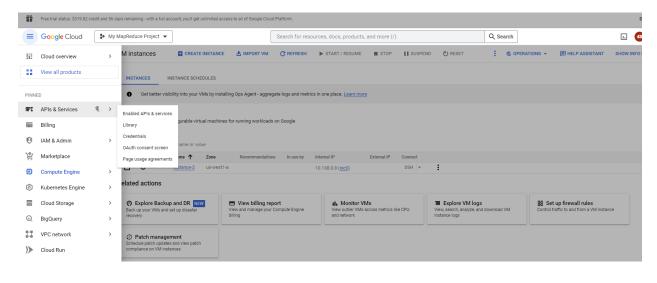
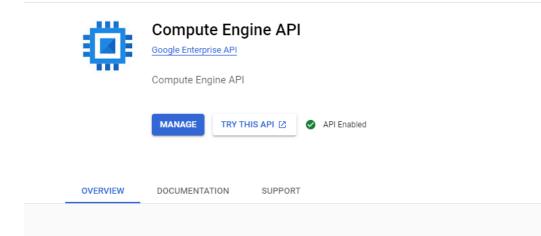
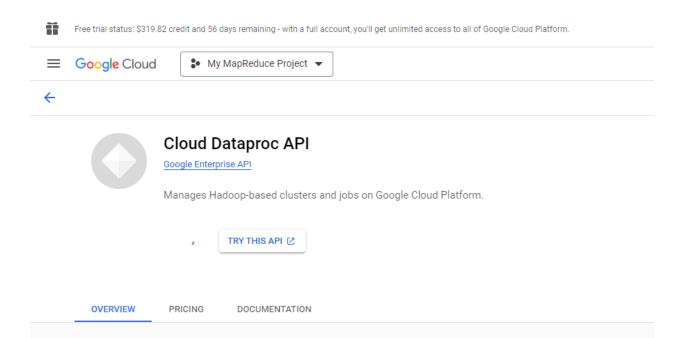
Part 1: Enable the Google Cloud Engine API and Dataproc API



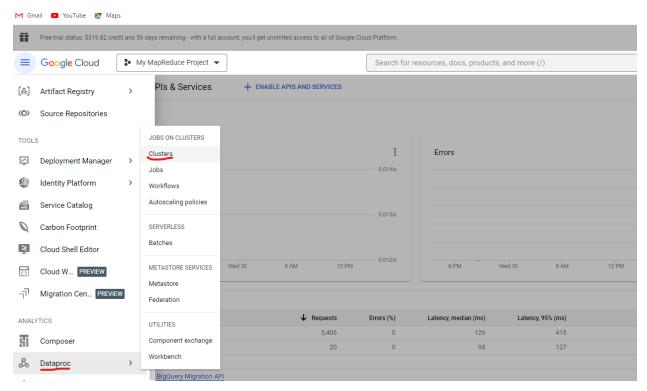


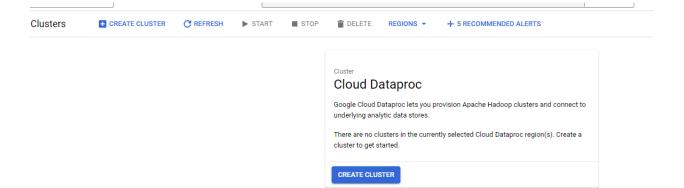
Overview

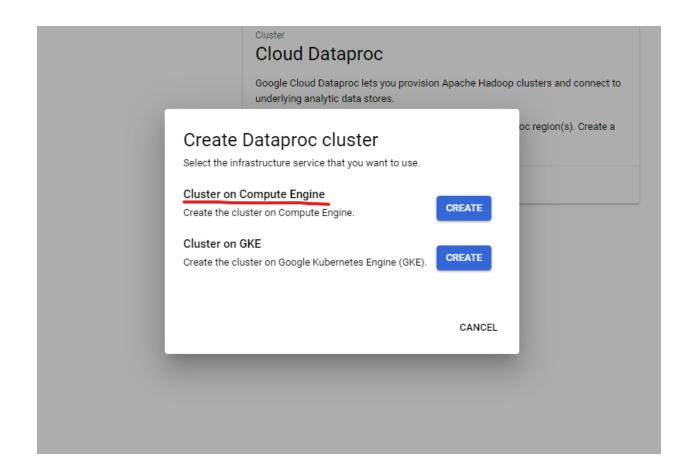


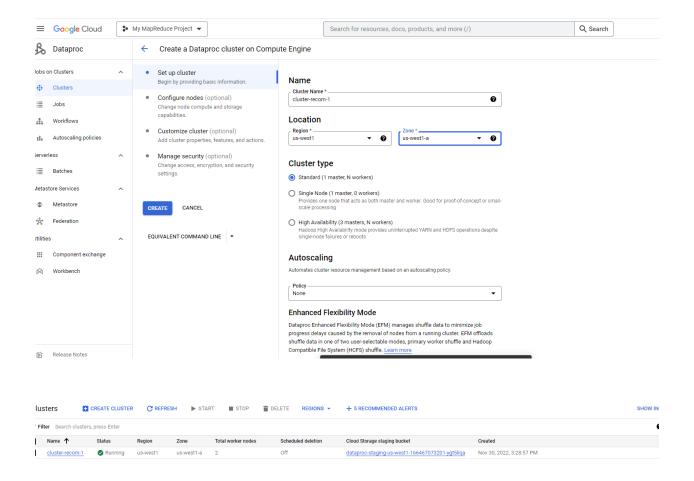


Part 2: Create a Dataproc Cluster

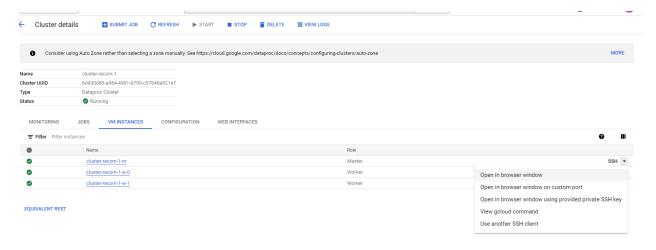




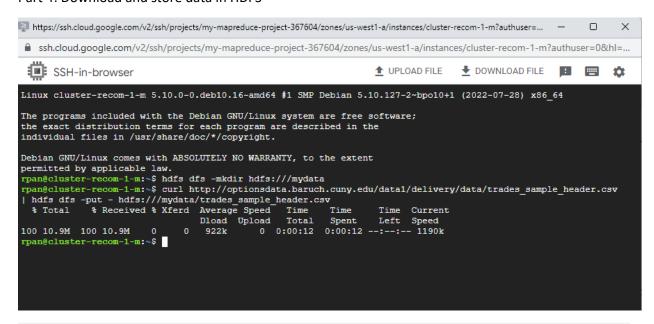




Part 3: Connecting to the Master Node using Secure Shell (ssh)



Part 4: Download and store data in HDFS



To verify that the file is indeed located in the mydata folder, run the following command:

```
rpan@cluster-recom-1-m:~$ hdfs dfs -ls hdfs:///mydata
Found 1 items
-rw-r--r- 2 rpan hadoop 11473124 2022-11-30 23:40 hdfs:///mydata/trades_sample_header.csv
```

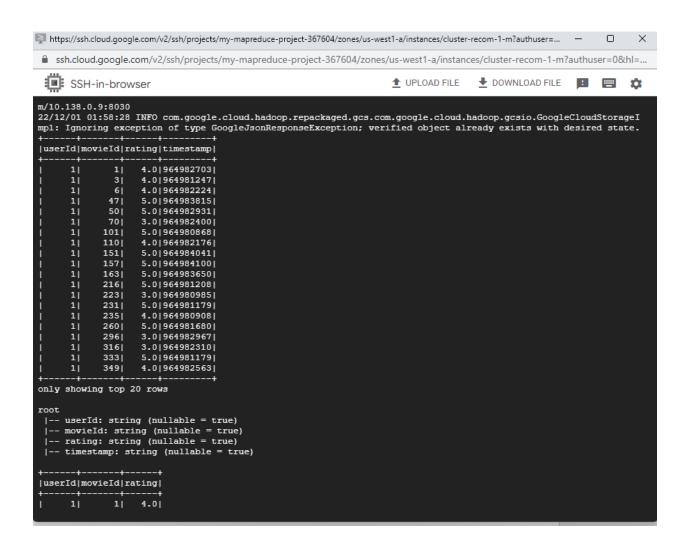
Upload and store movielens.py from local

```
\times \square
🕎 https://ssh.cloud.google.com/v2/ssh/projects/my-mapreduce-project-367604/zones/us-west1-a/instances/cluster-recom-1-m?authuser=... —
 ssh.cloud.google.com/v2/ssh/projects/my-mapreduce-project-367604/zones/us-west1-a/instances/cluster-recom-1-m?authuser=0&hl=...
                                                                                 SSH-in-browser
Linux cluster-recom-1-m 5.10.0-0.deb10.16-amd64 #1 SMP Debian 5.10.127-2~bpo10+1 (2022-07-28) 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: Thu Dec 1 00:13:29 2022 from 35.235.241.65 rpan@cluster-recom-1-m:~$ hdfs dfs -mkdir hdfs://mydata
 -mkdir: java.net.UnknownHostException: mydata
Usage: hadoop fs [generic options]
          [-appendToFile <localsrc> ... <dst>]
          [-cat [-ignoreCrc] <src> ...]
          [-checksum <src> ...]
[-checksum <src> ...]
[-chgrp [-R] GROUP PATH...]
[-chmod [-R] <MODE[,MODE]... | OCTALMODE> PATH...]
[-chown [-R] [OWNER][:[GROUP]] PATH...]
[-chown [-R] [OWNER][:[GROUP]] PATH...]
[-copyFromLocal [-f] [-p] [-l] [-d] [-t <thread count>] [-q <thread pool queue size>] <localsrc> ... <d
st>1
          [-copyToLocal [-f] [-p] [-crc] [-ignoreCrc] [-t <thread count>] [-q <thread pool queue size>] <src> ...
          [-count [-q] [-h] [-v] [-t [<storage type>]] [-u] [-x] [-e] <path> ...]
          [-cp [-f] [-p | -p[topax]] [-d] [-t <thread count>] [-q <thread pool queue size>] <src> ... <dst>] [-createSnapshot <snapshotDir> [<snapshotName>]]
          [-deleteSnapshot <snapshotDir> <snapshotName>]
          [-df [-h] [<path> ...]]
          [-du [-s] [-h] [-v] [-x] <path> ...]
```

```
n@cluster-recom-1-m:~$ hdfs dfs -mkdir hdfs:///mydata
mkdir: `hdfs:///mydata': File exists
rpan@cluster-recom-1-m:~$ rm -rf mydata
rpan@cluster-recom-1-m:~$ 1s
recommendation_engine_movielens.py
rpan@cluster-recom-1-m:~$ hdfs dfs -mkdir hdfs:///mydata
mkdir: `hdfs:///mydata': File exists
rpan@cluster-recom-1-m:~$ hdfs dfs -put recommendation_engine_movielens.py hdfs:///mydatarpan@cluster-recom-1-m:~$ hdfs dfs -ls hdfs:///mydata
Found 2 items
-rw-r--r-- 2 rpan hadoop 4853 2022-12-01 01:14 hdfs:///mydata/recommendation_engine_movielens.py
-rw-r--r-- 2 rpan hadoop 11473124 2022-11-30 23:40 hdfs://mydata/trades_sample_header.csv
rpan@cluster-recom-1-m:~$ pyspark
Python 3.8.13 | packaged by conda-forge | (default, Mar 25 2022, 06:04:10)
[GCC 10.3.0] on linux
Type "help", "copyright", "credits" or "license" for more information.
Setting default log level to "WARN".
To adjust logging level use sc.setLogLevel(newLevel). For SparkR, use setLogLevel(newLevel). 22/12/01 01:14:59 INFO org.apache.spark.SparkEnv: Registering MapOutputTracker
22/12/01 01:14:59 INFO org.apache.spark.SparkEnv: Registering BlockManagerMaster
22/12/01 01:14:59 INFO org.apache.spark.SparkEnv: Registering BlockManagerMasterHeartbeat
22/12/01 01:14:59 INFO org.apache.spark.SparkEnv: Registering OutputCommitCoordinator
Welcome to
                                    version 3.1.3
Using Python version 3.8.13 (default, Mar 25 2022 06:04:10)
Spark context Web UI available at http://cluster-recom-1-m.us-west1-a.c.my-mapreduce-project-367604.internal:40
Spark context available as 'sc' (master = yarn, app id = application 1669853514400 0001).
SparkSession available as 'spark'.
>>>
```

rpan@cluster-recom-1-m:~\$ hdfs dfs -put ratings.csv hdfs:///mydata rpan@cluster-recom-1-m:~\$ spark-submit recommendation engine movielens.py

```
rpan@cluster-recom-1-m:~$ vi recommendation_engine_movielens.py
rpan@cluster-recom-1-m:~$ vi recommendation_engine_movielens_test.py
rpan@cluster-recom-1-m:~$ spark-submit recommendation_engine_movielens_test.py
22/12/01 01:58:22 INFO org.apache.spark.SparkEnv: Registering MapOutputTracker
22/12/01 01:58:22 INFO org.apache.spark.SparkEnv: Registering BlockManagerMaster
22/12/01 01:58:22 INFO org.apache.spark.SparkEnv: Registering BlockManagerMasterHeartbeat
22/12/01 01:58:22 INFO org.apache.spark.SparkEnv: Registering OutputCommitCoordinator
22/12/01 01:58:22 INFO org.sparkproject.jetty.util.log: Logging initialized @3429ms to org.sparkproject.jetty.u
til.log.Slf4jLog
22/12/01 01:58:22 INFO org.sparkproject.jetty.server.Server: jetty-9.4.40.v20210413; built: 2021-04-13T20:42:42
.668Z; git: b881a572662e1943a14ae12e7e1207989f218b74; jvm 1.8.0 352-b08 22/12/01 01:58:22 INFO org.sparkproject.jetty.server.Server: Started @3548ms
22/12/01 01:58:22 INFO org.sparkproject.jetty.server.AbstractConnector: Started ServerConnector@60cdfcd8{HTTP/1
.1, (http/1.1)}{0.0.0.0:41397}
22/12/01 01:58:23 INFO org.apache.hadoop.yarn.client.RMProxy: Connecting to ResourceManager at cluster-recom-1-
m/10.138.0.9:8032
22/12/01 01:58:23 INFO org.apache.hadoop.yarn.client.AHSProxy: Connecting to Application History server at clus
ter-recom-1-m/10.138.0.9:10200
22/12/01 01:58:24 INFO org.apache.hadoop.conf.Configuration: resource-types.xml not found
22/12/01 01:58:24 INFO org.apache.hadoop.yarn.util.resource.ResourceUtils: Unable to find 'resource-types.xml'.
22/12/01 01:58:25 INFO org.apache.hadoop.yarn.client.api.impl.YarnClientImpl: Submitted application application
1669853514400 0006
22/12/01 01:58:26 INFO org.apache.hadoop.yarn.client.RMProxy: Connecting to ResourceManager at cluster-recom-1-
m/10.138.0.9:8030
22/12/01 01:58:28 INFO com.google.cloud.hadoop.repackaged.gcs.com.google.cloud.hadoop.gcsio.GoogleCloudStorageI
mpl: Ignoring exception of type GoogleJsonResponseException; verified object already exists with desired state.
|userId|movieId|rating|timestamp|
                    4.0|964982703|
                    4.0|964981247|
                    4.0|964982224|
      1|
1|
             47|
                    5.0|964983815|
             501
                    5.0|964982931|
```



```
|-- userId: string (nullable = true)
 |-- movield: string (nullable = true)
|-- rating: string (nullable = true)
|-- timestamp: string (nullable = true)
|userId|movieId|rating|
                          4.0|
        1 j
1 j
                          4.0|
                         4.0|
5.0|
5.0|
        1|
1|
1|
1|
1|
1|
1|
1|
1|
                 50|
                 70|
                          3.0|
                101|
                          5.0|
                1101
                          4.0|
                151|
                          5.0|
                157 I
                          5.0|
                163|
                          5.01
                216|
                          5.01
                223
                          3.01
                231
                          5.0|
                235
                          4.0|
                260|
                          5.0
                296
                          3.0
        1|
1|
                316
                          3.0
                333|
                          5.0
                349
                          4.0
only showing top 20 rows
The ratings dataframe is 98.30% empty.
|userId|count|
```

```
The ratings dataframe is 98.30% empty.
|userId|count|
   414| 2698|
   599| 2478|
   474| 2108|
   448 | 1864 |
   274 | 1346 |
   610| 1302|
    68| 1260|
   380| 1218|
   606
        1115
   288| 1055|
   249| 1046|
   387| 1027|
   182
         977
   307
         975|
   603
         943
   298|
         939|
   177|
          904|
   318|
         879
   232|
         862|
   480| 836|
only showing top 20 rows
|movieId|count|
    356| 329|
```

```
only showing top 20 rows
|movieId|count|
           3291
     3561
     3181
           3171
     296|
           307|
     593|
           279|
    2571|
           278|
           251|
     260|
     480|
           238|
           237|
     110|
     589|
           224|
     527|
           220|
    2959|
           218|
           215|
    1196
           211
    2858|
           204|
           204
      47|
           203
     780|
           202|
     150
           201
    1198
           200
    4993 j
           198
only showing top 20 rows
Num models to be tested: 16
CrossValidator_96912e7e175b
**Best Model**
  Rank: 50
  MaxIter: 10
```

```
only showing top 20 rows
Num models to be tested: 16
CrossValidator_96912e7e175b
**Best Model**
  Rank: 50
  MaxIter: 10
RegParam: 0.15
0.8685666272031658
|userId|movieId|rating|prediction|
            1580|
                     4.0| 3.4476712|
     5801
     580
            44022
                     3.5| 3.2499712|
                     2.0| 4.2078404|
5.0| 3.9294207|
     597 j
             471
     108
             1959
     368
            2122
                      2.0| 1.8601142|
     436|
             471
                     3.0| 3.6853335|
     587
             1580
                      4.0|
                           3.7985733|
     27|
             1580|
                      3.0| 3.4053385|
     606
             1580|
                      2.5
                           3.1694307|
     606|
            44022|
                      4.0| 2.8594952|
            2122|
                      4.0| 2.4488945|
     597|
            2387|
                      4.0|
                           3.818116|
                     2.0| 2.11591|
4.0| 2.900031|
1.5| 3.2513812|
             540|
     3681
     368|
            1127|
     28|
            48780|
     4971
             8581
                      4.0| 3.5255935|
                     5.0| 3.6248567|
     76
             858|
                     3.5| 3.8020349|
     332
            48780|
             858|
                      5.0| 3.9408183|
     577
             897 j
                      3.5| 3.474449|
     606
```

```
only showing top 20 rows
|userId|
               recommendations|
      80|[{3379, 5.54679},...|
     240|[{67618, 5.295908...|
    160|[{6591, 4.592959}...|
70|[{3379, 5.514155}...|
     480|[{3379, 4.615519}...|
    390|[{3379, 4.8776674...|
550|[{3379, 5.2294383...|
     490|[{3379, 4.474837}...|
60|[{3379, 4.678643}...|
90|[{3379, 5.1346874...|
|userId|movieId| rating|
     350| 33649|4.3721337|
     350|
            3379| 4.272633|
           74226|4.2142377|
     3501
     350| 84273|4.2142377|
    350| 138966|4.2142377|
    350| 26073|4.2142377|
    350| 184245|4.2142377|
    350| 179135|4.2142377|
     350|
            7071|4.2142377|
     350| 117531|4.2142377|
|movieId|userId| rating|
                                                  title|
                                                                          genres|
```

```
|movieId|userId| rating|
                                             title|
                                                                    genres|
             100|5.1201425|Strictly Sexual (...|Comedy|Drama|Romance|
100| 5.064743| On the Beach (1959)| Drama|
   67618|
    3379
   42730
             100| 5.042285| Glory Road (2006)|
             100| 5.021657| Saving Face (2004)|Comedy|Drama|Romance|
100|4.9267745| Watermark (2014)| Documentary|
   33649|
  117531
             100|4.9267745|Woman Under the I...|
    7071|
                                                                   Drama|
  184245
             100|4.9267745|De platte jungle ...|
                                                              Documentary|
   26073|
             100|4.9267745|Human Condition I...|
                                                                Drama|War|
  179135
             100|4.9267745|Blue Planet II (2...|
                                                              Documentary|
   84273|
             100|4.9267745|Zeitgeist: Moving...|
                                                              Documentary|
|movieId|userId|rating|
                                          title|
                                                               genres|
    1101|
             100|
                               Top Gun (1986) |
                                                    Action|Romance|
    1958|
             100|
                     5.0|Terms of Endearme...|
                                                       Comedy|Drama|
    2423|
             100|
                     5.0 | Christmas Vacatio... |
                                                               Comedy|
                                                        Drama|Romance|
    4041|
             100|
                     5.0|Officer and a Gen...|
    5620|
             100|
                     5.0|Sweet Home Alabam...|
                                                       Comedy|Romance|
                             Maverick (1994) | Adventure | Comedy | . . . |
     368|
             100|
                     4.5|
     934|
             100|
                     4.5|Father of the Bri...|
                                                                Comedy|
                     4.5|Sleepless in Seat...|Comedy|Drama|Romance|
     5391
             100|
      161
             1001
                     4.5|
                                Casino (1995)|
                                                          Crime | Drama |
     553|
             100|
                     4.5|
                             Tombstone (1993) | Action | Drama | Western |
22/12/01 02:24:00 INFO org.sparkproject.jetty.server.AbstractConnector: Stopped Spark@60cdfcd8{HTTP/1.1, (http/
```

```
rpan@cluster-recom-1-m:~$ ^C
rpan@cluster-recom-1-m:~$ ^C
rpan@cluster-recom-1-m:~$ 1s
movies.csv ratings.csv recommendation_engine_movielens.py recommendation_engine_movielens_test.py
rpan@cluster-recom-1-m:~$ vi ^C
rpan@cluster-recom-1-m:~$ vi recommendation_engine_movielens_test.py
rpan@cluster-recom-1-m:~$
```

🙀 https://ssh.cloud.google.com/v2/ssh/projects/my-mapreduce-project-367604/zones/us-west1-a/instances/cluster-recom-1-m?authuser=... — X ssh.cloud.google.com/v2/ssh/projects/my-mapreduce-project-367604/zones/us-west1-a/instances/cluster-recom-1-m?authuser=0&hl=... SSH-in-browser ◆ UPLOAD FILE ◆ DOWNLOAD FILE ■ # -*- coding: utf-8 -*-"""CS522 Week9 HW2 Yixin Cao 19536.ipynb Original file is located at https://colab.research.google.com/drive/1zN8WElepvxHXyWvIN5qB6rJd8RsRJnVP ### **Step 1: Go to the correct directory** # Commented out IPython magic to ensure Python compatibility.
%cd drive/MyDrive/Colab Notebooks/CS570 #!pwd import pandas as pd # covert txt to cvs
#read_file = pd.read_csv ("movies.txt")
#read_file.to_csv ("hdfs:///data/movies.csv", index=None) #read_file = pd.read_csv ("ratings.txt")
#read_file.to_csv ("hdfs:///data/ratings.csv", index=None) #read_file = pd.read_csv ("tags.txt")
#read_file.to_csv ("hdfs:///tags.csv", index=None) #!pip install pyspark import pandas as pd from pyspark.sql.functions import col, explode from pyspark import SparkContext from pyspark.sql import SparkSession 1,23 Top

```
from pyspark import SparkContext
 from pyspark.sql import SparkSession
sc = SparkContext
spark = SparkSession.builder.appName('Recommendations').getOrCreate()
# Commented out IPython magic to ensure Python compatibility.
# %cd drive/MyDrive/Colab Notebooks/CS570
movies = spark.read.csv("hdfs:///mydata/movies.csv",header=True)
ratings = spark.read.csv("hdfs://mydata/ratings.csv",header=True)
ratings.show()
ratings.printSchema()
ratings = ratings.\
       withColumn('userId', col('userId').cast('integer')).\
withColumn('movieId', col('movieId').cast('integer')).\
withColumn('rating', col('rating').cast('float')).\
       drop('timestamp')
 ratings.show()
numerator = ratings.select("rating").count()
# Count the number of distinct userIds and distinct movieIds
num_users = ratings.select("userId").distinct().count()
num_movies = ratings.select("movieId").distinct().count()
# Set the denominator equal to the number of users multiplied by the number of movies
denominator = num_users * num_movies
                                                                                                                                                                         24%
                                                                                                                                                   66,36
```

```
📝 https://ssh.cloud.google.com/v2/ssh/projects/my-mapreduce-project-367604/zones/us-west1-a/instances/cluster-recom-1-m?authuser=... —
                                                                                                                                X
 ssh.cloud.google.com/v2/ssh/projects/my-mapreduce-project-367604/zones/us-west1-a/instances/cluster-recom-1-m?authuser=0&hl=...
 SSH-in-browser
                                                                            num movies = ratings.select("movieId").distinct().count()
# Set the denominator equal to the number of users multiplied by the number of movies denominator = num_users * num_movies
# Divide the numerator by the denominator
sparsity = (1.0 - (numerator *1.0)/denominator)*100
print("The ratings dataframe is ", "%.2f" % sparsity + "% empty.")
"""### **Step 8: Interpret ratings**""
# Group data by userId, count ratings
userId_ratings = ratings.groupBy("userId").count().orderBy('count', ascending=False)
userId_ratings.show()
# Group data by userId, count ratings
movieId_ratings = ratings.groupBy("movieId").count().orderBy('count', ascending=False)
movieId_ratings.show()
"""### **Step 9: Build Out An ALS Model**""
# Import the required functions
from pyspark.ml.evaluation import RegressionEvaluator
from pyspark.ml.recommendation import ALS
from pyspark.ml.tuning import ParamGridBuilder, CrossValidator
# Create test and train set
(train, test) = ratings.randomSplit([0.8, 0.2], seed = 1234)
# Create ALS model
als = ALS(userCol="userId", itemCol="movieId", ratingCol="rating", nonnegative =
           True, implicitPrefs = False, coldStartStrategy="drop")
 Confirm that a model called "als" was created
type(als)
 ""### **Step 10: Tell Spark how to tune your ALS model**""
                                                                                                            100,0-1
                                                                                                                            48%
```

```
type (als)
from pyspark.ml.evaluation import RegressionEvaluator
from pyspark.ml.tuning import ParamGridBuilder, CrossValidator
# Add hyperparameters and their respective values to param_grid
param grid = ParamGridBuilder() \
               .addGrid(als.rank, [10, 50, 100, 150]) \
.addGrid(als.regParam, [.01, .05, .1, .15]) \
                 .build()
# Define evaluator as RMSE and print length of evaluator
evaluator = RegressionEvaluator(metricName="rmse", labelCol="rating", predictionCol="prediction")
print ("Num models to be tested: ", len(param_grid))
"""### **Step 11: Build your cross validation pipeline**""
# Build cross validation using CrossValidator cv = CrossValidator(estimator=als, estimatorParamMaps=param_grid, evaluator=evaluator, numFolds=5)
# Confirm cv was built
print(cv)
#Fit cross validator to the 'train' dataset
model = cv.fit(train)
#Extract best model from the cv model above
best_model = model.bestModel
# # Print best_model
# print(type(best_model))
                                                                                                                           134,36
                                                                                                                                              73%
```

```
🕎 https://ssh.cloud.google.com/v2/ssh/projects/my-mapreduce-project-367604/zones/us-west1-a/instances/cluster-recom-1-m?authuser=... —
 ssh.cloud.google.com/v2/ssh/projects/my-mapreduce-project-367604/zones/us-west1-a/instances/cluster-recom-1-m?authuser=0&hl=...
                                                                         SSH-in-browser
print(cv)
#Fit cross validator to the 'train' dataset
model = cv.fit(train)
#Extract best model from the cv model above
best model = model.bestModel
# # Print best model
# Complete the code below to extract the ALS model parameters
print("**Best Model**")
print(" Rank:", best_model._java_obj.parent().getRank())
print(" MaxIter:", best_model._java_obj.parent().getMaxIter())
# Print "RegParam"
print(" RegParam:", best_model._java_obj.parent().getRegParam())
# View the predictions
test_predictions = best_model.transform(test)
RMSE = evaluator.evaluate(test_predictions)
print(RMSE)
test_predictions.show()
# Generate n Recommendations for all users
\label{eq:necommend} \begin{tabular}{ll} nrecommendations = best\_model.recommendForAllUsers(10) \\ nrecommendations.limit(10).show() \\ \end{tabular}
nrecommendations = nrecommendations\
                                                                                                        160,0-1
                                                                                                                       92%
```

```
##### **Step 13: Make Recommendations**""

# Generate n Recommendations for all users
nrecommendations = best model.recommendForAllUsers(10)
nrecommendations.limit(\overline{10}).show()

nrecommendations = nrecommendations\
    .withColumn("rec_exp", explode("recommendations"))\
    .select('userId', col("rec_exp.movieId"), col("rec_exp.rating"))

nrecommendations.limit(10).show()

"""## **Do the recommendations make sense?**""

nrecommendations.join(movies, on='movieId').filter('userId = 100').show()

ratings.join(movies, on='movieId').filter('userId = 100').sort('rating', ascending=False).limit(10).show()

175,36 Bot
```

