```
In [1]:
             import pandas as pd
             dataset = pd.read csv('hate speech.csv')
          3 dataset.head()
Out[1]:
            id label
                                                    tweet
                     @user when a father is dysfunctional and is s...
                     @user @user thanks for #lyft credit i can't us...
             3
                  0
                                         bihday your majesty
         3
            4
                  0
                        #model i love u take with u all the time in ...
            5
                  0
                              factsguide: society now #motivation
In [2]:
             dataset.label.value_counts()
Out[2]: 0
              3000
         1
              2242
         Name: label, dtype: int64
             for index, tweet in enumerate(dataset["tweet"] [10:15]):
In [3]:
          2
                  print(index+1,"-", tweet)
         1 - âDD #ireland consumer price index (mom) climbed from previous 0.2% to
         0.5% in may
                        #blog #silver #gold #forex
         2 - we are so selfish. #orlando #standwithorlando #pulseshooting #orlandos
         hooting #biggerproblems #selfish #heabreaking
                                                           #values #love #
         3 - i get to see my daddy today!!
                                               #80days #gettingfed
         4 - ouch...junior is angryð@@@#got7 #junior #yugyoem
         5 - i am thankful for having a paner. #thankful #positive
In [4]:
             import re
          2
             def clean_text(text):
                  text = re.sub(r'[^a-zA-Z']','', text)
          3
                  text = re.sub(r'[^\x00-\x7F]+','', text)
          4
          5
                  text = text.lower()
                  return text
          6
             dataset['clean_text'] = dataset.tweet.apply(lambda x: clean_text(x))
In [5]:
```

In [29]: 1 dataset.head(10)

Out[29]:		id label		tweet clean_text		word_count	any_		
	0	1	0	@user when a father is dysfunctional and is s	userwhenafatherisdysfunctionalandissoselfishhe	1			
	1	2	0	@user @user thanks for #lyft credit i can't us	useruserthanksforlyftcreditican'tusecausetheyd	1			
	2	3	0	bihday your majesty	bihdayyourmajesty	1			
	3	4	0	#model i love u take with u all the time in 	modeliloveutakewithuallthetimeinur	1			
	4	5	0	factsguide: society now #motivation	factsguidesocietynowmotivation	1			
	5	6	0	[2/2] huge fan fare and big talking before the	hugefanfareandbigtalkingbeforetheyleavechaosan	1			
	6	7	0	@user camping tomorrow @user @user @user @use	usercampingtomorrowuseruseruseruseruseruse	1			
	7	8	0	the next school year is the year for exams.ŏ□□	thenextschoolyearistheyearforexamscan'tthinkab	1			
	8	9	0	we won!!! love the land!!! #allin #cavs #champ	wewonlovethelandallincavschampionsclevelandcle	1			
	9	10	0	@user @user welcome here!i'm it's so#gr	useruserwelcomeherei'mit'ssogr	1			
	4								
In [6]:		<pre>from nltk.corpus import stopwords len(stopwords.words('english'))</pre>							

Out[6]: 179

```
In [7]:
              import nltk
              nltk.download('stopwords')
         [nltk data] Downloading package stopwords to
                          C:\Users\nihar\AppData\Roaming\nltk_data...
         [nltk_data]
                        Package stopwords is already up-to-date!
         [nltk data]
 Out[7]: True
 In [8]:
              def gen_freq(text):
           1
           2
                  word_list = []
           3
                  for tw_words in text.split():
           4
                      word_list.extend(tw_words)
           5
                  word_freq = pd.Series(word_list).value_counts()
           6
                  stop = stopwords.words('english')
           7
                  word_freq = word_freq.drop(stop, errors='ignore')
           8
                  return word freq
 In [9]:
           1
              def any_neg(words):
           2
                  for word in words:
                      if word in ['n', 'no', 'non', 'not'] or re.search(r"\wn't", wor
           3
           4
                          return 1
           5
                      else:
           6
                          return 0
                                                                                     In [10]:
              def any_rare(words, rare_100):
           2
                    for word in words:
           3
                      if word in rare 100:
                            return 1
           4
           5
                      else:
                          return 0
           6
In [11]:
              def is_question(words):
           1
           2
                    for word in words:
           3
                      if word in ["when","what","how","why","who"]:
           4
                             return 1
           5
                      else:
           6
                             return 0
In [12]:
           1
              word_freq=gen_freq(dataset.clean_text.str)
              rare 100=word freq[-100:]
              dataset['word_count'] = dataset.clean_text.str.split().apply(lambda x:ler
           3
              dataset['any_neg']=dataset.clean_text.str.split().apply(lambda x:any_neg')
           5
              dataset['is_question']=dataset.clean_text.str.split().apply(lambda x:is
              dataset['any_rare'] = dataset.clean_text.str.split().apply(lambda x:any_r
           6
           7
              dataset['char_count'] = dataset.clean_text.apply(lambda x:len(x))
```

In [13]: 1 dataset.head(10)

Out[13]:		id	label	tweet	clean_text	word_count any_
	0	1	0	@user when a father is dysfunctional and is s	userwhenafatherisdysfunctionalandissoselfishhe	1
	1	2	0	@user @user thanks for #lyft credit i can't us	useruserthanksforlyftcreditican'tusecausetheyd	1
	2	3	0	bihday your majesty	bihdayyourmajesty	1
	3	4	0	#model i love u take with u all the time in 	modeliloveutakewithuallthetimeinur	1
	4	5	0	factsguide: society now #motivation	factsguidesocietynowmotivation	1
	5	6	0	[2/2] huge fan fare and big talking before the	hugefanfareandbigtalkingbeforetheyleavechaosan	1
	6	7	0	@user camping tomorrow @user @user @use	usercampingtomorrowuseruseruseruseruseruse	1
	7	8	0	the next school year is the year for exams.ð□□	thenextschoolyearistheyearforexamscan'tthinkab	1
	8	9	0	we won!!! love the land!!! #allin #cavs #champ	wewonlovethelandallincavschampionsclevelandcle	1
	9	10	0	@user @user welcome here!i'm it's so#gr	useruserwelcomeherei'mit'ssogr	1
	4					•
In [18]:	3	2 X	= dat = dat	taset[['word taset.label	<pre>l_selection import train_test_split d_count', 'any_neg','any_rare','char_cou y_train, y_test = train_test_split(X,y,</pre>	

```
In [21]:
           1 from sklearn.naive_bayes import GaussianNB
             model = GaussianNB()
           2
             model = model.fit(X_train, y_train)
             pred = model.predict(X_test)
In [22]:
           1 model.predict(X_test[5:10])
Out[22]: array([1, 1, 1, 1, 1], dtype=int64)
In [23]:
             from sklearn.metrics import accuracy_score
             print("Accuracy:", accuracy_score(y_test, pred)*100, '%')
         Accuracy: 44.518589132507145 %
In [24]:
           1 from sklearn.ensemble import RandomForestClassifier
           2 clf rf = RandomForestClassifier()
           3 clf_rf.fit(X_train,y_train)
           4 rf_pred=clf_rf.predict(X_test).astype(int)
           1 | from sklearn.metrics import classification_report, confusion_matrix, \
In [25]:
             accuracy_score
           3
             print(confusion_matrix(y_test,rf_pred))
             print(classification_report(y_test,rf_pred))
             print("Accuracy:",accuracy_score(y_test, rf_pred))
         [[410 189]
          [233 217]]
                       precision
                                     recall f1-score
                                                        support
                                       0.68
                    0
                            0.64
                                                 0.66
                                                            599
                    1
                            0.53
                                       0.48
                                                 0.51
                                                            450
                                                 0.60
             accuracy
                                                           1049
                            0.59
                                       0.58
                                                 0.58
                                                           1049
            macro avg
         weighted avg
                            0.59
                                       0.60
                                                 0.59
                                                           1049
         Accuracy: 0.5977121067683508
In [26]:
           1 from sklearn.linear model import LogisticRegression
             logreg = LogisticRegression(class_weight='balanced')
              logreg.fit(X_train, y_train)
Out[26]: LogisticRegression(class_weight='balanced')
In [27]:
           1 y_pred = logreg.predict(X_test)
```

In [28]: 1 from sklearn.metrics import classification_report
2 print(classification_report(y_test, y_pred))

	precision	recall	f1-score	support	
0	0.65	0.54	0.59	599	
1	0.50	0.62	0.55	450	
accuracy			0.57	1049	
macro avg	0.58	0.58	0.57	1049	
weighted avg	0.59	0.57	0.57	1049	

In []: | 1