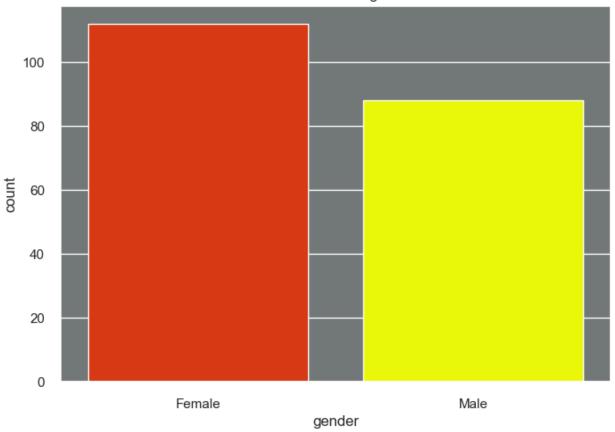
```
import numpy as np
import pandas as pd
import seaborn as sns
import matplotlib.pyplot as plt
import scipy as sp
import plotly.express as px
import plotly graph objects as go
import plotly.io as pio
import scipy.stats as st
%matplotlib inline
from sklearn.preprocessing import LabelEncoder
from sklearn.cluster import KMeans
from mpl toolkits.mplot3d import Axes3D
from yellowbrick.cluster import KElbowVisualizer
from termcolor import colored
from warnings import filterwarnings
filterwarnings("ignore")
from sklearn import set config
set config(print changed only = False)
print(colored("Required libraries were successfully imported...",
              color = "green", attrs = ["bold", "dark"]))
Required libraries were successfully imported...
df = pd.read csv("Mall Customers.csv")
df.head(n = 7)
   CustomerID Gender Age Annual Income (k$)
                                                 Spending Score (1-100)
0
            1
                 Male
                        19
                                             15
                                                                     39
            2
1
                        21
                                             15
                 Male
                                                                     81
2
            3 Female
                        20
                                             16
                                                                      6
3
            4 Female
                        23
                                             16
                                                                     77
4
            5
               Female
                        31
                                             17
                                                                     40
5
            6
               Female
                        22
                                             17
                                                                     76
            7 Female
                                             18
                                                                      6
df.index = df.iloc[:, 0]
df.head(n = 7)
            CustomerID Gender Age Annual Income (k$) \
CustomerID
1
                     1
                          Male
                                 19
                                                      15
2
                     2
                                 21
                          Male
                                                      15
3
                     3
                        Female
                                 20
                                                      16
4
                     4
                        Female
                                 23
                                                      16
5
                        Female
                                 31
                                                      17
```

```
6
                         Female
                                  22
                                                       17
7
                         Female
                                  35
                                                       18
            Spending Score (1-100)
CustomerID
1
                                 39
2
                                 81
3
                                  6
4
                                 77
5
                                 40
6
                                 76
7
                                  6
dff = df.drop(["CustomerID"], axis = 1)
dff.index.name = None
print(colored("'CustomerID' variable was successfully dropped...",
              color = "green", attrs = ["bold", "dark"]))
dff.head(n = 7)
'CustomerID' variable was successfully dropped...
                                     Spending Score (1-100)
   Gender Age
                Annual Income (k$)
1
     Male
            19
                                 15
                                                          39
2
     Male
                                 15
                                                          81
            21
3
   Female
            20
                                 16
                                                           6
   Female
            23
                                 16
                                                          77
5
   Female
                                 17
                                                          40
            31
   Female
            22
                                 17
                                                          76
   Female
            35
                                 18
dff.rename(columns = {"Annual Income (k$)": "annual_income",
                       "Spending Score (1-100)": "spending_score",
                       "Age": "age", "Gender": "gender"}, inplace =
True)
# Checking Null Values
print("There is {} null values in this
dataset".format(dff.isnull().sum().sum()))
There is 0 null values in this dataset
# Checking Duplicate Values
print("There is {} duplicated values in this
dataset".format(dff.duplicated().sum()))
There is 0 duplicated values in this dataset
dff.describe()
```

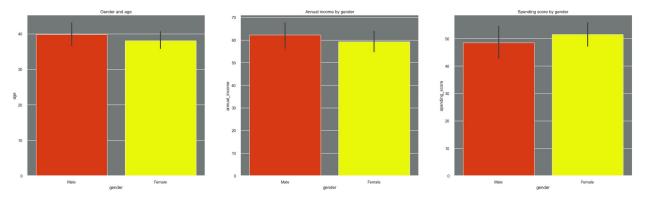
```
spending score
                   annual income
count
       200.000000
                      200.000000
                                      200.000000
        38.850000
                       60.560000
                                       50,200000
mean
        13.969007
                       26.264721
                                       25.823522
std
min
        18.000000
                       15.000000
                                        1.000000
25%
        28.750000
                       41.500000
                                       34.750000
50%
        36.000000
                       61.500000
                                       50.000000
75%
        49.000000
                       78,000000
                                       73.000000
       70.000000
max
                      137.000000
                                       99.000000
dff.info()
<class 'pandas.core.frame.DataFrame'>
Index: 200 entries, 1 to 200
Data columns (total 4 columns):
     Column
                     Non-Null Count
                                     Dtype
0
     gender
                     200 non-null
                                     object
                     200 non-null
1
                                     int64
     age
 2
     annual income
                     200 non-null
                                     int64
     spending score
                     200 non-null
                                     int64
dtypes: int64(3), object(1)
memory usage: 7.8+ KB
```

## Data Visualization and Exploratory Data Analysis

## The number of classes of 'gender' variable



```
fig, axes = plt.subplots(1, 3, figsize = (30, 8))
sns.barplot(ax = axes[0], x = "gender", y = "age", data = dff,
saturation = 1, palette = ["#D63913", "#E9F709"])
axes[0].set_title("Gender and age")
sns.barplot(ax = axes[1], x = "gender", y = "annual_income", data =
dff, saturation = 1, palette = ["#D63913", "#E9F709"])
axes[1].set_title("Annual income by gender")
sns.barplot(ax = axes[2], x = "gender", y = "spending_score", data =
dff, saturation = 1, palette = ["#D63913", "#E9F709"])
axes[2].set_title("Spending score by gender");
```

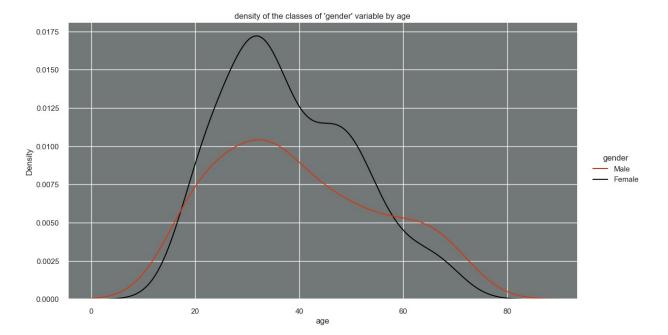


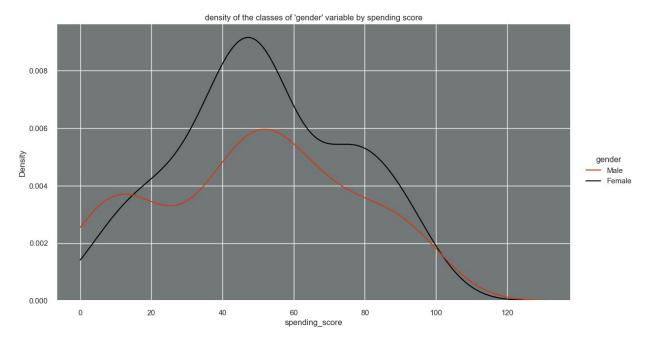
```
# The graphs above visualize the relationship between 'gender'
variable and 'age', 'annual_income' and 'spending_score' variables.

# There are no significant differences between the genders (male and female) in the mentioned parameters

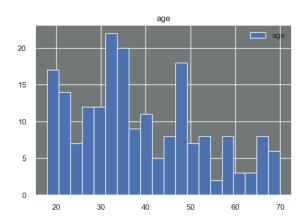
sns.set(rc={"axes.facecolor":"#727877", "figure.facecolor":"#ffffff"})

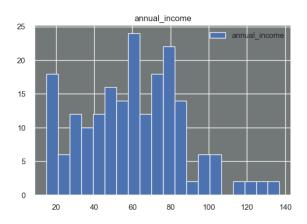
sns.displot(data = dff, x = "age", hue = "gender", kind = "kde", height = 6.5, aspect = 1.8, clip = (0, None), palette = ["#D63913", "#0000000"]).set(title = "density of the classes of 'gender' variable by age");
```

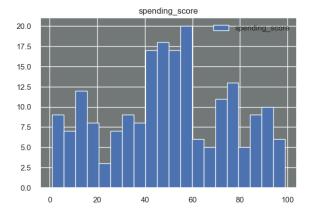


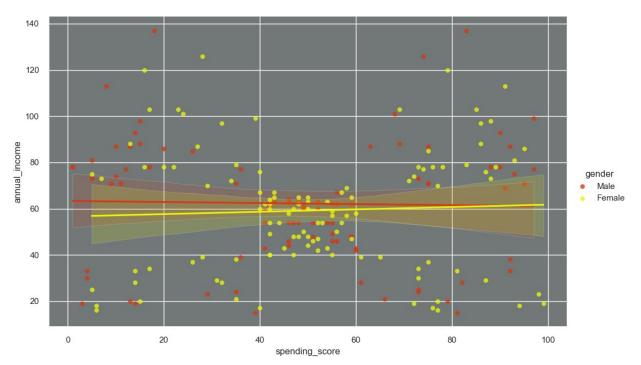


## # Histogram dff.hist(figsize = (15, 10), bins = 20, backend = None, legend = True);









```
# The graph above shows the relationship between the annual income
# and annual expenditure of women and men separately.
# Visualization with plotly express...
px.scatter(dff, x = "age", y = "spending_score", color =
"annual income", template = "plotly dark", opacity = 1)
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60,60,60,60,60,60,61,61,62,62,62,62,62,63,63,63,63,63,63,64,64,65,65,6
5,65,67,67,67,67,69,69,70,70,71,71,71,71,71,71,72,72,73,73,73,73,74,74
81,85,85,86,86,87,87,87,87,87,88,88,88,88,93,93,97,97,98,98,99,99,1
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,70,47,60,60,59,26,45,40,23,49,57,38,67,46,21,48,55,22,34,50,68,18,48,
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52,47,50,42,49,41,48,59,55,56,42,50,46,43,48,52,54,42,46,48,50,43,59,4
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fig.show()
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fig = px.density heatmap(dff, x = "age", y = "annual income", <math>z =
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                         title = "Density heatmap of relationship
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variable")
fig.show()
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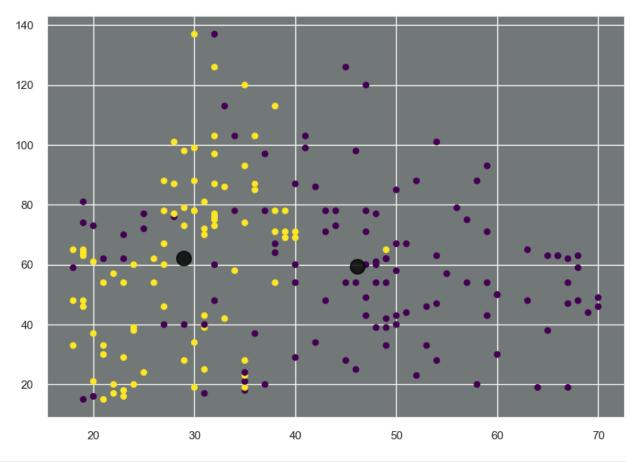
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# Pearson correlation coefficient between variables...
list = (dff[["age","annual_income"]].corr(),
        dff[["age", "spending_score"]].corr(),
```

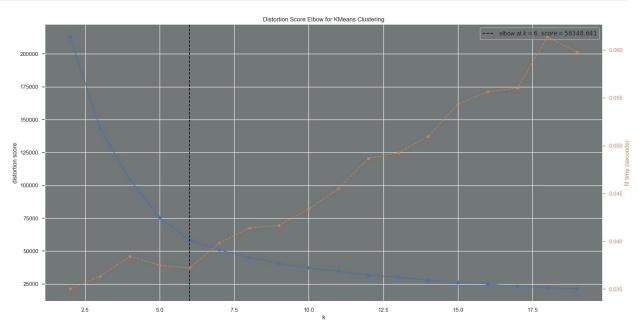
```
dff[["annual income", "spending score"]].corr())
for corr in list:
    print(corr, "\n\n")
                    age annual income
               1.000000
                             -0.012398
annual income -0.012398
                              1.000000
                          spending score
                     age
                1.000000
                               -0.327227
age
spending_score -0.327227
                               1.000000
                annual income spending score
annual income
                     1.000000
                                     0.009903
spending score
                     0.009903
                                     1.000000
# Here we see that there is not correlation between variables.
print("Pearson correlation coefficient between 'age' and
'annual income' variables: \n",
      st.pearsonr(dff["age"], dff["annual income"])[0])
Pearson correlation coefficient between 'age' and 'annual income'
variables:
-0.012398042736060148
print("Pearson correlation coefficient between 'age' and
'spending score' variables: \n",
      st.pearsonr(dff["age"], dff["spending score"])[0])
Pearson correlation coefficient between 'age' and 'spending score'
variables:
 -0.3272268460390901
print("Pearson correlation coefficient between 'annual income' and
'spending score' variables: \n",
      st.pearsonr(dff["annual income"], dff["spending score"])[0])
Pearson correlation coefficient between 'annual income' and
'spending score' variables:
0.009902848094037624
print(colored("For 'annual income' variable:", color = "blue", attrs =
["bold", "dark"]))
test statistic, pvalue = st.shapiro(dff["annual income"])
print("Test statistic = %.11f, p-value = %.11f" % (test statistic,
pvalue))
```

```
print("
                                                               ")
print(colored("\nFor 'spending score' variable:", color = "blue",
attrs = ["bold", "dark"]))
test statistic, pvalue = st.shapiro(dff["spending score"])
print("Test statistic = %.11f, p-value = %.11f" % (test_statistic,
pvalue))
For 'annual income' variable:
Test statistic = 0.97839051485, p-value = 0.00353734032
For 'spending_score' variable:
Test statistic = 0.96946030855, p-value = 0.00024227305
st.spearmanr(dff["annual income"], dff["spending score"])
SignificanceResult(statistic=0.007839641317528493,
pvalue=0.9122697727000879)
# Encode 'gender' variable...
# 1 = Male
# 0 = Female
lbe = LabelEncoder()
lbe.fit transform(dff["gender"])
dff["gender"] = lbe.fit_transform(dff["gender"])
kmeans = KMeans(n clusters = 2, random state = 11)
k fit = kmeans.fit(dff)
plt.figure(figsize = [10, 7], clear = False)
clusters = k fit.labels
centers = k_fit.cluster_centers_
plt.scatter(dff.iloc[:, 1],
            dff.iloc[:, 2],
            c = clusters,
            s = 30,
            cmap = "viridis")
plt.scatter(centers[:, 1],
           centers[:, 2],
           c = "black",
           s = 200,
           alpha = 0.8);
```



```
kmeans = KMeans(n_clusters = 3, random_state = 11)
k fit = kmeans.fit(dff)
clusters = k_fit.labels_
centers = k_fit.cluster_centers_
plt.rcParams["figure.figsize"] = (20, 10)
fig = plt.figure()
ax = Axes3D(fig)
ax.scatter(dff.iloc[:, 1], dff.iloc[:, 2], dff.iloc[:, 3]);
fig = plt.figure()
ax = Axes3D(fig)
ax.scatter(dff.iloc[:, 1], dff.iloc[:, 2], dff.iloc[:, 3], c =
clusters)
ax.scatter(centers[:, 1], centers[:, 2], centers[:, 3],
           marker = '*'
           c = "#8F931F",
           s = 1000);
<Figure size 2000x1000 with 0 Axes>
<Figure size 2000x1000 with 0 Axes>
```

```
kmeans = KMeans(random_state = 11)
visualizer = KElbowVisualizer(kmeans, k = (2, 20), locate_elbow =
True)
visualizer.fit(dff)
visualizer.poof();
```



```
kmeans = KMeans(n_clusters = 6, random_state = 11)
k_{fit} = kmeans.fit(dff)
\overline{clusters} = k \text{ fit.labels}
data = pd.DataFrame({"Customer ID": dff.index, "Clusters":
(k_fit.labels_ + 1))
data.head(n = 7)
   Customer ID Clusters
0
              1
                          6
1
              2
                          2
2
              3
                          6
3
                          2
              4
4
              5
                          6
5
              6
                          2
6
                          6
```