INFSCI 2750 – Cloud Computing

Mini Project 2 – Working with Apache Spark

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Part 1 – Setting up Spark

Configuring Spark on top of Hadoop cluster. Hadoop cluster setup was done in previous project. Below steps are followed to configure Spark on top of Hadoop.

1. Pre-requisites for running spark programs in YARN are done in previous project. Java JDK version 8 –

```
student@CC-AM-12:~/spark$ java -version
openjdk version "1.8.0_191"
OpenJDK Runtime Environment (build 1.8.0_191-8u191-b12-2ubuntu0.18.04.1-b12)
OpenJDK 64-Bit Server VM (build 25.191-b12, mixed mode)
```

Setting environment variables – HADDOP_HOME, HADOOP_CONF_DIR, SPARK_HOME in ~/.bashrc file -

```
export HADOOP_HOME='/home/student/hadoop'
export HADOOP_CONF_DIR='/home/student/hadoop/etc/hadoop'
export SPARK_HOME='/home/student/spark'
```

Hadoop cluster started and running in all three machines -

```
$HADOOP_HOME/sbin/start-all.sh
$HADOOP_HOME/bin/mapred --daemon start historyserver
$SPARK_HOME/sbin/start-history-server.sh
```

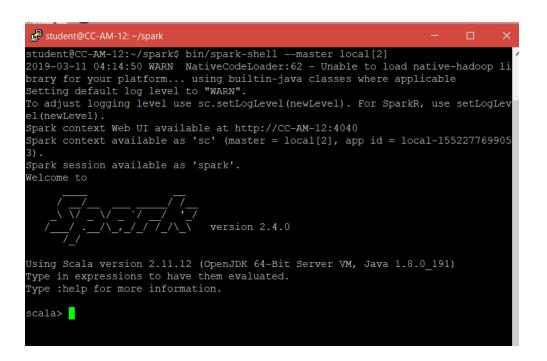
Spark version 11 – Download, unpack spark, install and rename

```
wget <a href="http://us.mirrors.quenda.co/apache/spark/spark-2.4.0/spark-2.4.0-bin-hadoop2.7.tgz">http://us.mirrors.quenda.co/apache/spark/spark-2.4.0-bin-hadoop2.7.tgz</a>
tar zxvf spark-2.4.0-bin-hadoop2.7.tgz
ln -s spark-2.4.0-bin-hadoop2.7 spark
```

```
Last login: Sun Mar 10 04:25:22 2019 from 24.3.136.195 student@CC-AM-12:~$ ls hadoop myimages spark spark-2.4.0-bin-hadoop2.7 student@CC-AM-12:~$
```

Install Scala and open spark shell in local mode

bin/spark-shell --master local[2]



Trying a scala program – To calculate pi value

To run spark shell with YARN as the scheduler

student@CC-AM-12:~/spark\$ bin/spark-shell --master yarn --deploy-mode client

Running pi program with YARN

bin/spark-submit --class org.apache.spark.examples.SparkPi --master yarn --deploy-mode cluster --driver-memory 512m --executor-memory 512m --executor-cores 1 --queue default examples/jars/spark-examples*.jar 10

```
client token: N/A
diagnostics: N/A
ApplicationMaster host: CC-AM-12
ApplicationMaster RPC port: 38305
queue: default
start time: 1552362632905
final status: SUCCEEDED
tracking URL: http://CC-AM-12:8088/proxy/application_1552362569461_0001/
user: student
```

Part 2 – Spark program for data analysis – To print listening count of each artist from the 'user_artists.dat' data

ArtistListeningCounts.java file has the source code for counting total listening count of each artists.

To run the above code as a jar file in Spark with YARN as the scheduler

bin/spark-submit --class "com.pitt.cloudcomputing.ArtistListeningCounts" --master yarn --deploy-mode cluster --driver-memory 1g --executor-memory 1g --executor-cores 1 --queue default jarfiles/Artist*.jar

```
client token: N/A
diagnostics: N/A
ApplicationMaster host: CC-AM-12
ApplicationMaster RPC port: 37901
queue: default
start time: 1553211785465
final status: SUCCEEDED
tracking URL: http://CC-AM-12:8088/proxy/application_1553211656864_0002/
user: student
2019-03-21 23:43:40 INFO ShutdownHookManager:54 - Shutdown hook called
2019-03-21 23:43:40 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-a2f96c25-62ec-4590-8ba3-a3537a34c65b
2019-03-21 23:43:40 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-a2f96c25-62ec-4590-8ba3-a3537a34c65b
2019-03-21 23:43:40 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-a1cac5bb-9a63-49a7-b82e-3e753913be27
student@CC-AM-12:~/spark$
```

To view the output and the logs

~/hadoop/bin/yarn logs -applicationId application_1553211656864_0002

```
2019-03-17 01:32:23 INFO CodeGenerator:54 - Code generated in 22.818632 ms
       72|1301308|
      89|1291387|
      292|1058405|
      288| 905423|
      701| 688529|
      227| 662116|
      300| 532545|
333| 525844|
      679| 506453|
      295| 499318|
      511| 493024|
      461| 489065|
486| 485532|
      163| 466104|
      154| 385306|
      466| 384405|
      792| 350035|
       51| 348919|
       65| 330757|
      475| 321011|
 nly showing top 30 rows
```

Part 3 – Spark program to analyze web log – To answer questions from the log data set

(a) Log-Analysis-1.java file has the source code for counting and printing the number of hits for the website element /assets/img/loading.gif.

To run the above code as a jar file in Spark with YARN as the scheduler

bin/spark-submit --class "com.pitt.cloudcomputing.KeyCountEvaluator" --master yarn --deploy-mode cluster --driver-memory 1g --executor-memory 1g --executor-cores 1 --queue default jarfiles/Log-Analysis-1*.jar

```
client token: N/A
diagnostics: N/A
ApplicationMaster host: CC-AM-12
ApplicationMaster RPC port: 34385
queue: default
start time: 1553212457730
final status: SUCCEEDED
tracking URL: http://CC-AM-12:8088/proxy/application_1553211656864_0003/
user: student
2019-03-21 23:54:39 INFO ShutdownHookManager:54 - Shutdown hook called
2019-03-21 23:54:39 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-fc2d8c2f-882d-4632-bfd3-f6ae816d925b
2019-03-21 23:54:39 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-022a252c-c152-4937-8d9a-0c936695c40f
student@CC-AM-12:~/spark$
```

The log file can be viewed here

~/hadoop/bin/yarn logs -applicationId application_1553211656864_0003

The screenshot below gives the result of the program and the hits for the website element loading.gif

Answer: The element /assets/img/loading.gif has 294 hits

(b) Log-Analysis-2.java file has the source code for counting and printing the number of hits for the website element /assets/js/lightbox.js.

To run the above code as a jar file in Spark with YARN as the scheduler

bin/spark-submit --class "com.pitt.cloudcomputing.KeyCountEvaluator" --master yarn --deploy-mode cluster --driver-memory 1g --executor-memory 1g --executor-cores 1 --queue default jarfiles/Log-Analysis-2*.jar

```
client token: N/A
diagnostics: N/A
ApplicationMaster host: CC-AM-12
ApplicationMaster RPC port: 45521
queue: default
start time: 1553212755501
final status: SUCCEEDED
tracking URL: http://CC-AM-12:8088/proxy/application_1553211656864_0004/
user: student
2019-03-21 23:59:42 INFO ShutdownHookManager:54 - Shutdown hook called
2019-03-21 23:59:42 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-3db061cd-8d27-49ec-92f1-deld2090346c
2019-03-21 23:59:42 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-d84402ee-4650-46f2-bba9-bc2ebe5f59f8
student@CC-AM-12:-/spark$
```

The log file can be viewed here

~/hadoop/bin/yarn logs -applicationId application_1553211656864_0005

The screenshot below gives the result of the program and the hits for the website element lightbox.js

Answer: The element /assets/js/lightbox.js has 297 hits

(c) Log-Analysis-3.java file has the source code for printing the website path that has the most hits (count the max URL) and the number of hits for that path.

To run the above code as a jar file in Spark with YARN as the scheduler

bin/spark-submit --class "com.pitt.cloudcomputing.MaxUrlCountEvaluator" -- master yarn --deploy-mode cluster --driver-memory 1g --executor-cores 1 --queue default jarfiles/Log-Analysis-3*.jar

```
client token: N/A
diagnostics: N/A
ApplicationMaster host: CC-AM-12
ApplicationMaster RPC port: 42445
queue: default
start time: 1553213061672
final status: SUCCEEDED
tracking URL: http://CC-AM-12:8088/proxy/application_1553211656864_0006/
user: student
2019-03-22 00:04:44 INFO ShutdownHookManager:54 - Shutdown hook called
2019-03-22 00:04:44 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-0f397f27-5bc0-4270-8de4-8af25a65f59d
2019-03-22 00:04:44 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-3ed80b3e-4c90-4b0c-a326-c4491bf70ff5
student@CC-AM-12:~/spark$
```

The log file can be viewed here

~/hadoop/bin/yarn logs -applicationId application 1553211656864 0006

The screenshot below gives the result of the program and the max hit URL and the count of hits.

```
assets/css/combined.css
************OUTPUT END**********
019-03-22 00:04:44 INFO AbstractConnector:318 - Stopped Spark@59309208{HTTP/1.1,[http/1.1]}{0.0.0.0:0}
2019-03-22 00:04:44 INFO SparkUI:54 - Stopped Spark web UI at http://cc-AM-12:39095
019-03-22 00:04:44 INFO YarnAllocator:54 - Driver requested a total number of 0 executor(s).
2019-03-22 00:04:44 INFO YarnClusterSchedulerBackend:54 - Shutting down all executors
019-03-22 00:04:44 INFO YarnSchedulerBackend$YarnDriverEndpoint:54 - Asking each executor to shut down
019-03-22 00:04:44 INFO SchedulerExtensionServices:54 - Stopping SchedulerExtensionServices
(serviceOption=None,
services=List(),
started=false)
019-03-22 00:04:44 INFO MapOutputTrackerMasterEndpoint:54 - MapOutputTrackerMasterEndpoint stopped!
019-03-22 00:04:44 INFO MemoryStore:54 - MemoryStore cleared
019-03-22 00:04:44 INFO BlockManager:54 - BlockManager stopped
2019-03-22 00:04:44 INFO BlockManagerMaster:54 - BlockManagerMaster stopped
2019-03-22 00:04:44 INFO OutputCommitCoordinator$OutputCommitCoordinatorEndpoint:54 - OutputCommitCoordinator
2019-03-22 00:04:44 INFO SparkContext:54 - Successfully stopped SparkContext
019-03-22 00:04:44 INFO ApplicationMaster:54 - Unregistering ApplicationMaster with SUCCEEDED
019-03-22 00:04:44 INFO AMRMClientImpl:382 - Waiting for application to be successfully unregistered.
2019-03-22 00:04:44 INFO ApplicationMaster:54 - Deleting staging directory hdfs://CC-AM-12:9000/user/student
019-03-22 00:04:44 INFO ShutdownHookManager:54 - Deleting directory /tmp/hadoop-student/nm-local-dir/userca
2c-b284-7ee6660757a8
End of LogType:stdout
student@CC-AM-12:~/spark$
```

Answer: The website path with the max hits is /assets/css/combined.css and the count of the hits is 117348

(d) Log-Analysis-4.java file has the source code for finding the IP address with maximum accesses to the website and the number of accesses.

To run the above code as a jar file in Spark with YARN as the scheduler

bin/spark-submit --class "com.pitt.cloudcomputing.MaxIPCountEvaluator" -- master yarn --deploy-mode cluster --driver-memory 1g --executor-cores 1 --queue default jarfiles/Log-Analysis-4*.jar

```
client token: N/A
diagnostics: N/A
ApplicationMaster host: CC-AM-12
ApplicationMaster RPC port: 46421
queue: default
start time: 1553213209914
final status: SUCCEEDED
tracking URL: http://CC-AM-12:8088/proxy/application_1553211656864_0007/
user: student
2019-03-22 00:07:23 INFO ShutdownHookManager:54 - Shutdown hook called
2019-03-22 00:07:23 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-89c955da-294c-440e-bb30-f190f9e98117
2019-03-22 00:07:23 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-89c955da-294c-440e-bb30-f190f9e98117
2019-03-22 00:07:23 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-1647aba1-816d-4065-9720-d36edf06aa72
student@CC-AM-12:~/spark$
```

The log file can be viewed here

~/hadoop/bin/yarn logs -applicationId application_1553211656864_0007

The screenshot below gives the result of the program and the IP with maximum accesses and the count of the accesses to the website from that IP

Answer: The IP with maximum accesses to the website is 10.216.113.172 and the number of accesses is 158614.

Part 3 – second task – to analyze and report the performance numbers of the program with and without cached RDD

With cached RDD: Log-Analysis-With-Cache.java file has the source code for printing the hit count for two keys (two website elements) with cached RDD. The file is loaded once and all the keys are counted and transferred to the RDD.

To run the above code as a jar file in Spark with YARN as the scheduler

bin/spark-submit --class "com.pitt.cloudcomputing.KeyCountEvaluatorWithCache" -- master yarn --deploy-mode cluster --driver-memory 1g --executor-memory 1g -- executor-cores 1 --queue default jarfiles/Log-Analysis-With*.jar

```
client token: N/A
diagnostics: N/A
ApplicationMaster host: CC-AM-12
ApplicationMaster RPC port: 35727
queue: default
start time: 1553213537419
final status: SUCCEEDED
tracking URL: http://CC-AM-12:8088/proxy/application_1553211656864_0008/
user: student
2019-03-22 00:12:47 INFO ShutdownHookManager:54 - Shutdown hook called
2019-03-22 00:12:47 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-519088fd-7a55-411b-b837-784ae4c07447
2019-03-22 00:12:47 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-44e930b4-0ce8-4b09-a94e-7ad9325338da
student@CC-AM-12:~/spark$
```

The log file can be viewed here

~/hadoop/bin/yarn logs -applicationId application_1553211656864_0008

The screenshot below gives the result of the program and the total run time of the program to count the number of hits for both the keys.

Answer: The total running time with cached RDD is 29.577s

Without cached RDD: Log-Analysis-No-Cache.java file has the source code for printing the hit count for two keys (two website elements) without cached RDD. For each key, the file is loaded once and the hits are counted and transferred to the RDD. In our example, the file is loaded twice.

To run the above code as a jar file in Spark with YARN as the scheduler

bin/spark-submit --class "com.pitt.cloudcomputing.KeyCountEvaluatorWithoutCache" --master yarn --deploy-mode cluster --driver-memory 1g --executor-memory 1g --executor-cores 1 --queue default jarfiles/Log-Analysis-No*.jar

```
client token: N/A
diagnostics: N/A
ApplicationMaster host: CC-AM-12
ApplicationMaster RPC port: 42009
queue: default
start time: 1553214080395
final status: SUCCEEDED
tracking URL: http://CC-AM-12:8088/proxy/application_1553211656864_0009/
user: student
2019-03-22 00:21:53 INFO ShutdownHookManager:54 - Shutdown hook called
2019-03-22 00:21:53 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-02156cfe-548c-4758-b3fd-08fb28e9f6b3
2019-03-22 00:21:53 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-02156cfe-548c-4758-b3fd-08fb28e9f6b3
2019-03-22 00:21:53 INFO ShutdownHookManager:54 - Deleting directory /tmp/spark-ad42e127-0775-4238-8dde-2d7746b60d4e
student@CC-AM-12:~/sparks
```

The log file can be viewed here

~/hadoop/bin/yarn logs -applicationId application_1553211656864_0009

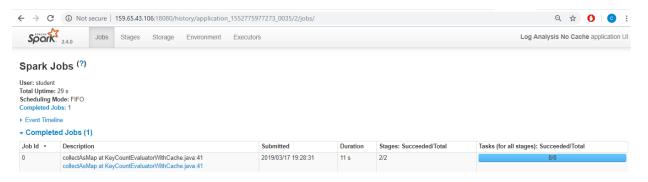
The screenshot below gives the result of the program and the total run time of the program to count the number of hits for both the keys.

```
2019-03-17 19:19:08 INFO DAGScheduler:S4 - ResultStage 3 (collectAsMap at ReyCountEvaluatorWithoutCache.java:S0) finished in 0.596 s
2019-03-17 19:19:08 INFO DAGScheduler:S4 - Job 1 finished: collectAsMap at ReyCountEvaluatorWithoutCache.java:S0, took 6.502181 s
2019-03-17 19:19:08 INFO DAGSCheduler:S4 - Job 1 finished: collectAsMap at ReyCountEvaluatorWithoutCache.java:S0, took 6.502181 s
2019-03-17 19:19:08 INFO DAGSCHAPPORTOR COLLEGE STATE STA
```

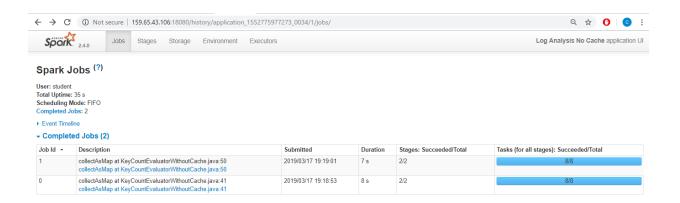
Answer: The total running time without cached RDD is 35.806s

The program with cached RDD was able to run in 29.577s while the one without cached RDD takes 35.806s. If we consider only the total run time, with cached RDD we get a speedup of 1.2X for the whole program. The performance measurement was only done with one run and multiple runs will give us a more robust speedup number.

The screenshot below gives the output of the jobs summary web portal and the time for the sub-tasks of the program. With cached RDD, even though the total run time is 29s, the time for the text processing is 11s with cached file and output the result for the desired keys.



The screenshot below gives the output of the jobs summary web portal and the time for the sub-tasks of the program. Without cached RDD, even though the total run time is 35s, the time for the text processing is 7s and 8s for the two separate sub tasks.



The performance results show the importance of the use of cached RDD in caching the results of the intermediate tasks and use when for repetitive tasks, thereby speeding up the overall program.