```
!pip install pyspark
     Looking in indexes: <a href="https://pypi.org/simple">https://us-python.pkg.dev/colab-wheels/public/simple/</a>
     Collecting pyspark
       Downloading pyspark-3.3.2.tar.gz (281.4 MB)
                                                 - 281.4/281.4 MB 4.2 MB/s eta 0:00:00
       Preparing metadata (setup.py) ... done
     Collecting py4j==0.10.9.5
       Downloading py4j-0.10.9.5-py2.py3-none-any.whl (199 kB)
                                                - 199.7/199.7 KB 20.6 MB/s eta 0:00:00
     Building wheels for collected packages: pyspark
       Building wheel for pyspark (setup.py) ... done
       Created wheel for pyspark: filename=pyspark-3.3.2-py2.py3-none-any.whl size=281824028 sha256=a13aca676936528aa26bc4bd3baad454c1f1204ec
       Stored in directory: /root/.cache/pip/wheels/6c/e3/9b/0525ce8a69478916513509d43693511463c6468db0de237c86
     Successfully built pyspark
     Installing collected packages: py4j, pyspark
       Attempting uninstall: py4j
         Found existing installation: py4j 0.10.9.7
         Uninstalling py4j-0.10.9.7:
           Successfully uninstalled py4j-0.10.9.7
     Successfully installed py4j-0.10.9.5 pyspark-3.3.2
from pyspark.sql import SparkSession
spark = SparkSession.builder.master("local[*]").getOrCreate()
. . .
load models
from pyspark.ml import Pipeline
from pyspark.ml.feature import StringIndexer, VectorIndexer, IndexToString
from\ pyspark.ml. evaluation\ import\ Multiclass Classification Evaluator
from pyspark.mllib.evaluation import MulticlassMetrics
from google.colab import drive
# Mount Google Drive to this Notebook instance
drive.mount('/content/drive')
                                    nt/drive; to attempt to forcibly remount, call drive.mount("/content/drive", force_remount=True).
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data = spark.read.format("libsvm").load("/content/drive/My Drive/dataset.txt")
data.select("features").show(1,False)
     |(4,[0,1,2,3],[-0.222222,0.5,-0.762712,-0.833333])|
    only showing top 1 row
labelIndexer = StringIndexer(inputCol="label", outputCol="indexedLabel").fit(data)
featureIndexer = VectorIndexer(inputCol="features", outputCol="indexedFeatures", maxCategories=4).fit(data)
(trainingData, testData) = data.randomSplit([0.7, 0.3])
from pyspark.ml.classification import RandomForestClassifier
for n in (7,5):
 rf = RandomForestClassifier(numTrees=n,featuresCol="indexedFeatures",labelCol="indexedLabel")
 rf_pipeline = Pipeline(stages=[labelIndexer, featureIndexer, rf])
 •rf_model·=·rf_pipeline.fit(trainingData)
 rf_predictions = rf_model.transform(testData)
 print(rf_model.stages[2])
 rf_predictions.show(5)
```

```
RandomForestClassificationModel: uid=RandomForestClassifier_6334c0ec4696, numTrees=7, numClasses=3, numFeatures=4
    +----+
                    features|indexedLabel| indexedFeatures| rawPrediction| probability|prediction|
                                     0.0|(4,[0,1,2,3],[-0....|[5.833333333333...|[0.8333333333333...|
       0.0|(4,[0,1,2,3],[-0....|
                                     0.0|(4,[0,1,2,3],[-0...)|[5.833333333333...]|[0.8333333333333...]|
0.0|(4,[0,1,2,3],[-0...)|[7.0,0.0,0.0]||[1.0,0.0,0.0]|
       0.0|(4,[0,1,2,3],[-0....|
                                                                                                            0.01
       0.0|(4,[0,1,2,3],[-0....|
                                                                                                            0.0
                                     0.0|(4,[0,1,2,3],[0.1...|[6.833333333333...|[0.97619047619047...|
       0.0|(4,[0,1,2,3],[0.1...|
                                                                                                            0.01
                                     0.0|(4,[0,1,2,3],[0.1...|
                                                                [7.0,0.0,0.0]
                                                                                     [1.0,0.0,0.0]
                                                                                                            0.0
    0.0|(4,[0,1,2,3],[0.1...|
                                                                    -----+-
    only showing top 5 rows
    RandomForestClassificationModel: uid=RandomForestClassifier_f991bb141c24, numTrees=5, numClasses=3, numFeatures=4
            featureslindexedLabell
                                            indexedFeatures| rawPrediction|
                                                                                        probability|prediction|
    0.0|(4,[0,1,2,3],[-0....|
                                      0.0 | (4,[0,1,2,3],[-0...]  [5.0,0.0,0.0] | [1.0,0.0,0.0] |
                                                                                                            a al
       0.0|(4,[0,1,2,3],[-0....|
                                      0.0|(4,[0,1,2,3],[-0....|
                                                                    [5.0,0.0,0.0]
                                                                                        [1.0,0.0,0.0]
                                                                                                            0.0
                                    0.0 (4, [0,1,2,3], [-0....
      0.0|(4,[0,1,2,3],[-0....|
                                                                    [5.0,0.0,0.0]
                                                                                        [1.0.0.0.0.0]
                                                                                                            0.01
                                     0.0|(4,[0,1,2,3],[0.1...|[4.94736842105263...|[0.98947368421052...|
       0.0|(4,[0,1,2,3],[0.1...|
                                                                                                            0.01
     0.0|(4,[0,1,2,3],[0.1...|
                                      0.0|(4,[0,1,2,3],[0.1...|[4.94736842105263...|[0.98947368421052...|
                                                                                                            0.0
    only showing top 5 rows
from pyspark.ml.evaluation import MulticlassClassificationEvaluator
from pyspark.sql.functions import col
# calculate accuracy
accuracy_evaluator = MulticlassClassificationEvaluator(labelCol="indexedLabel", predictionCol="prediction", metricName="accuracy")
accuracy = accuracy_evaluator.evaluate(rf_predictions)
# calculate precision
precision_evaluator = MulticlassClassificationEvaluator(labelCol="indexedLabel", predictionCol="prediction", metricName="weightedPrecision")
precision = precision_evaluator.evaluate(rf_predictions)
# calculate recall
recall_evaluator = MulticlassClassificationEvaluator(labelCol="indexedLabel", predictionCol="prediction", metricName="weightedRecall")
recall = recall_evaluator.evaluate(rf_predictions)
# calculate F1 score
\verb|f1_evaluator = MulticlassClassificationEvaluator(labelCol="indexedLabel", predictionCol="prediction", metricName="f1")|
f1_score = f1_evaluator.evaluate(rf_predictions)
 Saved successfully!
print("Recall: ", recall)
print("F1 score: ", f1_score)
print("F1 score: ", f1_score)
    Accuracy: 0.9629629629629
    Precision: 0.9673202614379085
    Recall: 0.9629629629629
    F1 score: 0.9628858024691358
    F1 score: 0.9628858024691358
# create a confusion matrix
predictionsAndLabels = rf_predictions.select("prediction", "indexedLabel").rdd
metrics = MulticlassMetrics(predictionsAndLabels)
confusion_matrix = metrics.confusionMatrix().toArray()
# print the confusion matrix
print("Confusion matrix:")
print(confusion_matrix)
# calculate precision, recall, and F1-score
tp = confusion_matrix[1, 1]
fp = confusion_matrix[0, 1]
tn = confusion_matrix[0, 0]
fn = confusion_matrix[1, 0]
precision = tp / (tp + fp)
recall = tp / (tp + fn)
f1_score = 2 * (precision * recall) / (precision + recall)
accuracy = (tp + tn) / (tp + fp + tn + fn)
# print the evaluation metrics
```

```
print("Precision: ", precision)
print("Recall: ", recall)
print("F1 score: ", f1_score)
print("Accuracy: ", accuracy)

//usr/local/lib/python3.9/dist-packages/pyspark/sql/context.py:157: FutureWarning: Deprecated in 3.0.0. Use SparkSession.builder.getOrCrewarnings.warn(
Confusion matrix:
[[15. 0. 0.]
  [ 0. 23. 0.]
  [ 2. 0. 14.]]
Precision: 1.0
Recall: 1.0
F1 score: 1.0
Accuracy: 1.0
```

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