

Diabetes Data (With Random Forest Classification)

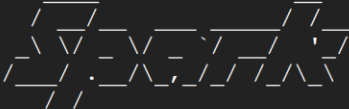
Creating a Hadoop directory and loading the data from the local files system to Hadoop

```
Linux midterm-m 5.10.0-0.bpo.12-amd64 #1 SMP Debian 5.10.103-1~bpo10+1 (2022-03-08) x86_64

The programs included with the Debian GNU/Linux system are free software;
the exact distribution terms for each program are described in the
individual files in /usr/share/doc/*/copyright.

Debian GNU/Linux comes with ABSOLUTELY NO WARRANTY, to the extent
permitted by applicable law.
Last login: Sat Jul 30 00:23:51 2022 from 35.235.244.34
harsh88maggo@midterm-m:~$ hadoop fs -mkdir /MidTerm
mkdir: `/MidTerm': File exists
harsh88maggo@midterm-m:~$ hadoop fs -copyFromLocal diabetes.csv /MidTerm/.
copyFromLocal: `diabetes.csv': No such file or directory
harsh88maggo@midterm-m:~$ hadoop fs -copyFromLocal diabetes.csv /MidTerm/.
harsh88maggo@midterm-m:~$
```

Running the Spark Shell

```
https://ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m7authuser=08hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot255Enabled=true&troubleshoot2...  
harsh88maggo@midterm-m:~$ spark-shell --master yarn  
Setting default log level to "WARN".  
To adjust logging level use sc.setLogLevel(newLevel). For SparkR, use setLogLevel(new  
22/07/30 00:36:24 INFO org.apache.spark.SparkEnv: Registering MapOutputTracker  
22/07/30 00:36:24 INFO org.apache.spark.SparkEnv: Registering BlockManagerMaster  
22/07/30 00:36:24 INFO org.apache.spark.SparkEnv: Registering BlockManagerMasterHeartbeat  
22/07/30 00:36:24 INFO org.apache.spark.SparkEnv: Registering OutputCommitCoordinator  
Spark context Web UI available at http://midterm-m.us-central1-a.c.utoyian-outlet-355300  
Spark context available as 'sc' (master = yarn, app id = application_1659139248703_000000)  
Spark session available as 'spark'.  
Welcome to  
 version 3.1.3  
Using Scala version 2.12.14 (OpenJDK 64-Bit Server VM, Java 1.8.0_332)  
Type in expressions to have them evaluated.  
Type :help for more information.  
scala>
```

Import statements

Split the dataset into train and test

```
ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m7authuser-08hl-en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot255Enabled=true&troubleshoot2...  
| 0.0| 137.0| 40.0| 35.0| 168.0|43.1| 2.288|33.0| 1.0|  
| 5.0| 116.0| 74.0| 0.0| 0.0|25.6| 0.201|30.0| 0.0|  
| 3.0| 78.0| 50.0| 32.0| 88.0|31.0| 0.248|26.0| 1.0|  
| 10.0| 115.0| 0.0| 0.0| 0.0|35.3| 0.134|29.0| 0.0|  
| 2.0| 197.0| 70.0| 45.0| 543.0|30.5| 0.158|53.0| 1.0|  
| 8.0| 125.0| 96.0| 0.0| 0.0| 0.0| 0.232|54.0| 1.0|  
| 4.0| 110.0| 92.0| 0.0| 0.0|37.6| 0.191|30.0| 0.0|  
| 10.0| 168.0| 74.0| 0.0| 0.0|38.0| 0.537|34.0| 1.0|  
| 10.0| 139.0| 80.0| 0.0| 0.0|27.1| 1.441|57.0| 0.0|  
| 1.0| 189.0| 60.0| 23.0| 846.0|30.1| 0.398|59.0| 1.0|  
| 5.0| 166.0| 72.0| 19.0| 175.0|25.8| 0.587|51.0| 1.0|  
| 7.0| 100.0| 0.0| 0.0| 0.0|30.0| 0.484|32.0| 1.0|  
| 0.0| 118.0| 84.0| 47.0| 230.0|45.8| 0.551|31.0| 1.0|  
| 7.0| 107.0| 74.0| 0.0| 0.0|29.6| 0.254|31.0| 1.0|  
| 1.0| 103.0| 30.0| 38.0| 83.0|43.3| 0.183|33.0| 0.0|  
| 1.0| 115.0| 70.0| 30.0| 96.0|34.6| 0.529|32.0| 1.0|  
+-----+-----+-----+-----+-----+-----+-----+-----+-----+  
only showing top 20 rows  
  
scala> val Array(trainingdata_harshdeep, testdata_harshdeep) = dataset_harshdeep.randomSplit(Array(0.8, 0.2), 521)  
trainingdata_harshdeep: org.apache.spark.sql.Dataset[org.apache.spark.sql.Row] = [Pregnancies: double, Glucose: double ... 7 more fields]  
testdata_harshdeep: org.apache.spark.sql.Dataset[org.apache.spark.sql.Row] = [Pregnancies: double, Glucose: double ... 7 more fields]  
  
scala> :paste  
// Entering paste mode (ctrl-D to finish)  
  
val assembler_harshdeep = new VectorAssembler()  
.setInputCols(Array("Pregnancies", "Glucose", "BloodPressure", "SkinThickness", "Insulin", "BMI", "DiabetesPedigreeFunction", "Age"))  
.setOutputCol("assembled-features")  
  
// Exiting paste mode, now interpreting.  
  
assembler_harshdeep: org.apache.spark.ml.feature.VectorAssembler = VectorAssembler: uid=vecAssembler_e138ef729e05, handleInvalid=error, numInput  
scala> |
```

Assembling the features using VectorAssembler

```
ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m7authuser-08hl-en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot255Enabled=true&troubleshoot2...  
| 0.0| 137.0| 40.0| 35.0| 168.0|43.1| 2.288|33.0| 1.0|  
| 5.0| 116.0| 74.0| 0.0| 0.0|25.6| 0.201|30.0| 0.0|  
| 3.0| 78.0| 50.0| 32.0| 88.0|31.0| 0.248|26.0| 1.0|  
| 10.0| 115.0| 0.0| 0.0| 0.0|35.3| 0.134|29.0| 0.0|  
| 2.0| 197.0| 70.0| 45.0| 543.0|30.5| 0.158|53.0| 1.0|  
| 8.0| 125.0| 96.0| 0.0| 0.0| 0.0| 0.232|54.0| 1.0|  
| 4.0| 110.0| 92.0| 0.0| 0.0|37.6| 0.191|30.0| 0.0|  
| 10.0| 168.0| 74.0| 0.0| 0.0|38.0| 0.537|34.0| 1.0|  
| 10.0| 139.0| 80.0| 0.0| 0.0|27.1| 1.441|57.0| 0.0|  
| 1.0| 189.0| 60.0| 23.0| 846.0|30.1| 0.398|59.0| 1.0|  
| 5.0| 166.0| 72.0| 19.0| 175.0|25.8| 0.587|51.0| 1.0|  
| 7.0| 100.0| 0.0| 0.0| 0.0|30.0| 0.484|32.0| 1.0|  
| 0.0| 118.0| 84.0| 47.0| 230.0|45.8| 0.551|31.0| 1.0|  
| 7.0| 107.0| 74.0| 0.0| 0.0|29.6| 0.254|31.0| 1.0|  
| 1.0| 103.0| 30.0| 38.0| 83.0|43.3| 0.183|33.0| 0.0|  
| 1.0| 115.0| 70.0| 30.0| 96.0|34.6| 0.529|32.0| 1.0|  
+-----+-----+-----+-----+-----+-----+-----+-----+-----+  
only showing top 20 rows  
  
scala> val Array(trainingdata_harshdeep, testdata_harshdeep) = dataset_harshdeep.randomSplit(Array(0.8, 0.2), 521)  
trainingdata_harshdeep: org.apache.spark.sql.Dataset[org.apache.spark.sql.Row] = [Pregnancies: double, Glucose: double ... 7 more fields]  
testdata_harshdeep: org.apache.spark.sql.Dataset[org.apache.spark.sql.Row] = [Pregnancies: double, Glucose: double ... 7 more fields]  
  
scala> :paste  
// Entering paste mode (ctrl-D to finish)  
  
val assembler_harshdeep = new VectorAssembler()  
.setInputCols(Array("Pregnancies", "Glucose", "BloodPressure", "SkinThickness", "Insulin", "BMI", "DiabetesPedigreeFunction", "Age"))  
.setOutputCol("assembled-features")  
  
// Exiting paste mode, now interpreting.  
  
assembler_harshdeep: org.apache.spark.ml.feature.VectorAssembler = VectorAssembler: uid=vecAssembler_e138ef729e05, handleInvalid=error, numInput  
scala> |
```

Creating the Random Forest Object and passing the features

```
https://ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m?authuser=0&hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot255Enabled=tru...
ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m?authuser=0&hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot2...

val rf_harshdeep = new RandomForestClassifier()
  .setFeaturesCol("assembled-features")
  .setLabelCol("Outcome")
  .setSeed(1234)

// Exiting paste mode, now interpreting.

rf_harshdeep: org.apache.spark.ml.classification.RandomForestClassifier = rfc_9d25d32fa7ee

scala> :paste
// Entering paste mode (ctrl-D to finish)

val pipeline_harshdeep = new Pipeline()
  .setStages(Array(assembler, rf))

// Exiting paste mode, now interpreting.

<paste>:34: error: not found: value assembler
  .setStages(Array(assembler, rf))
                  ^
<paste>:34: error: not found: value rf
  .setStages(Array(assembler, rf))
                  ^

scala> :paste
// Entering paste mode (ctrl-D to finish)

val pipeline_harshdeep = new Pipeline()
  .setStages(Array(assembler_harshdeep, rf_harshdeep))

// Exiting paste mode, now interpreting.

pipeline_harshdeep: org.apache.spark.ml.Pipeline = pipeline_ee907308b7b4
```

Creating the pipelining

```
https://ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m?authuser=0&hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot255Enabled=tru...
ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m?authuser=0&hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot2...

val rf_harshdeep = new RandomForestClassifier()
  .setFeaturesCol("assembled-features")
  .setLabelCol("Outcome")
  .setSeed(1234)

// Exiting paste mode, now interpreting.

rf_harshdeep: org.apache.spark.ml.classification.RandomForestClassifier = rfc_9d25d32fa7ee

scala> :paste
// Entering paste mode (ctrl-D to finish)

val pipeline_harshdeep = new Pipeline()
  .setStages(Array(assembler, rf))

// Exiting paste mode, now interpreting.

<paste>:34: error: not found: value assembler
  .setStages(Array(assembler, rf))
                  ^
<paste>:34: error: not found: value rf
  .setStages(Array(assembler, rf))
                  ^

scala> :paste
// Entering paste mode (ctrl-D to finish)

val pipeline_harshdeep = new Pipeline()
  .setStages(Array(assembler_harshdeep, rf_harshdeep))

// Exiting paste mode, now interpreting.

pipeline_harshdeep: org.apache.spark.ml.Pipeline = pipeline_ee907308b7b4
```

Evaluator for our model

```
https://ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m?authuser=0&hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot255Enabled=true&troubleshoot2...
ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m?authuser=0&hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot2...

evaluator harshdeep: org.apache.spark.ml.evaluation.MulticlassClassificationEvaluator = MulticlassClassificationEvaluator: uid=mcEval_fe2407a0ff
cName=accuracy, metricLabel=0.0, beta=1.0, eps=1.0E-15

scala> :paste
// Entering paste mode (ctrl-D to finish)

val paramGrid harshdeep = new ParamGridBuilder()
  .addGrid(rf_harshdeep.maxDepth, Array(4,6,8))
  .addGrid(rf_harshdeep.numTrees, Array(1,2,4)).build()

// Exiting paste mode, now interpreting.

paramGrid_harshdeep: Array[org.apache.spark.ml.param.ParamMap] =
Array([
  rfc_9d25d32fa7ee-maxDepth: 4,
  rfc_9d25d32fa7ee-numTrees: 1
], [
  rfc_9d25d32fa7ee-maxDepth: 4,
  rfc_9d25d32fa7ee-numTrees: 2
], [
  rfc_9d25d32fa7ee-maxDepth: 4,
  rfc_9d25d32fa7ee-numTrees: 4
], [
  rfc_9d25d32fa7ee-maxDepth: 6,
  rfc_9d25d32fa7ee-numTrees: 1
], [
  rfc_9d25d32fa7ee-maxDepth: 6,
  rfc_9d25d32fa7ee-numTrees: 2
], [
  rfc_9d25d32fa7ee-maxDepth: 6,
  rfc_9d25d32fa7ee-numTrees: 4
], [
  rfc_9d25d32fa7ee-maxDepth: 8,
  rfc_9d25d32fa7ee-numTrees: 1
])
```

Setting the hyperparameters

```
https://ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m?authuser=0&hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot255Enabled=true&troubleshoot2...
ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m?authuser=0&hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot2...

evaluator harshdeep: org.apache.spark.ml.evaluation.MulticlassClassificationEvaluator = MulticlassClassificationEvaluator: uid=mcEval_fe2407a0ff
cName=accuracy, metricLabel=0.0, beta=1.0, eps=1.0E-15

scala> :paste
// Entering paste mode (ctrl-D to finish)

val paramGrid harshdeep = new ParamGridBuilder()
  .addGrid(rf_harshdeep.maxDepth, Array(4,6,8))
  .addGrid(rf_harshdeep.numTrees, Array(1,2,4)).build()

// Exiting paste mode, now interpreting.

paramGrid_harshdeep: Array[org.apache.spark.ml.param.ParamMap] =
Array([
  rfc_9d25d32fa7ee-maxDepth: 4,
  rfc_9d25d32fa7ee-numTrees: 1
], [
  rfc_9d25d32fa7ee-maxDepth: 4,
  rfc_9d25d32fa7ee-numTrees: 2
], [
  rfc_9d25d32fa7ee-maxDepth: 4,
  rfc_9d25d32fa7ee-numTrees: 4
], [
  rfc_9d25d32fa7ee-maxDepth: 6,
  rfc_9d25d32fa7ee-numTrees: 1
], [
  rfc_9d25d32fa7ee-maxDepth: 6,
  rfc_9d25d32fa7ee-numTrees: 2
], [
  rfc_9d25d32fa7ee-maxDepth: 6,
  rfc_9d25d32fa7ee-numTrees: 4
], [
  rfc_9d25d32fa7ee-maxDepth: 8,
  rfc_9d25d32fa7ee-numTrees: 1
])
```

Creating the Cross Validator

```
https://ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m7authuser-08hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot255Enabled=true...
ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m7authuser-08hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot2...

}, {
  rfc_9d25d32fa7ee-maxDepth: 4,
  rfc_9d25d32fa7ee-numTrees: 4
}, {
  rfc_9d25d32fa7ee-maxDepth: 6,
  rfc_9d25d32fa7ee-numTrees: 1
}, {
  rfc_9d25d32fa7ee-maxDepth: 6,
  rfc_9d25d32fa7ee-numTrees: 2
}, {
  rfc_9d25d32fa7ee-maxDepth: 6,
  rfc_9d25d32fa7ee-numTrees: 4
}, {
  rfc_9d25d32fa7ee-maxDepth: 8,
  rfc_9d25d32fa7ee-numTrees: 1
}, {
  rfc_9d25d32fa7ee-maxDepth: 8,
  rfc_9d25d32fa7ee-numTrees: 2
}, {
  rfc_9d25d32fa7ee-maxDepth: 8,
  rfc_9d25d32fa7ee-numTrees: 4
})

scala> :paste
// Entering paste mode (ctrl-D to finish)

val cross_validator_harshdeep = new CrossValidator()
  .setEstimator(pipeline_harshdeep)
  .setEvaluator(evaluator_harshdeep)
  .setEstimatorParamMaps(paramGrid_harshdeep)
  .setNumFolds(3)

// Exiting paste mode, now interpreting.

cross_validator_harshdeep: org.apache.spark.ml.tuning.CrossValidator = cv_44752ec6e46d
```

Training our model

```
https://ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m7authuser-08hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot255Enabled=true...
ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m7authuser-08hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot2...

<console>:34: error: not found: value cross_validator
    val cvModel_harshdeep = cross_validator.fit(trainingdata_harshdeep)
                              ^

scala> val cvModel_harshdeep = cross_validator_harshdeep.fit(trainingdata_harshdeep)
cvModel_harshdeep: org.apache.spark.ml.tuning.CrossValidatorModel = CrossValidatorModel: v_44752ec6e46d, bestModel=pipeline_ee907308b7b4, numFolds=3

scala> val predictions_harshdeep = cvModel_harshdeep.transform(testdata_harshdeep)
predictions_harshdeep: org.apache.spark.sql.DataFrame = [Pregnancies: double, Glucose: dou... 11 more fields]

scala> :paste
// Entering paste mode (ctrl-D to finish)

val accuracy_harshdeep = evaluator.evaluate(predictions_harshdeep)

println("accuracy on test data = " + accuracy)

// Exiting paste mode, now interpreting.
```


Prediction using testdata

```
https://ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m7authuser-08hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot255Enabled=true...
ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m7authuser-08hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot255Enabled=true...

<console>:34: error: not found: value cross_validator
      val cvModel_harshdeep = cross_validator.fit(trainingdata_harshdeep)
                                ^

scala> val cvModel_harshdeep = cross_validator_harshdeep.fit(trainingdata_harshdeep)
cvModel_harshdeep: org.apache.spark.ml.tuning.CrossValidatorModel = CrossValidatorModel: u
v_44752ec6e46d, bestModel=pipeline_ee907308b7b4, numFolds=3

scala> val predictions_harshdeep = cvModel_harshdeep.transform(testdata_harshdeep)
predictions_harshdeep: org.apache.spark.sql.DataFrame = [Pregnancies: double, Glucose: dou
... 11 more fields]

scala> :paste
// Entering paste mode (ctrl-D to finish)

val accuracy_harshdeep = evaluator.evaluate(predictions_harshdeep)

println("accuracy on test data = " + accuracy)

// Exiting paste mode, now interpreting.
```

Evaluating the performance of our model

```
https://ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m7authuser-08hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot255Enabled=true...
ssh.cloud.google.com/v2/ssh/projects/utopian-outlet-355300/zones/us-central1-a/instances/midterm-m7authuser-08hl=en_US&projectNumber=1024426281300&useAdminProxy=true&troubleshoot4005Enabled=true&troubleshoot255Enabled=true...

println("accuracy on test data = " + accuracy_harshdeep)

// Exiting paste mode, now interpreting.

<pastie>:34: error: not found: value evaluator
val accuracy_harshdeep = evaluator.evaluate(predictions_harshdeep)
                             ^

scala> :paste
// Entering paste mode (ctrl-D to finish)

val accuracy_harshdeep = evaluator_harshdeep.evaluate(predictions_harshdeep)

println("accuracy on test data = " + accuracy_harshdeep)

// Exiting paste mode, now interpreting.

accuracy on test data = 0.8089171974522293
accuracy_harshdeep: Double = 0.8089171974522293

scala> 
```

ACCURACY: 80.89%