## 9 Clustering

## 1. DBSCAN

Using DBSCAN iterate (for-loop) through different values of min\_samples (1 to 10) and epsilon (.05 to .5, in steps of .01) to find clusters in the road-data used in the Lesson and calculate the Silohouette Coeff for min\_samples and epsilon. Plot **one** line plot with the multiple lines generated from the min\_samples and epsilon values. Use a 2D array to store the SilCoeff values, one dimension represents min\_samples, the other represents epsilon.

```
In [1]: #Package Import
        import pandas as pd
        # allow plots to appear in the notebook
        %matplotlib notebook
        import matplotlib.pyplot as plt
        import seaborn
        from mpl toolkits.mplot3d import Axes3D
        plt.rcParams['font.size'] = 14
        from sklearn import metrics
        from sklearn.cluster import DBSCAN
        import numpy as np
        from tqdm import tqdm
In [2]: #Dataset import
        X = pd.read csv(r'C:\Users\carlb\Desktop\mlnn\data\3D spatial network.t
        xt.gz', header=None, names=['osm', 'lat', 'lon', 'alt'])
        X = X.drop(['osm'], axis=1).sample(30000)
        X.head()
Out[2]:
                    lat
                             lon
                                     alt
```

```
lat
                              lon
                                       alt
          325811 10.178636 57.322604 85.041087
                 8.811170 56.765342 9.607123
          434617
          24456 8.374593 56.875030 22.505016
          200404 10.350397 57.476084 25.387797
          168698 9.448692 56.696825 22.683633
In [3]: #Normalize sample from dataset
         XX = X.copy()
         XX['alt'] = (X.alt - X.alt.mean())/X.alt.std()
         XX['lat'] = (X.lat - X.lat.mean())/X.lat.std()
         XX['lon'] = (X.lon - X.lon.mean())/X.lon.std()
In [4]: #eps loop 0.05 to 0.5 (steps 0.01) min samples=10
         eps range = [x / 100.0 \text{ for } x \text{ in } range(5,51,1)]
         eps scores 10 = []
         for e in tqdm(eps range):
             dbscan = DBSCAN(eps=e, min samples=10)
             labels = dbscan.fit predict(XX[['lon', 'lat', 'alt']])
             eps scores 10.append(metrics.silhouette score(XX[['lon', 'lat', 'al
         t'll. labels))
         100%|
                                                                 | 46/46 [19:30<00:0
         0, 25.83s/it]
In [5]: #eps loop 0.05 to 0.5 (steps 0.01) min samples=9
         eps range = [x / 100.0 \text{ for } x \text{ in } range(5,51,1)]
         eps scores 9 = []
         for e in tqdm(eps range):
             dbscan = DBSCAN(eps=e, min samples=9)
             labels = dbscan.fit predict(XX[['lon', 'lat', 'alt']])
             eps scores 9.append(metrics.silhouette score(XX[['lon', 'lat', 'al
         t']], labels))
```

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100%|
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        0, 25.80s/itl
In [6]: #eps loop 0.05 to 0.5 (steps 0.01) min samples=8
         eps range = [x / 100.0 \text{ for } x \text{ in range}(5,51,1)]
         eps scores 8 = []
         for e in tqdm(eps range):
             dbscan = DBSCAN(eps=e, min samples=8)
             labels = dbscan.fit predict(XX[['lon', 'lat', 'alt']])
             eps scores 8.append(metrics.silhouette score(XX[['lon', 'lat', 'al
         t']], labels))
        100%|
                                                                | 46/46 [19:46<00:0
        0, 25.75s/it]
In [7]: #eps loop 0.05 to 0.5 (steps 0.01) min samples=7
        eps range = [x / 100.0 \text{ for } x \text{ in range}(5,51,1)]
        eps scores 7 = []
         for e in tqdm(eps range):
             dbscan = DBSCAN(eps=e, min samples=7)
             labels = dbscan.fit predict(XX[['lon', 'lat', 'alt']])
             eps scores 7.append(metrics.silhouette score(XX[['lon', 'lat', 'al
         t'll, labels))
        100%
                                                                | 46/46 [19:53<00:0
        0, 25.79s/it]
In [8]: #eps loop 0.05 to 0.5 (steps 0.01) min samples=6
         eps range = [x / 100.0 \text{ for } x \text{ in } range(5,51,1)]
        eps scores 6 = []
         for e in tgdm(eps range):
             dbscan = DBSCAN(eps=e, min samples=6)
             labels = dbscan.fit predict(XX[['lon', 'lat', 'alt']])
             eps scores 6.append(metrics.silhouette score(XX[['lon', 'lat', 'al
        t'll, labels))
```

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100%|
                                                                 | 46/46 [20:18<00:0
         0, 25.77s/itl
 In [9]: #eps loop 0.05 to 0.5 (steps 0.01) min samples=5
          eps range = [x / 100.0 \text{ for } x \text{ in range}(5,51,1)]
         eps scores 5 = []
          for e in tgdm(eps range):
              dbscan = DBSCAN(eps=e, min samples=5)
              labels = dbscan.fit predict(XX[['lon', 'lat', 'alt']])
              eps scores 5.append(metrics.silhouette score(XX[['lon', 'lat', 'al
          t']], labels))
         100%|
                                                                 | 46/46 [20:59<00:0
         0, 25.79s/it]
In [10]: #eps loop 0.05 to 0.5 (steps 0.01) min samples=4
          eps range = [x / 100.0 \text{ for } x \text{ in range}(5,51,1)]
         eps scores 4 = []
          for e in tqdm(eps range):
              dbscan = DBSCAN(eps=e, min samples=4)
              labels = dbscan.fit predict(XX[['lon', 'lat', 'alt']])
              eps scores 4.append(metrics.silhouette score(XX[['lon', 'lat', 'al
          t'll, labels))
         100%|
                                                                  46/46 [22:22<00:0
         0, 25.74s/it]
In [11]: #eps loop 0.05 to 0.5 (steps 0.01) min samples=3
          eps range = [x / 100.0 \text{ for } x \text{ in } range(5,51,1)]
         eps scores 3 = []
          for e in tqdm(eps range):
              dbscan = DBSCAN(eps=e, min samples=3)
              labels = dbscan.fit predict(XX[['lon', 'lat', 'alt']])
              eps scores 3.append(metrics.silhouette score(XX[['lon', 'lat', 'al
          t']], labels))
```

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100%|
                                                                   46/46 [25:36<00:0
          0, 25.60s/itl
In [12]: #eps loop 0.05 to 0.5 (steps 0.01) min samples=2
          eps range = [x / 100.0 \text{ for } x \text{ in range}(5,51,1)]
          eps scores 2 = []
          for e in tgdm(eps range):
              dbscan = DBSCAN(eps=e, min samples=2)
              labels = dbscan.fit predict(XX[['lon', 'lat', 'alt']])
              eps scores 2.append(metrics.silhouette score(XX[['lon', 'lat', 'al
          t']], labels))
          100%|
                                                                 | 46/46 [37:05<00:0
          0, 25.90s/it]
In [13]: #eps loop 0.05 to 0.5 (steps 0.01) min samples=1
          eps range = [x / 100.0 \text{ for } x \text{ in range}(5,51,1)]
          eps scores 1 = []
          for e in tqdm(eps range):
              dbscan = DBSCAN(eps=e, min samples=1)
              labels = dbscan.fit predict(XX[['lon', 'lat', 'alt']])
              eps scores 1.append(metrics.silhouette score(XX[['lon', 'lat', 'al
          t'll, labels))
          100%|
                                                                46/46 [1:44:29<00:0
          0, 25.75s/it]
In [14]: #make blank df for figure
          index = [x / 100.0 \text{ for } x \text{ in } range(5,51,1)]
          columns = ['one','two','three','four','five','six','seven','eight','nin
          e','ten']
          fig df = pd.DataFrame(index=index, columns=columns)
In [15]: #insert silhouette scores into df
          fig df['one'] = eps scores 1
          fig df['two'] = eps scores 2
```

```
fig_df['three'] = eps_scores_3
fig_df['four'] = eps_scores_4
fig_df['five'] = eps_scores_5
fig_df['six'] = eps_scores_6
fig_df['seven'] = eps_scores_7
fig_df['eight'] = eps_scores_8
fig_df['nine'] = eps_scores_9
fig_df['ten'] = eps_scores_10
```

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In [16]: #line plot of multiple scores
   plt.plot(fig_df['one'], '-o', label='min_smpl_one')
        plt.plot(fig_df['two'], '-o', label='min_smpl_two')
        plt.plot(fig_df['three'], '-o', label='min_smpl_three')
        plt.plot(fig_df['four'], '-o', label='min_smpl_four')
        plt.plot(fig_df['five'], '-o', label='min_smpl_five')
        plt.plot(fig_df['six'], '-o', label='min_smpl_six')
        plt.plot(fig_df['seven'], '-o', label='min_smpl_seven')
        plt.plot(fig_df['eight'], '-o', label='min_smpl_eight')
        plt.plot(fig_df['nine'], '-o', label='min_smpl_nine')
        plt.plot(fig_df['ten'], '-o', label='min_smpl_ten')
        plt.xlabel('eps_value')
        plt.ylabel('silhouette coefficient')
        plt.show()
```

