```
In [1]: from Bio import SeqIO
         import numpy as np
         from sklearn.manifold import MDS
         from sklearn.cluster import KMeans
         import matplotlib.pyplot as plt
         import pandas as pd
 In [2]: def hamming distance(s1, s2):
             if len(s1) != len(s2):
                 raise ValueError("Strand lengths are not equal!")
             return sum(ch1 != ch2 for ch1,ch2 in zip(s1,s2))
 In [3]: | seqList=[]
 In [4]: for record in SeqIO.parse("HW2.fas", "fasta"):
             seqList.append(record.seq)
 In [5]: | hdList=[]
 In [6]: for x in seqList:
             for y in seqList:
                 hdList.append(hamming distance(x,y))
 In [7]: len(hdList)
 Out[7]: 14400
 In [8]: matrix=np.array(hdList)
         matrix
 Out[8]: array([ 0, 1, 1, ..., 28, 28, 0])
 In [9]: matrix.shape
 Out[9]: (14400,)
In [10]: | matrix=matrix.reshape(120,120)
In [11]: matrix
Out[11]: array([[ 0, 1, 1, ..., 76, 74, 79],
                [ 1, 0, 2, ..., 77, 75, 80],
                [1, 2, 0, \ldots, 77, 75, 80],
                [76, 77, 77, \ldots, 0, 4, 28],
                [74, 75, 75, \ldots, 4, 0, 28],
                [79, 80, 80, ..., 28, 28, 0]])
In [12]: embedding=MDS(n_components = 2)
```

In [15]: xtransform

```
Out[15]: array([[ 336.21717018, 139.40752686],
                [ 338.25587276, 141.05911055],
                [ 338.49797387, 140.71737312],
                [ 342.41338996, 140.03250948],
                [ 342.27105178, 141.01730558],
                [ 327.65043255, 135.70759135],
                [ 338.61807982, 140.5400141 ],
                [ 334.93867641, 144.37553733],
                [ 338.10443632, 141.5667336 ],
                [ 334.9887192 , 149.65042408],
                [ 337.50040771, 136.34222127],
                [ 341.83227748, 141.19036268],
                [ 332.16003933, 135.74159982],
                [ 338.12264207, 141.22257478],
                [ 338.37795136, 140.89058049],
                [ 332.4019961 , 137.73938878],
                [ 318.17774657, 279.15373086],
                [ 315.40943539, 284.79806639],
                [ 310.49883246, 279.81182995],
                [ 318.91047806, 275.56563622],
                [ 314.86295133, 285.16771371],
                [ 315.70391649, 284.46043971],
                [ 315.57390027, 277.63251426],
                [ 315.3587506 , 281.29820653],
                [ 308.43046049, 286.96651924],
                [ 315.34355635, 284.68094408],
                [ 316.08228527, 288.91389387],
                [ 314.44742174, 275.08415142],
                [ 305.63688618, 278.79904357],
                [ 314.13879099, 270.57893388],
                [ 307.69161122, 270.7514105 ],
                [ 310.30129998, 280.19110367],
                [ 315.58847559, 279.8325568 ],
                [ 301.31345255, 277.60056464],
                [ 315.64858003, 282.60461182],
                [ 313.56736905, 285.44175016],
                [ 305.26911398, 279.20891275],
                [ 315.6293873 , 284.8422978 ],
                [ 307.62770316, 286.88879029],
                [ 313.72461519, 261.4947599 ],
                [ 336.01295514, 190.77543241],
                [ 311.70317345, 283.3179049 ],
                [-123.5723512, -229.61648994],
                [-129.09383428, -220.11025011],
                [-128.8224948, -228.790318],
                [-113.90864987, -204.93896562],
                [-120.75632486, -207.50022666],
                [-130.47997914, -214.9822144],
                [-123.40428074, -216.85874697],
                [-124.5115173, -219.01343547],
                [-128.5570011, -224.02972908],
                [-108.67493099, -199.64090883],
                [-135.94733364, -226.28340334],
                [-126.88167566, -225.21599934],
                [-135.24296372, -223.05203203],
                [-118.54264872, -222.70795129],
```

```
[-129.88660142, -222.39447464],
[-122.01969491, -225.90294984],
[-121.67566551, -225.94765277],
[-128.23393852, -233.95086324],
[-121.79652331, -215.19648804],
[-124.71748593, -214.60268979],
[-35.33283015, -260.62737865],
[-37.81782536, -257.99266893],
[-33.13204313, -259.9517154],
[-32.99273649, -257.96830219],
[-32.90593474, -251.97762746],
[-30.77897512, -255.90502253],
[-33.97754007, -246.59079251],
[-30.73427791, -242.48236534],
[-40.10975867, -262.66286476],
[-35.64925226, -244.90499571],
[-39.15284629, -256.56457349],
[-28.28570263, -240.54092306],
[-46.51015602, -262.9642177],
[-33.05563327, -258.09690709],
[-43.71521827, -260.12328634],
[-30.68934992, -257.2673507],
[-42.2220171, -261.31481456],
[-38.47307636, -251.41752909],
[-44.80431592, -254.57002215],
[-280.98089883, -30.48610316],
[-285.84677617, -36.02708279],
[-272.76357818,
                 76.70745516],
[-286.05321502, -30.92741906],
               33.93595905],
[-248.52987944,
[-282.92009272, -40.92582843],
[-283.30098741, -45.63403637],
[-279.43770068, 52.3420009],
[-261.96681492, -41.40782028],
[-261.90167823, -0.5215357],
[-276.4313365, 57.23683836],
                37.338909181,
[-253.68368475,
[-250.12749351, 37.74605668],
[-277.45909425, -40.47305586],
               -35.19958962],
[-239.57540532,
[-287.23797854]
                53.079578681,
[-279.54092839,
                -40.393659861,
[-246.83069795, -61.37865284],
[-275.92682189, -55.66088314],
                43.02789248],
[-255.75608146,
[-276.49148238,
                63.64688616],
[-276.21564329,
                -34.83765091],
[-263.9486101, -61.42460551],
                41.29792444],
[-292.79098421,
[-218.82992818,
               -0.786000661,
[-286.07784944, -51.27146284],
               -46.610564 1,
[-279.54839198,
[-279.05420631,
                46.989775181,
[-281.83578409, -46.83950173],
[-224.82869204, -10.16191534],
                45.56313358],
[-286.25797858,
```

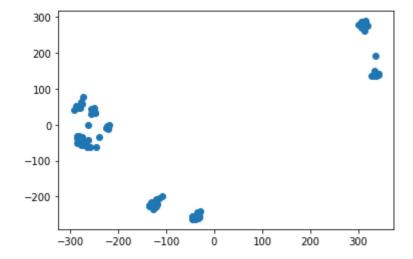
```
[-249.0387382 , 32.22889082],
                  [-222.88634477, -4.70765535],
                  [-272.14795226, -50.89606196],
                  [-255.68219311, 30.25645086],
                  [-249.80029918, 46.61044951],
                  [-276.83166066, -55.96650298],
                  [-258.82907605, -61.36553863],
                  [-220.57192144, -12.50850017]])
In [16]: df=pd.DataFrame(xtransform)
          df
Out[16]:
                       0
                                1
            0 336.217170 139.407527
            1 338.255873 141.059111
            2 338.497974 140.717373
            3 342.413390 140.032509
            4 342.271052 141.017306
           115 -255.682193 30.256451
           116 -249.800299 46.610450
          117 -276.831661 -55.966503
          118 -258.829076 -61.365539
          119 -220.571921 -12.508500
          120 rows × 2 columns
          x=df[0]
In [17]:
```

```
In [18]:
         y=df[1]
```

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```
In [19]: plt.scatter(x,y)
```

Out[19]: <matplotlib.collections.PathCollection at 0x275504c5548>



## Estimate: K=3

```
kmeans=KMeans(n clusters=3, random state=0).fit(df)
In [20]:
In [21]:
    kmeans.labels_
0,
        0,
        2,
        2,
        2, 2, 2, 2, 2, 2, 2, 2, 2])
In [22]: kmeans=kmeans.cluster centers
In [23]:
    df=pd.DataFrame(kmeans)
    df
Out[23]:
         0
      -81.719625 -237.042542
    0
      322.500102
          224.834823
    2 -265.588176
           -5.087267
In [24]: x=df[0]
```

In [ ]:

```
In [25]: y=df[1]
In [26]: plt.scatter(x,y, c=['red','blue','green'])
Out[26]: <matplotlib.collections.PathCollection at 0x2755057a9c8>

200
-100
-200
-100
0 100 200 300
```