spark

February 19, 2025

1 1. Verilerin Yüklenmesi

Spark session başlatılarak veriseti çekilir.

```
[3]: from pyspark.sql import SparkSession

spark = SparkSession.builder.appName("HousingPricePrediction").getOrCreate()

data = spark.read.csv("/content/drive/MyDrive/Colab Notebooks/spark/housing.

ocsv", header=True, inferSchema=True)
```

2 2. Verilerin İncelenmesi

Veriseti, sütunlardaki verilerin ortalama, medyan, maximum, minimum gibi değerleri baz alınarak incelenmiştir.

	·	+	·		
·	·	+- ng_median_age tot	·	oodroomal no	nulation
•		ig_median_age;coc ian_house_value c		bear ooms (pc	ритастоп
	_				
		+-	+		
-122.23	37.88	41.0	880.0	129.0	322.0
126.0	8.3252	452600.0	NEAR BAY		
-122.22	37.86	21.0	7099.0	1106.0	2401.0
1138.0	8.3014	358500.0	NEAR BAY		
-122.24	37.85	52.0	1467.0	190.0	496.0
177.0	7.2574	352100.0	NEAR BAY		
-122.25	37.85	52.0	1274.0	235.0	558.0
219.0	5.6431	341300.0	NEAR BAY		
-122.25	37.85	52.0	1627.0	280.0	565.0
259.0	3.84621	342200.0	NEAR BAY		

data.descri	ibe().show()			
•		•	·	
summary total_rooms median_inco	· +	+ latitude hous: population e ocean_proximity	ing_median_age households	
•		•		
count	20640	20640	20640	
20640	20433	20640	20640	
20640	20640	20640		
•	19.56970445736148			
	41087 28.63948643410 5 499.5396802325581 ;	·	•	5618 1425
12.58555761	2.003531723502584 2. 211163 2181.61525158 76534 382.3297528316	27944 421.3850700740	•	359
min	-124.35	32.54	1.0	
2.0	1.0	3.0	1.0	0.4999
14999.0	<1H OCEAN			
max	-114.31	41.95	52.0	
39320.0	6445.0	35682.0	6082.0	
15.0001	500001.0	•		
+		· 	•	
data.summan	ry().show()			
•		•	•	
	· +		·	
summary total_rooms median_inco	me median_house_valu	population	ing_median_age households	
·			·	
count	+	+ 20640		

20640	20433	20640	20640	
20640	20640	20640		
mean -1	19.56970445736148			
35.63186143	41087 28.639486434108	527 2635.7630813953	488 537.870552537	5618 1425.4
76744186046	5 499.5396802325581 3	3.8706710029070246 2	06855.81690891474	
NULL				
stddev	2.003531723502584 2.1	35952397457101		
12.58555761	211163 2181.615251582	7944 421.3850700740	3115	
1132.462121	76534 382.32975283160	98 1.8998217179452	63 115395.61587441	.359
NULL				
min	-124.35	32.54	1.0	
2.0	1.0	3.0	1.0	0.4999
14999.0	<1H OCEAN			
25%	-121.8	33.93	18.0	
1447.0	296.0	787.0	280.0	
2.5625	119600.0	NULL		
50%	-118.49	34.26	29.0	
2127.0	435.0	1166.0	409.0	
3.5347	179700.0	NULL		
75%	-118.01	37.71	37.0	
3146.0	647.0	1724.0	605.0	
4.7426	264700.0	NULL		
max	-114.31	41.95	52.0	
39320.0	6445.0	35682.0	6082.0	
15.0001	500001.0	NEAR OCEAN		
•	+	· ·	•	
+				+
	+	+		

Sütunlardaki eşşiz değerlerin sayısı incelenmiştir.

```
[10]: for col_name in data.columns:
    distinct_count = data.select(col_name).distinct().count()
    print(f"{col_name}: {distinct_count} unique values")
```

longitude: 844 unique values latitude: 862 unique values

housing_median_age: 52 unique values total_rooms: 5926 unique values total_bedrooms: 1924 unique values population: 3888 unique values households: 1815 unique values median_income: 12928 unique values median_house_value: 3842 unique values

ocean_proximity: 5 unique values

Her sütundaki boş değerler incelelmiştir.

```
[13]: from pyspark.sql.functions import col, count, when
  data.select([count(when(col(c).isNull(), c)).alias(c) for c in data.columns]).
   ⇒show()
  -----+
  |longitude|latitude|housing median age|total rooms|total bedrooms|population|hou
  seholds|median_income|median_house_value|ocean_proximity|
  _____+
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      01
                   01
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                                     01
                 01
        01
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  -----+
```

3 3.Özniteliklerin Seçimi ve Verilerin Makine Öğrenmesi İçin Hazırlanması

StringIndexer kullanılarak kategorik değişken olan "ocean_proximity" değişkeni sayısal bir değişkene dönüştürülmüştür.

```
[15]: from pyspark.ml.feature import StringIndexer, VectorAssembler

indexer =

StringIndexer(inputCol="ocean_proximity",outputCol="ocean_proximity_index")

data = indexer.fit(data).transform(data)
```

```
[19]: data.show()
```

37.88	 41.0			
8.3252	452600.0	NEAR BAY		3.0
37.86	21.0	7099.0	1106.0	2401.0
8.3014	358500.0	NEAR BAY		3.0
37.85	52.0	1467.0	190.0	496.0
7.2574	352100.0	NEAR BAY		3.0
37.85	52.0	1274.0	235.0	558.0
5.6431	341300.0	NEAR BAY		3.0
37.85	52.0	1627.0	280.0	565.0
3.8462	342200.0	NEAR BAY		3.0
37.85	52.0	919.0	213.0	413.0
	37.88 8.3252 37.86 8.3014 37.85 7.2574 37.85 5.6431 37.85 3.8462	37.88 41.0 8.3252 452600.0 37.86 21.0 8.3014 358500.0 37.85 52.0 7.2574 352100.0 37.85 52.0 5.6431 341300.0 37.85 52.0 3.8462 342200.0	37.88 41.0 880.0 8.3252 452600.0 NEAR BAY 37.86 21.0 7099.0 8.3014 358500.0 NEAR BAY 37.85 52.0 1467.0 7.2574 352100.0 NEAR BAY 37.85 52.0 1274.0 5.6431 341300.0 NEAR BAY 37.85 52.0 1627.0 3.8462 342200.0 NEAR BAY	37.88 41.0 880.0 129.0 8.3252 452600.0 NEAR BAY 37.86 21.0 7099.0 1106.0 8.3014 358500.0 NEAR BAY 37.85 52.0 1467.0 190.0 7.2574 352100.0 NEAR BAY 37.85 52.0 1274.0 235.0 5.6431 341300.0 NEAR BAY 37.85 52.0 1627.0 280.0 3.8462 342200.0 NEAR BAY

-122.25 37.84 52.0 2535.0 489.0 1094.0 514.0 3.6591 299200.0 NEAR BAY 3.0 -122.25 37.84 52.0 3104.0 687.0 1157.0 647.0 3.12 241400.0 NEAR BAY 3.0 -122.26 37.84 42.0 2555.0 665.0 1206.0 595.0 2.0804 226700.0 NEAR BAY 3.0 -122.25 37.84 52.0 3549.0 707.0 1551.0 714.0 3.6912 261100.0 NEAR BAY 3.0 -122.26 37.85 52.0 2202.0 434.0 910.0 402.0 3.2031 281500.0 NEAR BAY 3.0 -122.26 37.85 52.0 3503.0 752.0 1504.0 734.0 3.2705 241800.0 NEAR BAY 3.0 -122.26 37.85 52.0 2491.0 474.0 1098.0 468.0 3.075 213500.0 NEAR BAY 3.0 -122.26 37.85 52.0 2643.0 696.0 191.0 345.0 174.0 2.6736 191300.0 NEAR BAY 3.0 -122.26 37.85 52.0 2643.0 626.0 1212.0 620.0 1.9167 159200.0 NEAR BAY 3.0 -122.26 37.85 52.0 2643.0 626.0 1212.0 626.0 1.9167 159200.0 NEAR BAY 3.0 -122.26 37.85 52.0 2643.0 626.0 1212.0 626.0 1.9167 159200.0 NEAR BAY 3.0 -122.26 37.85 52.0 2643.0 626.0 3.0 3.0 -122.26 37.85 52.0 2643.0 626.0 3.0 3.0 -122.26 37.85 52.0 1966.0 347.0 793.0 264.0 2.125 140000.0 NEAR BAY 3.0 -122.27 37.85 52.0 1966.0 347.0 793.0 331.0 2.775 152500.0 NEAR BAY 3.0
-122.25 37.84 52.0 3104.0 687.0 1157.0 647.0 3.12 241400.0 NEAR BAY 3.0 -122.26 37.84 42.0 2555.0 665.0 1206.0 595.0 2.0804 226700.0 NEAR BAY 3.0 -122.25 37.84 52.0 3549.0 707.0 1551.0 714.0 3.6912 261100.0 NEAR BAY 3.0 -122.26 37.85 52.0 2202.0 434.0 910.0 402.0 3.2031 281500.0 NEAR BAY 3.0 -122.26 37.85 52.0 3503.0 752.0 1504.0 734.0 3.2705 241800.0 NEAR BAY 3.0 -122.26 37.85 52.0 2491.0 474.0 1098.0 468.0 3.075 213500.0 NEAR BAY 3.0 -122.26 37.84 52.0 696.0 191.0 345.0 174.0 2.6736 191300.0 NEAR BAY 3.0 -122.26 37.85 52.0 2643.0 626.0 1212.0 620.0 1.9167 159200.0 NEAR BAY 3.0 -122.26 37.85 52.0 2643.0 626.0 3.0 -122.26 37.85 52.0 1120.0 283.0 697.0 264.0 2.125 140000.0 NEAR BAY 3.0
647.0 3.12 241400.0 NEAR BAY 3.0 -122.26 37.84 42.0 2555.0 665.0 1206.0 595.0 2.0804 226700.0 NEAR BAY 3.0 -122.25 37.84 52.0 3549.0 707.0 1551.0 714.0 3.6912 261100.0 NEAR BAY 3.0 -122.26 37.85 52.0 2202.0 434.0 910.0 402.0 3.2031 281500.0 NEAR BAY 3.0 -122.26 37.85 52.0 3503.0 752.0 1504.0 734.0 3.2705 241800.0 NEAR BAY 3.0 168.0 3.0 -122.26 37.85 52.0 2491.0 474.0 1098.0 468.0 3.075 213500.0 NEAR BAY 3.0 -122.26 37.84 52.0 696.0 191.0 345.0 -122.26 37.85
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-122.26 37.85 52.0 2491.0 474.0 1098.0 468.0 3.075 213500.0 NEAR BAY 3.0 -122.26 37.84 52.0 696.0 191.0 345.0 174.0 2.6736 191300.0 NEAR BAY 3.0 -122.26 37.85 52.0 2643.0 626.0 1212.0 620.0 1.9167 159200.0 NEAR BAY 3.0 -122.26 37.85 50.0 1120.0 283.0 697.0 264.0 2.125 140000.0 NEAR BAY 3.0 -122.27 37.85 52.0 1966.0 347.0 793.0
468.0 3.075 213500.0 NEAR BAY 3.0 -122.26 37.84 52.0 696.0 191.0 345.0 174.0 2.6736 191300.0 NEAR BAY 3.0 -122.26 37.85 52.0 2643.0 626.0 1212.0 620.0 1.9167 159200.0 NEAR BAY 3.0 -122.26 37.85 50.0 1120.0 283.0 697.0 264.0 2.125 140000.0 NEAR BAY 3.0 -122.27 37.85 52.0 1966.0 347.0 793.0
-122.26 37.84 52.0 696.0 191.0 345.0 174.0 2.6736 191300.0 NEAR BAY 3.0 -122.26 37.85 52.0 2643.0 626.0 1212.0 620.0 1.9167 159200.0 NEAR BAY 3.0 -122.26 37.85 50.0 1120.0 283.0 697.0 264.0 2.125 140000.0 NEAR BAY 3.0 -122.27 37.85 52.0 1966.0 347.0 793.0
174.0 2.6736 191300.0 NEAR BAY 3.0 -122.26 37.85 52.0 2643.0 626.0 1212.0 620.0 1.9167 159200.0 NEAR BAY 3.0 -122.26 37.85 50.0 1120.0 283.0 697.0 264.0 2.125 140000.0 NEAR BAY 3.0 -122.27 37.85 52.0 1966.0 347.0 793.0
-122.26 37.85 52.0 2643.0 626.0 1212.0 620.0 1.9167 159200.0 NEAR BAY 3.0 -122.26 37.85 50.0 1120.0 283.0 697.0 264.0 2.125 140000.0 NEAR BAY 3.0 -122.27 37.85 52.0 1966.0 347.0 793.0
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-122.26 37.85 50.0 1120.0 283.0 697.0 264.0 2.125 140000.0 NEAR BAY 3.0 -122.27 37.85 52.0 1966.0 347.0 793.0
264.0 2.125 140000.0 NEAR BAY 3.0 -122.27 37.85 52.0 1966.0 347.0 793.0
-122.27 37.85 52.0 1966.0 347.0 793.0
221 0
-122.27 37.85 52.0 1228.0 293.0 648.0
303.0 2.1202 155500.0 NEAR BAY 3.0
-122.26 37.84 50.0 2239.0 455.0 990.0
419.0 1.9911 158700.0 NEAR BAY 3.0
-122.27 37.84 52.0 1503.0 298.0 690.0
275.0 2.6033 162900.0 NEAR BAY 3.0
+

only showing top 20 rows

VectorAssembler ile özellikler (bağımısz değişkenler) belirlenerek hepsi bir vektör formatına dönüştürülmüştür. "median_house_value" sütunu da tahmin edilecek değişken olarak belirlenmiştir.(bağımlı değişken)

```
features | median_house_value |
+----+
|[-122.23,37.88,41...|
                              452600.0
[-122.22,37.86,21...]
                              358500.0
[-122.24,37.85,52...]
                              352100.0|
|[-122.25,37.85,52...|
                              341300.0
[-122.25,37.85,52...]
                              342200.0
|[-122.25,37.85,52...|
                              269700.0
|[-122.25,37.84,52...|
                              299200.0
|[-122.25,37.84,52...|
                              241400.0|
|[-122.26,37.84,42...|
                              226700.0|
|[-122.25,37.84,52...|
                              261100.0|
|[-122.26,37.85,52...|
                              281500.0
|[-122.26,37.85,52...|
                              241800.0|
|[-122.26,37.85,52...|
                              213500.0
|[-122.26,37.84,52...|
                              191300.0|
|[-122.26,37.85,52...|
                              159200.0
|[-122.26,37.85,50...|
                              140000.0
| [-122.27,37.85,52...|
                              152500.0
[-122.27,37.85,52...]
                              155500.0
|[-122.26,37.84,50...|
                              158700.0
|[-122.27,37.84,52...|
                              162900.0
```

only showing top 20 rows

4.PySpark ile Makine Öğrenmesi Modelinin Oluşturulması

final data, eğitim ve test verisi olarak ikiye bölünür. Doğrusal Regresyon modeli tanımlanır ve fit fonksiyonu ile model eğitilir.

```
[21]: from pyspark.ml.regression import LinearRegression
      train_data, test_data = final_data.randomSplit([0.8, 0.2])
      lr = LinearRegression(featuresCol="features", labelCol="median_house_value")
      lr_model = lr.fit(train_data)
```

Model verisi evaluate fonksiyonu ile test verisi üzerinden değerlendirilir. Root mean squared error ve R2 değerleri hesaplanır.

```
[22]: test_results = lr_model.evaluate(test_data)
      print("Root Mean Squared Error (RMSE):", test_results.rootMeanSquaredError)
      print("R2:", test_results.r2)
```

Root Mean Squared Error (RMSE): 71602.65298060827

R2: 0.6239338349430412