Import Libraries

```
In [1]: import numpy as np
   import pandas as pd
   from sklearn.model_selection import train_test_split
   from sklearn.feature_extraction.text import TfidfVectorizer
   from sklearn.naive_bayes import MultinomialNB
   from sklearn.metrics import accuracy_score,classification_report
```

Import Dataset

```
In [2]: true_data = pd.read_csv('True.csv')
fake_data = pd.read_csv('Fake.csv')
```

In [3]: fake_data.head()

Out[3]:

	title	title text		date
0	Donald Trump Sends Out Embarrassing New Year'	Donald Trump just couldn t wish all Americans	News	December 31, 2017
1	Drunk Bragging Trump Staffer Started Russian	House Intelligence Committee Chairman Devin Nu	News	December 31, 2017
2	Sheriff David Clarke Becomes An Internet Joke	On Friday, it was revealed that former Milwauk	News	December 30, 2017
3	Trump Is So Obsessed He Even Has Obama's Name	On Christmas day, Donald Trump announced that	News	December 29, 2017
4	Pope Francis Just Called Out Donald Trump Dur	Pope Francis used his annual Christmas Day mes	News	December 25, 2017

```
In [4]: #add a column target label
    true_data['Target']=['True']*len(true_data)
    fake_data['Target']=['Fake']*len(fake_data)
```

In [5]: # data=true_data.append(fake_data).sample(frac=1).reset_index().drop(columns=[# data.head() data = pd.concat([true_data, fake_data], ignore_index=True) data = data.sample(frac=1).reset_index(drop=True) data.head()

Out[5]:

	title	text	subject	date	Target
0	What Ted Cruz Said In Church Sounds Like Shar	Presidential candidate Senator Ted Cruz (R-TX)	News	February 15, 2016	Fake
1	THEY KNEW! CLOSE CLINTON FRIEND Warned Against	In June of 2016, the disgraced sexual predator	left-news	Oct 18, 2017	Fake
2	Former RNC Chair Michael Steele Refuses To Vo	Donald Trump has dragged the Republican Party	News	October 21, 2016	Fake
3	Cambodia's main opposition party dissolved by	PHNOM PENH (Reuters) - Cambodia s highest cour	worldnews	November 16, 2017	True
4	CNN INTERVIEW TURNS INTO SCREAMING MATCH When	(From CNN) New video captured hours before Mic	politics	Mar 13, 2017	Fake

In [6]: #create a dummy column for target column data['label']=pd.get_dummies(data.Target)['Fake'] data.head()

Out[6]:

	title	text	subject	date	Target	label
0	What Ted Cruz Said In Church Sounds Like Shar	Presidential candidate Senator Ted Cruz (R- TX)	News	February 15, 2016	Fake	1
1	THEY KNEW! CLOSE CLINTON FRIEND Warned Against	In June of 2016, the disgraced sexual predator	left-news	Oct 18, 2017	Fake	1
2	Former RNC Chair Michael Steele Refuses To Vo	Donald Trump has dragged the Republican Party	News	October 21, 2016	Fake	1
3	Cambodia's main opposition party dissolved by	PHNOM PENH (Reuters) - Cambodia s highest cour	worldnews	November 16, 2017	True	0
4	CNN INTERVIEW TURNS INTO SCREAMING MATCH When	(From CNN) New video captured hours before Mic	politics	Mar 13, 2017	Fake	1

In [7]: def cleaning_data(row):

```
row=row.lower
row=re.sub('[^a-zA-Z]',' ', row)
token=row.split()
news=[ps.lemmatize(word) for word in token if not word in stopwords]
cleanned_news=' '.join(news)
return cleaned_news
```

Split the dataset into training and test data

```
In [8]: xtrain,xtest,ytrain,ytest=train_test_split(data['text'],data['label'],test_siz
 In [9]: xtrain
 Out[9]: 38388
                  DC Antifa Leader Moved to Turkey with Man She ...
         23136
                  Consortium News Exclusive: The mainstream medi...
                  Leave it to Obama to politicize our money some...
         24221
                  NEW YORK (Reuters) - A federal appeals court o...
         8837
         15902
                  LAHORE, Pakistan (Reuters) - A Christian man h...
         30403
                  COLOMBO (Reuters) - European lawmakers said on...
         21243
                  SEOUL (Reuters) - North Korea's leader Kim Jon...
         42613
                  Megyn Kelly may have departed Fox News for mor...
         43567
                  BERLIN (Reuters) - Largely unperturbed by Ange...
                  BARCELONA (Reuters) - Catalonia s regional par...
         2732
         Name: text, Length: 35918, dtype: object
In [10]: xtest
Out[10]: 35305
                  TOKYO (Reuters) - Japanese Prime Minister Shin...
                  (Reuters) - U.S. President Donald Trump named ...
         29180
                  PARIS (Reuters) - France is close to finalizin...
         29805
                  21st Century Wire says Our weekly documentary ...
         38237
         5099
                  MOSCOW (Reuters) - Politicians from North and ...
         37781
                  WASHINGTON (Reuters) - Several environmental g...
                   Snitches get stitches is Kremlin s message t...
         2275
         19324
                  If there s anyone who has clearly had enough o...
         1178
                  THE PURGE CONTINUES THE NYC MAYOR has just ope...
         34472
                  DANANG, Vietnam (Reuters) - Vietnam released w...
         Name: text, Length: 8980, dtype: object
In [11]: ytrain
Out[11]: 38388
                  1
         23136
                  1
         24221
                  1
         8837
                  0
         15902
                  0
         30403
                  0
         21243
                  0
                  1
         42613
         43567
                  0
         2732
         Name: label, Length: 35918, dtype: uint8
```

```
In [12]: ytest
Out[12]: 35305
                   0
         29180
                   0
         29805
                   0
         38237
                   1
         5099
                  . .
         37781
                   0
         2275
                   1
         19324
                   1
         1178
                   1
         34472
                   0
         Name: label, Length: 8980, dtype: uint8
```

Vectorization

Vectorization is a process in machine learning that converts text or other categorical data into numerical vectors.

TF-IDF stands for term frequency-inverse document frequency. It is a statistical measure that is used to quantify the importance of a word in a document. TF-IDF is calculated by multiplying the term frequency by the inverse document frequency.

```
In [13]: vectorizer = TfidfVectorizer(max_features=500, lowercase=False, ngram_range=(1
In [14]: vec_xtrain=vectorizer.fit_transform(xtrain).toarray()
         vec_xtest=vectorizer.fit_transform(xtest).toarray()
In [15]: |vec_xtrain
                           , 0.
Out[15]: array([[0.
                                       , 0.
                                                 , ..., 0.
                                                                 , 0.2970844 ,
                 0.
                           ],
                [0.
                           , 0.
                                       , 0.
                                                  , ..., 0.
                                                                   , 0.
                 0.
                           ],
                           , 0.06643891, 0.
                                                  , ..., 0.
                [0.
                                                                   , 0.04445308,
                 0.
                           ],
                . . . ,
                                      , 0.
                [0.
                                                                   , 0.16900815,
                           , 0.
                                                  , ..., 0.
                0.
                           ],
                           , 0.
                                       , 0.
                                                  , ..., 0.02577194, 0.
                [0.
                 0.
                           ],
                           , 0.20230865, 0.
                [0.
                                                  , ..., 0.
                                                                   , 0.
                 0.
                           11)
```

```
In [16]: vec_xtest
Out[16]: array([[0.
                              , 0.
                                           , 0.
                                                        , ..., 0.
                                                                          , 0.
                  0.
                              ],
                                                        , ..., 0.04813364, 0.
                  [0.
                              , 0.
                                           , 0.
                  0.
                              ],
                  [0.
                              , 0.09176602, 0.09438542, ..., 0.06845066, 0.
                  0.
                              ],
                  . . . ,
                              , 0.
                                           , 0.
                                                        , ..., 0.
                                                                          , 0.04259164,
                  [0.
                  0.06187009],
                              , 0.
                                                        , ..., 0.
                  [0.
                                           , 0.
                                                                          , 0.03242363,
                  0.
                              ],
                              , 0.
                  [0.
                                                       , ..., 0.
                                                                          , 0.
                                           , 0.
                              ]])
                  0.
```

Model:-MultinomialNB

```
In [17]: clf=MultinomialNB()
    clf.fit(vec_xtrain,ytrain)
    y_pred=clf.predict(vec_xtest)
```

Classification Report

```
In [18]: print(classification_report(ytest, y_pred))
```

```
precision
                            recall f1-score
                                                support
           0
                   0.91
                              0.83
                                        0.87
                                                   4328
           1
                   0.85
                              0.92
                                        0.89
                                                   4652
                                        0.88
                                                   8980
    accuracy
   macro avg
                   0.88
                              0.87
                                        0.88
                                                   8980
weighted avg
                   0.88
                              0.88
                                        0.88
                                                   8980
```

```
In [19]: y_pred_train= clf.predict(vec_xtrain)
print(classification_report(ytrain, y_pred_train))
```

support	f1-score	recall	precision	
17089 18829	0.94 0.94	0.95 0.93	0.92 0.95	0 1
35918 35918 35918	0.94 0.94 0.94	0.94 0.94	0.94 0.94	accuracy macro avg weighted avg

Accuracy score

```
In [20]: accuracy_score(ytrain,y_pred_train)
Out[20]: 0.9394175622250682
In [21]: accuracy_score(ytest,y_pred)
Out[21]: 0.8766146993318485
In [ ]:
```