# K-Means, Agglomerative and DBSCAN on Amazon Fine Food Reviews DataSet:

### **Data Source:**

https://www.kaggle.com/snap/amazon-fine-foodreviews (https://www.kaggle.com/snap/amazon-fine-food-reviews)

The Amazon Fine Food Reviews dataset consists of reviews of fine foods from Amazon.

Number of reviews: 568,454

Number of users: 256,059

Number of products: 74,258

Timespan: Oct 1999 - Oct 2012

Number of Attributes/Columns in data: 10

Attribute Information:

Id - Id of the row in the dataset

Productld - unique identifier for the product

Userld - unqiue identifier for the user

ProfileName - name on the profile

HelpfulnessNumerator - number of users who found the review helpful

HelpfulnessDenominator - number of users who indicated whether they found the review helpful or not

Score - rating between 1 and 5

Time - timestamp for the review

Summary - brief summary of the review

Text - text of the review

Objective:

To apply the K-Means Clustering Algorithm on the Bow, TF-IDF Vectors and computing the best K value for each Vectors and finding the word cloud for each clusters formed .

# **DBSCAN Clustering:**

- 1. Find the best 'Eps' using the elbow-knee method.
- 2. Try representing those reviews in a cluster as a word cloud so that it would be more comprehensible what a particular cluster represents.

### Step-By-Step procedure

- 1. In this, we need to work with all 4-vectorizers (BOW, TFIDF, Avg w2v and TF-IDF weighted w2v) where we will convert our texted review into numerical(vector) form in order to apply any Model
- After that we will take our cleandedtext(i.e cleand text means we have already cleaned our data by removing stops words, other this which are going to affect our model) and then we will take only test data not their respective class lable because as we know we are goint to apply Kmeans clustering algo which do not required class lables, what is does is it mainly group/clusters the similar data points
- 3. DBSCAN is density based clustering algo and in this we have to hyperparameters i.e min pts and EPS what are these min pts i.e min samples is The number of samples (or total weight) in a neighborhood for a point to be considered as a core point, and eps is the maximum distance between two samples for them to be considered as in the same neighborhood, and we typically try to choose larger min points because which helps to remove the outliers
- 4. We typically choose min pts is 2\*dim-of-our data and EPS using using elbow-knee methods.
- 5. After getting min points and EPS we try to implement DBSCAN model with different EPS near by to best EPS and try to read and represent the reviews for each EPS

```
In [1]:
        import numpy as np
        import pandas as pd
        import matplotlib.pyplot as plt
        import seaborn as sns
        %matplotlib inline
        import sqlite3
        import string
        import nltk
        from sklearn.decomposition import TruncatedSVD
        from sklearn.feature extraction.text import TfidfTransformer
        from sklearn.feature extraction.text import TfidfVectorizer
        from sklearn.feature_extraction.text import CountVectorizer
        import re
        import string
        from gensim.models import Word2Vec
        from gensim.models import KeyedVectors
        import pickle
        import os
        from tqdm import tqdm
        from sklearn.cross validation import cross val score
        from sklearn.metrics import accuracy score
        from sklearn.cross_validation import train_test_split
        from sklearn.metrics import confusion matrix
        from sklearn.metrics import make scorer
        from sklearn.metrics import f1 score
        from sklearn.decomposition import TruncatedSVD
        from sklearn.preprocessing import StandardScaler
        from sklearn.model selection import GridSearchCV
        from sklearn.model_selection import RandomizedSearchCV
        from sklearn.metrics import precision score
        from sklearn.metrics import f1 score
        from sklearn.model selection import TimeSeriesSplit
        from sklearn.metrics import recall score
        from sklearn.metrics import classification report
        from sklearn.metrics import roc_auc_score
        from sklearn.metrics import roc curve, auc
        from sklearn.linear model import SGDClassifier
        from sklearn.ensemble import BaggingClassifier
        from sklearn.multiclass import OneVsRestClassifier
        from sklearn.svm import SVC
        from sklearn.svm import LinearSVC
        import warnings
        warnings.filterwarnings('ignore')
        # ======================== data preprocessing =================================
        # Making the connection to the database.sqlite
        con = sqlite3.connect("C:\\Users\\Ashu\\Desktop\\AAIC\\IPython Notebooks\\AMAZON F
```

C:\Users\Ashu\Miniconda3\lib\site-packages\gensim\utils.py:1197: UserWarning:
detected Windows; aliasing chunkize to chunkize\_serial

warnings.warn("detected Windows; aliasing chunkize to chunkize\_serial")

C:\Users\Ashu\Miniconda3\lib\site-packages\sklearn\cross\_validation.py:41: Dep recationWarning: This module was deprecated in version 0.18 in favor of the mo del\_selection module into which all the refactored classes and functions are m oved. 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)

C:\Users\Ashu\Miniconda3\lib\site-packages\sklearn\ensemble\weight\_boosting.p
y:29: DeprecationWarning: numpy.core.umath\_tests is an internal NumPy module a
nd should not be imported. It will be removed in a future NumPy release.

from numpy.core.umath\_tests import inner1d

```
In [2]:
        # Extracting out the positive and negative features
         amazon featured reviews = pd.read sql query("""SELECT * FROM REVIEWS WHERE SCORE !
         print(amazon featured reviews.shape)
        # Creating the partition function returning the positive or negative reviews and a
        # of ratings given:
        def partition(x):
                 if x < 3:
                     return 0
                 else :
                     return 1
         pos_neg_reviews_df = amazon_featured_reviews['Score'].map(partition)
         print(type(pos neg reviews df) , 'pos neg reviews df' , pos neg reviews df.shape)
        print('type(amazon_featured_reviews):' , type(amazon_featured_reviews))
         amazon_featured_reviews['Score'] = pos_neg_reviews_df
         amazon featured reviews.shape
         amazon_featured_reviews.head(2)
           (525814, 10)
           <class 'pandas.core.series.Series'> pos neg reviews df (525814,)
           type(amazon_featured_reviews): <class 'pandas.core.frame.DataFrame'>
Out[2]:
            ld
                 ProductId
                                     Userld ProfileName HelpfulnessNumerator HelpfulnessDenominat
            1 B001E4KFG0 A3SGXH7AUHU8GW
                                                                       1
                                              delmartian
         1 2 B00813GRG4
                                                                       0
                            A1D87F6ZCVE5NK
                                                 dll pa
```

In [3]: # Data deduplication is used to clean the data having redundancy and many unwanted # use the data: duplicate\_df = pd.read\_sql\_query("""SELECT \* FROM REVIEWS WHERE SCORE !=3 AND Text (SELECT Text FROM REVIEWS GROUP BY Text having count(\*) > 1) """ , con) duplicate\_df.head(4) #So we can see there are many such duplicated rows having some column values simil

#### Out[3]:

	ld	ProductId	Userld	ProfileName	HelpfulnessNumerator	HelpfulnessDenominat
0	4	B000UA0QIQ	A395BORC6FGVXV	Karl	3	
1	11	B0001PB9FE	A3HDKO7OW0QNK4	Canadian Fan	1	
2	30	B0001PB9FY	A3HDKO7OW0QNK4	Canadian Fan	1	
3	70	B000E7VI7S	AWCBF2ZWIN57F	C. Salcido	0	

In [4]: #Doing some other check using the below query to see whether such reduncdancy is o # From count(\*) values we can see that we have so much of redundant data, so it ha dup\_data = pd.read\_sql\_query(""" select ID,ProductID,USERID , PROFILENAME , Summary ,text ,count(\*) AS COUNT FROM REVIEWS GROUP BY PRODUCTID, SUMMARY, TEXT having count(\*) > 1""",con) dup\_data.head(6)

#### Out[4]:

	ld	ProductId	UserId	ProfileName	Summary	Text	COUNT
0	171154	7310172001	AJD41FBJD9010	N. Ferguson "Two, Daisy, Hannah, and Kitten"	best dog treat great for training all do	Freeze dried liver has a hypnotic effect on do	2
1	217385	7310172101	AJD41FBJD9010	N. Ferguson "Two, Daisy, Hannah, and Kitten"	best dog treat great for training all do	Freeze dried liver has a hypnotic effect on do	2
2	369857	B000084DWM	A3TVZM3ZIXG8YW	christopher hayes	Filler food is empty, leaves your cat always n	This review will make me sound really stupid,	10
3	369801	B000084DWM	A36JDIN9RAAIEC	Jon	Great product, but trust your vet not the hype	I have two cats, one 6 and one 2 years old. Bo	2
4	410265	B000084EZ4	A2FGXWWR8ZU59C	Thomas Lawrence	Cats love the food, but no pull-tab top, and d	I appreciate being able to buy this larger, mo	2
5	410304	B000084EZ4	A29JUMRL1US6YP	НТВК	Fantastic Food for Good Cat Health	The pet food industry can be one of the most i	4

```
In [5]: # Let's see another case:
        dup_data = pd.read_sql_query("""SELECT * FROM REVIEWS
                                            WHERE SCORE != 3 AND UserId = "AJD41FBJD9010"
                                            Order by ProductID""" , con)
        dup_data
```

#### Out[5]:

	ld	ProductId	Userld	ProfileName	HelpfulnessNumerator	HelpfulnessDenominato
0	171152	7310172001	AJD41FBJD9010	N. Ferguson "Two, Daisy, Hannah, and Kitten"	0	
1	171153	7310172001	AJD41FBJD9010	N. Ferguson "Two, Daisy, Hannah, and Kitten"	0	
2	171154	7310172001	AJD41FBJD9010	N. Ferguson "Two, Daisy, Hannah, and Kitten"	0	
3	171189	7310172001	AJD41FBJD9010	N. Ferguson "Two, Daisy, Hannah, and Kitten"	39	5
4	171223	7310172001	AJD41FBJD9010	N. Ferguson "Two, Daisy, Hannah, and Kitten"	1	
5	171228	7310172001	AJD41FBJD9010	N. Ferguson "Two, Daisy, Hannah, and Kitten"	5	

# **Observation:**

#### In above Analysis what we found is:

There are product's having the same productID's with same {'TEXT'}, {'Timestamp'}, {'UserID'}

There are products having the different productID's with same {'TEXT'}, {'Timestamp'}, {"helpfullnessNumerator"} , {"HelpfullnessNumerator"}

We termed such type of the data in our data set as Redundant Data, so we perform various cleaning methods to remove them from

the Data Set.

```
In [6]:
        #Removing the Duplicate data points:
        duplicated data = amazon featured reviews.duplicated(subset={'UserId','ProfileName
        duplicated data = pd.DataFrame(duplicated data , columns=['Boolean'])
        print(duplicated data.head(5))
        #True values in the Boolean Series represents the duplicate data:
        print(duplicated_data['Boolean'].value_counts(dropna=False)) #gives me the total n
        #The total no of duplicates here in the amazon featured reviews are:
        print("total no of duplicates here in the amazon featured reviews are:",duplicated
        #dropping the duplicates:
        final = amazon_featured_reviews.sort_values(by='ProductId',kind='quicksort',ascend
        final = final.drop_duplicates(subset={'UserId','ProfileName','Time','Text'} , keep
        print('\n','DataFrame final shape before removing helpfullness data :', final.shap
        #Also removing the instances where HelpfulnessNumerator >= HelpfulnessDenominator:
        final = final[final['HelpfulnessNumerator'] <= final['HelpfulnessDenominator']]</pre>
        print('final', final.shape)
              Boolean
           0
                False
                False
           1
           2
                False
           3
                False
           4
                False
```

False 365333 160481 True Name: Boolean, dtype: int64 total no of duplicates here in the amazon featured reviews are: Boolean 481 dtype: int64 DataFrame final shape before removing helpfullness data: (364173, 10) final (364171, 10)

160

```
In [7]:
        #Finding the books data in the amazon featured reviews using the regex:
        import re
        print(final.columns)
        def analyzing summary book(filtered data , regex):
            mask_summary = filtered_data.Summary.str.lower().str.contains(regex)
                           filtered data.Text.str.lower().str.contains(regex)
            print(len(filtered data[mask summary].index) , len(filtered data[mask text].in
            print('initial shape of the filtered_data' , filtered_data.shape)
            filtered_data.drop(filtered_data[mask_summary].index , inplace=True , axis=0)
            filtered data.drop(filtered data[mask text].index , axis=0 , inplace=True)
           Index(['Id', 'ProductId', 'UserId', 'ProfileName', 'HelpfulnessNumerator',
                  'HelpfulnessDenominator', 'Score', 'Time', 'Summary', 'Text'],
                 dtype='object')
        #Removing the Books reviews we get below final dataframe:
In [8]:
        #On observation of some of the reviews we got certain keywords related to books,re
        #So we removed these words as much as possible:
        print('final shape before removing books reviews:' , final.shape)
        analyzing_summary_book(final , re.compile(r'reading|books|book|read|study|learn|po
        print('final shape after removing the book reviews:' , final.shape)
           final shape before removing books reviews: (364171, 10)
           2842 36649
           initial shape of the filtered data (364171, 10)
           final shape after removing the book reviews: (326808, 10)
In [9]:
        #Computing the proportion of positive and negative class labels in the DataFrame:
        final['Score'].value counts()
Out[9]:
        1
             276668
              50140
```

Name: Score, dtype: int64

```
In [10]:
         import nltk
         from nltk.stem import SnowballStemmer
         from nltk.corpus import stopwords
         from nltk.stem.wordnet import WordNetLemmatizer
         from nltk.stem import PorterStemmer
         stop = set(stopwords.words('english'))
         print(stop)
         print('\n' , 'length of stopwords set' , len(stop))
         print("*" * 30)
         sno = SnowballStemmer('english')
```

{'further', 're', 'then', 'doesn', 'ours', 'these', "shouldn't", 'm', 'doing', 'by', 'having', 'and', 'more', 'itself', 'where', 'didn', "she's", 'at', 'to', 'before', 'do', 'not', 'off', 'll', 'y', 'your', "you'd", "don't", 'haven', 'w hen', 'yours', 'who', 'shouldn', 'wasn', 'its', 'as', 'have', 'on', 'once', 'a re', "wouldn't", 'such', 'had', 'other', 'only', "it's", "wasn't", 'my', 'were n', 'with', 'can', 'those', 'you', "won't", 'am', "haven't", 'hadn', "you'll", 'of', 'a', 'above', 'so', 'hasn', 'an', "doesn't", 'no', 'does', 'won', 'sam e', 'o', 'our', 'shan', 'any', 'from', 'over', "weren't", 'if', 'between', "mu 'is', 'should', 'will', 'yourselves', 'couldn', 'he', "shoul 'after', stn't", d've", 'down', 'very', 'her', 'out', 'herself', 'it', "didn't", 'all', 'isn', 'or', 'himself', 'up', 'below', 'which', 'him', 'but', 'why', "mightn't", 'nee dn', 'while', 'the', 'ourselves', 'myself', 'yourself', 'some', 'don', 'his', 'their', 'own', "needn't", 'here', 'just', 'has', 'wouldn', 'into', 'be', 'the y', "that'll", 'both', 'under', 'them', 'she', 'there', 'been', 'during', 'no r', 'ain', "hadn't", 'again', 'i', "hasn't", 'how', 'this', 'now', 'for', 'the irs', "you've", 'did', 'few', "shan't", 'themselves', "isn't", 'most', 'might n', 'until', 'about', 'd', 've', "you're", 'mustn', 'hers', 'in', 'were', 'thr ough', 'against', 'that', "couldn't", 'than', 'aren', 'me', 't', 'each', 'wa s', 'because', 'being', 'ma', "aren't", 'whom', 's', 'too', 'what', 'we'}

```
length of stopwords set 179
*********
```

### **Observation:**

We found many redundancy in the data set and some of the Books data which does not make any sense here.

We dropped the almost 160K records in data de duplication step.

### Text Preprocessing:

Removing Removing html tags

**Removing Punctuation charcaters** 

### Alphanumeric numbers

### Length of words must be > 2

### Uppercase to Lowercase

### Removing the stop words

### Using the Snowball Stemmer.

```
In [11]:
         # Functions to clean the html tags and punctuation marks using Regular Expression.
         def clean_htmlTags(sentence):
             pattern = re.compile('<.*?>')
             cleaned_text = re.sub(pattern , '' , sentence)
             return cleaned_text
         def clean punc(sentence):
             cleaned = re.sub(r'[!|#|,|?|\'|"]' , r' ' , sentence)
             cleaned = re.sub(r'[.|,|)|(||/|',r'', cleaned)
             return cleaned
```

```
#The below code will remove all the html tags , punctuation marks , uppercase to l
In [12]:
         # are greater than 2 and are alphanumeric . Further we perform the Stemming of the
         all positive words = []
         all_negative_words = []
         i = 0
         str temp = ' '
         final_string = []
         for sent in final['Text'].values:
             filtered sentence=[]
             sent = clean_htmlTags(sent)
             for w in sent.split():
                  for clean word in clean punc(w).split():
                      if((clean_word.isalpha()) and (len(clean_word) > 2)):
                          if(clean_word.lower() not in stop):
                              s = (sno.stem(clean_word.lower())).encode('utf-8')
                              filtered sentence.append(s)
                              if((final['Score'].values)[i] == 'positive'):
                                  all positive_words.append(s)
                              if((final['Score'].values)[i] == 'negative'):
                                  all_negative_words.append(s)
                          else:
                              continue
                      else:
                          continue
             str_temp = b" ".join(filtered_sentence)
             final string.append(str temp)
             i+=1
```

```
In [13]: #Now I have a final string of list of each review and append it to the new columns
         final['CleanedText'] = final string
         final['CleanedText'] = final['CleanedText'].str.decode('utf-8')
         final.shape
Out[13]: (326808, 11)
In [14]:
         #Making backup of th pre processed data for the future use:
         final backup = final
In [15]:
         final_backup.shape #to use the dataframe in future if required
Out[15]: (326808, 11)
In [75]:
         #Now lets take roughly same proportion of each of positive and negative review fr
         #the further data:
         #We can process our next tasks with whole amount of the data but we are bounded wi
         # To sample 80K points :
         final clean = final.iloc[:5000:]
         print(final clean.shape)
         print(final_clean['Score'].value_counts())
            (5000, 11)
                 4171
                  829
            Name: Score, dtype: int64
In [76]:
         #Sort the final data frame by timestamp values:
         final_clean['Time'] = pd.to_datetime(final['Time'],unit='s')
         final clean = final clean.sort values(by='Time')
         final clean.shape
Out[76]: (5000, 11)
```

### **DBSCAN Algorithm Implementation:**

```
In [77]: from sklearn.cluster import DBSCAN
         text reviews = final['Text'].values
         #The below function will find the Kth distance to the points in the cluster:
         def Kth_neighbour_distance(vect , n):
             distance matrix = []
             for p in vect:
                 p_vect_distance = np.sort(np.sum((vect - p)**2,axis=1),axis=None)
                 distance_matrix.append(p_vect_distance[n])
             return np.sqrt(np.array(distance_matrix))
         from wordcloud import WordCloud, STOPWORDS
         stopwords = set(STOPWORDS)
         def cluster wordcloud(text):
             wordcloud = WordCloud(max font size=50, max words=100, stopwords=stopwords , bac
             plt.figure()
             plt.imshow(wordcloud, interpolation="bilinear")
             plt.axis("off")
             plt.show()
```

```
In [109]: | text reviews = final['Text'].values
          #We can see some of the labels in the DBSCAN model is -1 which represent the nois
          # the noisy data too and represent the reviews in them in a wordcloud.
          def DBSCAN_implementation_different_eps(n_eps , min_pts , vector):
              for eps val in n eps:
                  model = DBSCAN(eps=eps val, min samples=min pts).fit(vector)
                  print("*" * 30, "DBSCAN with EPS = ", eps val, " ", "*" * 30)
                  clusters list = list(set(model.labels ))
                  #finding the length of the cluster:
                  n clusters = len(set(model.labels ))
                  print("DBSCAN with EPS =%.3f and min pts = %d the no. of Clusters = %d"%()
                  for cluster in clusters_list:
                       review count = 1
                      print("*" * 100)
                      if cluster == -1:
                           print("Noisy point label in cluster - ",cluster)
                           print("Reviews of cluster = ",cluster+1)
                           print("*" * 100)
                      for i in range(model.labels .shape[0]):
                           if model.labels [i] == cluster:
                               if review_count == 3:
                                   break;
                               else:
                                   print('Review - ',review_count)
                                   print(text_reviews[i])
                                   cluster wordcloud(text reviews[i])
                                   review count += 1
                  print("*" * 100)
                  print("\n")
```

#### **BAG OF WORDS:**

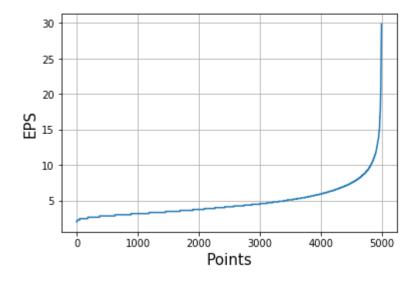
```
In [97]: # Creating the training data :
         X = final clean['CleanedText']
         y = final_clean['Score']
         print(X.shape , y.shape)
            (5000,)(5000,)
```

```
In [98]:
         # Computing the Train Vectorizer :
         count vect = CountVectorizer(ngram range=(1,1) , min df=200)
         X bow = count vect.fit transform(X)
         print(X bow.shape)
         type(X_bow)
            (5000, 148)
Out[98]: scipy.sparse.csr.csr_matrix
```

### Find the best 'Eps' using the elbow-knee method.(BoW)

```
In [81]:
         #bow data.shape[1]
         min_pts = 2*X_bow.shape[1]
         # Computing the distances for nth-nearest neighbours:
         dist_matrix = Kth_neighbour_distance(X_bow.toarray(),min_pts)
         dist sorted = np.sort(dist matrix)
         X_points = [x for x in range(X_bow.shape[0])]
         # Plotting Distance(Eps or Kth distances) VS points:
         plt.plot(X points, dist sorted)
         plt.xlabel('Points',size=15)
         plt.ylabel('EPS',size=15)
         plt.title('Distances and Points Graph Plot\n',size=18)
         plt.grid()
         plt.show()
```

### Distances and Points Graph Plot



### Implementing DBSCAN

So after getting best EPS lets try different nearby eps to see that the change in eps what will happen to our clusters

```
In [110]: eps_list = [8,10,12,14,15]
DBSCAN_implementation_different_eps(eps_list,min_pts,X_bow.toarray())
```

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



#### Review - 2

Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



Noisy point label in cluster - -1

Review - 1

Dogs just love Freeze dried liver and this is a good price for this size container.



My 5 month old lab goes nuts over these liver treats. Our vet recommended the se as a healthy treat. Our pup acts like a cat with catnip over these. A big hit. The price and size are excellent and should last a good while.



#### Review - 1

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



\*\*\*\*\*\*\*\*

Noisy point label in cluster - -1 Review - 1

Dogs just love Freeze dried liver and this is a good price for this size container.

Dogs love good price Freeze liverdried

#### Review - 2

<a href="http://www.amazon.com/gp/product/B001AGXEAG">Beetlejuice (20th Annive
rsary Deluxe Edition)</a>I am very impressed with the new transfer of this fil
m. The features are not that great but the cartoon series was pretty cool. I a
m interested to find out how good the blu-ray version is. Sweet dvd!!!



```
********
                   ****** DBSCAN with EPS = 12
DBSCAN with EPS =12.000 and min_pts = 296 the no. of Clusters = 2
Reviews of cluster =
```

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



Review - 2

Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



Noisy point label in cluster - -1

Review - 1

Dogs just love Freeze dried liver and this is a good price for this size conta iner.



#### Review - 2

Just wanted to post a correction to what the previous review said...<br/>
/><br />The film is NOT based on the cartoon it's the other way around. The cartoon came later.



**************	*********
*******	
****** DBSCAN with EPS =	14 **************
*****	
DBSCAN with EPS =14.000 and min_pts = 296 the no.	of Clusters = 2

Reviews of cluster = 1

Review - 1

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calonics non nacket. Thank you Anchon Fanmel



#### Review - 2

Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



\*

\*\*\*\*\*\*\*

Noisy point label in cluster - -1

Review - 1

Just wanted to post a correction to what the previous review said...<br/><br/>/><br/>br />The film is NOT based on the cartoon it's the other way around. The cartoon came later.

# around came

Review -

Great product. The best way to kill a mole. I bought these traps on-line onl y because I couldn't find them in the stores. I've killed 3 this month. 6 fo r the summer. Well worth the money.



\*\*\*\*\*\* DBSCAN with EPS = 15 \*\*\*\*\* DBSCAN with EPS =15.000 and min\_pts = 296 the no. of Clusters = 2 \* Reviews of cluster = 1

\*

Review - 1

\*\*\*\*\*\*\*\*

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



\*

\*\*\*\*\*\*\*

Noisy point label in cluster - -1

Review - 1

Just wanted to post a correction to what the previous review said...<br/><br/>/><br/>br />The film is NOT based on the cartoon it's the other way around. The cartoon came later.



Review - 2

Great product. The best way to kill a mole. I bought these traps on-line onl y because I couldn't find them in the stores. I've killed 3 this month. 6 fo r the summer. Well worth the money.

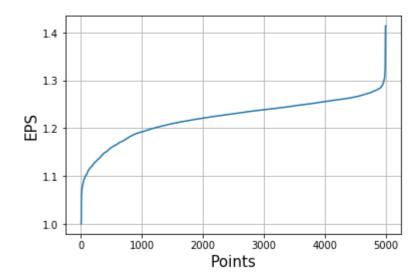


# **TF-idf vector using Dataset:**

```
In [129]: #Uni Gram Train dataset Tf-IDF Vector:
          tfidf_vector = TfidfVectorizer(min_df=200 )
          X_tfidf= tfidf_vector.fit_transform(X)
          print('X_tfidf.get_shape() : ' , X_tfidf.get_shape())
            X_tfidf.get_shape() : (5000, 148)
```

```
In [130]:
          #bow data.shape[1]
          min_pts = 2*X_tfidf.shape[1]
          # Computing the distances for nth-nearest neighbours:
          dist_matrix = Kth_neighbour_distance(X_tfidf.toarray(),min_pts)
          dist sorted = np.sort(dist matrix)
          X_points = [x for x in range(X_tfidf.shape[0])]
          # Plotting Distance(Eps or Kth distances) VS points:
          plt.plot(X_points, dist_sorted)
          plt.xlabel('Points', size=15)
          plt.ylabel('EPS', size=15)
          plt.title('Distances and Points Graph Plot\n', size=18)
          plt.grid()
          plt.show()
```

### Distances and Points Graph Plot



```
In [131]: eps list = [0.5,0.8,1.2,2,3]
          DBSCAN_implementation_different_eps(eps_list,min_pts,X_tfidf.toarray())
```

```
****** DBSCAN with EPS = 0.5
******
DBSCAN with EPS =0.500 and min pts = 296 the no. of Clusters = 1
**************************
********
```

Noisy point label in cluster - -1

Review - 1

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



#### Review - 2

Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



\*\*\*\*\*\*\*\* \*\*\*\*\*\*\*\* \*\*\*\*\*\* DBSCAN with EPS = 0.8 DBSCAN with EPS =0.800 and min\_pts = 296 the no. of Clusters = 1 \*\*\*\*\*\*\*\* Noisy point label in cluster - -1 Review - 1

This product by Archer Farms is the best drink mix ever. Just mix a flavored p

acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



#### Review - 2

Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



\* \*\*\*\*\*\* DBSCAN with EPS = 1.2 DBSCAN with EPS =1.200 and min pts = 296 the no. of Clusters = 1 \*\*\*\*\*\*\*\*\* Reviews of cluster = 1 \* \*\*\*\*\*\*\*\*

#### Review - 1

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



\* \*\*\*\*\*\*\*\* \*\*\*\*\*\* DBSCAN with EPS = 2 \*\*\*\*\* DBSCAN with EPS =2.000 and min pts = 296 the no. of Clusters = 1 \* \*\*\*\*\*\*\*\* Reviews of cluster = 1 \*\*\*\*\*\*\*\*

#### Review - 1

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



Our dogs just love them. I saw them in a pet store and a tag was attached r egarding them being made in China and it satisfied me that they were safe.



\*\*\*\*\*\* DBSCAN with EPS = 3 DBSCAN with EPS =3.000 and min pts = 296 the no. of Clusters = 1 \*\*\*\*\*\*\*\* Reviews of cluster = 1 \*\*\*\*\*\*\*

Review - 1

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



Review - 2

Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



\*\*\*\*\*\*\*\*

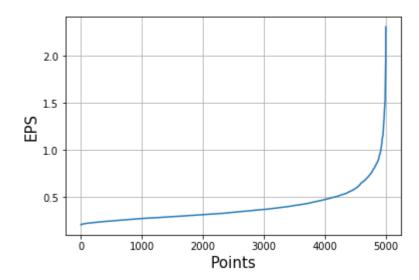
### Word2Vec

```
In [114]: | # Lets compute a list of words for Train Data to compute the word2vec:
          # Now we will Train our own model using Word2vec:
          list of sentence=[]
          for sent in X:
              list_of_sentence.append(sent.split())
          print(list_of_sentence[0])
            ['beetlejuic', 'well', 'written', 'movi', 'everyth', 'excel', 'act', 'specia
            1', 'effect', 'delight', 'chose', 'view', 'movi']
In [115]: # Creating the gensim model
          import gensim
          import warnings
          warnings.filterwarnings('ignore')
          model = gensim.models.Word2Vec(list_of_sentence , min_count=5 , size=200 , worker
          vocab_list = list(model.wv.vocab)
```

```
In [116]:
          #Computing the Average word2vec for Data:
           sent_vect= [] #this will hold the all values of the vectors of each words
          for sen in tqdm(list_of_sentence):
               sen vec = np.zeros(200)
               word_count=0
               for word in sen:
                   if word in vocab list:
                       vector_of_current_word = model.wv[word]
                       sen_vec+=vector_of_current_word
                      word_count+=1
               if word_count != 0:
                   sen_vec/=word_count
               sent_vect.append(sen_vec)
          print(len(sent_vect))
          print(len(sent_vect[0]))
            100%
                                                         5000/5000 [00:12<00:00, 405.18it/
            s]
            5000
            200
In [117]:
          sent_vect = np.array(sent_vect)
          type(sent_vect)
Out[117]: numpy.ndarray
```

```
In [118]:
          #bow data.shape[1]
          min_pts = 2*sent_vect[0].shape[0]
          # Computing the distances for nth-nearest neighbours:
          dist_matrix = Kth_neighbour_distance(sent_vect,min_pts)
          dist sorted = np.sort(dist matrix)
          X_points = [x for x in range(len(sent_vect))]
          # Plotting Distance(Eps or Kth distances) VS points:
          plt.plot(X_points, dist_sorted)
          plt.xlabel('Points', size=15)
          plt.ylabel('EPS', size=15)
          plt.title('Distances and Points Graph Plot\n', size=18)
          plt.grid()
          plt.show()
```

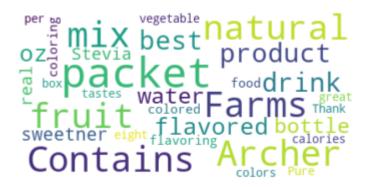
### Distances and Points Graph Plot



```
In [132]: eps list = [0.5, 0.7, 1.2, 1.4, 1.5]
           DBSCAN_implementation_different_eps(eps_list,min_pts,sent_vect)
```

```
******* DBSCAN with EPS = 0.5
******
DBSCAN with EPS =0.500 and min pts = 296 the no. of Clusters = 2
**********************************
*********
Reviews of cluster = 1
********
```

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



#### Review - 2

Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



\*\*\*\*\*\*\*\*

```
Noisy point label in cluster - -1
Review - 1
```

okay, it's freeze-dried liver cube-lets. my common sense tells me that for a lot less than the price of this treat i could buy real liver, cube it and free ze it. it would serve the same purpose for a lot less money, and it would not be over-processed.<br />that said, our dog would do back flips for this treat, so if you're made of money, go ahead. you'll make your dog's day :-)

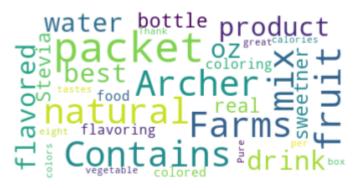


awesome<br/>
'><br/>
'>I've been watching Beatlejuice for as long as i can remembe r. ive seen it so many times its now easy for me to quote lines. this is a gre at humorous movie that will forever and always be even better the more times i watch it. definately a classic.<br/>
'><br/>
Michael Keaton is ghoulishly funny in this wonderful blend of horror and humor. Enjoyable family viewing on a Hal loween night. Invite the neighborhood goblins over.



#### Review - 1

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



Noisy point label in cluster - -1

Review - 1

okay, it's freeze-dried liver cube-lets. my common sense tells me that for a lot less than the price of this treat i could buy real liver, cube it and free ze it. it would serve the same purpose for a lot less money, and it would not be over-processed.<br />that said, our dog would do back flips for this treat, so if you're made of money, go ahead. you'll make your dog's day :-)



#### Review - 2

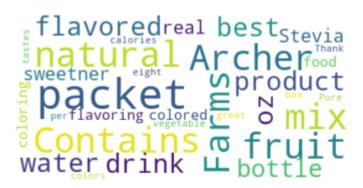
I love this little gizmo. I wouldn't expect it to rid you of fleas all on its own, but it is a great assist. I think it is most valuable in letting you know how effective your other efforts are, because if you have fleas, they \*will\* f ind their way into this trap. When I first started treating this season, I put this trap out. Overnight, it was covered in fleas, just like in the product pi ctures. As things started to get better, I noticed a decrease in how many flea s were being trapped. The last time I changed a disk, I caught several moths a nd such and one flea. Success!!!<br />I recommend <a href="http://www.amazon.c om/gp/product/B001VJ3FP6">SentryHOME Household Flea and Tick Spray, 20-Ounce</ a> and <a href="http://www.amazon.com/gp/product/B0051GCTAW">Fiproguard Fiprog uard Topical Flea and Tick for Cats, All Weights</a> as two of the most effect ive anodusts for midding your home of flees

```
"effective etting
last
 В
```

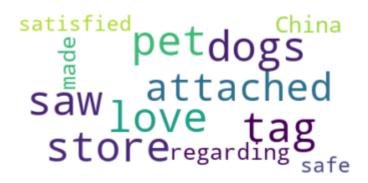
\* \*\*\*\*\*\*\*\* \* DBSCAN with EPS = 1.2 DBSCAN with EPS =1.200 and min\_pts = 296 the no. of Clusters = 2 \* \*\*\*\*\*\*\*\* Reviews of cluster = \* \*\*\*\*\*\*\*\*

Review - 1

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



\*\*\*\*\*\*\*\*

Noisy point label in cluster - -1

Review - 1

I love this little gizmo. I wouldn't expect it to rid you of fleas all on its own, but it is a great assist. I think it is most valuable in letting you know how effective your other efforts are, because if you have fleas, they \*will\* f ind their way into this trap. When I first started treating this season, I put this trap out. Overnight, it was covered in fleas, just like in the product pi ctures. As things started to get better, I noticed a decrease in how many flea s were being trapped. The last time I changed a disk, I caught several moths a nd such and one flea. Success!!!<br />I recommend <a href="http://www.amazon.c om/gp/product/B001VJ3FP6">SentryHOME Household Flea and Tick Spray, 20-Ounce</ a> and <a href="http://www.amazon.com/gp/product/B0051GCTAW">Fiproguard Fiprog uard Topical Flea and Tick for Cats, All Weights</a> as two of the most effect ive products for ridding your home of fleas.



\*\*\*\*\*\*\*\*

\*\*\*\*\*\* DBSCAN with EPS = 1.4 \*\*\*\*\*\*

DBSCAN with EPS =1.400 and min\_pts = 296 the no. of Clusters = 1 \* \*\*\*\*\*\*\*\*

Reviews of cluster = 1

\* \*\*\*\*\*\*\*\*

# Review - 1

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



#### Review - 2

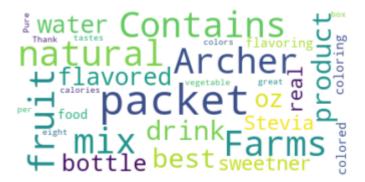
Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



\* \*\*\*\*\*\*\*\*\* \*\*\*\*\*\* DBSCAN with EPS = 1.5 \*\*\*\*\*\*\* DBSCAN with EPS =1.500 and min pts = 296 the no. of Clusters = 1 \* \*\*\*\*\*\*\*\*\* Reviews of cluster = \* \*\*\*\*\*\*\*\*

# Review - 1

This product by Archer Farms is the best drink mix ever. Just mix a flavored packet with your 16 oz. water bottle. Contains the all natural sweetner Stev ia, real fruit flavoring and no food coloring. Just colored with fruit or ve getable colors. Pure and natural and tastes great. There are eight packets i n a box and only contains 10 calories per packet. Thank you Archer Farms!



Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



\*\*\*\*\*\*\*\*

TF-idf W2vec:

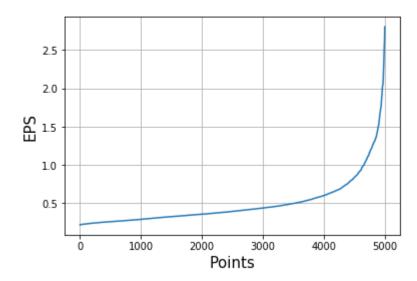
```
In [120]: #Computing the TF-idf values for the Train Data:
          tfidf model = TfidfVectorizer()
          tf idf matrix = tfidf model.fit transform(X)
          # we are converting a dictionary with word as a key, and the tfidf as a value
          dictionary = dict(zip(tfidf_model.get_feature_names(), list(tfidf_model.idf_)))
```

```
In [121]: # Creating the gensim model
          model = gensim.models.Word2Vec(list_of_sentence , min_count=5 , size=200 , worker
          vocab list = list(model.wv.vocab)
In [122]:
         # TF-IDF weighted Word2Vec
          tfidf_feat = tfidf_model.get_feature_names() # tfidf words/col-names
          # final tf idf is the sparse matrix with row= sentence, col=word and cell val = t
          tfidf sent vectors = []; # the tfidf-w2v for each sentence/review is stored in the
          row=0;
          for sent in tqdm(list of sentence): # for each review/sentence
              sent_vec = np.zeros(200) # 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 vocab list:
                      vec = model.wv[word]
                      tf idf = dictionary[word]*sent.count(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
          print('\n' , len(tfidf_sent_vectors))
          print(len(tfidf sent vectors[0]))
            100%
                                                         5000/5000 [00:17<00:00, 290.29it/
            s]
             5000
            200
In [123]:
          #Converting the type of tfidf_sent_vectors_train to ndarray:
          tfidf_sent_vectors = np.array(tfidf_sent_vectors)
          type(tfidf_sent_vectors)
```

```
Out[123]: numpy.ndarray
```

```
In [124]:
          #bow data.shape[1]
          min_pts = 2*tfidf_sent_vectors[0].shape[0]
          # Computing the distances for nth-nearest neighbours:
          dist_matrix = Kth_neighbour_distance(tfidf_sent_vectors,min_pts)
          dist sorted = np.sort(dist matrix)
          X_points = [x for x in range(len(tfidf_sent_vectors))]
          # Plotting Distance(Eps or Kth distances) VS points:
          plt.plot(X_points, dist_sorted)
          plt.xlabel('Points', size=15)
          plt.ylabel('EPS', size=15)
          plt.title('Distances and Points Graph Plot\n', size=18)
          plt.grid()
          plt.show()
```

# Distances and Points Graph Plot



```
M = [133]: eps list = [0.7, 1.2, 1.4, 1.5, 2]
            DBSCAN_implementation_different_eps(eps_list,min_pts,tfidf_sent_vectors)
```

```
****** DBSCAN with EPS = 0.7
******
DBSCAN with EPS =0.700 and min pts = 296 the no. of Clusters = 2
*******************************
*********
Reviews of cluster = 1
********
```

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



Review - 2

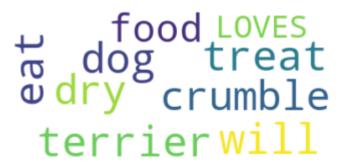
Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



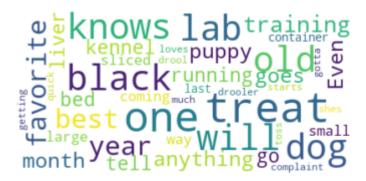
\* \*\*\*\*\*\*\*\*

Noisy point label in cluster - -1 Review - 1

This is the only dog treat that my terrier will eat. We crumble over his dry f ood and he LOVES it.



I have a 2 1/2 year old black lab and these are her favorite treats! They are the best for training, my dog will do just about anything to get one of these treats. Even my 3 month old black lab puppy goes running to his kennel when I tell him to go to bed because he knows that a liver treat is coming his way. S ince they are sliced small a large container of these will last a while. The o nly complaint I have is that my dog loves these so much that if she knows shes getting one she starts to drool, and she's not a drooler... So I gotta toss on e to her quick!!



# Review - 1

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



Noisy point label in cluster - -1

Review - 1

I have no idea what all those people are saying but these bars don't taste tha t great...it is full of sugar and high fructose corn syrup. I much prefer luna bars or the south beach meal bars--which all taste tons better and are healthi er.

# Review - 2

We moved from Science Diet lamb and Rice to Diamond Beef and Rice. Our dog, a 8 year old 751b Rhodesian Ridgeback, enjoys the food (she enjoys all food.)and we're feeding her the same amount as before with no changes in weight since th e switch. We're on our 2nd bag and I believe this is a good quality mid grade

food and we will continue to use it as it offers good nutrition at a great val I appreciate more than anything that Diamond has not increased price by r educing the weight of the bag. 10 years ago a 40lb bag was standard and now m ost brands are selling their "big bags at 35lbs or even less. Just like with people food, price increases are often disguised with reduced quantity in simi lar packaging. Bravo to Diamond for not jumping on that bandwagon!



```
*******
****** DBSCAN with EPS = 1.4
DBSCAN with EPS =1.400 and min_pts = 296 the no. of Clusters = 1
********
Reviews of cluster =
********
```

\*

# Review - 1

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



## Review -

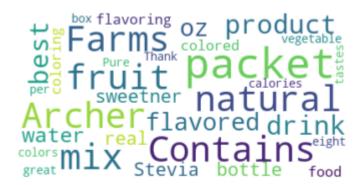
Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



```
****** DBSCAN with EPS = 1.5
DBSCAN with EPS =1.500 and min pts = 296 the no. of Clusters = 1
Reviews of cluster =
```

\*\*\*\*\*\*\*\*

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



Review - 2

Our dogs just love them. I saw them in a pet store and a tag was attached r egarding them being made in China and it satisfied me that they were safe.



\* \*\*\*\*\*\*\*\* \*\*\*\*\*\* DBSCAN with EPS = 2 DBSCAN with EPS =2.000 and min pts = 296 the no. of Clusters = 1 \* \*\*\*\*\*\*\*\* Reviews of cluster = \*\*\*\*\*\*\*\*

#### Review - 1

This product by Archer Farms is the best drink mix ever. Just mix a flavored p acket with your 16 oz. water bottle. Contains the all natural sweetner Stevia, real fruit flavoring and no food coloring. Just colored with fruit or vegetabl e colors. Pure and natural and tastes great. There are eight packets in a box and only contains 10 calories per packet. Thank you Archer Farms!



#### Review - 2

Our dogs just love them. I saw them in a pet store and a tag was attached reg arding them being made in China and it satisfied me that they were safe.



\*\*\*\*\*\*\*\*

# **Conclusion:**

1. As compared to the K-Means and Agglomerative Clustering, DBSCAN is a better choice in terms of Noise and non globular shapes.

It has handled noisy points(i.e having the labels as '-1') very well.