

# UNIVERSITY OF A CORUÑA COMPUTER ARCHITECTURE GROUP

# MapReduce Evaluator: User Guide

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# Contents

1	1 Overview				
2	Features         2.1       User-defined parameters         2.2       Solutions and benchmarks				
3	Example         3.1       Configuration of the experiments         3.2       Execution         3.3       Results         3.3.1       Performance         3.3.2       Resource utilization	$\begin{array}{c} 6 \\ 6 \\ 7 \end{array}$			
A	About Open Grid Scheduler/Grid Engine	9			
в	About Environment Modules	9			
С	System Requirements				

#### 1 Overview

The MapReduce Evaluator (MREv) is an evaluation tool which can be used to extract valuable information about the performance, scalability and resource efficiency of HPC-oriented MapReduce solutions. It allows to compare several frameworks by means of different workloads, including micro-benchmarks and real-world applications.

MREv uses multiple user-defined parameters to unify the configuration the solutions, ensuring a fair comparison between them. In each experiment, the user can select the workloads and the solutions to be run. Several cluster sizes can be used in order to check the scalability of the frameworks and ensure an optimal use of the nodes of the system. The user can also determine the number of times each workload is executed in order to obtain statistical information.

#### 2 Features

This section discusses the user-defined parameters, solutions and benchmarks currently available in MREv. It also describes the main behaviour of the execution of the experiments.

#### 2.1 User-defined parameters

Table 1 shows the configuration parameters currently available in MREv. They are classified depending on whether they affect the configuration of the solutions, the experiments to run or the input data sets of the workloads.

System dependent	Experiment dependent	Workload dependent				
Mappers per node	Benchmarks	RandomWriter/Teragen data size				
Reducers per node	Cluster sizes	TestDFSIO: number of files				
Java heap size (slave)	Solutions	TestDFSIO: file size				
Java heap size (master)	Number of executions	PageRank: number of iterations				
HDFS block size		Bayes: input directory				
HDFS replication factor						
Temporary directory						
SSD optimization						
GbE interface						
IPoIB interface						
Hadoop specific paramete	Hadoop specific parameters					
io.sort.factor						
io.sort.mb						
shuffle.parallelcopies						
Mahout specific parameters						
Mahout heap size						

 Table 1: Available MREv configuration parameters

#### 2.2 Solutions and benchmarks

Table 2 and 3 show the frameworks, and the benchmarks, respectively, currently supported by MREv. All benchmark are available for Hadoop-based solutions, although DataMPI only

supports WordCount, Sort and TeraSort, provided with the distribution. Benchmarks for Spark are still under development.

Solution	Release Date	Interconnect
Hadoop-2.5.1-GBE	12/09/2014	Gigabit Ethernet
Hadoop-2.5.1-IPoIB	12/09/2014	InfiniBand (IPoIB)
Hadoop-2.5.1-UDA	03/09/2014	InfiniBand (RDMA & IPoIB)
Hadoop-2.4.1-GBE	30/06/2014	Gigabit Ethernet
Hadoop-2.4.1-IPoIB	30/06/2014	InfiniBand (IPoIB)
Hadoop-2.4.1-UDA	03/09/2014	InfiniBand (RDMA & IPoIB)
Hadoop-1.2.1-GBE	01/08/2013	Gigabit Ethernet
Hadoop-1.2.1-IPoIB	01/08/2013	InfiniBand (IPoIB)
Hadoop-1.2.1-UDA	07/06/2013	InfiniBand (RDMA & IPoIB)
RDMA-Hadoop-0.9.9	31/03/2014	InfiniBand (RDMA)
RDMA-Hadoop-2-0.9.5	26/11/2014	InfiniBand (RDMA)
$DataMPI-0.6.0-HDFS-GBE^{a}$	16/04/2014	InfiniBand (RDMA) & Gigabit Ethernet
DataMPI-0.6.0-HDFS-IPoIB <sup>a</sup>	16/04/2014	InfiniBand (RDMA & IPoIB)
Spark-1.1.0-YARN-GBE	11/09/2014	Gigabit Ethernet
Spark-1.1.0-YARN-IPoIB	11/09/2014	InfiniBand (IPoIB)

Table 2: Supported frameworks

<sup>a</sup> DataMPI uses HDFS (Hadoop 1.2.1) as distributed filesystem

Micro-benchmarks					
TestDFSIO	Tests the read and write throughput of HDFS by generating a large number				
	of tasks performing reads and writes simultaneously				
Wordcount	Counts the number of times each word appears in the input text data set,				
	which is set up using the RandomTextWriter data generator				
Sort	Sorts the input text data set, also generated by RandomTextWriter				
TeraSort	Sorts 100B-sized $\langle key, value \rangle$ tuples, generated by the TeraGen data				
	generator. Each key is 10B-sized and each value is 90B-sized				
Real-world Applications					
PageRank	Ranks websites by counting the number and quality of the links to each one.				
-	Developed by Google, it is used to obtain Google search results				
Bayes	Performs a classification algorithm, based on Bayes' Theorem				
Other					
Command	Opens a shell where the user can type actions, which is useful to perform				
	user-defined workloads and interact with other Hadoop components like				
	HDFS.				

### 3 Example

This section describes a practical use case of MREv, including the configuration of user-defined parameters, the execution of the experiments and some comments about the provided results.

#### 3.1 Configuration of the experiments

The configuration of a experiment affects the following files:

- system-conf.sh
- experiment-conf.sh
- $\bullet~{\rm solutions.lst}$
- benchmarks.lst
- cluster\_sizes.lst

**Environment variables** The directory where these files are available can be set by the EXP\_DIR variable. If this variable is not set, the value taken by default is \$MREv\_HOME/experiment. The directory where MREv will write the results of the experiment can also be configured by using the OUT\_DIR variable. If this variable is not set, the value taken by default is \$PWD/MREv\_OUT. Finally, the HOSTFILE variable must be set, which contains the compute nodes. The first line of the file will be the master, and the remaining lines will be the slaves. If this variable is not set, the value taken by default is \$EXP\_DIR/hostfile.

```
export EXP_DIR=$HOME/terasort-experiment
export OUT_DIR=$HOME/terasort-out
export HOSTFILE=$HOME/hostfile
```

**system-conf.sh** This file contains the parameters related to the system where MREv is being run.

```
#!/bin/sh
```

```
export TMP_DIR=/scratch/$USER # Directory used to store local data in each node
export SSD="false" # Enable SSD optimization (only applies to RDMA-Hadoop)
export GBE_INTERFACE="eth1" # GbE interface to use in the nodes
export IPOIB_INTERFACE="ib0" # IPoIB interface to use in the nodes
export MAPPERS_PER_NODE=7 # Maximum number of map tasks per node
export REDUCERS_PER_NODE=7 # Maximum number of reduce tasks per node
export HEAPSIZE=$((3*1024)) # Heap volume size per map/reduce task (MB)
export MASTER_HEAPSIZE=$((16*1024)) # Heap volume size per master daemon (MB)
export BLOCKSIZE=$((64*1024*1024)) # HDFS block size (Bytes)
#Hadoop specific parameters
export IO_SORT_FACTOR=100 # Number of streams to merge at once while sorting files
export IO_SORT_MB=$(( $HEAPSIZE / 3 )) # Total amount of buffer memory to use while
    sorting files (MB)
export SHUFFLE_PARALLELCOPIES=20 # Default number of parallel transfers run by reduce
    during the copy(shuffle) phase
#MAHOUT
export MAHOUT_HEAPSIZE=$((32*1024)) # Heap volume size for Mahout master process (MB)
```

**experiment-conf.sh** This file sets the problem size of the benchmark and the number of times each one is executed.

#!/bin/sh
export NUM\_EXECUTIONS=3 # Number of times each benchmark is executed
#Wordcount, sort & terasort
export DATASIZE=\$((128 \* 1024 \* 1024 \* 1024)) # Size of each input dataset (Bytes)
#TestDFSIO
export DFSIO\_N\_FILES=100 # Number of files to generate

export DFSI0\_FILE\_SIZE=100 # Size of each file (MB)
#PageRank
export PAGERANK\_ITERATIONS=10 # Number of iterations to obtain the results
#Bayes
export BAYES\_INPUT=\$PWD/wikixml # Input data set (optional)

solutions.lst This file contains the solutions to be used in the experiment.

#Hadoop-1.2.1-GBE #Hadoop-1.2.1-IPoIB #Hadoop-1.2.1-UDA #Hadoop-2.4.1-GBE #Hadoop-2.4.1-IPoIB #Hadoop-2.5.1-GBE Hadoop-2.5.1-IPoIB Hadoop-2.5.1-UDA RDMA-Hadoop-0.9.9 #RDMA-Hadoop-0.9.9 #RDMA-Hadoop-2-0.9.5 DataMPI-0.6.0-HDFS-GBE #DataMPI-0.6.0-HDFS-IPoIB #Spark-1.1.0-YARN-GBE #Spark-1.1.0-YARN-IPoIB

benchmarks.lst This file contains the benchmarks to be used in the experiment.

#testdfsio # Tests the read and write throughput of HDFS
#wordcount # Counts the number of times each word appears in the input data set
#sort # Sorts the input data set
terasort # Sorts 100B-sized < key, value > tuples
#pagerank # Ranks websites by counting the number and quality of the links to each one
#bayes # Performs a classification algorithm, based on Bayes' Theorem
#command # Opens a shell where the user can type actions

**cluster\_sizes.lst** This file contains the cluster sizes with which the user wants to run the experiments. Additionally, the cluster size can be set to the maximum number of nodes available.

#3 5 9 13 #MAX

#### 3.2 Execution

The following command starts the experiments:

bash MREv/bin/run.sh

#### 3.3 Results

The results from the execution will be found in the **\$OUT\_DIR** directory, having the structure shown in Figure 1.

#### 3.3.1 Performance

The performance results in terms of time are available in the graphs subdirectory. For example, for the TeraSort benchmark, they can be found in the terasort-out/graphs/terasort.eps file. For each cluster size, the graph includes the average, maximum and minimum execution times taken by each framework to perform the workload.

#### 3.3.2 Resource utilization

The resource utilization results from the execution of a benchmark can be found at the {cluster\_size}/{framework}/{benchmark}\_{num\_execution}/stat\_records subdirectory. For example, the values of the first execution of TeraSort using Hadoop-2.5.1-IPoIB on 13 nodes are in terasort-out/13/Hadoop-2.5.1-IPoIB/terasort\_1/stat\_records. This directory contains one subdirectory for the values of each cluster node, plus another one for the average values among the slave nodes. The resource utilization graphs include CPU utilization values (cpu\_stat.eps), CPU load values (cpu\_load\_stat.eps) during the last minute, memory usage values (mem\_stat.eps), disk read/write values (dsk\_sda\_rw\_stat.eps), disk utilization values (dsk\_sda\_util\_stat.eps) and network send/recv values (net\_eth1\_stat.eps, net\_ib0\_stat.eps). Disks (sda) and network interfaces (eth1, ib0) are automatically detected by MREv. For some resources, like CPU utilization, there are different visualization modes that allow to see the results individually (with lines, cpu\_stat.eps) or as a whole (with stacked values, cpu\_stat\_stacked.eps).

terasort-out				
_ logExecution log				
summary Experiments configuration and main results				
5 Output directory for cluster size 5				
Hadoop-2.5.1-GBE Output directory for Hadoop-2.5.1-GBE				
Hadoop-2.5.1-IPoIBOutput directory for Hadoop-2.5.1-IPoIB				
$\_$ terasort_1Output directory for the $1^{st}$ execution of TeraSort				
elapsed_time				
output				
stat_recordsStatistics directory				
logStat graphs generation log				
avgAverage statistics directory				
cpu_stat.eps CPU utilization results graph				
cpu_stat_stacked.eps CPU utilization results graph (stacked values)				
cpu_load_stat.epsCPU load results graph				
dsk_sda_rw_stat.eps Disk read/write results graph				
dsk_sda_util_stat.epsDisk utilization results graph				
mem_stat.epsMemory results graph				
net_eth1_stat.eps GBE network results graph				
net_ib0_stat.epsIPoIB network results graph				
_ cpu_stat.datCPU results data file				
_node-0Node 0 (master) statistics directory				
_node-1Node 1 (slave) statistics directory				
$\_$ terasort_2 Output directory for the $2^{nd}$ execution of TeraSort				
Let $a_{-} \cdots$ Let $a_{-} terasort_3 \dots$ Output directory for the $3^{rd}$ execution of TeraSort				
Hadoop-2.5.1-UDAOutput directory for Hadoop-2.5.1-UDA				
RDMA-Hadoop-0.9.9Output directory for RDMA-Hadoop-0.9.9				
<b>•</b> • • •				
DataMPI-0.6.0-HDFS-GBE Output directory for DataMPI-0.6.0-HDFS-GBE				
■- · · ·				
9 Output directory for cluster size 9				
<b>•</b> · · · ·				
_ 13Output directory for cluster size 13				
_ graphsPerformance graphs directory				
_logGraph generation log				
_terasort.eps Time results for the TeraSort benchmark (graph)				
_terasort.datTime results for the TeraSort benchmark (data file)				

Figure 1: MREv output directory structure

## A About Open Grid Scheduler/Grid Engine

As most supercomputers use a batch-queuing system for distributed resource management, MREv is aware of the environment variables and connection constraints that are typically present in these cases. The correct behaviour of MREv under this kind of systems has been tested with the Open Grid Scheduler/GE (OGS/GE).

MREv will detect the PE\_HOSTFILE environment and use it to read the compute nodes. In this case, no HOSTFILE variable will be needed, although it can also be set. Moreover, the ssh connections used to launch DataMPI and Hadoop daemons do not work properly under OGS/GE, so MREv modifies them to enable their execution.

## **B** About Environment Modules

MREv is aware of the use of Modules for dynamically modifying the user's environment. If available, MREv will use it for loading the Java and MPI environment variables.

# C System Requirements

The following packages need to be installed:

- Gnuplot 4.4
- $\bullet\,$ Java JRE
- MPI  $^1$

 $<sup>^1\</sup>mathrm{DataMPI}$  has been tested using Mvapich2