

```
In [1]: import numpy as np # linear algebra
import pandas as pd # data processing, CSV file I/O (e.g. pd.read_csv)
```

```
In [3]: crime_rates=pd.read_csv("C:\\Users\\Admin\\Downloads\\assignment 4\\crime_data.csv", in
```

```
In [4]: crime_rates.head()
```

```
Out[4]:
```

|                   | Murder | Assault | UrbanPop | Rape |
|-------------------|--------|---------|----------|------|
| <b>Alabama</b>    | 13.2   | 236     | 58       | 21.2 |
| <b>Alaska</b>     | 10.0   | 263     | 48       | 44.5 |
| <b>Arizona</b>    | 8.1    | 294     | 80       | 31.0 |
| <b>Arkansas</b>   | 8.8    | 190     | 50       | 19.5 |
| <b>California</b> | 9.0    | 276     | 91       | 40.6 |

```
In [5]: crime_rates.describe()
```

```
Out[5]:
```

|              | Murder   | Assault    | UrbanPop  | Rape      |
|--------------|----------|------------|-----------|-----------|
| <b>count</b> | 50.00000 | 50.000000  | 50.000000 | 50.000000 |
| <b>mean</b>  | 7.78800  | 170.760000 | 65.540000 | 21.232000 |
| <b>std</b>   | 4.35551  | 83.337661  | 14.474763 | 9.366385  |
| <b>min</b>   | 0.80000  | 45.000000  | 32.000000 | 7.300000  |
| <b>25%</b>   | 4.07500  | 109.000000 | 54.500000 | 15.075000 |
| <b>50%</b>   | 7.25000  | 159.000000 | 66.000000 | 20.100000 |
| <b>75%</b>   | 11.25000 | 249.000000 | 77.750000 | 26.175000 |
| <b>max</b>   | 17.40000 | 337.000000 | 91.000000 | 46.000000 |

```
In [6]: #standardize the data to normal distribution
from sklearn import preprocessing
crime_rates_standardized = preprocessing.scale(crime_rates)
print(crime_rates_standardized)
crime_rates_standardized = pd.DataFrame(crime_rates_standardized)
```

```
[ [ 1.25517927  0.79078716 -0.52619514 -0.00345116]
  [ 0.51301858  1.11805959 -1.22406668  2.50942392]
  [ 0.07236067  1.49381682  1.00912225  1.05346626]
  [ 0.23470832  0.23321191 -1.08449238 -0.18679398]
  [ 0.28109336  1.2756352  1.77678094  2.08881393]
  [ 0.02597562  0.40290872  0.86954794  1.88390137]
  [-1.04088037 -0.73648418  0.79976079 -1.09272319]
  [-0.43787481  0.81502956  0.45082502 -0.58583422]
  [ 1.76541475  1.99078607  1.00912225  1.1505301 ]
```

```
[ 2.22926518  0.48775713 -0.38662083  0.49265293]
[-0.57702994 -1.51224105  1.21848371 -0.11129987]
[-1.20322802 -0.61527217 -0.80534376 -0.75839217]
[ 0.60578867  0.94836277  1.21848371  0.29852525]
[-0.13637203 -0.70012057 -0.03768506 -0.0250209 ]
[-1.29599811 -1.39102904 -0.5959823  -1.07115345]
[-0.41468229 -0.67587817  0.03210209 -0.34856705]
[ 0.44344101 -0.74860538 -0.94491807 -0.53190987]
[ 1.76541475  0.94836277  0.03210209  0.10439756]
[-1.31919063 -1.06375661 -1.01470522 -1.44862395]
[ 0.81452136  1.56654403  0.10188925  0.70835037]
[-0.78576263 -0.26375734  1.35805802 -0.53190987]
[ 1.00006153  1.02108998  0.59039932  1.49564599]
[-1.1800355  -1.19708982  0.03210209 -0.68289807]
[ 1.9277624  1.06957478 -1.5032153  -0.44563089]
[ 0.28109336  0.0877575  0.31125071  0.75148985]
[-0.41468229 -0.74860538 -0.87513091 -0.521125 ]
[-0.80895515 -0.83345379 -0.24704653 -0.51034012]
[ 1.02325405  0.98472638  1.0789094  2.671197 ]
[-1.31919063 -1.37890783 -0.66576945 -1.26528114]
[-0.08998698 -0.14254532  1.63720664 -0.26228808]
[ 0.83771388  1.38472601  0.31125071  1.17209984]
[ 0.76813632  1.00896878  1.42784517  0.52500755]
[ 1.20879423  2.01502847 -1.43342815 -0.55347961]
[-1.62069341 -1.52436225 -1.5032153  -1.50254831]
[-0.11317951 -0.61527217  0.66018648  0.01811858]
[-0.27552716 -0.23951493  0.1716764  -0.13286962]
[-0.66980002 -0.14254532  0.10188925  0.87012344]
[-0.34510472 -0.78496898  0.45082502 -0.68289807]
[-1.01768785  0.03927269  1.49763233 -1.39469959]
[ 1.53348953  1.3119988  -1.22406668  0.13675217]
[-0.92491776 -1.027393  -1.43342815 -0.90938037]
[ 1.25517927  0.20896951 -0.45640799  0.61128652]
[ 1.13921666  0.36654512  1.00912225  0.46029832]
[-1.06407289 -0.61527217  1.00912225  0.17989166]
[-1.29599811 -1.48799864 -2.34066115 -1.08193832]
[ 0.16513075 -0.17890893 -0.17725937 -0.05737552]
[-0.87853272 -0.31224214  0.52061217  0.53579242]
[-0.48425985 -1.08799901 -1.85215107 -1.28685088]
[-1.20322802 -1.42739264  0.03210209 -1.1250778 ]
[-0.22914211 -0.11830292 -0.38662083 -0.60740397]]
```

In [8]:

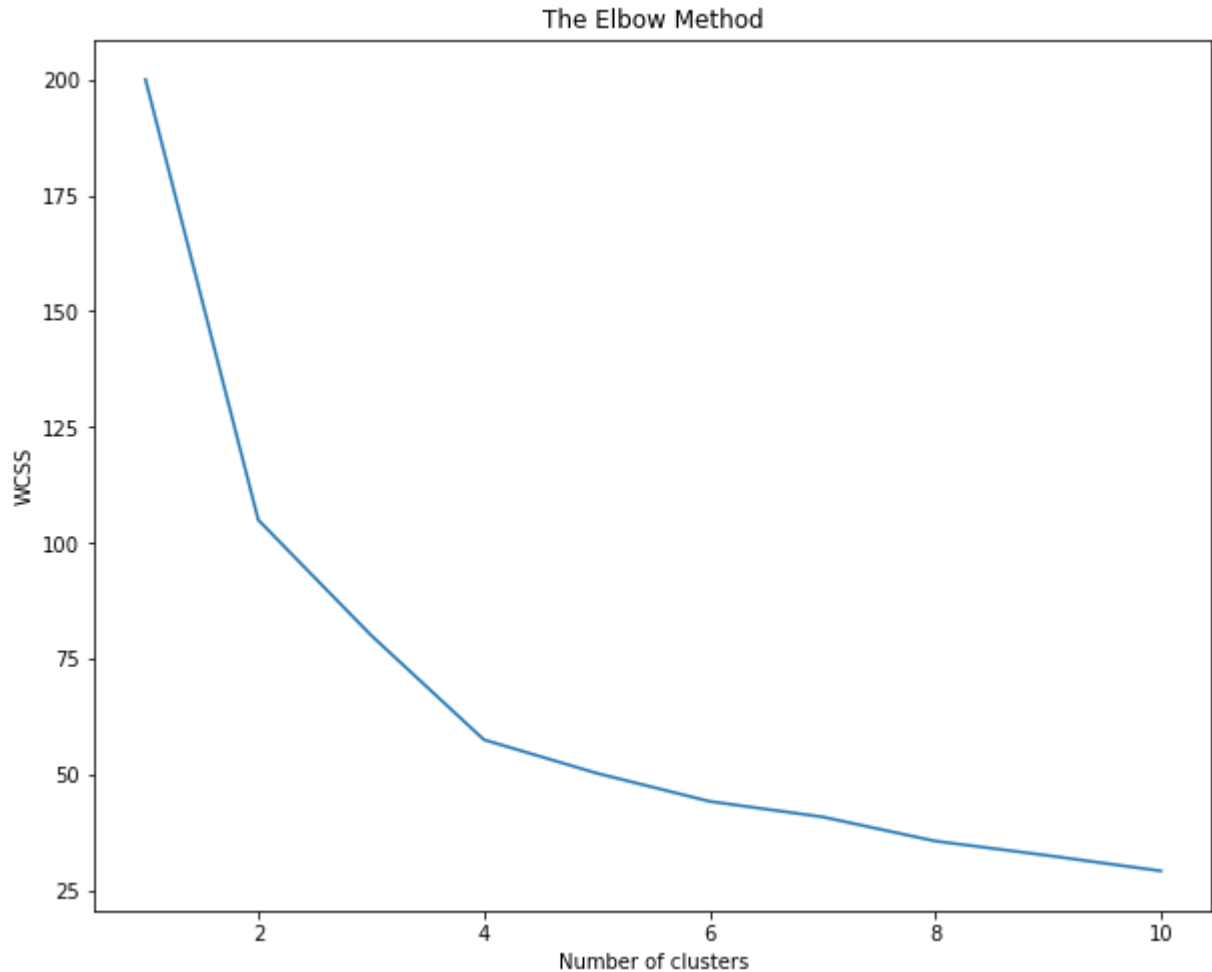
```
from sklearn.cluster import KMeans
import matplotlib.pyplot as plt
%matplotlib inline

plt.figure(figsize=(10, 8))
wcss = []
for i in range(1, 11):
    kmeans = KMeans(n_clusters = i, init = 'k-means++', random_state = 42)
    kmeans.fit(crime_rates_standardized)
    wcss.append(kmeans.inertia_) #criterion based on which K-means clustering works
plt.plot(range(1, 11), wcss)
plt.title('The Elbow Method')
plt.xlabel('Number of clusters')
plt.ylabel('WCSS')
plt.show()
```

C:\Users\Admin\anaconda3\lib\site-packages\sklearn\cluster\\_kmeans.py:881: UserWarning:

KMeans is known to have a memory leak on Windows with MKL, when there are less chunks than available threads. You can avoid it by setting the environment variable OMP\_NUM\_THREADS=1.

```
warnings.warn(
```



```
In [9]: # Fitting K-Means to the dataset
kmeans = KMeans(n_clusters = 4, init = 'k-means++', random_state = 42)
y_kmeans = kmeans.fit_predict(crime_rates_standardized)

y_kmeans
```

```
Out[9]: array([1, 2, 2, 1, 2, 2, 0, 0, 2, 1, 0, 3, 2, 0, 3, 0, 3, 1, 3, 2, 0, 2,
        3, 1, 2, 3, 3, 2, 3, 0, 2, 2, 1, 3, 0, 0, 0, 0, 0, 1, 3, 1, 2, 0,
        3, 0, 0, 3, 3, 0])
```

```
In [10]: #beginning of the cluster numbering with 1 instead of 0
y_kmeans1=y_kmeans+1

# New list called cluster
cluster = list(y_kmeans1)
# Adding cluster to our data set
crime_rates['cluster'] = cluster
```

```
In [11]: #Mean of clusters 1 to 4
kmeans_mean_cluster = pd.DataFrame(round(crime_rates.groupby('cluster').mean(),1))
kmeans_mean_cluster
```

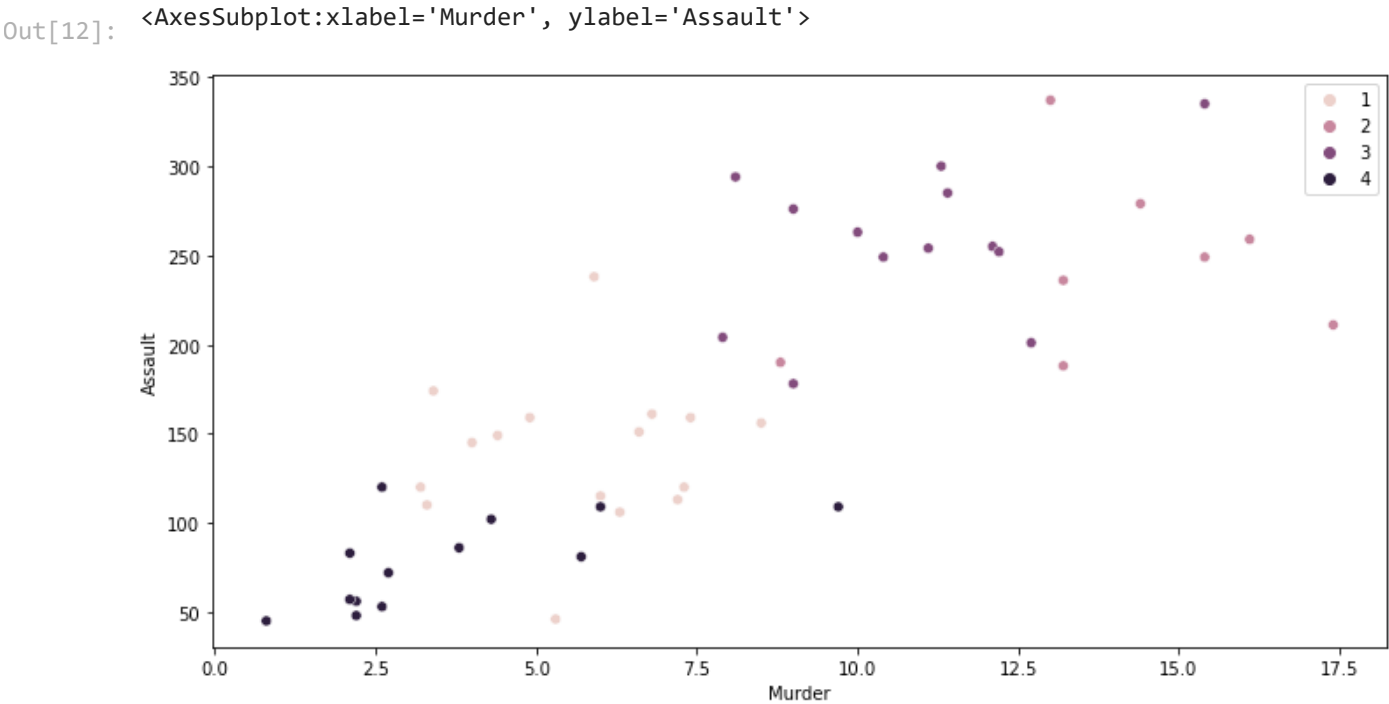
Out[11]:

|         | Murder | Assault | UrbanPop | Rape |
|---------|--------|---------|----------|------|
| cluster |        |         |          |      |
| 1       | 5.7    | 138.9   | 73.9     | 18.8 |
| 2       | 13.9   | 243.6   | 53.8     | 21.4 |
| 3       | 10.8   | 257.4   | 76.0     | 33.2 |
| 4       | 3.6    | 78.5    | 52.1     | 12.2 |

In [12]:

```
import seaborn as sns

plt.figure(figsize=(12,6))
sns.scatterplot(x=crime_rates['Murder'], y = crime_rates['Assault'],hue=y_kmeans1)
```



In [13]:

```
crime_rates[crime_rates['cluster']==1]
```

Out[13]:

|               | Murder | Assault | UrbanPop | Rape | cluster |
|---------------|--------|---------|----------|------|---------|
| Connecticut   | 3.3    | 110     | 77       | 11.1 | 1       |
| Delaware      | 5.9    | 238     | 72       | 15.8 | 1       |
| Hawaii        | 5.3    | 46      | 83       | 20.2 | 1       |
| Indiana       | 7.2    | 113     | 65       | 21.0 | 1       |
| Kansas        | 6.0    | 115     | 66       | 18.0 | 1       |
| Massachusetts | 4.4    | 149     | 85       | 16.3 | 1       |
| New Jersey    | 7.4    | 159     | 89       | 18.8 | 1       |
| Ohio          | 7.3    | 120     | 75       | 21.4 | 1       |

|                     | Murder | Assault | UrbanPop | Rape | cluster |
|---------------------|--------|---------|----------|------|---------|
| <b>Oklahoma</b>     | 6.6    | 151     | 68       | 20.0 | 1       |
| <b>Oregon</b>       | 4.9    | 159     | 67       | 29.3 | 1       |
| <b>Pennsylvania</b> | 6.3    | 106     | 72       | 14.9 | 1       |
| <b>Rhode Island</b> | 3.4    | 174     | 87       | 8.3  | 1       |
| <b>Utah</b>         | 3.2    | 120     | 80       | 22.9 | 1       |
| <b>Virginia</b>     | 8.5    | 156     | 63       | 20.7 | 1       |
| <b>Washington</b>   | 4.0    | 145     | 73       | 26.2 | 1       |
| <b>Wyoming</b>      | 6.8    | 161     | 60       | 15.6 | 1       |

```
In [15]: from IPython.display import HTML
import base64

df = crime_rates
def create_download_link( df, title = "Download CSV file", filename = "data.csv"):
    csv = df.to_csv()
    b64 = base64.b64encode(csv.encode())
    payload = b64.decode()
    html = '<a download="{filename}" href="data:text/csv;base64,{payload}" target="_bla
    html = html.format(payload=payload,title=title,filename=filename)
    return HTML(html)

create_download_link(df)
```

Out[15]: [Download CSV file](#)

```
In [16]: %%HTML

<div class='tableauPlaceholder' id='viz1558006161579' style='position: relative'>
<noscript>
<a href='#'>
<img alt=' ' src='https://public.tableau.com/static/images/US/US&#47;U
</noscript>

<object class='tableauViz' style='display:none;'>
<param name='host_url' value='https%3A%2F%2Fpublic.tableau.com%2F' />
<param name='embed_code_version' value='3' />
<param name='site_root' value='' />
<param name='name' value='USCrimeRatesClusters&#47;Dashboard' />
<param name='tabs' value='no' />
<param name='toolbar' value='yes' />
<param name='static_image' value='https://public.tableau.com/static/ima
<param name='display_static_image' value='yes' />
<param name='display_spinner' value='yes' />
<param name='display_overlay' value='yes' />
<param name='display_count' value='yes' />
</object>
</div>
<script type='text/javascript'>                                var divElement = document.getElement
```

In [ ]: