```
! pip install kaggle # Installing Kaggle Library
     Requirement already satisfied: kaggle in /usr/local/lib/python3.10/dist-packages (1.5.16)
     Requirement already satisfied: six>=1.10 in /usr/local/lib/python3.10/dist-packages (from kaggle) (1.16.0)
     Requirement already satisfied: certifi in /usr/local/lib/python3.10/dist-packages (from kaggle) (2023.11.17)
     Requirement already satisfied: python-dateutil in /usr/local/lib/python3.10/dist-packages (from kaggle) (2.8.2)
     Requirement already satisfied: requests in /usr/local/lib/python3.10/dist-packages (from kaggle) (2.31.0)
     Requirement already satisfied: tqdm in /usr/local/lib/python3.10/dist-packages (from kaggle) (4.66.1)
     Requirement already satisfied: python-slugify in /usr/local/lib/python3.10/dist-packages (from kaggle) (8.0.1)
     Requirement already satisfied: urllib3 in /usr/local/lib/python3.10/dist-packages (from kaggle) (2.0.7)
     Requirement already satisfied: bleach in /usr/local/lib/python3.10/dist-packages (from kaggle) (6.1.0)
     Requirement already satisfied: webencodings in /usr/local/lib/python3.10/dist-packages (from bleach->kaggle) (0.5.1)
     Requirement already satisfied: text-unidecode>=1.3 in /usr/local/lib/python3.10/dist-packages (from python-slugify->kaggle) (1.3)
     Requirement already satisfied: charset-normalizer<4,>=2 in /usr/local/lib/python3.10/dist-packages (from requests->kaggle) (3.3.2)
     Requirement already satisfied: idna<4,>=2.5 in /usr/local/lib/python3.10/dist-packages (from requests->kaggle) (3.6)
# Configuring the path of kaggle.json file
! mkdir -p ~/.kaggle
! cp kaggle.json ~/.kaggle/
! chmod 600 ~/.kaggle/kaggle.json
```

Importing Twitter Sentiment Dataset

```
# API to fetch the dataset from kaggle
! kaggle datasets download -d kazanova/sentiment140

    Downloading sentiment140.zip to /content
    87% 70.0M/80.9M [00:00<00:00, 128MB/s]
    100% 80.9M/80.9M [00:00<00:00, 129MB/s]

# Extracting the compressed dataset

from zipfile import ZipFile
dataset = '/content/sentiment140.zip'
with ZipFile(dataset, 'r') as zip:
    zip.extractall()
    print("The dataset has been extracted!")

The dataset has been extracted!</pre>
```

Importing the Dependencies

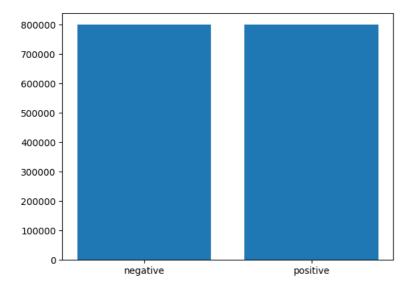
```
import numpy as np
import pandas as pd
import re # Regular Expression
from nltk.corpus import stopwords # Natural Language Tool Kit
from nltk.stem.porter import PorterStemmer
from sklearn.feature_extraction.text import TfidfVectorizer
from sklearn.model_selection import train_test_split
from sklearn.linear model import LogisticRegression
from sklearn.metrics import accuracy_score, confusion_matrix
import matplotlib.pyplot as plt
import nltk
nltk.download('stopwords')
     [nltk_data] Downloading package stopwords to /root/nltk_data...
     [nltk_data] Unzipping corpora/stopwords.zip.
     True
# Printing the stopwords in English
print(stopwords.words('english')) # Machine Learning Model doesn't require these word and also not required for processing
     ['i', 'me', 'my', 'myself', 'we', 'our', 'ours', 'ourselves', 'you', "you're", "you've", "you'll", "you'd", 'your', 'yours', 'yourse
```

Data Processing

```
# Loading the data from csv file to pandas dataframe
twitter_data = pd.read_csv('/content/training.1600000.processed.noemoticon.csv', encoding = 'ISO-8859-1')
```

Checking the Number of rows and columns

```
twitter_data.shape
     (1599999, 6)
# Printing the first 10 rows of the dataframe
twitter_data.head(10)
                                                                              @switchfoot
                         Mon Apr
                                                                 http://twitpic.com/2y1zl
                              06
                                                                  Awww, that's a bummer.
         0 1467810369
                                    NO_QUERY _TheSpecialOne_
                        22:19:45
                                                                    You shoulda got David
                                                                  Carr of Third Day to do
                        PDT 2009
                                                                                   it.;D
                         Mon Apr
                              06
                                                                  is upset that he can't update
      0 0 1467810672
                                  NO_QUERY
                                                   scotthamilton
                         22:19:49
                                                                          his Facebook by ...
                        PDT 2009
                                                                     @Kenichan I dived many
                              06
      1 0 1467810917
                                  NO_QUERY
                                                      mattycus
                         22:19:53
                                                                     times for the ball. Man...
                        PDT 2009
                              06
                                                                my whole body feels itchy and
                                  NO_QUERY
                                                       ElleCTF
      2 0 1467811184
                         22:19:57
                        PDT 2009
# Naming the columns and reading the dataset again
column_names = ['target', 'id', 'date', 'flag', 'user', 'text']
twitter_data = pd.read_csv('/content/training.1600000.processed.noemoticon.csv', names = column_names, encoding = 'ISO-8859-1')
# Checking the Number of rows and columns
twitter_data.shape
     (1600000, 6)
# Counting the number of missing values in the dataset
twitter_data.isnull().sum() # Tells how many missing values are there in each columns
     target
     id
               0
     date
               0
     flag
               0
     user
               0
     text
     dtype: int64
# Checking the distribution of target column
twitter_data['target'].value_counts()
          800000
     0
          800000
     Name: target, dtype: int64
CONVERT THE TARGET '4' TO '1'
twitter_data.replace({'target': {4:1}}, inplace = True)
# Checking the distribution of target column
plt.bar(['negative', 'positive'],twitter_data['target'].value_counts())
plt.show()
```



0 ---> Negative Tweet

1 ---> Positive Tweet

STEMMING

Process of reducing a word to its root word

```
port_stem = PorterStemmer()

def stemming(content):

    stemmed_content = re.sub('[^a-zA-Z]', ' ', content)
    stemmed_content = stemmed_content.lower()
    stemmed_content = stemmed_content.split()
    stemmed_content = [port_stem.stem(word) for word in stemmed_content if not word in stopwords.words('english')]
    stemmed_content = ' '.join(stemmed_content)

    return stemmed_content

twitter_data['stemmed_content'] = twitter_data['text'].apply(stemming)
```

twitter_data.head()

	target	id	date	flag	user	text	stem
0	0	1467810369	Mon Apr 06 22:19:45 PDT 2009	NO_QUERY	_TheSpecialOne_	@switchfoot http://twitpic.com/2y1zl - Awww, t	a
·	-		Mon Apr 06			is upset that he can't	>

```
# Separating the data and label
```

Splitnig the data into training and test data

X = twitter_data['stemmed_content'].values

Y = twitter_data['target'].values

```
# Converting the textual data to numerical data
vectorizer = TfidfVectorizer()
X_train = vectorizer.fit_transform(X_train)
X_test = vectorizer.transform(X_test)
```

Training the Machine Learning Model

```
Accuracy score on the training data : 0.81018984375

# Accuracy score on the test data
X_test_prediction = model.predict(X_test)
test_data_accuracy = accuracy_score(Y_test, X_test_prediction)

print('Accuracy score on the testing data :', test_data_accuracy)
Accuracy score on the testing data : 0.7780375
```

print('Accuracy score on the training data :', training_data_accuracy)

Model Accuracy = 77.8 %

Confusion Matrix

```
Y_pred = model.predict(X_test)
cm = confusion_matrix(Y_test, Y_pred, labels = twitter_data['target'].unique())
twitter_data_cm = pd.DataFrame(cm, index = twitter_data['target'].unique(), columns = twitter_data.target.unique())
twitter_data_cm
```

```
0 11 385551 32473 127527
```

Confusion Matrix in percentage expression

```
twitter_data_cm_percentage = twitter_data_cm.copy()
for val in twitter_data_cm_percentage:
   twitter_data_cm_percentage[val] /= twitter_data_cm_percentage[val].sum()
twitter_data_cm_percentage
```

```
0 0.789024 0.2321441 0.210976 0.767856
```

Saving the trained model

```
import pickle

filename = 'trained_model.sav'
pickle.dump(model, open(filename, 'wb'))
```

Using the saved model for the future predictions

```
# Loading the saved model
loaded_model = pickle.load(open('/content/trained_model.sav', 'rb'))
new_tweets = 'hey, congrats mr mukul for finally joining twitter'
vectTweet = vectorizer.transform(np.array([new_tweets]))
prediction = loaded_model.predict(vectTweet)
print(prediction[0])
if prediction[0] > 0:
 print('Tweet is Positive')
elif prediction[0] == 0:
 print('Tweet is Negative')
  print('Tweet is Neutral')
     Tweet is Positive
tweetList = ['Best Game Ever!', 'Working days are worst....']
vectTweet = vectorizer.transform(np.array(tweetList))
prediction = loaded_model.predict(vectTweet)
for val, i in enumerate(tweetList):
 print(i, ': This tweet is', 'positive' if prediction[val] == 1 else 'negative')
    Best Game Ever! : This tweet is positive
     Working days are worst....: This tweet is negative
Start coding or generate with AI.
```