## BD\_24\_Summative-Spark

July 20, 2018

## 1 Spark

null

In [1]: import findspark

findspark.init()

```
#from pyspark.sql.session import SparkSession
       from pyspark.sql import SparkSession
       spark = SparkSession.builder.master("local[*]").getOrCreate()
In [2]: # read csv file
      data = spark.read.csv('sensor_data.csv',header=True)
In [3]: from pyspark.sql.types import DoubleType, IntegerType
       #convert all columns
       for col_name in data.columns:
          data = data.withColumn(col_name, data[col_name].cast(DoubleType()))
In [4]: # inspect the first 10 rows
      data.show(100)
       # the printSchema() method tells you the data type of each column
       data.printSchema()
Temp1 Temp1_ave
|Date|Device_ID|
                                                  Temp1_sd|
                                                                           Temp2
4.0 | 26.809322978877425 | 6.702330744719356 |
                                                            0.0 | 39.49025527676517 | 9.8
          7.0 | 47.11805302640779 | 11.754296029930412 | 5.051965285211055 | 61.82985832904858 | 16.3
null
null
         6.0| 42.90664203147708|15.613316184695398| 6.840977654674061| 57.19730623462479| 21.
null
          4.0 | 41.08917584805568 | 18.652689971692283 | 7.925440713617367 | 55.198093432861256 | 25.3
null
         8.0 | 58.21307761699691 | 21.998427558106112 | 9.748124352541879 | 74.03438537869661 | 29.
         4.0|29.955361583677057| 24.00283526904515| 9.963760586188132|42.950897742044766| 32.
|null|
null
         7.0|61.154504228264315|26.403470434163175| 10.93949082352105| 77.26995465109076|35.3
         9.0 | 23.95729066993767 | 27.677384596910024 | 10.773736728799927 | 36.353019736931444 | 37.
|null|
```

2.0 | 38.48319240889367 | 28.72066251995634 | 10.577513361379625 | 52.33151164978304 | 38.5

```
|null|
                           0.0 | 61.14964542885435 | 32.82242882467565 | 7.455527630296799 | 77.26460997173979 | 43.
                           3.0 | 24.94857562201685 | 34.87771295190258 | 5.269447610147681 | 37.443433184218534 | 46.
null
                           1.0 | 85.13894576791235 | 37.474983640733655 | 5.338669030292077 | 103.65284034470359 | 50.0
null
                           2.0 | 36.66560703813738 | 39.312347437109004 | 4.819164735913903 | 50.332167741951125 | 52.
null
                           3.0 | 24.74365043243004 | 39.853634604776346 | 4.6481940797500565 | 37.21801547567305 | 53.
null
null
                           5.0 | 41.00262030042762 | 40.53578144844561 | 4.223918265236809 | 55.102882330470386 | 54.0
null
                           7.0|45.660867553058225| 40.66005066431742|4.2482878000296695| 60.22695430836405| 54.660867553058225| 40.66005066431742|4.2482878000296695| 60.22695430836405| 54.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867553058225| 60.660867555925| 60.66086755925| 60.66086755925| 60.6608675595925| 60.66086755925| 60.66086755925| 60.66086755925| 60.66086755925| 60.66086755925| 60.66086755925| 60.6608675925| 60.66086755925| 60.66086755925| 60.6608675925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925| 60.660875925|
null
                                            93.188165665542|42.484024451111374| 5.758471323141652| 112.5069822320962| 56.
|null|
                           9.0 | 25.137207454510232 | 43.51835516734725 | 5.619815536856776 | 37.65092819996126 | 57.
                           null
                           2.0 | 34.05561333623302 | 47.3698752087411 | 7.085302334224268 | 47.46117466985633 | 61.
null
                           7.0 | 48.181561106896126 | 48.898395229604446 | 6.373816557052487 | 62.99971721758574 |
                                                                                                                                                                                                                           63
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null
                         10.0| 59.88844365535325| 49.41352269243798| 6.590272061333156| 75.87728802088859|
                                                                                                                                                                                                                           64
null
                           5.0 | 36.63654167895332 | 49.799141655583526 | 6.499905408404016 | 50.30019584684866 |
                                                                                                                                                                                                                           64
                           null
|null|
                           8.0 | 56.49802960366512 | 51.17216441811185 | 5.044806276095282 | 72.14783256403163 | 66.
                           8.0 | 51.87968353752222 | 51.93498580535653 | 4.095110993449273 | 67.06765189127444 | 67.
null
                           8.0 | 58.71783859211923 | 51.64534366895448 | 3.980616995724839 | 74.58962245133115 | 66.
null
                           3.0 | 29.64880566565567 | 51.54090202193156 | 4.102211159110559 | 42.61368623222124 | 66.
null
null
                                         59.6606929201749| 50.42745525299882|2.7043665006637756|
                                                                                                                                                                            75.6267622121924
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                           5.0 39.14293311477787 49.719553170762865 2.564952563425427 53.05722642625566 64.
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                           0.0 \mid 74.3327995004876 \mid 49.84240756892569 \mid 2.7264367205082918 \mid 91.76607945053637 \mid 64.84240756892569 \mid 2.7264367205082918 \mid 91.766079450536919 \mid 91.766079450536919 \mid 91.7660794507919 \mid 91.76607919 \mid 91.766
null
                           3.0 | 23.941554596282813 | 49.03587614107106 | 2.418046098840527 | 36.33571005591109 | 63.9
                           5.0 32.74871143582221 48.33378181410179 2.988087343566726 46.02358257940443 63.
|null|
                           7.0 | 48.77922653757037 | 48.1340932481783 | 3.170060691257809 | 63.65714919132741 | 62.9
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                           0.0 | 67.00524804730043 | 48.24700728482655 | 3.21667700436947 | 83.70577285203048 | 63.
null
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                           7.0 | 49.328613179170816 | 48.267916053353964 | 3.2265761992695943 |
                                                                                                                                                                              64.2614744970879
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                           6.0 | 46.12709275200149 | 47.968828983746576 | 3.003408460384522 | 60.73980202720164 | 62.
null
                           8.0 | 53.89706524372359 | 48.35072017099274 | 3.0180535335172443 | 69.28677176809595 | 63.1
null
                           1.0 | 89.63568339030601 | 49.38651332318063 | 4.640890425100705 | 108.59925172933663 | 64.
null
                           9.0 | 23.34500579757141 | 49.768410004391384 | 4.589993750864147 | 35.67950637732855 | 64.
null
null
                           3.0 | 25.31695832329066 | 48.82943648586954 | 4.614668912524848 | 37.84865415561973 | 63.
                           5.0 | 37.33061400865023 | 48.459932832287336 | 4.9322114281910165 | 51.063675409515255 | 63.3
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                           2.0 39.86145925583612 48.36062378760103 5.050143006530877 53.84760518141973 63.1
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                           6.0 \mid 40.98846788367812 \mid 49.280425496138264 \mid 5.0731337042924345 \mid 55.087314672045935 \mid 64.08867812 \mid 49.280425496138264 \mid 5.0731337042924345 \mid 55.087314672045935 \mid 64.08867812 \mid 64
                           3.0 | 27.32364087418675 | 48.74720052164754 | 5.258181308140732 | 40.056004961605424 | 63.
|null|
null
                           5.0 | 39.70371537957944 | 48.18669735646894 | 5.500155548033561 | 53.67408691753739 | 63.
                           8.0 | 74.18864708748593 | 48.27360952867905 | 5.537778803721562 | 91.60751179623453 | 63.
|null|
null
                           5.0 | 43.63201980658634 | 47.18870206824364 | 3.9639859867214606 | 57.99522178724498 | 61.9
                                         49.6091067472683 | 47.031623996659505 | 3.844238484642558 | 64.57001742199513 | 61.
null
                         10.0 | 64.18951380469294 | 47.885629330006466 | 4.121796833989696 | 80.60846518516223 | 62.
null
null
                           4.0 | 39.52103488558373 | 51.40167364441388 | 5.396409991220145 | 53.47313837414211 | 66.
null
null
                           3.0|31.598967396131634| 51.12692581509698|5.3573592886155765| 44.7588641357448| 66.
null
                           5.0 | 42.16802270091739 | 53.23582070506169 | 5.500457204307668 | 56.38482497100913 |
                                                                                                                                                                                                                           68
null
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4.0 | 28.578187897659937 | 29.343067408226716 | 10.206953542739077 | 41.43600668742593 | 39.4

null

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null
                7.0|45.352970246734266|54.21395809665847|4.41714381073814|59.8882672714077|69.
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                6
                3.0 30.44266302775148 53.02982111668973 5.949963107106021 43.48692933052663 68.
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                9.0 | 19.58452720363539 | 51.75727663333572 | 7.7114488808885655 | 31.542979923998928 |
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null
                1.0 | 89.46538189387785 | 51.43476497304984 | 7.719199460551777 | 108.41192008326564 | 66.
                5.0 | 41.63532819575759 | 49.92697169757262 | 6.757788255832079 | 55.79886101533335 | 64.
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                4.0 32.3333472877084 48.616434551017825 6.5244682790961965 45.56668201647924 63.
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                1.0 | 89.43195302862108 | 49.079356331913964 | 6.810620845209115 | 108.3751483314832 | 63.
                5.0 | 46.35799753081059 | 48.361704840035884 | 5.9174843114681615 | 60.99379728389166 | 63.
null
|null|
                1.0 | 92.63443410202945 | 49.08512650615512 | 7.09675704555434 | 111.8978775122324 | 63.
                4.0 | 37.9415845590416 | 49.44240811355224 | 7.375536342819978 | 51.73574301494576 | 64.
null
                1.0 | 83.48858200973001 | 51.164701056138256 | 8.356331331195683 | 101.83744021070302 | 66.
null
                8.0 | 61.05560029594513 | 53.221744194782616 | 8.437489266142466 | 77.16116032553965 | 68.
null
null
                7.0|43.082287582620715|55.351970558240524| 6.411856994080157| 57.39051634088279| 70
                9.0 | 25.889084604345662 | 55.360232898595655 | 6.4047441570543695 | 38.47799306478023 | 70.
null
               10.0 | 60.346532090682494 | 55.83420975123511 | 5.986273511424731 | 76.38118529975075 | 71.
null
null
                9.0 | 20.230185181647883 | 55.887113338063195 | 5.882013165144085 | 32.25320369981267 | 71.
               10.0 | 68.88371226368885 | 55.41308500906096 | 6.098539186625547 | 85.77208349005774 | 70.
null
                9.0 | 15.100009202836269 | 54.27611405410992 | 7.361679387137321 | 26.610010123119896 | 69.
null
                null
                4.0|37.426595839100365|51.015800192668294| 7.664625052301054|51.169255423010405| 66.
null
                8.0 | 69.67400960631642 | 49.61696011940592 | 6.459550630645657 | 86.64141056694807 | 64.
null
null
                1.0 | 95.52900417489109 | 49.42966516143279 | 6.0909466735869 | 115.0819045923802
                                                                                                                                     64
null
                2.0 | 36.583365414413045 | 49.12672088874774 | 5.727734236651658 | 50.24170195585435 | 64.
                |null|
                8.0 | 64.42337748410608 | 49.24530748419248 | 5.801919552690064 | 80.86571523251669 | 64.
null
                8.0 | 62.12272779462968 | 50.37441865583951 | 5.853474584474721 | 78.33500057409266 | 65.
null
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                3.0 | 20.477134202338917 | 50.01108758304103 | 5.943754687302341 | 32.52484762257281 |
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                2.0 43.2387899088701 50.442058796093036 5.460891786632595 57.56266889975712 65.
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               |10.0| |59.5857989596201| |50.94202262164742| |50.101037777628926| |50.54437885558211| |66.5857989596201|
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                6.0 \\ | 32.739595448549224 \\ | 51.46232387004422 \\ | 4.553936769551084 \\ | 46.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.01355499340415 \\ | 66.013554993404 \\ | 66.013554993404 \\ | 66.013554993404 \\ | 66.013554993404 \\ | 66.013554993404 \\ | 66.01355499404 \\ | 66.01355499404 \\ | 66.01355499404 \\ | 66.01355499404 \\ | 66.01355499404 \\ | 66.01355499404 \\ | 66.01355499404 \\ | 66.01355499404 \\ | 66.01355499404 \\ | 66.0135494 \\ | 66.0135494 \\ | 66.0135494 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549 \\ | 66.013549
null
               10.0 | 57.89260869109902 | 50.29292780395803 | 3.299537273054879 | 73.68186956020892 | 65.
               10.0 | 59.90249018914247 | 49.99885887376162 | 2.997661561275365 | 75.89273920805672 | 64.
null
                9.0 | 28.61467317249583 | 49.6097155654562 | 3.2197412581236837 | 41.47614048974542 | 64.
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                9.0 | 28.237294471391884 | 48.413206008909285 | 3.705655919126634 | 41.06102391853108 | 63.
null
                0.0 72.35572900268393 47.771648871700464 2.838812402899347 89.59130190295232 62.
                1.0 | 85.41416668849033 | 48.913906830947624 | 4.223048194101935 | 103.95558335733936 | 63.
|null|
                null
                null
                null
                5.0 | 39.77175008814805 | 51.69343557152081 | 5.271198129478133 | 53.748925096962864 |
                                                                                                                                     66
null
                5.0|36.992251983376434| 51.79783540806511| 5.231819504388494| 50.69147718171408| 66.
null
```

only showing top 100 rows

```
root
```

|-- Date: double (nullable = true)

```
|-- Device_ID: double (nullable = true)
 |-- Temp1: double (nullable = true)
 |-- Temp1_ave: double (nullable = true)
 |-- Temp1_sd: double (nullable = true)
 |-- Temp2: double (nullable = true)
 |-- Temp2_ave: double (nullable = true)
 |-- Temp2_sd: double (nullable = true)
 |-- Temp3: double (nullable = true)
 |-- Temp3_ave: double (nullable = true)
 |-- Temp3_sd: double (nullable = true)
 |-- Temp_Ambient: double (nullable = true)
 |-- Temp_Am_ave: double (nullable = true)
 |-- Temp_Am_sd: double (nullable = true)
1.0.1 Prepare data for model
In [5]: # Split the data into training and test sets (30% held out for testing)
        (trainingData, testData) = data.randomSplit([0.7, 0.3])
In [6]: from pyspark.ml import Pipeline
        from pyspark.ml.feature import OneHotEncoder, VectorAssembler
        from pyspark.ml.regression import DecisionTreeRegressor
        from pyspark.ml.evaluation import RegressionEvaluator
In [7]: # assemble variables to one feature column
        assembler = VectorAssembler(
            inputCols = ['Device_ID', 'Temp1', 'Temp2', 'Temp3', 'Temp_Ambient'],
            outputCol = "features")
        #define the estimator - decision tree
        dt = DecisionTreeRegressor(labelCol="Device_ID", featuresCol="features")
        # Chain indexers and tree in a Pipeline
        pipeline = Pipeline(stages=[assembler, dt])
1.0.2 Fit pipeline and transform data
In [8]: #fit the pipeline
        PipelineModel = pipeline.fit(trainingData)
        # transform using the pipeline
        predictions = PipelineModel.transform(testData)
        # evaluate model fit
        predictions.select("prediction", "Device_ID")
```

evaluator = RegressionEvaluator(

```
labelCol="Device_ID", predictionCol="prediction", metricName="rmse")
rmse = evaluator.evaluate(predictions)
```

In [9]: predictions.show()

```
Temp1 Temp1_ave Temp1_sd
|Date|Device ID|
                                                                                                                                                               Temp2
0.0 | 61.14964542885435 | 32.82242882467565 | 7.455527630296799 | 77.26460997173979 | 43.9
null
                      0.0 | 61.40414948957228 | 36.01476215770229 | 4.091746723223278 | 77.54456443852952 | 49.61
null
                     0.0 | 62.71132194066853 | 40.7814903289155 | 3.855135636520485 | 78.98245413473539 | 54.8
                     0.0 | 62.75904439465696 | 52.956074380882754 | 2.6852696762147925 | 79.03494883412266 | 68.2
null
                    0.0 | 63.03687215832894 | 41.54623193006443 | 3.312626890133367 | 79.34055937416184 | 55.7
null
null
                    0.0|63.430181435504004| 53.37820310837903|2.2635303796313657| 79.7731995790544| 68.7
null
                    0.0| 63.44980651960239| 46.13079958431568| 6.712322655623347|79.79478717156263|60.74
null
                   0.0| 64.12564567369651| 44.40435205900481| 3.362210187323846|80.53821024106617| 58.8
null
                     0.0 | 64.53018603256234 | 47.190289494113 | 5.035759648164062 | 80.98320463581858 | 61.90
null
null
                     0.0 | 65.17404507459204 | 51.448235322453925 | 5.160542925094705 | 81.69144958205125 | 66.5
                     0.0 \mid 65.72958680736592 \mid 56.19231743756139 \mid 4.6612773067474516 \mid 82.30254548810252 \mid 71.88612773067474516 \mid 82.3025454816 \mid 82.30254816 \mid 82.3025481
null
                     0.0 | 67.26676882422221 | 48.97793078394485 | 3.319671384079394 | 83.99344570664444 | 63.8
null
null
                     0.0 67.7625291843144 50.60791645934563 3.4195457417093844 84.53878210274586 65.6
null
                     0.0| 67.91851161062704| 45.67684399567627| 4.583746841280199|84.71036277168974| 60.2
                   0.0 | 68.18085502690612 | 46.761002823756826 | 4.4336419725855585 | 84.99894052959674 | 61.4
null
                     0.0 | 68.36905540607681 | 53.738525915599254 | 8.206394614752899 | 85.2059609466845 | 69.1
null
                     0.0 | 68.54833033126368 |
                                                                     57.139803753407 | 4.634278884796937 | 85.40316336439005 | 72.
null
null
                    0.0 | 68.60788867420946 | 44.708384891329295 | 4.912916224261732 | 85.46867754163041 | 59.1
                   0.0| 68.77870074809725| 52.70727030377573| 5.094252003473131|85.65657082290699| 67.
```

only showing top 20 rows

0.0

## 1.0.3 Kmeans clustering

```
In [11]: from pyspark.ml.clustering import KMeans

# Trains a k-means model with 4 clusters.
kmeans = KMeans(featuresCol='features', predictionCol='prediction',k=4)

#transform data using pipeline
pipeline = Pipeline(stages=[assembler, kmeans])
```

```
#fir pipeline
PipelineModel = pipeline.fit(data)

# transform using the pipeline
predictions = PipelineModel.transform(data)
```

Date Device	ce_ID  +	Te	mp1	Temp1_av	7e  +	Temp1	_sd  _	Temp2	_
null	4.0	26.809322978877	425  (	 6.70233074471935	56	(	0.0  3	39.49025527676517	9.8
null	7.0	47.11805302640	779 1:	1.75429602993041	۱2۱	5.0519652852110	)55  6	61.82985832904858	16.3
null	6.0	42.90664203147	708 15	5.61331618469539	)8 <u> </u>	6.8409776546740	061  5	57.19730623462479	21.
null	4.0	41.08917584805	568 18	8.65268997169228	33	7.9254407136173	367 55	5.198093432861256	25.3
null	8.0	58.21307761699	691 2:	1.99842755810611	۱ <b>2</b>	9.7481243525418	379  7	74.03438537869661	29.
null	4.0	29.955361583677	057  :	24.0028352690451	.5	9.9637605861883	132 42	2.950897742044766	32.
null	7.0	61.154504228264	315 26	6.40347043416317	'5 I	10.93949082352	105  7	77.26995465109076	35.3
null	9.0	23.95729066993	767   27	7.67738459691002	24   1	0.7737367287999	927 36	3.353019736931444	37.
null	2.0	38.48319240889	367  :	28.7206625199563	34 1	0.5775133613796	525  5	52.33151164978304	38.5
null	4.0	28.578187897659	937   29	9.34306740822671	6 1	0.2069535427390	)77  4	11.43600668742593	39.4
null	0.0	61.14964542885	435  3	32.8224288246756	35	7.4555276302967	799  7	77.26460997173979	43.
null	3.0	24.94857562201	685  3	34.8777129519025	i8	5.2694476101476	81 37	7.443433184218534	46.
null	1.0	85.13894576791	235 37	7.47498364073365	55	5.3386690302920	77 10	03.65284034470359	50.C
null	2.0	36.66560703813	738   39	9.31234743710900	)4	4.8191647359139	903 50	0.332167741951125	52.
null	3.0	24.74365043243	004 39	9.85363460477634	46 4	.64819407975009	565  3	37.21801547567305	53.
null	5.0	41.00262030042	762  4	40.5357814484456	31	4.2239182652368	309 55	5.102882330470386	54.0
null	7.0	45.660867553058	225  4	40.6600506643174	12 4	.24828780002966	S95  6	80.22695430836405	54.
null	1.0	93.188165665	542 42	2.48402445111137	4	5.7584713231416	552  1	112.5069822320962	56.
null	9.0	25.137207454510	232  4	43.5183551673472	25	5.6198155368567	776  3	37.65092819996126	57.
null	1.0	101.06531426679	787   46	6.10628136375261	5	6.8907670150792	256 12	21.17184569347766	60.
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only showing top 20 rows

## 1.0.4 END

In [13]: spark.stop()