```
import matplotlib.pyplot as plt
          import seaborn as sns
          %matplotlib inline
          import re
          import nltk
          from nltk.corpus import stopwords
          from nltk.stem import WordNetLemmatizer
          from sklearn.feature_extraction.text import TfidfVectorizer
          from sklearn.ensemble import RandomForestClassifier
          from sklearn.tree import DecisionTreeClassifier
          from sklearn.model_selection import train_test_split
          from sklearn.naive_bayes import MultinomialNB
          from sklearn.metrics import classification_report, confusion_matrix
          from sklearn.model_selection import cross_val_score
          read data
In [2]: df=pd.read_csv(r"C:\Users\Somay\Documents\Spam SMS Collection.csv", encoding="ISO-8859-1")
          understanding the data
In [3]: print(df.columns)
          Index(['ham', 'Go until jurong point, crazy.. Available only in bugis n great world la e buff
          et... Cine there got amore wat...'], dtype='object')
In [4]: df.head()
 Out[4]:
             ham Go until jurong point, crazy.. Available only in bugis n great world la e buffet... Cine there got amore wat...
          0 ham
                                                                               Ok lar... Joking wif u oni...
          1 spam
                                                               Free entry in 2 a wkly comp to win FA Cup fina...
                                                                U dun say so early hor... U c already then say...
          3 ham
                                                                 Nah I don't think he goes to usf, he lives aro...
          4 spam
                                                               FreeMsg Hey there darling it's been 3 week's n...
In [5]: df.shape
Out[5]: (5571, 2)
In [6]: df.isnull().sum()
 Out[6]: ham
          Go until jurong point, crazy.. Available only in bugis n great world la e buffet... Cine ther
 In [7]: df=df.rename(columns={'ham':'type','Go until jurong point, crazy.. Available only in bugis n
          great world la e buffet... Cine there got amore wat...':'message'})
 In [8]: | df.info()
          <class 'pandas.core.frame.DataFrame'>
          RangeIndex: 5571 entries, 0 to 5570
          Data columns (total 2 columns):
               Column Non-Null Count Dtype
                         5571 non-null object
               type
               message 5571 non-null object
          dtypes: object(2)
          memory usage: 43.6+ KB
In [9]: df.head()
Out[9]:
                                              message
              type
          0 ham
                                  Ok lar... Joking wif u oni...
                  Free entry in 2 a wkly comp to win FA Cup fina...
          1 spam
                   U dun say so early hor... U c already then say...
             ham
                    Nah I don't think he goes to usf, he lives aro...
          4 spam FreeMsg Hey there darling it's been 3 week's n...
In [10]: | df['type']=df['type'].map({'ham':0, 'spam':1})
Out[10]:
                                                message
                type
                                    Ok lar... Joking wif u oni...
             1
                    Free entry in 2 a wkly comp to win FA Cup fina...
                     U dun say so early hor... U c already then say...
                       Nah I don't think he goes to usf, he lives aro...
                  1 FreeMsg Hey there darling it's been 3 week's n...
                     This is the 2nd time we have tried 2 contact u...
          5566
                 1
          5567
                  0
                             Will ü b going to esplanade fr home?
                       Pity, * was in mood for that. So...any other s...
          5568
                      The guy did some bitching but I acted like i'd...
           5569
                  0
          5570
                                      Rofl. Its true to its name
          5571 rows × 2 columns
          data visualization for inbalanced dataset
In [11]: plt.figure(figsize=(10,10))
          g=sns.countplot(x='type', data=df)
          p=plt.title('inbalanced dataset ')
          p=plt.xlabel('spam')
          p=plt.ylabel('count')
                                             inbalanced dataset
             5000
             4000
             3000
             2000
             1000
                                                   spam
In [12]: print('ham count', df['type'].value_counts()[0])
          print('spam count', df['type'].value_counts()[1])
          ham count 4824
          spam count 747
In [13]: only_spam=df[df['type']==1]
          count=int((df.shape[0]-only_spam.shape[0])/only_spam.shape[0])
          for i in range(0, count-1):
              df=pd.concat([df,only_spam])
          df.shape
Out[13]: (9306, 2)
          data visualization for balanced dataset
In [14]: plt.figure(figsize=(10,10))
          g=sns.countplot(x='type',data=df)
          p=plt.title('balanced datasets')
          p=plt.xlabel('spam')
          p=plt.ylabel('count')
                                              balanced datasets
             5000
             4000
             3000
             2000
             1000
                                                                       i
                                                   spam
          word count spam and ham message and visualize the graph
In [15]: df['word_count']=df['message'].apply(lambda x: len(x.split()))
In [16]: df.head()
Out[16]:
                                             message word_count
             type
          0
               0
                                  Ok lar... Joking wif u oni...
                                                             6
               1 Free entry in 2 a wkly comp to win FA Cup fina...
          1
                                                            28
                  U dun say so early hor... U c already then say...
                                                            11
                                                            13
                    Nah I don't think he goes to usf, he lives aro...
                                                            32
               1 FreeMsg Hey there darling it's been 3 week's n...
In [17]: plt.figure(figsize=(16,8))
          plt.subplot(1,2,1)
          g=sns.distplot(a=df[df['type']==0].word_count)
          p=plt.title('distribution of word count ham message')
          plt.figure(figsize=(16,8))
          plt.subplot(1,2,2)
          g=sns.distplot(a=df[df['type']==1].word_count,color='red')
          p=plt.title('distribution of word count spam message')
          plt.tight_layout()
                         distribution of word count ham message
           0.07
           0.06
           0.05
           0.04
           0.03
           0.02
           0.01
                                  distribution of word count spam message
           0.14
           0.12
           0.10
           0.08
           0.04
           0.02
                                              word_count
          check cuurecy symbol in messages
In [18]: def currency(x):
              currency_symbols=['€','$','£','¥','f']
              for i in cuurency_symbols:
                   if i in x:
                       return 1
              return 0
          df['contain_currency_symbols']=df['message'].apply(lambda x: len(x.split()))
In [19]: df.head()
Out[19]:
                                             message word_count contain_currency_symbols
             type
                                  Ok lar... Joking wif u oni...
               1 Free entry in 2 a wkly comp to win FA Cup fina...
                                                            28
                                                                                  28
                   U dun say so early hor... U c already then say...
                                                            11
                                                                                  11
                                                            13
                                                                                  13
                    Nah I don't think he goes to usf, he lives aro...
                                                            32
               1 FreeMsg Hey there darling it's been 3 week's n...
                                                                                  32
          data cleaning with lemmatized, tfidfvectorization and many
          more parameters
In [20]: corpus=[]
          for sms_string in list(df.message):
              message=re.sub(pattern='[a-zA-Z]', repl='', string=sms_string)
              message=message.lower()
              words=message.split()
              filtered_words=[word for word in words if word not in set(stopwords.words('english'))]
              lemmatized_words=[wl.lemmatize(word) for word in filtered_words]
              message=''.join(lemmatized_words)
              corpus.append(message)
In [21]: corpus[0:5]
Out[21]: ['.....', "2212005.87121()&'0845281007518'", '.....', "',", "'3'!'?!,£1.50"]
In [22]: tfidf=TfidfVectorizer(max_features=500)
          vector=tfidf.fit_transform(corpus).toarray()
          feature_names=tfidf.get_feature_names()
In [23]: X=pd.DataFrame(vector, columns=feature_names)
          y=df['type']
          model evaluation
In [24]: X_train, X_test, y_train, y_test=train_test_split(X, y, test_size=0.3, random_state=42)
          average and S.D score
In [25]: mn=MultinomialNB()
          cv=cross_val_score(mn, X, y, scoring='f1', cv=10)
          print("average score mn={}".format(round(cv.mean(), 3)))
print("standard deviation={}".format(round(cv.std(), 3)))
          average score mn=0.745
          standard deviation=0.008
          classification reports
In [26]: mn.fit(X_train,y_train)
          y_pred=mn.predict(X_test)
          print("classification report of this model")
          print(classification_report(y_test,y_pred))
          classification report of this model
                         precision
                                       recall f1-score
                                                           support
                      0
                              0.70
                                         1.00
                                                    0.82
                                                               1453
                                                               1339
                      1
                              0.99
                                         0.55
                                                    0.70
                                                    0.78
                                                               2792
              accuracy
                                                    0.76
                                                               2792
             macro avg
                              0.85
                                         0.77
          weighted avg
                              0.84
                                                    0.77
                                                               2792
          confusion matrix
In [27]: cm=confusion_matrix(y_test,y_pred)
          axis_labels=['ham', 'spam']
          plt.figure(figsize=(8,5))
          g=sns.heatmap(data=cm, annot=True, cbar=False, xticklabels=axis_labels , yticklabels=axis_labe
          ls , fmt='.1%')
          p=plt.xlabel('actual value')
          p=plt.ylabel('predicted value')
                                    cm for naive bayes
```

import libaries

import numpy as np

In [1]: import pandas as pd

In [ ]:

In [ ]:

In [ ]:

In [ ]:

700.0%

73100.0%

spam

144600.0%

60800.0%

ham

actual value

ham

spam

predicted value