## # SEC TEXT: NLP

## A codebase to allow for search and Natural Language Processing by analysts and developers for SEC 10K and 10Q filings.

The product is built in four files.

The first 2 are written in R and use the edgarWebR library from <a href="https://mwaldstein.github.io/edgarWebR/">https://mwaldstein.github.io/edgarWebR/</a>, a well-maintained and popular library for pulling SEC documents and slicing the SEC's unique XBRL approach into readable sections.

sec\_nlp\_getter.R reads a list of tickers from a local csv file, column
named Symbol, and

- a) retrieves all filings from the SEC for that symbol,
- b) saves the base HTML document in a file tokenized (split) by
- c) parses the base document into MDNA and Risk Factor sections
- d) creates a local file filing\_index.csv which stores the location of each document for each ticker.

sec\_R\_utils.R is the utility file for sec\_nlp\_getter.

The second 2 files are written in Python and use NLTK and pattern libraries to apply sentiment analysis to the extracted documents.

(sample\_workflow.py is a sample file to show the various combinations available to the SECTextNLP class)

sec\_text\_nlp.py contains the SECTextNLP class.

sec nlp utils.py is the utility file for sec text nlp.py.

## The following workflow is an example of the use of the SECTextNLP class.

```
#setup: download git into a directory,
#unzip the archive.zip file in the git directory

#import py file
from sec_text_nlp import *

#create an SECTextNLP object for ticker 'AAPL'
stn = SECTextNLP("AAPL")

#read the file index for a list of available documents
stn.df_file_index[['ticker','period_date','form_name','type']].head()
```

	ticker	period_date	form_name	type
139	AAPL	2020-06-27T04:00:00Z	Quarterly report [Sections 13 or 15(d)]	10-Q
140	AAPL	2020-03-28T04:00:00Z	Quarterly report [Sections 13 or 15(d)]	10-Q
141	AAPL	2019-12-28T05:00:00Z	Quarterly report [Sections 13 or 15(d)]	10-Q
142	AAPL	2019-09-28T04:00:00Z	Annual report [Section 13 and 15(d), not S-K I	10-K
143	AAPL	2019-06-29T04:00:00Z	Quarterly report [Sections 13 or 15(d)]	10-Q

#get the fully concatenated text of the base document
#includes the file name and href is the reference key for use against other

stn.df\_text.head()

	part.name	item.name	sentence_text	file	
0	NaN	NaN	united states securities and exchange commissi	aapl- 20200627_sentences.csv	https://www.sec.gov//
1	NaN	NaN	20549 form 10-q (mark one) ⊠ quarterly repor	aapl- 20200627_sentences.csv	https://www.sec.gov//
2	NaN	NaN	commission file number: 001- 36743 apple inc.	aapl- 20200627_sentences.csv	https://www.sec.gov//
3	NaN	NaN	(exact name of registrant as specified in its	aapl- 20200627_sentences.csv	https://www.sec.gov//
4	NaN	NaN	employer identification no.)	aapl- 20200627_sentences.csv	https://www.sec.gov//

#for more reference information, join with the file index on the href key. #now you can see filing\_date

pd.merge(stn.df\_text,stn.df\_file\_index,how = 'inner',left\_on='href',right\_c

	ticker	filing_date	sentence_text
0	AAPL	2020-07-31T04:00:00Z	united states securities and exchange commissi
1	AAPL	2020-07-31T04:00:00Z	20549 form 10-q (mark one) ⊠ quarterly repor
2	AAPL	2020-07-31T04:00:00Z	commission file number: 001-36743 apple inc.
3	AAPL	2020-07-31T04:00:00Z	(exact name of registrant as specified in its
4	AAPL	2020-07-31T04:00:00Z	employer identification no.)

```
#OR, if you only want Management Discussion and Analysis,
#join with the df_mdna object instead of df_text
pd.merge(stn.df_mdna,stn.df_file_index,how = 'inner',left_on='href',right_c
```

	ticker	filing_date	sentence_text
0	AAPL	2020-07-31T04:00:00Z	item 2.
1	AAPL	2020-07-31T04:00:00Z	management's discussion and analysis of financ
2	AAPL	2020-07-31T04:00:00Z	forward-looking statements provide current exp
3	AAPL	2020-07-31T04:00:00Z	for example, statements in this form 10-q rega
4	AAPL	2020-07-31T04:00:00Z	forward-looking statements can also be identif

```
#you can also pass in a topic, and get noun phrases around that topic.
#get business segments?
stn.get_noun_phrases_around_topic(BUSINESS_SEGMENT_LIST)

['americas segment',
    'asia pacific',
    'asia pacific segment',
    'china segment',
    'distribution partners',
    'europe segment',
    'geographic segment',
    'hong kong',
    'retail stores',
    'software products']
```

localhost:8888/notebooks/.ipynb# 4/9

```
#same approach, get products
stn.get_noun_phrases_around_topic(PRODUCTS_LIST,nrows=2)
    ['app store',
     'app store®',
     'apple music',
     'apple music®',
    'apple pay',
     'apple pay®',
     'apple tv',
     'apple tv®',
     'apple watch®',
    'book store',
     'delivers digital content',
     'digital content',
     'icloud backup',
     'icloud drive®',
    'icloud icloud',
     'icloud keychain®',
    'icloud photos',
     'icloud services',
     'ios devices',
     'itunes store',
     'itunes store®',
    'mac app store',
     'multiple ios devices',
     'personal computers',
     'professional software applications',
     'stores music',
     'support offerings',
     'support options',
     'tv app store']
```

localhost:8888/notebooks/.ipynb#

```
#or just get a list of all trademark items
stn.get_words_with_trademark(stn.df_mdna)
    ['ipad®',
     'iphone®',
     'ipados®',
     'watch®',
     'macbook®',
     'store™',
     'arcade™',
     'retina®',
     'applecare®',
     'imac®',
     'tvos®',
     'pencil®',
     'pro™',
     'bar™',
     'touch®',
     'macos™',
     'pro®',
     'card™',
     'ipod®',
     'mini®',
     'watchos®',
     'music®',
     'air®',
     'beats®',
     'mac®',
     'homepod™',
     'folio™',
     'macos®',
     'airpods™',
     'x®',
     'store®',
     'pay®',
     'tvos™',
     'ipados™',
     'icloud®',
     'tv®']
```

localhost:8888/notebooks/.ipynb#

#pair keyword search list with SENTIMENT ...
#using NLTK sentiment analyzer
#'MACRO' is the column name of the new dataframe
stn.match\_keywords(stn.NLTK\_sentiment(stn.df\_mdna),GLOBAL\_SEARCH\_LIST,'MACF

	part.name	item.name	sentence_text	section	file	
0	PART I - FINANCIAL INFORMATION	Item 2. Management's Discussion and Analysis o	item 2.	discussion	aapl- 20200627_mdna.csv	https://v
1	PART I - FINANCIAL INFORMATION	Item 2. Management's Discussion and Analysis o	management's discussion and analysis of financ	discussion	aapl- 20200627_mdna.csv	https://v
2	PART I - FINANCIAL INFORMATION	Item 2. Management's Discussion and Analysis o	forward-looking statements provide current exp	discussion	aapl- 20200627_mdna.csv	https://v
3	PART I - FINANCIAL INFORMATION	Item 2. Management's Discussion and Analysis o	for example, statements in this form 10-q rega	discussion	aapl- 20200627_mdna.csv	https://v
4	PART I - FINANCIAL INFORMATION	Item 2. Management's Discussion and Analysis o	forward-looking statements can also be identif	discussion	aapl- 20200627_mdna.csv	https://v

#take the trademark list, and get the sentiment from the MDNA text
list\_trademarks = stn.get\_words\_with\_trademark(stn.df\_mdna)
stn.match\_keywords(stn.NLTK\_sentiment(stn.df\_mdna),list\_trademarks,'trademark

part.name	item.name	sentence_text	section	file	
PART I - FINANCIAL INFORMATION	Item 2. Management's Discussion and Analysis o	item 2.	discussion	aapl- 20200627_mdna.csv	https://v
PART I - FINANCIAL INFORMATION	Item 2. Management's Discussion and Analysis o	management's discussion and analysis of financ	discussion	aapl- 20200627_mdna.csv	https://v
PART I - FINANCIAL INFORMATION	Item 2. Management's Discussion and Analysis o	forward-looking statements provide current exp	discussion	aapl- 20200627_mdna.csv	https://v
PART I - FINANCIAL INFORMATION	Item 2. Management's Discussion and Analysis o	for example, statements in this form 10-q rega	discussion	aapl- 20200627_mdna.csv	https://v
PART I - FINANCIAL INFORMATION	Item 2. Management's Discussion and Analysis o	forward-looking statements can also be identif	discussion	aapl- 20200627_mdna.csv	https://v
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#follow the same process, but use the pattern library sentiment analyzer in
df = stn.match\_keywords(stn.pattern\_sentiment(stn.df\_mdna),list\_trademarks,
df.dropna()[['sentence\_text','pattern\_sentiment','pattern\_subjectivity','tn

	sentence_text	pattern_sentiment	pattern_subjectivity	trademarks	trademar
22	the covid-19 pandemic has significantly curtai	-0.200000	0.300000	['store®']	1.0
25	the company is working on safely re- opening it	0.000000	0.000000	['pro™', 'pro®']	2.0
27	the most pronounced impact occurred in april 2	0.102778	0.369444	['pro®', 'air®']	2.0
28	the full extent of the future impact of the co	-0.062500	0.187500	['applecare®', 'store®']	2.0
32	third quarter fiscal 2020 highlights total net	0.000000	0.000000	[ˈcard™ˈ]	1.0