools and Applications, Vol. 62, pp. 507-543, 2013
- 5. Rahul, S. (2021). MULTIMEDIA INFORMATION SYSTEMS. *MULTIMEDIA INFORMATION SYSTEMS*, 29–80. <a href="https://ilearn.sfsu.edu/ay2021/pluginfile.php/1068666/mod\_resource/content/1/MULTIMEDIA-LectureNotes-Class.pdf">https://ilearn.sfsu.edu/ay2021/pluginfile.php/1068666/mod\_resource/content/1/MULTIMEDIA-LectureNotes-Class.pdf</a>
- 6. Create a Python Web Server Python Tutorial. (2020). Python. <a href="https://pythonbasics.org/webserver/">https://pythonbasics.org/webserver/</a>
- 7. Otto, M. J. T. (2021). *Bootstrap*. Bootstrap. https://getbootstrap.com/

### **Project Contributions**

Sean Ellis

Yu Hang Lee