

## K- Nearest Neighbors on Amazon Food Reviews

```
In [1]: %matplotlib inline
import warnings
warnings.filterwarnings("ignore")

# General Packages
import os
import sqlite3
import pandas as pd
import numpy as np
import string
import re
import nltk
import datetime
import time

# Plotting Packages
import matplotlib.pyplot as plt
import seaborn as sns

# Packages for Tfidf
from sklearn.feature_extraction.text import TfidfTransformer
from sklearn.feature_extraction.text import TfidfVectorizer

# Packages for BOW (Bag of words)
from sklearn.feature_extraction.text import CountVectorizer
from sklearn.metrics import confusion_matrix
from sklearn import metrics
from sklearn.metrics import roc_curve, auc

# Packages for Text Preprocessing
from nltk.stem.porter import PorterStemmer
from nltk.corpus import stopwords
from nltk.stem.wordnet import WordNetLemmatizer

#Packages for Word2vec, Average Word2vec & Tf-Idf Weighted Word2Vec
from gensim.models import Word2Vec
from gensim.models import KeyedVectors
import pickle

#Packages for plotting Tsne plot
from sklearn.manifold import TSNE

from sklearn.cross_validation import train_test_split
from sklearn.neighbors import KNeighborsClassifier
from sklearn.metrics import accuracy_score
from sklearn.cross_validation import cross_val_score
from collections import Counter
from sklearn.metrics import accuracy_score
from sklearn import cross_validation
from sklearn.model_selection import TimeSeriesSplit
```

/usr/lib/python3/dist-packages/sklearn/cross\_validation.py:44: DeprecationWarning: This module was deprecated in version 0.18 in favor of the model\_selection module into which all the refactored classes and functions are moved. Also note that the interface of the new CV iterators are different from that of this module. This module will be removed in 0.20.  
"This module will be removed in 0.20.", DeprecationWarning)

### Preprocessing Stage: Cleansed Stop Words, Punctuations & Html tags

```
In [2]: #Connecting the Sqlite file after the Preprocessing Stage
#os.chdir('/Users/sujis/Downloads/AI')
con2 = sqlite3.connect('final.sqlite')
final= pd.read_sql_query(""" SELECT * FROM Reviews """, con2)
```

```
In [3]: final.head(1)
```

Out[3]:

	index	Id	ProductId	UserId	ProfileName	HelpfulnessNumerator	HelpfulnessDenominator	Score	Time	Summary
0	138706	150524	0006641040	ACITT7DI6IDDL	shari zychinski	0	0	positive	939340800	EVERY book is n educational

```
In [4]: # Due to memory constraints taking 2.5k positive & 2.5k negative reviews
final_dataset=pd.DataFrame()
positive_dataset=final.loc[final['Score'] == 'positive'].head(2500)
Negative_dataset=final.loc[final['Score'] == 'negative'].head(2500)
final_dataset=pd.concat([positive_dataset,Negative_dataset])
l1 = positive_dataset['Score']
l2 = Negative_dataset['Score']
label=pd.concat([l1,l2])
```

```
In [5]: # Converting the Epoch Date format to normal date format
Time_P=[]
Time_N=[]
for each in positive_dataset['Time']:
    Time_P.append(time.strftime('%Y-%m-%d', time.localtime(each)))
for each in Negative_dataset['Time']:
    Time_N.append(time.strftime('%Y-%m-%d', time.localtime(each)))
Time=Time_P+Time_N
```

```
In [6]: #Bow
count_vect = CountVectorizer() #in scikit-learn
final_counts = count_vect.fit_transform(final_dataset['CleanedText'].values)
print("the type of count vectorizer ",type(final_counts))
print("the shape of out text BOW vectorizer ",final_counts.get_shape())
print("the number of unique words ", final_counts.get_shape()[1])
```

```
the type of count vectorizer <class 'scipy.sparse.csr.csr_matrix'>
the shape of out text BOW vectorizer (5000, 10430)
the number of unique words 10430
```

```
In [8]: # Converting Sparse matrix to array
final_counts=final_counts.toarray()
```

```
In [9]: #tsne
start_time_code = time.time()
model = TSNE(n_components=2, random_state=0, perplexity=30)
tsne_data = model.fit_transform(final_counts)
end_time_code = time.time()
print ("Running Time for code execution " + str(end_time_code - start_time_code) + " secs")

Running Time for code execution 592.2491195201874 secs
```

```
In [10]: tsne_bow_data = np.vstack((tsne_data.T,label,Time)).T
```

```
In [11]: tsne_bow_data.shape
```

```
Out[11]: (5000, 4)
```

```
In [41]: #Saving tsne data into seperate file for further usecases.
tsne_bow_df = pd.DataFrame(data=tsne_bow_data, columns=("X", "Y", "Label", "Date"))
tsne_bow_df.to_csv('/home/venkatasujit272/tsne_bow_data.csv')
```

```
In [38]: # Aliasing the Score field values into Binary format
def partition(x):
    if x == 'negative':
        return 0.
    return 1.

# Aliasing the Score to String Format (Positive for Score > 3 & Negative for Score < 3)

actualScore = tsne_bow_df['Label']
positiveNegative = actualScore.map(partition)
tsne_bow_df['Label'] = positiveNegative
```

```
In [14]: tsne_bow_df.head(1)
```

```
Out[14]:
```

	X	Y	Label	Date
0	3.95061	-6.3007	1.0	1999-10-08

```
In [15]: #Sorting the Dataframe with Date to apply Timebased Split  
tsne_bow_df.sort_values(by='Date',ascending=1)
```

Out[15]:

	X	Y	Label	Date
0	3.95061	-6.3007	1.0	1999-10-08
28	10.3196	0.287563	1.0	1999-10-25
377	6.70138	3.92468	1.0	1999-12-02
287	11.2809	0.770661	1.0	1999-12-06
376	6.7136	4.17597	1.0	2000-01-03
209	6.6723	3.98859	1.0	2000-01-09
2540	6.65033	3.90467	0.0	2000-01-19
198	5.98368	2.05558	1.0	2000-01-24
224	-6.36712	3.0824	1.0	2000-02-26
284	3.31828	3.42525	1.0	2000-06-03
378	3.31857	3.42551	1.0	2000-06-03
205	7.54684	2.14946	1.0	2000-06-23
206	7.4365	1.14201	1.0	2000-06-29
415	3.7623	1.40381	1.0	2000-07-31
684	8.15351	2.93929	1.0	2000-08-09
714	8.09218	2.87029	1.0	2000-08-09
212	8.90946	3.81539	1.0	2000-08-15
258	7.47962	4.37065	1.0	2000-10-03
691	5.38752	-6.31318	1.0	2000-12-05
315	-0.326053	-1.9004	1.0	2000-12-19
286	6.76072	4.30598	1.0	2000-12-30
692	8.29616	2.9847	1.0	2001-02-22
2547	11.1145	-1.07556	0.0	2001-06-11
2543	6.82782	4.33278	0.0	2001-08-08
233	5.08881	-0.01522	1.0	2001-09-24
701	8.19487	2.50405	1.0	2001-10-23
309	7.88662	-1.73058	1.0	2001-10-26
30	11.6625	0.0439728	1.0	2001-12-26
830	5.69966	-3.07542	1.0	2002-01-06
288	6.6525	4.14869	1.0	2002-02-04
...	...	...	...	...
232	9.56216	3.22136	1.0	2012-10-22
3856	7.94275	0.942424	0.0	2012-10-23
1792	-0.344878	2.78245	1.0	2012-10-23
813	3.68547	0.383336	1.0	2012-10-23
3649	4.61891	-2.95272	0.0	2012-10-23
2030	4.28381	4.84058	1.0	2012-10-23
1897	11.5943	-1.59847	1.0	2012-10-23
1086	7.93208	-0.563009	1.0	2012-10-23
3056	11.634	-2.49857	0.0	2012-10-23
1594	-0.34193	1.33567	1.0	2012-10-23
4556	7.18706	0.136966	0.0	2012-10-23
134	-0.500191	2.4304	1.0	2012-10-23
2717	2.57152	1.79645	0.0	2012-10-24
2705	6.26789	0.674835	0.0	2012-10-24
1295	7.01916	1.18204	1.0	2012-10-24
2391	8.2813	3.01715	1.0	2012-10-24
1603	1.27944	-5.16483	1.0	2012-10-25
3849	7.57325	-0.891235	0.0	2012-10-25
2715	3.31716	0.335818	0.0	2012-10-25
4115	7.10874	-5.62311	0.0	2012-10-25
1827	-1.43616	0.38397	1.0	2012-10-25
2978	5.04737	-1.58026	0.0	2012-10-26

	X	Y	Label	Date
135	2.42842	-1.21995	1.0	2012-10-26
782	7.05385	-1.49977	1.0	2012-10-26
136	-0.0579819	1.21796	1.0	2012-10-26
3569	4.14018	-0.925766	0.0	2012-10-26
1349	0.94107	-4.24592	1.0	2012-10-26
493	4.54338	1.3034	1.0	2012-10-26
4793	2.80861	-6.49147	0.0	2012-10-26
2592	11.4845	-4.11881	0.0	2012-10-26

5000 rows × 4 columns

```
In [16]: # create design matrix X and target vector y
X = np.array(tsne_bow_df.iloc[:, 0:4]) # end index is exclusive
Y = np.array(tsne_bow_df['Label']) # showing you two ways of indexing a pandas df
```

```
In [17]: #Time based split
tscv = TimeSeriesSplit(n_splits=5)
print(tscv)
```

```
TimeSeriesSplit(n_splits=5)
```

```
In [18]: #Splitting the Dataset into Train set & Test set
for train_index, test_index in tscv.split(X):
    print("TRAIN:", train_index, "TEST:", test_index)
    X_tr, X_test = X[train_index], X[test_index]
    Y_tr, Y_test = Y[train_index], Y[test_index]
```

8

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4979 4980 4981 4982 4983 4984 4985 4986 4987 4988 4989 4990 4991 4992
4993 4994 4995 4996 4997 4998 4999]
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In [19]: #Checking the Structures of the datasets
print(X_tr.shape)
print(X_test.shape)
print(Y_tr.shape)
print(Y_test.shape)

(4167, 4)
(833, 4)
(4167,)
(833,)
```

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In [20]: # Splitting the Train dataset into Cross Validation & Train Datasets
for train_index, test_index in tscv.split(X_tr):
    print("TRAIN:", train_index, "TEST:", test_index)
    X_train, X_cv = X[train_index], X[test_index]
    Y_train, Y_cv = Y[train_index], Y[test_index]
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1369 1370 1371 1372 1373 1374 1375 1376 1377 1378 1379 1380 1381 1382
1383 1384 1385 1386 1387 1388 1389 1390]
TRAIN: [ 0 1 2 ... 1388 1389 1390] TEST: [1391 1392 1393 1394 1395 1396 1397 1398 1399 1400 1401
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1419 1420 1421 1422 1423 1424 1425 1426 1427 1428 1429 1430 1431 1432
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1965 1966 1967 1968 1969 1970 1971 1972 1973 1974 1975 1976 1977 1978
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2063 2064 2065 2066 2067 2068 2069 2070 2071 2072 2073 2074 2075 2076
2077 2078 2079 2080 2081 2082 2083 2084]
TRAIN: [ 0 1 2 ... 2082 2083 2084] TEST: [2085 2086 2087 2088 2089 2090 2091 2092 2093 2094 2095
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```

```

In [21]: print(X_train.shape)
         print(X_cv.shape)
         print(X_test.shape)

         print(Y_train.shape)
         print(Y_cv.shape)
         print(Y_test.shape)

```

```

(3473, 4)
(694, 4)
(833, 4)
(3473,)
(694,)
(833,)

```

```

In [22]: # Removing the Date variable from the Data sets
new_X= []
for each in X_train:
    new_X.append(np.delete(each,3))
X_train = np.asarray(new_X)

```

```

new_X_cv= []
for each in X_cv:
    new_X_cv.append(np.delete(each,3))
X_cv = np.asarray(new_X_cv)

```

```

new_X_test= []
for each in X_test:
    new_X_test.append(np.delete(each,3))
X_test = np.asarray(new_X_test)

```

```

In [23]: print(X_train.shape)
         print(X_cv.shape)
         print(X_test.shape)

         print(Y_train.shape)
         print(Y_cv.shape)
         print(Y_test.shape)

```

```

(3473, 3)
(694, 3)
(833, 3)
(3473,)
(694,)
(833,)

```



```
In [24]: # Finding the Test accuracy using Cross Validation Data Set
for i in range(1,30,2):
    # instantiate learning model (k = 30)
    knn = KNeighborsClassifier(n_neighbors=i)

    # fitting the model on crossvalidation train
    knn.fit(X_train, Y_train)

    # predict the response on the crossvalidation train
    pred = knn.predict(X_cv)

    # evaluate CV accuracy
    acc = accuracy_score(Y_cv, pred, normalize=True) * float(100)
    print('\nCV accuracy for k = %d is %d%%' % (i, acc))

knn = KNeighborsClassifier(1)
knn.fit(X_train,Y_train)
pred = knn.predict(X_test)
acc = accuracy_score(Y_test, pred, normalize=True) * float(100)
print('\n****Test accuracy for k = 1 is %d%%' % (acc))
```

```
CV accuracy for k = 1 is 98%

CV accuracy for k = 3 is 98%

CV accuracy for k = 5 is 97%

CV accuracy for k = 7 is 96%

CV accuracy for k = 9 is 96%

CV accuracy for k = 11 is 96%

CV accuracy for k = 13 is 96%

CV accuracy for k = 15 is 95%

CV accuracy for k = 17 is 95%

CV accuracy for k = 19 is 94%

CV accuracy for k = 21 is 94%

CV accuracy for k = 23 is 93%

CV accuracy for k = 25 is 92%

CV accuracy for k = 27 is 89%

CV accuracy for k = 29 is 88%

****Test accuracy for k = 1 is 99%
```

```
In [25]: # creating odd list of K for KNN
myList = list(range(0,50))
neighbors = list(filter(lambda x: x % 2 != 0, myList))

# empty list that will hold cv scores
cv_scores = []
```

```
In [27]: for k in neighbors:
    knn = KNeighborsClassifier(n_neighbors=k)
    scores = cross_val_score(knn, X_train, Y_train, cv=10)
    cv_scores.append(scores.mean())
```

```
In [28]: # changing to misclassification error
MSE = [1 - x for x in cv_scores]

# determining best k
optimal_k = neighbors[MSE.index(min(MSE))]
print('\nThe optimal number of neighbors is %d.' % optimal_k)

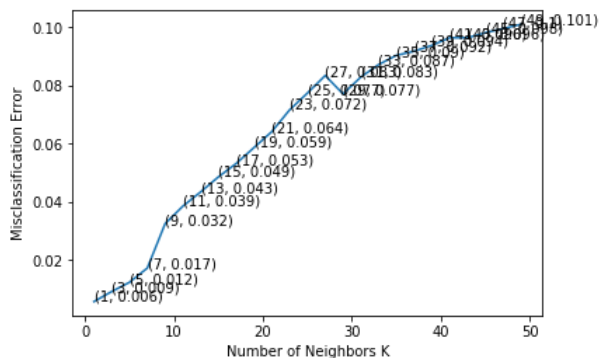
# plot misclassification error vs k
plt.plot(neighbors, MSE)

for xy in zip(neighbors, np.round(MSE,3)):
    plt.annotate('%s, %s' % xy, xy=xy, textcoords='data')

plt.xlabel('Number of Neighbors K')
plt.ylabel('Misclassification Error')
plt.show()

print("the misclassification error for each k value is : ", np.round(MSE,3))
```

The optimal number of neighbors is 1.



the misclassification error for each k value is : [0.006 0.009 0.012 0.017 0.032 0.039 0.043 0.049 0.053 0.059 0.064 0.072 0.077 0.083 0.077 0.083 0.087 0.09 0.092 0.094 0.096 0.096 0.098 0.1 0.101]

```
In [29]: # KNN with k = optimal_k

# instantiate learning model k = optimal_k
knn_optimal = KNeighborsClassifier(n_neighbors=optimal_k)

# fitting the model
knn_optimal.fit(X_train, Y_train)

# predict the response
pred = knn_optimal.predict(X_test)

# evaluate accuracy
acc = accuracy_score(Y_test, pred) * 100
print('\nThe accuracy of the knn classifier for k = %d is %f%%' % (optimal_k, acc))
```

The accuracy of the knn classifier for k = 1 is 99.639856%

## Term Frequency– Inverse Document Frequency ( TF-IDF )

```
In [165]: # Configuring ngram range from unigram to bigram
tf_idf_vect = TfidfVectorizer(ngram_range=(1,2))
final_tf_idf = tf_idf_vect.fit_transform(final_dataset['CleanedText'].values)
print("the type of count vectorizer ", type(final_tf_idf))
print("the shape of out text TFIDF vectorizer ", final_tf_idf.get_shape())
print("the number of unique words including both unigrams and bigrams ", final_tf_idf.get_shape()[1])
```

the type of count vectorizer <class 'scipy.sparse.csr.csr\_matrix'>  
the shape of out text TFIDF vectorizer (5000, 151352)  
the number of unique words including both unigrams and bigrams 151352

```
In [166]: # Converting Sparse matrix to array
final_tf_idf=final_tf_idf.toarray()
#tsne
start_time_code = time.time()
model = TSNE(n_components=2, random_state=0, perplexity=30)
tsne_data_tfidf = model.fit_transform(final_tf_idf)
end_time_code = time.time()
print ("Running Time for code execution " + str(end_time_code - start_time_code) + " secs")
```

Running Time for code execution 6420.043386220932 secs

```
In [167]: tsne_data_tf = np.vstack((tsne_data_tfidf.T,label,Time)).T
```

```
In [168]: #Saving tsne data into seperate file for further usecases.
tsne_tfidf_df = pd.DataFrame(data=tsne_data_tf, columns=("X", "Y", "Label", "Date"))
tsne_tfidf_df.to_csv('/home/venkatasujit272/tsne_tfidf_data.csv')
```

```
In [169]: # Aliasing the Score field values into Binary format
def partition(x):
    if x == 'negative':
        return 0.
    return 1.

# Aliasing the Score to String Format (Positive for Score > 3 & Negative for Score < 3)

actualScore = tsne_tfidf_df['Label']
positiveNegative = actualScore.map(partition)
tsne_tfidf_df['Label'] = positiveNegative
```

```
In [170]: tsne_tfidf_df.head(1)
```

Out[170]:

	X	Y	Label	Date
0	0.633459	-8.7365	1.0	1999-10-08

```
In [171]: #Sorting the Dataframe with Date  
tsne_tfidf_df.sort_values(by='Date',ascending=1)
```

Out[171]:

	X	Y	Label	Date
0	0.633459	-8.7365	1.0	1999-10-08
28	0.621319	-8.71731	1.0	1999-10-25
377	-1.79879	-10.9841	1.0	1999-12-02
287	-2.03936	-12.3553	1.0	1999-12-06
376	-1.86981	-11.1863	1.0	2000-01-03
209	-2.02703	-10.426	1.0	2000-01-09
2540	-1.19717	-10.54	0.0	2000-01-19
198	4.47318	-11.9677	1.0	2000-01-24
224	-2.31892	-12.8517	1.0	2000-02-26
284	0.119211	-10.6952	1.0	2000-06-03
378	0.132651	-10.7101	1.0	2000-06-03
205	0.971696	-7.40803	1.0	2000-06-23
206	1.12162	-7.44633	1.0	2000-06-29
415	10.4458	-7.40248	1.0	2000-07-31
684	0.929265	7.57625	1.0	2000-08-09
714	0.807889	7.65295	1.0	2000-08-09
212	-1.44218	-12.0895	1.0	2000-08-15
258	-1.72246	-12.3186	1.0	2000-10-03
691	0.6374	7.7362	1.0	2000-12-05
315	-2.57085	-11.4867	1.0	2000-12-19
286	-1.88425	-11.6942	1.0	2000-12-30
692	1.51776	7.20513	1.0	2001-02-22
2547	-2.17737	-11.5179	0.0	2001-06-11
2543	-1.21317	-11.2717	0.0	2001-08-08
233	-8.75209	-9.4265	1.0	2001-09-24
701	1.25664	7.48027	1.0	2001-10-23
309	-2.23182	-12.4742	1.0	2001-10-26
30	0.618278	-8.68635	1.0	2001-12-26
830	3.22437	10.3938	1.0	2002-01-06
288	-1.77231	-12.3715	1.0	2002-02-04
...	...	...	...	...
232	-2.24862	-10.3694	1.0	2012-10-22
3856	-1.18319	-2.79451	0.0	2012-10-23
1792	-7.34889	5.06849	1.0	2012-10-23
813	-8.16596	1.03918	1.0	2012-10-23
3649	3.53231	0.34179	0.0	2012-10-23
2030	5.86201	9.161	1.0	2012-10-23
1897	0.997734	4.99462	1.0	2012-10-23
1086	-2.20842	8.7914	1.0	2012-10-23
3056	3.91186	-4.51015	0.0	2012-10-23
1594	-5.56258	6.03292	1.0	2012-10-23
4556	5.0185	1.64046	0.0	2012-10-23
134	-5.32573	7.34865	1.0	2012-10-23
2717	-2.51862	8.37566	0.0	2012-10-24
2705	-3.72909	-1.20997	0.0	2012-10-24
1295	-4.48909	-1.0134	1.0	2012-10-24
2391	1.28051	7.21648	1.0	2012-10-24
1603	-12.9058	0.683586	1.0	2012-10-25
3849	-1.05837	2.06191	0.0	2012-10-25
2715	-6.49729	1.41066	0.0	2012-10-25
4115	1.82492	-7.29996	0.0	2012-10-25
1827	-6.37683	2.24747	1.0	2012-10-25
2978	12.1615	3.03545	0.0	2012-10-26

	X	Y	Label	Date
135	6.06442	-10.2238	1.0	2012-10-26
782	-5.81879	1.55783	1.0	2012-10-26
136	-6.23531	7.0223	1.0	2012-10-26
3569	12.9654	1.75552	0.0	2012-10-26
1349	-12.5389	0.879432	1.0	2012-10-26
493	11.2503	-9.80318	1.0	2012-10-26
4793	-2.08286	9.36516	0.0	2012-10-26
2592	10.135	-8.41314	0.0	2012-10-26

5000 rows × 4 columns

```
In [172]: # create design matrix X and target vector y
X_tfidf = np.array(tsne_tfidf_df.iloc[:, 0:4]) # end index is exclusive
Y_tfidf = np.array(tsne_tfidf_df['Label']) # showing you two ways of indexing a pandas df
```

```
In [173]: # Timebasedf Split
tscv = TimeSeriesSplit(n_splits=5)
print(tscv)
```

```
TimeSeriesSplit(n_splits=5)
```

```
In [174]: # Splitting the Dataset into Train & Test Datasets
for train_index, test_index in tscv.split(X_tfidf):
    print("TRAIN:", train_index, "TEST:", test_index)
    X_tfidf_tr, X_tfidf_test = X[train_index], X[test_index]
    Y_tfidf_tr, Y_tfidf_test = Y[train_index], Y[test_index]
```

8



```
1395 1396 1397 1398 1399 1400 1401 1402 1403 1404 1405 1406 1407 1408
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4979 4980 4981 4982 4983 4984 4985 4986 4987 4988 4989 4990 4991 4992
4993 4994 4995 4996 4997 4998 4999]
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In [175]: print(X_tfidf_tr.shape)
          print(X_tfidf_test.shape)
          print(Y_tfidf_tr.shape)
          print(X_tfidf_test.shape)
```

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(4167, 4)
(833, 4)
(4167,)
(833, 4)
```

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In [176]: # Splitting the Train dataset into Train & Cross Validation Dataset
for train_index, test_index in tscv.split(X_tfidf_tr):
    print("TRAIN:", train_index, "TEST:", test_index)
    X_tfidf_train, X_tfidf_cv = X[train_index], X[test_index]
    Y_tfidf_train, Y_tfidf_cv = Y[train_index], Y[test_index]
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1369 1370 1371 1372 1373 1374 1375 1376 1377 1378 1379 1380 1381 1382
1383 1384 1385 1386 1387 1388 1389 1390]
TRAIN: [ 0 1 2 ... 1388 1389 1390] TEST: [1391 1392 1393 1394 1395 1396 1397 1398 1399 1400 1401
1402 1403 1404
1405 1406 1407 1408 1409 1410 1411 1412 1413 1414 1415 1416 1417 1418
1419 1420 1421 1422 1423 1424 1425 1426 1427 1428 1429 1430 1431 1432
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TRAIN: [ 0 1 2 ... 3470 3471 3472] TEST: [3473 3474 3475 3476 3477 3478 3479 3480 3481 3482 3483
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```

```

In [177]: print(X_tfidf_train.shape)
          print(X_tfidf_cv.shape)
          print(X_tfidf_test.shape)

          print(Y_tfidf_train.shape)
          print(Y_tfidf_cv.shape)
          print(Y_tfidf_test.shape)

```

```

(3473, 4)
(694, 4)
(833, 4)
(3473,)
(694,)
(833,)

```

```

In [178]: # Removing Date variable from all the datasets
          tfidf_X= []
          for each in X_tfidf_train:
              tfidf_X.append(np.delete(each,3))
          X_tfidf_train = np.asarray(tfidf_X)

          tfidf_X_cv= []
          for each in X_tfidf_cv:
              tfidf_X_cv.append(np.delete(each,3))
          X_tfidf_cv = np.asarray(tfidf_X_cv)

          tfidf_X_test= []
          for each in X_tfidf_test:
              tfidf_X_test.append(np.delete(each,3))
          X_tfidf_test = np.asarray(tfidf_X_test)

```

```

In [179]: print(X_tfidf_train.shape)
          print(X_tfidf_cv.shape)
          print(X_tfidf_test.shape)

          print(Y_tfidf_train.shape)
          print(Y_tfidf_cv.shape)
          print(Y_tfidf_test.shape)

```

```

(3473, 3)
(694, 3)
(833, 3)
(3473,)
(694,)
(833,)

```

```
In [180]: # Finding the Test accuracy using Cross Validation Data Set
for i in range(1,30,2):
    # instantiate learning model (k = 30)
    knn = KNeighborsClassifier(n_neighbors=i)

    # fitting the model on crossvalidation train
    knn.fit(X_tfidf_train, Y_tfidf_train)

    # predict the response on the crossvalidation train
    pred = knn.predict(X_tfidf_cv)

    # evaluate CV accuracy
    acc = accuracy_score(Y_tfidf_cv, pred, normalize=True) * float(100)
    print('\nCV accuracy for k = %d is %d%%' % (i, acc))

knn = KNeighborsClassifier(1)
knn.fit(X_tfidf_train, Y_tfidf_train)
pred = knn.predict(X_tfidf_test)
acc = accuracy_score(Y_tfidf_test, pred, normalize=True) * float(100)
print('\n****Test accuracy for k = 1 is %d%%' % (acc))
```

```
CV accuracy for k = 1 is 98%

CV accuracy for k = 3 is 98%

CV accuracy for k = 5 is 97%

CV accuracy for k = 7 is 96%

CV accuracy for k = 9 is 96%

CV accuracy for k = 11 is 96%

CV accuracy for k = 13 is 96%

CV accuracy for k = 15 is 95%

CV accuracy for k = 17 is 95%

CV accuracy for k = 19 is 94%

CV accuracy for k = 21 is 94%

CV accuracy for k = 23 is 93%

CV accuracy for k = 25 is 92%

CV accuracy for k = 27 is 89%

CV accuracy for k = 29 is 88%

****Test accuracy for k = 1 is 99%
```

```
In [181]: # creating odd list of K for KNN
myList = list(range(0,50))
neighbors = list(filter(lambda x: x % 2 != 0, myList))

# empty list that will hold cv scores
cv_scores = []
```

```
In [182]: for k in neighbors:
    knn = KNeighborsClassifier(n_neighbors=k)
    scores = cross_val_score(knn, X_tfidf_train, Y_tfidf_train, cv=10)
    cv_scores.append(scores.mean())
```

```
In [183]: # changing to misclassification error
MSE = [1 - x for x in cv_scores]

# determining best k
optimal_k = neighbors[MSE.index(min(MSE))]
print('\nThe optimal number of neighbors is %d.' % optimal_k)

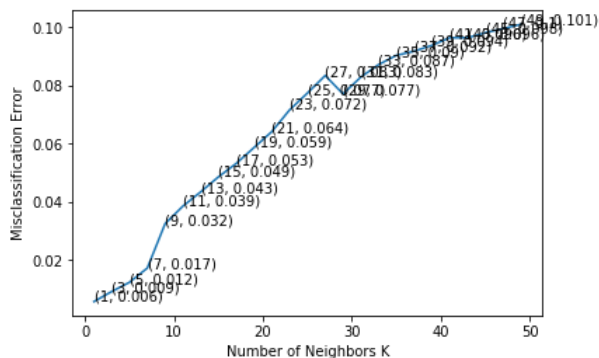
# plot misclassification error vs k
plt.plot(neighbors, MSE)

for xy in zip(neighbors, np.round(MSE,3)):
    plt.annotate('%s, %s' % xy, xy=xy, textcoords='data')

plt.xlabel('Number of Neighbors K')
plt.ylabel('Misclassification Error')
plt.show()

print("the misclassification error for each k value is : ", np.round(MSE,3))
```

The optimal number of neighbors is 1.



the misclassification error for each k value is : [0.006 0.009 0.012 0.017 0.032 0.039 0.043 0.049 0.053 0.059 0.064 0.072 0.077 0.083 0.077 0.083 0.087 0.09 0.092 0.094 0.096 0.096 0.098 0.1 0.101]

```
In [184]: # KNN with k = optimal_k

# instantiate learning model k = optimal_k
knn_optimal = KNeighborsClassifier(n_neighbors=optimal_k)

# fitting the model
knn_optimal.fit(X_tfidf_train, Y_tfidf_train)

# predict the response
pred = knn_optimal.predict(X_tfidf_test)

# evaluate accuracy
acc = accuracy_score(Y_tfidf_test, pred) * 100
print('\nThe accuracy of the knn classifier for k = %d is %f%%' % (optimal_k, acc))
```

The accuracy of the knn classifier for k = 1 is 99.639856%

## Average Word2Vec ( Avg W2V )

```
In [ ]: # Word2Vec
#model = KeyedVectors.load_word2vec_format('GoogleNews-vectors-negative300.bin', binary=True)
```

```
In [76]: # Train your own Word2Vec model using your own text corpus
i=0
list_of_sent=[]
for sent in final_dataset['CleanedText'].values:
    list_of_sent.append(sent.split())
```

```
In [77]: # min_count = 5 considers only words that occurred atleast 5 times
w2v_model=Word2Vec(list_of_sent,min_count=5,size=50,workers=4)
```

```
In [78]: # Printing Sample words
w2v_words = list(w2v_model.wv.vocab)
print("number of words that occurred minimum 5 times ", len(w2v_words))
print("sample words ", w2v_words[0:50])
```

```
number of words that occurred minimum 5 times 3596
sample words ['stare', 'thrip', 'made', 'teenag', 'mislead', 'support', 'televis', 'disc', 'decreas', 'p
eko', 'pound', 'preserv', 'die', 'canola', 'wash', 'difficulti', 'explain', 'relax', 'agar', 'guest', 'pe
rsian', 'primarili', 'king', 'second', 'indoor', 'beast', 'certifi', 'hundr', 'grab', 'overweight', 'imme
di', 'come', 'puke', 'here', 'desper', 'pic', 'prudhomm', 'ignor', 'angl', 'aint', 'certain', 'mental',
'reject', 'drop', 'scream', 'work', 'grow', 'evil', 'sort', 'labrador']
```

```
In [79]: # average Word2Vec
# compute average word2vec for each review.
sent_vectors = []; # the avg-w2v for each sentence/review is stored in this list
for sent in list_of_sent: # for each review/sentence
    sent_vec = np.zeros(50) # as word vectors are of zero length
    cnt_words = 0; # num of words with a valid vector in the sentence/review
    for word in sent: # for each word in a review/sentence
        if word in w2v_words:
            vec = w2v_model.wv[word]
            sent_vec += vec
            cnt_words += 1
    if cnt_words != 0:
        sent_vec /= cnt_words
    sent_vectors.append(sent_vec)
print(len(sent_vectors))
```

```
5000
```

```
In [80]: #tsne
start_time_code = time.time()
model = TSNE(n_components=2, random_state=0, perplexity=30)
tsne_data_Aw2v = model.fit_transform(sent_vectors)
end_time_code = time.time()
print ("Running Time for code execution " + str(end_time_code - start_time_code) + " secs")
```

```
Running Time for code execution 119.21003150939941 secs
```

```
In [81]: #Saving tsne data into seperate file for further usecases.
tsne_data_Aw2v = np.vstack((tsne_data_Aw2v.T, label, Time)).T
tsne_AW2V_df = pd.DataFrame(data=tsne_data_Aw2v, columns=("X", "Y", "Label", "Date"))
tsne_AW2V_df.to_csv('/home/venkatasujit272/tsne_AW2V_data.csv')
```

```
In [106]: # Aliasing the Score field values into Binary format
def partition(x):
    if x == 'negative':
        return 0.
    return 1.

# Aliasing the Score to String Format (Positive for Score > 3 & Negative for Score < 3)

actualScore = tsne_AW2V_df['Label']
positiveNegative = actualScore.map(partition)
tsne_AW2V_df['Label'] = positiveNegative
```

```
In [107]: tsne_AW2V_df.head(1)
```

```
Out[107]:
```

	X	Y	Label	Date
0	-9.86456	-6.63527	1.0	1999-10-08

```
In [108]: #Sorting the Dataframe with Date to apply Timebased Split  
tsne_AW2V_df.sort_values(by='Date',ascending=1)
```

Out[108]:

	X	Y	Label	Date
0	-9.86456	-6.63527	1.0	1999-10-08
28	-7.92173	-3.97298	1.0	1999-10-25
377	4.77067	-6.03357	1.0	1999-12-02
287	-10.1318	-6.53944	1.0	1999-12-06
376	10.7702	1.09368	1.0	2000-01-03
209	9.03657	-2.81984	1.0	2000-01-09
2540	6.11455	-6.58935	0.0	2000-01-19
198	7.51311	-9.64076	1.0	2000-01-24
224	-5.14856	-7.64139	1.0	2000-02-26
284	6.9695	0.245181	1.0	2000-06-03
378	7.04625	-0.410789	1.0	2000-06-03
205	-8.24021	-5.58602	1.0	2000-06-23
206	-9.00248	-5.94668	1.0	2000-06-29
415	8.8098	-8.75489	1.0	2000-07-31
684	8.90907	1.63241	1.0	2000-08-09
714	2.10214	6.8294	1.0	2000-08-09
212	8.88045	3.6079	1.0	2000-08-15
258	-10.0803	-6.65756	1.0	2000-10-03
691	5.75153	-7.13541	1.0	2000-12-05
315	10.6806	0.89765	1.0	2000-12-19
286	-8.364	-7.1144	1.0	2000-12-30
692	7.9073	4.42538	1.0	2001-02-22
2547	-9.44292	-5.99435	0.0	2001-06-11
2543	5.01425	-6.71079	0.0	2001-08-08
233	5.92343	-4.89261	1.0	2001-09-24
701	4.56288	5.71232	1.0	2001-10-23
309	5.0271	-6.83168	1.0	2001-10-26
30	0.247379	-6.5743	1.0	2001-12-26
830	-4.98638	-4.9586	1.0	2002-01-06
288	-9.87982	-6.59116	1.0	2002-02-04
...	...	...	...	...
232	4.12953	-6.38718	1.0	2012-10-22
3856	0.243018	-11.1007	0.0	2012-10-23
1792	-4.08604	-1.76852	1.0	2012-10-23
813	-7.30072	8.9931	1.0	2012-10-23
3649	2.88995	12.7322	0.0	2012-10-23
2030	1.38835	12.7569	1.0	2012-10-23
1897	5.90414	-6.32744	1.0	2012-10-23
1086	-1.18904	-0.262306	1.0	2012-10-23
3056	-8.98367	-5.92079	0.0	2012-10-23
1594	-4.89015	6.93228	1.0	2012-10-23
4556	-1.69037	-8.78941	0.0	2012-10-23
134	-4.31622	3.7928	1.0	2012-10-23
2717	-3.08961	0.0190142	0.0	2012-10-24
2705	-6.26781	-4.91724	0.0	2012-10-24
1295	0.71428	-3.04017	1.0	2012-10-24
2391	8.87518	2.60925	1.0	2012-10-24
1603	-5.54538	9.02892	1.0	2012-10-25
3849	-1.42926	-1.72346	0.0	2012-10-25
2715	-7.63241	8.99004	0.0	2012-10-25
4115	3.58862	-1.07547	0.0	2012-10-25
1827	-8.03734	0.590219	1.0	2012-10-25
2978	6.85339	-5.6653	0.0	2012-10-26

	X	Y	Label	Date
135	-4.22697	-4.25746	1.0	2012-10-26
782	-1.40514	-7.92723	1.0	2012-10-26
136	-4.24847	4.89457	1.0	2012-10-26
3569	4.41025	-3.19662	0.0	2012-10-26
1349	-8.73549	6.57709	1.0	2012-10-26
493	10.6767	-6.28655	1.0	2012-10-26
4793	-4.15521	4.98447	0.0	2012-10-26
2592	9.93938	-7.65937	0.0	2012-10-26

5000 rows × 4 columns

```
In [117]: # create design matrix X and target vector y
X_AW2V = np.array(tsne_AW2V_df.iloc[:, 0:4]) # end index is exclusive
Y_AW2V = np.array(tsne_AW2V_df['Label']) # showing you two ways of indexing a pandas df
```

```
In [118]: #Time based split
tscv = TimeSeriesSplit(n_splits=5)
print(tscv)
```

```
TimeSeriesSplit(n_splits=5)
```

```
In [125]: #Splitting the Dataset into Train set & Test set
for train_index, test_index in tscv.split(X_AW2V):
    print("TRAIN:", train_index, "TEST:", test_index)
    X_AW2V_tr, X_AW2V_test = X[train_index], X[test_index]
    Y_AW2V_tr, Y_AW2V_test = Y[train_index], Y[test_index]
```



8

```
1395 1396 1397 1398 1399 1400 1401 1402 1403 1404 1405 1406 1407 1408
1409 1410 1411 1412 1413 1414 1415 1416 1417 1418 1419 1420 1421 1422
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1591 1592 1593 1594 1595 1596 1597 1598 1599 1600 1601 1602 1603 1604
1605 1606 1607 1608 1609 1610 1611 1612 1613 1614 1615 1616 1617 1618
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1633 1634 1635 1636 1637 1638 1639 1640 1641 1642 1643 1644 1645 1646
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1780 1781 1782 1783 1784 1785 1786 1787 1788 1789 1790 1791 1792 1793
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1864 1865 1866 1867 1868 1869 1870 1871 1872 1873 1874 1875 1876 1877
1878 1879 1880 1881 1882 1883 1884 1885 1886 1887 1888 1889 1890 1891
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1906 1907 1908 1909 1910 1911 1912 1913 1914 1915 1916 1917 1918 1919
1920 1921 1922 1923 1924 1925 1926 1927 1928 1929 1930 1931 1932 1933
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2018 2019 2020 2021 2022 2023 2024 2025 2026 2027 2028 2029 2030 2031
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2102 2103 2104 2105 2106 2107 2108 2109 2110 2111 2112 2113 2114 2115
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2354 2355 2356 2357 2358 2359 2360 2361 2362 2363 2364 2365 2366 2367
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2382 2383 2384 2385 2386 2387 2388 2389 2390 2391 2392 2393 2394 2395
2396 2397 2398 2399 2400 2401 2402 2403 2404 2405 2406 2407 2408 2409
2410 2411 2412 2413 2414 2415 2416 2417 2418 2419 2420 2421 2422 2423
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2543 2544 2545 2546 2547 2548 2549 2550 2551 2552 2553 2554 2555 2556
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2795 2796 2797 2798 2799 2800 2801 2802 2803 2804 2805 2806 2807 2808
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3628 3629 3630 3631 3632 3633 3634 3635 3636 3637 3638 3639 3640 3641
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3852 3853 3854 3855 3856 3857 3858 3859 3860 3861 3862 3863 3864 3865
3866 3867 3868 3869 3870 3871 3872 3873 3874 3875 3876 3877 3878 3879
3880 3881 3882 3883 3884 3885 3886 3887 3888 3889 3890 3891 3892 3893
3894 3895 3896 3897 3898 3899 3900 3901 3902 3903 3904 3905 3906 3907
3908 3909 3910 3911 3912 3913 3914 3915 3916 3917 3918 3919 3920 3921
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3964 3965 3966 3967 3968 3969 3970 3971 3972 3973 3974 3975 3976 3977
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4132 4133 4134 4135 4136 4137 4138 4139 4140 4141 4142 4143 4144 4145
4146 4147 4148 4149 4150 4151 4152 4153 4154 4155 4156 4157 4158 4159
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TRAIN: [ 0 1 2 ... 4164 4165 4166] TEST: [4167 4168 4169 4170 4171 4172 4173 4174 4175 4176 4177
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4209 4210 4211 4212 4213 4214 4215 4216 4217 4218 4219 4220 4221 4222
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4237 4238 4239 4240 4241 4242 4243 4244 4245 4246 4247 4248 4249 4250
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4265 4266 4267 4268 4269 4270 4271 4272 4273 4274 4275 4276 4277 4278
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4293 4294 4295 4296 4297 4298 4299 4300 4301 4302 4303 4304 4305 4306
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4391 4392 4393 4394 4395 4396 4397 4398 4399 4400 4401 4402 4403 4404
4405 4406 4407 4408 4409 4410 4411 4412 4413 4414 4415 4416 4417 4418
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4643 4644 4645 4646 4647 4648 4649 4650 4651 4652 4653 4654 4655 4656
4657 4658 4659 4660 4661 4662 4663 4664 4665 4666 4667 4668 4669 4670
4671 4672 4673 4674 4675 4676 4677 4678 4679 4680 4681 4682 4683 4684
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4713 4714 4715 4716 4717 4718 4719 4720 4721 4722 4723 4724 4725 4726
4727 4728 4729 4730 4731 4732 4733 4734 4735 4736 4737 4738 4739 4740
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4951 4952 4953 4954 4955 4956 4957 4958 4959 4960 4961 4962 4963 4964
4965 4966 4967 4968 4969 4970 4971 4972 4973 4974 4975 4976 4977 4978
4979 4980 4981 4982 4983 4984 4985 4986 4987 4988 4989 4990 4991 4992
4993 4994 4995 4996 4997 4998 4999]
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In [126]: print(X_AW2V_tr.shape)
          print(X_AW2V_test.shape)
          print(Y_AW2V_tr.shape)
          print(Y_AW2V_test.shape)
```

```
(4167, 4)
(833, 4)
(4167,)
(833,)
```

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In [127]: # Splitting the Train dataset into Cross Validation & Train Datasets
for train_index, test_index in tscv.split(X_AW2V_tr):
    print("TRAIN:", train_index, "TEST:", test_index)
    X_AW2V_train, X_AW2V_cv = X[train_index], X[test_index]
    Y_AW2V_train, Y_AW2V_cv = Y[train_index], Y[test_index]
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1369 1370 1371 1372 1373 1374 1375 1376 1377 1378 1379 1380 1381 1382
1383 1384 1385 1386 1387 1388 1389 1390]
TRAIN: [ 0 1 2 ... 1388 1389 1390] TEST: [1391 1392 1393 1394 1395 1396 1397 1398 1399 1400 1401
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1461 1462 1463 1464 1465 1466 1467 1468 1469 1470 1471 1472 1473 1474
1475 1476 1477 1478 1479 1480 1481 1482 1483 1484 1485 1486 1487 1488
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1643 1644 1645 1646 1647 1648 1649 1650 1651 1652 1653 1654 1655 1656
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```

```

In [128]: print(X_AW2V_train.shape)
          print(X_AW2V_cv.shape)
          print(X_AW2V_test.shape)

          print(Y_AW2V_train.shape)
          print(Y_AW2V_cv.shape)
          print(Y_AW2V_test.shape)

```

```

(3473, 4)
(694, 4)
(833, 4)
(3473,)
(694,)
(833,)

```

```

In [129]: # Removing the Date variable from the Data sets
AW2V_X= []
for each in X_AW2V_train:
    AW2V_X.append(np.delete(each,3))
X_AW2V_train = np.asarray(AW2V_X)

AW2V_X_cv= []
for each in X_AW2V_cv:
    AW2V_X_cv.append(np.delete(each,3))
X_AW2V_cv = np.asarray(AW2V_X_cv)

AW2V_X_test= []
for each in X_AW2V_test:
    AW2V_X_test.append(np.delete(each,3))
X_AW2V_test = np.asarray(AW2V_X_test)

```

```

In [130]: print(X_AW2V_train.shape)
          print(X_AW2V_cv.shape)
          print(X_AW2V_test.shape)

          print(Y_AW2V_train.shape)
          print(Y_AW2V_cv.shape)
          print(Y_AW2V_test.shape)

```

```

(3473, 3)
(694, 3)
(833, 3)
(3473,)
(694,)
(833,)

```

```
In [131]: # Finding the Test accuracy using Cross Validation Data Set
for i in range(1,30,2):
    # instantiate learning model (k = 30)
    knn = KNeighborsClassifier(n_neighbors=i)

    # fitting the model on crossvalidation train
    knn.fit(X_AW2V_train, Y_AW2V_train)

    # predict the response on the crossvalidation train
    pred = knn.predict(X_AW2V_cv)

    # evaluate CV accuracy
    acc = accuracy_score(Y_AW2V_cv, pred, normalize=True) * float(100)
    print('\nCV accuracy for k = %d is %d%%' % (i, acc))

knn = KNeighborsClassifier(1)
knn.fit(X_AW2V_train, Y_AW2V_train)
pred = knn.predict(X_AW2V_test)
acc = accuracy_score(Y_AW2V_test, pred, normalize=True) * float(100)
print('\n****Test accuracy for k = 1 is %d%%' % (acc))
```

CV accuracy for k = 1 is 98%

CV accuracy for k = 3 is 98%

CV accuracy for k = 5 is 97%

CV accuracy for k = 7 is 96%

CV accuracy for k = 9 is 96%

CV accuracy for k = 11 is 96%

CV accuracy for k = 13 is 96%

CV accuracy for k = 15 is 95%

CV accuracy for k = 17 is 95%

CV accuracy for k = 19 is 94%

CV accuracy for k = 21 is 94%

CV accuracy for k = 23 is 93%

CV accuracy for k = 25 is 92%

CV accuracy for k = 27 is 89%

CV accuracy for k = 29 is 88%

\*\*\*\*Test accuracy for k = 1 is 99%

```
In [135]: # creating odd list of K for KNN
myList = list(range(0,50))
neighbors = list(filter(lambda x: x % 2 != 0, myList))

# empty list that will hold cv scores
cv_scores = []
```

```
In [136]: for k in neighbors:
    knn = KNeighborsClassifier(n_neighbors=k)
    scores = cross_val_score(knn, X_AW2V_train, Y_AW2V_train, cv=10)
    cv_scores.append(scores.mean())
```

```
In [137]: # changing to misclassification error
MSE = [1 - x for x in cv_scores]

# determining best k
optimal_k = neighbors[MSE.index(min(MSE))]
print('\nThe optimal number of neighbors is %d.' % optimal_k)

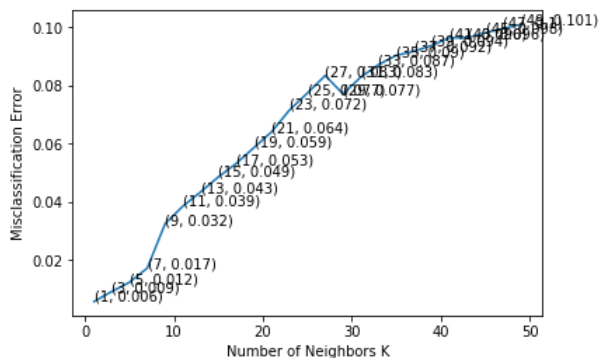
# plot misclassification error vs k
plt.plot(neighbors, MSE)

for xy in zip(neighbors, np.round(MSE,3)):
    plt.annotate('%s, %s' % xy, xy=xy, textcoords='data')

plt.xlabel('Number of Neighbors K')
plt.ylabel('Misclassification Error')
plt.show()

print("the misclassification error for each k value is : ", np.round(MSE,3))
```

The optimal number of neighbors is 1.



the misclassification error for each k value is : [0.006 0.009 0.012 0.017 0.032 0.039 0.043 0.049 0.053 0.059 0.064 0.072 0.077 0.083 0.077 0.083 0.087 0.09 0.092 0.094 0.096 0.096 0.098 0.1 0.101]

```
In [138]: # Finding Optimal K from a set of odd List of Integers
# instantiate learning model k = optimal_k
knn_optimal = KNeighborsClassifier(n_neighbors=optimal_k)

# fitting the model
knn_optimal.fit(X_AW2V_train, Y_AW2V_train)

# predict the response
pred = knn_optimal.predict(X_AW2V_test)

# evaluate accuracy
acc = accuracy_score(Y_AW2V_test, pred) * 100
print('\nThe accuracy of the knn classifier for k = %d is %f%%' % (optimal_k, acc))
```

The accuracy of the knn classifier for k = 1 is 99.639856%

## TF-IDF - W2V

```
In [82]: # TF-IDF weighted Word2Vec
tfidf_feat = tf_idf_vect.get_feature_names() # tfidf words/col-names
# final_tf_idf is the sparse matrix with row= sentence, col=word and cell_val = tfidf

tfidf_sent_vectors = []; # the tfidf-w2v for each sentence/review is stored in this list
row=0;
for sent in list_of_sent: # for each review/sentence
    sent_vec = np.zeros(50) # as word vectors are of zero length
    weight_sum =0; # num of words with a valid vector in the sentence/review
    for word in sent: # for each word in a review/sentence
        if word in w2v_words:
            vec = w2v_model.wv[word]
            # obtain the tf_idf of a word in a sentence/review
            tf_idf = final_tf_idf[row, tfidf_feat.index(word)]
            sent_vec += (vec * tf_idf)
            weight_sum += tf_idf
    if weight_sum != 0:
        sent_vec /= weight_sum
    tfidf_sent_vectors.append(sent_vec)
    row += 1
```

```
In [101]: #tsne
start_time_code = time.time()
model = TSNE(n_components=2, random_state=0, perplexity=30)
tsne_data_tfidf_Aw2v = model.fit_transform(tfidf_sent_vectors)
end_time_code = time.time()
print ("Running Time for code execution " + str(end_time_code - start_time_code) + " secs")
```

Running Time for code execution 102.52370500564575 secs

```
In [139]: tsne_data_tfidf_Aw2v.shape
```

```
Out[139]: (5000, 2)
```

```
In [140]: tsne_data_tf_Aw2v = np.vstack((tsne_data_tfidf_Aw2v.T,label,Time)).T
```

```
In [141]: tsne_data_tf_Aw2v.shape
```

```
Out[141]: (5000, 4)
```

```
In [142]: #Saving tsne data into seperate file for further usecases.
tsne_Tf_AW2V_df = pd.DataFrame(data=tsne_data_tf_Aw2v, columns=("X", "Y", "Label", "Date"))
tsne_Tf_AW2V_df.to_csv('/home/venkatasujit272/tsne_Tf_AW2V_data.csv')
```

```
In [143]: # Aliasing the Score field values into Binary format
def partition(x):
    if x == 'negative':
        return 0.
    return 1.

# Aliasing the Score to String Format (Positive for Score > 3 & Negative for Score < 3)

actualScore = tsne_Tf_AW2V_df['Label']
positiveNegative = actualScore.map(partition)
tsne_Tf_AW2V_df['Label'] = positiveNegative
```

```
In [144]: tsne_Tf_AW2V_df.head(1)
```

```
Out[144]:
```

	X	Y	Label	Date
0	-2.5246	-10.7039	1.0	1999-10-08

```
In [145]: #Sorting the Dataframe with Date to apply Timebased Split  
tsne_Tf_AW2V_df.sort_values(by='Date',ascending=1)
```

Out[145]:

	X	Y	Label	Date
0	-2.5246	-10.7039	1.0	1999-10-08
28	-3.36253	-9.00849	1.0	1999-10-25
377	3.91971	-10.5973	1.0	1999-12-02
287	-4.60195	-11.4588	1.0	1999-12-06
376	1.9589	-2.21929	1.0	2000-01-03
209	2.61388	-2.75753	1.0	2000-01-09
2540	3.93277	-10.1787	0.0	2000-01-19
198	9.37026	-8.3316	1.0	2000-01-24
224	-7.84105	-2.76157	1.0	2000-02-26
284	8.18882	-3.9679	1.0	2000-06-03
378	7.18127	-4.67793	1.0	2000-06-03
205	-2.50795	-11.1343	1.0	2000-06-23
206	-4.70862	-11.6129	1.0	2000-06-29
415	11.3001	-5.85578	1.0	2000-07-31
684	6.40004	9.04671	1.0	2000-08-09
714	5.35139	10.0547	1.0	2000-08-09
212	1.94638	-2.10341	1.0	2000-08-15
258	3.55155	-10.6195	1.0	2000-10-03
691	1.09665	-6.80669	1.0	2000-12-05
315	1.88862	-2.23293	1.0	2000-12-19
286	1.61452	-11.2988	1.0	2000-12-30
692	8.08022	6.12519	1.0	2001-02-22
2547	-2.35202	-12.4363	0.0	2001-06-11
2543	3.7056	-10.4436	0.0	2001-08-08
233	1.99856	-10.2072	1.0	2001-09-24
701	7.51727	4.46549	1.0	2001-10-23
309	3.58549	-10.5966	1.0	2001-10-26
30	-2.37335	-6.28845	1.0	2001-12-26
830	9.13102	-3.75512	1.0	2002-01-06
288	-3.73461	-11.9175	1.0	2002-02-04
...	...	...	...	...
232	2.61009	-10.6303	1.0	2012-10-22
3856	-2.47455	-4.49752	0.0	2012-10-23
1792	-0.781262	-2.4867	1.0	2012-10-23
813	3.27652	4.65774	1.0	2012-10-23
3649	-0.606243	10.1302	0.0	2012-10-23
2030	11.3966	6.16946	1.0	2012-10-23
1897	8.59687	-4.20608	1.0	2012-10-23
1086	2.66058	0.475088	1.0	2012-10-23
3056	-0.870412	-12.1437	0.0	2012-10-23
1594	0.48707	6.28572	1.0	2012-10-23
4556	-4.63344	-5.06469	0.0	2012-10-23
134	-1.15171	7.04979	1.0	2012-10-23
2717	-0.138413	4.3474	0.0	2012-10-24
2705	-5.88004	0.477485	0.0	2012-10-24
1295	-2.43614	-2.72924	1.0	2012-10-24
2391	6.10425	9.29838	1.0	2012-10-24
1603	-2.66913	4.19046	1.0	2012-10-25
3849	3.78954	-0.0163171	0.0	2012-10-25
2715	1.8184	4.49809	0.0	2012-10-25
4115	-5.23026	-9.38369	0.0	2012-10-25
1827	-8.63288	6.96447	1.0	2012-10-25
2978	3.33108	-9.95436	0.0	2012-10-26

	X	Y	Label	Date
135	-2.33329	-9.65648	1.0	2012-10-26
782	-4.57583	-4.63614	1.0	2012-10-26
136	-5.42425	8.65321	1.0	2012-10-26
3569	-4.8137	-10.4036	0.0	2012-10-26
1349	-3.56628	5.03526	1.0	2012-10-26
493	12.6854	-1.58449	1.0	2012-10-26
4793	-2.07365	2.77399	0.0	2012-10-26
2592	9.60875	-8.42097	0.0	2012-10-26

5000 rows × 4 columns

```
In [146]: # create design matrix X and target vector y
X_TW= np.array(tsne_Tf_AW2V_df.iloc[:, 0:4]) # end index is exclusive
Y_TW = np.array(tsne_Tf_AW2V_df['Label']) # showing you two ways of indexing a pandas df
```

```
In [147]: tscv = TimeSeriesSplit(n_splits=5)
print(tscv)
```

```
TimeSeriesSplit(n_splits=5)
```



```
In [148]: #Splitting the Dataset into Train set & Test set
for train_index, test_index in tscv.split(X_TW):
    print("TRAIN:", train_index, "TEST:", test_index)
    X_TW_tr, X_TW_test = X[train_index], X[test_index]
    Y_TW_tr, Y_TW_test = Y[train_index], Y[test_index]
```

8

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1395 1396 1397 1398 1399 1400 1401 1402 1403 1404 1405 1406 1407 1408
1409 1410 1411 1412 1413 1414 1415 1416 1417 1418 1419 1420 1421 1422
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1661 1662 1663 1664 1665 1666 1667]
TRAIN: [ 0 1 2 ... 1665 1666 1667] TEST: [1668 1669 1670 1671 1672 1673 1674 1675 1676 1677 1678
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4447 4448 4449 4450 4451 4452 4453 4454 4455 4456 4457 4458 4459 4460
4461 4462 4463 4464 4465 4466 4467 4468 4469 4470 4471 4472 4473 4474
4475 4476 4477 4478 4479 4480 4481 4482 4483 4484 4485 4486 4487 4488
4489 4490 4491 4492 4493 4494 4495 4496 4497 4498 4499 4500 4501 4502
4503 4504 4505 4506 4507 4508 4509 4510 4511 4512 4513 4514 4515 4516
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4559 4560 4561 4562 4563 4564 4565 4566 4567 4568 4569 4570 4571 4572
4573 4574 4575 4576 4577 4578 4579 4580 4581 4582 4583 4584 4585 4586
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4615 4616 4617 4618 4619 4620 4621 4622 4623 4624 4625 4626 4627 4628
4629 4630 4631 4632 4633 4634 4635 4636 4637 4638 4639 4640 4641 4642
4643 4644 4645 4646 4647 4648 4649 4650 4651 4652 4653 4654 4655 4656
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4671 4672 4673 4674 4675 4676 4677 4678 4679 4680 4681 4682 4683 4684
4685 4686 4687 4688 4689 4690 4691 4692 4693 4694 4695 4696 4697 4698
4699 4700 4701 4702 4703 4704 4705 4706 4707 4708 4709 4710 4711 4712
4713 4714 4715 4716 4717 4718 4719 4720 4721 4722 4723 4724 4725 4726
4727 4728 4729 4730 4731 4732 4733 4734 4735 4736 4737 4738 4739 4740
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4755 4756 4757 4758 4759 4760 4761 4762 4763 4764 4765 4766 4767 4768
4769 4770 4771 4772 4773 4774 4775 4776 4777 4778 4779 4780 4781 4782
4783 4784 4785 4786 4787 4788 4789 4790 4791 4792 4793 4794 4795 4796
4797 4798 4799 4800 4801 4802 4803 4804 4805 4806 4807 4808 4809 4810
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4839 4840 4841 4842 4843 4844 4845 4846 4847 4848 4849 4850 4851 4852
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4867 4868 4869 4870 4871 4872 4873 4874 4875 4876 4877 4878 4879 4880
4881 4882 4883 4884 4885 4886 4887 4888 4889 4890 4891 4892 4893 4894
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4979 4980 4981 4982 4983 4984 4985 4986 4987 4988 4989 4990 4991 4992
4993 4994 4995 4996 4997 4998 4999]
```

```
In [149]: print(X_TW_tr.shape)
          print(X_TW_test.shape)
          print(Y_TW_tr.shape)
          print(Y_TW_test.shape)
```

```
(4167, 4)
(833, 4)
(4167,)
(833,)
```

```
In [150]: # Splitting the Train dataset into Cross Validation & Train Datasets
for train_index, test_index in tscv.split(X_TW_tr):
    print("TRAIN:", train_index, "TEST:", test_index)
    X_TW_train, X_TW_cv = X[train_index], X[test_index]
    Y_TW_train, Y_TW_cv = Y[train_index], Y[test_index]
```

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```
1369 1370 1371 1372 1373 1374 1375 1376 1377 1378 1379 1380 1381 1382
1383 1384 1385 1386 1387 1388 1389 1390]
TRAIN: [ 0 1 2 ... 1388 1389 1390] TEST: [1391 1392 1393 1394 1395 1396 1397 1398 1399 1400 1401
1402 1403 1404
1405 1406 1407 1408 1409 1410 1411 1412 1413 1414 1415 1416 1417 1418
1419 1420 1421 1422 1423 1424 1425 1426 1427 1428 1429 1430 1431 1432
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1489 1490 1491 1492 1493 1494 1495 1496 1497 1498 1499 1500 1501 1502
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1559 1560 1561 1562 1563 1564 1565 1566 1567 1568 1569 1570 1571 1572
1573 1574 1575 1576 1577 1578 1579 1580 1581 1582 1583 1584 1585 1586
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1601 1602 1603 1604 1605 1606 1607 1608 1609 1610 1611 1612 1613 1614
1615 1616 1617 1618 1619 1620 1621 1622 1623 1624 1625 1626 1627 1628
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1643 1644 1645 1646 1647 1648 1649 1650 1651 1652 1653 1654 1655 1656
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1699 1700 1701 1702 1703 1704 1705 1706 1707 1708 1709 1710 1711 1712
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1727 1728 1729 1730 1731 1732 1733 1734 1735 1736 1737 1738 1739 1740
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1783 1784 1785 1786 1787 1788 1789 1790 1791 1792 1793 1794 1795 1796
1797 1798 1799 1800 1801 1802 1803 1804 1805 1806 1807 1808 1809 1810
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1867 1868 1869 1870 1871 1872 1873 1874 1875 1876 1877 1878 1879 1880
1881 1882 1883 1884 1885 1886 1887 1888 1889 1890 1891 1892 1893 1894
1895 1896 1897 1898 1899 1900 1901 1902 1903 1904 1905 1906 1907 1908
1909 1910 1911 1912 1913 1914 1915 1916 1917 1918 1919 1920 1921 1922
1923 1924 1925 1926 1927 1928 1929 1930 1931 1932 1933 1934 1935 1936
1937 1938 1939 1940 1941 1942 1943 1944 1945 1946 1947 1948 1949 1950
1951 1952 1953 1954 1955 1956 1957 1958 1959 1960 1961 1962 1963 1964
1965 1966 1967 1968 1969 1970 1971 1972 1973 1974 1975 1976 1977 1978
1979 1980 1981 1982 1983 1984 1985 1986 1987 1988 1989 1990 1991 1992
1993 1994 1995 1996 1997 1998 1999 2000 2001 2002 2003 2004 2005 2006
2007 2008 2009 2010 2011 2012 2013 2014 2015 2016 2017 2018 2019 2020
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2035 2036 2037 2038 2039 2040 2041 2042 2043 2044 2045 2046 2047 2048
2049 2050 2051 2052 2053 2054 2055 2056 2057 2058 2059 2060 2061 2062
2063 2064 2065 2066 2067 2068 2069 2070 2071 2072 2073 2074 2075 2076
2077 2078 2079 2080 2081 2082 2083 2084]
TRAIN: [ 0 1 2 ... 2082 2083 2084] TEST: [2085 2086 2087 2088 2089 2090 2091 2092 2093 2094 2095
2096 2097 2098
2099 2100 2101 2102 2103 2104 2105 2106 2107 2108 2109 2110 2111 2112
2113 2114 2115 2116 2117 2118 2119 2120 2121 2122 2123 2124 2125 2126
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2141 2142 2143 2144 2145 2146 2147 2148 2149 2150 2151 2152 2153 2154
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2197 2198 2199 2200 2201 2202 2203 2204 2205 2206 2207 2208 2209 2210
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2239 2240 2241 2242 2243 2244 2245 2246 2247 2248 2249 2250 2251 2252
2253 2254 2255 2256 2257 2258 2259 2260 2261 2262 2263 2264 2265 2266
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2281 2282 2283 2284 2285 2286 2287 2288 2289 2290 2291 2292 2293 2294
2295 2296 2297 2298 2299 2300 2301 2302 2303 2304 2305 2306 2307 2308
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2393 2394 2395 2396 2397 2398 2399 2400 2401 2402 2403 2404 2405 2406
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2505 2506 2507 2508 2509 2510 2511 2512 2513 2514 2515 2516 2517 2518
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2659 2660 2661 2662 2663 2664 2665 2666 2667 2668 2669 2670 2671 2672
2673 2674 2675 2676 2677 2678 2679 2680 2681 2682 2683 2684 2685 2686
2687 2688 2689 2690 2691 2692 2693 2694 2695 2696 2697 2698 2699 2700
2701 2702 2703 2704 2705 2706 2707 2708 2709 2710 2711 2712 2713 2714
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2743 2744 2745 2746 2747 2748 2749 2750 2751 2752 2753 2754 2755 2756
2757 2758 2759 2760 2761 2762 2763 2764 2765 2766 2767 2768 2769 2770
2771 2772 2773 2774 2775 2776 2777 2778]
TRAIN: [ 0 1 2 ... 2776 2777 2778] TEST: [2779 2780 2781 2782 2783 2784 2785 2786 2787 2788 2789
2790 2791 2792
2793 2794 2795 2796 2797 2798 2799 2800 2801 2802 2803 2804 2805 2806
2807 2808 2809 2810 2811 2812 2813 2814 2815 2816 2817 2818 2819 2820
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2835 2836 2837 2838 2839 2840 2841 2842 2843 2844 2845 2846 2847 2848
2849 2850 2851 2852 2853 2854 2855 2856 2857 2858 2859 2860 2861 2862
2863 2864 2865 2866 2867 2868 2869 2870 2871 2872 2873 2874 2875 2876
2877 2878 2879 2880 2881 2882 2883 2884 2885 2886 2887 2888 2889 2890
2891 2892 2893 2894 2895 2896 2897 2898 2899 2900 2901 2902 2903 2904
2905 2906 2907 2908 2909 2910 2911 2912 2913 2914 2915 2916 2917 2918
2919 2920 2921 2922 2923 2924 2925 2926 2927 2928 2929 2930 2931 2932
2933 2934 2935 2936 2937 2938 2939 2940 2941 2942 2943 2944 2945 2946
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2961 2962 2963 2964 2965 2966 2967 2968 2969 2970 2971 2972 2973 2974
2975 2976 2977 2978 2979 2980 2981 2982 2983 2984 2985 2986 2987 2988
2989 2990 2991 2992 2993 2994 2995 2996 2997 2998 2999 3000 3001 3002
3003 3004 3005 3006 3007 3008 3009 3010 3011 3012 3013 3014 3015 3016
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3059 3060 3061 3062 3063 3064 3065 3066 3067 3068 3069 3070 3071 3072
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3143 3144 3145 3146 3147 3148 3149 3150 3151 3152 3153 3154 3155 3156
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3199 3200 3201 3202 3203 3204 3205 3206 3207 3208 3209 3210 3211 3212
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3255 3256 3257 3258 3259 3260 3261 3262 3263 3264 3265 3266 3267 3268
3269 3270 3271 3272 3273 3274 3275 3276 3277 3278 3279 3280 3281 3282
3283 3284 3285 3286 3287 3288 3289 3290 3291 3292 3293 3294 3295 3296
3297 3298 3299 3300 3301 3302 3303 3304 3305 3306 3307 3308 3309 3310
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3325 3326 3327 3328 3329 3330 3331 3332 3333 3334 3335 3336 3337 3338
3339 3340 3341 3342 3343 3344 3345 3346 3347 3348 3349 3350 3351 3352
3353 3354 3355 3356 3357 3358 3359 3360 3361 3362 3363 3364 3365 3366
3367 3368 3369 3370 3371 3372 3373 3374 3375 3376 3377 3378 3379 3380
3381 3382 3383 3384 3385 3386 3387 3388 3389 3390 3391 3392 3393 3394
3395 3396 3397 3398 3399 3400 3401 3402 3403 3404 3405 3406 3407 3408
3409 3410 3411 3412 3413 3414 3415 3416 3417 3418 3419 3420 3421 3422
3423 3424 3425 3426 3427 3428 3429 3430 3431 3432 3433 3434 3435 3436
3437 3438 3439 3440 3441 3442 3443 3444 3445 3446 3447 3448 3449 3450
3451 3452 3453 3454 3455 3456 3457 3458 3459 3460 3461 3462 3463 3464
3465 3466 3467 3468 3469 3470 3471 3472]
TRAIN: [ 0 1 2 ... 3470 3471 3472] TEST: [3473 3474 3475 3476 3477 3478 3479 3480 3481 3482 3483
3484 3485 3486
3487 3488 3489 3490 3491 3492 3493 3494 3495 3496 3497 3498 3499 3500
3501 3502 3503 3504 3505 3506 3507 3508 3509 3510 3511 3512 3513 3514
3515 3516 3517 3518 3519 3520 3521 3522 3523 3524 3525 3526 3527 3528
3529 3530 3531 3532 3533 3534 3535 3536 3537 3538 3539 3540 3541 3542
3543 3544 3545 3546 3547 3548 3549 3550 3551 3552 3553 3554 3555 3556
3557 3558 3559 3560 3561 3562 3563 3564 3565 3566 3567 3568 3569 3570
3571 3572 3573 3574 3575 3576 3577 3578 3579 3580 3581 3582 3583 3584
3585 3586 3587 3588 3589 3590 3591 3592 3593 3594 3595 3596 3597 3598
3599 3600 3601 3602 3603 3604 3605 3606 3607 3608 3609 3610 3611 3612
3613 3614 3615 3616 3617 3618 3619 3620 3621 3622 3623 3624 3625 3626
3627 3628 3629 3630 3631 3632 3633 3634 3635 3636 3637 3638 3639 3640
3641 3642 3643 3644 3645 3646 3647 3648 3649 3650 3651 3652 3653 3654
3655 3656 3657 3658 3659 3660 3661 3662 3663 3664 3665 3666 3667 3668
3669 3670 3671 3672 3673 3674 3675 3676 3677 3678 3679 3680 3681 3682
3683 3684 3685 3686 3687 3688 3689 3690 3691 3692 3693 3694 3695 3696
3697 3698 3699 3700 3701 3702 3703 3704 3705 3706 3707 3708 3709 3710
3711 3712 3713 3714 3715 3716 3717 3718 3719 3720 3721 3722 3723 3724
3725 3726 3727 3728 3729 3730 3731 3732 3733 3734 3735 3736 3737 3738
3739 3740 3741 3742 3743 3744 3745 3746 3747 3748 3749 3750 3751 3752
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3753 3754 3755 3756 3757 3758 3759 3760 3761 3762 3763 3764 3765 3766
3767 3768 3769 3770 3771 3772 3773 3774 3775 3776 3777 3778 3779 3780
3781 3782 3783 3784 3785 3786 3787 3788 3789 3790 3791 3792 3793 3794
3795 3796 3797 3798 3799 3800 3801 3802 3803 3804 3805 3806 3807 3808
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3823 3824 3825 3826 3827 3828 3829 3830 3831 3832 3833 3834 3835 3836
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3851 3852 3853 3854 3855 3856 3857 3858 3859 3860 3861 3862 3863 3864
3865 3866 3867 3868 3869 3870 3871 3872 3873 3874 3875 3876 3877 3878
3879 3880 3881 3882 3883 3884 3885 3886 3887 3888 3889 3890 3891 3892
3893 3894 3895 3896 3897 3898 3899 3900 3901 3902 3903 3904 3905 3906
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3949 3950 3951 3952 3953 3954 3955 3956 3957 3958 3959 3960 3961 3962
3963 3964 3965 3966 3967 3968 3969 3970 3971 3972 3973 3974 3975 3976
3977 3978 3979 3980 3981 3982 3983 3984 3985 3986 3987 3988 3989 3990
3991 3992 3993 3994 3995 3996 3997 3998 3999 4000 4001 4002 4003 4004
4005 4006 4007 4008 4009 4010 4011 4012 4013 4014 4015 4016 4017 4018
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4033 4034 4035 4036 4037 4038 4039 4040 4041 4042 4043 4044 4045 4046
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4061 4062 4063 4064 4065 4066 4067 4068 4069 4070 4071 4072 4073 4074
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4089 4090 4091 4092 4093 4094 4095 4096 4097 4098 4099 4100 4101 4102
4103 4104 4105 4106 4107 4108 4109 4110 4111 4112 4113 4114 4115 4116
4117 4118 4119 4120 4121 4122 4123 4124 4125 4126 4127 4128 4129 4130
4131 4132 4133 4134 4135 4136 4137 4138 4139 4140 4141 4142 4143 4144
4145 4146 4147 4148 4149 4150 4151 4152 4153 4154 4155 4156 4157 4158
4159 4160 4161 4162 4163 4164 4165 4166]

```

```

In [151]: print(X_TW_train.shape)
          print(X_TW_cv.shape)
          print(X_TW_test.shape)

          print(Y_TW_train.shape)
          print(Y_TW_cv.shape)
          print(Y_TW_test.shape)

```

```

(3473, 4)
(694, 4)
(833, 4)
(3473,)
(694,)
(833,)

```

```

In [152]: # Removing the Date variable from the Data sets

```

```

TW_X= []
for each in X_TW_train:
    TW_X.append(np.delete(each,3))
X_TW_train = np.asarray(TW_X)

TW_X_cv= []
for each in X_TW_cv:
    TW_X_cv.append(np.delete(each,3))
X_TW_cv = np.asarray(TW_X_cv)

TW_X_test= []
for each in X_TW_test:
    TW_X_test.append(np.delete(each,3))
X_TW_test = np.asarray(TW_X_test)

```

```

In [153]: print(X_TW_train.shape)
          print(X_TW_cv.shape)
          print(X_TW_test.shape)

          print(Y_TW_train.shape)
          print(Y_TW_cv.shape)
          print(Y_TW_test.shape)

```

```

(3473, 3)
(694, 3)
(833, 3)
(3473,)
(694,)
(833,)

```

```
In [154]: # Finding the Test accuracy using Cross Validation Data Set
for i in range(1,30,2):
    # instantiate learning model (k = 30)
    knn = KNeighborsClassifier(n_neighbors=i)

    # fitting the model on crossvalidation train
    knn.fit(X_TW_train, Y_TW_train)

    # predict the response on the crossvalidation train
    pred = knn.predict(X_TW_cv)

    # evaluate CV accuracy
    acc = accuracy_score(Y_TW_cv, pred, normalize=True) * float(100)
    print('\nCV accuracy for k = %d is %d%%' % (i, acc))

knn = KNeighborsClassifier(1)
knn.fit(X_TW_train, Y_TW_train)
pred = knn.predict(X_TW_test)
acc = accuracy_score(Y_TW_test, pred, normalize=True) * float(100)
print('\n****Test accuracy for k = 1 is %d%%' % (acc))
```

CV accuracy for k = 1 is 98%

CV accuracy for k = 3 is 98%

CV accuracy for k = 5 is 97%

CV accuracy for k = 7 is 96%

CV accuracy for k = 9 is 96%

CV accuracy for k = 11 is 96%

CV accuracy for k = 13 is 96%

CV accuracy for k = 15 is 95%

CV accuracy for k = 17 is 95%

CV accuracy for k = 19 is 94%

CV accuracy for k = 21 is 94%

CV accuracy for k = 23 is 93%

CV accuracy for k = 25 is 92%

CV accuracy for k = 27 is 89%

CV accuracy for k = 29 is 88%

\*\*\*\*Test accuracy for k = 1 is 99%

```
In [155]: # creating odd list of K for KNN
myList = list(range(0,50))
neighbors = list(filter(lambda x: x % 2 != 0, myList))

# empty list that will hold cv scores
cv_scores = []
```

```
In [156]: for k in neighbors:
    knn = KNeighborsClassifier(n_neighbors=k)
    scores = cross_val_score(knn, X_TW_train, Y_TW_train, cv=10)
    cv_scores.append(scores.mean())
```

```
In [157]: # changing to misclassification error
MSE = [1 - x for x in cv_scores]

# determining best k
optimal_k = neighbors[MSE.index(min(MSE))]
print('\nThe optimal number of neighbors is %d.' % optimal_k)

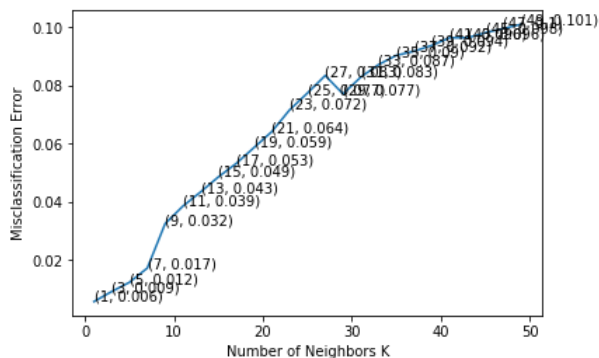
# plot misclassification error vs k
plt.plot(neighbors, MSE)

for xy in zip(neighbors, np.round(MSE,3)):
    plt.annotate('%s, %s' % xy, xy=xy, textcoords='data')

plt.xlabel('Number of Neighbors K')
plt.ylabel('Misclassification Error')
plt.show()

print("the misclassification error for each k value is : ", np.round(MSE,3))
```

The optimal number of neighbors is 1.



the misclassification error for each k value is : [0.006 0.009 0.012 0.017 0.032 0.039 0.043 0.049 0.053 0.059 0.064 0.072 0.077 0.083 0.077 0.083 0.087 0.09 0.092 0.094 0.096 0.096 0.098 0.1 0.101]

```
In [158]: # ===== KNN with k = optimal_k =====
# instantiate learning model k = optimal_k
knn_optimal = KNeighborsClassifier(n_neighbors=optimal_k)

# fitting the model
knn_optimal.fit(X_TW_train, Y_TW_train)

# predict the response
pred = knn_optimal.predict(X_TW_test)

# evaluate accuracy
acc = accuracy_score(Y_TW_test, pred) * 100
print('\nThe accuracy of the knn classifier for k = %d is %f%%' % (optimal_k, acc))
```

The accuracy of the knn classifier for k = 1 is 99.639856%

Conclusion: The Accuracy obtained by all different types of Doc2Vec conversion techniques ( BOW, TF-IDF, AW2V, TF\_IDF W2V) are same i.e. 99.6%