Music Data Analysis using Hadoop

Section - 1

Project Overview

A leading music-catering company is planning to analyze large amount of data received from varieties of sources, namely mobile app and website to track the behavior of users, classify users, calculate royalties associated with the song and make appropriate business strategies. The file server receives data files periodically after every 3 hours.

1.1 Fields present in the data files

Data files contain below fields.

Column Name/Field Name	Column Description/Field Description
User_id	Unique identifier of every user
Song_id	Unique identifier of every song
Artist_id	Unique identifier of the lead artist of the song
Timestamp	Timestamp when the record was generated
Start_ts	Start timestamp when the song started to play
End_ts	End timestamp when the song was stopped
Geo_cd	Can be 'A' for USA region, 'AP' for asia pacific
	region, 'J' for Japan region, 'E' for europe and
	'AU' for australia region
Station_id	Unique identifier of the station from where the
	song was played
Song_end_type	How the song was terminated.
	0 means completed successfully
	1 means song was skipped
	2 means song was paused
	3 means other type of failure like device issue,
	network error etc.
Like	0 means song was not liked
	1 means song was liked
Dislike	0 means song was not disliked
	1 means song was disliked

1.2 LookUp Tables

There are some existing look up tables present in NoSQL databases. They play an important role in data enrichment and analysis.

Table Name	Description
Station_Geo_Map	Contains mapping of a geo_cd with station_id
Subscribed_Users	Contains user_id, subscription_start_date and
	subscription_end_date.
	Contains details only for subscribed users
Song_Artist_Map	Contains mapping of song_id with artist_id
	alongwith royalty associated with each play of
	the song
User_Artist_Map	Contains an array of artist_id(s) followed by a
	user_id

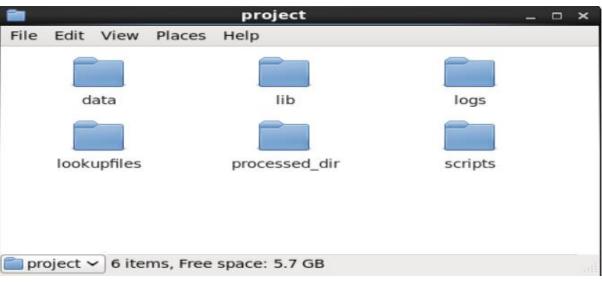
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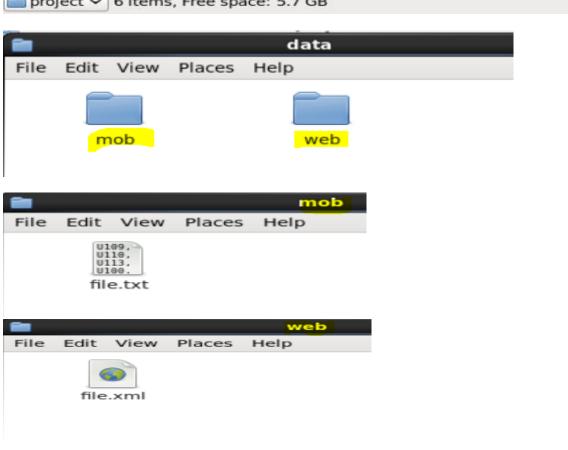
1.3 DATASET

- 1. Data coming from web applications reside in /data/web and has xml format.
- 2. Data coming from mobile applications reside in /data/mob and has csv format.
- 3. Data present in lookup directory should be used in HBase.

Below is the link for same.

https://drive.google.com/drive/folders/0B_P3pWagdIrrMjJGVINsSUEtbG8?usp=sharing





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1.4 Data Enrichment 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.

NULL or absent field	Look up field	Look up table (Table from			
		which record can be updated)			
Geo_cd	Station_id	Station_Geo_Map			
Artist_id	Song_id	Song_Artist_Map			

1.5 Data Analysis (SHOULD BE IMPLEMETED IN SPARK)

- 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.

1.6 Challenges and Optimizations:

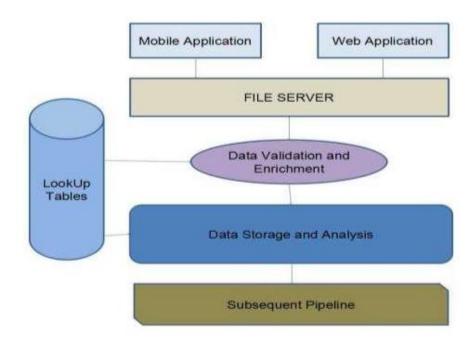
1. LookUp tables are in NoSQL databases. Integrate them with the actual data flow.

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- 2. Try to make joins as less expensive as possible.
- 3. Data Cleaning, Validation, Enrichment, Analysis and Post Analysis have to be automated. Try using schedulers.
- 4. Appropriate logs have to maintain to track the behaviour and overcome failures in the pipeline.

1.7 Flow of operations

A schematic flow of operations is shown below

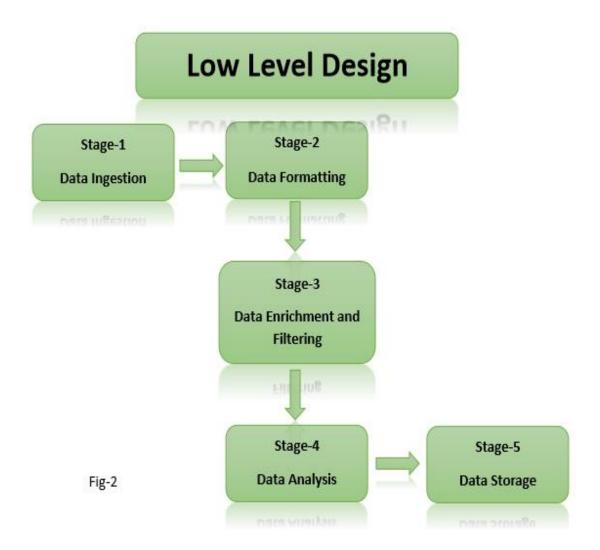


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Section -2 -

Design of the Project 2.1 Low Level Design

The following flowchart shows the Low Level design of this project,



Music Data Analysis using Hadoop

2.2 High Level Design

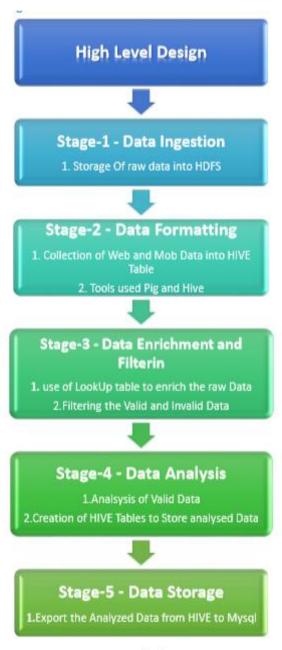


Fig-3

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Section-3-Hadoop Eco-System Implementation

 We have created a batch file "start-daemon.sh" which starts the daemons such as hive, hbase, Mysql and rest of the all hadoop daemons.
 Batch file script,

```
start-daemons.sh
#!/bin/bash
if [ -f "/home/acadgild/project/logs/current-batch.txt" ]
 echo "Batch File Found!"
else
 echo -n "1" > "/home/acadgild/project/logs/current-batch.txt"
fi
chmod 775 /home/acadgild/project/logs/current-batch.txt
batchid=`cat /home/acadgild/project/logs/current-batch.txt`
LOGFILE=/home/acadgild/project/logs/log_batch_$batchid
echo "Starting daemons" >> $LOGFILE
# To Start Hadoop Daemons:
start-all.sh
# To start the HMASTER service:
start-hbase.sh
# To Start the JobHistory server Services:
mr-jobhistory-daemon.sh start historyserver
# To Start the mysql service
sudo service mysqld start
  To Start HIVE metastore:
hive --service metastore
```

2. Starting all daemons, sh start-daemon.sh

As per the batch file script all the hadoop daemons and the Hive, MySql and Hive daemons are started shown in the below screen shot,

```
[acadgild@localhost ~]$ sh /home/acadgild/project/scripts/start-daemons.sh
Batch File Found!
his script is Deprecated. Instead use start-dfs.sh and start-yarn.sh.
18/09/08 23:48:57 WARN util.NativeCodeLoader: Unable to load native-hadoop libra
ry for your platform... using builtin-java classes where applicable
Starting namenodes on [localhost]
localhost: starting namenode, logging to /home/acadgild/install/hadoop/hadoop-2.
5.5/logs/hadoop-acadgild-namenode-localhost.localdomain.out
localhost: starting datanode, logging to /home/acadgild/install/hadoop/hadoop-2.
5.5/logs/hadoop-acadgild-datanode-localhost.localdomain.out
  arting secondary namenodes [0.0.0.0]
0.0.0.0: starting secondarynamenode, logging to /home/acadgild/install/hadoop/ha
doop-2.6.5/logs/hadoop-acadgild-secondarynamenode-localhost.localdomain.out
18/09/08 23:49:22 WARN util.NativeCodeLoader: Unable to load native-hadoop libra
y for your platform... using builtin-java classes where applicable:
starting yarn daemons
starting resourcemanager, logging to /home/acadgild/install/hadoop/hadoop-2.6.5/
logs/yarn-acadgild-resourcemanager-localhost.localdomain.out
localhost: starting nodemanager, logging to /home/acadgild/install/hadoop/hadoop
·2.6.5/logs/yarn-acadgild-nodemanager-localhost.localdomain.out
localhost: starting zookeeper, logging to /home/acadgild/install/hbase/hbase-1.2
6/logs/hbase-acadgild-zookeeper-localhost.localdomain.out
                 logging to /home/acadgild/install/hbase/hbase-1.2.6/logs/hbase
```

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```
starting historyserver, logging to /home/acadgild/install/hadoop/hadoop-2.6.5/lo
gs/mapred-acadgild-historyserver-localhost.localdomain.out
Starting mysqld:
2018-09-08 23:50:06: Starting Hive Metastore Server
/home/acadgild/install/hive/apache-hive-2.3.2-bin/bin/ext/metastore.sh: line 29:
export: ` -Dproc_metastore -Dlog4j.configurationFile=hive-log4j2.properties
Djava.util.logging.config.file=/home/acadgild/install/hive/apache-hive-2.3.2-bin
/conf/parquet-logging.properties ': not a valid identifier
SLF4J: Class path contains multiple SLF4J bindings.
SLF4J: Found binding in [jar:file:/home/acadgild/install/hive/apache-hive-2.3.2-
bin/lib/log4j-slf4j-impl-2.6.2.jar!/org/slf4j/impl/StaticLoggerBinder.class]
SLF4J: Found binding in [jar:file:/home/acadgild/install/hadoop/hadoop-2.6.5/sha
re/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.apache.logging.slf4j.Log4jLoggerFactory]
2018-09-08T23:50:20,587 INFO [main] org.apache.hadoop.hive.conf.HiveConf - Found
configuration file file:/home/acadgild/install/hive/apache-hive-2.3.2-bin/conf/
hive-site.xml
2018-09-08T23:50:27,057 INFO [main] org.apache.hadoop.hive.metastore.HiveMetaSto
re - STARTUP MSG:
STARTUP MSG: Starting HiveMetaStore
STARTUP_MSG: host = localhost/127.0.0.1
```

2. We can see the list active services using the jps command, see below screen shot and also Starting the hive metastore created a metastore_db in the location where we desired,

```
[acadgild@localhost ~]$ jps
3649 NodeManager
4561 RunJar
4267 HMaster
4171 HQuorumPeer
3211 DataNode
3403 SecondaryNameNode
3547 ResourceManager
5148 Jps
3087 NameNode
4495 JobHistoryServer
4383 HRegionServer

hdfs metastore db metastore db.tmp
```

4. The **start-daemon.sh** script will check whether the **current-batch.txt** file is available in the logs folder or not. If not it will create the file and dump value '1' in that file and create LOGFILE with the **current batchid**.

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Section-4 - Data Ingestion, Formatting, Enrichment and Filtering

4.1 Stage – 1 – Data Ingestion By using the "populate-lookup.sh" script we will create lookup tables in Hbase. These tables have to be used in, Data formatting, Data enrichment and Analysis stage

Lookup Tables

Sl.no	Table Name	Description	Related File
1	station-geo-	Contains mapping of a geo_cd with	stn-geocd.txt
	map	station_id	
2	subscribed-	Contains user_id, subscription_start_date	user-subscn.txt
	users	and	
		subscription_end_date.	
		Contains details only for subscribed users	
3	song-artist-	Contains mapping of song_id with artist_id	song-artist.txt
	map	Along with royalty associated with each play	
		of	
		the song	
4	user-artist-	Contains an array of artist_id(s) followed by	user-artist.txt
	map	a	
		user_id	

Table-1

"populate-lookup.sh" script

The "populate-lookup.sh" shell script creates the above 4 lookup tables in the Hbase and populate the data into the lookup tables from the dataset files.

In the below screen shots, we can see the create-lookup.sh scripts and the following screen shots shows the tables creation and population of the data in the Hbase. Also, the values loaded into the Hbase Tables are also shown, please see the below screen shots.

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```
populate-lookup.sh 
 #!/bin/bash
 batchid=`cat /home/acadgild/project/logs/current-batch.txt`
 LOGFILE=/home/acadgild/project/logs/log batch $batchid
 echo "Creating LookUp Tables" >> $LOGFILE
 echo "create 'station-geo-map', 'geo'" | hbase shell
echo "create 'subscribed-users', 'subscri" | hbase shell
echo "create 'song-artist-map', 'artist'" | hbase shell
 echo "Populating LookUp Tables" >> $LOGFILE
 file="/home/acadgild/project/lookupfiles/stn-geocd.txt"
while IFS= read -r line
                                                                                                                                             \mathbf{T}
 do
  stnid=`echo $line | cut -d',' -fl`
geocd=`echo $line | cut -d',' -f2`
echo "put 'station-geo-map', '$stnid', 'geo:geo_cd', '$geocd'" | hbase shell
 done <"$file"
 file="/home/acadgild/project/lookupfiles/song-artist.txt"
while IFS= read -r line
 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"</pre>
file="/home/acadgild/project/lookupfiles/song-artist.txt"
while IFS= read -r line
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"</pre>
file="/home/acadgild/project/lookupfiles/user-subscn.txt"
while IFS= read -r line
 userid=`echo $line | cut -d',' -fl
startdt=`echo $line | cut -d',' -f
enddt=`echo $line | cut -d',' -f3`
echo "put 'subscribed-users', '$us
                  echo $line | cut -d',' -f2`
ho $line | cut -d',' -f2`
ho $line | cut -d',' -f3`
  'subscribed-users', '$userid', 'subscn:startdt', '$start
  'subscribed-users', '$userid', 'subscn:enddt', '$enddt'"
  echo "put
                                                                                                           '$startdt'"
                                                                                                                                 | hbase shell
                                                                                                                         | hbase shell
done <"$file"
hive -f /home/acadgild/project/scripts/user-artist.hql
```

Run the script: ./populate-lookup.sh

```
acadgild@localhost ~]$ sh /home/acadgild/project/scripts/po
                                                                pulate-lookup
2018-09-08 23:54:30,125 WARN [main] util.NativeCodeLoader: Unable to load nativ
e-hadoop library for your platform... using builtin-java classes where applicabl
SLF4J: Class path contains multiple SLF4J bindings.
SLF4J: Found binding in [jar:file:/home/acadgild/install/hbase/hbase-1.2.6/lib/s
lf4j-log4j12-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder.class]
SLF4J: Found binding in [jar:file:/home/acadgild/install/hadoop/hadoop-2.6.5/sha
re/hadoop/common/lib/slf4j-log4jl2-1.7.5.jar!/org/slf4j/impl/StaticLoggerBinder.
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
create 'station-geo-map', 'geo'
0 row(s) in 3.1530 seconds
Hbase::Table - station-geo-map
2018-09-08 23:54:45,239 WARN [main] util.NativeCodeLoader: Unable to load nativ
e-hadoop library for your platform... using builtin-java classes where applicabl
SLF4J: Class path contains multiple SLF4J bindings.
```

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```
create 'subscribed-users', 'subscn'
 0 row(s) in 1.7980 seconds
 Hbase::Table - subscribed-users
 2018-09-08 23:54:58,773 WARN [main] util.NativeCodeLoader: Unal
 e-hadoop library for your platform... using builtin-java classe:
 create 'song-artist-map', 'artist'
 0 row(s) in 1.8870 seconds
 Hbase::Table - song-artist-map
 2018-09-08 23:55:13,171 WARN [main] util.Nati
 e-hadoop library for your platform... using bu
put 'station-geo-map', 'ST400', 'geo:geo cd', 'A'
0 row(s) in 0.9730 seconds
put 'song-artist-map', 'S202', 'artist:artistid', 'A302'
0 row(s) in 0.6970 seconds
put 'subscribed-users', 'Ul00', 'subscn:startdt', '1465230523'
0 row(s) in 0.5150 seconds
Logging initialized using configuration in jar:file:/home/acadgild/install/hive/
apache-hive-2.3.2-bin/lib/hive-common-2.3.2.jar!/hive-log4j2.properties Async: t
rue
OK
Time taken: 21.748 seconds
OK
Time taken: 0.071 seconds
OK
Time taken: 5.026 seconds
Loading data to table project.users artists
Time taken: 8.278 seconds
```

We can see the lookup tables created using the "populate-lookup.sh" in the below screen shot,

Lookup Tables in the hbase shell,

```
hbase(main):001:0> list

TABLE

bulktable

clicks

clicksl

plants

song-artist-map

station-geo-map

subscribed-users

7 row(s) in 1.0390 seconds

=> ["bulktable", "clicks", "clicksl", "plants", "song-artist-map", "station-geo-map", "subscribed-users"]
```

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The values loaded in the Lookup tables are shown below,

song-artist-map

```
hbase(main):002:0> scan 'song-artist-map'
ROW
                      COLUMN+CELL
S200
                      column=artist:artistid, timestamp=1536431307664, value=A30
                      column=artist:artistid, timestamp=1536431320389, value=A30
                      column=artist:artistid, timestamp=1536431333004, value=A30
S202
S203
                      column=artist:artistid, timestamp=1536431345899, value=A30
                      column=artist:artistid, timestamp=1536431358653, value=A30
S204
S205
                      column=artist:artistid, timestamp=1536431371190, value=A30
S206
                      column=artist:artistid, timestamp=1536431384035, value=A30
                      column=artist:artistid, timestamp=1536431396771, value=A30
S208
                      column=artist:artistid, timestamp=1536431409984, value=A30
S209
                      column=artist:artistid, timestamp=1536431422326, value=A30
10 row(s) in 0.4220 seconds
```

station-geo-map

```
hbase(main):003:0> scan 'station-geo-map'
ROW
                    COLUMN+CELL
ST400
                    column=geo:geo cd, timestamp=1536431116927, value=A
ST401
                    column=geo:geo cd, timestamp=1536431129347, value=AU
ST402
                    column=geo:geo cd, timestamp=1536431141865, value=AP
                    column=geo:geo cd, timestamp=1536431154611, value=J
ST403
                    column=geo:geo cd, timestamp=1536431168157, value=E
ST404
                    column=geo:geo cd, timestamp=1536431180666, value=A
ST405
ST406
                    column=geo:geo_cd, timestamp=1536431192822, value=AU
ST407
                    column=geo:geo cd, timestamp=1536431206290, value=AP
                    column=geo:geo cd, timestamp=1536431218499, value=E
ST408
ST409
                    column=geo:geo cd, timestamp=1536431231455, value=E
                    column=geo:geo cd, timestamp=1536431243954, value=A
ST410
                    column=geo:geo cd, timestamp=1536431256698, value=A
ST411
                    column=geo:geo cd, timestamp=1536431268827, value=AP
ST412
                    column=geo:geo_cd, timestamp=1536431281830, value=J
ST413
ST414
                    column=geo:geo cd, timestamp=1536431294734, value=E
5 row(s) in 0.1340 seconds
```

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subscribed-users

hhase(main):004:0>	agan laubagribad ugaral
ROW	scan 'subscribed-users' COLUMN+CELL
U100	column=subscn:enddt, timestamp=1536431446966, value=146
	5130523
U100	column=subscn:startdt, timestamp=1536431434484, value=1
III 01	465230523
U101	column=subscn:enddt, timestamp=1536431473347, value=147 5130523
U101	column=subscn:startdt, timestamp=1536431459505, value=1
	465230523
U102	column=subscn:enddt, timestamp=1536431498428, value=147
	5130523
U102	column=subscn:startdt, timestamp=1536431486043, value=1
U103	465230523 column=subscn:enddt, timestamp=1536431523614, value=147
0103	5130523
U103	column=subscn:startdt, timestamp=1536431510669, value=1
	465230523
U104	column=subscn:enddt, timestamp=1536431549489, value=147
	5130523
U104	column=subscn:startdt, timestamp=1536431536755, value=1
U105	465230523 column=subscn:enddt, timestamp=1536431575466, value=147
0100	5130523
U105	column=subscn:startdt, timestamp=1536431562508, value=1
	465230523
U106	column=subscn:enddt, timestamp=1536431602204, value=148
U106	5130523 column=subscn:startdt, timestamp=1536431588815, value=1
0100	465230523
U107	column=subscn:enddt, timestamp=1536431628433, value=145
	5130523
U107	column=subscn:startdt, timestamp=1536431615180, value=1
U108	465230523
0108	column=subscn:enddt, timestamp=1536431657411, value=146
U108	column=subscn:startdt, timestamp=1536431643225, value=1
	465230523
U109	column=subscn:enddt, timestamp=1536431684886, value=147
771.00	5130523
U109	column=subscn:startdt, timestamp=1536431671469, value=1 465230523
U110	column=subscn:enddt, timestamp=1536431713667, value=147
	5130523

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```
U110
                   column=subscn:enddt, timestamp=1536431713667, value=147
                   5130523
U110
                   column=subscn:startdt, timestamp=1536431698933, value=1
                   465230523
U111
                   column=subscn:enddt, timestamp=1536431741647, value=147
                   5130523
U111
                   column=subscn:startdt, timestamp=1536431727804, value=1
                   465230523
U112
                   column=subscn:enddt, timestamp=1536431774030, value=147
                   5130523
U112
                   column=subscn:startdt, timestamp=1536431756332, value=1
                   465230523
U113
                   column=subscn:enddt, timestamp=1536431805069, value=148
U113
                   column=subscn:startdt, timestamp=1536431789462, value=1
                   465230523
U114
                   column=subscn:enddt, timestamp=1536431834210, value=146
                   8130523
U114
                   column=subscn:startdt, timestamp=1536431819885, value=1
                   465230523
l5 row(s) in 0.2580 seconds
```

We have successfully created the lookup tables in the Hbase.

The populate-lookup.sh also creates a lookup table "users_artists" in the HIVE, loading the data from the user-artist.txt, the below screen shot shows that the table has been created in the HIVE.

```
Logging initialized using configuration in jar:file:/home/acadgild/install/hive/apache-hive-2.3.2-bin/lib/hive-common-2.3.2.jar!/hive-log4j2.properties Async: true
OK
Time taken: 21.748 seconds
OK
Time taken: 0.071 seconds
OK
Time taken: 5.026 seconds
Loading data to table project.users_artists
OK
Time taken: 8.278 seconds
You have new mail in /var/spool/mail/acadgild
```

```
sing Hive 1.X releases.
hive> show databases;
OK
custom
default
project
Time taken: 40.762 seconds, Fetched: 3 row(s)
hive> use project;
OK
Time taken: 0.145 seconds
```

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hive> Select * From users_artists;

```
hive> show tables;
OK
users artists
Time taken: 0.161 seconds, Fetched: 1 row(s)
hive> select * from users artists;
OK
U100
      ["A300", "A301", "A302"]
U101
      ["A301", "A302"]
U102
       ["A302"]
       ["A303","A301","A302"]
U103
       ["A304", "A301"]
U104
       ["A305", "A301", "A302"]
U105
       ["A301", "A302"]
U106
U107
       ["A302"]
       ["A300","A303","A304"]
U108
       ["A301", "A303"]
U109
       ["A302", "A301"]
U110
U111
       ["A303", "A301"]
       ["A304", "A301"]
U112
       ["A305", "A302"]
U113
U114
        ["A300", "A301", "A302"]
Time taken: 9.456 seconds, Fetched: 15 row(s)
```

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:

In this section 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.

Run the script: ./data_enrichment_filtering_schema.sh,

```
#!/bin/bash

batchid-'cat /home/acadgild/project/logs/current-batch.txt'
LOGFILE=/home/acadgild/project/logs/log_batch_$batchid

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

hive -f /home/acadgild/project/scripts/create_hive_hbase_lookup.hql
```

The script will run the "create_hive_hbase_lookup.hql" 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.

create_hive_hbase_lookup.hql

Music Data Analysis using Hadoop

```
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");
```

The below screenshot we can see tables getting created in hive by running the "data_enrichement_filtering_schema.sh file"

Music Data Analysis using Hadoop

```
[acadgild@localhost ~]$ sh /home/acadgild/project/scripts/data enrichment f
iltering schema.sh
SLF4J: Class path contains multiple SLF4J bindings.
SLF4J: Found binding in [jar:file:/home/acadgild/install/hive/apache-hive-2
.3.2-bin/lib/log4j-slf4j-impl-2.6.2.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-log4jl2-1.7.5.jar!/org/slf4j/impl/StaticLog
gerBinder.class]
SLF4J: See http://www.slf4j.org/codes.html#multiple bindings for an explana
tion.
SLF4J: Actual binding is of type [org.apache.logging.slf4j.Log4jLoggerFacto
Logging initialized using configuration in jar:file:/home/acadgild/install/
hive/apache-hive-2.3.2-bin/lib/hive-common-2.3.2.jar!/hive-log4j2.propertie
s Asvnc: true
OK
Time taken: 32.075 seconds
OK
Time taken: 16.2 seconds
OK
Time taken: 0.529 seconds
OK
Time taken: 0.474 seconds
You have new mail in /var/spool/mail/acadgild
```

Hive>Show Tables;

```
hive> show tables;

OK

song_artist_map
station_geo_map
subscribed_users
users_artists

Time taken: 0.871 seconds, Fetched: 4 row(s)
```

hive>Select * From song_artist_map

```
hive> select * from song artist map;
OK
S200
        A300
        A301
S201
S202
        A302
S203
        A303
S204
        A304
S205
        A301
S206
        A302
S207
        A303
S208
        A304
S209
        A305
Time taken: 15.159 seconds, Fetched: 10 row(s)
```

Music Data Analysis using Hadoop

hive>Select * From station_geo_map

```
hive> select * from station geo map;
OK
ST400
        Α
ST401
        AU
ST402
        AP
ST403
        J
ST404
        E
ST405
        A
ST406
        ΑU
ST407
        AP
ST408
        E
ST409
        E
ST410
       A
ST411
       \mathbf{A}
ST412
       AP
ST413
        J
ST414
Time taken: 0.898 seconds, Fetched: 15 row(s)
```

hive>Select * From Subscribed_users

```
hive> select * from subscribed users;
OK
       1465230523 1465130523
1465230523 1475130523
1465230523 1475130523
U100
U101
U102
U103
       1465230523
                        1475130523
       1465230523
U104
                        1475130523
       1465230523
1465230523
1465230523
U105
                        1475130523
                        1485130523
U106
                        1455130523
U107
       1465230523
U108
                        1465230623
U109
       1465230523
                        1475130523
U110
       1465230523
                        1475130523
U111
       1465230523
                         1475130523
U112
        1465230523
                         1475130523
U113
        1465230523
                         1485130523
U114
        1465230523
                         1468130523
Time taken: 1.079 seconds, Fetched: 15 row(s)
```

4.2 Stage - 2 - Data Formatting

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

Run the script: ./dataformatting.sh

Music Data Analysis using Hadoop

```
#!/bin/bash
batchid='cat /home/acadgild/project/logs/current-batch.txt'
LOGFILE-/home/acadgild/project/logs/log_batch_Sbatchid
echo "Flacing data files from local to HDF5..." >> $LOGFILE
/web/
hadoop fs -rm -r /user/acadgild/project/batch | batchid
                                                    /formattedweb/
hadoop fs -rm -r /user/acadgild/project/batchs(batch
                                                     /mob/
hadoop fs -mkdir -p /user/acadgild/project/batch
                                                        /web/
hadoop fs -mkdir -p /user/acadgild/project/batch
                                                       /mob/
hadoop fs -put /home/acadgild/project/data/web/* /user/acadgild/project/batch
                                                                                   /web/
hadoop fs -put /home/acadgild/project/data/mob/* /user/acadgild/project/batch
                                                                                   /mob/
echo "Running pig script for data formatting..." >> $LOGFILE
pig -param batchid-Sbatchid /home/acadgild/project/scripts/dataformatting.pig
echo "Running hive script for formatted data load..." >> $LOGPILE
hive -hiveconf batchid-Sbatchid -f /home/acadgild/project/scripts/formatted_hive_load.hgl
```

We are running two scripts to format the data. They are:

- 1. Dataformatting.pig
- 2. Formatted_hive_load.hql

Pig script to parse the data from coming from web_data.xml to csv format and partition both web and mob data based on based on batch ID's

Dataformatting.pig

```
REGISTIR /home/acadgild/project/lib/piggybank.jar/

DEFINE XFath org.apache.pig.piggybank.evaluation.xml.XFath()/

A = LOAD '/user/acadgild/project/batch5(batchid)/web/' using org.apache.pig.piggybank.storage.XMLLoader('record') as [x:chararray]/

B = FOREACH A GEMERATE TRIM(XFath(x, 'record/user_id')) AS user_id,
    TRIM(XFath(x, 'record/song_id')) AS song_id,
    TRIM(XFath(x, 'record/sories_id')) AS srist_id,
    TOUNLXTIME(FODate(TRIM(XFath(x, 'record/timestamp')),'yyyy-MN-dd HH:mm:ss')) AS timestamp,
    TOUNLXTIME(FODate(TRIM(XFath(x, 'record/end_ts')),'yyyy-MN-dd HH:mm:ss')) AS start_ts,
    TOUNLXTIME(FODate(TRIM(XFath(x, 'record/end_ts')), 'yyyy-MN-dd HH:mm:ss')) AS end_ts,
    TRIM(XFath(x, 'record/song_end_type)) AS station_id,|
    TRIM(XFath(x, 'record/song_end_type')) AS song_end_type,
    TRIM(XFath(x, 'record/dise')) AS like,
    TRIM(XFath(x, 'record/dise')) AS dislike;

STORE B INIO '/user/acadgild/project/batchs(batchid)/formattedweb/' USING FigStorage(',');
```

formatted hive load.hql

Music Data Analysis using Hadoop

```
set hive.support.sql11.reserved.keywords=false;
USE project;
CREATE TABLE IF NOT EXISTS formatted input
user_id STRING,
song id STRING,
artist id STRING,
timestp 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 DATA INPATH '/user/acadgild/project/batch${hiveconf:batchid}/formattedweb/'
INTO TABLE formatted input PARTITION (batchid=${hiveconf:batchid});
LOAD DATA INPATH '/user/acadgild/project/batch${hiveconf:batchid}/mob/'
INTO TABLE formatted input PARTITION (batchid=${hiveconf:batchid});
```

In the below screenshot we can see the data both the scripts in action, first pig script will parse the data and then hive script will load the data into hive terminal successfully. Pig script successful completion,

```
[acadgild@localhost ~]$ sh /home/acadgild/project/scripts/dataformatting.sh
18/09/09 02:15:09 WARN util.NativeCodeLoader: Unable to load native-hadoop
library for your platform... using builtin-java classes where applicable
rm: `/user/acadgild/project/batch2/web/': No such file or directory
18/09/09 02:15:16 WARN util.NativeCodeLoader: Unable to load native-hadoop
library for your platform... using builtin-java classes where applicable
rm: `/user/acadgild/project/batch2/formattedweb/': No such file or director
18/09/09 02:15:20 WARN util.NativeCodeLoader: Unable to load native-hadoop
library for your platform... using builtin-java classes where applicable
rm: `/user/acadgild/project/batch2/mob/': No such file or directory
18/09/09 02:15:24 WARN util.NativeCodeLoader: Unable to load native-hadoop
library for your platform... using builtin-java classes where applicable
18/09/09 02:15:28 WARN util.NativeCodeLoader: Unable to load native-hadoop
library for your platform... using builtin-java classes where applicable
18/09/09 02:15:34 WARN util.NativeCodeLoader: Unable to load native-hadoop
library for your platform... using builtin-java classes where applicable
18/09/09 02:16:21 WARN util.NativeCodeLoader: Unable to load native-hadoop
library for your platform... using builtin-java classes where applicable
18/09/09 02:16:31 INFO pig.ExecTypeProvider: Trying ExecType : LOCAL
18/09/09 02:16:31 INFO pig.ExecTypeProvider: Trying ExecType : MAPREDUCE
```

Music Data Analysis using Hadoop

```
HadoopVersion
                PigVersion
                                UserId StartedAt
                                                         FinishedAt
                                                                         Fea
tures
2.6.5
       0.16.0
                acadgild
                                2018-09-09 02:16:46
                                                        2018-09-09 02:20:37
UNKNOWN
Success!
Job Stats (time in seconds):
JobId
      Maps
               Reduces MaxMapTime
                                        MinMapTime
                                                        AvgMapTime
                                                                         Med
ianMapTime
               MaxReduceTime
                                MinReduceTime
                                                AvgReduceTime
                                                                MedianReduc
etime
       Alias
               Feature Outputs
job 1536430769011 0001 1
                                        68
                                                 68
                                                                 68
                                                                         0 0
                                                         68
                                        /user/acadgild/project/batch2/forma
                A,B
                        MAP ONLY
ttedweb,
Input(s):
Successfully read 20 records (7105 bytes) from: "/user/acadgild/project/bat
ch2/web"
Output(s):
Successfully stored 20 records (1235 bytes) in: "/user/acadgild/project/bat
ch2/formattedweb"
```

In the above screenshot we can see the **dataformatting.pig** along with the **formatted_hive_load.hql** executed successfully.

The output of dataformatting.sh script in HDFS folders:

```
[acadgild@localhost ~]$ hadoop fs -ls /user/acadgild/project
18/09/10 22:57:15 WARN util.NativeCodeLoader: Unable to load native-hadoop libra
ry for your platform... using builtin-java classes where applicable
Found 1 items
drwxr-xr-x - acadgild supergroup 0 2018-09-10 22:46 /user/acadgild/pr
oject/batch2
You have new mail in /var/spool/mail/acadgild
```

```
[acadgild@localhost ~]$ hadoop fs -ls /user/acadgild/project/batch2
18/09/10 22:58:46 WARN util.NativeCodeLoader: Unable to load native-hadoop libra
ry for your platform... using builtin-java classes where applicable
Found 3 items
                                           0 2018-09-10 22:46 /user/acadgild/pr
drwxr-xr-x - acadgild supergroup
oject/batch2/formattedweb
drwxr-xr-x - acadgild supergroup
                                           0 2018-09-10 22:45 /user/acadgild/pr
oject/batch2/mob
                                            0 2018-09-10 22:45 /user/acadgild/pr
drwxr-xr-x - acadgild supergroup
oject/batch2/web
You have new mail in /var/spool/mail/acadgild
[acadgild@localhost ~]$ hadoop fs -ls /user/acadgild/project/batch2/formattedweb
18/09/10 22:59:11 WARN util.NativeCodeLoader: Unable to load native-hadoop libra
ry for your platform... using builtin-java classes where applicable
Found 2 items
-rw-r--r-- 1 acadgild supergroup
                                            0 2018-09-10 22:46 /user/acadgild/pr
oject/batch2/formattedweb/ SUCCESS
-rw-r--r-- l acadgild supergroup
                                        1235 2018-09-10 22:46 /user/acadgild/pr
oject/batch2/formattedweb/part-m-00000
```

Music Data Analysis using Hadoop

The output of the **formattedweb** data obtained from the **Dataformatting.pig** is shown in the below screen shot,

Command,

hadoop fs -cat /user/acadgild/project/batch1/formattedweb/*

```
[acadgild@localhost ~]$ hadoop fs -cat /user/acadgild/project/batch2/formattedwe
18/09/10 23:01:49 WARN util.NativeCodeLoader: Unable to load native-hadoop libra
ry for your platform... using builtin-java classes where applicable
Ullo, S206, A302, 1462863262, 1462863262, 1494297562, E, ST410, 0, 1, 1
U106,S207,A301,1494297562,1494297562,1465490556,AP,ST409,3,0,1
U100,S210,A303,1462863262,1468094889,1465490556,AP,ST405,3,1,0
U118,S203,A300,1465490556,1462863262,1468094889,E,ST411,0,1,1
U119,S205,A305,1462863262,1494297562,1462863262,E,ST403,3,1,0
S209, A303, 1462863262, 1494297562, 1462863262, A, ST401, 2, 0, 1
J107,S204,A302,1462863262,1465490556,1494297562,AP,ST404,3,1,0
U104,S207,A305,1462863262,1465490556,1465490556,AU,ST407,0,0,0
Ull4,S209,A304,1462863262,1465490556,1462863262,,ST401,0,1,0
U100,S201,,1465490556,1462863262,1462863262,E,ST413,3,0,1
U101,S202,A300,1462863262,1462863262,1494297562,A,ST411,0,1,0
U116,S207,A305,1468094889,1468094889,1494297562,A,ST411,2,0,1
U111,S205,A302,1465490556,1494297562,1468094889,U,ST402,2,0,0
U119,S210,A303,1494297562,1494297562,1468094889,U,ST401,0,1,0
Ullo,S206,A305,1462863262,1465490556,1462863262,E,ST404,0,0,0
U119,S205,A305,1468094889,1462863262,1465490556,A,ST403,1,0,0
U119,S209,A303,1494297562,1468094889,1462863262,U,ST404,2,1,1
U103,S208,A303,1462863262,1465490556,1468094889,A,ST403,3,1,0
U116,S208,A305,1465490556,1494297562,1465490556,E,ST406,3,0,1
U111,S200,A303,1462863262,1494297562,1465490556,E,ST402,1,1,0
```

```
2018-09-11 02:52:11,548 [main] INFO org.apache.hadoop.yarn.client.RMProxy - Connecting to ResourceManager at localhost/127.0.0.1:8032
2018-09-11 02:52:11,560 [main] INFO org.apache.hadoop.mapred.ClientServiceDelegate - Application state is completed. FinalApplicationStatus=SUCCEEDED. Redirecting to
2018-09-11 02:52:11,659 [main] INFO org.apache.hadoop.yarn.client.RMProxy - Connecting to ResourceManager at localhost/127.0.0.1:8032
2018-09-11 02:52:11,676 [main] INFO org.apache.hadoop.mapred.ClientServiceDelegate - Application state is completed. FinalApplicationStatus=SUCCEEDED. Redirecting to
2018-09-11 02:52:11,767 [main] INFO org.apache.hadoop.yarn.client.RMProxy - Connecting to ResourceManager at localhost/127.0.0.1:8032
2018-09-11 02:52:11,778 [main] INFO org.apache.hadoop.mapred.ClientServiceDelegate - Application state is completed. FinalApplicationStatus=SUCCEEDED. Redirecting to
018-09-11 02:52:11,880 [main] INFO org.apache.pig.backend.hadoop.executionengine.mapReduceLayer.MapReduceLauncher - Success!
2018-09-11 02:52:12,029 [main] INFO org.apache.pig.Main - Pig script completed in 2 minutes, 2 seconds and 863 milliseconds (122863 ms)
SLF4J: Class path contains multiple SLF4J bindings.
SEF4J: Found binding in [jar:file:/home/acadgild/install/hive/apache-hive-2.3.2-bin/lib/log4j-slf4j-impl-2.6.2.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-log4jl2-1.7.5.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.apache.logging.slf4j.Log4jLoggerFactory]
ogging initialized using configuration in jar:file:/home/acadgild/install/hive/apache-hive-2.3.2-bin/lib/hive-common-2.3.2.jar!/hive-log4j2.properties Async: true
Time taken: 16.633 seconds
Time taken: 5.716 seconds
Time taken: 1.169 seconds
oading data to table project.formatted input partition (batchid=2)
Time taken: 4.237 seconds
oading data to table project.formatted_input partition (batchid=2)
Time taken: 2.166 seconds
 u have new mail in /var/spool/mail/acadgild
```

Music Data Analysis using Hadoop

```
show tables
2018-09-11 02:33:55,808 main ERROR Unable to move file /tmp/acadgild/hive.lo
18-09-10 to /tmp/acadgild/hive.log.2018-09-10: java.nio.file.NoSuchFileExcep
 / tmp/acadgild/hive.log.2018-09-10 \ -> \ / tmp/acadgild/hive.log.2018-09-10
2018-09-11 02:33:55,813 main ERROR Unable to copy file /tmp/acadgild/hive.log
18-09-10 to /tmp/acadgild/hive.log.2018-09-10: java.nio.file.NoSuchFileExcep
 /tmp/acadgild/hive.log.2018-09-10
OK
formatted_input
song artist map
station geo map
subscribed users
users_artists
Time taken: 1.677 seconds, Fetched: 5 row(s)
hive> describe formatted input;
OK
user_id
                               string
song_id
                               string
artist id
                               string
timestamp_ts
                               string
start ts
                               string
end ts
                               string
geo cd
                               string
station_id
                               string
song_end_type
like_fs
                               int
                               int
dislike fs
                               int
batchid
                               int
# Partition Information
# col name
                               data type
                                                               comment
batchid
Time taken: 1.834 seconds, Fetched: 17 row(s)
           * from formatted input;
                                                1465230523
                                                1465230523
                                                1465130523
U109
             A302
                                                                     ST408
J102
                                                                     ST406
       5209
              A305
                     1465230523
                                                1465130523
                                                                     ST407
J106
                     1465230523
                                                1465130523
       S200
              A304
                                  1465230523
                                                                     ST410
       S205
U105
       S206
                    1465130523
                                  1465230523
                                                1475130523
                                                                     ST406
                     1465130523
                                  1465230523
       S202
             A302
                                                                     ST412
       5209
                                  1475130523
       5204
                                  1465230523
                                                1465230523
                                                              AΡ
                                                                     ST412
       S205
              A305
                     1465130523
                                                1475130523
                                                                     ST413
       5203
             A303
                                  1465230523
                                                1465130523
                                                                     ST409
                                                1465230523
                    1465130523
U120
       S209
             A301
                                                                     ST415
                                                1494297562
                                                                     ST410
                     1494297562
              A303
                     1462863262
                                  1468094889
                                                1465490556
                                                                     ST405
                     1465490556
                                                1468094889
       S203
             A300
                                  1462863262
                                  1494297562
              A305
                                                                     ST403
                                   1494297562
                                  1465490556
1465490556
U104
       S207
              A305
                     1462863262
                                                1465490556
                                                              AU
                                                                     ST407
       S209
              A304
                                                                     ST401
       S202
              A300
                                   1462863262
                                                1494297562
U116
                     1468094889
                                  1468094889
                                                              A
                                                                     ST411
       S205
                                                                     ST402
                                                1468094889
                                                                     ST401
                                                                     ST404
                     1468094889
                                  1462863262
                                                1465490556
                                                              A
                                                                     ST403
              A303
                     1494297562
                                                1462863262
       S209
                                  1468094889
                                                                     ST404
                                                1468094889
U116
                     1465490556
                                   1494297562
                    1462863262
                                  1494297562
                                                1465490556
                                                                     ST402
Time taken: 0.588 seconds, Fetched: 40 row(s)
```

Music Data Analysis using Hadoop

4.3 Stage - 3 - Data Enrichment & Filtering

In this stage, 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. data_enrichment.sh

```
#!/bin/bash
batchid=`cat /home/acadgild/project/logs/current-batch.txt`
LOGFILE=/home/acadgild/project/logs/log_batch_$batchid
VALIDDIR=/home/acadgild/project/processed dir/valid/batch $batchid
INVALIDDIR=/home/acadgild/project/processed_dir/invalid/batch_$batchid
echo "Running hive script for data enrichment and filtering..." >> $LOGFILE
hive -hiveconf batchid=Sbatchid -f /home/acadgild/project/scripts/data_enrichment.hql
if [ ! -d "$VALIDDIR" ]
then
mkdir -p "$VALIDDIR"
fi
if [ ! -d "$INVALIDDIR" ]
mkdir -p "$INVALIDDIR"
echo "Copying valid and invalid records in local file system..." >> $LOGFILE
hadoop fs -get /user/hive/warehouse/project.db/enriched data/batchid=$batchid/status=pass/* $VALIDDIR
hadoop fs -get /user/hive/warehouse/project.db/enriched_data/batchid=$batchid/status=fail/* $INVALIDDIR
```

Music Data Analysis using Hadoop

```
set hive.support.sql11.reserved.keywords=false;
SET hive.auto.convert.join=false;
SET hive.exec.dynamic.partition.mode=nonstrict;
USE project;
CREATE TABLE IF NOT EXISTS enriched data
user_id STRING,
song_id STRING,
artist id STRING,
timestamp_ts STRING,
start ts STRING,
end_ts STRING,
geo_cd STRING,
station id STRING,
song_end_type INT,
like_fs INT,
dislike fs INT
PARTITIONED BY
(batchid INT,
status STRING)
STORED AS ORC;
INSERT OVERWRITE TABLE enriched_data
PARTITION (batchid, status)
SELECT
i.user id,
i.song_id,
IF(i.artist_id is NULL OR i.artist_id='',sa.artist_id,i.artist_id) AS artist_id,
i.timestamp ts,
data_enrichment.hql
i.start ts,
i.end_ts,
IF(i.geo_cd is NULL OR i.geo_cd='',sg.geo_cd,i.geo_cd) AS geo_cd,
i.station_id,
IF (i.song end type IS NULL, 3, i.song end type) AS song end type,
IF (i.like fs IS NULL, 0, i.like fs) AS like fs,
IF (i.dislike fs IS NULL, 0, i.dislike fs) AS dislike fs,
i.batchid,
IF((i.like fs=1 AND i.dislike fs=1)
OR i.user_id IS NULL
OR i.song id IS NULL
OR i.timestamp ts IS NULL
OR i.start_ts IS NULL
OR i.end_ts IS NULL
OR i.user id="'
OR i.song_id=''
OR i.timestamp ts=''
OR i.start ts=''
OR i.end_ts=''
OR sg.geo_cd=''
OR sg.geo_cd IS NULL
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=2;
```

Music Data Analysis using Hadoop

```
| Acadajid@localhost scripts|s sh /Nome/acadajid/project/scripts/data_enrichment.sh stPH3: class path contains multiple SLP43 bindings.
SLP43: Found binding in [jar:file:/home/acadqild/install/hiw/apache-hive-2.3.2-bin/lib/log4j-slf4j-impl-2.6.2.jar!/org/slf4.
SLP43: Found binding in [jar:file:/home/acadqild/install/hadocy/hadocy-2.6.5/share/hadocy/common/lib/slf4j-log4jl2-1.7.5.jar
SLP43: See http://www.slf4j.org/codes.html#multiple bindings for an explanation.
SLP43: Actual binding is of type [org.apache.logging.slf4j.log4jloggerFactory]

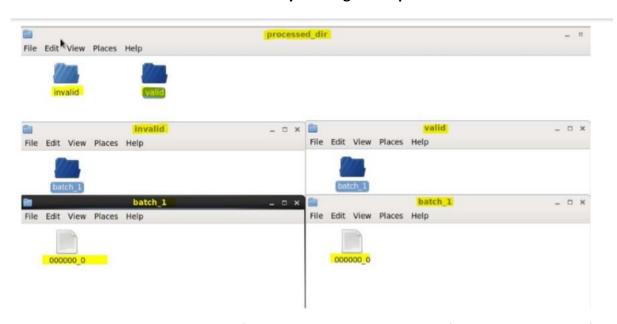
Logging initialized using configuration in jar:file:/home/acadqild/install/hive/apache-hive-2.3.2-bin/lib/hive-common-2.3.2.*

No Stats for projectParation goo map. Columns: statt is, song id, user_id, end_ts, dislike, station_id, ego.
No Stats for projectParation goo map. Columns: station_id, ego.
No Stats for projectParation goo map. Columns: station_id, ego.
No Stats for projectParation goo map. Columns: station_id, ego.
No Stats for projectParation goo map. Columns: station_id, ego.
No Stats for projectParation goo map. Columns: station_id, ego.
No Stats for projectParation goo map. Columns: station_id, ego.
No Stats for projectParation goo map. Columns: station_id, ego.
No Stats for projectParation goo map. Columns: station_id, ego.
No Stats for projectParation goo map. Columns: station_id, ego.
No Stats for projectParation goo map. Columns: station_id, ego.
No Stats for projectParation goo map. Columns: station_id, ego.
No Stats for projectParation goo.
No Stats for pr
```

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.

```
[acadgild@localhost ~]$ cd project/processed dir [acadgild@localhost processed_dir]$ ls -l invalid total 8 drwxrwxr-x. 2 acadgild acadgild 4096 Sep 16 22:54 batch_1 drwxrwxr-x. 2 acadgild acadgild 4096 Sep 17 00:40 batch_2 [acadgild@localhost processed_dir]$ ls -l valid total 8 drwxrwxr-x. 2 acadgild acadgild 4096 Sep 16 22:54 batch_1 drwxrwxr-x. 2 acadgild acadgild 4096 Sep 16 22:54 batch_1 drwxrwxr-x. 2 acadgild acadgild 4096 Sep 17 00:40 batch_2
```

Music Data Analysis using Hadoop



In the below screenshot we have data for enriched_data 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 enriched_data;

_										
hive>	select '	from en	riched_data;							
U101	5201	A305	1465130523	1475130523	1465130523	AP	ST405			fail
U118	3201	A305	1475130523	1485130523	1485130523	E	ST412			fail
U119	3204	A304	1462863262	1468094889	1462863262	A	57402			fail
0110	5204	A301	1462863262	1494297562	1494297562	AP	ST408			fail
U110	5204	A304	1468094889	1494297562	1494297562	E	ST406			fail
0110	\$205	A303	1465490556	1468094889	1468094889	n.	ST403			fail
1119	3205	A301	1468094889	1494297562	1468094889	AP	ST400			fail
J100	3207	A303	1462863262	1465490556	1494297562	A	ST415			fail
1108	3207	A301	1468094889	1465490556	1468094889	E	ST415			fail
J103	S208	A303	1494297562	1494297562	1494297562	AP	ST404			fail
	5209	A301	1475130523	1465130523	1485130523	U	ST404			fail
7113	S209	A300	1465130523	1485130523	1465130523		ST415			fail
1109	S210	NULL	1465130523	1475130523	1465130523	AP	ST410			fail
3104	5210	A305	1462863262	1494297562	1494297562	AU	ST401			fail
J113	5210	A304	1465130523	1485130523	1475130523	AP	ST401			fail
1109	5210	A300	1475130523	1475130523	1465230523	U	ST400			
3117	S200 S201	A300	1465130523	1475130523	1475130523	5	ST411	2		pass
1118	S201	A304	1495130523	1465130523	1465230523	E	ST407			pass
1100	S202	A304	1475130523	1465230523	1465230523		ST407			pass
7101	5202	A302	1465130523	1465230523	1475130523	A J	ST413			pass
1110	3202	A305	1465130523	1475130523	1485130523	AP	ST404			pass
1120		A305	1465230523	1485130523	1475130523	AU	ST404			pass
	5204	A305								pass
1106	5204		1494297562	1465490556 1475130523	1468094889 1465230523	AP	ST407			pass
7115	S205	A305	1495130523			AU	ST400			pass
1112	8205	A302	1462863262	1465490556	1465490556		ST406			pass
1103	3206	A305	1468094889	1462863262	1465490556		ST407			pass
1118	3206	A304	1465130523	1485130523	1465230523	E	ST402			pass
1108	S206	A303	1494297562	1462863262	1468094889	AP	ST405			pass
1110	s207	A300	1495130523	1485130523	1465130523	A	ST404			pass
11.07	S208	A303	1465130523	1475130523	1465130523	UA	ST400			pass
1117	S208	V303	1495130523	1485130523	1465130523	MU	ST411			pass
0108	S208	A305	1465130523	1465130523	1485130523		ST410			pass
1109	5208	A303	1494297562	1468094889	1465490556	AP	ST406			pass
1113	5208	A302	1465490556	1494297562	1494297562		ST405			pass
1100	S208	A300	1462863262	1465490556	1462863262	AP	ST405			pass
J120	5208	A304	1494297562	1462863262	1462863262		ST402			pass
J120	3209	A304	1494297562	1465490556	1462863262		ST402			pass
0104	5209	A300	1465490556	1494297562	1465490556		ST411			pass.
1115	3209	A305	1465490556	1465490556	1462863262		ST414			pass
U109	S209	A304	1465230523	1475130523	1485130523		ST402			pass

Music Data Analysis using Hadoop

4.4 Stage - 4 - Data Analysis

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

Before running the spark-submit command we have to zip –d command to remove the bad manifests in created spark project jar file to avoid the invalid Signature exception. We used two spark-submits for analysis.

- a. Spark_analysis for creating tables for each query/problem statement.
- b. Spark analysis 2 for displaying results for each query in terminal.

Data analysis.sh

```
data_analysis.sh  
#!/bin/bash
batchid=`cat /home/acadgild/project/logs/current-batch.txt`
LOGFILE=/home/acadgild/project/logs/log_batch_$batchid

echo "Running hive script for data analysis..." >> $LOGFILE
hive -hiveconf batchid=$batchid -f /home/acadgild/project/scripts/data_analysis.hql
sh /home/acadgild/project/scripts/data_export.sh
echo "Incrementing batchid..." >> $LOGFILE
batchid=`expr $batchid + 1`
echo -n $batchid > /home/acadgild/project/logs/current-batch.txt
```

Music Data Analysis using Hadoop

```
set hive.support.sql11.reserved.keywords=false;
SET hive.auto.convert.join=false;
USE project;
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;
INSERT OVERWRITE TABLE top 10 stations
PARTITION(batchid=${hiveconf:batchid})
SELECT
station id,
COUNT(DISTINCT song id) AS total distinct songs played,
COUNT(DISTINCT user id) AS distinct user count
FROM enriched data
WHERE status='pass'
AND batchid=${hiveconf:batchid}
AND like=1
GROUP BY station id
ORDER BY total distinct songs played DESC
LIMIT 10;
```

Table Creation in HIVE and Data analysis using HIVE,

```
Number of reduce tasks not specified. Estimated from input data size: 1
In order to change the average load for a reducer (in bytes):
set hive.exec.reducers.bytes.per.reducer=enumber>
In order to limit the maximum number of reducers:
set hive.exec.reducers.max=enumber>
In order to set a constant number of reducers:
set mapreduce.job.reduces=cumuber>
Starting Job = job.1516485910189 0029, Tracking URL = http://localhost:8088/proxy/application_1516485910189_0029/
Kill Command = /home/acadghid/hadoop.2.7.2/bin/hadoop job -kill job_1516485910189_0029
Hadoop job information for Stage-2 map = 100%, reduce = 0%, cumulative CPU 2.26 sec
2018-01-22 10:37:36,403 Stage-2 map = 100%, reduce = 0%, cumulative CPU 4.34 sec
HapRoduce Total cumulative CPU time: 4 seconds 340 msec
Ended Job = job_1516485910189_0029
Ended Job = job_1516485910189_0029
Ended Job = job_1516485910189_0029
In order to change the average load for a reducer (in bytes):
set hive.exec.reducers.bytes.per.reducer=enumber>
In order to set a constant number of reducers:
set hive.exec.reducers.max=enumber>
starting Job = job_1516485910189_0030, Tracking URL = http://localhost:8088/proxy/application_1516485910189_0030/
Kill Command = /home/acadghid/hadoop-2.7.2/bin/hadoop job -kill job_1516485910189_0030/
Kill Command = /home/acadghid/hadoop-2.7.2/bin/hadoop job -kill job_1516485910189_0030

Kill Command = /home/acadghid/hadoop-2.7.2/bin/hadoop-2.7.2/bin/hadoop-2.7.2/bin/hadoop-2.7.2/bin/hadoop-2.7.2/bin/hadoop-2.7.2/bin/hadoop-2.7.2/bin/hadoo
```

Music Data Analysis using Hadoop

```
nive> select * from top 10 royalty songs;
       22627294
      15254588
S209
      9900000 2
S204
      2604333 2
S202
       100000 2
Time taken: 0.342 seconds, Fetched: 8 row(s)
hive> select * from top_10_unsubscribed_users;
U117
U118
       20000000
U120
       12627294
U115
       12527294
        10000000
       2604333 2
        2604333 2
Time taken: 0.402 seconds, Fetched: 10 row(s)
```

Music Data Analysis using Hadoop

Query-

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

```
hive> select station_id from top_10_stations;

OK
ST407
ST414
ST411
ST402
ST406
ST405
Time taken: 0.269 seconds, Fetched: 6 row(s)
```

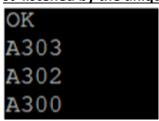
Query-

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 eit her not present in Subscribed users lookup table or has subscription end date earlier than the timestamp of the song played by him.



Query-

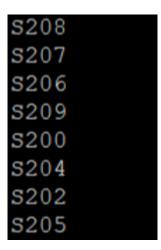
3: Determine top 10 connected artists. Connected artists are those whose songs are mo st listened by the unique users who follow them



Query-

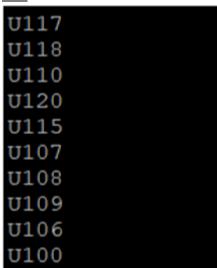
4: Determine top 10 songs who have generated the maximum revenue. Royalty applies to a song only if it was liked or was completed successfully or both

Music Data Analysis using Hadoop



Query-

5: Determine top 10 unsubscribed users who listened to the songs for the longest durat ion.



<u>4.5 Stage – 5 – Data Storage in MYSQL Using the bash file shown below, data_export.sh</u> we are going to export the data from the hive tables into mysql using Sqoop export.

Music Data Analysis using Hadoop

```
#!/bin/bash
#This script is not working.
#Either change table to text or use STRING as type of partitioned column
batchid=`cat /home/acadgild/project/logs/current-batch.txt
LOGFILE=/home/acadgild/project/logs/log_batch_$batchid
echo "Creating mysql tables if not present..." >> $LOGFILE
mysql < /home/acadgild/project/scripts/create_schema.sql</pre>
echo "Running sqoop job for data export..." >> $LOGFILE
sqoop export --connect jdbc:mysql://localhost/project --username root --password acadgild --table top_10_stations --export-
dir hdfs://localhost:9000/user/hive/warehouse/project.db/top_10_stations/batchid=$batchid --input-fields-terminated-by
m 1
sqoop export --connect jdbc:mysql://localhost/project --username root --password acadgild --table users_behaviour --export-
dir hdfs://localhost:9000/user/hive/warehouse/project.db/users_behaviour/batchid=$batchid --input-fields-terminated-by
sqoop export --connect jdbc:mysql://localhost/project --username root --password acadgild --table connected_artists --
export-dir hdfs://localhost:9000/user/hive/warehouse/project.db/connected_artists/batchid=$batchid --input-fields-
terminated-by ',
                  -m 1
sqoop export --connect jdbc:mysql://localhost/project --username root --password acadgild --table top_10_royalty_songs --
export-dir hdfs://localhost:9000/user/hive/warehouse/project.db/top_10_royalty_songs/batchid=$batchid --input-fields-terminated-by ',' -m 1
```

<u>create_schema.sql - Make sure that you logged in to MySql. The below schema will</u> create the database and tables in the MySQl.

Music Data Analysis using Hadoop

```
create schema.sql 🗶
CREATE DATABASE IF NOT EXISTS project;
USE project;
CREATE TABLE IF NOT EXISTS top 10 stations
station id VARCHAR(50),
total distinct songs played INT,
distinct user count INT
);
CREATE TABLE IF NOT EXISTS users behaviour
user type VARCHAR(50),
duration BIGINT
);
CREATE TABLE IF NOT EXISTS connected artists
artist id VARCHAR(50),
user count INT
);
CREATE TABLE IF NOT EXISTS top 10 royalty songs
song id VARCHAR(50),
duration BIGINT
CREATE TABLE IF NOT EXISTS top 10 unsubscribed users
```

Now we can see the data exported successfully into the MYSQL Database for all the 5 queries.

Music Data Analysis using Hadoop

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 the successive screen shots, The data base project had been exported from the hive and the below screen shot shows the data base presence, output from top_10_stations, connected_artists shown below,

```
mysql> use project;
Database changed
mysql> show tables;
 Tables_in_project
 connected_artists
 top_10_royalty_songs
 top_10_stations
 top_10_unsubscribed_users
users_behaviour
5 rows in set (0.00 sec)
mysql> Select * From top 10 stations;
 station_id | total_distinct_songs_played | distinct_user_count |
  ST407
                                                                   3
  ST414
 ST411
                                           1
                                                                   1
 ST402
                                                                   1
  ST406
                                           1
 ST405
                                                                   1
6 rows in set (0.00 sec)
mysgl> Select * From connected artists;
 artist_id | user_count
                        2
 A303
                        2
  A302
  A300
                        1
3 rows in set (0.00 sec)
```

top_10_royalty_songs,

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

Output from top 10 unsubscribed users and users behaviour

Music Data Analysis using Hadoop

```
mysql> Select * From top_10_unsubscribed_users;
  user_id | duration |
      . . . . . . + . . . . . . . . . . +
            | 20000000
| 20000000
| 20000000
| 12627294
| 12527294
| 100000000
| 5231627
  U117
  U118
  U110
  U120
  U115
  U107
  U108
  U109
               2604333
               2604333
  U106
  U100
                        Θ
10 rows in set (0.01 sec)
mysql> Select * From users_behaviour;
                    | duration
  user_type
  SUBSCRIBED | 93861594
UNSUBSCRIBED | 105594881
2 rows in set (0.00 sec)
```

Job Scheduling:

We can check logs to track the behavior of the operations we have done on the data and overcome failures in the pipeline and we can see the batchid incremented value in currentbatch.txt

```
[acadgild@localhost project]$ cd logs
[acadgild@localhost logs]$ ls -1
total 36
-rwxrwxr-x. 1 acadgild acadgild
                                 1 Sep 17 01:27 current-batch.txt
-rw-rw-r--. 1 acadgild acadgild 679 Jan 24 2018 derby.log
drwxrwxr-x. 3 acadgild acadgild 4096 Jan 24 2018 hdfs:
-rw-rw-r--. 1 acadgild acadgild 77 Jan 24
                                            2018 log batch 1
-rw-rw-r--. 1 acadgild acadgild 1265 Sep 17 01:27 log batch 2
-rw-rw-r--. 1 acadgild acadgild 77 Sep 17 01:27 log batch 2???
rw-rw-r--. 1 acadgild acadgild
                                34 Sep 19 09:34 log batch 3
rw-rw-r--. 1 acadgild acadgild 154 Sep 19 12:49 log batch 3???
drwxrwxr-x. 5 acadgild acadgild 4096 Jan 24 2018 metastore db
[acadgild@localhost logs]$ cat current-batch.txt
```

The log file captured all the data and steps we performed so far,

Music Data Analysis using Hadoop

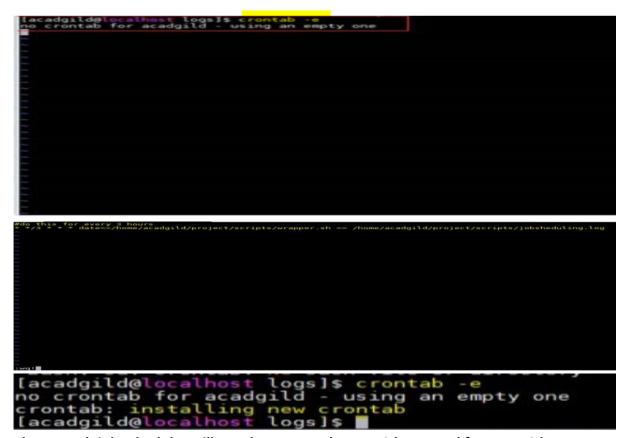
```
acadgild@localhost logs]$ cat log batch 2
Starting daemons
Creating LookUp Tables
Populating LookUp Tables
Starting daemons
Creating LookUp Tables
Populating LookUp Tables
Starting daemons
Starting daemons
Placing data files from local to HDFS...
Running pig script for data formatting ...
Running hive script for formatted data load...
Running hive script for data enrichment and filtering...
Copying valid and invalid records in local file system...
Deleting older valid and invalid records from local file system...
Placing data files from local to HDFS...
Running pig script for data formatting...
Running hive script for formatted data load ...
Running hive script for data enrichment and filtering...
Copying valid and invalid records in local file system...
Deleting older valid and invalid records from local file system...
Running hive script for data enrichment and filtering...
Copying valid and invalid records in local file system...
Deleting older valid and invalid records from local file system...
Running hive script for data enrichment and filtering...
Copying valid and invalid records in local file system...
Running hive script for data enrichment and filtering...
Copying valid and invalid records in local file system...
Running hive script for data analysis...
Incrementing batchid.
```

Wrapping all the scripts inside the single script file and scheduling this file to run at the periodic interval of every 3 hours. wrapper.sh

The wrapper.sh will be running for every 3 hours as per the job scheduling done below, as per the above order the wrapper.sh will run the scripts.

Creating Crontab to schedule the wrapper.sh script to run for every 3 hour interval.

Music Data Analysis using Hadoop



The crontab job scheduler will run the wrappr.sh every 3 hours and for every 3 hours we will get incremental batch ID's. Hence, as per the request this job scheduling has been not done.

```
Deleting older valid and invalid records from local file system...

Running hive script for data analysis...

Incrementing batchid...

[acadgild@localhost logs]$ cd

[acadgild@localhost ~]$ crontab -l

#do this for every 3 hours

* */3 * * * date>>/home/acadgild/project/scripts/wrapper.sh >> /home/acadgild/project/scripts/jobsheduling.log

[acadgild@localhost ~]$

[acadgild@localhost ~]$
```