```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
import re
import nltk
from nltk.corpus import stopwords
from nltk.stem import WordNetLemmatizer
nltk.download('stopwords')
nltk.download('wordnet')
[nltk data] Downloading package stopwords to
                C:\Users\khada\AppData\Roaming\nltk data...
[nltk data]
[nltk data]
              Package stopwords is already up-to-date!
[nltk data] Downloading package wordnet to
                C:\Users\khada\AppData\Roaming\nltk data...
[nltk data]
[nltk data]
              Package wordnet is already up-to-date!
True
from textblob import TextBlob
from tensorflow.keras.preprocessing.text import Tokenizer
from nltk.sentiment.util import *
trump = pd.read csv('hashtag donaldtrump.csv',lineterminator = '\n')
biden = pd.read csv('hashtag joebiden.csv',lineterminator = '\n')
trump
                 created at
                                 tweet id
0
        2020-10-15 00:00:01
                             1.316529e+18
1
        2020-10-15 00:00:01
                             1.316529e+18
2
        2020-10-15 00:00:02
                             1.316529e+18
3
        2020-10-15 00:00:02
                             1.316529e+18
4
        2020-10-15 00:00:08
                             1.316529e+18
725649
        2020-11-05 23:59:59
                             1.324502e+18
725650 2020-11-05 23:59:59
                             1.324502e+18
725651 2020-11-05 23:59:59
                             1.324502e+18
       2020-11-05 23:59:59
725652
                             1.324502e+18
725653 2020-11-05 23:59:59
                            1.324502e+18
                                                     tweet
                                                           likes \
0
        #Elecciones2020 | En #Florida: #JoeBiden dice ...
                                                              0.0
1
        Usa 2020, Trump contro Facebook e Twitter: cop...
                                                             26.0
2
        #Trump: As a student I used to hear for years,...
                                                              2.0
3
        2 hours since last tweet from #Trump! Maybe he...
                                                              0.0
4
        You get a tie! And you get a tie! #Trump 's ra...
                                                              4.0
725649
                           @DavidCornDC #coup by #trump @
                                                              2.0
725650 Did you ever speak to someone on public transp...
                                                              3.0
```

```
So they accepted ballots WAY MORE than three d...
                                                               3.0
725651
        #Trump zegt nu gewoon ... 'if you only count m...
725652
                                                               6.0
725653
       #Trump speech truth-o-meter as we speak...\n\n...
                                                               1.0
        retweet_count
                                     source
                                                   user id
0
                                             3.606665e+08
                  0.0
                                  TweetDeck
1
                  9.0
                           Social Mediaset
                                             3.316176e+08
2
                  1.0
                            Twitter Web App
                                            8.436472e+06
3
                              Trumpytweeter
                  0.0
                                            8.283556e+17
4
                  3.0
                         Twitter for iPhone
                                            4.741380e+07
                        Twitter for iPhone
725649
                                             1.230104e+18
                  0.0
                       Twitter for Android
                                             2.964605e+07
725650
                  2.0
725651
                  0.0
                            Twitter Web App
                                             3.753528e+08
725652
                  0.0
                            Twitter Web App
                                             2.902307e+08
                       Twitter for Android
725653
                  0.0
                                             2.697767e+09
                           user name user screen name
0
                 El Sol Latino News elsollatinonews
1
                                     MediasetTgcom24
                             Tgcom24
2
                              snarke
                                               snarke
3
                      Trumpytweeter
                                        trumpytweeter
4
              رنا أيتر - Rana Abtar
                                      Ranaabtar
       Debra Weller Olson - "VOTE"
                                          OlsonWeller
725649
725650
                   Stephen Connolly
                                          5Konnolly87
725651
                       Brian Kennedy
                                      GrowingUpHockey
725652
           Tom Du Bois Vanhoutte ® 🖲
                                               Du Bois
             Robbie "#PR17 forever"
725653
                                                Rob2K
                                          user description
        Noticias de interés para latinos de la costa...
1
        Profilo ufficiale di Tgcom24: tutte le notizie...
2
        Will mock for food! Freelance writer, blogger,...
3
        If he doesn't tweet for some time, should we b...
4
        Washington Correspondent, Lebanese-American ,c...
        2012-14 wkd 3Blocks "S"of #WallSt NYC "GC"Firm...
725649
725650
        Montreal-born, live in Cali. I wrote Growing U...
725651
725652
        RT&like≠endorse
                          "#Nationalism eq. #poison, yo...
        @TheBharatArmy @bcci @CTFCOfficial fan #COYR @...
725653
       user followers count
                                             user location
lat
                             Philadelphia, PA / Miami, FL
0
                     1860.0
                                                             25.774270
                  1067661.0
1
                                                        NaN
                                                                   NaN
```

	2 3 4 725649 725650 725651 725652		1185.0	Portland 45.520247
			32.0	NaN NaN
			5393.0	Washington DC 38.894992
			5654.0	United States 39.783730
			539.0	Drumlane / Portmarnock NaN
			1092.0	Canadian-Californian NaN
			2952.0	@Nottinghill @Antwerp NaN
	725653		600.0	London, England 51.507322
	America 1 NaN 2 - America 3 NaN	long	city	country
		t \ -80.193660	NaN	United States of America North
		NaN	NaN	NaN
		122.674195	Portland	United States of America North
		NaN	NaN	NaN
		-77.036558	Washington	United States of America North
	725649 - America 725650 NaN 725651 NaN 725652 NaN 725653 Europe	100.445882	NaN	United States North
		NaN	NaN	NaN
		NaN	NaN	NaN
		NaN	NaN	NaN
		-0.127647	London	United Kingdom
			state st	ate_code collected_at
	0		Florida	FL 2020-10-21 00:00:00
	1		NaN	NaN 2020-10-21 00:00:00.373216530

```
2
                      0regon
                                     0R
                                          2020-10-21 00:00:00.746433060
3
                                     NaN
                                          2020-10-21 00:00:01.119649591
                         NaN
4
        District of Columbia
                                     DC
                                          2020-10-21 00:00:01.492866121
                                                                     . . .
                                             2020-11-06 09:50:53.176351
725649
                         NaN
                                     NaN
                                             2020-11-06 09:50:53.272491
725650
                         NaN
                                     NaN
725651
                         NaN
                                     NaN
                                             2020-11-06 09:50:53.108048
725652
                         NaN
                                     NaN
                                             2020-11-06 09:50:53.401021
725653
                     England
                                     ENG
                                             2020-11-06 09:50:53.372230
[725654 rows x 21 columns]
biden
                 created at
                                 tweet id \
0
        2020-10-15 00:00:01
                             1.316529e+18
1
        2020-10-15 00:00:18
                             1.316529e+18
2
        2020-10-15 00:00:20
                             1.316529e+18
3
        2020-10-15 00:00:21
                             1.316529e+18
4
        2020-10-15 00:00:22
                             1.316529e+18
       2020-11-05 23:59:45
499823
                             1.324502e+18
        2020-11-05 23:59:47
                             1.324502e+18
499824
       2020-11-05 23:59:50
499825
                             1.324502e+18
499826
        2020-11-05 23:59:54
                             1.324502e+18
499827
        2020-11-05 23:59:58
                             1.324502e+18
                                                     tweet likes
0
        #Elecciones2020 | En #Florida: #JoeBiden dice ...
                                                              0.0
        #HunterBiden #HunterBidenEmails #JoeBiden #Joe...
1
                                                              0.0
2
        @IslandGirlPRV @BradBeauregardJ @MeidasTouch T...
                                                              0.0
3
        @chrislongview Watching and setting dvr. Let's...
                                                              0.0
4
        #censorship #HunterBiden #Biden #BidenEmails #...
                                                              1.0
                                                               . . .
        Votes get "whittled down"? Counting of mail i...
                                                              0.0
499823
499824
        CONTINÚAN SALIENDO LAS PRUEBAS DEL FRAUDE ELEC...
                                                              1.0
        #ElectionResults2020 #USElection #ThursdayThou...
499825
                                                              1.0
        I wonder who they're voting for ⊚... - #fyp #f...
499826
                                                               0.0
        Biden - 290 \nTrump ⊕ - 248 \nEasy money babby...
499827
                                                               0.0
```

```
retweet_count
                                                user_id
                                   source
0
                  0.0
                                TweetDeck 3.606665e+08
                  0.0
                         Twitter for iPad 8.099044e+08
1
2
                  0.0
                          Twitter Web App
                                           3.494182e+09
3
                       Twitter for iPhone
                                          8.242596e+17
                  0.0
4
                  0.0
                          Twitter Web App
                                           1.032807e+18
                         Twitter for iPad
                                           8.059161e+08
499823
                  0.0
                  1.0
                       Twitter for iPhone 4.805877e+08
499824
                       Twitter for iPhone
499825
                  0.0
                                          2.265816e+09
499826
                  0.0
                                Instagram
                                          8.317075e+17
499827
                  0.0
                       Twitter for iPhone
                                          9.071075e+17
                                      user name user screen name
                             El Sol Latino News elsollatinonews
0
1
                                    Cheri A. 🖤 🕲
                                                      Biloximeemaw
2
                                                     Flag Wavers
                                     Flag Waver
                                                   MichelleFerg4
3
                                  Michelle Ferg
4
                                 the Gold State
                                                   theegoldstate
                                  Sherry Slater
                                                       NS Slater
499823
                                 Portero Mexico
                                                PorteroMexico
499824
        VOTE EARLY! 哟~哟~哟~哟~♥~~® Maden2020
499825
lolo173
499826
                                      NathanKTV
                                                      NathanKTV
499827
                                  BraddahBit ♦○
                                                        alohacory
                                         user description
        Moticias de interés para latinos de la costa...
0
1
        Locked and loaded Meemaw. Love God, my family ...
2
                                                      NaN
3
                                                      NaN
       A Silicon Valley #independent #News #Media #St...
       Mom of 4 great kids - hard working, proud Demo...
499823
499824
499825
       If my content resonates—follow me. Resist • Pro...
499826
       ♂ : IG ❷ NathanKTV \n○: ☞唰除ttps://t.co/o...
499827
        crypto degenerate : truth seeker : datsun enth...
       user followers count
                                            user location
lat
    \
                     1860.0
                            Philadelphia, PA / Miami, FL
                                                           25.774270
1
                     6628.0
                                                      NaN
                                                                 NaN
2
                                    Golden Valley Arizona 46.304036
                     1536.0
```

3	27.0	NaN NaN
4	390.0	California, USA 36.701463
499823	27.0	NaN NaN
499824	873.0	NaN NaN
499825	140.0	Earth NaN
499826	0.0	Beverly Hills, CA 34.069650
499827	94.0	San Francisco, CA 37.779026
long continent \	city	country
0 -80.193660	NaN	United States of America North
America 1 NaN	NaN	NaN
NaN 2 -109.171431	NaN	United States of America North
America 3 NaN	NaN	NaN
NaN 4 -118.755997	NaN	United States of America North
America		
 499823 NaN	NaN	NaN
NaN 499824 NaN	NaN	NaN
NaN 499825 NaN	NaN	NaN
NaN 499826 -118.396306	NaN	United States of America North
America 499827 -122.419906 America	San Francisco	United States of America North
state 0 Florida 1 NaN 2 Montana 3 NaN 4 California	MT 202 NaN 202	collected_at 2020-10-21 00:00:00 0-10-21 00:00:00.517827283 0-10-21 00:00:01.035654566 0-10-21 00:00:01.553481849 0-10-21 00:00:02.071309132

```
2020-11-06 10:04:37.074759
499823
               NaN
                           NaN
499824
               NaN
                           NaN
                                   2020-11-06 10:04:36.811037
499825
               NaN
                           NaN
                                   2020-11-06 10:04:37.040510
499826
       California
                            CA
                                   2020-11-06 10:04:36.975515
499827
        California
                            CA
                                   2020-11-06 10:04:37.088501
[499828 rows x 21 columns]
print(trump.shape)
print(biden.shape)
(725654, 21)
(499828, 21)
trump.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 725654 entries, 0 to 725653
Data columns (total 21 columns):
                            Non-Null Count
#
     Column
                                              Dtype
     -----
                            -----
- - -
                                              ----
 0
                            725654 non-null
                                             obiect
     created at
                                              float64
 1
     tweet id
                            725654 non-null
 2
     tweet
                            725654 non-null
                                             object
 3
                            725654 non-null
     likes
                                             float64
 4
                            725654 non-null
                                             float64
     retweet count
 5
     source
                            724897 non-null
                                             object
 6
                                              float64
                            725654 non-null
     user id
 7
     user_name
                            725639 non-null
                                              object
 8
     user screen name
                            725654 non-null
                                             object
 9
     user description
                            651481 non-null
                                             object
 10
                            725654 non-null
    user_join_date
                                             object
 11
     user_followers_count
                            725654 non-null
                                              float64
     user_location
 12
                            505267 non-null
                                             object
 13
    lat
                            342071 non-null
                                              float64
 14
    long
                            342071 non-null
                                              float64
 15
                            172431 non-null
                                             object
    city
 16
    country
                            339877 non-null
                                             object
                                             object
 17
     continent
                            339890 non-null
 18
    state
                            248088 non-null
                                             object
     state code
 19
                            233393 non-null
                                             object
 20
     collected at
                            725654 non-null
                                             object
dtypes: float64(7), object(14)
memory usage: 116.3+ MB
trump['candidate'] = 'Trump'
biden['candidate'] = 'Biden'
df = pd.concat([trump,biden])
df
```

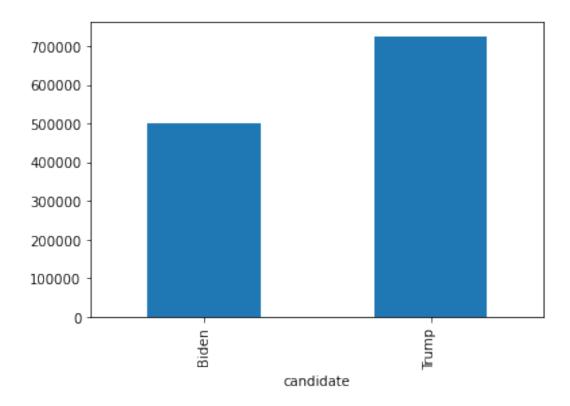
```
created at
                                 tweet id
0
        2020-10-15 00:00:01
                             1.316529e+18
1
        2020-10-15 00:00:01
                             1.316529e+18
2
        2020-10-15 00:00:02
                             1.316529e+18
3
        2020-10-15 00:00:02
                             1.316529e+18
4
        2020-10-15 00:00:08
                             1.316529e+18
499823
        2020-11-05 23:59:45
                             1.324502e+18
499824
       2020-11-05 23:59:47
                             1.324502e+18
499825
        2020-11-05 23:59:50
                             1.324502e+18
499826
        2020-11-05 23:59:54
                             1.324502e+18
499827
        2020-11-05 23:59:58
                             1.324502e+18
                                                    tweet
                                                           likes
0
        #Elecciones2020 | En #Florida: #JoeBiden dice ...
                                                             0.0
1
        Usa 2020, Trump contro Facebook e Twitter: cop...
                                                            26.0
2
        #Trump: As a student I used to hear for years,...
                                                             2.0
3
        2 hours since last tweet from #Trump! Maybe he...
                                                             0.0
        You get a tie! And you get a tie! #Trump 's ra...
4
                                                             4.0
499823
       Votes get "whittled down"? Counting of mail i...
                                                             0.0
       CONTINÚAN SALIENDO LAS PRUEBAS DEL FRAUDE ELEC...
499824
                                                             1.0
499825
       #ElectionResults2020 #USElection #ThursdayThou...
                                                             1.0
       I wonder who they're voting for ☞... - #fyp #f...
499826
                                                              0.0
499827
        Biden - 290 \nTrump @ - 248 \nEasy money babby...
                                                              0.0
        retweet count
                                   source
                                                user id
0
                  0.0
                                TweetDeck
                                          3.606665e+08
1
                  9.0
                         Social Mediaset
                                           3.316176e+08
2
                  1.0
                                          8.436472e+06
                          Twitter Web App
3
                  0.0
                            Trumpytweeter
                                           8.283556e+17
4
                  3.0
                       Twitter for iPhone
                                           4.741380e+07
. . .
                  . . .
                         Twitter for iPad
                                           8.059161e+08
499823
                  0.0
499824
                  1.0
                       Twitter for iPhone
                                           4.805877e+08
499825
                  0.0
                       Twitter for iPhone
                                           2.265816e+09
499826
                  0.0
                                Instagram
                                           8.317075e+17
499827
                  0.0
                       Twitter for iPhone
                                           9.071075e+17
                                      user_name user_screen_name
0
                             El Sol Latino News
                                                 elsollatinonews
1
                                        Tacom24
                                                MediasetTgcom24
2
                                         snarke
                                                          snarke
3
                                  Trumpytweeter
                                                   trumpytweeter
4
                          رنا ابتر - Rana Abtar
                                                 Ranaabtar
. . .
499823
                                  Sherry Slater
                                                       NS Slater
499824
                                 Portero Mexico
                                                   PorteroMexico
lolo173
```

499826 499827	NathanKTV BraddahBit �️(
0 1 2 3 4	user_description \ Noticias de interés para latinos de la costa Profilo ufficiale di Tgcom24: tutte le notizie Will mock for food! Freelance writer, blogger, If he doesn't tweet for some time, should we b Washington Correspondent, Lebanese-American ,c							
499823 499824	Mom of 4 great kids - hard working, pro							
499825 499826 499827	NaN If my content resonates—follow me. Resist •Pro ♂ : IG ⚠ NathanKTV \n ○: ☞ ♠ https://t.co/o crypto degenerate : truth seeker : datsun enth							
city \	user_location lat	long						
city \ 0 NaN	Philadelphia, PA / Miami, FL 25.774270	-80.193660						
NaN NaN	NaN NaN	NaN						
2	Portland 45.520247	-122.674195						
Portlan	nd NaN NaN	NaN						
NaN 4	Washington DC 38.894992	-77.036558						
Washing	gton 							
 499823	NaN NaN	NaN						
NaN 499824	NaN NaN							
NaN		NaN						
499825 NaN	Earth NaN	NaN						
499826 NaN	Beverly Hills, CA 34.069650	-118.396306						
499827 Francis	San Francisco, CA 37.779026 sco	-122.419906 San						
,	country continent	state						
0	United States of America North America	Florida						
1	NaN NaN	NaN						
2	United States of America North America	Oregon						
3	NaN NaN	NaN						

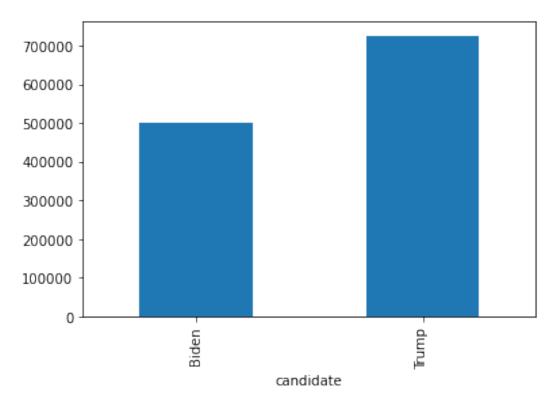
```
4
        United States of America North America District of Columbia
499823
                             NaN
                                             NaN
                                                                   NaN
499824
                             NaN
                                             NaN
                                                                   NaN
499825
                             NaN
                                                                   NaN
                                             NaN
499826 United States of America North America
                                                            California
499827 United States of America North America
                                                            California
       state code
                                    collected at candidate
0
               FL
                             2020-10-21 00:00:00
                                                      Trump
                   2020-10-21 00:00:00.373216530
1
              NaN
                                                      Trump
2
                   2020-10-21 00:00:00.746433060
                                                      Trump
               0R
3
              NaN
                   2020-10-21 00:00:01.119649591
                                                      Trump
4
                   2020-10-21 00:00:01.492866121
               DC
                                                      Trump
                      2020-11-06 10:04:37.074759
                                                      Biden
499823
              NaN
                      2020-11-06 10:04:36.811037
499824
              NaN
                                                      Biden
                      2020-11-06 10:04:37.040510
499825
              NaN
                                                      Biden
                      2020-11-06 10:04:36.975515
499826
               CA
                                                      Biden
                      2020-11-06 10:04:37.088501
499827
               CA
                                                      Biden
[1225482 rows x 22 columns]
df.shape
(1225482, 22)
```

EDA

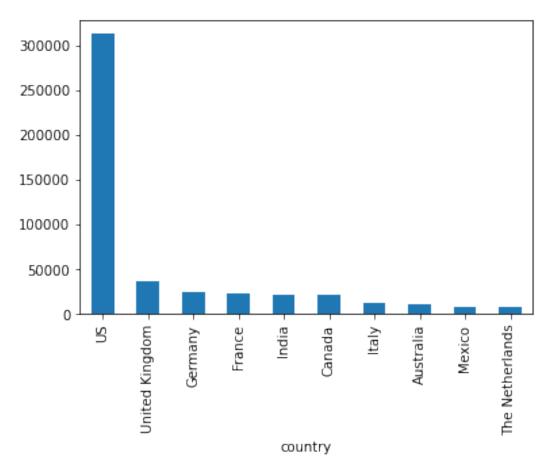
```
# in visual who have got more number of tweets
df.groupby('candidate')['tweet'].count().plot.bar()
<matplotlib.axes._subplots.AxesSubplot at 0x1d483449610>
```



comparison of likes
df.groupby('candidate')['likes'].count().plot.bar()
<matplotlib.axes._subplots.AxesSubplot at 0x1d485515790>



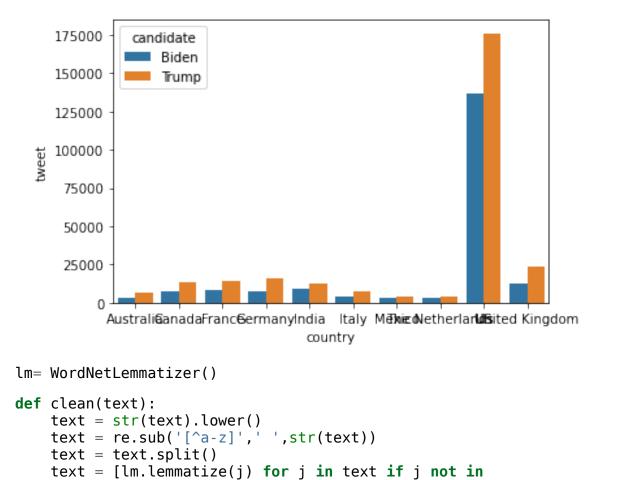
```
df.country.value counts()
United States of America
                            262250
United States
                             50846
United Kingdom
                             35946
                             23590
Germany
France
                             22459
Benin
                                  2
Turks and Caicos Islands
                                 1
Antigua and Barbuda
                                 1
Saint Lucia
                                 1
Northern Mariana Islands
Name: country, Length: 185, dtype: int64
df['country'] = df['country'].replace({'United States of
America':'US','United States':'US'})
df.country.value counts()
US
                            313096
United Kingdom
                             35946
Germany
                             23590
France
                             22459
India
                             21891
South Sudan
                                  2
Antigua and Barbuda
                                 1
                                 1
Saint Lucia
Northern Mariana Islands
                                 1
Turks and Caicos Islands
                                 1
Name: country, Length: 184, dtype: int64
# top 10 countries with highest number of tweets - bar graph
df.groupby('country')
['tweet'].count().sort values(ascending=False).head(10).plot.bar()
<matplotlib.axes. subplots.AxesSubplot at 0x1d485599eb0>
```



```
# tweets for biden and trump from each country
top10country = df.groupby('country')
['tweet'].count().sort values(ascending=False).head(10).index.tolist()
top10country
['US',
 'United Kingdom',
 'Germany',
 'France',
 'India',
 'Canada',
 'Italy',
 'Australia',
 'Mexico',
 'The Netherlands']
tweet_df = df.groupby(['country','candidate'])
['tweet'].count().reset_index()
tweet df
         country candidate
                             tweet
0
     Afghanistan
                     Biden
                                53
     Afghanistan
1
                     Trump
                                78
2
         Albania
                     Biden
                                29
```

```
3
         Albania
                      Trump
                                 55
4
                      Biden
                                  9
         Algeria
                         . . .
354
                      Trump
                                 78
           Yemen
355
                      Biden
          Zambia
                                  8
356
          Zambia
                      Trump
                                 26
357
        Zimbabwe
                      Biden
                                 33
358
        Zimbabwe
                      Trump
                                 43
[359 rows x 3 columns]
tweet_df = tweet_df[tweet_df['country'].isin(top10country)]
tweet_df
              country candidate
                                    tweet
           Australia
15
                           Biden
                                     3601
16
           Australia
                           Trump
                                     6691
                           Biden
52
               Canada
                                     7401
53
               Canada
                           Trump
                                    13320
109
               France
                           Biden
                                     8244
110
               France
                           Trump
                                    14215
115
              Germany
                           Biden
                                     7503
116
              Germany
                           Trump
                                    16087
143
                India
                           Biden
                                     9155
144
                India
                           Trump
                                    12736
157
                Italy
                           Biden
                                     4442
158
                                     7316
                Italy
                           Trump
202
                                     2930
               Mexico
                           Biden
203
               Mexico
                           Trump
                                     4237
321
     The Netherlands
                           Biden
                                     2812
322
     The Netherlands
                           Trump
                                     4210
331
                           Biden
                                  136920
                   US
332
                   US
                           Trump
                                  176176
339
      United Kingdom
                                   12626
                           Biden
      United Kingdom
340
                           Trump
                                   23320
sns.barplot(data=tweet_df,x='country',y='tweet',hue='candidate')
```

<matplotlib.axes._subplots.AxesSubplot at 0x1d48560cd90>



set(stopwords.words('english'))]

```
tweet country \
        President Donald #Trump's youngest daughter, T...
115369
                                                                US
270220
       Woah. Have you read this article?\n\nAll the p...
                                                                US
661169
       #SethMeyers lambastes Fox News for parroting #...
                                                                US
       🖈 Las #noticias más importantes de la mañana: ...
693531
                                                                US
566989
       #Trump Habla en segundos. Todavía nada está de...
                                                                US
                                                               . . .
205989
       About the #fracking comment last night.
                                                                US
                                                 Is Jo...
462011
       Dirty Don trying to cheat at the polls. @realD...
                                                                US
68033
        The United States shows more DEATHS than other...
                                                                US
228347
        #iamvalued #youarevaued #msc #Trump #trump2020...
                                                                US
205868
        Picture from the last night #Debates2020 #Bide...
                                                                US
                                                cleantext
115369
        president donald trump youngest daughter tiffa...
       woah read article president debt donald trump ...
270220
       sethmeyers lambastes fox news parroting donald...
661169
       la noticias importantes de la ana sigue el con...
693531
       trump habla en segundos todav nada est definid...
566989
205989
        fracking comment last night joe biden bidenhar...
        dirty trying cheat poll realdonaldtrump donald...
462011
        united state show death country lamestream fak...
68033
        iamvalued youarevaued msc trump trump seat sti...
228347
205868
        picture last night debate biden trump http co ...
[39630 rows x 3 columns]
```

Create function for polarity and subjectivity

Subjectivity - if the sentence is subjective or objective - subjective refers to the personal opinions, emotions or peoples's judgement wheras objectrive refers to factual information.

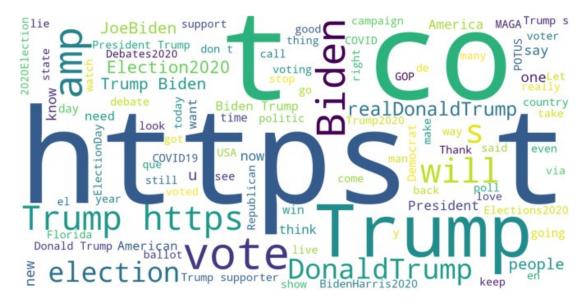
```
Polarity - float value lies between[-1,1] where 1 means positive and -1 means negative
def getsubjectivity(text):
    return TextBlob(text).sentiment.subjectivity
def getpolarity(text):
    return TextBlob(text).sentiment.polarity
def getAnalysis(score):
    if score<0:
        return 'negative'
    elif score==0:
        return 'neutral'
    else:
        return 'positive'

trump_tweets['subjectivity'] =
trump_tweets['cleantext'].apply(getsubjectivity)</pre>
```

```
trump tweets['polarity'] =
trump tweets['cleantext'].apply(getpolarity)
trump tweets['sentiment'] =
trump tweets['polarity'].apply(getAnalysis)
trump tweets
                                                    tweet country \
115369
        President Donald #Trump's youngest daughter, T...
                                                                US
270220 Woah. Have you read this article?\n\nAll the p...
                                                                US
661169
       #SethMeyers lambastes Fox News for parroting #...
                                                                US
       🖈 Las #noticias más importantes de la mañana: ...
693531
                                                                US
566989
       #Trump Habla en segundos. Todavía nada está de...
                                                                US
205989
        About the #fracking comment last night.
                                                 Is Jo...
                                                                US
        Dirty Don trying to cheat at the polls. @realD...
462011
                                                                US
        The United States shows more DEATHS than other...
                                                                US
68033
        #iamvalued #youarevaued #msc #Trump #trump2020...
                                                                US
228347
        Picture from the last night #Debates2020 #Bide...
                                                                US
205868
                                                cleantext
subjectivity \
115369 president donald trump youngest daughter tiffa...
0.000000
270220
       woah read article president debt donald trump ...
0.000000
661169 sethmeyers lambastes fox news parroting donald...
0.000000
693531
       la noticias importantes de la ana sigue el con...
0.000000
566989 trump habla en segundos todav nada est definid...
0.000000
205989 fracking comment last night joe biden bidenhar...
0.066667
462011 dirty trying cheat poll realdonaldtrump donald...
0.800000
        united state show death country lamestream fak...
68033
0.733333
228347
        iamvalued youarevaued msc trump trump seat sti...
0.000000
205868
       picture last night debate biden trump http co ...
0.066667
        polarity sentiment
115369
            0.00
                   neutral
270220
            0.00
                   neutral
661169
            0.00
                   neutral
693531
            0.00
                   neutral
```

```
0.00
566989
                   neutral
. . .
             . . .
205989
            0.00
                   neutral
462011
           -0.60
                 negative
68033
           -0.44
                  negative
228347
            0.00
                   neutral
205868
            0.00
                   neutral
[39630 rows x 6 columns]
biden tweets =
df.query('(candidate=="Biden")').sort values('user followers count',as
cending=False).drop duplicates(['user id'])[['tweet','country']]
biden tweets = biden tweets.loc[biden tweets.country=='US']
biden tweets['cleantext'] = biden tweets['tweet'].apply(clean)
biden tweets['polarity'] =
biden tweets['cleantext'].apply(getpolarity)
biden tweets['subjectivity'] =
biden tweets['cleantext'].apply(getsubjectivity)
biden tweets['sentiment'] =
biden tweets['polarity'].apply(getAnalysis)
biden_tweets
                                                     tweet country
                                                                    \
175650
        #JoeBiden is enlisting A-list star power to he...
                                                                US
       The big fight TODAY!!!!! @realDonaldTrump vs #...
343145
                                                                US
        #JimmyKimmel offered his view about how the la...
459947
                                                                US
        Sigue el conteo de votos en #Georgia: #Trump y...
493728
                                                                US
281536
       Are you there, God? It's me again, Bette. We'r...
                                                                US
                                                                . . .
        UNITED WE STAND PEOPLE don't let the clowns ru...
484098
                                                                US
67722
        @TheJeffBridges And, I voted for the only hono...
                                                                US
        #2020ElectionPrediction\n\n#Trump wins 300-320...
313770
                                                                US
42480
        The world is sick and needs a hero. I think #b...
                                                                US
427600
        This race is still tight!! Biden has a tiny le...
                                                                US
                                                 cleantext
                                                            polarity \
175650
        joebiden enlisting list star power help close ...
                                                            0.000000
343145
        big fight today realdonaldtrump v joebiden got...
                                                            0.000000
        jimmykimmel offered view last day gone close r...
459947
                                                            0.000000
493728
        sigue el conteo de votos en georgia trump bide...
                                                            0.000000
281536
        god bette scared fascist whitehouse racist cri...
                                                            0.100000
484098
        united stand people let clown running presiden...
                                                            0.083333
        thejeffbridges voted honorable man running pre...
67722
                                                            0.000000
313770
        electionprediction trump win electoral vote ma...
                                                            0.733333
```

```
world sick need hero think biden way towards s... -0.714286
42480
427600
       race still tight biden tiny lead michigan neva... 0.255357
        subjectivity sentiment
175650
            0.000000
                      neutral
343145
            0.100000
                       neutral
459947
           0.066667 neutral
                      neutral
493728
           0.000000
           0.562500 positive
281536
. . .
           0.541667 positive
484098
67722
           0.000000
                     neutral
313770
           0.566667 positive
42480
           0.857143 negative
427600
           0.446429
                     positive
[42976 rows x 6 columns]
trump tweets.sentiment.value counts(normalize=True)*100
           44.789301
neutral
positive
           34.625284
           20.585415
negative
Name: sentiment, dtype: float64
biden tweets.sentiment.value counts(normalize=True)*100
neutral
           46.854058
positive
           36.827532
           16.318410
negative
Name: sentiment, dtype: float64
from wordcloud import WordCloud, STOPWORDS
def word cloud(wd list):
    stopwords = set(STOPWORDS)
   all_words = ' '.join([text for text in wd_list])
   wordcloud = WordCloud(background color='white',stopwords =
stopwords,
                          width=1600, height=800,
max font size=800, max words=100).generate(all words)
   plt.figure(figsize=(12,10))
   plt.axis('off')
   plt.imshow(wordcloud)
word_cloud(trump_tweets['tweet'][:5000])
```



word_cloud(biden_tweets['tweet'][:5000])

