

Assignment 4

A. Sentiment Analysis

The **cleaned_twitter_data.csv** in **Twitter** folder contains the twitter data from the Assignment 3. The URLs and special characters were already removed in the Assignment 3. The **polarity_twitter_data.py** is a python script which makes bag-of-words for each tweets and compares the words with the list of positive and negative words. The **positive_words.txt** and **negative_words.txt** are the text files containing a list of positive and negative words respectively. These lists have been referenced from Github[1].

The script keeps the count of positive and negative words in a tweet and accordingly assigns the polarity to the tweet. The **twitter_data_polarity.csv** contains tweets with their polarity. Simultaneously, the script stores all the matched positive and negative words in a list. At last, it counts the frequency of the positive and negative words in the list. It stores this information in **words_polarity.csv**. The **tableau.png** and **word_cloud.png** contains the screenshots of Tableau[4] and word cloud.



Words. Colour shows details about Polarity. Size shows sum of Frequency.

Figure 1 Word Cloud

B. Semantic Analysis

The **cleaned_news_data.csv** contains the news data which is cleaned using **cleaning_news_data.py** script. The script is same which was used in Assignment 3. The **Semantic_Analysis.py** takes each tweet and save it in separate files. These files can be found in **News_Articles** folder. The script also searches for words like 'canada', 'university', 'dalhousie university', 'halifax', and 'business' in 'title', 'description' and 'content' of every tweet. It keeps count of number of documents these keywords occur in and stores that information in **10.a.csv** file.

	A	B	C	D	E
1	Keyword	df	N/df	log10(N/df)	
2	canada	72	1.388889	0.142668	
3	university	17	5.882353	0.769551	
4	dalhousie	2	50	1.69897	
5	halifax	3	33.33333	1.522879	
6	business	7	14.28571	1.154902	
7					
8					
9					
10					

Figure 2 TF-IDF of keywords

The script also finds the number of occurrences of word “Canada” in documents. It then counts the total words in a document and calculates relative frequency. The **relative_frequency.csv** contains the information about frequency and relative frequency of word “Canada” in every documents it occurs.

	A	B	C	D	E
1	Article	Total_wor	frequency	relative_freq	
2	E:\Study\Dalhousie\DM\Assignment 4\News\News Articles\0_news_article	101	1	0.009901	
3	E:\Study\Dalhousie\DM\Assignment 4\News\News Articles\10_news_article	105	7	0.066667	
4	E:\Study\Dalhousie\DM\Assignment 4\News\News Articles\13_news_article	93	1	0.010753	
5	E:\Study\Dalhousie\DM\Assignment 4\News\News Articles\15_news_article	106	3	0.028302	
6	E:\Study\Dalhousie\DM\Assignment 4\News\News Articles\16_news_article	60	1	0.016667	
7	E:\Study\Dalhousie\DM\Assignment 4\News\News Articles\17_news_article	92	2	0.021739	
8	E:\Study\Dalhousie\DM\Assignment 4\News\News Articles\18_news_article	105	6	0.057143	
9	E:\Study\Dalhousie\DM\Assignment 4\News\News Articles\19_news_article	90	2	0.022222	
10	E:\Study\Dalhousie\DM\Assignment 4\News\News Articles\20_news_article	104	2	0.019231	
11	E:\Study\Dalhousie\DM\Assignment 4\News\News Articles\23_news_article	82	3	0.036585	
12	E:\Study\Dalhousie\DM\Assignment 4\News\News Articles\24_news_article	119	3	0.02521	
13	E:\Study\Dalhousie\DM\Assignment 4\News\News Articles\27_news_article	103	4	0.038835	

Figure 3 Frequency and Relative Frequency

At last, the scripts prints the article which has the highest relative frequency.

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PROBLEMS  OUTPUT  DEBUG CONSOLE  TERMINAL
SyntaxError: EOL while scanning string literal

(base) C:\Users\shrey>C:\Users\shrey\Anaconda3\python.exe "e:/Study/Dalhousie/DM/Assignment 4/News/Semanti
[72, 17, 2, 3, 7]
['canada', 'university', 'dalhousie university', 'halifax', 'business']
[72, 17, 2, 3, 7]
[1.3888888888888888, 5.882352941176471, 50.0, 33.33333333333333, 14.285714285714286]
[0.14266750356873154, 0.7695510786217261, 1.6989700043360187, 1.5228787452803376, 1.1549019599857433]
Article with highest relative frequency is 10_news_article

(base) C:\Users\shrey>
  
```

Figure 4 Article with highest relative frequency

References:

[1]"jeffreybreen/twitter-sentiment-analysis-tutorial-201107", *GitHub*, 2020. [Online]. Available: <https://github.com/jeffreybreen/twitter-sentiment-analysis-tutorial-201107/tree/master/data/opinion-lexicon-English>. [Accessed: 04- Apr- 2020].

[2]"Getting started", Developer.twitter.com, 2020. [Online]. Available:<https://developer.twitter.com/en/docs/basics/getting-started>. [Accessed: 27-Mar-2020].

[3]"Get started -Documentation -News API", Newsapi.org, 2020. [Online]. Available: <https://newsapi.org/docs/get-started>. [Accessed: 27-Mar-2020].

[4]"Tableau Desktop", *Tableau Software*, 2020. [Online]. Available: <https://www.tableau.com/en-ca/products/desktop>. [Accessed: 05- Apr- 2020].