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Big Data Engineering with Hadoop & Spark
Final Assignment

Music Data Analysis



Final Assignment Music Data Analysis

This assignment is aimed at consolidating the concepts that was learnt during the entire course of Big Data Engineering with Hadoop & Spark.

Objectives:

- 1. Data simulation using python scripts
- 2. Launch all necessary daemons
- 3. Populate look up tables into HBase
- 4. Perform Data Enrichment filter
- 5. Perform Data Formatting
- 6. Perform Data Enrichment and Cleaning
- 7. Perform Data Analysis

1. Data simulation using Python scripts:

To generated data following python scripts were used.

- generate_web_data.py
- generate_mob_data.py
 - Data generated from web applications were stored in /home/acadgild/examples/music/data/web as xml format.
 - Whereas, Data generated from mobile applications were stored in /home/acadgild/examples/music/data/mob as text format.

A master batch file "music_project_master.sh" was created which was used to perform data simulation through python scripts. Provided below is a part of the script used for data generation:

```
# Create data
echo "Preparing to execute python scripts to generate data..."

rm -r /home/acadgild/examples/music/data/web

rm -r /home/acadgild/examples/music/data/mob

mkdir -p /home/acadgild/examples/music/data/web

mkdir -p /home/acadgild/examples/music/data/mob

python /home/acadgild/examples/music/generate_web_data.py

python /home/acadgild/examples/music/generate_mob_data.py

echo "Data Generated Successfully!"
```

- The script when initiated will first remove web and mob directories, if they are present already at "/home/acadgild/examples/music/data"
- It will then recreate the web and mob directories at the provided path "/home/acadgild/examples/music/data"
- Finally, it will generate data using the python script provided

```
[acadgild@localhost music]$ ./music_project_master.sh
Preparing to execute python scripts to generate data...
rm: cannot remove `/home/acadgild/examples/music/data/web': No such file or directory
rm: cannot remove `/home/acadgild/examples/music/data/mob': No such file or directory
Data Generated Successfully !
```

2. Launch all necessary daemons:

Once the data simulation is complete, we need to start all Hadoop daemons. To perform this task, we have created a batch file "*start-daemon.sh*". Please is the script for the same:

echo "After batchid-->> "\$batchid

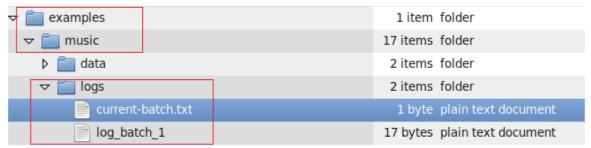
LOGFILE=/home/acadgild/examples/music/logs/log_batch_\$batchid echo "Starting daemons" >> \$LOGFILE

start-all.sh start-hbase.sh mr-jobhistory-daemon.sh start historyserver

cat/home/acadgild/examples/music/logs/current-batch.txt

- It will first remove logs directory, if they already exist at "/home/acadgild/examples/music/"
- Then it will create **logs** directory "/home/acadgild/examples/music/"
- After this, it will search for current-batch.txt file inside directory "/home/acadgild/examples/music/logs"
- If it is present, then message will be generated as "Batch File Found", else it will create current-batch.txt file inside directory "/home/acadgild/examples/music/logs" with content as '1'
- Then required permissions would be given for this file
- Then batchid would be content of *current-batch.txt* file. i.e., 1
- Next, log_batch_1 file as Logfile would be created inside directory "/home/acadgild/examples/music/logs/"

Below you could see that *current_batch.txt* and *log_batch_1* files are present inside directory: "/home/acadgild/examples/music/logs"



Finally, the script will start all Hadoop daemons. "start-daemon.sh" batch file will be initiated by "music_project_master.sh" batch file.

```
[acadgild@localfost music]s ./music_project_master.sh
Preparing to execute python scripts to generate data...
Data Generated Successfully !

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```

Here, we have executed **music_project_master** batch file which will execute **start-daemon.sh** script internally and you could see that data generated and all daemons are started successfully.

3. Populate look up tables into HBase:

By using the **"populate-lookup.sh"** script, we will create below lookup tables in HBase. These tables we are using for Data formatting, Data enrichment and

Analysis stage.

Sr#	Table name	Descripion	Related file				
1	Station_geo_map	Contains mapping of a geo_cd with station_id	stn-geocd.txt				
2	Subscribed_users	Contains user_id, subscription_start_date and subscription_end_date.					
		Contains details only for subscribed users user-subscn.txt					
3	Song_artist_map	Contains mapping of song_id with artist_id Along with royalty associated with each play of the	and artist test				
4	User_artists	contains an array of artist_id(s) followed by user_id	User_artists.txt				

The "populate-lookup.sh" shell script creates above lookup tables in HBase and populates data into the lookup tables from dataset files. Below is the script for populate-lookup.sh:

#!/bin/bash

batchid=`cat /home/acadgild/examples/music/logs/current-batch.txt` LOGFILE=/home/acadgild/examples/music/logs/log_batch_\$batchid

echo "Creating LookUp Tables" >> \$LOGFILE

```
echo "disable 'station-geo-map'" | hbase shell
echo "drop 'station-geo-map'" | hbase shell
echo "disable 'subscribed-users'" | hbase shell
echo "drop 'subscribed-users'" | hbase shell
echo "disable 'song-artist-map'" | hbase shell
echo "drop 'song-artist-map'" | hbase shell
```

```
echo "create 'station-geo-map', 'geo'" | hbase shell
echo "create 'subscribed-users', 'subscn'" | hbase shell
echo "create 'song-artist-map', 'artist'" | hbase shell
echo "Populating LookUp Tables" >> $LOGFILE
```

```
file="/home/acadgild/examples/music/lookupfiles/stn-geocd.txt"
while IFS= read -r line
do
      stnid=`echo $line | cut -d',' -f1`
      geocd=`echo $line | cut -d',' -f2`
echo "put 'station-geo-map', '$stnid', 'geo:geo_cd', '$geocd'" | hbase shell
done <"$file"
file="/home/acadgild/examples/music/lookupfiles/song-artist.txt"
while IFS= read -r line
do
      songid='echo $line | cut -d',' -f1'
      artistid=`echo $line | cut -d',' -f2`
echo "put 'song-artist-map', '$songid', 'artist:artistid', '$artistid'" | hbase shell
done <"$file"
file="/home/acadgild/examples/music/lookupfiles/user-subscn.txt"
while IFS= read -r line
do
      userid='echo $line | cut -d',' -f1'
      startdt='echo $line | cut -d',' -f2'
       enddt='echo $line | cut -d',' -f3'
echo "put 'subscribed-users', '$userid', 'subscn:startdt', '$startdt'" | hbase shell
echo "put 'subscribed-users', '$userid', 'subscn:enddt', '$enddt'" | hbase shell
done <"$file"
```

Below screenshots shows tables creation and population of data in HBase. Here we are executing *populate-lookup.sh* via *music_project_master.sh* batch file. We are disabling these HBase tables first and then we are dropping it.

```
acadgild@localhost music]s ./music_project_master.sh
reparing to execute python scripts to generate data...
rata Generated Successfully !
tarting the daemons....
2514 Jps
1095 DataNode
1257 SecondaryNameNode
1377 JobHistoryServer
1001 NameNode
1484 ResourceManager
1583 NodeManager
11985 Main
1131 HQuorumPeer
1380 Main
11516 HMaster
1576 RunJar
             76 KunJar
37 HRegionServer
l hadoop daemons started !
load the look up tables now in Hbase...
18-11-25 22:01:21,718 WARN [main] util.NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java
asses where applicable
F4J: Class path contains multiple SLF4J bindings.
F4J: Found binding in [jar:file:/home/acadgild/install/hbase/hbase-1.2.6/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder
lass]
     LF4]: Found binding in [jar:file:/home/acadgild/install/Moase/nbase-1.2.0/(10/str4) tog-jit into-jan/group group g
     lisable 'station-geo-map'
row(s) in 6.0110 seconds
     018-11-25 22:02:19,615 WARN [main] util.NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java
:lasses where applicable
:LF4J: Class path contains multiple SLF4J bindings
:lF4J: Found binding in [jar:file:/home/acadgild/install/hbase/hbase-1.2.6/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder
class]
     class|
slf4]: Found binding in [jar:file:/home/acadgild/install/hadoop/hadoop-2.6.5/share/hadoop/common/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/i
pl/StaticLoggerBinder.class|
lF4]: See http://www.slf4j.org/codes.html#multiple_bindings for an explanation.
lF4]: Actual binding is of type [org.slf4j.impl.Log4jLoggerFactory]
lBase Shell; enter 'help=RETURN>' for list of supported commands.
ype "exitARETURN>" to leave the HBase Shell
(ersion 1.2.6, rUnknown, Mon May 29 02:25:32 CDT 2017
      018-11-25 22:03:16,646 WARN [main] util.NativeCodeLoader: <mark>Unable to</mark> load native-hadoop library for your platform... using builtin-java
lasses where applicable
LF4J: Class path contains multiple SLF4J bindings.
LF4J: Found binding in [jar:file:/home/acadgild/install/hbase/hbase-1.2.6/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder
      class]
LF4J: Found binding in [jar:file:/home/acadgild/install/hadoop/hadoop-2.6.5/share/hadoop/common/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/ipl/staticLoggerBinder.class]
LF4J: Seo http://www.slf4j.org/codes.html#multiple_bindings for an explanation.
LF4J: Actual binding is of type [org.slf4j.impl.Log4jLoggerFactory]
Base Shell; enter 'help<RETURN>' for list of supported commands.
ype "exit-RETURN>" to leave the HBase Shell
ersion 1.2.6, rUnknown, Mon May 29 02:25:32 CDT 2017
     018-11-25 22:04:14,135 WARN [main] util.NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java
classes where applicable
NF43: Class path contains multiple SLF43 bindings.
    018-11-25 22:05:08,393 WARN [main] util.NativeCodeLoader: <mark>Unable to</mark> load native-hadoop library for your platform... using builtin-java
lasses where applicable
LF4J: class path contains multiple SLF4J bindings.
LF4J: Found binding in [jar:file:/home/acadgild/install/hbase/hbase-1.2.6/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder
  ELF4J: Found binding in [jar:file:/home/acadgild/install/hbase/hbase-1.2.0/tlb/straj-togaji2-1.7.5.jur./org/straj-togaji2-1.7.5.jur./org/straj-togaji2-1.7.5.jur./org/straj-togaji2-1.7.5.jur./org/straj-togaji2-1.7.5.jur./org/straj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/staj/cog/sta
     018-11-25 22:06:01,334 WARN [main] util.NativeCodeLoader: <mark>Unable to</mark> load native-hadoop library for your platform... using builtin-java
lasses where applicable
LF43: [ass path contains multiple SLF43 bindings.
LF43: Found binding in [jar:file:/home/acadgild/install/hbase/hbase-1.2.6/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder
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F4J: Found binding in [jar:file:/home/acadgild/install/hadoop/hadoop-2.6.5/share/hadoop/common/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/i
l/StaticLoggerBinder.class]
F4J: See http://www.slf4j.org/codes.html#multiple_bindings for an explanation.
F4J: Actual binding is of type [org.slf4j.impl.Log4jLoggerFactory]
lase Shell; enter 'help-RETURN>' for list of supported commands.
pre "exit-RETURN>" to leave the HBase Shell
ersion 1.2.6, rUnknown, Mon May 29 02:25:32 CDT 2017
2018-11-25 22:06:55,326 WARN [main] util.NativeCodeLoader: <mark>Unable to</mark> load native-hadoop library for your platform... using builtin-java
classes where applicable
```

Below we have created HBase tables: song-artist-map, station-geo-map and subscribed-users successfully. We are populating values into these HBase tables as shown below:

```
O FOW(s) In 3.8320 seconds

2018-11-25 22:23:10,832 WARN [main] util.NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java classes where applicable

SLF4J: Class path contains multiple SLF4J bindings.

SLF4J: Found binding in [jar:file:/home/acadgild/install/hbase/hbase-1.2.6/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder.

SLF4J: Found binding in [jar:file:/home/acadgild/install/hadoop/hadoop-2.6.5/share/hadoop/common/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder.class]

SLF4J: See http://www.slf4j.org/codes.html#multiple_bindings for an explanation.

SLF4J: Actual binding is of type [org.slf4j.impl.Log4jLoggerFactory]

HBase Shell; enter "help-RETURN>" for list of supported commands.

Type "exit<RETURN>" to leave the HBase Shell

Version 1.2.6, rUnknown, Mon May 29 02:25:32 CDT 2017
      out 'song-artist-map', 'S200', 'artist:artistid', 'A300'
) row(s) in 3.7040 seconds
      018-11-25 22:24:08,925 WARN [main] util.NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java
lasses where applicable
      lasses where applicable
LF4J: Class path contains multiple SLF4J bindings.
LF4J: Found binding in [jar:file:/home/acadgild/install/hbase/hbase-1.2.6/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder
class]
    .class]
SLF4J: Found binding in [jar:file:/home/acadgild/install/hadoop/hadoop-2.6.5/share/hadoop/common/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/i
mpl/StaticLoggerBinder.class]
SLF4J: See http://www.slf4j.org/codes.html#multiple_bindings for an explanation.
SLF4J: Actual binding is of type [org.slf4j.impl.Log4jLoggerFactory]
HBase Shell; enter "help-RETURN>" for list of supported commands.
Type "exit<RETURN>" to leave the HBase Shell
Version 1.2.6, rUnknown, Mon May 29 02:25:32 CDT 2017
     out 'song-artist-map', 'S201', 'artist:artistid', 'A301'
) row(s) in 3.2920 seconds
    2018-11-25 22:25:10,175 WARN [main] util.NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java
classes where applicable
       ut 'song-artist-map', 'S209', 'artist:artistid', 'A305'
row(s) in 4.0930 seconds
    2018-11-25 22:32:36,734 WARN [main] util.NativeCodeLoader: <mark>Unable to</mark> load native-hadoop library for your platform... using builtin-java
classes where applicable
SLF41: Class path contains multiple SLF4J bindings.
SLF41: Found binding in [jar:file:/home/acadgild/install/hbase/hbase-1.2.6/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder
.class]
   .class]
SLF4J: Found binding in [jar:file:/home/acadgild/install/hadoop/hadoop-2.6.5/share/hadoop/common/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder
sLF4J: Found binding in [jar:file:/home/acadgild/install/hadoop/hadoop-2.6.5/share/hadoop/common/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/i
mpl/StaticLoggerBinder.class]
SLF4J: See http://www.slf4j.org/codes.html#multiple_bindings for an explanation.
SLF4J: Actual binding is of type [org.slf4j.impl.Log4jLoggerFactory]
HBase Shell; enter 'help-RETURN>' for list of supported commands.
Type "exit<RETURN>" to leave the HBase Shell
Version 1.2.6, rUnknown, Mon May 29 02:25:32 CDT 2017
        ut 'subscribed-users', 'U100', 'subscn:startdt', '1465230523'
row(s) in 3.0470 seconds
  O TOW(s) IN 3.0470 Seconds

2018-11-25 22:33:32,170 WARN [main] util.NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java classes where applicable

SLF4J: Class path contains multiple SLF4J bindings.

SLF4J: Found binding in [jar:file:/home/acadgild/install/hbase/hbase-1.2.6/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder.class]

SLF4J: Found binding in [jar:file:/home/acadgild/install/hadoop/hadoop-2.6.5/share/hadoop/common/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder.class]

SLF4J: See http://www.slf4j.org/codes.html#multiple_bindings for an explanation.

SLF4J: Actual binding is of type [org.slf4j.impl.Log4jLoggerFactory]

HBase Shell; enter 'help<RETURN>' for list of supported commands.

Type "exit<RETURN>" to leave the HBase Shell

Version 1.2.6, rUnknown, Mon May 29 02:25:32 CDT 2017
    put 'subscribed-users', 'U100', 'subscn:enddt', '1465130523'
0 row(s) in 3.1590 seconds
        it 'subscribed-users', 'Ull4', 'subscn:startdt', '1465230523'
row(s) in 3.0850 seconds
    2018-11-25 22:58:53,236 WARN [main] util.NativeCodeLoader: <mark>Unable to</mark> load native-hadoop library for your platform... using builtin-java
:lasses where applicable
ikF4J: (lass path contains multiple SLF4J bindings.
ikF4J: Found binding in [jar:file:/home/acadgild/install/hbase/hbase-1.2.6/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder
SLF4J: Found binding in [jar:file:/home/acadgild/instatt/hoase/hoase/instatt/noase/hoase/instatt/hoase/hoase/instatt/hoase/hoase/instatt/hoase/hoase/instatt/hoase/hoase/instatt/hoase/hoase/instatt/hoase/hoase/instatt/hoase/hoase/instatt/hoase/hoase/instatt/hoase/hoase/hoase/instatt/hoase/hoase/instatt/hoase/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/hoase/instatt/h
  put 'subscribed-users', 'Ull4', 'subscn:enddt', '1468130523'
0 row(s) in 3.7300 seconds
   Done with data population in look up tables !

Lets do some data formatting now....

data formatting complete !

Creating hive tables on top of hbase tables for data enrichment and filtering...

Hive table with Hbase Mapping Complete !

Let us do data enrichment as per the requirement...

Data Enrichment Complete

Lets run some use cases now...

USE CASES COMPLETE !!

You have new mail in /var/spool/mail/acadgild

[acadgild@localhost music]$
```

In HBase shell, by using **list** command you could verify that HBase tables: songartist-map, station-geo-map and subscribed-users are created successfully.

```
hbase(main):003:0> list
TABLE
song-artist-map
station-geo-map
subscribed-users
3 row(s) in 0.0760 seconds
=> ["song-artist-map", "station-geo-map", "subscribed-users"]
hbase(main):004:0>
```

In HBase shell, by using **scan** command we could verify that HBase tables: song-artist-map, station- geo-map and subscribed-users are populated successfully.

By this way we have successfully created the lookup tables in the HBase.

4. Perform Data Enrichment filtering:

Now we need to link theses lookup tables in hive using the HBase Storage Handler. With the help of "data_enrichment_filtering_schema.sh" file we will create hive tables on the top of Hbase tables using "create_hive_hbase_lookup.hql".

Creating Hive Tables on the top of HBase:

With the help of HBase storage handler & SerDe properties, we are creating the hive external tables by matching the columns of HBase tables to hive tables. <code>data_enrichment_filtering_schema.sh</code> script will run the <code>"create_hive_hbase_lookup.hql"</code> which will create the HIVE external tables with the help of HBase storage handler & SerDe properties. The hive external tables will match the columns of Hbase tables to HIVE tables.

Script for data enrichment filtering schema.sh:

```
#!/bin/bash
```

batchid=`cat /home/acadgild/examples/music/logs/current-batch.txt`

LOGFILE=/home/acadgild/examples/music/logs/log_batch_\$batchid

echo "Creating hive tables on top of hbase tables for data enrichment and filtering..." >> \$LOGFILE

hive -f /home/acadgild/examples/music/create_hive_hbase_lookup.hql

Script for create hive hbase lookup.hql:

```
CREATE DATABASE IF NOT EXISTS project; USE project;
```

```
create external table if not exists station_geo_map
(
station_id String,
geo_cd string
) STORED BY 'org.apache.hadoop.hive.hbase.HBaseStorageHandler' with
serdeproperties ("hbase.columns.mapping"=":key,geo:geo_cd")
tblproperties("hbase.table.name"="station-geo-map");
```

```
create external table if not exists subscribed_users (
user_id STRING,
subscn_start_dt STRING,
subscn_end_dt STRING
```

) STORED BY 'org.apache.hadoop.hive.hbase.HBaseStorageHandler' with serdeproperties ("hbase.columns.mapping"=":key,subscn:startdt,subscn:enddt") tblproperties("hbase.table.name"="subscribed-users");

```
create external table if not exists song_artist_map
(
song_id STRING,
artist_id STRING
) STORED BY 'org.apache.hadoop.hive.hbase.HBaseStorageHandler' with
serdeproperties ("hbase.columns.mapping"=":key,artist:artistid")
tblproperties("hbase.table.name"="song-artist-map");
```

- We are running *data_enrichment_filtering_schema.sh* script through the execution of *music_project_master.sh* script.
- The below screenshot we can see tables are getting created in hive by running the "data_enrichement_filtering_schema.sh" file".
- Below you could see that three tables are created in project database in hive. They are: Song_artist_map, Station_geo_map, Subscribed_users

hive> show tables;

```
hive> show databases;

OK

default
project
Time taken: 33.773 seconds, Fetched: 2 row(s)
hive> use project;

OK
Time taken: 0.135 seconds
hive> show tables;

OK
song_artist_map
station_geo_map
subscribed_users
Time taken: 0.236 seconds, Fetched: 3 row(s)
```

hive> select * from song_artist_map;

hive> select * from station_geo_map;

```
hive> select * from station_geo_map;

OK
ST400 A
ST401 AU
ST402 AP
ST403 J
ST404 E
ST405 A
ST406 AU
ST407 AP
ST408 E
ST409 E
ST410 A
ST411 A
ST412 AP
ST413 J
ST414 E
Time taken: 2.495 seconds, Fetched: 15 row(s)
```

hive> select * from subscribed_users

```
hive> select * from subscribed_users;
OK
U100
U101
U102
                                                    1465130523
1475130523
1475130523
                 1465230523
1465230523
                  1465230523
                                                   1475130523
1475130523
1475130523
1475130523
1485130523
                 1465230523
1465230523
U103
U104
U105
U106
U107
                 1465230523
1465230523
1465230523
1465230523
1465230523
                                                    1465230623
1475130523
U108
U109
                 1465230523
1465230523
1465230523
1465230523
1465230523
U110
U111
U112
U113
                                                   1475130523
1475130523
1475130523
                                                    1485130523
1468130523
U114
Time taken: 2.174 seconds, Fetched: 15 row(s)
```

5. Data Formatting:

In this stage, we are merging the data coming from both web applications and mobile applications and create a common table for analysing purpose and create partitioned data based on batchid, since we are running this scripts for every 3 hours.

Script for **dataformatting.sh**:

```
#!/bin/bash
batchid=`cat /home/acadgild/examples/music/logs/current-batch.txt`
LOGFILE=/home/acadgild/examples/music/logs/log_batch_$batchid
echo "Running script for data formatting..." >> $LOGFILE
spark-submit --packages com.databricks:spark-xml_2.10:0.4.1 \
--class DataFormatting \
--master local[2] \
/home/acadgild/examples/music/MusicDataAnalysis/target/scala-
2.11/musicdataanalysis_2.11-1.0.jar $batchid
Source code for DataFormatting.scala:
import org.apache.spark.{SparkConf, SparkContext}
import org.apache.spark.sql
object DataFormatting {
 def main(args: Array[String]): Unit = {
  val conf = new SparkConf().setAppName("Data Formatting")
  val sc = new SparkContext(conf)
  val sqlContext = new org.apache.spark.sql.hive.HiveContext(sc)
  val batchId = args(0)
                           = """CREATE
  val create hive table
                                             TABLE
                                                      IF NOT EXISTS
project.formatted_input
              User_id STRING,
              Song_id STRING,
              Artist_id STRING,
              Timestamp STRING,
              Start_ts STRING,
              End ts STRING,
              Geo cd STRING,
              Station id STRING,
              Song_end_type INT,
              Like INT.
              Dislike INT
              )
              PARTITIONED BY
              (batchid INT)
```

```
ROW FORMAT DELIMITED FIELDS TERMINATED BY ','
```

```
load_mob_data
                                s"""LOAD
                                                       LOCAL
 val
                                             DATA
                                                                 INPATH
'/home/acadgild/examples/music/data/mob/file.txt'
              INTO
                       TABLE
                               project.formatted input
                                                              PARTITION
(batchid='$batchId')"""
 val load_web_data = s"""INSERT INTO project.formatted_input
              PARTITION(batchid='$batchId')
              SELECT user id.
              song_id,
              artist id.
              unix_timestamp(timestamp,'yyyy-MM-dd HH:mm:ss')
                                                                       AS
timestamp,
              unix_timestamp(start_ts,'yyyy-MM-dd HH:mm:ss') AS start_ts,
              unix timestamp(end ts,'yyyy-MM-dd HH:mm:ss') AS end ts,
              geo_cd,
              station id,
              song_end_type,
              like.
              dislike
              FROM web data
 try {
                                   xmlData
    val
sqlContext.read.format("com.databricks.spark.xml").option("rowTag",
"record").load("file:///home/acadgild/examples/music/data/web/file.xml")
    xmlData.createOrReplaceTempView("web_data")
    sqlContext.sql(create_hive_table)
    sqlContext.sql(load_mob_data)
    sqlContext.sql(load web data)
  catch{
   case e: Exception=>e.printStackTrace()
We have build.sbt file inside MusicDataAnalysis folder to create jar file:
```

1 18:34 build.sbt

[acadgild@localhost music]\$ cd MusicDataAnalysis [acadgild@localhost MusicDataAnalysis]\$ ls -ls

-rw-rw-r--. 1 acadgild acadgild 802 Dec

drwxrwxr-x. 3 acadgild acadgild 4096 Dec

Below is the command to create jar file in verbose mode: *sbt-v package*

Finally Jar file gets created as highlighted below:

```
[info] Done updating.
[info] Compiling 3 Scala sources to /home/acadgild/examples/music/MusicDataAnalysis/target/scala-2.11/classes ...
[info] Non-compiled module 'compiler-bridge_2.11' for Scala 2.11.8. Compiling...
[info] Compilation completed in 107.731s.
[warn] there were three deprecation warnings; re-run with -deprecation for details
[warn] one warning found
[info] Done compiling.
[warn] Multiple main classes detected. Run 'show discoveredMainClasses' to see the list
[info] Packaging /home/acadgild/examples/music/MusicDataAnalysis/target/scala-2.11/musicdataanalysis_2.11-1.0.jar ...
[info] Done packaging.
[success] Total time: 1147 s, completed Dec 1, 2018 7:12:42 PM
You have new mail in /var/spool/mail/acadgild
[acadgild@localhost MusicDataAnalysis]$ ■
```

Below is the location of Jar file which gets created under /MusicDataAnalysis/taraet/scala-2.11:

```
[acadgild@localhost MusicDataAnalysis]$ ls -ls
total 16
4 -rw-rw-r--. 1 acadgild acadgild 802 Dec 1 18:34 build.sbt
4 drwxrwxr-x. 3 acadgild acadgild 4096 Dec 1 18:52 project
4 drwxrwxr-x. 3 acadgild acadgild 4096 Dec 1 18:34 src
4 drwxrwxr-x. 4 acadgild acadgild 4096 Dec 1 18:58 target
You have new mail in /var/spool/mail/acadgild
[acadgild@localhost MusicDataAnalysis]$ cd target
[acadgild@localhost target]$ ls -ls
total 8
4 drwxrwxr-x. 4 acadgild acadgild 4096 Dec 1 19:12 scala-2.11
4 drwxrwxr-x. 4 acadgild acadgild 4096 Dec 1 18:53 streams
[acadgild@localhost target]$ cd scala-2.11
[acadgild@localhost scala-2.11]$ ls -ls
total 16
4 drwxrwxr-x. 2 acadgild acadgild 4096 Dec 1 19:12 classes
 -rw-rw-r--. 1 acadgild acadgild 8183 Dec 1 19:12 musicdataanalysis 2.11-1.0.jar
 drwxrwxr-x. 5 acadgild acadgild 4096 Dec 1 19:10 resolution-cache
```

Scala programs related to data lies in the location below:

```
[acadgild@localhost MusicDataAnalysis]$ ls -ls
total 16
4 -rw-rw-r--. 1 acadgild acadgild 802 Dec 1 18:34 build.sbt
4 drwxrwxr-x. 3 acadgild acadgild 4096 Dec 1 18:52 project
4 drwxrwxr-x. 3 acadgild acadgild 4096 Dec 1 18:34 src
4 drwxrwxr-x. 4 acadgild acadgild 4096 Dec 1 18:58 target
[acadgild@localhost MusicDataAnalysis]$ cd src
[acadgild@localhost src]$ ls -ls
total 4
4 drwxrwxr-x. 3 acadgild acadgild 4096 Dec 1 18:34 main
[acadgild@localhost src]$ cd main
[acadgild@localhost main]$ ls -ls
total 4
4 drwxrwxr-x. 2 acadgild acadgild 4096 Dec 1 18:40 scala
[acadgild@localhost main]$ cd scala
[acadgild@localhost scala]$ ls -ls
total 20
8 -rw-rw-r--. 1 acadgild acadgild 4814 Dec 1 18:34 DataAnalysis.scala
DataEnrichment.scala
DataFormatting.scala
```

We are executing master script which internally calls *dataformatting.sh* which performs data formatting:

```
dgild@localhost music]s ./music project master.sh
aring to execute python scripts to generate data...
Generated Successfully !
ting the daemons...
1 ResourceManager
2 HRegionServer
9 NodeManager
1 JobHistoryServer
1 HMaster
1 HMuster
1 HMuster
2 RunJam
2 RecondaryNameNode
8 Jps
    13502 DataNode
13407 NameNode
11 hadoop daemons started !
19load the look up tables now in Hbase...
20ne with data population in look up tables !
201 est do some data formatting now...
202 type fault Cache set to: /home/acadgild/.ivy2/cache
203 the packages stored in: /home/acadgild/.ivy2/jars
204 ings/ivysettings: : url = jar:file:/home/acadgild/install/spark/spark-2.2.1-bin-hadoop2.7/jars/ivy-2.4.0.jar!/org/apache/ivy/core/settings/ivysettings.xml
2.10 added as a dependency
21 resolving dependencies :: org.apache.spark#spark-submit-parent;1.0
22 confs: [default]
23 found com. databricks#spark-xml 2.10;0.4.1 in central
23 ir resolving report :: resolve 1398ms :: artifacts dl 34ms
24 imodules in use:
25 com.databricks#spark-xml 2.10;0.4.1 from central in [default]
26 modules | | artifacts |
                        com.databricks#spark.xml_2.10;0.4.1 from central in [default]

| conf | number| search|dwnlded|evicted| number|dwnlded|
| default | 1 | 0 | 0 | 0 | 1 | 0 |
| retrieving:: org.apache.spark#spark-submit-parent
    confs: [default]
| 0 artifacts copied, 1 already retrieved (0kB/93ms)
/12/01 20:15:29 INFO spark.SparkContext: Running Spark version 2.2.1
/12/01 20:15:31 WARN util.NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java classes where plicable
/12/01 20:15:33 WARN util.Utils: Your hostname, localhost.localdomain resolves to a loopback address: 127.0.0.1; using 192.168.0.102 in ead (on interface eth15)
/12/01 20:15:33 WARN util.Utils: Set SPARK_LOCAL_IP if you need to bind to another address
/12/01 20:15:33 INFO spark.SparkContext: Submitted application: Data Formatting
/12/01 20:15:33 INFO spark.SecurityManager: changing view acls to: acadgild
/12/01 20:15:33 INFO spark.SecurityManager: changing widify acls to: acadgild
/12/01 20:15:33 INFO spark.SecurityManager: changing wiew acls groups to:
/12/01 20:15:33 INFO spark.SecurityManager: changing widify acls groups to:
/12/01 20:15:33 INFO spark.SecurityManager: SecurityManager: authentication disabled; ui acls disabled; users with view permissions: Set()
/12/01 20:15:36 INFO matestore.Wimmlager: changing modify acls groups to:
/12/01 20:15:36 INFO spark.SecurityManager: securityManager: authentication disabled; ui acls disabled; groups with modify permissions: Set()
/12/01 20:15:36 INFO spark.SecurityManager: securityManager: authentication disabled; ui acls disabled; groups with modify permissions: Set()
/12/01 20:15:36 INFO spark.SecurityManager: authentication disabled; ui acls disabled; groups with modify permissions: Set()
/12/01 20:15:36 INFO spark.SparkEnv: Registering MapoUnturTacker
18/12/01 20:15:36 INFO util.Utils: Successfully started service 'sparkDriver' on port 35422.

18/12/01 20:17:20 INFO metastore.HiveMetaStore: 0: get_database: project
18/12/01 20:17:20 INFO metastore.HiveMetaStore: 0: get_database: project
18/12/01 20:17:20 INFO metastore.HiveMetaStore: 0: get_database: project
18/12/01 20:17:20 INFO metastore.HiveMetaStore: 0: get_database: project tbl=formatted_input
18/12/01 20:17:20 INFO metastore.HiveMetaStore: 0: get_database: project tbl=formatted_input
18/12/01 20:17:20 INFO metastore.HiveMetaStore: 0: get_database: project tbl=formatted_input
18/12/02 20:17:20 INFO metastore.HiveMetaStore: 0: get_database: project tbl=formatted_input
18/12/02 20:17:20 INFO parser.CatalystSqlParser: Parsing command: int
18/12/02 20:17:20 INFO parser.CatalystSqlParser: Parsing command: string
18/12/02 20:17:21 INFO parser.CatalystSqlParser: Parsing command: int
1
```

Below Hive table *formatted_input* gets created which contains all data which gets merged from web and mobile applications (file.txt and file.xml): *hive> select * from formatted_input;*

```
hive> show tables;
formatted_input
rormatted_input
song_artist_map
station_geo_map
subscribed_users
Time taken: 0.221 seconds, Fetched: 4 row(s)
nive> select * from formatted_input;
                                                                                                1465230523
                          A302
A303
A302
A301
A305
A304
J106
J119
             S203
S204
                                         1495130523
1475130523
                                                                     1465130523
1485130523
                                                                                                1485130523
1475130523
                                                                                                                                          ST403
ST403
             S200
S202
S206
                                         1475130523
1475130523
1495130523
                                                                     1485130523
1475130523
1485130523
                                                                                                1485130523
1465130523
1475130523
                                                                                                                                          ST410
J115
                                                                                                                            A
AU
                                                                                                                                          ST403
                                                                                                                                          ST404
 J101
                           A300
A301
                                         1495130523
1465230523
1465230523
                                                                     1475130523
1465230523
1465130523
                                                                                                                                          ST406
                                                                                                 1485130523
                                                                                                                            ΑU
U105
U101
             S208
S201
                                                                                                1475130523
1475130523
                                                                                                                                          ST400
                           A302
                                                                                                                                          ST412
                                         1465130523
1495130523
1475130523
                                                                                                                            E
             S203
                                                                     1465130523
                                                                                                 1475130523
                                                                                                                                          ST406
             S209
S207
                           A303
A300
                                                                     1475130523
1485130523
U110
                                                                                                1475130523
                                                                                                                                          ST406
 100
                                                                                                 1485130523
                                                                                                                                          ST413
J103
             S202
                           A301
A301
A301
                                         1465130523
1465130523
1465230523
                                                                     1475130523
1485130523
1485130523
                                                                                                1485130523
1485130523
                                                                                                                                          ST404
U109
U102
             S203
S204
                                                                                                                                          ST415
                                                                                                 1475130523
                                                                                                                                          ST411
                           A303
A301
J111
             S200
S205
                                         1495130523
1465130523
                                                                     1465230523
1475130523
                                                                                                 1465230523
                                                                                                                            E
AU
                                                                                                                                          ST404
J107
J114
                                                                                                1465230523
                                                                                                                                          ST409
             S210
                           A302
                                         1465130523
                                                                     1465230523
                                                                                                 1475130523
                                                                                                                            A
AP
                           A301
A300
A300
J109
J110
             S200
                                         1465230523
1465230523
                                                                     1485130523
1485130523
                                                                                                 1485130523
                                                                                                                                          ST407
                                                                                                 1475130523
                                                                                                                            AP
             S200
                                                                                                                                          ST404
J105
J100
J100
                                                                                                                                          ST407
                                         1465490556
                                                                     1462863262
                                                                                                                                                                      1
0
             S205
S203
                           A304
A302
                                         1468094889
                                                                     1468094889
                                                                                                 1465490556
                                                                                                                            ΑU
                                                                                                                                          ST415
                                         1462863262
                                                                     1468094889
                                                                                                 1465490556
                                                                                                                                          ST403
                           A304
                                         1462863262
                                                                     1465490556
                                                                                                 1462863262
                                                                                                                                          ST408
             S210
                           A305
A304
                                         1494297562
                                                                     1468094889
                                                                                                 1465490556
                                                                                                                            AP
                                                                                                                                          ST409
                                                                     1462863262
                                                                                                                                          ST415
```

In the above screenshot, we could see that formatted input data with some **null** values in user_id, aritist_id and geo_cd columns which we will fill the enrichment script based on rules of enrichment for artist_id and geo_cd only. Data Formatting phase is executed successfully by loading both mobile and web data and partitioned based on batchid.

6. Perform Data Enrichment and Cleaning:

In this phase we will enrich the data coming from web and mobile applications using the lookup table stored in Hbase and divide the records based on the enrichment rules into 'pass' and 'fail' records.

Rules for data enrichment:

- **1.** If any of like or dislike is NULL or absent, consider it as 0.
- 2. If fields like Geo_cd and Artist_id are NULL or absent, consult the lookup tables for fields Station_id and Song_id respectively to get the values of Geo_cd and Artist_id.
- **3.** If corresponding lookup entry is not found, consider that record to be invalid

So, based on the enrichment rules we will fill the null geo_cd and artist_id values with the help of corresponding lookup values in song-artist-map and station-geo-map tables in Hive-HBase tables.

<u>Script for Data enrichment.sh:</u>

#!/bin/bash

batchid=`cat /home/acadgild/examples/music/logs/current-batch.txt`
LOGFILE=/home/acadgild/examples/music/logs/log_batch_\$batchid
VALIDDIR=/home/acadgild/examples/music/processed_dir/valid/batch_\$batchid

INVALIDDIR=/home/acadgild/examples/music/processed_dir/invalid/batch_\$ batch_id

echo "Running script for data enrichment and filtering..." >> \$LOGFILE

```
spark-submit --class DataEnrichment \
--master local[2] \
          /home/acadgild/install/hive/apache-hive-2.3.2-bin/lib/hive-hbase-
handler-2.3.2.jar,/home/acadgild/install/hive/apache-hive-2.3.2-
bin/lib/hbase-client-1.1.1.jar,/home/acadgild/install/hive/apache-hive- 2.3.2-
bin/lib/hbase-common-1.1.1.jar,/home/acadgild/install/hive/apache-
                                                                        hive-
2.3.2-bin/lib/hbase-hadoop-compat-
1.1.1.jar,/home/acadgild/install/hive/apache-hive-2.3.2-bin/lib/hbase- server-
1.1.1.jar,/home/acadgild/install/hive/apache-hive-2.3.2-
                                                               bin/lib/hbase-
protocol-1.1.1.jar,/home/acadgild/install/hive/apache-hive-
                                                                        2.3.2-
                                                                        2.3.2-
bin/lib/zookeeper-3.4.6.jar,/home/acadgild/install/hive/apache-hive-
bin/lib/guava-14.0.1.jar,/home/acadgild/install/hive/apache-hive-
                                                                        2.3.2-
bin/lib/htrace-core-3.1.0-incubating.jar \
/home/acadgild/examples/music/MusicDataAnalysis/target/scala-
2.11/musicdataanalysis_2.11-1.0.jar $batchid
```

```
then
mkdir -p "$VALIDDIR" fi
if [!-d "$INVALIDDIR"]
then
mkdir -p "$INVALIDDIR"
fi
echo "Copying valid and invalid records in local file system..." >>
$LOGFILE
hadoop fs -get
/user/hive/warehouse/project.db/enriched_data/batchid=$batchid/status=pa
ss/* $VALIDDIR
hadoop fs -get
/user/hive/warehouse/project.db/enriched_data/batchid=$batchid/status=fai
l/* $INVALIDDIR
echo "Deleting older valid and invalid records from local file system..."
>> $LOGFILE
find /home/acadgild/examples/music/processed_dir/ -mtime +7 -exec rm {} \;
Source code for DataEnrichment.scala:
import org.apache.spark.{SparkConf, SparkContext}
import org.apache.spark.sql
object DataEnrichment {
 def main(args: Array[String]): Unit = {
  val conf = new SparkConf().setAppName("Data Formatting")
  val sc = new SparkContext(conf)
  val sqlContext = new org.apache.spark.sql.hive.HiveContext(sc)
  val batchId = args(0)
  val create_hive_table = """CREATE TABLE IF NOT EXISTS enriched_data
              User_id STRING,
              Song_id STRING,
              Artist_id STRING,
              Timestamp STRING,
              Start_ts STRING,
              End ts STRING.
              Geo_cd STRING,
              Station id STRING,
              Song_end_type INT,
              Like INT.
```

```
Dislike INT
              PARTITIONED BY
              (batchid INT.
              status STRING)
              STORED AS ORC
 val load data = s"""INSERT OVERWRITE TABLE enriched data
            PARTITION (batchid, status)
            SELECT
            i.user id.
            i.song_id,
            sa.artist_id,
            i.timestamp,
            i.start ts,
            i.end_ts,
            sg.geo_cd,
            i.station id,
                (i.song end type IS NULL, 3, i.song end type)
                                                                          AS
song_end_type,
            IF (i.like IS NULL, 0, i.like) AS like,
            IF (i.dislike IS NULL, 0, i.dislike) AS dislike,
            i.batchid.
            IF((i.like=1 AND i.dislike=1)
            OR i.user id IS NULL
            OR i.song_id IS NULL
            OR i.timestamp IS NULL
            OR i.start_ts IS NULL
            OR i.end ts IS NULL
            OR i.geo_cd IS NULL
            OR i.user id="
            OR i.song_id="
            OR i.timestamp="
            OR i.start ts="
            OR i.end ts="
            OR i.geo_cd="
            OR sg.geo_cd IS NULL
            OR sg.geo_cd=''
            OR sa.artist_id IS NULL
            OR sa.artist_id="', 'fail', 'pass') AS status
            FROM formatted_input i LEFT OUTER JOIN station_geo_map sg
ON i.station_id = sg.station_id
            LEFT OUTER JOIN song artist map sa ON i.song id = sa.song id
            WHERE i.batchid=$batchId
```

111111

```
try {
    sqlContext.sql("SET hive.auto.convert.join=false")
    sqlContext.sql("SET hive.exec.dynamic.partition.mode=nonstrict")
    sqlContext.sql("USE project")

    sqlContext.sql(create_hive_table)
    sqlContext.sql(load_data)
    }
    catch{
        case e: Exception=>e.printStackTrace()
    }
}
```

We have executed data_enrichment.sh script by calling *music_project_master.sh* batch file as shown below:

```
[acadgild@localhost music]$ ./music_project_master.sh
Preparing to execute python scripts to generate data...
Data Generated Successfully !
Starting the daemons....
15888 RunJar
                                       RunJar
HMaster
NodeManager
NameNode
RunJar
SecondaryNameNode
   3791 ResourceManager
All hadsop daemons started !
Upload the look up tables now in Hbase...
Done with data population in look up tables !
Lets do some data formatting now....
data formatting complete !
Creating hive tables on top of hbase tables for data enrichment and filtering...
Hive table with Hbase Mapping Complete !
Let us do data enrichment as per the requirement...
18/12/02 15:25:32 INFO spark.SparkContext: Running Spark version 2.2.1
18/12/02 15:25:33 INFO spark.SparkContext: Running Spark version 2.2.1
18/12/02 15:25:35 WARN util.NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java classes where applicable
18/12/02 15:25:35 WARN util.NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java classes where applicable
18/12/02 15:25:36 WARN util.Utils: Your hostname, localhost.localdomain resolves to a loopback address: 127.0.0.1; using 192.168.0.100 in stead (on interface eth15)
18/12/02 15:25:36 WARN util.Utils: Set SPARK_LOCAL_IP if you need to bind to another address
18/12/02 15:25:37 INFO spark.SparkContext: Submitted application: Data Formatting
18/12/02 15:25:37 INFO spark.SecurityManager: Changing view acls to: acadgild
18/12/02 15:25:37 INFO spark.SecurityManager: Changing woidify acls to: acadgild
18/12/02 15:25:37 INFO spark.SecurityManager: Changing view acls groups to:
18/12/02 15:25:37 INFO spark.SecurityManager: Changing modify acls groups to:
18/12/02 15:25:37 INFO spark.SecurityManager: SecurityManager: additional production of the spark of 
 et(acagg1(a); groups with view permissions: Set() users with mooiry permissions: Set() 18/12/02 15:25:40 INFO util.Utils: Successfully started service 'sparkbriver' on port 36466.

18/12/02 15:28:44 INFO HiveMetaStore.audit: ugi=acadgild ip=unknown-ip-addr cmd=get_database: project 18/12/02 15:28:44 INFO metastore.HiveMetaStore: 0: get_table : db=project tbl=enriched_data 18/12/02 15:28:44 INFO metastore.HiveMetaStore: 0: get_table : db=project tbl=enriched_data 18/12/02 15:28:44 INFO metastore.HiveMetaStore: 0: get_table : db=project tbl=enriched_data 18/12/02 15:28:44 INFO metastore.HiveMetaStore: 0: get_table : db=project tbl=enriched_data 18/12/02 15:28:44 INFO metastore.HiveMetaStore: 0: get_table : db=project tbl=enriched_data 18/12/02 15:28:44 INFO metastore.HiveMetaStore: 0: get_table : db=project tbl=enriched_data 18/12/02 15:28:44 INFO metastore.HiveMetaStore: 0: get_table : db=project tbl=enriched_data 18/12/02 15:28:44 INFO parser.CatalyxtSqlParser: Parsing command: string 18/12/02 15:28:44 INFO p
                    /12/02 15:28:53 WARN util.NativeCodeLoader: <mark>Unable to l</mark>oad native-hadoop library for your platform... using builtin-java classes where
plicable
//12/02 15:29:06 WARN util.NativeCodeLoader: <mark>Unable to</mark> load native-hadoop library for your platform... using builtin-java classes where
       applicable
Data Enrichment Complete
Lets run some use cases now...
USE CASES COMPLETE!!
You have new mail in /var/spool/mail/acadgild
[acadgild@localhost music]$
```

In the above step Data Enrichment is completed.

Let's have a look at the data enrichment table that got created.

```
hive> show databases;

OK
default
project
Time taken: 4.22 seconds, Fetched: 2 row(s)
hive> use project;

OK
Time taken: 0.116 seconds
hive> show tables;

OK
enriched_data
formatted_input
song_artist_map
station_geo_map
subscribed_users
Time taken: 0.251 seconds, Fetched: 5 row(s)
```

In the below screenshot, we have data for data enrichment table where we filled the null values of *artist_id* and *geo_cd* of formatted input with the help of lookup tables

hive>	select *	from on	riched data;									
OK	select *	Trom en	riched_data;									
U111	S201	A301	1465490556	1494297562	1465490556	J	ST403	1	1	1	1	fail
U101	S201	A301	1465230523	1465130523	1475130523	AP	ST412	ī	ō	Ö	ī	fail
U100	S207	A303	1475130523	1485130523	1485130523	Ĵ	ST413	î	ĭ	ĭ	î	fail
U103	5202	A302	1465130523	1475130523	1485130523	Ē	ST404	ī	ī	ī	ī	fail
U119	5202	A302	1462863262	1465490556	1462863262	Ē	ST408	3	ī	ī	ī	fail
NULL	S202	A302	1462863262	1462863262	1465490556	NULL	ST415	Θ	ī	ī	ī	fail
	S206	A302	1495130523	1485130523	1475130523	E	ST404	1	ī	ī	ī	fail
U105	S208	A304	1465230523	1465230523	1475130523	Α	ST400	3	1	1	1	fail
U114	S210	NULL	1465130523	1465230523	1475130523	E	ST409	Θ	Θ	1	1	fail
U114	S210	NULL	1494297562	1468094889	1465490556	E	ST409	2	1	Θ	1	fail
U108	S205	A301	1462863262	1468094889	1465490556	Α	ST410	1	1	1	1	fail
U105	S205	A301	1465490556	1462863262	1462863262	AP	ST407	Θ	1	1	1	fail
U100	S205	A301	1468094889	1468094889	1465490556	NULL	ST415	2	0	1	1	fail
U110	S200	A300	1465230523	1485130523	1475130523	E	ST404	1	1	1	1	fail
U113	S203	A303	1465490556	1465490556	1468094889	AP	ST407	Θ	0	Θ	1	fail
U109	S203	A303	1465130523	1485130523	1485130523	NULL	ST415	1	1	Θ	1	fail
U114	S203	A303	1494297562	1462863262	1468094889	NULL	ST415	3	1	Θ	1	fail
U112	S203	A303	1465130523	1465130523	1475130523	AU	ST406	Θ	1	1	1	fail
U106	S201	A301	1468094889	1462863262	1462863262	J	ST403	2	Θ	1	1	pass
U106	S207	A303	1494297562	1494297562	1468094889	E	ST404	3	0	1	1	pass
U117	S202	A302	1462863262	1465490556	1465490556	E	ST404	Θ	1	Θ	1	pass
U115	S202	A302	1475130523	1475130523	1465130523	J	ST403	2	0	Θ	1	pass
U101	S202	A302	1495130523	1475130523	1485130523	AU	ST406	3	Θ	1	1	pass
U102	S204	A304	1494297562	1462863262	1465490556	E	ST414	3	1	Θ	1	pass
U119	S204	A304	1475130523	1485130523	1475130523	J	ST403	0	0	1	1	pass
U109	S204	A304	1468094889	1494297562	1494297562	J	ST403	3	0	1	1	pass
U103	S204	A304	1462863262	1465490556	1465490556	A	ST410	3	0	1	1	pass
U102	S204	A304	1465230523	1485130523	1475130523	A	ST411	0	Θ	Θ	1	pass
U104	S209	A305	1465490556	1462863262	1494297562	AP	ST407	0	0	1	1	pass
U110	S209	A305	1495130523	1475130523	1475130523	AU	ST406	0	1	Θ	1	pass
U116	S206	A302	1465490556	1462863262	1468094889	E	ST409	0	1	Θ	1	pass
U118	S206	A302	1465490556	1465490556	1462863262	A	ST411	1	0	1	1	pass
U107	S205	A301	1465130523	1475130523	1465230523	E	ST409	1	1	9	1	pass
U104	S205	A301	1462863262	1468094889	1468094889	Е	ST409	2	0	Θ	1	pass

At the end, script will automatically divide the records based on status **pass & fail** and dump the result into **processed_dir** folder with **valid** and **invalid** folders as shown below:

```
[acadgild@localhost processed_dir]s ls -ls total 8
4 drwxrwxr-x. 3 acadgild acadgild 4096 Dec 2 13:43 invalid [acadgild@localhost processed_dir]s cd valid [acadgild@localhost valid]s ls -ls total 4
4 drwxrwxr-x. 3 acadgild acadgild 4096 Dec 2 13:43 valid [acadgild@localhost valid]s ls -ls total 4
4 drwxrwxr-x. 2 acadgild acadgild 4096 Dec 2 13:43 batch_1 [acadgild@localhost valid]s cd batch_1/
You have new mmail in /var/spool/mmail/acadgild [acadgild@localhost batch_1]s ls -ls total 36
4 -rw-r--r-. 1 acadgild acadgild 1028 Dec 2 13:43 part-00020-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-. 1 acadgild acadgild 1180 Dec 2 13:43 part-00097-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-. 1 acadgild acadgild 1180 Dec 2 13:43 part-00097-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-. 1 acadgild acadgild 1155 Dec 2 13:43 part-00097-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-. 1 acadgild acadgild 1155 Dec 2 13:43 part-00097-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-. 1 acadgild acadgild 1150 Dec 2 13:43 part-00167-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-. 1 acadgild acadgild 1157 Dec 2 13:43 part-00167-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-. 1 acadgild acadgild 1157 Dec 2 13:43 part-00167-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-. 1 acadgild acadgild 1155 Dec 2 13:43 part-0017-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-. 1 acadgild acadgild 1155 Dec 2 13:43 part-0019-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-. 1 acadgild acadgild 1155 Dec 2 13:44 part-0019-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-. 1 acadgild acadgild 1155 Dec 2 13:44 part-00020-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-. 1 acadgild acadgild 1000 Dec 2 13:44 part-00033-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-. 1 acadgild acadgild 1000 Dec 2 13:44 part-00067-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-. 1 acadgild acadgild 1000 Dec 2 13:44 part-00160-ee135a99-53c0-4842-a147-c3209adbf222.c000
4 -rw-r--r-.
```

Enrichment phase is executed successfully by applying all the rules of enrichment.

7. Perform Data Analysis (using Spark)

In this stage, we will do analysis on enriched data using Spark SQL and run the program using **Spark-Submit** command.

```
Script for Data analysis.sh:
```

#!/bin/bash

batchid=`cat /home/acadgild/examples/music/logs/current-batch.txt` LOGFILE=/home/acadgild/examples/music/logs/log_batch_\$batchid

echo "Running script for data analysis..." >> \$LOGFILE

```
spark-submit
--class DataAnalysis --master local[2] \
--jars
/home/acadgild/install/hive/apache-hive-2.3.2-bin/lib/hive-
                                                              hbase-handler-
2.3.2.jar,/home/acadgild/install/hive/apache-hive- 2.3.2-bin/lib/hbase-client-
1.1.1.jar,/home/acadgild/install/hive/apache-hive-2.3.2-
                                                               bin/lib/hbase-
common-1.1.1.jar,/home/acadgild/install/hive/apache-
                                                                   hive-2.3.2-
bin/lib/hbase-hadoop-compat- 1.1.1.jar,/home/acadgild/install/hive/apache-
hive-2.3.2- bin/lib/hbase-server-1.1.1.jar,/home/acadgild/install/hive/apache-
hive-2.3.2-bin/lib/hbase-protocol-
1.1.1.jar,/home/acadgild/install/hive/apache-hive-2.3.2- bin/lib/zookeeper-
3.4.6.jar,/home/acadgild/install/hive/apache-hive-
                                                         2.3.2-bin/lib/guava-
14.0.1.jar,/home/acadgild/install/hive/apache- hive-2.3.2-bin/lib/htrace-core-
3.1.0-incubating.jar \
/home/acadgild/examples/music/MusicDataAnalysis/target/scala-
2.11/musicdataanalysis_2.11-1.0.jar $batchid
```

sh/home/acadgild/examples/music/data_export.sh

echo "Incrementing batchid..." >> \$LOGFILE

batchid=`expr \$batchid + 1`
echo -n \$batchid > /home/acadgild/examples/music/logs/current- batch.txt

Problem Statements

- **1.** Determine top 10 station_id(s) where maximum number of songs were played, which were liked by unique users.
- **2.** Determine total duration of songs played by each type of user, where type of user can be 'subscribed' or 'unsubscribed'. An unsubscribed user is the one whose record is either not present in Subscribed_users lookup table or has subscription_end_date earlier than the timestamp of the song played by him.
- **3.** Determine top 10 connected artists. Connected artists are those whose songs are most listened by the unique users who follow them.
- **4.** Determine top 10 songs who have generated the maximum revenue. Royalty applies to a song only if it was liked or was completed successfully or both.
- **5.** Determine top 10 unsubscribed users who listened to the songs for the longest duration.

Spark Source Code:

We have created below Scala file for creating tables for each query (problem statement wise).

DataAnalysis.scala:

```
import org.apache.spark.{SparkConf, SparkContext}
import org.apache.spark.sql

object DataAnalysis {
    def main(args: Array[String]): Unit = {
        val conf = new SparkConf().setAppName("Data Analysis")
        val sc = new SparkContext(conf)
        val sqlContext = new org.apache.spark.sql.hive.HiveContext(sc)
        val batchId = args(0)

/***Problem 1: Determine top 10 station_id(s) where maximum number
        of songs were played, which were liked by unique users***/
```

```
val create_top_10_stations = """CREATE TABLE IF NOT EXISTS top_10_stations (
    station_id STRING,
    total_distinct_songs_played INT,
    distinct_user_count INT
)
PARTITIONED BY (batchid INT)
ROW FORMAT DELIMITED
FIELDS TERMINATED BY ','
STORED AS TEXTFILE"""
```

```
PARTITION(batchid='$batchId')
SELECT
station_id,
COUNT(DISTINCT song_id) AS total_distinct_songs_played,
COUNT(DISTINCT user_id) AS distinct_user_count
FROM enriched data
WHERE status='pass'
AND batchid='$batchId'
AND like=1
GROUP BY station id
ORDER BY total_distinct_songs_played DESC
LIMIT 10"""
/***Problem 2: Determine total duration of songs played by each type of
user, where type of user can be 'subscribed' or 'unsubscribed'. An
unsubscribed user is the one whose record is either not present in
Subscribed_users lookup table or has subscription_end_date earlier than
the timestamp of the song played by him***/
    create users behaviour = """CREATE TABLE IF NOT EXISTS
users_behaviour
user_type STRING,
duration INT
PARTITIONED BY (batchid INT)
ROW FORMAT DELIMITED
FIELDS TERMINATED BY '.'
STORED AS TEXTFILE"""
val load_users_behaviour = s"""INSERT OVERWRITE TABLE users_behaviour
PARTITION(batchid='$batchId')
SELECT
CASE WHEN (su.user id IS NULL OR CAST(ed.timestamp AS DECIMAL(20,0))
> CAST(su.subscn_end_dt AS DECIMAL(20,0))) THEN 'UNSUBSCRIBED'
WHEN (su.user id IS NOT NULL AND CAST(ed.timestamp AS DECIMAL(20,0))
<= CAST(su.subscn_end_dt AS DECIMAL(20,0))) THEN 'SUBSCRIBED'</pre>
END AS user_type,
SUM(ABS(CAST(ed.end_ts
                           AS
                                 DECIMAL(20,0))-CAST(ed.start_ts
                                                                   AS
DECIMAL(20,0)))) AS duration
FROM enriched data ed
LEFT OUTER IOIN subscribed users su
ON ed.user id=su.user id
WHERE ed.status='pass'
AND ed.batchid='$batchId'
```

GROUP BY CASE WHEN (su.user_id IS NULL OR CAST(ed.timestamp AS DECIMAL(20,0)) > CAST(su.subscn_end_dt AS DECIMAL(20,0))) THEN 'UNSUBSCRIBED'

WHEN (su.user_id IS NOT NULL AND CAST(ed.timestamp AS DECIMAL(20,0)) <= CAST(su.subscn_end_dt AS DECIMAL(20,0))) THEN 'SUBSCRIBED' END"""

/***Problem 3: Determine top 10 connected artists. Connected artists are those whose songs are most listened by the unique users who follow them***/

```
val create_connected_artists = """CREATE TABLE IF NOT EXISTS
connected artists
artist id STRING.
user count INT
PARTITIONED BY (batchid INT)
ROW FORMAT DELIMITED
FIELDS TERMINATED BY '.'
STORED AS TEXTFILE"""
      load connected artists = s"""INSERT OVERWRITE
val
                                                                TABLE
connected_artists
PARTITION(batchid='$batchId')
SELECT
ua.artist id.
COUNT(DISTINCT ua.user_id) AS user_count
FROM
SELECT user id, artist id FROM users artists
LATERAL VIEW explode(artists_array) artists AS artist_id
) ua
INNER JOIN
SELECT artist id, song id, user id
FROM enriched data
WHERE status='pass'
AND batchid='$batchId'
) ed
ON ua.artist id=ed.artist id
AND ua.user id=ed.user id
GROUP BY ua.artist id
ORDER BY user count DESC
LIMIT 10"""
```

```
/***Problem 4: Determine top 10 songs who have generated the
maximum revenue. Royalty applies to a song only if it was liked or was
completed successfully or both***/
val create_top_10_royalty_songs = """CREATE TABLE IF NOT EXISTS
top_10_royalty_songs
song_id STRING,
duration INT
PARTITIONED BY (batchid INT)
ROW FORMAT DELIMITED
FIELDS TERMINATED BY '.'
STORED AS TEXTFILE"""
val load_top_10_royalty_songs = s"""INSERT OVERWRITE
                                                              TABLE
top_10_royalty_songs
PARTITION(batchid='$batchId')
SELECT song id,
SUM(ABS(CAST(end_ts
                         AS
                                 DECIMAL(20,0))-CAST(start_ts
                                                                  AS
DECIMAL(20,0)))) AS duration
FROM enriched data
WHERE status='pass'
AND batchid='$batchId'
AND (like=1 OR song_end_type=0)
GROUP BY song_id
ORDER BY duration DESC
LIMIT 10"""
/***Problem 5: Determine top 10 unsubscribed users who listened to the
songs for the longest duration***/
val create_top_10_unsubscribed_users = """CREATE TABLE IF NOT EXISTS
top_10_unsubscribed_users
user id STRING,
duration INT
PARTITIONED BY (batchid INT)
ROW FORMAT DELIMITED
FIELDS TERMINATED BY '.'
STORED AS TEXTFILE"""
val load_top_10_unsubscribed_users = s"""INSERT OVERWRITE TABLE
top 10 unsubscribed users
PARTITION(batchid='$batchId')
SELECT
```

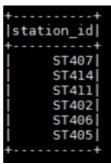
```
ed.user id,
SUM(ABS(CAST(ed.end_ts
                                   DECIMAL(20,0))-CAST(ed.start_ts
                                                                       AS
                            AS
DECIMAL(20,0)))) AS duration
FROM enriched_data ed
LEFT OUTER JOIN subscribed_users su
ON ed.user_id=su.user_id
WHERE ed.status='pass'
AND ed.batchid='$batchId'
AND (su.user_id IS NULL OR (CAST(ed.timestamp AS DECIMAL(20,0)) >
CAST(su.subscn end dt AS DECIMAL(20,0))))
GROUP BY ed.user_id
ORDER BY duration DESC
LIMIT 10"""
  try {
    sqlContext.sql("SET hive.auto.convert.join=false")
    sqlContext.sql("USE project")
    sqlContext.sql(create_top_10_stations)
    sqlContext.sql(load_top_10_stations)
    sqlContext.sql(create_users_behaviour)
    sqlContext.sql(load_users_behaviour)
    sqlContext.sql(create_connected_artists)
    sqlContext.sql(load_connected_artists)
    sqlContext.sql(create_top_10_royalty_songs)
    sqlContext.sql(load_top_10_royalty_songs)
    sqlContext.sql(create_top_10_unsubscribed_users)
    sqlContext.sql(load top 10 unsubscribed users)
   }
   catch{
   case e: Exception=>e.printStackTrace()
```

We are executing **Data_analysis.sh** script by running **music_project_master.sh** script file.

```
cadgild@localhost music]$ ./music project master.sh
eparing to execute python scripts to generate data...
ta Generated Successfully !
arting the daemons....
52 NodeManagor
                  35 JobHistoryServer
325 Jps
l hadoop daemons started !
load the look up tables now in Hbase...
ne with data population in look up tables !
ts do some data formatting now...
ts formatting complete !
eating hive tables on top of hbase tables for data enrichment and filtering...
ve table with Hbase Mapping Complete !
ts do some data enrichment as per the requirement...
ta Enrichment Complete
ts run some use cases now...
1/2/09 15:40:57 INFO spark.SparkContext: Running Spark version 2.2.1
1/2/09 15:40:57 INFO spark.SparkContext: Running Spark version 2.2.1
1/2/09 15:41:05 WARN util.NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java classes where
plicable
1/2/09 15:41:06 WARN util.Utils: Your hostname, localhost.localdomain resolves to a loopback address: 127.0.0.1; using 192.168.0.100 in
ead (on interface eth15)
1/2/09 15:41:06 WARN util.Utils: Set SPARK_LOCAL_IP if you need to bind to another address
1/2/09 15:41:07 INFO spark.SparkContext: Submitted application: Data Analysis
1/2/09 15:41:07 INFO spark.SecurityManager: Changing view acls to: acadgild
1/2/09 15:41:07 INFO spark.SecurityManager: Changing view acls groups to:
                     /12/09 15:45:58 INFO parser.CatalýstsqlParser: Parsing command: string
/12/09 15:45:58 INFO metastore.HiveMetaStore: 0: get_table : db=project<mark>_tbl=top_10_unsubscribed_users</mark>
/12/09 15:45:58 INFO HiveMetaStore.audit: ugi=acadgild ip=unknown-ip-addr cmd=get_table : db=project_tbl=top_10_unsubscribe
    18/12/09 15:45:58 INFO HiveMetaStore.audit: ugi=acadgild ip=unknown-1p-addr cmd=get_table : db=project tbl=top_10_unsubscribe d_users
18/12/09 15:45:58 INFO parser.CatalystSqlParser: Parsing command: int
18/12/09 15:45:58 INFO parser.CatalystSqlParser: Parsing command: string
18/12/09 15:45:58 INFO parser.CatalystSqlParser: Parsing command: int
18/12/09 15:45:59 INFO common.FileUtils: Creating directory if it doesn't exist: hdfs://localhost:8020/user/hive/warehouse/project.db/top
18/12/09 15:45:59 INFO common.FileUtils: Creating directory if it doesn't exist: hdfs://localhost:8020/user/hive/warehouse/project.db/top
18/12/09 15:45:59 INFO output.FileOutputCommitter: File Output Committer Algorithm version is 1
18/12/09 15:45:59 INFO datasources.SQLHadoopMapReduceCommitProtocol: Using output committer class org.apache.hadoop.mapreduce.lib.output.
18/12/09 15:45:59 INFO aggregate.HashAggregateExec: spark.sql.codegen.aggregate.map.twolevel.enable is set to true, but current version of codegened fast hashmap does not support this aggregate.
18/12/09 15:45:59 INFO spark.ContextCleaner: Cleaned shuffle 9
18/12/09 15:45:59 INFO spark.ContextCleaner: cleaned accumulator 439
18/12/09 15:45:59 INFO spark.ContextCleaner: cleaned accumulator 439
18/12/09 15:45:59 INFO spark.ContextCleaner: Cleaned accumulator 438
18/12/09 15:45:59 INFO spark.ContextCleaner: Cleaned accumulator 438
18/12/09 15:45:59 INFO spark.ContextCleaner: Cleaned accumulator 438
18/12/09 15:45:59 INFO spark.ContextCleaner: Cleaned accumulator 437
18/12/09 15:45:59 INFO spark.Conte
                           .
12/09 15:45:59 INFO spark.ContextCleaner: Cleaned accumulator 434
12/09 15:45:59 INFO spark.ContextCleaner: cleaned accumulator 435
12/09 15:45:59 INFO storage.BlockManagerInfo: Removed broadcast_19_piece0 on 192.168.0.100:45515 in memory (size: 24.9 KB, free: 413.8
     MB)
18/12/09 15:45:59 INFO spark.ContextCleaner: Cleaned accumulator 430
18/12/09 15:45:59 INFO spark.ContextCleaner: Cleaned accumulator 436
Warning: /home/acadgild/install/sqoop/sqoop-1.4.6.bin_hadoop-2.0.4-alpha/../hcatalog does not exist! HCatalog jobs will fail.
Please set $HCAT_HOME to the root of your HCatalog installation.
Warning: /home/acadgild/install/sqoop/sqoop-1.4.6.bin_hadoop-2.0.4-alpha/../accumulo does not exist! Accumulo imports will fail.
Please set $ACCUMULO HOME to the root of your Accumulo installation.
18/12/09 16:21:09 MARN tool.BaseSqoopTool: Setting your password on the command-line is insecure. Consider using -P instead.
18/12/09 16:21:10 INFO sqoop, RySQLManager: Preparing to use a MySQL streaming resultset.
18/12/09 16:21:10 INFO manager.MySQLManager: Preparing to use a MySQL streaming resultset.
18/12/09 16:21:15 IST 2018 MARN: Establishing SSL connection must be established by default if explicit option isn't set. For compliance w ith existing applications not using SSL the verifyServerCertificate property is set to 'false', You need either to explicitly disable SSL by setting useSSL=false, or set useSSL=true and provide truststore for server certificate verification.
18/12/09 16:21:19 INFO manager.SqLManager: Executing SQL statement: SELECT t.* FROM top 10 stations' AS t LIMIT 1
18/12/09 16:21:19 INFO orm.CompilationManager: HADODP MAPRED HOME is /home/acadgild/install/hadoop/hadoop-2.6.5
Note: /tmp/sqoop-acadgild/compile/2e7e41237c990121d658a47478733800/top_10_stations
18/12/09 16:21:32 INFO orm.CompilationManager: Writing jar file: /tmp/sqoop-acadgild/compile/2e7e412a7c900121d658a47478733800/top_10_stations
SLF41: Found binding in [jar:file:/home/acadgild/install/hadoop/hadoop-2.6.5/share/hadoop/common/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder.class|
SLF41: Scound binding in [jar:file:/home/acadgild/install/hadoop/hadoop-2.6.5/share/hadoop/common/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder.class|
SLF41: Scound binding in [jar:file:/home/acadgild/install/hadoop/hadoop-2.6.5/share/hadoop/common/lib/slf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder.class|
     .class]
SLF4J: See http://www.slf4j.org/codes.html#multiple_bindings for an explanation.
SLF4J: Actual binding is of type [org.slf4j.impl.Log4jLoggerFactory]
18/12/09 16:21:33 WARN util.NativeCodeLoader: <mark>Unable t</mark>o load native-hadoop library for your platform... using builtin-java classes where
applicable
     applicable
18/12/09 16:21:34 INFO Configuration.deprecation: mapred.jar is <mark>deprecated.</mark> Instead, use mapreduce.job.jar
18/12/09 16:21:41 INFO Configuration.deprecation: mapred.reduce.tasks.speculative.execution is d<mark>eprecated</mark>. Instead, use mapreduce.reduce.
speculative
18/12/09 16:21:41 INFO Configuration.deprecation: mapred.map.tasks.speculative.execution is <mark>deprecated</mark>. Instead, use mapreduce.map.specul
      ative
<u>18/12/0</u>9 <u>16:21:41 INF</u>O Configuration.deprecation: mapred.map.tasks is <mark>deprecated.</mark> Instead, use mapreduce.job.map:
```

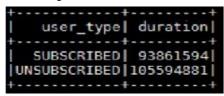
Problem 1:

Determine top 10 station_id(s) where maximum number of songs were played, which were liked by unique users.



Problem 2:

Determine total duration of songs played by each type of user, where type of user can be 'subscribed' or 'unsubscribed'. An unsubscribed user is the one whose record is either not present in Subscribed_users lookup table or has subscription_end_date earlier than the timestamp of the song played by him.



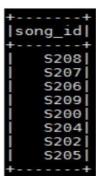
Problem 3:

Determine top 10 connected artists. Connected artists are those whose songs are most listened by the unique users who follow them.



Problem 4:

Determine top 10 songs who have generated the maximum revenue. Royalty applies to a song only if it was liked or was completed successfully or both



Problem 5:

Determine top 10 unsubscribed users who listened to the songs for the longest duration.

```
| U117|
| U117|
| U118|
| U110|
| U120|
| U15|
| U107|
| U108|
| U109|
| U106|
| U100|
```

We could see below that all tables have also been created in the Hive:

```
hive> use project;

OK

Time taken: 0.098 seconds
hive> show tables;

OK

connected artists
enriched_data
formatted_input
song_artist_map
station_geo_map
subscribed users
top_10_royalty_songs
top_10_royalty_songs
top_10_unsubscribed_users
users artists
users_behaviour

Time taken: 0.407 seconds, Fetched: 11 row(s)
hive>
```

We have also verified that all the spark queries creating the tables for each query. So, Data Analysis using Spark is executed successfully.

The data analysis result is shown in the Hive tables below in the screen shot:

Below is the output of **top_10_stations** table:

Below is the output of **users_behaviour** table:

```
hive> Select * From users_behaviour;

OK
users_behaviour.user_type users_behaviour.duration users_behaviour.batchid

SUBSCRIBED 93861594 1

UNSUBSCRIBED 105594881 1

Time taken: 0.274 seconds, Fetched: 2 row(s)
```

Below is the output of **connected_artists** table:

```
hive> Select * From connected_artists;

OK
connected_artists.artist_id connected_artists.user_count connected_artists.batchid

A303 2 1

A302 2 1

A300 1 1

Time taken: 0.225 seconds, Fetched: 3 row(s)
```

Below is the output of **top_10_royalty_songs** table:

Below is the output of **top_10_unsubscribed_users** table:

Now we need to export all the data to the MYSQL using sqoop, by executing **data_export.sh** script file. By using **data_export.sh** script file, we are going to export the data from the hive tables into mysql using Sqoop export.

```
#!/bin/bash
```

batchid=`cat /home/acadgild/examples/music/logs/current-batch.txt` LOGFILE=/home/acadgild/examples/music/logs/log_batch_\$batchid

echo "Creating mysql tables if not present..." >> \$LOGFILE

echo "Running sqoop job for data export..." >> \$LOGFILE

```
sqoop export \
--connect jdbc:mysql://localhost/project \
--username 'root' \
--password 'Root@123' \
--table 'top_10_stations' \
--export-dir
'/user/hive/warehouse/project.db/top_10_stations/batchid=$batchid' \
--input-fields-terminated-by ',' \
-m 1
```

```
sgoop export \
--connect jdbc:mysql://localhost/project \
--username 'root' \
--password 'Root@123' \
--table 'song_duration' \
--export-dir
'/user/hive/warehouse/project.db/users_behaviour/batchid=$batchid' \
--input-fields-terminated-by ',' \
-m 1
sqoop export \
--connect jdbc:mysql://localhost/project \
--username 'root' \
--password 'Root@123' \
--table 'connected_artists' \
--export-dir
'/user/hive/warehouse/project.db/connected_artists/batchid=$batchid \
--input-fields-terminated-by ',' \
-m 1
sqoop export \
--connect jdbc:mysql://localhost/project \
--username 'root' \
--password 'Root@123' \
--table 'top_10_royalty_songs' \
--export-dir
'/user/hive/warehouse/project.db/top_10_royalty_songs/batchid=$batchid' \
--input-fields-terminated-by ',' \
-m 1
sgoop export \
--connect jdbc:mysql://localhost/project \
--username 'root' \
--password 'Root@123' \
--table 'top_10_unsubscribed_users' \
--export-dir
'/user/hive/warehouse/project.db/top_10_unsubscribed_users/batchid=$batch
--input-fields-terminated-by ',' \
-m 1
```

Below we could see that data exported successfully into the MYSQL Database for all the 5 queries:

The sqoop export command exported the tables from the hive and it stored in the Mysql. The below screen shot show the successful Sqoop export from hive to mysql. The data stored in the Mysql is shown in below screenshots:

```
Warning: /home/acadgild/install/sqoop/sqoop-1.4.6.bin_hadoop-2.0.4-alpha/../hcatalog does not exist! HCatalog jobs will fail.
Please set SHCAT HOWE to the root of your HCatalog installation.
Warning: /home/acadgild/install/sqoop/sqoop-1.4.6.bin_hadoop-2.0.4-alpha/../accumulo does not exist! Accumulo imports will fail.
Please set SACCUMULO HOME to the root of your Accumulo installation.
18/12/99 16:21:09 INFO sqoop. Sqoop: Running Sqoop version: 1.4.6
18/12/99 16:21:10 INFO manager.MySQLManager: Setting your password on the command-line is insecure. Consider using -P instead.
18/12/99 16:21:10 INFO manager.MySQLManager: Preparing to use a MySQL streaming resultset.
18/12/99 16:21:110 INFO tool.CodedenTool: Beginning code generation
Sun Dec 09 16:21:12 IST 2018 WARN: Establishing SSL connection without server's identity verification is not recommended. According to My
SQL 5.5.45+5.6.26-4 and 5.7.6+ requirements SSL connection without server's identity verification is not recommended. According to My
SQL 5.5.45+5.6.26-4 and 5.7.6+ requirements SSL connection without server's identity verification is not recommended. According to My
SQL 5.5.45+5.6.26-4 and 5.7.6+ requirements SSL connection without server's identity verification is not recommended. According to My
SQL 5.5.45+5.6.26-4 and 5.7.6+ requirements SSL connection without server's identity verification is not recommended. According to My
SQL 5.5.45+5.6.26-4 and 5.7.6+ requirements SSL connection without server's identity verification is not recommended. According to My
SQL 5.5.45+5.6.26-4 and 5.7.6+ requirements SSL connection without server's identity verification is not recommended. According to My
SQL 5.5.45+5.6-26-4 and 5.7.6+ requirements SSL connection without server's identity verification is not recommended. According to My
SQL 5.5-45+5.6-26-4 and 5.7.6+ requirements SSL connection without server's identity verification is not recommended. According to My
SQL 5.5-45+5.6-26-4 and 5.7.6+5.4-5.6-26-4 and 5.7.6+5.4-5.4-5.4-5.4-5.4-5.6-4-5.4-5.4-5.6-5.6-
```

```
Total committed heap usage (bytes)=62980096
File Input Format Counters
Bytes Read=0
File Output Format Counters
Bytes Written=0
18/12/09 16:23:34 IMFO mapreduce.ExportJobBase: Transferred 266 bytes in 112.788 seconds (2.3584 bytes/sec)
18/12/09 16:23:34 IMFO mapreduce.ExportJobBase: Exported 5 records.
Warning: /home/acadgild/install/sqoop/sqoop-1.4.6.bin_hadoop-2.0.4-alpha/../hcatalog does not exist! HCatalog jobs will fail.
Please set $MCAT HOME to the root of your HCatalog installation.
Please set $MCAT HOME to the root of your Accumulo installation.
18/12/09 16:23:44 IMFO sqoop.Sqoop: Aunning Sqoop version: 1.4.6
18/12/09 16:23:44 WARN tool.BaseSqoop: Running Sqoop version: 1.4.6
18/12/09 16:23:44 WARN tool.BaseSqoop: Running Sqoop version: 1.4.6
18/12/09 16:23:45 IMFO manager.MySQLManager: Preparing to use a MySQL streaming resultset.
18/12/09 16:23:45 IMFO manager.MySQLManager: Preparing to use a MySQL streaming resultset.
18/12/09 16:23:45 IMFO manager.SquManager: Sconnection without server's identity verification is not recommended. According to My SQL 5.5.45+, 5.6.26+ and 5.7.6+ requirements SSL connection without server's identity verification is not recommended. According to My SQL 5.5.45+, 5.6.26+ and 5.7.6+ requirements SSL connection without server's identity verification is not recommended. According to My SQL 5.5.45+, 5.6.26+ and 5.7.6+ requirements SSL connection must be established by default if explicit option isn't set. For compliance w by setting useSSL=false, or set useSSL=true and provide truststore isnoored set of the set o
```

The **project** database had been exported from hive (HDFS) and the below screen shot shows all tables:

Output from **top_10_stations** table in mysgl is shown below:

Output from **users_behaviour** table in mysql is shown below:

Output from **connected_artists** table in mysql is shown below:

Output from **top_10_royalty_songs** table in mysql is shown below:

```
mysql> | Select * From top_10_royalty_songs;
 song_id | duration
 S208
           22627294
 S207
           20000000
 S206
           19900000
 S209
            15254588
 S200
             9900000
 S204
             2604333
  S202
              100000
  S205
  rows in set (0.00 sec)
```

Output from **top_10_unsubscribed_users** table in mysql is shown below:

```
mysql> Select * From top 10 unsubscribed users;
 user id | duration |
 U117
         20000000
 U118
         2000000
         20000000
 U110
 U120
         12627294
 U115
         12527294
 U107
         10000000
 U108
            5231627
 U109
            2604333
            2604333
 U106
 U100
                 Θ
10 rows in set (0.01 sec)
```

Iob Scheduling

Now after exporting data into MySQL, **batchid** will be incremented to additional 1 means one batch of data operations is successfully completed and new batch of data will be loaded for the analysis after every 3 hours.

Part of Data analysis.sh file:

sh /home/acadgild/examples/music/data_export.sh echo "Incrementing batchid..." >> \$LOGFILE batchid=`expr \$batchid + 1` echo -n \$batchid >/home/acadgild/examples/music/logs/current-batch.txt

We can check logs to track the behaviour of the operations we have done on the data and overcome failures (if any) we could see the **batchid** gets incremented by 1 in **current-batch.txt**

```
[acadgild@localhost logs]$ pwd
/home/acadgild/examples/music/logs
[acadgild@localhost logs]$ ls -ls
total 52
4 -rwxrwxr-x. 1 acadgild acadgild 2 Dec 9 17:18 current-batch.txt
4 -rw-rw-r--. 1 acadgild acadgild 522 Dec 9 16:21 log batch 1

[acadgild@localhost logs]$ cat current-batch.txt
2
```

Conclusion

We have performed all data operations, executed all use cases and obtained results successfully for one of the leading music company.