

Sistemi za obradu i analizu velike količine podataka - Treći projekat

Tehnologije

Java 8

Hadoop 2.7

Spark 2.4.3

Kafka 2.4.0 (Scala 2.11)

Docker

ML Batch

```
SparkSession spark = SparkSession.builder().appName("BigData-3-ML-Saving").master(sparkMasterUrl).getOrCreate();

Dataset<Row> dataSet = spark.read().option("header", "true").csv(csvFile);

Dataset<Row> filteredData = dataSet.filter((row) -> {
    return !row.anyNull();
});

UDF1<String, Integer> udfGetDayOfWeek = Main::getDayOfWeekFromDate;
UserDefinedFunction getDayOfWeek = functions.udf(udfGetDayOfWeek, DataTypes.IntegerType);

UDF1<String, Integer> udfGetHourOfDay = Main::getHourOfDayFromDate;
UserDefinedFunction getHourOfDay = functions.udf(udfGetHourOfDay, DataTypes.IntegerType);

Dataset<Row> selectedData = filteredData.select(
    dataSet.col("trip_distance").cast(FloatType).as("TripDistance"),
    dataSet.col("pickup_longitude").cast(DoubleType).as("PickupLongitude"),
    dataSet.col("pickup_latitude").cast(DoubleType).as("PickupLatitude"),
    dataSet.col("dropoff_longitude").cast(DoubleType).as("DropoffLongitude"),
    dataSet.col("dropoff_latitude").cast(DoubleType).as("DropoffLatitude"),
    dataSet.col("rate_code").cast(IntegerType).as("RateCode"),
    getDayOfWeek.apply(dataSet.col("pickup_datetime")).as("DayOfWeek"),
    getHourOfDay.apply(dataSet.col("pickup_datetime")).as("HourOfDay"),
    dataSet.col("fare_amount").cast(FloatType).as("FareAmount")
);
```

ML Batch

```
// nyc coordinates:
// latitude = 40.730610
// longitude = -73.935242
double nycMinLatitude = 38.730610; // -2
double nycMaxLatitude = 42.730610; // +2
double nycMinLongitude = -75.935242; // -2
double nycMaxLongitude = -71.935242; // +2

Dataset<Row> filteredAndSelectedData = selectedData.filter(selectedData.col("TripDistance").notEqual(0.0)
    .and(selectedData.col("PickupLongitude").gt(nycMinLongitude))
    .and(selectedData.col("PickupLongitude").lt(nycMaxLongitude))
    .and(selectedData.col("PickupLatitude").gt(nycMinLatitude))
    .and(selectedData.col("PickupLatitude").lt(nycMaxLatitude))
    .and(selectedData.col("DropoffLongitude").gt(nycMinLongitude))
    .and(selectedData.col("DropoffLongitude").lt(nycMaxLongitude))
    .and(selectedData.col("DropoffLatitude").gt(nycMinLatitude))
    .and(selectedData.col("DropoffLatitude").lt(nycMaxLatitude)));

VectorAssembler vectorAssembler = new VectorAssembler()
    .setInputCols(new String[]{"TripDistance", "PickupLongitude", "PickupLatitude", "DropoffLongitude",
        "DropoffLatitude", "DayOfWeek", "HourOfDay", "RateCode"})
    .setOutputCol("Features");

Dataset<Row> transformedData = vectorAssembler.transform(filteredAndSelectedData);
```

ML Batch

```
Dataset<Row>[] splits = transformedData.randomSplit(new double[]{0.7, 0.3});
Dataset<Row> trainingData = splits[0];
Dataset<Row> testData = splits[1];

RandomForestRegressor rf = new RandomForestRegressor()
    .setLabelCol("FareAmount")
    .setFeaturesCol("Features");

RandomForestRegressionModel model = rf.fit(trainingData);

model.write().overwrite().save(hdfsUrl + "/big-data/ml-model");

Dataset<Row> predictions = model.transform(testData);
predictions.show(100);

RegressionEvaluator evaluator = new RegressionEvaluator()
    .setLabelCol("FareAmount")
    .setPredictionCol("prediction")
    .setMetricName("rmse");

double rmse = evaluator.evaluate(predictions);
System.out.println("Root Mean Squared Error (RMSE) on test data = " + rmse);

spark.stop();
spark.close();
```

ML Batch

TripDistance	PickupLongitude	PickupLatitude	DropoffLongitude	DropoffLatitude	RateCode	DayOfWeek	HourOfDay	FareAmount	Features	prediction
0.1	-74.176627	40.693992	-74.176839	40.69469	5	1	5	89.0	[0.10000000149011...]	58.737010551225545
0.1	-74.065719	40.736415	-74.063249	40.736124	5	3	12	10.0	[0.10000000149011...]	54.72816942145073
0.1	-74.031489	40.747989	-74.032132	40.745665	5	6	1	50.0	[0.10000000149011...]	53.96433985635012
0.1	-74.030594	40.751024	-74.031165	40.749189	5	1	1	55.0	[0.10000000149011...]	53.96433985635012
0.1	-74.029534	40.754394	-74.029019	40.753738	2	1	3	52.0	[0.10000000149011...]	47.87083323929747
0.1	-74.028862	40.750301	-74.029596	40.748284	5	5	22	59.0	[0.10000000149011...]	53.65914699973001
0.1	-74.016645	40.709344	-74.015315	40.711311	1	5	8	4.0	[0.10000000149011...]	7.759521221780579
0.1	-74.015685	40.707588	-74.015225	40.709477	1	5	4	3.0	[0.10000000149011...]	7.6433329446059135
0.1	-74.015397	40.713378	-74.013783	40.714622	1	5	19	4.0	[0.10000000149011...]	7.759521221780579
0.1	-74.01395	40.703626	-74.011409	40.703582	1	4	8	4.5	[0.10000000149011...]	8.834691419302509
0.1	-74.012609	40.703363	-74.010536	40.70415	1	2	10	4.0	[0.10000000149011...]	8.79026119671549
0.1	-74.012111	40.716147	-74.011202	40.715731	1	2	10	3.0	[0.10000000149011...]	7.588119251398949
0.1	-74.010702	40.71752	-74.008504	40.71661	1	2	8	3.0	[0.10000000149011...]	7.588119251398949
0.1	-74.010162	40.719744	-74.00887	40.719299	1	4	17	3.0	[0.10000000149011...]	7.632549473985968
0.1	-74.008723	40.71123	-74.008612	40.709877	1	4	22	3.0	[0.10000000149011...]	7.759521221780579
0.1	-74.008334	40.721349	-74.008194	40.722068	1	4	22	2.5	[0.10000000149011...]	7.662901856412401
0.1	-74.008213	40.733597	-74.006907	40.73373	1	4	8	2.5	[0.10000000149011...]	7.499099515889452
0.1	-74.008162	40.708797	-74.007445	40.708065	1	3	12	3.5	[0.10000000149011...]	7.8808779649021306
0.1	-74.008074	40.721034	-74.005488	40.720482	1	5	7	2.5	[0.10000000149011...]	7.71344517907314
0.1	-74.008014	40.703861	-74.007456	40.705048	1	3	14	3.0	[0.10000000149011...]	8.957799802672417
0.1	-74.00793	40.711826	-74.00942	40.710668	1	3	17	3.0	[0.10000000149011...]	7.8808779649021306
0.1	-74.007682	40.738703	-74.004402	40.738886	1	3	21	3.0	[0.10000000149011...]	7.499099515889452
0.1	-74.00756	40.717765	-74.00799	40.716375	1	5	7	4.5	[0.10000000149011...]	7.717344517907314
0.1	-74.007396	40.743194	-74.006083	40.745147	1	3	15	2.5	[0.10000000149011...]	7.499099515889452
0.1	-74.00722	40.715906	-74.00561	40.718018	1	6	15	3.0	[0.10000000149011...]	7.753906217107518
0.1	-74.006907	40.70687	-74.00811	40.708669	1	4	18	3.0	[0.10000000149011...]	7.8808779649021306
0.1	-74.006654	40.716251	-74.005778	40.716893	1	3	18	2.5	[0.10000000149011...]	7.753906217107518
0.1	-74.006342	40.722819	-74.006495	40.72142	5	7	2	12.0	[0.10000000149011...]	51.74657894848393
0.1	-74.006113	40.748497	-74.00299	40.747307	1	3	23	3.0	[0.10000000149011...]	7.499099515889452
0.1	-74.005604	40.726639	-74.00592	40.724843	1	3	6	2.5	[0.10000000149011...]	7.470616660077934
0.1	-74.00508	40.751541	-73.981421	40.764474	1	4	22	2.5	[0.10000000149011...]	7.499099515889452
0.1	-74.004925	40.718912	-74.003716	40.720756	5	4	4	58.0	[0.10000000149011...]	51.74657894848393
0.1	-74.004685	40.71646	-74.006623	40.7167	1	2	14	3.5	[0.10000000149011...]	7.709475994520501
0.1	-74.004518	40.749272	-74.005869	40.749043	1	4	4	2.5	[0.10000000149011...]	7.382911238714786
0.1	-74.004452	40.737981	-74.006157	40.73812	1	6	22	2.5	[0.10000000149011...]	7.499099515889452
0.1	-74.004191	40.742429	-74.005248	40.739576	1	5	1	3.0	[0.10000000149011...]	7.382911238714786
0.1	-74.004159	40.742742	-74.005128	40.741229	1	5	23	3.0	[0.10000000149011...]	7.499099515889452
0.1	-74.004107	40.725536	-74.001333	40.724366	1	2	10	3.0	[0.10000000149011...]	7.463329813539953
0.1	-74.004099	40.712631	-74.005017	40.713967	1	4	18	3.0	[0.10000000149011...]	7.8808779649021306
0.1	-74.004038	40.742189	-74.001682	40.741221	1	5	2	3.5	[0.10000000149011...]	7.382911238714786
0.1	-74.003968	40.743476	-74.006391	40.743929	1	1	0	3.5	[0.10000000149011...]	7.338481016127768
0.1	-74.003435	40.743751	-74.003976	40.743005	1	7	2	2.5	[0.10000000149011...]	7.382911238714786
0.1	-74.003173	40.748843	-74.003175	40.750605	1	6	14	5.0	[0.10000000149011...]	7.499099515889452
0.1	-74.003089	40.739118	-74.003089	40.739118	1	4	13	2.5	[0.10000000149011...]	7.499099515889452
0.1	-74.002476	40.750291	-74.010298	40.729828	1	7	1	2.5	[0.10000000149011...]	7.382911238714786
0.1	-74.002038	40.71909	-74.00363	40.72083	1	3	18	6.5	[0.10000000149011...]	7.662901856412401
0.1	-74.001502	40.736832	-74.00232	40.73522	1	2	14	3.0	[0.10000000149011...]	7.454669293302435
0.1	-74.001317	40.742562	-73.998091	40.741302	1	2	3	3.5	[0.10000000149011...]	7.338481016127768
0.1	-74.001187	40.746461	-73.999537	40.745698	1	4	14	2.5	[0.10000000149011...]	7.499099515889452
0.1	-74.001012	40.722345	-74.00236	40.722802	1	5	17	5.0	[0.10000000149011...]	7.662901856412401
0.1	-74.000993	40.743902	-73.998037	40.742702	1	3	20	3.0	[0.10000000149011...]	7.499099515889452

```
21/05/12 08:20:29 INFO TaskSetManager: Finished task 1.0 in stage 21.0 (TID 293) in 44
21/05/12 08:20:29 INFO TaskSetManager: Finished task 0.0 in stage 21.0 (TID 292) in 46
21/05/12 08:20:29 INFO TaskSetManager: Finished task 2.0 in stage 21.0 (TID 294) in 48
21/05/12 08:20:29 INFO TaskSchedulerImpl: Removed TaskSet 21.0, whose tasks have all co
21/05/12 08:20:29 INFO DAGScheduler: ResultStage 21 (treeAggregate at RegressionMetrics
21/05/12 08:20:29 INFO DAGScheduler: Job 14 finished: treeAggregate at RegressionMetric
Root Mean Squared Error (RMSE) on test data = 3.3588650885232996
21/05/12 08:20:29 INFO SparkUI: Stopped Spark web UI at http://bfcf95a652f9:4040
21/05/12 08:20:29 INFO StandaloneSchedulerBackend: Shutting down all executors
21/05/12 08:20:29 INFO CoarseGrainedSchedulerBackend$DriverEndpoint: Asking each execut
spark-master | 21/05/12 08:20:29 INFO Master: Received unregister request from application app-2021051
spark-master | 21/05/12 08:20:29 INFO Master: Removing app app-20210512081134-0000
```

ML Batch

Browse Directory

/big-data/ml-model

Go!

Show

25

entries

Search:

<input type="checkbox"/>	<div></div> Permission	<div></div> Owner	<div></div> Group	<div></div> Size	<div></div> Last Modified	<div></div> Replication	<div></div> Block Size	<div></div> Name	<div></div>
<input type="checkbox"/>	drwxr-xr-x	root	supergroup	0 B	May 11 16:57	0	0 B	data	
<input type="checkbox"/>	drwxr-xr-x	root	supergroup	0 B	May 11 16:57	0	0 B	metadata	
<input type="checkbox"/>	drwxr-xr-x	root	supergroup	0 B	May 11 16:57	0	0 B	treesMetadata	

Showing 1 to 3 of 3 entries

Previous




1

Next

Hadoop, 2019.

/big-data/ml-model/data

Go!























Show

25

entries

Search:

<input type="checkbox"/>	 Permission	 Owner	 Group	 Size	 Last Modified	 Replication	 Block Size	 Name	
<input type="checkbox"/>	-rw-r--r--	root	supergroup	0 B	May 11 16:57	3	128 MB	_SUCCESS	
<input type="checkbox"/>	-rw-r--r--	root	supergroup	6.78 KB	May 11 16:57	3	128 MB	part-00000-3f1c9c4a-693b-43a6-a83a-fd88062f01f4-c000.snappy.parquet	
<input type="checkbox"/>	-rw-r--r--	root	supergroup	6.81 KB	May 11 16:57	3	128 MB	part-00001-3f1c9c4a-693b-43a6-a83a-fd88062f01f4-c000.snappy.parquet	
<input type="checkbox"/>	-rw-r--r--	root	supergroup	6.85 KB	May 11 16:57	3	128 MB	part-00002-3f1c9c4a-693b-43a6-a83a-fd88062f01f4-c000.snappy.parquet	
<input type="checkbox"/>	-rw-r--r--	root	supergroup	9.54 KB	May 11 16:57	3	128 MB	part-00003-3f1c9c4a-693b-43a6-a83a-fd88062f01f4-c000.snappy.parquet	
<input type="checkbox"/>	-rw-r--r--	root	supergroup	6.77 KB	May 11 16:57	3	128 MB	part-00004-3f1c9c4a-693b-43a6-a83a-fd88062f01f4-c000.snappy.parquet	
<input type="checkbox"/>	-rw-r--r--	root	supergroup	6.83 KB	May 11 16:57	3	128 MB	part-00005-3f1c9c4a-693b-43a6-a83a-fd88062f01f4-c000.snappy.parquet	
<input type="checkbox"/>	-rw-r--r--	root	supergroup	6.81 KB	May 11 16:57	3	128 MB	part-00006-3f1c9c4a-693b-43a6-a83a-fd88062f01f4-c000.snappy.parquet	
<input type="checkbox"/>	-rw-r--r--	root	supergroup	9.85 KB	May 11 16:57	3	128 MB	part-00007-3f1c9c4a-693b-43a6-a83a-fd88062f01f4-c000.snappy.parquet	
<input type="checkbox"/>	-rw-r--r--	root	supergroup	6.84 KB	May 11 16:57	3	128 MB	part-00008-3f1c9c4a-693b-43a6-a83a-fd88062f01f4-c000.snappy.parquet	
<input type="checkbox"/>	-rw-r--r--	root	supergroup	6.83 KB	May 11 16:57	3	128 MB	part-00009-3f1c9c4a-693b-43a6-a83a-fd88062f01f4-c000.snappy.parquet	

ML Streaming

```
SparkSession spark = SparkSession.builder().appName("BigData-4-ML-Streaming").master(sparkMasterUrl).getOrCreate();
JavaSparkContext javaSparkContext = JavaSparkContext.fromSparkContext(spark.sparkContext());
JavaStreamingContext streamingContext = new JavaStreamingContext(javaSparkContext, new Duration(dataReceivingSleep * 1000))

RandomForestRegressionModel model = RandomForestRegressionModel.load(hdfsUrl + "/big-data/ml-model/");

Map<String, Object> kafkaParams = getKafkaParams(kafkaUrl);
Collection<String> topics = Collections.singletonList(TaxiTopic);

JavaInputDStream<ConsumerRecord<Object, String>> stream =
    KafkaUtils.createDirectStream(
        streamingContext,
        LocationStrategies.PreferConsistent(),
        ConsumerStrategies.Subscribe(topics, kafkaParams)
    );

JavaDStream<String> receivedData = stream.map(ConsumerRecord::value);
JavaDStream<EventData> eventData = receivedData.map(EventData::CreateEventData);

JavaDStream<EventData> filteredData = eventData.filter(ed -> ed != null &&
    !ed.getTripDistance().equals("0.0") &&
    !ed.getPickupLongitude().equals("0.0") &&
    !ed.getPickupLatitude().equals("0.0") &&
    !ed.getDropoffLongitude().equals("0.0") &&
    !ed.getDropoffLatitude().equals("0.0") &&
    !ed.getRateCode().equals(null) &&
    !ed.getPickupDateTime().equals(null)
);

JavaDStream<Row> rows = filteredData.map(row -> RowFactory.create(
    Float.parseFloat(row.getTripDistance()),
    Double.parseDouble(row.getPickupLongitude()),
    Double.parseDouble(row.getPickupLatitude()),
    Double.parseDouble(row.getDropoffLongitude()),
    Double.parseDouble(row.getDropoffLatitude()),
    Integer.parseInt(row.getRateCode()),
    getDayOfWeekFromDate(row.getPickupDateTime()),
    getHourOfDayFromDate(row.getPickupDateTime())
));
```


ML Streaming

```
rows.foreachRDD(d -> {  
  StructType rowSchema = DataTypes.createStructType(  
    new StructField[]{  
      createStructField("TripDistance", DataTypes.FloatType, false),  
      createStructField("PickupLongitude", DataTypes.DoubleType, false),  
      createStructField("PickupLatitude", DataTypes.DoubleType, false),  
      createStructField("DropoffLongitude", DataTypes.DoubleType, false),  
      createStructField("DropoffLatitude", DataTypes.DoubleType, false),  
      createStructField("RateCode", DataTypes.IntegerType, false),  
      createStructField("DayOfWeek", DataTypes.IntegerType, false),  
      createStructField("HourOfDay", DataTypes.IntegerType, false),  
    }  
  });  
  
  Dataset<Row> data = spark.createDataFrame(d, rowSchema);  
  
  VectorAssembler vectorAssembler = new VectorAssembler()  
    .setInputCols(new String[]{"TripDistance", "PickupLongitude", "PickupLatitude", "DropoffLongitude",  
      "DropoffLatitude", "RateCode", "DayOfWeek", "HourOfDay"})  
    .setOutputCol("Features");  
  
  Dataset<Row> transformed = vectorAssembler.transform(data);  
  Dataset<Row> predictions = model.transform(transformed);  
  predictions.show(100);  
});
```

ML Streaming

```
21/05/11 15:25:01 INFO DAGScheduler: ResultStage 11 (show at Main.java:116) finished in 0.737 s
21/05/11 15:25:01 INFO DAGScheduler: Job 7 finished: show at Main.java:116, took 0.754938 s
```

TripDistance	PickupLongitude	PickupLatitude	DropoffLongitude	DropoffLatitude	RateCode	DayOfWeek	HourOfDay	Features	prediction
2.3	-73.98857	40.739406	-73.986626	40.765217	1	5	20	[2.29999995231628...]	11.277809310241029

```
21/05/11 15:25:01 INFO JobScheduler: Finished job streaming job 1620746700000 ms.0 from job set of time 1620746700000 ms
21/05/11 15:25:01 INFO JobScheduler: Total delay: 1.643 s for time 1620746700000 ms (execution: 1.486 s)
21/05/11 15:25:01 INFO ReceivedBlockTracker: Deleting batches:
```

```
21/05/11 15:25:30 INFO JobScheduler: Total delay: 0.584 s for time 1620746730000 ms (execution: 0.566 s)
```

TripDistance	PickupLongitude	PickupLatitude	DropoffLongitude	DropoffLatitude	RateCode	DayOfWeek	HourOfDay	Features	prediction
1.7	-73.960213	40.770464	-73.979863	40.77705	1	5	20	[1.70000004768371...]	8.64848592515177
0.9	-73.995371	40.717248	-73.984367	40.720524	1	5	20	[0.89999997615814...]	7.402053100375133
0.9	-73.983811	40.749655	-73.989747	40.756575	1	5	20	[0.89999997615814...]	7.12812526226065

```
21/05/11 15:25:30 INFO MapPartitionsRDD: Removing RDD 30 from persistence list
DAGScheduler | Sleeping 10sec
```

TripDistance	PickupLongitude	PickupLatitude	DropoffLongitude	DropoffLatitude	RateCode	DayOfWeek	HourOfDay	Features	prediction
3.6	-73.984138	40.726317	-73.962869	40.758443	1	5	20	[3.59999990463256...]	13.31525507597342
2.1	-73.979906	40.74585	-73.95909	40.773639	1	5	20	[2.09999990463256...]	9.667650540227058
3.4	-73.981147	40.758918	-73.94251	40.785975	1	5	20	[3.40000009536743...]	13.280766151283803

```
21/05/11 15:26:00 INFO JobScheduler: Finished job streaming job 1620746760000 ms.0 from job set of time 1620746760000 ms
```

Pomoćne funkcije

```
public static int getDayOfWeekFromDate(String stringDate) {
    // example format: 2014-01-09 20:45:25
    SimpleDateFormat formatter = new SimpleDateFormat("yyyy-MM-dd HH:mm:ss");
    Date date = new Date();

    try {
        date = formatter.parse(stringDate);
    } catch (ParseException e) {
        e.printStackTrace();
    }

    Calendar calendar = Calendar.getInstance();
    calendar.setTime(date);
    return calendar.get(Calendar.DAY_OF_WEEK); // the day of the week in numerical format
}

public static int getHourOfDayFromDate(String stringDate) {
    // example format: 2014-01-09 20:45:25
    SimpleDateFormat formatter = new SimpleDateFormat("yyyy-MM-dd HH:mm:ss");
    Date date = new Date();

    try {
        date = formatter.parse(stringDate);
    } catch (ParseException e) {
        e.printStackTrace();
    }

    Calendar calendar = Calendar.getInstance();
    calendar.setTime(date);
    return calendar.get(Calendar.HOUR_OF_DAY); // the hour of the day in numerical format
}
```