# **CS 553 Cloud Computing Programming Assignment 2**

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# **Overview:**

The objective of this assignment is to perform Terasort operation using C, Hadoop and Spark. The main goal behind this is to compare the results obtained from each of this methods and build a conclusion out of it.

# **Runtime Environment Settings**

Amazon Web Services EC2

AMI - Ubuntu Server 16.04 LTS (HVM), SSD Volume Type- ami-45ead225

Hadoop 2.6.5

Spark 2.2.0

Java 1.8.0 151

Shared-Memory:

EC2 instance type: i3.large

Hadoop:

EC2 instance type: (master node)i3.large (slave node)i3.large

Spark:

EC2 instance type: (headnode)i3.large (worker node)i3.large

MPI: Open MPI 3.0.4, starcluster 1

# **Installation Steps of Virtual Cluster**

- 1. 1 node
- 1) log in to the AWS, choose EC2
- 2) launch instance
- 3) choose Ubuntu Server 14.04 LTS (HVM), SSD Volume Type ami-3d50120d
- 4) choose i3.large
- 5) choose spot instance
- 6) create a new security group, with rules: SSH, All TCP(Anywhere), All ICMP(Anywhere)
- 2. 1 node
- 1) choose i3.4xlarge
- 2) choose spot instance
- 3) create an image of instance established in 1st step.
- 4) use the same configuration
- 3. 8 nodes
- 1) finish the step of 1 node
- 2) create an image of instance established in 1 node
- 3) create another 7 nodes use the AMI just created
- 4) use the same configuration

# → Create an instance on Amazon AWS:

# 1. Choose Amazon Machine Image:



# 2. Choose Instance type

Step 2: Choose an Instance Type												
	Storage optimized	h1.2xlarge	8	32	1 x 2000	Yes	Up to 10 Gigabit	Yes *				
	Storage optimized	h1.4xlarge	16	64	2 x 2000	Yes	Up to 10 Gigabit	Yes				
	Storage optimized	h1.8xlarge	32	128	4 x 2000	Yes	10 Gigabit	Yes				
	Storage optimized	h1.16xlarge	64	256	8 x 2000	Yes	25 Gigabit	Yes				
	Storage optimized	i3.large	2	15.25	1 x 475 (SSD)	Yes	Up to 10 Gigabit	Yes				
	Storage optimized	i3.xlarge	4	30.5	1 x 950 (SSD)	Yes	Up to 10 Gigabit	Yes				
	Storage optimized	i3.2xlarge	8	61	1 x 1900 (SSD)	Yes	Up to 10 Gigabit	Yes				
	Storage optimized	i3.4xlarge	16	122	2 x 1900 (SSD)	Yes	Up to 10 Gigabit	Yes				
	Storage optimized	i3.8xlarge	32	244	4 x 1900 (SSD)	Yes	10 Gigabit	Yes				
	Storage optimized	i3.16xlarge	64	488	8 x 1900 (SSD)	Yes	25 Gigabit	Yes				
					Cancel	Previous Review and	.aunch Next: Configure Instance Detail					

#### 3. Edit Storage

#### Step 4: Add Storage

Your instance will be launched with the following storage device settings. You can attach additional EBS volumes and instance store volumes to your instance, or edit the settings of the root volume. You can also attach additional EBS volumes after launching an instance, but not instance store volumes. Learn more about storage options in Amazon EC2.



We have changed the storage to 1862GB The screenshot is just an example

#### Instances created are:



# i3.large



# i3.4xlarge



# Connect to instance using ssh:

#### I would like to connect with

- A standalone SSH client
- A Java SSH Client directly from my browser (Java required)

#### To access your instance:

- 1. Open an SSH client. (find out how to connect using PuTTY)
- Locate your private key file (Demo1.pem). The wizard automatically detects the key you used to launch the instance.
- 3. Your key must not be publicly viewable for SSH to work. Use this command if needed:

```
chmod 400 Demo1.pem
```

4. Connect to your instance using its Public DNS:

```
ec2-52-15-63-135.us-east-2.compute.amazonaws.com
```

#### Example:

ssh -i "Demo1.pem" ubuntu@ec2-52-15-63-135.us-east-2.compute.amazonaws.com

Please note that in most cases the username above will be correct, however please ensure that you read your AMI usage instructions to ensure that the AMI owner has not changed the default AMI username.

If you need any assistance connecting to your instance, please see our connection documentation.

# ssh -i "Keyname.pem" public DNS

#### For eg:

ssh -i "Demo1.pem" ubuntu@ec2-18-217-183-207.us-east-2.compute.amazonaws.com

#### Transfer file from local system to AWS instance:

scp -i Keyname.pem filename.ext <a href="mailto:publicDNS:~/">publicDNS:~/</a>

#### For eg:

scp -i Demo1.pem SparkSort.py <u>ubuntu@ec2-18-217-183-207.us-east-2.compute.amazonaws.com:~/</u>

```
Swapnil@DESKTOP-CAH45E8 MINGW64 /c/Studies/Cloud Computing/Assignment 2
$ ssh -i "Demo1.pem" ubuntu@ec2-52-15-63-135.us-east-2.compute.amazonaws.com
Welcome to Ubuntu 16.04.3 LTS (GNU/Linux 4.4.0-1041-aws x86_64)

* Documentation: https://help.ubuntu.com

* Management: https://landscape.canonical.com

* Support: https://ubuntu.com/advantage

Get cloud support with Ubuntu Advantage Cloud Guest:
    http://www.ubuntu.com/business/services/cloud

13 packages can be updated.
8 updates are security updates.

Last login: Sun Dec 3 22:11:33 2017 from 208.59.146.145
ubuntu@ip-172-31-14-235:~$ |
```

#### **Shared Memory Terasort:**

We are making use of external sort algorithm for shared memory terasort.

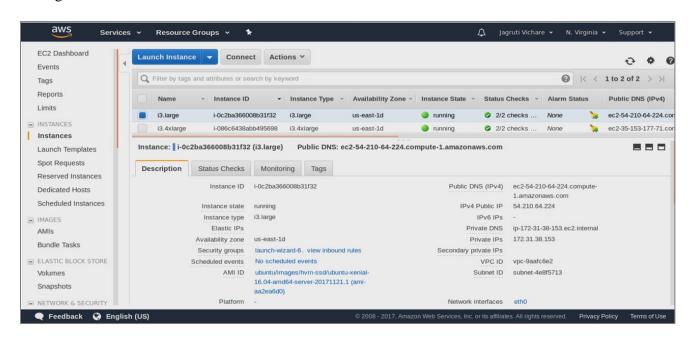
We have programmed the code using C language.

We have generated data using Gensort

128Gb of data is being used as an input in this part

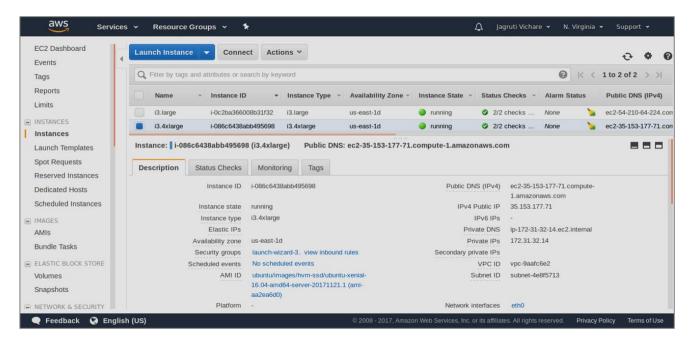
This is performed on virtual cluster1 of i3.large and i3.4xlarge configurations.

#### I3.large



#### CS553

#### i3.4xlarge



# **Performance**

#### Externsl sort with 128GB dataset

# Input File Size

Here an input file of 128 GB is given. The shared memory terasort is supposed to take this dataset as an input to perform operations on it.

#### 128 GB sort Result

```
ubuntu@ip-172-31-38-153:~

ubuntu@ip-172-31-38-153:~$ gcc externalSort.c -o sort -lpthread ubuntu@ip-172-31-38-153:~$ ./sort -t 2 -s 1

Final sorted records are in the file outputfile_128GB.dat

Total time taken to sort 128GB data is 10280 seconds ubuntu@ip-172-31-38-153:~$ 

### Add to the content of the
```

The screenshot above displays the sorting result of 128 GB of dataset As we can see the details are as follows:

The dataset has been sorted and stored in the output file

The total time taken for sorting is 10280 seconds.

This time shows that shared memory terasort performs good with the small datasets in one node.

Validation of result using Valsort

The screenshot above shows that a total of 1280000000 records are created which has to be validated.

The validation is performed after the sorting of data to check if the files are in place or not. This step ensures that no data is lost in the process of sorting

As we can see in the image that a checksum is generated and it shows that it has no duplicate keys.

After this the code displays a message saying that all records are found to be in order and that the sorting was successful.

Similarly we will carry out all the operations for 1TB of dataset with same steps just the different dataset.

#### **External Sort with 1 TB Dataset**

# Input File Size

As we can see from the screenshot, it shows that 1 TB of dataset is provided to the code as input.

#### 1 TB sort Result

```
## Bountu@ip-172-31-32-14:~

ubuntu@ip-172-31-32-14:~$ gcc externalSort.c -o sort -lpthread ubuntu@ip-172-31-32-14:~$ ./sort -t 10 -s 2

Final sorted records are in the file outfile_1TB.dat Total time taken to sort 1TB data is 26592 seconds ubuntu@ip-172-31-32-14:~$ ■
```

The screenshot above shows that the result has been generated for the 1TB dataset and the data has been sorted and stored in an output file

The total time taken for the sorting process to complete is 26592 seconds. That still is a good time because it is computed on a single node It shows that the time taken for sorting is 7.3 hours.

# Validation of Result using Valsort

```
## B ubuntu@lp-172-31-32-14:~

ubuntu@lp-172-31-32-14:~$ ./valsort outfile_1T8.dat

Records: 10000000000

Checksun: 2f987241eb

Duplicate keys: 8

SUCCESS - all records are in order

ubuntu@lp-172-31-32-14:~$ ■
```

The image in the screenshot shows that the number of records generated is 10000000000 and has no duplicate keys.

The command displays a success message at the end which says that all the records are found to be in order and also that the operation is completed as desired.

#### **Hadoop Terasort:**

#### Referred this:

→ <a href="https://janzhou.org/2014/how-to-compile-hadoop.html">https://janzhou.org/2014/how-to-compile-hadoop.html</a>

How to compile and generate jar files:

```
root@ip-172-31-14-235:/home/ubuntu/hadoop-2.6.5/bin# ls
container-executor
                      Hadoop.java
                                    input128
                                                  rcc
                                                                              yarn.cmd
hadoop
                      hdfs
                                                  test-container-executor
                                     mapred
                      hdfs.cmd
                                     mapred.cmd
hadoop.cmd
                                                 varn
root@ip-172-31-14-235:/home/ubuntu/hadoop-2.6.5/bin# javac -classpath ${HADOOP_CLASSPATH} Hado
javac: no source files
Usage: javac <options> <source files>
use -help for a list of possible options
root@ip-172-31-14-235:/home/ubuntu/hadoop-2.6.5/bin#
root@ip-172-31-14-235:/home/ubuntu/hadoop-2.6.5/bin# export HADOOP_CLASSPATH=$JAVA_HOME/lib/to
ols.jar
root@ip-172-31-14-235:/home/ubuntu/hadoop-2.6.5/bin# cd ...
root@ip-172-31-14-235:/home/ubuntu/hadoop-2.6.5# bin/hadoop com.sun.tools.javac.Main bin/Hadoo
/usr/lib/jvm/java-8-oracle/jre/bin/java
root@ip-172-31-14-235:/home/ubuntu/hadoop-2.6.5# jar -cvf bin/Hadoop.jar bin/Hadoop
bin/Hadoop : no such file or directory
added manifest
root@ip-172-31-14-235:/home/ubuntu/hadoop-2.6.5# cd bin/
root@ip-172-31-14-235:/home/ubuntu/hadoop-2.6.5/bin# ls
container-executor
                                                      hdfs
                                                                 mapred.cmd
                                                                                             yarn.cmd
                      Hadoop, java
                                                      hdfs.cmd
hadoop
                                                                 rcc
Hadoop.class
                      Hadoop$SortingMapper.class
                                                      input128
                                                                 test-container-executor
                      Hadoop$SortingReducer.class
hadoop.cmd
                                                      mapred
                                                                 yarn
root@ip-172-31-14-235:/home/ubuntu/hadoop-2.6.5/bin# rm Hadoop.jar
root@ip-172-31-14-235:/home/ubuntu/hadoop-2.6.5/bin# ls
container-executor
                     Hadoop.java
                                                      hdfs.cmd
                                                                    rcc
                                                      input128
hadoop
                      Hadoop$SortingMapper.class
                                                                    test-container-executor
Hadoop.class
                      Hadoop$SortingReducer.class
                                                      mapred
                                                                    yarn
                                                      mapred.cmd
hadoop.cmd
                      hdfs
                                                                   yarn.cmd
root@ip-172-31-14-235:/home/ubuntu/hadoop-2.6.5/bin# jar cvf Hadoop.jar Hadoop.class Hadoop\$S
ortingMapper.class Hadoop\$SortingReducer.class
added manifest
adding: Hadoop.class(in = 1925) (out= 1025)(deflated 46%)
adding: Hadoop$SortingMapper.class(in = 1558) (out= 644)(deflated 58%)
adding: Hadoop$SortingReducer.class(in = 1644) (out= 704)(deflated 57%)
root@ip-172-31-14-235:/home/ubuntu/hadoop-2.6.5/bin# ls
container-executor
                                                      hdfs
                                                                 mapred.cmd
                                                                                             yarn.cmd
                      Hadoop, java
hadoop
                                                      hdfs.cmd
                                                                 rcc
                                                      input128
Hadoop.class
                      Hadoop$SortingMapper.class
                                                                 test-container-executor
                      Hadoop$SortingReducer.class
hadoop.cmd
root@ip-172-31-14-235:/home/ubuntu/hadoop-2.6.5/bin# |
```

#### **Hadoop Setup on i3.large and i3.4xlarge:**

- 1. Login to new EC2 instance i3.large or i3.4xlarge(or any other instance you create)
- 2. Login as root user and install all base packages:

sudo su sudo apt-get install python-software-properties sudo add-apt-repository ppa:webupd8team/java sudo apt-get update sudo apt-get install oracle-java8-installer

- 3. Check the java version just to be sure you've installed proper version for java: java –version
- 4. Download latest stable Hadoop using wget

wget <a href="http://www.trieuvan.com/apache/hadoop/common/hadoop-2.6.5/hadoop-2.6.5.tar.gz">http://www.trieuvan.com/apache/hadoop/common/hadoop-2.6.5/hadoop-2.6.5/hadoop-2.6.5.tar.gz</a>

tar xzf hadoop-2.6.5.tar.gz

- 5. Create a directory to store all data for hadoop. mkdir hadoopdata
- 6. Add the Hadoop related environment variables in your bash file. Vi ~/.bashrc

Copy and paste these environment variables.

export HADOOP\_HOME=/home/ubuntu/hadoop-2.6.5
export HADOOP\_COMMON\_LIB\_NATIVE\_DIR=\$HADOOP\_HOME/lib/native
export HADOOP\_OPTS="-Djava.library.path=\$HADOOP\_HOME/lib"
export JAVA\_HOME=/usr/lib/jvm/java-8-oracle
PATH=\$PATH:\$JAVA\_HOME/bin:\$HADOOP\_HOME/bin:\$HADOOP\_HOME/sbin

7. Refresh the bash settings by using this command:

source ~/.bashrc

8. We'll setup hadoop for password less ssh access:

```
ssh-keygen -t rsa -P "
cat $HOME/.ssh/id_rsa.pub >> $HOME/.ssh/authorized_keys
check password less ssh access to localhost:
ssh localhost
and then exit.
```

9. Now, we've got to set the hadoop config files, has to be changed in order.

The files changed are:

a. core-site.xml

```
<configuration>
cproperty>
<name>hadoop.tmp.dir</name>
<value>/home/ubuntu/hadooptmp/hadoop-${user.name}</value>
<description>A base for other temporary directories.</description>
</property>
cproperty>
<name>fs.default.name</name>
<value>hdfs://localhost:9000</value>
</property></configuration>
```

b. Hadoop-env.sh

```
# The java implementation to use.
export JAVA_HOME=/usr/lib/jvm/java-8-oracle

# The jsvc implementation to use. Jsvc is required to run secure datanodes
# that bind to privileged ports to provide authentication of data transfer
# protocol. Jsvc is not required if SASL is configured for authentication of
# data transfer protocol using non-privileged ports.
#export JSVC_HOME=${JSVC_HOME}

export HADOOP_CONF_DIR=${HADOOP_CONF_DIR:-"/etc/hadoop"}
```

c. yarn.site.xml

```
<!-- Site specific YARN configuration properties -->
<configuration>
configuration>
configuration>
<name>yarn.nodemanager.aux-services</name>
<value>mapreduce_shuffle</value>
</property>
</configuration>
~
```

d. hdfs-site.xml

e. mapred-site.xmi

```
<configuration>
configuration>
configuration>

<configuration>

/configuration>
```

10. Now we format HDFS filesystem via NameNode:

hdfs namenode –format

#### 11. Start all services:

start-all.sh

We can check for hadoop processes/daemons running on hadoop with Java Virtual Machine Process Status Tool

Command:

jps

#### Hadoop with 128GB dataset:

```
gpl-2.0.txt
                                                               hadooptmp
anaconda3
                                   hadoop-2.6.5
                                                               input
                                   hadoop-2.6.5.tar.gz
hadoopdata
Anaconda3-4.1.1-Linux-x86_64.sh
                                                               pyTeraSort.py
certs
                                                                SparkSort.py
demo1
                                   HadoopSort.java
ubuntu@ip-172-31-9-206:~$ HadoopTests/
-bash: HadoopTests/: Is a directory
ubuntu@ip-172-31-9-206:~$ cd HadoopTests/
ubuntu@ip-172-31-9-206:~/HadoopTests$ ls
nadoop.jar SortHadoop.class
nadoopsort.jar SortHadoop$SortingMapper.class
                                                     WordCount.jar
input128
                 SortHadoop$SortingReducer.class
ubuntu@ip-172-31-9-206:~/HadoopTests$ ls -li
total 125000036
                                               1496 Dec 2 23:31 hadoop.jar
3154 Dec 3 00:18 hadoopsort.jar
  264252 -rw-r--r-- 1 root
                               root
31744003 -rw-r--r-- 1 root
                               root
                                                          2 08:29 input128
 2304274 -rwxrwxr-x 1 ubuntu ubuntu 128000000000 Dec
                                               1941 Dec 2 23:26 SortHadoop.class
  264251 -rw-r--r-- 1 root
                               root
                                               1570 Dec 2 23:26 SortHadoop$Sorting
  256053 -rw-r--r-- 1 root
                               root
Mapper.class
  264250 -rw-r--r-- 1 root
                                               1656 Dec 2 23:26 SortHadoop$Sorting
                               root
Reducer.class
31744002 -rw-r--r-- 1 root
                                                342 Dec 3 00:17 WordCount.jar
ubuntu@ip-172-31-9-206:~/HadoopTests$
```

#### Hadoop with 1TB Dataset:

```
Mapper.class
  264250 -rw-r--r-- 1 root
                                             1656 Dec 2 23:26 SortHadoop$Sorting
                              root
Reducer.class
31744002 -rw-r--r-- 1 root
                              root
                                              342 Dec 3 00:17 WordCount.jar
ubuntu@ip-172-31-9-206:~/HadoopTests$ cd ...
ubuntu@ip-172-31-9-206:~$ ls
                                  gensort-linux-1.5.tar.gz
                                                             HadoopTests
                                  gpl-2.0.txt
                                                             hadooptmp
                                                             input
                                  hadoop-2.6.5
                                                             pyTeraSort.py
Anaconda3-4.1.1-Linux-x86_64.sh
                                  hadoop-2.6.5.tar.gz
                                  hadoopdata
                                                             SparkSort.py
                                  HadoopSort.java
ubuntu@ip-172-31-9-206:~$ cd 64/
ubuntu@ip-172-31-9-206:~/64$ ls
externalSort.c gensort input1Tb sort spark_sort.py valsort ubuntu@ip-172-31-9-206:~/64$ ls -li
total 97656572
264242 -rw-rw-r-- 1 ubuntu ubuntu
                                            8499 Dec 2 07:46 externalSort.c
2304273 -rwxrwxr-x 1 ubuntu ubuntu
                                          141045 Mar 17
                                                         2013 gensort
2304278 -rwxrwxr-x 1 ubuntu ubuntu 10000000000 Dec 2 08:45 input1Tb
2304275 -rwxrwxr-x 1 ubuntu ubuntu
                                           18968 Dec 2 07:49 sort
264245 -rw----- 1 ubuntu ubuntu
                                             759 Dec 2 08:12 spark_sort.py
2304272 -rwxrwxr-x 1 ubuntu ubuntu
                                          134558 Mar 17
                                                         2013 valsort
ubuntu@ip-172-31-9-206:~/64$
```

# Performance

**Hadoop Sort Execution** 

For 128 GB dataset

```
ubuntu@ip-172-31-14-235:~$ cd hadoop-2.6.5/bin/
ubuntu@ip-172-31-14-235:~/hadoop-2.6.5/bin$ ls
container-executor
hadoop
                             input128
Hadoop.class
                             input1TB
hadoop.cmd
                             mapred
 ladoop.jar
                             mapred.cmd
Hadoop.java
Hadoop$SortingMapper.class
                             test-container-executor
Hadoop$SortingReducer.class
                             yarn
hdfs
                             yarn.cmd
hdfs.cmd
ubuntu@ip-172-31-14-235:~/hadoop-2.6.5/bin$ hadoop jar Hadoop.jar Hadoop input128 output128
```

```
INFO input.FileInputFormat: Total input paths to process : 1
INFO mapreduce.JobSubmitter: number of splits:75
INFO mapreduce.JobSubmitter: Submitting tokens for job: job_1459023141669_0001
INFO impl.YarnClientImpl: Submitted application application 1459023141669_0001
INFO mapreduce.Job: The url to track the job: http://master:8088/proxy/application_1459023141669_0001/
INFO mapreduce.Job: Running job: job_1459023141669_0001
INFO mapreduce.Job: Job job_1459023141669_0001 running in uber mode : false
INFO mapreduce. Job: map 0% reduce 0%
INFO mapreduce. Job:
                             map 1% reduce 0%
INFO mapreduce.Job:
                             map 2% reduce 0%
INFO mapreduce. Job:
                             map 3% reduce 6%
INFO mapreduce. Job:
                             map 4% reduce 6%
INFO mapreduce.Job:
INFO mapreduce.Job:
                             map 5% reduce 0%
                             map 6% reduce 0%
INFO mapreduce.Job:
                             map 7% reduce 0%
INFO mapreduce. Job:
                             map 8% reduce 0%
INFO mapreduce.Job:
INFO mapreduce.Job:
                             map 9% reduce 0%
                             map 10% reduce 0%
INFO mapreduce.Job:
                             map 11% reduce 0%
INFO mapreduce. Job:
                             map 12% reduce 0%
INFO mapreduce. Job:
                             map 13% reduce 0%
INFO mapreduce. Job:
                             map 14% reduce 0%
INFO mapreduce.Job:
                             map 15% reduce 6%
INFO mapreduce. Job:
                             map 16% reduce 6%
                             map 17% reduce 6%
INFO mapreduce. Job:
                             map 18% reduce 6%
INFO mapreduce. Job:
INFO mapreduce. Job:
                             map 19% reduce 0%
INFO mapreduce.Job:
INFO mapreduce.Job:
                             map 20% reduce 0%
                             map 21% reduce 0%
                             map 22% reduce 1%
map 22% reduce 2%
INFO mapreduce. Job:
INFO mapreduce. Job:
INFO mapreduce. Job:
                             map 22% reduce 3%
INFO mapreduce. Job:
                             map 22% reduce 4%
                             map 24% reduce 4%
INFO mapreduce.Job:
INFO mapreduce. Job:
                             map 24% reduce 5%
INFO mapreduce. Job:
                             map 25% reduce 5%
```

```
INFO mapreduce.Job: map 46% reduce 15%
INFO mapreduce.Job: map 47% reduce 15%
INFO mapreduce.Job: map 49% reduce 15%
INFO mapreduce.Job:
                      map 50% reduce 15%
INFO mapreduce. Job:
                      map 51% reduce 15%
INFO mapreduce. Job:
                      map 52% reduce 15%
INFO mapreduce.Job:
                      map 53% reduce 15%
INFO mapreduce. Job:
                      map 54% reduce 15%
INFO mapreduce.Job:
                      map 55% reduce 15%
INFO mapreduce. Job:
                      map 56% reduce 15%
INFO mapreduce.Job:
                      map 57% reduce 15%
INFO mapreduce. Job:
                      map 58% reduce 15%
INFO mapreduce.Job:
                      map 58% reduce 16%
INFO mapreduce.Job:
                      map 59% reduce 16%
INFO mapreduce.Job:
                      map 60% reduce 16%
INFO mapreduce.Job:
INFO mapreduce.Job:
                      map 61% reduce 16%
                      map 62% reduce 16%
INFO mapreduce. Job:
                      map 63% reduce 16%
INFO mapreduce.Job:
                      map 64% reduce 16%
INFO mapreduce. Job: map 64% reduce 17%
INFO mapreduce.Job:
INFO mapreduce.Job:
                      map 65% reduce 17%
                      map 65% reduce 18%
INFO mapreduce.Job:
                      map 65% reduce 19%
INFO mapreduce.Job:
                      map 65% reduce 20%
INFO mapreduce.Job: map 66% reduce 20%
INFO mapreduce.Job:
                      map 67% reduce 20%
INFO mapreduce.Job:
                      map 68% reduce 20%
INFO mapreduce.Job:
INFO mapreduce.Job:
                      map 69% reduce 20%
                      map 69% reduce 21%
INFO mapreduce.Job:
                      map 69% reduce 22%
INFO mapreduce.Job:
                      map 69% reduce 23%
INFO mapreduce.Job:
                      map 70% reduce 23%
INFO mapreduce.Job:
                      map 71% reduce 23%
INFO mapreduce. Job:
                      map 72% reduce 23%
INFO mapreduce.Job:
                      map 73% reduce 23%
INFO mapreduce.Job:
                       map 74% reduce 23%
INFO mapreduce.Job:
                       map 75% reduce 23%
INFO mapreduce.Job:
INFO mapreduce.Job:
                      map 76% reduce 23%
                      map 77% reduce 23%
```

```
INFO mapreduce.Job:
                          100% reduce
INFO mapreduce.Job: map 100% reduce 77%
INFO mapreduce. Job: map 100% reduce 78%
INFO mapreduce.Job:
                    map 100% reduce 79%
INFO mapreduce.Job:
                     map 100% reduce
INFO mapreduce. Job: map 100% reduce 81%
INFO mapreduce.Job: map 100% reduce 82%
INFO mapreduce.Job: map 100% reduce 83%
INFO mapreduce.Job: map 100% reduce 84%
INFO mapreduce.Job: map 100% reduce 85%
INFO mapreduce.Job:
                     map 100% reduce 86%
INFO mapreduce.Job: map 100% reduce 87%
INFO mapreduce.Job: map 100% reduce 88%
INFO mapreduce.Job: map 100% reduce 89%
INFO mapreduce. Job: map 100% reduce 90%
INFO mapreduce.Job: map 100% reduce 91%
INFO mapreduce.Job:
                     map 100% reduce 92%
INFO mapreduce.Job: map 100% reduce 93%
INFO mapreduce.Job: map 100% reduce 94%
INFO mapreduce.Job: map 100% reduce 95%
INFO mapreduce.Job: map 100% reduce 96%
INFO mapreduce.Job: map 100% reduce 97% INFO mapreduce.Job: map 100% reduce 98%
INFO mapreduce.Job: map 100% reduce 99%
INFO mapreduce.Job: map 100% reduce 100%
INFO mapreduce. Job: Job job 1459023141669 0001 completed successfully
```

# Output:

#### Head -5 output 128

The above screenshots are a collection of operations performed in the Hadoop Map Reduce method. As the theory says Hadoop is a method which performs sorting in many steps, It reads data from cluster, perform an operation, write results to the cluster, read updated data from the cluster, perform next operation, write next result to cluster. So the whole series of operations can be seen in our screenshot in the form of percentages.

The whole sorting process is divided in percentages from 0 to 100.

The last screenshot displays the output of the dataset sorted by Hadoop.

#### For 1 TB Dataset

```
ubuntu@ip-172-31-14-235:~$ ls
                                 gensort-linux-1.5.tar.gz hadoop-2.6.5.tar.gz
                                                            hadoopdata
                                 gpl-2.0.txt
                                 hadoop-2.6.5
Anaconda3-4.1.1-Linux-x86_64.sh
                                                            hadooptmp
ubuntu@ip-172-31-14-235:~$ cd hadoop-2.6.5/
ubuntu@ip-172-31-14-235:~/hadoop-2.6.5$ cd bin/
ubuntu@ip-172-31-14-235:~/hadoop-2.6.5/bin$ ls
container-executor
hadoop
                             input128
Hadoop.class
                             input1TB
hadoop.cmd
                             mapred
 ladoop.jar
                             mapred.cmd
Hadoop.java
                             rcc
Hadoop$SortingMapper.class
                             test-container-executor
Hadoop$SortingReducer.class
                             yarn
hdfs
                             yarn.cmd
hdfs.cmd
ubuntu@ip-172-31-14-235:~/hadoop-2.6.5/bin$ hadoop jar Hadoop.jar Hadoop input1TB output1TB|
```

```
INFO input.FileInputFormat: Total input paths to process: 1
INFO mapreduce.JobSubmitter: number of splits:75
INFO mapreduce.JobSubmitter: Submitting tokens for job: job_1459023141669_0001
INFO impl.YarnClientImpl: Submitted application application_1459023141669_0001
INFO mapreduce.Job: The url to track the job: http://master:8088/proxy/application 1459023141669 0001/
INFO mapreduce.Job: Running job: job 1459023141669_0001
INFO mapreduce.Job: Job job 1459023141669_0001 running in uber mode: false
INFO mapreduce.Job: map 0% reduce 0%
INFO mapreduce. Job: map 1% reduce 0%
INFO mapreduce.Job: map 2% reduce 0% INFO mapreduce.Job: map 3% reduce 0%
INFO mapreduce. Job: map 4% reduce 0%
INFO mapreduce.Job: map 5% reduce 6%
INFO mapreduce.Job: map 6% reduce 0%
INFO mapreduce. Job:
                         map 7% reduce 0%
INFO mapreduce.Job: map 8% reduce 0%
INFO mapreduce.Job: map 9% reduce 6%
INFO mapreduce.Job: map 10% reduce 0%
INFO mapreduce.Job:
                         map 11% reduce 0%
INFO mapreduce. Job: map 12% reduce 0%
INFO mapreduce. Job: map 13% reduce 0%
INFO mapreduce.Job: map 14% reduce 0%
INFO mapreduce. Job:
                         map 15% reduce 6%
INFO mapreduce. Job: map 16% reduce 6%
INFO mapreduce.Job: map 17% reduce 0%
INFO mapreduce.Job: map 18% reduce 0% INFO mapreduce.Job: map 19% reduce 0%
INFO mapreduce. Job: map 26% reduce 6%
INFO mapreduce.Job: map 21% reduce 0%
INFO mapreduce.Job: map 22% reduce 1% INFO mapreduce.Job: map 22% reduce 2%
INFO mapreduce. Job: map 22% reduce 3%
INFO mapreduce.Job: map 22% reduce 4%
INFO mapreduce. Job:
                         map 24% reduce 4%
INFO mapreduce.Job:
                         map 24% reduce 5%
INFO mapreduce.Job: map 25% reduce 5%
```

```
INFO mapreduce.Job: map 46% reduce 15%
INFO mapreduce.Job: map 47% reduce 15%
INFO mapreduce. Job:
                      map 49% reduce 15%
INFO mapreduce.Job:
                      map 50% reduce 15%
INFO mapreduce. Job:
                      map 51% reduce 15%
INFO mapreduce. Job:
                      map 52% reduce 15%
                      map 53% reduce 15%
INFO mapreduce. Job:
INFO mapreduce.Job:
                      map 54% reduce 15%
INFO mapreduce.Job:
                      map 55% reduce 15%
INFO mapreduce.Job:
                      map 56% reduce 15%
INFO mapreduce.Job:
                      map 57% reduce 15%
INFO mapreduce.Job:
                      map 58% reduce 15%
INFO mapreduce. Job:
                      map 58% reduce 16%
INFO mapreduce.Job: map 59% reduce 16%
INFO mapreduce.Job: map 60% reduce 16%
INFO mapreduce.Job:
                      map 61% reduce 16%
INFO mapreduce.Job:
                      map 62% reduce 16%
INFO mapreduce. Job: map 63% reduce 16%
INFO mapreduce.Job:
                      map 64% reduce 16%
INFO mapreduce.Job: map 64% reduce 17%
INFO mapreduce.Job: map 65% reduce 17%
INFO mapreduce.Job:
                      map 65% reduce 18%
INFO mapreduce.Job:
                      map 65% reduce 19%
INFO mapreduce.Job: map 65% reduce 20%
INFO mapreduce.Job: map 66% reduce 20%
INFO mapreduce.Job: map 67% reduce 20%
                      map 67% reduce 20%
INFO mapreduce.Job:
                      map 68% reduce 20%
INFO mapreduce.Job: map 69% reduce 26%
INFO mapreduce.Job: map 69% reduce 21%
                      map 69% reduce 21%
INFO mapreduce.Job: map 69% reduce 22%
INFO mapreduce.Job: map 69% reduce 23%
INFO mapreduce. Job:
                      map 70% reduce 23%
INFO mapreduce.Job: map 71% reduce 23%
INFO mapreduce.Job:
                      map 72% reduce 23%
INFO mapreduce.Job:
                      map 73% reduce 23%
INFO mapreduce. Job:
                      map 74% reduce 23%
INFO mapreduce. Job:
                      map 75% reduce 23%
INFO mapreduce.Job:
INFO mapreduce.Job:
                      map 76% reduce 23%
                      map 77% reduce 23%
INFO mapreduce.Job: map 100% reduce 76% INFO mapreduce.Job: map 100% reduce 77%
INFO mapreduce.Job: map 100% reduce 78%
INFO mapreduce.Job: map 100% reduce 79%
INFO mapreduce.Job:
INFO mapreduce.Job:
                      map 100% reduce 80%
                       map 100% reduce 81%
INFO mapreduce.Job: map 100% reduce 82%
INFO mapreduce.Job: map 100% reduce 83%
INFO mapreduce.Job: map 100% reduce 84%
INFO mapreduce.Job: map 100% reduce 85%
INFO mapreduce.Job: map 100% reduce 86%
INFO mapreduce.Job: map 100% reduce 87% INFO mapreduce.Job: map 100% reduce 88%
INFO mapreduce.Job:
                       map 100% reduce 89%
INFO mapreduce. Job: map 100% reduce 90%
INFO mapreduce. Job: map 100% reduce 91%
INFO mapreduce. Job: map 100% reduce 92%
INFO mapreduce.Job: map 100% reduce 93%
INFO mapreduce.Job:
INFO mapreduce.Job:
                      map 100% reduce 94%
                      map 100% reduce 95%
INFO mapreduce.Job:
                      map 100% reduce 96%
INFO mapreduce.Job: map 100% reduce 97%
INFO mapreduce.Job:
                      map 100% reduce 98%
INFO mapreduce.Job:
                       map 100% reduce 99%
INFO mapreduce.Job:
                      map 100% reduce 100%
INFO mapreduce.Job: Job job 1459023141669 0001 completed successfully
```

#### Output:

# Head -5 output 1 TB

"O!uve	0000000000000000000000000001228D4	77778888000022224444DDDDDDDDEEEE00000000CCCC7777DDDD
PMd32=	0000000000000000000000003440CC1	FFFFEEEE6666CCCCBBBB999933335555DDDDDDDDD777788886666
^3C0],	0000000000000000000000000158C5C5	5555AAAA9999EEEE888822229999CCCCDDDD6666555544442222
!&S3/]]	000000000000000000000000000145D78	8888BBBDDDD1111CCCC55556666BBBB1111EEEEDDDD22229999
!,=U#,9	00000000000000000000000019072E3	33332222FFFFBBBB0000FFFFAAAA666655553333DDDD33333CCCC

# **Compute Time: 618 Minutes (10.3 hours)**

Launching 8 nodes for forming a Virtual Cluster of i3.large instance:

Private Ips are stored in etc/hadoop/slaves file for slave node and etc/hadoop/masters file for master node

Master - 172.31.6.227

Slave1- 172.31.27.17

Slave2-172.31.29.179

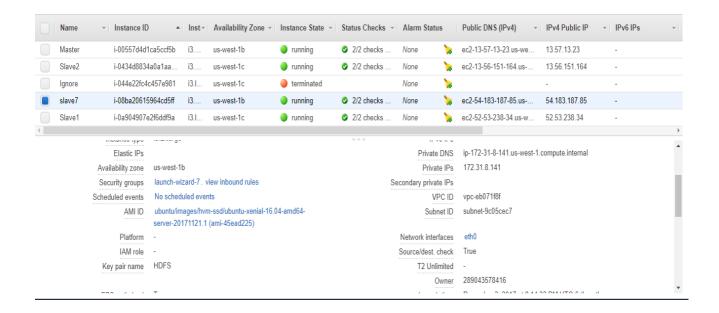
Slave3- 172.31.28.110

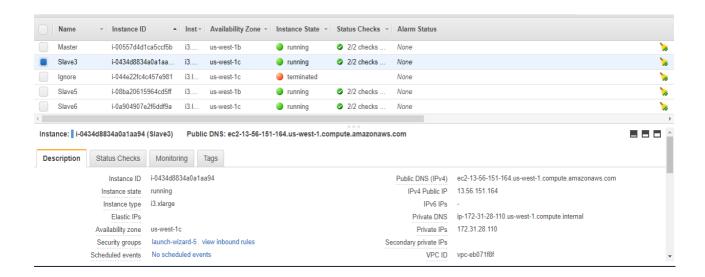
Slave4-172.31.7.134

Slave5-172.31.25.127

Slave6-172.31.12.24

Slave7-172.31.8.141





```
INFO mapreduce.Job: Running job: job 1459040042109 0001
INFO mapreduce.Job: Job job 1459040042109 0001 running in uber mode :
INFO mapreduce.Job:
                     map 0% reduce 0%
INFO mapreduce.Job:
                     map 1% reduce 0%
INFO mapreduce.Job:
                     map 2% reduce 0%
INFO mapreduce.Job:
                     map 3% reduce 0%
INFO mapreduce.Job:
                     map 4% reduce 0%
INFO mapreduce.Job:
                     map 5% reduce 0%
INFO mapreduce.Job:
                     map 6% reduce 0%
INFO mapreduce.Job:
                     map 7% reduce 0%
INFO mapreduce.Job:
                     map 8% reduce 0%
INFO mapreduce.Job:
                     map 9% reduce 0%
INFO mapreduce.Job:
                     map 10% reduce 0%
INFO mapreduce.Job:
                     map 11% reduce 0%
INFO mapreduce.Job:
                     map 12% reduce 0%
INFO mapreduce.Job:
                     map 13% reduce 0%
                     map 14% reduce 0%
INFO mapreduce.Job:
INFO mapreduce.Job:
                     map 15% reduce 0%
INFO mapreduce.Job:
                     map 16% reduce 0%
INFO mapreduce.Job:
                     map 17% reduce 0%
INFO mapreduce.Job:
                     map 18% reduce 0%
INFO mapreduce.Job:
                     map 19% reduce 0%
INFO mapreduce.Job:
                     map 20% reduce 0%
                     map 21% reduce 0%
INFO mapreduce.Job:
INFO mapreduce.Job:
                     map 22% reduce 0%
INFO mapreduce.Job:
                     map 23% reduce 0%
INFO mapreduce.Job:
                     map 24% reduce 0%
```

```
INFO mapreduce.Job:
                     map 95% reduce 6%
INFO mapreduce. Job:
                     map 96% reduce 6%
INFO mapreduce.Job:
                     map 97% reduce 6%
INFO mapreduce.Job:
                     map 98% reduce 6%
INFO mapreduce.Job:
                     map 99% reduce 6%
INFO mapreduce. Job:
                     map 100% reduce 6%
INFO mapreduce.Job:
                     map 100% reduce 7%
INFO mapreduce.Job:
                     map 100% reduce 8%
                     map 100% reduce 9%
INFO mapreduce.Job:
                     map 100% reduce 10%
INFO mapreduce.Job:
INFO mapreduce.Job:
                     map 100% reduce 11%
                     map 100% reduce 12%
INFO mapreduce.Job:
INFO mapreduce.Job:
                     map 100% reduce 13%
INFO mapreduce.Job:
                     map 100% reduce 14%
INFO mapreduce.Job:
                     map 100% reduce 15%
INFO mapreduce.Job:
                     map 95% reduce 0%
INFO mapreduce.Job:
                     map 96% reduce 0%
INFO mapreduce. Job:
                     map 96% reduce 1%
INFO mapreduce.Job:
                     map 97% reduce 1%
INFO mapreduce.Job:
                     map 98% reduce 1%
INFO mapreduce.Job:
                     map 99% reduce 1%
INFO mapreduce.Job:
                     map 99% reduce 2%
INFO mapreduce.Job:
                     map 100% reduce 2%
INFO mapreduce.Job:
                     map 100% reduce 3%
                     map 100% reduce 4%
INFO mapreduce.Job:
INFO mapreduce.Job:
                     map 100% reduce 5%
```

Here in the above screenshot you can see that Maps 100% but Reduces 15% and gets into that loop again which was a problem, I first thought it was something wrong with the code, but I just had to insert the numbers of mappers and reducers in Mapred-site.xml in etc/hadoop and then it just worked.

Check the next screenshot!

```
INFO mapreduce.Job:
                     map 100% reduce 75%
INFO mapreduce.Job:
                     map 100% reduce 76%
INFO mapreduce.Job:
                     map 100% reduce 77%
INFO mapreduce.Job:
                     map 100% reduce 78%
INFO mapreduce.Job:
                     map 100% reduce 79%
INFO mapreduce.Job:
                     map 100% reduce 80%
INFO mapreduce.Job:
                     map 100% reduce 81%
INFO mapreduce.Job:
                     map 100% reduce 82%
INFO mapreduce.Job:
                     map 100% reduce 83%
INFO mapreduce.Job:
                     map 100% reduce 84%
INFO mapreduce.Job:
                     map 100% reduce 85%
INFO mapreduce. Job:
                     map 100% reduce 86%
INFO mapreduce.Job:
                     map 100% reduce 87%
INFO mapreduce.Job:
                     map 100% reduce 88%
INFO mapreduce.Job:
                     map 100% reduce 89%
INFO mapreduce.Job:
                     map 100% reduce 90%
INFO mapreduce.Job:
                     map 100% reduce 91%
INFO mapreduce.Job:
                     map 100% reduce 92%
 INFO mapreduce.Job:
                     map 100% reduce 93%
INFO mapreduce.Job:
                     map 100% reduce 94%
INFO mapreduce.Job:
                     map 100% reduce 95%
INFO mapreduce.Job:
                     map 100% reduce 96%
INFO mapreduce.Job:
                     map 100% reduce 97%
INFO mapreduce.Job:
                     map 100% reduce 98%
INFO mapreduce.Job:
                     map 100% reduce 99%
INFO mapreduce.Job:
                     map 100% reduce 100%
```

And the time elapsed (Compute time) comes out to be: 477.53 minutes (7.95hrs)

# **Spark Terasort:**

Spark Setup on i3.large and i3.4xlarge:

1. Download and Install python:

```
wget <a href="http://repo.continuum.io/archive/Anaconda3-4.1.1-Linux-x86_64.sh">http://repo.continuum.io/archive/Anaconda3-4.1.1-Linux-x86_64.sh</a> bash Anaconda3-4.1.1-Linux-x86_64.sh
```

2. To know what version has been installed:

which python

3. Installing Scala:

sudo apt-get install scala

To check whether is has been installed properly or not:

scala –version

4. Install Spark:

wget <a href="http://archive.apache.org/dist/spark/spark-2.0.0/spark-2.0.0-bin-hadoop2.7.tgz">http://archive.apache.org/dist/spark/spark-2.0.0/spark-2.0.0-bin-hadoop2.7.tgz</a>

sudo tar -zxvf spark-2.0.0-bin-hadoop2.7.tgz

5. We've got to let python know where spark is:

```
export PATH=$SPARK_HOME:$PATH
export PYTHONPATH=$SPARK_HOME/python:$PYTHONPATH
```

#### Sparksort on 128 GB of dataset:

```
oot@ip-172-31-9-206:/home/ubuntu# ls
                                           t-linux-1.5.tar.gz
                                                                  HadoopTests
32
                                     gpl-2.0.txt
                                                                  hadooptmp
                                     hadoop-2.6.5
                                                                  input
Anaconda3-4.1.1-Linux-x86_64.sh
                                     hadoop-2.6.5.tar.gz
                                                                  pyTeraSort.py
demo1
                                     HadoopSort.java
root@ip-172-31-9-206:/home/ubuntu# cd HadoopTests/
root@ip-172-31-9-206:/home/ubuntu/HadoopTests# ls
 nadoop.jar
nadoopsort.jar
                 SortHadoop.class
                                                      SparkSort.py
                 SortHadoop$SortingMapper.class
                SortHadoop$SortingReducer.class
input128
root@ip-172-31-9-206:/home/ubuntu/HadoopTests# python SparkSort.py input128 outp
ut128
The program 'python' can be found in the following packages:
 * python-minimal
 * python3
Try: apt install <selected package>
root@ip-172-31-9-206:/home/ubuntu/HadoopTests# exit
ubuntu@ip-172-31-9-206:~$ cd HadoopTests/
ubuntu@ip-172-31-9-206:~/HadoopTests$ ls
                 SortHadoop.class
                                                       SparkSort.py
                  SortHadoop$SortingMapper.class
input128
                 SortHadoop$SortingReducer.class
ubuntu@ip-172-31-9-206:~/HadoopTests$ python SparkSort.py input128 output128
Input file path is...input128
Output file path is...output128
Using Spark's default log4j profile: org/apache/spark/log4j-defaults.properties
Setting default log level to "WARN".
To adjust logging level use sc.setLogLevel(newLevel). For SparkR, use setLogLeve
17/12/03 20:52:18 WARN NativeCodeLoader: Unable to load native-hadoop library fo
r your platform... using builtin-java classes where applicable
17/12/03 20:52:19 WARN Utils: Service 'SparkUI' could not bind on port 4040. Att
empting port 4041.
[Stage 0:>
                                                                        (61 + 1) / 3815]
```

#### Stage 0 of execution:

```
ubuntu@ip-172-31-9-206:~/HadoopTests$ python SparkSort.py input128 output128
Input file path is...input128
Output file path is...output128
Using Spark's default log4j profile: org/apache/spark/log4j-defaults.properties
Setting default log level to "WARN".
To adjust logging level use sc.setLogLevel(newLevel). For SparkR, use setLogLeve l(newLevel).
17/12/03 20:52:18 WARN NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java classes where applicable
17/12/03 20:52:19 WARN Utils: Service 'SparkUI' could not bind on port 4040. Att empting port 4041.
[Stage 0:====> (324 + 1) / 3815]
```

#### Stage 1 of execution:

This shows that the number of parts in which the dataset was divided is 3815. The operation is divided in 3 stages basically because the operation is performed on the whole dataset at once.

First stage reads the data from the dataset, the second stage performs the sorting operation on the data and then the third operation stored the processed data back in the output folder.

#### Sparksort on 1 TB dataset:

```
ubuntu@ip-172-31-9-206:~$ ls
32
                                 gensort-linux-1.5.tar.gz HadoopTests
64
                                 ap1-2.0.txt
                                                           hadooptmp
                                 hadoop-2.6.5
anaconda3
                                                           input
Anaconda3-4.1.1-Linux-x86_64.sh hadoop-2.6.5.tar.gz
                                                           pyTeraSort.py
                                 hadoopdata
                                                           SparkSort.py
demo1
                                 HadoopSort.java
ubuntu@ip-172-31-9-206:~$ mv SparkSort.py 64/
ubuntu@ip-172-31-9-206:~$ ls'
> \C
ubuntu@ip-172-31-9-206:~$ ls
                                 gensort-linux-1.5.tar.gz HadoopTests
32
                                                           hadooptmp
                                 gpl-2.0.txt
anaconda3
                                hadoop-2.6.5
                                                           input
Anaconda3-4.1.1-Linux-x86_64.sh
                                hadoop-2.6.5.tar.gz
                                                           pyTeraSort.py
certs
                                hadoopdata
                                 HadoopSort.java
demo1
ubuntu@ip-172-31-9-206:~$ cd 64/
ubuntu@ip-172-31-9-206:~/64$ ls
externalSort.c gensort input1Tb sort spark_sort.py SparkSort.py valsort
```

#### Stage 0 of execution:

```
ubuntu@ip-172-31-9-206:~/64$ python SparkSort.py input1Tb output1TB
Input file path is...input1Tb
Output file path is...output1TB
Using Spark's default log4j profile: org/apache/spark/log4j-defaults.properties
Setting default log level to "WARN".
To adjust logging level use sc.setLogLevel(newLevel). For SparkR, use setLogLeve l(newLevel).
17/12/03 20:47:00 WARN NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java classes where applicable
[Stage 0:======> (359 + 1) / 2981]
```

#### Stage 1 of execution:

```
ubuntu@ip-172-31-9-206:~/64$ python SparkSort.py input1Tb output1TB
Input file path is...input1Tb
Output file path is...output1TB
Using Spark's default log4j profile: org/apache/spark/log4j-defaults.properties
Setting default log level to "WARN".
To adjust logging level use sc.setLogLevel(newLevel). For SparkR, use setLogLeve l(newLevel).
17/12/03 20:47:00 WARN NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java classes where applicable
[Stage 1:=> (103 + 1) / 2981]
```

#### Stage 2 of Execution:

The screenshot above displays a collection of different operations and all of them connects to one operation of sorting.

As said above the operations are divided in three stages that collectively gives us an output and stores in the desired format in the folder.

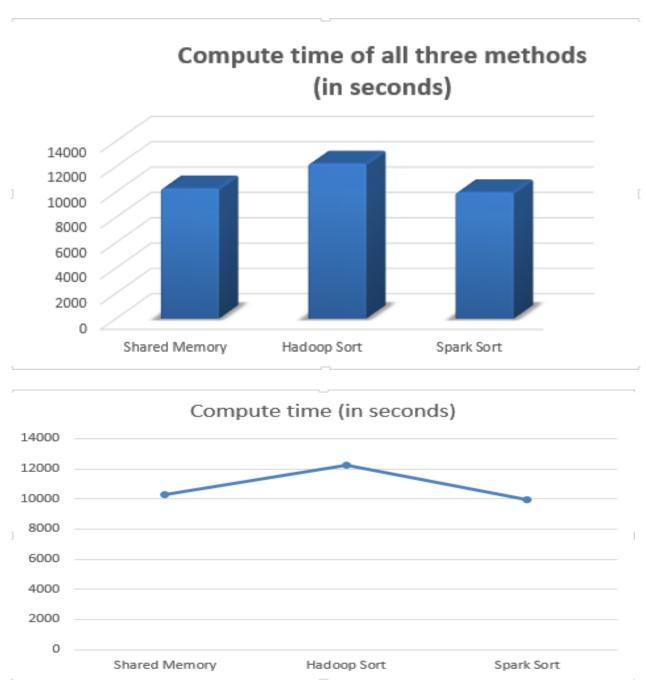
# 1) Performance:

**Table 1: Performance evaluation of TeraSort** 

Experiment (instance/dataset)	Shared	Hadoop	Spark	MPI
	Memory	Terasort	Terasort	Terasort
	Terasort			
Compute Time (sec) [1xi3.large 128GB]	10280 sec	12235	9972 sec	-
		sec		
Data Read (GB) [1xi3.large 128GB]	125 GB	120 GB	122 GB	•
Data Write (GB) [1xi3.large 128GB]	126 GB	120 GB	122 GB	-
I/O Throughput (MB/sec) [1xi3.large	112.412 MB/sec	85.7	105.15	-
128GB]		MB/sec	MB/sec	
Compute Time (sec) [1xi3.4xlarge 1TB]	26592 sec	37080	25391	-
		sec	sec	
Data Read (GB) [1xi3.4xlarge 1TB]	920 GB	920 GB	920 GB	-
Data Write (GB) [1xi3.4xlarge 1TB]	920 GB	920 GB	920 GB	-
I/O Throughput (MB/sec) [1xi3.4xlarge	315.45 MB/sec	226	330	-
1TB]		MB/sec	Mb/sec	
Compute Time (sec) [8xi3.large 1TB]	N/A	28652	24649	-
		sec	sec	
Data Read (GB) [8xi3.large 1TB]	N/A	920 GB	920 GB	-
Data Write (GB) [8xi3.large 1TB]	N/A	920 GB	920GB	-
I/O Throughput (MB/sec) [8xi3.large 1TB]	N/A	263.04	305.75	-
		MB/sec	MB/sec	
Speedup (weak scale)	2.80619	1.163	0.926	-
Efficiency (weak scale)	2.58677	1.290	1.030	-

# **Performance Report:**

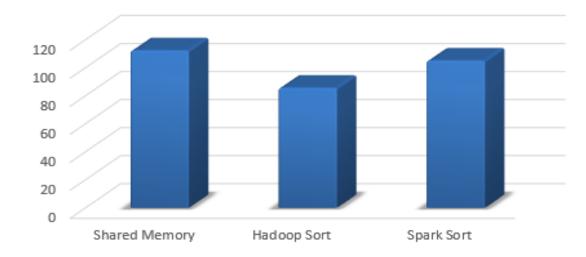
For 128 GB Compute time comparison



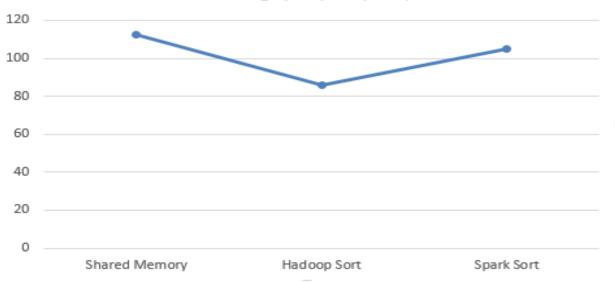
It is visible from the graph that Spark Sort takes the least time of all and after that the shared memory sort is efficient. Hadoop sort is not at all efficient to be run on a single node. And that shared memory performs as good as spark on a small dataset and when it comes to the single node then the performance of shared memory is very good comparatively.

# Throughput Comparison



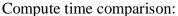


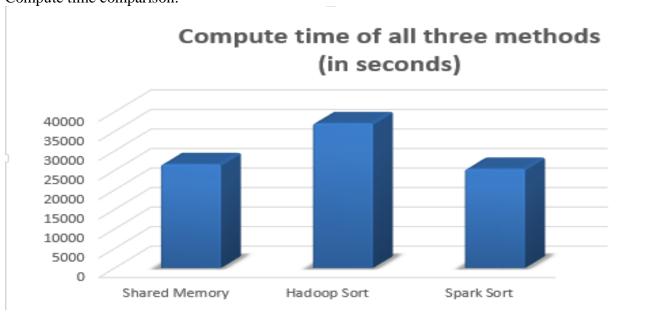


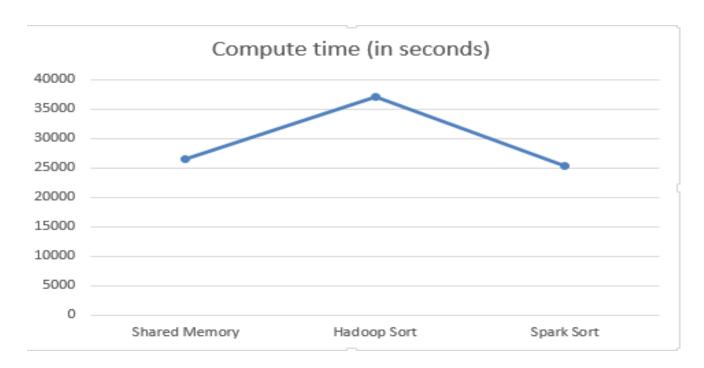


As we can see from the graph, the throughput of shared memory sorting is the best amongst all. Since the sorting is done on a single node so the shared memory outperforms all other sorting methods.

For 1 TB Dataset: (instance type i3.4xlarge)

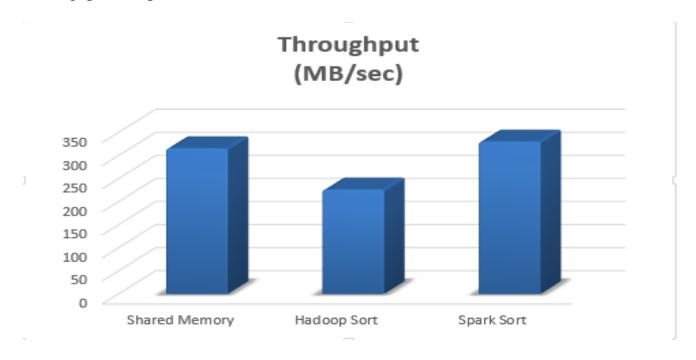


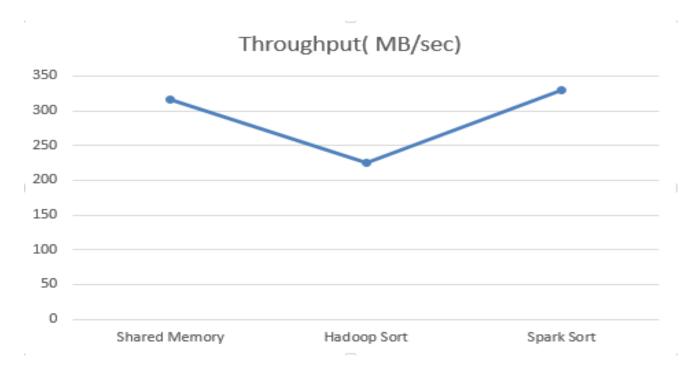




The Compute time for spark is the least in this case as seen from the graph. The spark sort is efficient for performing sorting operations on bigger datasets with higher number of nodes.

# Throughput comparison:



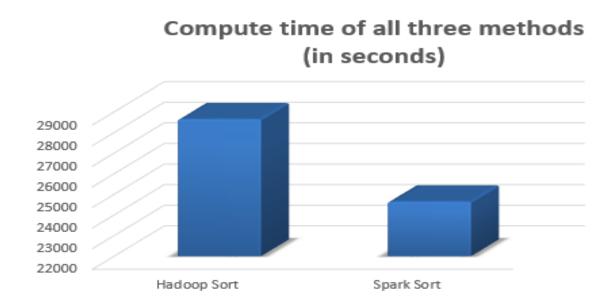


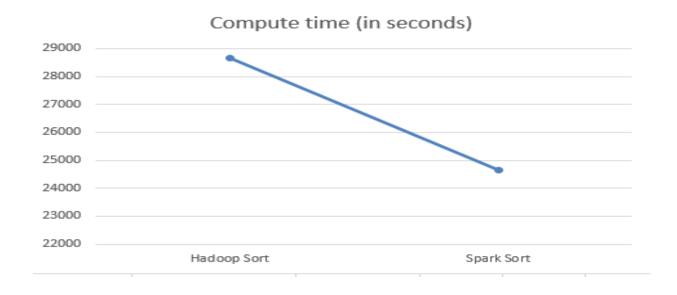
The throughput of Spark Sort is the best as it performs the fastest sorting amongst all. The Shared memory method has the second best throughput.

For 8 nodes in one cluster for instance type (i3.large)

Comparison of Hadoop and Spark Sorting:

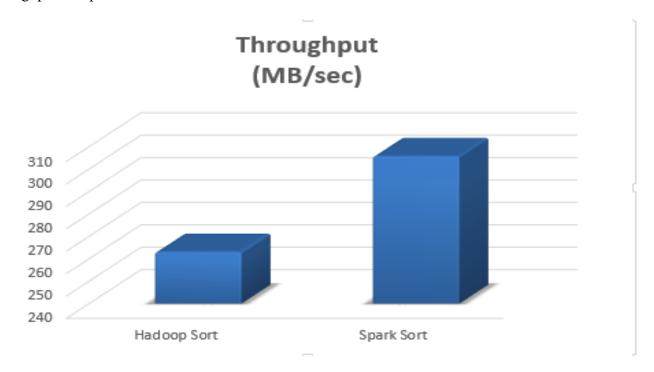
Compute time Comparison:



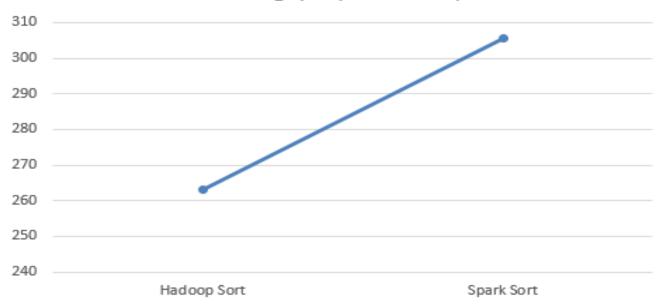


The compute time taken by Spark is considerably less than that taken by Hadoop.

# Throughput comparison:

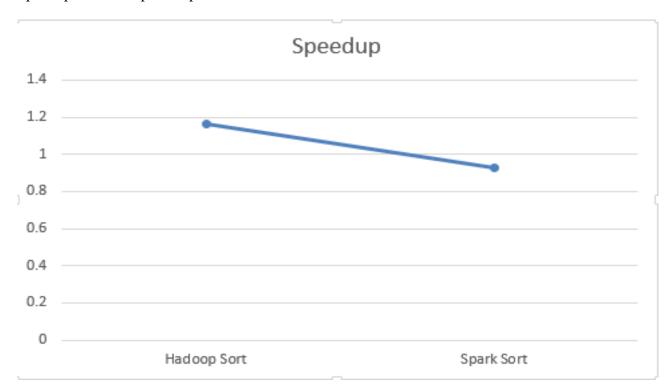






The Throughput of Spark is greater than Hadoop even in this type of setup.

# Speedup for Hadoop and Spark:



# Efficiency for Hadoop and Spark:



#### What conclusions can you draw?

The only conclusion that we can come to is that spark is the best sorting technique used in the whole assignment. And terasorting can be performed with all these sorting algorithms.

#### Which seems to be best at 1 node scale?

Performing sorting operations at 1 node is technically preferable with shared memory terasort, because with this method we are saved from setting up a cluster of nodes. Perform sorting of large datasets is quite difficult and time taking in a 1 node setup but it is the best option for relatively small datasets.

#### How about 8 nodes?

At 8 nodes we have a master and slave kind of distribution and Spark performs better than all other in this setup as it uses RDD (Resilient Distributed Datasets) and has better and updated architecture for data processing when compared to Hadoop. Spark can be as much as 10 times faster than MapReduce for batch processing and up to 100 times faster for in-memory analytics.

# Can you predict which would be best at 100 node scale?

Spark is clearly the one to be most efficient to work with at 100 node scale or more. The reason for this is when compared with Hadoop MapReduce it operates in steps, the workflow for MapReduce is: "read data from cluster, perform an operation, write results to the cluster, read updated data from the cluster, perform next operation, write next result to cluster" and so on...... Spark on the other hand completes full data analytics operations in-memory and in near real-time: "Read data from the cluster, perform all of the requisite analytic operations, write results to the cluster, done".

#### How about 1000 node scales?

As I have stated earlier Spark will be the better option for this 1000 node setup because it is more efficient single step algorithm and its results gets better for bigger datasets with a large distribution of nodes. From our calculations also we can see that the performance of Spark keeps on improving as the number of nodes keeps on increasing.

# Compare your results with those from the Sort Benchmark [9], specifically the winners in 2013 and 2014 who used Hadoop and Spark.

In 2013, according to Daytona GraySort, Hadoop was the winner with the sorting speed of 1.42 TB/min as it calculated 102.5 TB in 4,328 seconds with 2100 nodes of distributed systems. In 2014, according to Daytona GraySort, Apache Spark was the winner with the sorting speed of 4.27 TB/min and it calculated 100 TB in 1,378 seconds with only 207 Amazon EC2 nodes.

#### Also, what can you learn from the CloudSort benchmark?

CloudSort benchmark is something that makes use of resources available at public cloud to perform sorting operations on the data. CloudSort proposes using the cloud to define a benchmark that measures the efficiency of external sort from a total-cost of ownership perspective. The CloudSort Benchmark is summarized as follows:

- 1. Sort a fixed number (currently 1012,  $\sim 100 TB$ ) of randomly permuted 100-byte records with 10-byte keys
- 2. The sort must start with the input on a non-ephemeral, persistent store and finish with output on a nonephemeral, persistent store.
- 3. All operations must be performed on a commercially available public cloud.
- 4. The winner is the system with the minimum cost prorated for the duration of the sort.

In all CloudSort benchmark is one of the best public cloud benchmark system we have and it takes in consideration all the factors like cost and speed and efficiency for the calculation of benchmark.

# **Conclusion:**

We have learned from this assignment that Spark performs better than Hadoop and Shared Memory. Spark performs better in the distributed environment and huge datasets because of the special features of the algorithm that it performs all the operations collectively and not in steps.

Ideally the shared memory should perform better on the single node irrespective of the size of the dataset. The shared memory proves to be true in the results from our programs.

We also learned the application of AWS and how to create the master and slave node in cluster for performing calculation of huge datasets.

Implementing MPI was tough and was taking us a lot of time to give output so couldn't include it in the report.

Though Spark was the fastest to sort the data we can see that Hadoop can also perform well for bigger datasets in cluster computing.

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