



```
from pyspark.sql import functions as fun
from matplotlib import pyplot as plt
```

```
path = "/FileStore/tables/"
fmall = path + "Mall_Customers.csv"
mall = spark.read.csv( fmall, inferSchema=True, header=True )
mall.describe().show()
```

```
+-----+-----+-----+-----+-----+
-----+
|summary|      CustomerID| Genre|      Age|Annual Income (k$)|Spending Sc
ore (1-100)|
+-----+-----+-----+-----+-----+
-----+
|  count|          200|   200|          200|          200|
200|
|   mean|        100.5|  null|        38.85|        60.56|
50.2|
| stddev|57.879184513951124|  null|13.96900733155888| 26.26472116527124| 25.8235
21668370173|
|   min|          1|Female|          18|          15|
1|
|   max|          200|  Male|          70|          137|
99|
+-----+-----+-----+-----+-----+
-----+
```

```
mall = mall.select( fun.col("Genre").alias("gender"),
                    fun.col("Age").alias("age"), fun.col("Annual Income
(k$)").alias("income"),
                    fun.col("Spending Score (1-100)").alias("score") )
mall.printSchema()
```

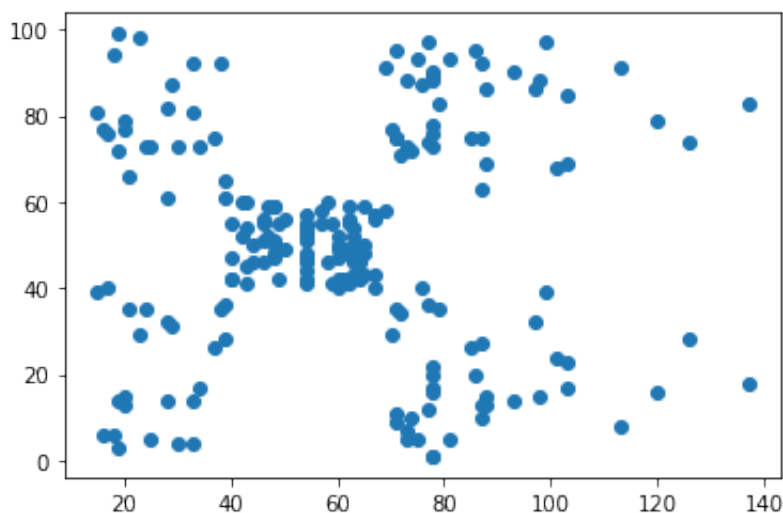
```
root
 |-- gender: string (nullable = true)
 |-- age: integer (nullable = true)
 |-- income: integer (nullable = true)
 |-- score: integer (nullable = true)
```

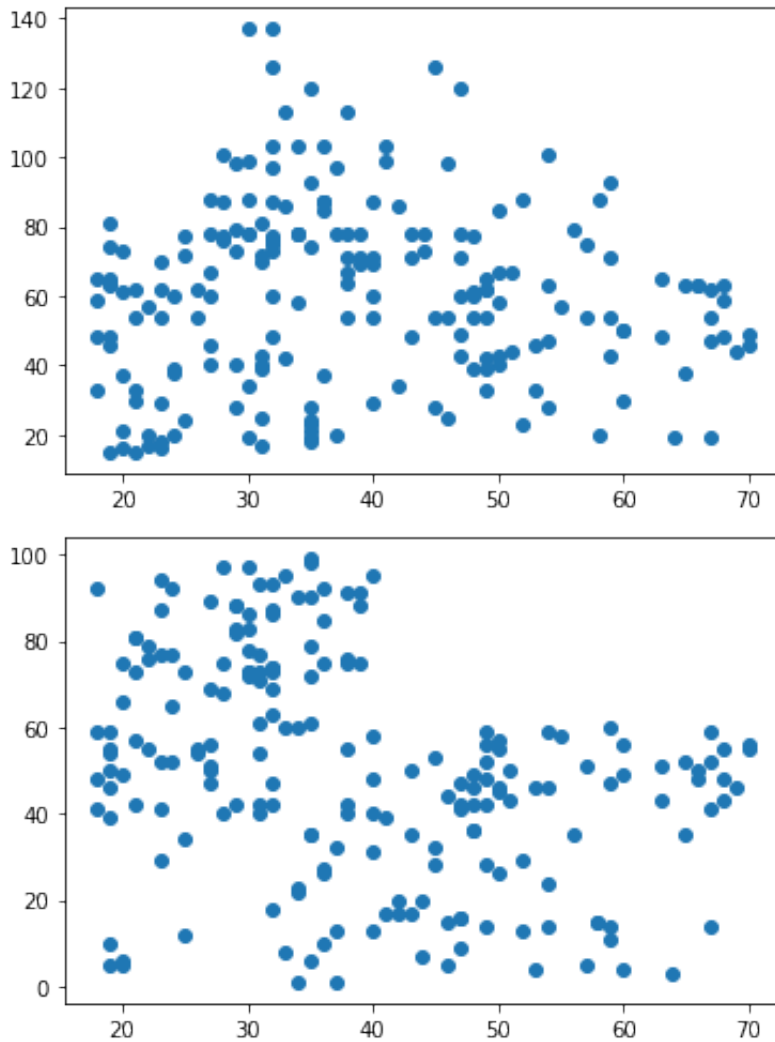
```
cols = mall.drop( "gender" ).columns
lisMean = [ fun.mean( c ) for c in cols ]
lisStd = [ fun.stddev( c ) for c in cols ]

mall.groupby("gender").agg( *lisMean, *lisStd ).show()
```

```
+-----+-----+-----+-----+-----+
|gender|      avg(age)|      avg(income)|      avg(score)| stddev_samp(age)|
stddev_samp(income)|stddev_samp(score)|
+-----+-----+-----+-----+-----+
|Female|38.098214285714285|      59.25|51.526785714285715|12.644095457392353|
26.011951515055948|24.114949877478647|
|  Male| 39.80681818181818|62.22727272727273| 48.51136363636363|15.514811576858186|
26.638373182494135|27.896769605833605|
+-----+-----+-----+-----+-----+
```

```
# Let's explore the feature space
malldas = mall.toPandas()
plt.scatter( malldas["income"], malldas["score"] )
plt.show()
plt.scatter( malldas["age"], malldas["income"] )
plt.show()
plt.scatter( malldas["age"], malldas["score"] )
plt.show()
```





```
mall2 = mall.drop( "gender" )
```

```
from pyspark.ml.feature import VectorAssembler
vecassem = VectorAssembler( inputCols=[ "age", "income", "score" ],
outputCol="features" )
mall3 = vecassem.transform( mall2 )
mall3.show(4)
```

```
+---+-----+-----+-----+
|age|income|score|          features|
+---+-----+-----+-----+
| 19|    15|   39|[19.0,15.0,39.0]|
| 21|    15|   81|[21.0,15.0,81.0]|
| 20|    16|    6|[20.0,16.0,6.0]|
| 23|    16|   77|[23.0,16.0,77.0]|
+---+-----+-----+-----+
only showing top 4 rows
```

```

from pyspark.ml.clustering import KMeans
k1 = KMeans( featuresCol="features", predictionCol="cluster", k=5 )
k1Fit = k1.fit( mall3 )
print ( "Centroids coordinates : ", k1Fit.clusterCenters() )
print( " Number of data points in each cluster:", k1Fit.summary.clusterSizes )

```

```

Centroids coordinates : [array([45.2173913 , 26.30434783, 20.91304348]), array([43
.08860759, 55.29113924, 49.56962025]), array([32.69230769, 86.53846154, 82.12820513
]), array([40.66666667, 87.75      , 17.58333333]), array([25.52173913, 26.30434783
, 78.56521739])]

```

```

Number of data points in each cluster: [23, 79, 39, 36, 23]

```

```

mallK = k1Fit.transform( mall3 )
mallK.show()

```

```

+---+-----+-----+-----+-----+
|age|income|score|          features|cluster|
+---+-----+-----+-----+-----+
| 19|    15|    39|[19.0,15.0,39.0]|      0|
| 21|    15|    81|[21.0,15.0,81.0]|      4|
| 20|    16|     6|[20.0,16.0,6.0]|      0|
| 23|    16|    77|[23.0,16.0,77.0]|      4|
| 31|    17|    40|[31.0,17.0,40.0]|      0|
| 22|    17|    76|[22.0,17.0,76.0]|      4|
| 35|    18|     6|[35.0,18.0,6.0]|      0|
| 23|    18|    94|[23.0,18.0,94.0]|      4|
| 64|    19|     3|[64.0,19.0,3.0]|      0|
| 30|    19|    72|[30.0,19.0,72.0]|      4|
| 67|    19|    14|[67.0,19.0,14.0]|      0|
| 35|    19|    99|[35.0,19.0,99.0]|      4|
| 58|    20|    15|[58.0,20.0,15.0]|      0|
| 24|    20|    77|[24.0,20.0,77.0]|      4|
| 37|    20|    13|[37.0,20.0,13.0]|      0|
| 22|    20|    79|[22.0,20.0,79.0]|      4|
| 35|    21|    35|[35.0,21.0,35.0]|      0|
| 20|    21|    66|[20.0,21.0,66.0]|      4|
| 52|    23|    29|[52.0,23.0,29.0]|      0|
| 35|    23|    98|[35.0,23.0,98.0]|      4|
+---+-----+-----+-----+-----+

```

```

only showing top 20 rows

```

```

from pyspark.ml.evaluation import ClusteringEvaluator
eval1 = ClusteringEvaluator( predictionCol='cluster', featuresCol='features' )
eval1.evaluate( mallK )

```

```

Out[46]: 0.6316639508003641

```

```

mallKandas = mallK.toPandas()
colours = ["r", "b", "g", "k", "m"]
for i in range( len(k1Fit.clusterCenters()) ) :
    plt.scatter( mallKandas[mallKandas["cluster"]==i]["income"],
mallKandas[mallKandas["cluster"]==i]["score"], c=colours[i] )

```

