eda_version2

March 11, 2024

1 Predicting tweet sentiment

Dataset from https://www.kaggle.com/datasets/bhavikjikadara/tweets-dataset

Context

This is the sentiment 140 dataset. It contains 1,600,000 tweets extracted using the Twitter API. The tweets have been annotated (0 = negative, 4 = positive) and can be used to detect sentiment.

Content

It contains the following 6 fields:

- target: the polarity of the tweet (0 = negative and 4 = positive)
- ids: The id of the tweet (2087)
- date: the date of the tweet (Sat May 16 23:58:44 UTC 2009)
- flag: The query (lyx). If there is no query, then this value is NO_QUERY.
- user: the user that tweeted.
- text: the text of the tweet.

1.1 1. Exploratory Data Analysis

```
[]: # import libraries
   import numpy as np
   import pandas as pd
   from matplotlib import pyplot as plt
   import seaborn as sns
   from sklearn.model_selection import train_test_split
   # text processing libraries
   import re
   import contractions
   from collections import Counter
   # import string
   import nltk
   # import warnings
   # %matplotlib inline
   # warnings.filterwarnings("ignore")
   from nltk.stem.porter import PorterStemmer
```

```
from wordcloud import WordCloud
     Pandas and Numpy have been used for data manipulation and numerical calculations
     Matplotlib and Seaborn have been used for data visualizations
[]: # import data
   tweets = pd.read_csv("..//data//tweets.csv", encoding="latin-1")
[]: # check the shape of the dataframe
   print("Shape of the dataframe:", tweets.shape)
  Shape of the dataframe: (1048575, 6)
[]: # display the first few rows of the dataframe
   tweets.head()
[]:
      Target
                      ID
                                                                            User
                                                   Date
                                                             flag
              1467810672 Mon Apr 06 22:19:49 PDT 2009
                                                         NO_QUERY
                                                                   scotthamilton
           0 1467810917 Mon Apr 06 22:19:53 PDT 2009
   1
                                                         NO_QUERY
                                                                        mattycus
   2
           0 1467811184 Mon Apr 06 22:19:57 PDT 2009
                                                                         ElleCTF
                                                         NO_QUERY
   3
           0 1467811193 Mon Apr 06 22:19:57 PDT 2009
                                                         NO_QUERY
                                                                          Karoli
           0 1467811372 Mon Apr 06 22:20:00 PDT 2009
                                                         NO QUERY
                                                                        joy_wolf
                                                    Text
      is upset that he can't update his Facebook by ...
      @Kenichan I dived many times for the ball. Man...
   2
        my whole body feels itchy and like its on fire
   3
      Onationwideclass no, it's not behaving at all...
                          OKwesidei not the whole crew
[]: # display the last few rows of the dataframe
   tweets.tail()
                             ID
Target
                                                         Date
                                                                   flag \
   1048570
                 4 1960186342 Fri May 29 07:33:44 PDT 2009
                                                              NO_QUERY
                 4 1960186409 Fri May 29 07:33:43 PDT 2009
   1048571
                                                               NO QUERY
   1048572
                 4 1960186429 Fri May 29 07:33:44 PDT 2009
                                                               NO_QUERY
   1048573
                 4 1960186445 Fri May 29 07:33:44 PDT 2009
                                                               NO_QUERY
                 4 1960186607 Fri May 29 07:33:45 PDT 2009
   1048574
                                                               NO_QUERY
                                                                           Text
                       User
   1048570 Madelinedugganx
                                       My GrandMa is making Dinenr with my Mum
   1048571
               OffRoad_Dude Mid-morning snack time... A bowl of cheese noo...
                   Falchion @ShaDeLa same here say it like from the Termi...
   1048572
   1048573
             jonasobsessedx
                                         @DestinyHope92 im great thaanks wbuu?
   1048574
                  sugababez
                                           cant wait til her date this weekend
[]: # display information about data
   tweets.info()
```

```
RangeIndex: 1048575 entries, 0 to 1048574
  Data columns (total 6 columns):
        Column Non-Null Count
                                   Dtype
                _____
    0
        Target
                1048575 non-null
                                  int64
    1
                1048575 non-null
                                  int64
    2
       Date
                1048575 non-null object
    3
       flag
                1048575 non-null object
    4
       User
                1048575 non-null
                                  object
    5
        Text
                1048575 non-null
                                  object
  dtypes: int64(2), object(4)
  memory usage: 48.0+ MB
[]: # check for duplication
   tweets.nunique()
                    2
: Target
   ID
              1048044
   Date
               662453
   flag
                    1
   User
              511366
   Text
              1036135
   dtype: int64
[]: # check for missing values
   tweets.isnull().sum()
[]: Target
             0
   ID
             0
   Date
             0
             0
   flag
   User
             0
   Text
             0
   dtype: int64
[]: # summary statistics of numerical columns
   tweets.describe()
[]:
                Target
                                   ID
          1.048575e+06
                         1.048575e+06
   count
          9.482431e-01
                         1.976166e+09
   mean
   std
          1.701120e+00
                         2.300580e+08
   min
          0.000000e+00
                         1.467811e+09
   25%
          0.000000e+00
                         1.824526e+09
   50%
          0.000000e+00
                         1.990869e+09
   75%
          0.000000e+00
                         2.198903e+09
   max
          4.000000e+00
                         2.329206e+09
```

Data reduction

<class 'pandas.core.frame.DataFrame'>

Some columns or variables can be dropped if they do not add value to our analysis

In our dataset, columns ID, Date, flag, User don't have any predictive power to predict the dependent variable

```
[]: data = tweets.drop(['ID', 'Date', 'flag', 'User'], axis = 'columns')
data
```

t Te	Target]:
O is upset that he can't update his Facebook by .	0	0	
O @Kenichan I dived many times for the ball. Man.	0	1	
0 my whole body feels itchy and like its on fir	0	2	
O @nationwideclass no, it's not behaving at all	0	3	
0 @Kwesidei not the whole cre	0	4	
4 My GrandMa is making Dinenr with my Mu	4	1048570	
4 Mid-morning snack time A bowl of cheese noo.	4	1048571	
4 @ShaDeLa same here say it like from the Termi.	4	1048572	
4 @DestinyHope92 im great thaanks wbu	4	1048573	
4 cant wait til her date this weeken	4	1048574	

[1048575 rows x 2 columns]

Data cleaning

Some names of the variables are not relevant and not easy to understand Some data may have data entry errors, and some variables may need data type conversion. We need to fix this issue in the data

```
[]: # adjusting target values
data['Target'] = data['Target'].replace(4, 1)
data
```

```
[]:
            Target
                    is upset that he can't update his Facebook by ...
                    @Kenichan I dived many times for the ball. Man...
   1
   2
                 0
                      my whole body feels itchy and like its on fire
   3
                 0
                    Onationwideclass no, it's not behaving at all...
                                         OKwesidei not the whole crew
   4
                 0
                             My GrandMa is making Dinenr with my Mum
   1048570
   1048571
                    Mid-morning snack time... A bowl of cheese noo...
   1048572
                     @ShaDeLa same here say it like from the Termi...
   1048573
                 1
                                @DestinyHope92 im great thaanks wbuu?
                                  cant wait til her date this weekend
   1048574
                 1
```

[1048575 rows x 2 columns]

```
[]: # removing unnecessary user tags
data['Text'] = data['Text'].replace(r"@\w+", "", regex=True)
data
```

```
Target

O is upset that he can't update his Facebook by ...
```

```
1
                  I dived many times for the ball. Managed to s...
2
                  my whole body feels itchy and like its on fire
                  no, it's not behaving at all. i'm mad. why am...
3
              0
                                               not the whole crew
1048570
              1
                          My GrandMa is making Dinenr with my Mum
1048571
              1 Mid-morning snack time... A bowl of cheese noo...
1048572
                  same here say it like from the Terminiator m...
1048573
                                           im great thaanks wbuu?
              1
1048574
              1
                              cant wait til her date this weekend
```

[1048575 rows x 2 columns]

```
[]: # resolving contractions (and slang)
data['Text'] = data['Text'].apply(lambda x: contractions.fix(x))
data
```

[]:	Target	Text
0	0	is upset that he cannot update his Facebook by
1	0	I dived many times for the ball. Managed to s
2	0	my whole body feels itchy and like its on fire
3	0	no, it is not behaving at all. i am mad. why
4	0	not the whole crew
		•••
1048570	1	My GrandMa is making Dinenr with my Mum
1048571	1	Mid-morning snack time A bowl of cheese noo
1048572	1	same here say it like from the Terminiator m
1048573	1	i am great thaanks wbuu?
1048574	1	cannot wait til her date this weekend

[1048575 rows x 2 columns]

Target

[]:

```
[]: # removing punctuation marks
data['Text'] = data['Text'].apply(lambda x: re.sub(r'[^\w\s]', '', x))
data
```

Text

0	0	is upset that he cannot update his Facebook by
1	0	I dived many times for the ball Managed to sa
2	0	my whole body feels itchy and like its on fire
3	0	no it is not behaving at all i am mad why am
4	0	not the whole crew
		•••
1048570	1	My GrandMa is making Dinenr with my Mum
1048571	1	Midmorning snack time A bowl of cheese noodles
1048572	1	same here say it like from the Terminiator m
1048573	1	i am great thaanks wbuu
1048574	1	cannot wait til her date this weekend

[1048575 rows x 2 columns]

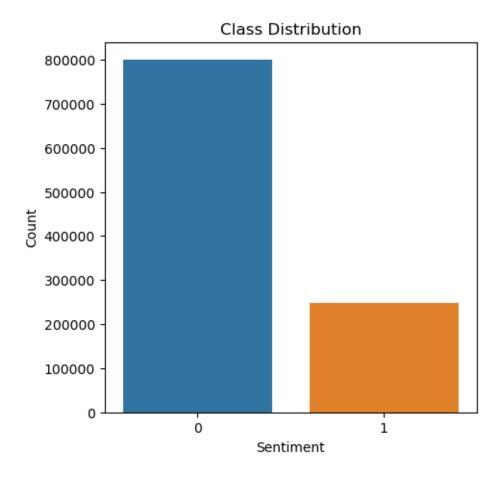
```
[]: # lowercasing letters in the text
data['Text'] = data['Text'].str.lower()
data
```

```
[]:
            Target
                                                                  Text
                 0 is upset that he cannot update his facebook by...
   0
   1
                     i dived many times for the ball managed to sa...
   2
                      my whole body feels itchy and like its on fire
                 0
   3
                     no it is not behaving at all i am mad why am ...
   4
                                                   not the whole crew
                 0
   1048570
                 1
                             my grandma is making dinenr with my mum
   1048571
                 1 midmorning snack time a bowl of cheese noodles...
   1048572
                 1
                     same here say it like from the terminiator m...
   1048573
                 1
                                              i am great thaanks wbuu
                               cannot wait til her date this weekend
   1048574
                 1
```

[1048575 rows x 2 columns]

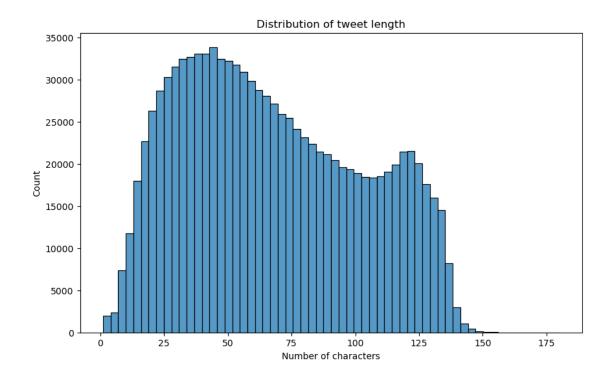
Visualization

```
[]: # visualize class distribution
plt.figure(figsize=(5, 5))
sns.countplot(x = 'Target' , data = data)
plt.title('Class Distribution')
plt.xlabel('Sentiment')
plt.ylabel('Count')
plt.show()
```



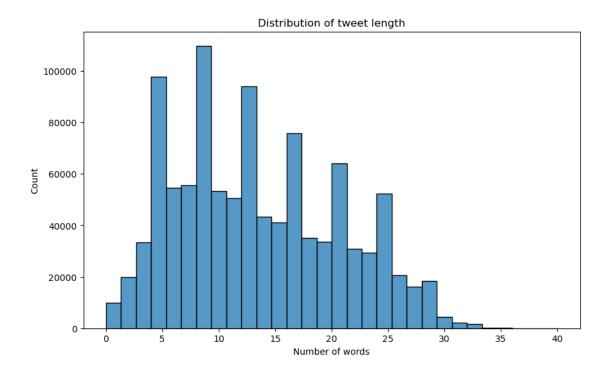
```
[]: # explore tweet length
data['characters'] = data['Text'].apply(lambda x: len(x))

# visualize tweet length distribution
plt.figure(figsize = (10, 6))
sns.histplot(data['characters'], bins = 60)
plt.title('Distribution of tweet length')
plt.xlabel('Number of characters')
plt.ylabel('Count')
plt.show()
```

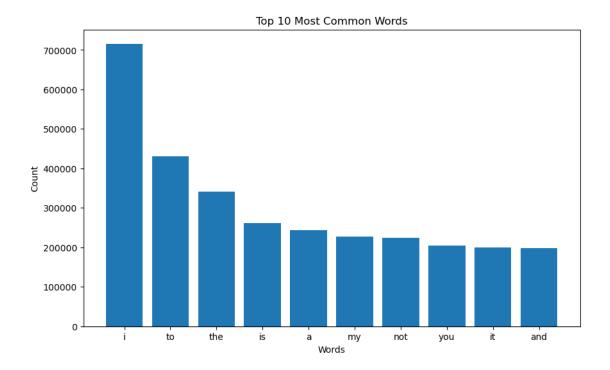


```
[]: # explore tweet length
data['words'] = data['Text'].apply(lambda x: len(x.split()))

# visualize tweet length distribution
plt.figure(figsize = (10, 6))
sns.histplot(data['words'], bins = 30)
plt.title('Distribution of tweet length')
plt.xlabel('Number of words')
plt.ylabel('Count')
plt.show()
```



```
[]: # combine all the text into a single string
   all_text = ' '.join(data['Text'])
   # split the text into individual words
   words = all_text.split()
   # count the frequency of each word
   word_counts = Counter(words)
   # get the top 10 most common words
   top_10_words = word_counts.most_common(10)
   # extract the words and their counts
   top_10_words, top_10_counts = zip(*top_10_words)
   # plot the bar chart
   plt.figure(figsize=(10, 6))
   plt.bar(top_10_words, top_10_counts)
   plt.title('Top 10 Most Common Words')
   plt.xlabel('Words')
   plt.ylabel('Count')
   plt.show()
```



```
[]: # average word count depending on sentiment

df = data.groupby("Target").words.agg("mean")

df.plot(kind = 'bar', color = 'blue')

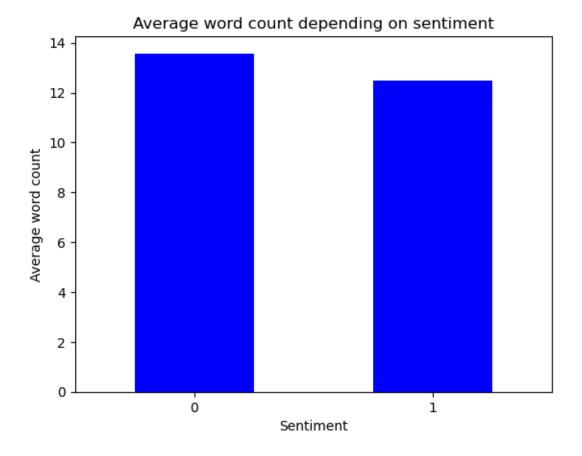
plt.title('Average word count depending on sentiment')

plt.xlabel('Sentiment')

plt.ylabel('Average word count')

plt.xticks(rotation = 0)

plt.show()
```



```
[]: # is # in tweet?
   data['has_hashtag'] = tweets['Text'].str.contains(r'#\w+')
   data
[]:
                                                                   Text \
            Target
                    is upset that he cannot update his facebook by...
                      i dived many times for the ball managed to sa...
   1
   2
                 0
                      my whole body feels itchy and like its on fire
                      no it is not behaving at all i am mad why am ...
   3
                 0
   4
                 0
                                                   not the whole crew
                  1
                              my grandma is making dinenr with my mum
   1048570
   1048571
                    midmorning snack time a bowl of cheese noodles...
   1048572
                  1
                      same here say it like from the terminiator m...
   1048573
                 1
                                              i am great thaanks wbuu
   1048574
                 1
                                cannot wait til her date this weekend
            characters
                         words
                                has_hashtag
   0
                                      False
                    107
                            21
   1
                     78
                            17
                                      False
```

```
3
                     93
                            22
                                       False
   4
                     20
                              4
                                       False
   . . .
                    . . .
                                         . . .
                            . . .
   1048570
                     40
                             8
                                       False
   1048571
                             9
                                       False
                     51
   1048572
                     81
                            16
                                       False
   1048573
                     25
                             5
                                       False
                             7
   1048574
                     38
                                       False
   [1048575 rows x 5 columns]
[]: # is hashtag present in negatives tweets?
   data[data['Target'] == 0]['has_hashtag'].value_counts().apply(lambda x: x /__
     →len(data[data['Target'] == 0]) * 100)
: False
             98.098373
              1.901627
   True
   Name: has_hashtag, dtype: float64
[]: # is hashtag present in positives tweets?
   data[data['Target'] == 1]['has_hashtag'].value_counts().apply(lambda x: x / [
    →len(data[data['Target'] == 1]) * 100)
: False
             97.43861
   True
              2.56139
   Name: has_hashtag, dtype: float64
[]: # is "not" in tweet?
   data['has_not'] = data['Text'].str.contains('not')
[]:
             Target
                                                                    Text \
                     is upset that he cannot update his facebook by...
   1
                      i dived many times for the ball managed to sa...
   2
                  0
                       my whole body feels itchy and like its on fire
   3
                      no it is not behaving at all i am mad why am ...
                  0
   4
                  0
                                                    not the whole crew
   1048570
                              my grandma is making dinenr with my mum
                  1
   1048571
                     midmorning snack time a bowl of cheese noodles...
                  1
   1048572
                  1
                      same here say it like from the terminiator m...
   1048573
                  1
                                               i am great thaanks wbuu
   1048574
                  1
                                 cannot wait til her date this weekend
             characters
                                has_hashtag has_not
                         words
   0
                    107
                            21
                                       False
                                                 True
```

2

47

10

False

```
78
                            17
                                       False
                                                  False
1
2
                   47
                                       False
                                                  False
                            10
3
                   93
                            22
                                       False
                                                   True
4
                   20
                             4
                                       False
                                                   True
                                          . . .
                                                    . . .
1048570
                                       False
                                                  False
                   40
                             8
1048571
                             9
                   51
                                       False
                                                  False
1048572
                   81
                            16
                                       False
                                                  False
1048573
                   25
                             5
                                       False
                                                  False
                             7
1048574
                   38
                                       False
                                                   True
```

[1048575 rows x 6 columns]

```
[]: # is "not" present in negatives tweets?

data[data['Target'] == 0]['has_not'].value_counts().apply(lambda x: x /

→len(data[data['Target'] == 0]) * 100)
```

[]: False 70.632338 True 29.367662

Name: has_not, dtype: float64

```
[]: # is "not" present in positives tweets?

data[data['Target'] == 1]['has_not'].value_counts().apply(lambda x: x / u olen(data[data['Target'] == 1]) * 100)
```

[]: False 86.185714 True 13.814286

Name: has_not, dtype: float64

```
[]: # extract hour from the Date column

data['Hour'] = pd.to_datetime(tweets['Date']).dt.hour
data
```

c:\Users\flang\anaconda3\lib\site-packages\dateutil\parser_parser.py:1207:
UnknownTimezoneWarning: tzname PDT identified but not understood. Pass
`tzinfos` argument in order to correctly return a timezone-aware datetime. In a future version, this will raise an exception.

warnings.warn("tzname {tzname} identified but not understood. "

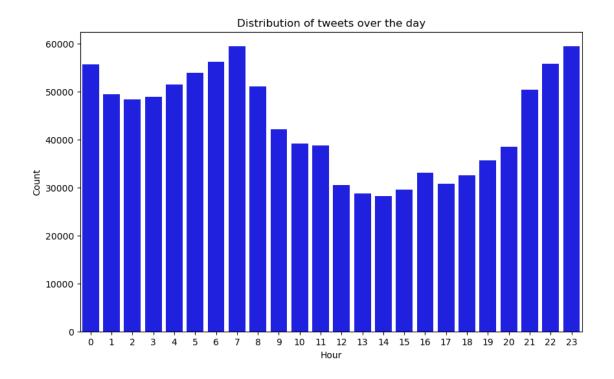
```
[]:
            Target
                                                                    Text \
   0
                    is upset that he cannot update his facebook by...
   1
                  0
                      i dived many times for the ball managed to sa...
   2
                  0
                       my whole body feels itchy and like its on fire
   3
                  0
                      no it is not behaving at all i am mad why am ...
   4
                  0
                                                    not the whole crew
   1048570
                  1
                              my grandma is making dinenr with my mum
```

```
1048571
                 midmorning snack time a bowl of cheese noodles...
1048572
                   same here say it like from the terminiator m...
1048573
              1
                                            i am great thaanks wbuu
1048574
              1
                             cannot wait til her date this weekend
         characters
                      words has_hashtag has_not Hour
0
                 107
                         21
                                    False
                                              True
                                                       22
1
                  78
                         17
                                    False
                                             False
                                                       22
2
                                                       22
                  47
                         10
                                    False
                                             False
3
                  93
                         22
                                    False
                                              True
                                                       22
4
                  20
                                    False
                                              True
                                                       22
                                      . . .
                                               . . .
                 . . .
                                                      . . .
1048570
                  40
                          8
                                    False
                                             False
                                                        7
                                                        7
1048571
                 51
                          9
                                    False
                                             False
1048572
                  81
                         16
                                    False
                                             False
                                                        7
                  25
                          5
                                                        7
1048573
                                    False
                                             False
                          7
                                                        7
                  38
                                    False
                                              True
1048574
```

[1048575 rows x 7 columns]

```
[]: # visualize the distribution of tweets over the day

plt.figure(figsize=(10, 6))
sns.countplot(x = 'Hour', data = data, color = 'blue')
plt.title('Distribution of tweets over the day')
plt.xlabel('Hour')
plt.ylabel('Count')
plt.show()
```



```
[]: # visualize the the influence of the hour of writing a tweet on the Target

→variable

hourly_target_counts = data.groupby('Hour')['Target'].value_counts().

→unstack(fill_value=0)

plt.figure(figsize=(15, 6))

hourly_target_counts.plot(kind='bar', stacked=True)

plt.title('The influence of the hour of writing a tweet on the sentiment')

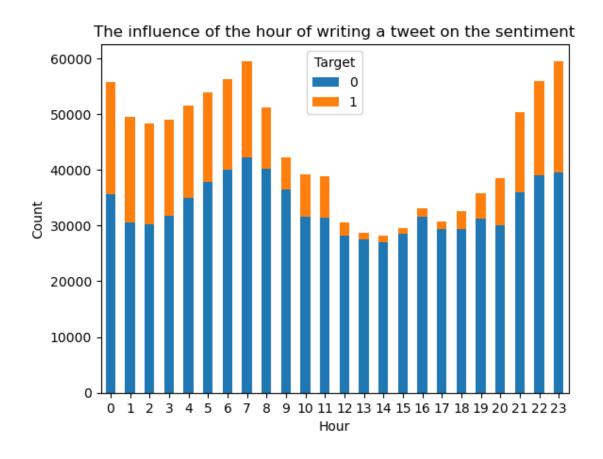
plt.xlabel('Hour')

plt.ylabel('Count')

plt.xticks(rotation = 0)

plt.show()
```

<Figure size 1500x600 with 0 Axes>



```
[]: # deleting words which have less characters than 3
   data['clean_text'] = data["Text"].apply(lambda x: " ".join([w for w in x.
    \rightarrowsplit() if len(w)>=3]))
   data
[]:
             Target
                                                                    Text
                                                                         \
                     is upset that he cannot update his facebook by...
   0
   1
                  0
                      i dived many times for the ball managed to sa...
   2
                       my whole body feels itchy and like its on fire
                      no it is not behaving at all i am mad why am ...
   3
                  0
                                                    not the whole crew
                . . .
   1048570
                  1
                              my grandma is making dinenr with my mum
   1048571
                     midmorning snack time a bowl of cheese noodles...
                  1
   1048572
                  1
                      same here say it like from the terminiator m...
   1048573
                  1
                                               i am great thaanks wbuu
   1048574
                                cannot wait til her date this weekend
             characters
                         words
                               has_hashtag
                                             has_not
                                                       Hour
   0
                    107
                            21
                                       False
                                                 True
                                                          22
```

```
1
                     78
                             17
                                       False
                                                False
                                                          22
   2
                                                          22
                     47
                                       False
                                                 False
                             10
   3
                     93
                             22
                                       False
                                                  True
                                                          22
   4
                     20
                              4
                                       False
                                                  True
                                                          22
                                         . . .
                                                   . . .
                                                         . . .
   1048570
                                       False
                                                False
                                                           7
                     40
                              8
                              9
                                                           7
   1048571
                     51
                                       False
                                                False
   1048572
                     81
                             16
                                       False
                                                False
                                                           7
                                                           7
   1048573
                     25
                              5
                                       False
                                                False
   1048574
                              7
                                       False
                                                           7
                     38
                                                  True
                                                      clean_text
   0
             upset that cannot update his facebook texting ...
   1
             dived many times for the ball managed save the...
   2
                      whole body feels itchy and like its fire
   3
             not behaving all mad why here because cannot s...
   4
                                             not the whole crew
   . . .
   1048570
                                 grandma making dinenr with mum
                 midmorning snack time bowl cheese noodles yum
   1048571
   1048572
            same here say like from the terminiator movies...
   1048573
                                             great thaanks wbuu
   1048574
                         cannot wait til her date this weekend
   [1048575 rows x 8 columns]
[]: # individual words considered as tokens
   tokenized_tweet = data['clean_text'].apply(lambda x: x.split())
   tokenized_tweet
[]: 0
               [upset, that, cannot, update, his, facebook, t...
               [dived, many, times, for, the, ball, managed, ...
   1
   2
               [whole, body, feels, itchy, and, like, its, fire]
   3
               [not, behaving, all, mad, why, here, because, ...
                                          [not, the, whole, crew]
   1048570
                             [grandma, making, dinenr, with, mum]
   1048571
               [midmorning, snack, time, bowl, cheese, noodle...
               [same, here, say, like, from, the, terminiator...
   1048572
   1048573
                                            [great, thaanks, wbuu]
                   [cannot, wait, til, her, date, this, weekend]
   1048574
   Name: clean_text, Length: 1048575, dtype: object
[]: # stem the words
   stemmer = PorterStemmer()
```

```
tokenized tweet = tokenized tweet.apply(lambda s: [stemmer.stem(word) for word_
    →in s]) # stemming
   tokenized_tweet
[]: 0
               [upset, that, cannot, updat, hi, facebook, tex...
               [dive, mani, time, for, the, ball, manag, save...
   1
   2
                 [whole, bodi, feel, itchi, and, like, it, fire]
   3
               [not, behav, all, mad, whi, here, becaus, cann...
   4
                                          [not, the, whole, crew]
                               [grandma, make, dinenr, with, mum]
   1048570
   1048571
                 [midmorn, snack, time, bowl, chees, noodl, yum]
   1048572
               [same, here, say, like, from, the, termini, mo...
   1048573
                                             [great, thaank, wbuu]
   1048574
                    [cannot, wait, til, her, date, thi, weekend]
   Name: clean_text, Length: 1048575, dtype: object
[]: # combining to sentences
   for i in range(len(tokenized_tweet)):
       tokenized_tweet[i] = ' '.join(tokenized_tweet[i])
   data['clean_text'] = tokenized_tweet
   data
[]:
                                                                     Text \
             Target
                     is upset that he cannot update his facebook by ...
                  0
   1
                  0
                      i dived many times for the ball managed to sa...
   2
                       my whole body feels itchy and like its on fire
                  0
   3
                  0
                      no it is not behaving at all i am mad why am ...
                  0
   4
                                                     not the whole crew
   1048570
                  1
                               my grandma is making dinenr with my mum
   1048571
                     midmorning snack time a bowl of cheese noodles...
                  1
   1048572
                  1
                      same here say it like from the terminiator m...
   1048573
                  1
                                                i am great thaanks wbuu
   1048574
                  1
                                 cannot wait til her date this weekend
             characters
                         words
                                 has_hashtag
                                              has_not
                                                        Hour
   0
                    107
                                       False
                                                  True
                                                          22
                             21
   1
                     78
                             17
                                       False
                                                False
                                                          22
   2
                     47
                             10
                                       False
                                                False
                                                          22
   3
                     93
                             22
                                       False
                                                 True
                                                          22
   4
                              4
                                                          22
                     20
                                       False
                                                  True
                     . . .
                            . . .
                                                         . . .
                                                           7
   1048570
                     40
                              8
                                       False
                                                False
   1048571
                     51
                              9
                                       False
                                                False
                                                           7
   1048572
                     81
                             16
                                       False
                                                False
                                                           7
   1048573
                     25
                              5
                                       False
                                                False
                                                           7
                              7
                                                           7
   1048574
                     38
                                       False
                                                  True
```

```
0
            upset that cannot updat hi facebook text and m...
   1
            dive mani time for the ball manag save the res...
                       whole bodi feel itchi and like it fire
   3
            not behav all mad whi here becaus cannot see y...
                                            not the whole crew
   1048570
                                  grandma make dinenr with mum
                      midmorn snack time bowl chees noodl yum
   1048571
   1048572 same here say like from the termini movi come ...
   1048573
                                             great thaank wbuu
   1048574
                         cannot wait til her date thi weekend
   [1048575 rows x 8 columns]
[]: all_words = ' '.join([text for text in data['clean_text']])
   all_words_pos = ' '.join([text for text in data['clean_text'][data['Target'] ==_
    →1]])
   all_words_neg = ' '.join([text for text in data['clean_text'][data['Target'] ==_
    →0]])
   wordcloud = WordCloud(width=800, height=500, random_state=42,_
    →max_font_size=100).generate(all_words)
   wordcloud_pos = WordCloud(width=800, height=500, random_state=42,__
    max_font_size=100).generate(all_words_pos)
   wordcloud_neg = WordCloud(width=800, height=500, random_state=42,_
    →max_font_size=100).generate(all_words_neg)
   # plot the graph
   fig, ax = plt.subplots(1, 3, figsize=(15, 10))
   ax[0].imshow(wordcloud, interpolation="bilinear")
   ax[0].set title('All words')
   ax[0].axis('off')
   ax[1].imshow(wordcloud_pos, interpolation="bilinear")
   ax[1].set_title('Words target 1')
   ax[1].axis('off')
   ax[2].imshow(wordcloud_neg, interpolation="bilinear")
   ax[2].set_title('Words target 0')
   ax[2].axis('off')
   fig.show()
```

clean_text

C:\Users\flang\AppData\Local\Temp\ipykernel_16508\2180637428.py:20: UserWarning:
FigureCanvasAgg is non-interactive, and thus cannot be shown
fig.show()







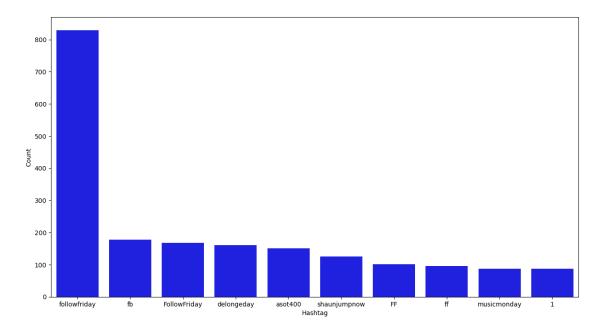
```
[]: def hashtag_extract(tweets):
       hashtags = []
       for tweet in tweets:
           ht = re.findall(r"#(\w+)", tweet)
           hashtags.append(ht)
       return hashtags
[]: # extracting hashtags from positive tweets
   ht_positive = hashtag_extract(tweets['Text'][data['Target'] == 1])
   # extracting hashtags from negative tweets
   ht_negative = hashtag_extract(tweets['Text'][data['Target'] == 0])
[]: # unnest list
   ht_positive = sum(ht_positive, [])
   ht_negative = sum(ht_negative, [])
[]: ht_positive[:5]
[]: ['Devunity', 'Alexa', 'Japan', 'Skype', 'expletives']
[]: ht_negative[:5]
[]: ['itm', 'therapyfail', 'fb', 'TTSC', '24']
[]: # converting dictionary to dataframe
   freq = nltk.FreqDist(ht_positive)
   d = pd.DataFrame({'Hashtag': list(freq.keys()),
                      'Count': list(freq.values())
                      })
   d.sort_values(by='Count', ascending=False)
[]:
              Hashtag
                        Count
   90
         followfriday
                          829
   68
                          177
   201
         FollowFriday
                          168
   1847
           delongeday
                          161
               asot400
   211
                          151
   . . .
   1270
               python
                            1
   1271
             jcdecaux
                            1
   1273
            12seconds
```

```
1274 com125 1
3217 brownies 1
```

[3218 rows x 2 columns]

```
[]: # selecting top 10 most frequent hashtags positive
d = d.nlargest(columns="Count", n = 10)
plt.figure(figsize=(15,8))
sns.barplot(data=d, x= "Hashtag", y = "Count", color="blue")
```

[]: <Axes: xlabel='Hashtag', ylabel='Count'>



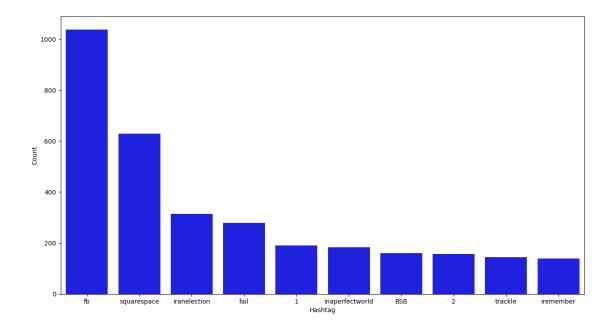
```
{\tt Count}
[]:
                 Hashtag
                       fb
                             1037
    4246
            squarespace
                              628
    4333
           iranelection
                              315
    12
                    fail
                              278
    17
                        1
                              191
    . . .
                      . . .
    2919
                   NHL10
                                1
    2918
                   NBA10
                                1
    2917
                  Fifa10
                                1
```

```
2916 WSOP4 1
7089 lbda 1
```

[7090 rows x 2 columns]

```
[]: # selecting top 10 most frequent hashtags negative
d = d.nlargest(columns="Count", n = 10)
plt.figure(figsize=(15,8))
sns.barplot(data=d, x= "Hashtag", y = "Count", color="blue")
```

[]: <Axes: xlabel='Hashtag', ylabel='Count'>



1.2 2. Feature engineering

1.3 3. Preparation of training and test sets

```
[]: clean_data = data[['Text', 'Target']] clean_data
```

```
[]:
                                                           Text
                                                                  Target
            is upset that he cannot update his Facebook by...
   0
                                                                       0
   1
              I dived many times for the ball. Managed to s...
                                                                       0
   2
              my whole body feels itchy and like its on fire
                                                                       0
   3
             no, it is not behaving at all. i am mad. why ...
                                                                       0
                                            not the whole crew
```

```
My GrandMa is making Dinenr with my Mum
   1048570
   1048571 Mid-morning snack time... A bowl of cheese noo...
             same here say it like from the Terminiator m...
   1048572
   1048573
                                    i am great thaanks wbuu?
                                                                     1
   1048574
                       cannot wait til her date this weekend
   [1048575 rows x 2 columns]
[]: x_train, x_test, y_train, y_test = train_test_split(
       clean_data[clean_data.columns.values[:-1]], # X
       clean_data[clean_data.columns.values[-1]], # y
       test_size=0.33, random_state=42)
[]: x_train.shape, x_test.shape, y_train.shape, y_test.shape
[]: ((702545, 1), (346030, 1), (702545,), (346030,))
[]:
```