

```
In [149... from sklearn.feature_extraction.text import CountVectorizer
```

```
In [150... import pandas as pd
```

```
In [151... from sklearn.feature_extraction.text import CountVectorizer
```

```
In [152... from sklearn.naive_bayes import BernoulliNB, MultinomialNB
```

```
In [153... df = pd.read_csv("sentiment_analysis.csv")
```

```
In [154... df.head()
```

```
Out[154...
               Sentence  Sentiment
0  The GeoSolutions technology will leverage Bene...    positive
1  $ESI on lows, down $1.50 to $2.50 BK a real po...   negative
2  For the last quarter of 2010 , Componenta 's n...    positive
3  According to the Finnish-Russian Chamber of Co...    neutral
4  The Swedish buyout firm has sold its remaining...    neutral
```

```
In [155... df.isna()
```

```
Out[155...
               Sentence  Sentiment
0          False      False
1          False      False
2          False      False
3          False      False
4          False      False
...           ...         ...
5837         False      False
5838         False      False
5839         False      False
5840         False      False
5841         False      False
```

5842 rows × 2 columns

```
In [156... df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 5842 entries, 0 to 5841
Data columns (total 2 columns):
 #   Column      Non-Null Count  Dtype
---  -
 0   Sentence    5842 non-null   object
 1   Sentiment   5842 non-null   object
dtypes: object(2)
memory usage: 91.4+ KB
```

```
In [157... vector1 = CountVectorizer(binary = True)
```

```
In [158... vector2 = CountVectorizer(binary = False)
```

```
In [159... text = df['Sentence']
label = df['Sentiment']
```

```
In [160... text
```

```
Out[160... 0      The GeoSolutions technology will leverage Bene...
1      $ESI on lows, down $1.50 to $2.50 BK a real po...
2      For the last quarter of 2010 , Componenta 's n...
3      According to the Finnish-Russian Chamber of Co...
4      The Swedish buyout firm has sold its remaining...
...
5837    RISING costs have forced packaging producer Hu...
5838    Nordic Walking was first used as a summer trai...
5839    According shipping company Viking Line , the E...
5840    In the building and home improvement trade , s...
5841    HELSINKI AFX - KCI Konecranes said it has won ...
Name: Sentence, Length: 5842, dtype: object
```

```
In [161... text.shape
```

```
Out[161... (5842,)
```

```
In [162... label
```

```
Out[162... 0      positive
1      negative
2      positive
3      neutral
4      neutral
...
5837    negative
5838    neutral
5839    neutral
5840    neutral
5841    positive
Name: Sentiment, Length: 5842, dtype: object
```

```
In [163... import nltk
from nltk.corpus import stopwords
```

```
In [164... # Download stop words list  
nltk.download('stopwords')  
nltk.download('punkt') # Download the tokenizer model  
stop_words = set(stopwords.words('english'))
```

```
[nltk_data] Downloading package stopwords to  
[nltk_data] C:\Users\PC-18\AppData\Roaming\nltk_data...  
[nltk_data] Package stopwords is already up-to-date!  
[nltk_data] Downloading package punkt to  
[nltk_data] C:\Users\PC-18\AppData\Roaming\nltk_data...  
[nltk_data] Package punkt is already up-to-date!
```

```
In [165... stop_words
```

```
Out[165... {'a',  
            'about',  
            'above',  
            'after',  
            'again',  
            'against',  
            'ain',  
            'all',  
            'am',  
            'an',  
            'and',  
            'any',  
            'are',  
            'aren',  
            "aren't",  
            'as',  
            'at',  
            'be',  
            'because',  
            'been',  
            'before',  
            'being',  
            'below',  
            'between',  
            'both',  
            'but',  
            'by',  
            'can',  
            'couldn',  
            "couldn't",  
            'd',  
            'did',  
            'didn',  
            "didn't",  
            'do',  
            'does',  
            'doesn',  
            "doesn't",  
            'doing',  
            'don',  
            "don't",  
            'down',  
            'during',  
            'each',  
            'few',  
            'for',  
            'from',  
            'further',  
            'had',  
            'hadn',  
            "hadn't",  
            'has',  
            'hasn',  
            "hasn't",  
            'have',  
            'haven',
```

"haven't",  
'having',  
'he',  
'her',  
'here',  
'hers',  
'herself',  
'him',  
'himself',  
'his',  
'how',  
'i',  
'if',  
'in',  
'into',  
'is',  
'isn',  
"isn't",  
'it',  
"it's",  
'its',  
'itself',  
'just',  
'll',  
'm',  
'ma',  
'me',  
'mightn',  
"mightn't",  
'more',  
'most',  
'mustn',  
"mustn't",  
'my',  
'myself',  
'needn',  
"needn't",  
'no',  
'nor',  
'not',  
'now',  
'o',  
'of',  
'off',  
'on',  
'once',  
'only',  
'or',  
'other',  
'our',  
'ours',  
'ourselves',  
'out',  
'over',  
'own',  
're',

's',  
'same',  
'shan',  
"shan't",  
'she',  
"she's",  
'should',  
"should've",  
'shouldn',  
"shouldn't",  
'so',  
'some',  
'such',  
't',  
'than',  
'that',  
"that'll",  
'the',  
'their',  
'theirs',  
'them',  
'themselves',  
'then',  
'there',  
'these',  
'they',  
'this',  
'those',  
'through',  
'to',  
'too',  
'under',  
'until',  
'up',  
've',  
'very',  
'was',  
'wasn',  
"wasn't",  
'we',  
'were',  
'weren',  
"weren't",  
'what',  
'when',  
'where',  
'which',  
'while',  
'who',  
'whom',  
'why',  
'will',  
'with',  
'won',  
"won't",  
'wouldn',

```
"wouldn't",
'y',
'you',
"you'd",
"you'll",
"you're",
"you've",
'your',
'yours',
'yourself',
'yourselves'}
```

```
In [166... def preprocess_text(Sentence):
    Sentence = Sentence.lower()
    tokens = nltk.word_tokenize(Sentence)
    filtered_tokens = [word for word in tokens if word not in stop_words]
    return ' '.join(filtered_tokens)
```

```
In [167... # Apply preprocessing to all texts
text = text.apply(preprocess_text)
```

```
In [168... text
```

```
Out[168... 0      geosolutions technology leverage benefon 's gp...
1      $ esi lows , $ 1.50 $ 2.50 bk real possibility
2      last quarter 2010 , componenta 's net sales do...
3      according finnish-russian chamber commerce , m...
4      swedish buyout firm sold remaining 22.4 percen...
...
5837    rising costs forced packaging producer huhtama...
5838    nordic walking first used summer training meth...
5839    according shipping company viking line , eu de...
5840    building home improvement trade , sales decrea...
5841    helsinki afx - kci konecranes said order four ...
Name: Sentence, Length: 5842, dtype: object
```

```
In [169... X1 = vector1.fit_transform(text)
```

```
In [170... X1
```

```
Out[170... <Compressed Sparse Row sparse matrix of dtype 'int64'
with 69381 stored elements and shape (5842, 11289)>
```

```
In [171... X1.shape
```

```
Out[171... (5842, 11289)
```

```
In [172... X2 = vector2.fit_transform(text)
```

```
In [173... X2.shape
```

```
Out[173... (5842, 11289)
```

```
In [174... y = label
```

```
In [175... y.shape
```

```
Out[175... (5842,)
```

```
In [176... from sklearn.model_selection import train_test_split
```

```
In [177... xtrain1,xtest1,ytrain,ytest = train_test_split(X1,y,test_size = 0.25,random_state =
```

```
In [178... xtrain2,xtest2,ytrain,ytest = train_test_split(X2,y,test_size = 0.25,random_state =
```

```
In [179... bnb = BernoulliNB()
```

```
In [180... mnb = MultinomialNB()
```

```
In [181... bnb.fit(xtrain1,ytrain)
```

```
Out[181... ▼ BernoulliNB ⓘ ?  
BernoulliNB()
```

```
In [182... mnb.fit(xtrain2,ytrain)
```

```
Out[182... ▼ MultinomialNB ⓘ ?  
MultinomialNB()
```

```
In [183... y_pred1 = bnb.predict(xtest1)
```

```
In [184... y_pred2 = mnb.predict(xtest2)
```

```
In [185... from sklearn.metrics import accuracy_score
```

```
In [186... accuracy_score(ytest,y_pred1)
```

```
Out[186... 0.6680355920602327
```

```
In [187... accuracy_score(ytest,y_pred2)
```

```
Out[187... 0.6598220396988365
```

```
In [188... from sklearn.feature_extraction.text import TfidfVectorizer
```

```
In [189... vector3 = TfidfVectorizer()  
vector3
```



Out[189...

▼ TfidfVectorizer ⓘ ?

TfidfVectorizer()

In [190...

```
X3 = vector3.fit_transform(text)
```

In [191...

```
xtrain,xtest,ytrain,ytest = train_test_split(X3,y,test_size = 0.25,random_state = 1
```

In [192...

```
model3=MultinomialNB()
```

In [193...

```
model3.fit(xtrain,ytrain)
```

Out[193...

▼ MultinomialNB ⓘ ?

MultinomialNB()

In [194...

```
ypred = model3.predict(xtest)
```

In [195...

```
from sklearn.metrics import accuracy_score
```

In [196...

```
accuracy_score(ytest,ypred)
```

Out[196...

0.6584531143052703

The highest accuracy score is 0.66803 as compare to other vectorizer technique using BernoulliNB() with CountVectorizer after removing the default stop\_words from the model.

In [ ]: