

MAPREDUCE & PIG TUTORIAL

Hands-on Session

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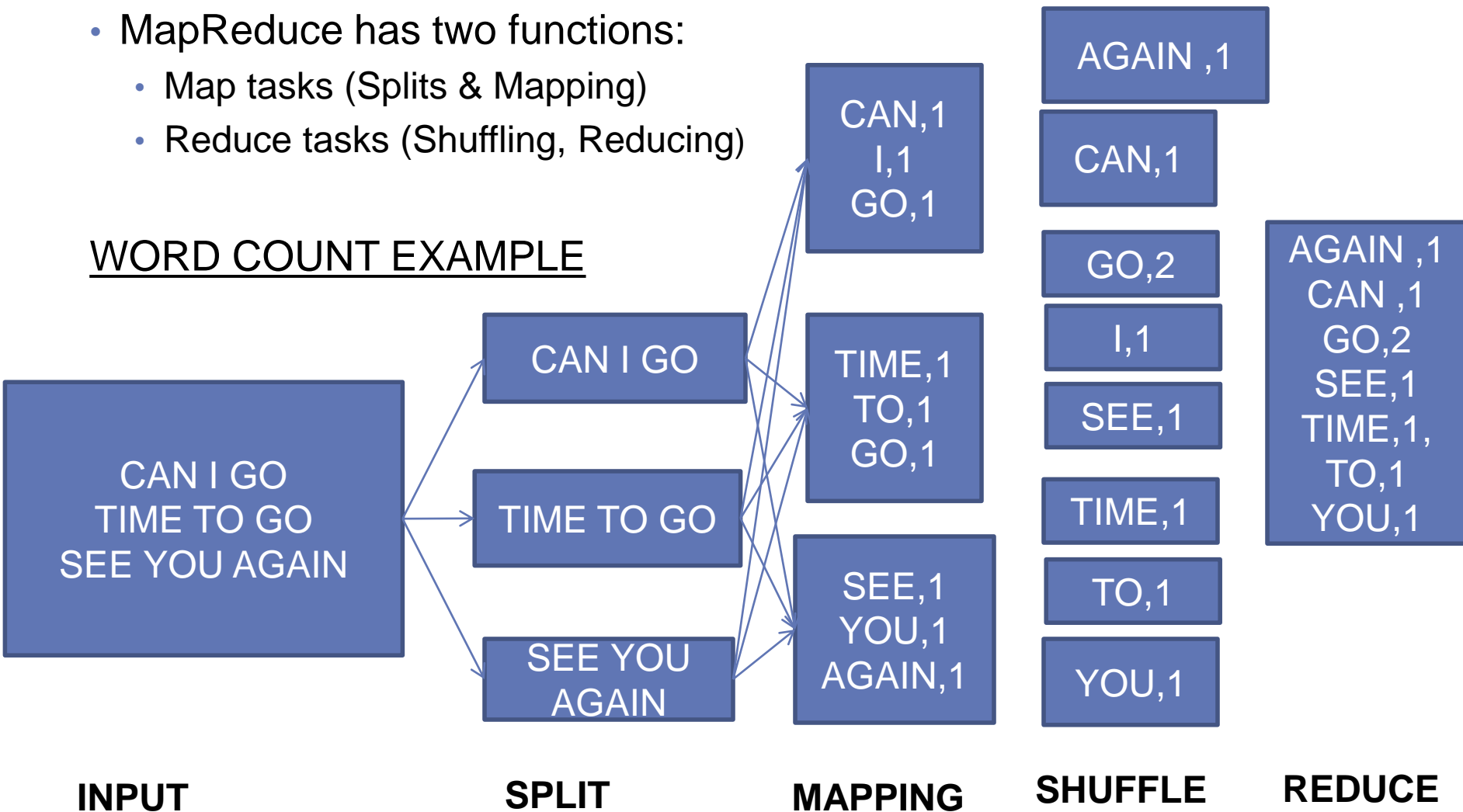
MAPREDUCE

- MapReduce is a programming model. It is a specialization of the *split-apply-combine* strategy for data analysis.
- Hadoop's MapReduce implementation is based on Google's paper : "MAPREDUCE: SIMPLIFIED DATA PROCESSING ON LARGE CLUSTERS" by Jeffrey Dean and Sanjay Ghemawat in 2004.
- Google's proprietary MapReduce system ran on the Google File System (GFS).
- MapReduce leverages HDFS to perform high performance batch processing.

How MapReduce Works?

- MapReduce has two functions:
 - Map tasks (Splits & Mapping)
 - Reduce tasks (Shuffling, Reducing)

WORD COUNT EXAMPLE



MAPREDUCE - Run WordCount

- Start cloudera quick start

```
docker run --hostname=quickstart.cloudera --privileged=true -t -i --  
publish-all=true -p 8888:8888 -p 8080:80 -p 50070:50070 -p 8088:8088 -p  
50075:50075 -p 8032:8032 -p 8042:8042 -p 19888:19888  
cloudera/quickstart /usr/bin/docker-quickstart
```

Port	Purpose
8088	Yarn (MRv2) - job tracker
8032	ResourceManager
50070	Name node web interface
50075	Data node
8042	NodeManager
19888	JobHistory Server

MAPREDUCE - Run WordCount

- Copy text file to HDFS.

```
hadoop fs -mkdir DATA
```

```
docker cp E:/sample1.txt <containerid>:/tmp/sample1.txt
```

```
docker cp E:/sample2.txt <containerid>:/tmp/sample2.txt
```

```
hadoop fs -copyFromLocal /tmp/sample1.txt DATA/sample1.txt
```

```
hadoop fs -copyFromLocal /tmp/sample2.txt DATA/sample2.txt
```

- Copy WordCount java to Docker .

```
docker cp e:/MSc_Datascience/BigDataHadoop/WordCount.java  
<containerid>:/tmp/WordCount.java
```

- https://docs.cloudera.com/documentation/other/tutorial/CDH5/topics/ht_wordcount1_source.html

MAPREDUCE - Run WordCount

- Compile java class & create jar

mkdir -p build

**javac -cp /usr/lib/hadoop/*:/usr/lib/hadoop-mapreduce/*
/tmp/WordCount1.java -d build -Xlint**

```
Using CATALINA_PID: /var/run/solr/solr.pid
Started Impala Catalog Server (catalogd) : [ OK ]
Started Impala Server (impalad): [ OK ]
root@quickstart /l# hadoop fs -mkdir DATA
root@quickstart /l# hadoop fs -copyFromLocal /tmp/sample1.txt DATA/sample1.txt
root@quickstart /l# hadoop fs -copyFromLocal /tmp/sample2.txt DATA/sample2.txt
root@quickstart /l# mkdir -p build
root@quickstart /l# javac -cp /usr/lib/hadoop/*:/usr/lib/hadoop-mapreduce/* /tm
p/WordCount1.java -d build -Xlint
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/jaxb-api.jar": no su
ch file or directory
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/activation.jar": no
such file or directory
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/jsr173_1.0_api.jar":
no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/jaxb1-impl.jar": no
such file or directory
4 warnings
root@quickstart /l#
```

jar -cvf wordcount.jar -C build/ .

```
root@quickstart /l# jar -cvf wordcount.jar -C build/ .
added manifest
adding: WordCount1$Map.class(in = 2192) (out= 982)(deflated 55%)
adding: WordCount1$Reduce.class(in = 1630) (out= 687)(deflated 57%)
adding: WordCount1.class(in = 1959) (out= 986)(deflated 49%)
root@quickstart /l#
```

MAPREDUCE - Run WordCount

- Execute Mapreduce Word Count job .

hadoop jar wordcount.jar WordCount1 DATA DATA2

```
[root@quickstart /]# hadoop jar wordcount.jar WordCount1 DATA DATA2
19/12/25 14:37:10 INFO client.RMProxy: Connecting to ResourceManager at /0.0.0.0:8032
19/12/25 14:37:11 INFO input.FileInputFormat: Total input paths to process : 2
19/12/25 14:37:12 INFO mapreduce.JobSubmitter: number of splits:2
19/12/25 14:37:12 INFO mapreduce.JobSubmitter: Submitting tokens for job: job_1577284264785_0001
19/12/25 14:37:13 INFO impl.YarnClientImpl: Submitted application application_1577284264785_0001
19/12/25 14:37:13 INFO mapreduce.Job: The url to track the job: http://quickstart.t.cloudera:8088/proxy/application_1577284264785_0001/
19/12/25 14:37:13 INFO mapreduce.Job: Running job: job_1577284264785_0001
19/12/25 14:37:26 INFO mapreduce.Job: Job job_1577284264785_0001 running in uber mode : false
19/12/25 14:37:26 INFO mapreduce.Job: map 0% reduce 0%
19/12/25 14:37:43 INFO mapreduce.Job: map 100% reduce 0%
19/12/25 14:37:52 INFO mapreduce.Job: map 100% reduce 100%
19/12/25 14:37:53 INFO mapreduce.Job: Job job_1577284264785_0001 completed successfully
19/12/25 14:37:53 INFO mapreduce.Job: Counters: 49
File System Counters
  FILE: Number of bytes read=96
  FILE: Number of bytes written=340703
  FILE: Number of read operations=0
  FILE: Number of large read operations=0
  FILE: Number of write operations=0
  HDFS: Number of bytes read=286
  HDFS: Number of bytes written=39
  HDFS: Number of read operations=9
  HDFS: Number of large read operations=0
Job Counters
  Number of write operations=2
  Launched reduce tasks=1
  Total time spent by all maps in occupied slots (ms)=27727
  Total time spent by all map tasks (ms)=27727slots (ms)=6612
  Total vcore-seconds taken by all map tasks=27727
  Total megabyte-seconds taken by all map tasks=28392448
Map-Reduce Framework
  write-seconds taken by all reduce tasks=6770688
  Map output records=8
  Map output materialized bytes=102
```

```
  HDFS: Number of read operations=9
  HDFS: Number of large read operations=0
Job Counters
  Number of write operations=2
  Launched reduce tasks=1
  Total time spent by all maps in occupied slots (ms)=27727
  Total time spent by all map tasks (ms)=27727slots (ms)=6612
  Total vcore-seconds taken by all map tasks=27727
  Total megabyte-seconds taken by all map tasks=28392448
Map-Reduce Framework
  write-seconds taken by all reduce tasks=6770688
  Map output records=8
  Map output materialized bytes=102
  Input split bytes=246
  Combine input records=0
  Combine output records=0
  Reduce input groups=5
  Reduce shuffle bytes=102
  Reduce input records=8
  Reduce output records=5
  Spilled Records=16
  Shuffled Maps =2
  Failed Shuffles=0
  Merged Map outputs=2
  GC time elapsed (ms)=278
  CPU time spent (ms)=3250
  Physical memory (bytes) snapshot=720171008
  Virtual memory (bytes) snapshot=4096000192
  Total committed heap usage (bytes)=624427008
Shuffle Errors
  BAD_ID=0
  CONNECTION=0
  IO_ERROR=0
  WRONG_LENGTH=0
  WRONG_MAP=0
  WRONG_REDUCE=0
File Input Format Counters
  Bytes Read=40
File Output Format Counters
  Bytes Written=39
[root@quickstart /]#
```

MAPREDUCE - Run WordCount

- Open Yarn web page in browser
<http://192.168.99.100:8088/cluster>

<http://localhost:8088/cluster>

← → ↻ 🏠 ⓘ Not secure | 192.168.99.100:8088/cluster ☆

📱 Apps 🔄



All Applications

▼ Cluster

- About
- Nodes
- Applications
 - NEW
 - NEW SAVING
 - SUBMITTED
 - ACCEPTED
 - RUNNING
 - FINISHED
 - FAILED
 - KILLED
- Scheduler

► Tools

Cluster Metrics

Apps Submitted	Apps Pending	Apps Running	Apps Completed	Containers Running	Memory Used	Memory Total	Memory Reserved	VCores Used	VCores Total	VCores Reserved	Active Nodes	Decommissioned Nodes
1	0	0	1	0	0 B	8 GB	0 B	0	8	0	1	0

User Metrics for dr.who

Apps Submitted	Apps Pending	Apps Running	Apps Completed	Containers Running	Containers Pending	Containers Reserved	Memory Used	Memory Pending	Memory Reserved	VCores Used
0	0	0	1	0	0	0	0 B	0 B	0 B	0

Show 20 entries

ID	User	Name	Application Type	Queue	StartTime	FinishTime	State	FinalStatus	Running Containers	Allocated CPU VCores
application_1577284264785_0001	root	wordcount	MAPREDUCE	root.root	Wed Dec 25 20:07:12	Wed Dec 25 20:07:51	FINISHED	SUCCEEDED	N/A	N/A

MAPREDUCE - Run WordCount

- Click on JOB ID

Cluster

- About
- Nodes
- Applications
 - NEW
 - NEW SAVING
 - SUBMITTED
 - ACCEPTED
 - RUNNING
 - FINISHED
 - FAILED
 - KILLED
- Scheduler

Tools

Application Overview

User: root
Name: wordcount
Application Type: MAPREDUCE
Application Tags:
State: FINISHED
FinalStatus: SUCCEEDED
Started: Wed Dec 25 14:37:12 +0000 2019
Elapsed: 38sec
Tracking URL: [History](#)
Diagnostics:

Application Metrics

Total Resource Preempted: <memory:0, vCores:0>
Total Number of Non-AM Containers Preempted: 0
Total Number of AM Containers Preempted: 0
Resource Preempted from Current Attempt: <memory:0, vCores:0>
Number of Non-AM Containers Preempted from Current Attempt: 0
Aggregate Resource Allocation: 137655 MB-seconds, 86 vcore-seconds

ApplicationMaster			
Attempt Number	Start Time	Node	Logs
1	Wed Dec 25 14:37:12 +0000 2019	quickstart.cloudera:8042	logs

- To View Node Manager
- <http://192.168.99.100:8042/node/node>

MAPREDUCE - Run WordCount

- View Job history

<http://192.168.99.100:19888/jobhistory>

- Application
- ▾ Job
 - [Overview](#)
 - [Counters](#)
 - [Configuration](#)
 - [Map tasks](#)
 - [Reduce tasks](#)
- Tools

Job Overview

Job Name:	wordcount
User Name:	root
Queue:	root.root
State:	SUCCEEDED
Uberized:	false
Submitted:	Wed Dec 25 14:37:12 UTC 2019
Started:	Wed Dec 25 14:37:25 UTC 2019
Finished:	Wed Dec 25 14:37:51 UTC 2019
Elapsed:	25sec
Diagnostics:	
Average Map Time	13sec
Average Shuffle Time	5sec
Average Merge Time	0sec
Average Reduce Time	0sec

ApplicationMaster			
Attempt Number	Start Time	Node	Logs
1	Wed Dec 25 14:37:18 UTC 2019	quickstart.cloudera:8042	logs

Task Type	Total	Complete
Map	2	2
Reduce	1	1

Attempt Type	Failed	Killed	Successful
Maps	0	0	2
Reduces	0	0	1

MAPREDUCE - Run WordCount

- Open DATA2 folder in Namenode to view mapreduce output

<http://192.168.99.100:50070/explorer.html#/user/root/DATA2>

Hadoop Overview Datanodes Snapshot Startup Progress Utilities ▾

Browse Directory

/user/root/DATA2

Go!

Permission	Owner	Group	Size	Last Modified	Replication	Block Size	Name
-rw-r--r--	root	supergroup	0 B	Wed Dec 25 20:07:51 +0530 2019	1	128 MB	_SUCCESS
-rw-r--r--	root	supergroup	39 B	Wed Dec 25 20:07:50 +0530 2019	1	128 MB	part-r-00000

MAPREDUCE - Run WordCount

- Input file

This is sample1 text

This is sample2 text

- Final Output

```
1 This 2
2 is 2
3 sample1 1
4 sample2 1
5 text 2
6
```

Apache PIG

- PIG is an abstraction over MapReduce.
- It uses high level language - Pig Latin.
- PIG Latin is easy to learn if programmer knows procedural language. Programmer can do MapReduce task without having to write complex Java code.
- Pig has many built-in functions & data types for doing operations like joins, filters, ordering, grouping. Thus reducing code length.
- Apache PIG has a internal component called PIG engine.
- PIG engine converts Pig Latin scripts to Map Reduce Task.
- Apache Pig was developed as a research project at Yahoo in 2006. First release of Apache Pig came out in 2008.

Apache PIG – Run Mode

- Pig can be run in various modes:
 - Local mode : Run PIG in local host and file system
 - MapReduce mode : Run PIG on Hadoop cluster and HDFS. It is the default mode.
 - Interactive mode : Run Pig using Grunt shell.
 - Batch mode : Run Pig using PIG script.

	Interactive Mode	Batch Mode
Local Mode	<pre>\$ pig -x local grunt> <pig Latin statement></pre>	<pre>\$ pig -x local ScriptFile.pig</pre>
MapReduce Mode	<pre>\$ pig grunt> <pig Latin statement></pre>	<pre>\$ pig ScriptFile.pig</pre>
	<pre>\$ pig -x mapreduce grunt> <pig Latin statement></pre>	<pre>\$ pig -x mapreduce ScriptFile.pig</pre>

PIG Latin Statement

- Pig Latin statement structure is:
- **LOAD** statement to read data from the file system.
- **Transformation** statements to process the data.
- **DUMP** statement to view results or **STORE** statement to save the results.
- **Load Operator**
Relation_name = LOAD 'Input file path' USING function as schema;

PIG Latin Statement

Transformation statements :

- [FILTER](#) operator to remove unwanted rows of data.
- [FOREACH](#) , [GENERATE](#) operator to perform data transformations on columns of data.
- [GROUP](#) operator to group data in a single relation.
- [COGROUP](#), [inner JOIN](#), and [outer JOIN](#) operators to group or join data in two or more relations.
- [ORDER](#) operator to sort data.
- [UNION](#) operator to merge the contents of two or more relations.
- [SPLIT](#) operator to partition the contents of a relation into multiple relations.

Exercise

- Find average sepal length for each flower class in IRIS DATASET

- Reference :

<http://archive.cloudera.com/cdh5/cdh/5/pig-0.12.0-cdh5.15.0/func.html>

<http://archive.cloudera.com/cdh5/cdh/5/pig-0.12.0-cdh5.15.0/udf.html>

Run PIG

- **Start Cloudera server**

```
docker run --hostname=quickstart.cloudera --privileged=true -t -i --  
publish-all=true -p 8888:8888 -p 8080:80 -p 50070:50070 -p 8088:8088  
-p 50075:50075 -p 8032:8032 -p 8042:8042 -p 19888:19888  
cloudera/quickstart /usr/bin/docker-quickstart
```

- **Copy Text file to docker container**

```
docker cp E:/iris.txt <containerid>:/tmp/iris.txt
```

- **Copy Text file to HDFS**

```
hadoop fs -mkdir DATA
```

```
hadoop fs -copyFromLocal /tmp/iris.txt DATA/iris.txt
```

#view output

```
hdfs dfs -cat DATA/iris.txt
```

Run PIG

- Start PIG
- type pig and press enter to get PIG command prompt

```
flower = LOAD 'DATA/iris.txt' USING PigStorage(',') as ( sepal_length:int,  
sepal_width:int, petal_length:int, petal_width:int, flower_class:chararray);
```

```
DUMP flower;
```

```
B = GROUP flower BY flower_class;  
DUMP B;
```

```
Result = FOREACH B GENERATE flower.flower_class,  
AVG(flower.sepal_length);
```

```
DUMP Result;
```

OUTPUT

```
Success!

Job Stats (time in seconds):
JobId      Maps      Reduces  MaxMapTime      MinMapTime      AvgMapTime      MedianMa
pTime     MaxReduceTime  MinReduceTime  AvgReduceTime   MedianReductime  A
lias      Feature Outputs
job_1581917396709_0001  1      0      47      47      47      47      n/a      n
/a        n/a        n/a      flower  MAP_ONLY  hdfs://quickstart.cloudera:8020/
tmp/tmp1319724132/tmp-899714232,

Input(s):
Successfully read 151 records (4925 bytes) from: "hdfs://quickstart.cloudera:8020/user/root/DATA/iris.txt"

Output(s):
Successfully stored 151 records (4088 bytes) in: "hdfs://quickstart.cloudera:8020/tmp/tmp1319724132/tmp-899714232"

Counters:
Total records written : 151
Total bytes written : 4088
Spillable Memory Manager spill count : 0
Total bags proactively spilled: 0
Total records proactively spilled: 0

Job DAG:
job_1581917396709_0001

2020-02-17 05:50:51,141 [main] WARN  org.apache.pig.backend.hadoop.executionengi
ne.mapReduceLayer.MapReduceLauncher - Encountered Warning ACCESSING_NON_EXISTENT
_FIELD 4 time(s).
2020-02-17 05:50:51,144 [main] INFO  org.apache.pig.backend.hadoop.executionengi
ne.mapReduceLayer.MapReduceLauncher - Success!
2020-02-17 05:50:51,161 [main] INFO  org.apache.hadoop.conf.Configuration.deprec
ation - fs.default.name is deprecated. Instead, use fs.defaultFS
2020-02-17 05:50:51,164 [main] INFO  org.apache.hadoop.conf.Configuration.deprec
ation - mapred.job.tracker is deprecated. Instead, use mapreduce.jobtracker.addr
ess
2020-02-17 05:50:51,169 [main] INFO  org.apache.pig.data.SchemaTupleBackend - Ke
y [pig.schematuple] was not set... will not generate code.
2020-02-17 05:50:51,235 [main] INFO  org.apache.hadoop.mapreduce.lib.input.FileI
nputFormat - Total input paths to process: 1
```

OUTPUT

```
(6,3,5,2,Iris-virginica)
(6,3,5,1,Iris-virginica)
(6,3,4,1,Iris-virginica)
(6,3,5,2,Iris-virginica)
(6,3,5,2,Iris-virginica)
(6,3,5,2,Iris-virginica)
(5,2,5,1,Iris-virginica)
(6,3,5,2,Iris-virginica)
(6,3,5,2,Iris-virginica)
(6,3,5,2,Iris-virginica)
(6,2,5,1,Iris-virginica)
(6,3,5,2,Iris-virginica)
(6,3,5,2,Iris-virginica)
(5,3,5,1,Iris-virginica)
(,,,,)
grunt> B = GROUP flower BY flower_class;
2020-02-17 05:53:12,148 [main] INFO org.apache.hadoop.conf.Configuration.deprecation - fs.default.name is deprecated. Instead, use fs.defaultFS
2020-02-17 05:53:12,150 [main] INFO org.apache.hadoop.conf.Configuration.deprecation - mapred.job.tracker is deprecated. Instead, use mapreduce.jobtracker.address
grunt> Result = FOREACH B GENERATE flower.flower_class, AVG(flower.sepal_length);
grunt> DUMP Result;
2020-02-17 05:53:42,813 [main] INFO org.apache.pig.tools.pigstats.ScriptState - Pig features used in the script: GROUP_BY
2020-02-17 05:53:42,826 [main] INFO org.apache.pig.newplan.logical.optimizer.LogicalPlanOptimizer - {RULES_ENABLED=[AddForEach, ColumnMapKeyPrune, DuplicateForEachColumnRewrite, GroupByConstParallelSetter, ImplicitSplitInserter, LimitOptimizer, LoadTypeCastInserter, MergeFilter, MergeForEach, NewPartitionFilterOptimizer, PushDownForEachFlatten, PushUpFilter, SplitFilter, StreamTypeCastInserter], RULES_DISABLED=[FilterLogicExpressionSimplifier, PartitionFilterOptimizer]}
2020-02-17 05:53:42,909 [main] INFO org.apache.pig.backend.hadoop.executionengine.mapReduceLayer.MRCompiler - File concatenation threshold: 100 optimistic? false
2020-02-17 05:53:42,959 [main] INFO org.apache.pig.backend.hadoop.executionengine.mapReduceLayer.MultiQueryOptimizer - MR plan size before optimization: 1
2020-02-17 05:53:42,962 [main] INFO org.apache.pig.backend.hadoop.executionengine.mapReduceLayer.MultiQueryOptimizer - MR plan size after optimization: 1
2020-02-17 05:53:43,080 [main] INFO org.apache.hadoop.yarn.client.RMPProxy - Connecting to ResourceManager at /0.0.0.0:8032
2020-02-17 05:53:43,097 [main] INFO org.apache.pig.tools.pigstats.ScriptState - Pig script settings are added to the job
2020-02-17 05:53:43,190 [main] INFO org.apache.pig.backend.hadoop.executionengi
```


USER DEFINED FUNCTION

- Find Volume Weighted Average Price of a stock per year.

Date	Adj Close	Close	High	Low	Open	Volume
31-12-2007	92.64	92.64	94.37	92.45	93.81	5755200
02-01-2008	96.25	96.25	97.43	94.7	95.35	13858700
03-01-2008	95.21	95.21	97.25	94.52	96.06	9122500
04-01-2008	88.79	88.79	93.4	88.5	93.26	10270000

$$\text{VWAP} = \frac{\text{sum}(\text{Price} * \text{Volume})}{\text{sum}(\text{Volume})}$$

It is a measure of the volume weighted average price at which a stock is traded over the trading horizon.

USER DEFINED FUNCTION

- **Find Volume Weighted Average Price of a stock**

Copy content to docker:

```
docker cp E:/MSc_Datascience/BigDataHadoop/Slides/stock.csv  
<containerid>:/tmp/stock.csv
```

```
docker cp E:/MSc_Datascience/BigDataHadoop/Slides/pig_UDF.py  
<containerid>:/tmp/pig_UDF.py
```

```
docker cp E:/MSc_Datascience/BigDataHadoop/Slides/piggybank-0.15.0.jar  
<containerid>:/tmp/piggybank-0.15.0.jar
```

```
hadoop fs -mkdir DATA
```

```
hadoop fs -copyFromLocal /tmp/stock.csv DATA/stock.csv
```


USER DEFINED FUNCTION

Execute in PIG Interface:

```
REGISTER '/tmp/pig_UDF.py' using jython as myudfs;  
REGISTER '/tmp/piggybank-0.15.0.jar';
```

```
records = LOAD 'DATA/stock.csv' USING  
org.apache.pig.piggybank.storage.CSVExcelStorage(',', 'NO_MULTILINE', 'UNIX',  
'SKIP_INPUT_HEADER') AS
```

```
(Date:datetime,AdjClose:int,Close:int,High:int,Low:int,Open:int,Volume:int);
```

```
record= foreach records GENERATE Volume, Close, GetYear(Date) as Year;
```

```
yearData = GROUP record BY Year;
```

```
vol_wt_avg_price = FOREACH yearData GENERATE  
myudfs.calVWAP(record.Year,record.Volume,record.Close);
```

```
STORE vol_wt_avg_price INTO '/user/root/PRICE';
```

```
hadoop fs -cat /user/root/PRICE/part-r-00000
```

OUTPUT

```
ne.mapReduceLayer.MapReduceLauncher - Success!  
2020-02-19 00:46:09,260 [main] INFO org.apache.hadoop.conf.Configuration.deprec  
ation - fs.default.name is deprecated. Instead, use fs.defaultFS  
2020-02-19 00:46:09,266 [main] INFO org.apache.hadoop.conf.Configuration.deprec  
ation - mapred.job.tracker is deprecated. Instead, use mapreduce.jobtracker.addr  
ess  
2020-02-19 00:46:09,279 [main] INFO org.apache.pig.data.SchemaTupleBackend - Ke  
y [pig.schematuple] was not set... will not generate code.  
2020-02-19 00:46:09,465 [main] INFO org.apache.hadoop.mapreduce.lib.input.FileI  
nputFormat - Total input paths to process : 1  
2020-02-19 00:46:09,472 [main] INFO org.apache.pig.backend.hadoop.executionengi  
ne.util.MapRedUtil - Total input paths to process : 1  
<<(2007,92)>>  
<<(2008,67)>>  
<<(2009,87)>>  
<<(2010,135)>>  
<<(2011,197)>>  
<<(2012,214)>>  
<<(2013,295)>>  
<<(2014,329)>>  
<<(2015,485)>>  
<<(2016,680)>>  
<<(2017,969)>>  
<<(2018,1624)>>  
grunt>
```

QUIZ 5

```
emp_data.txt  
001,Mary,32,Delhi  
002,Ram,33,Bangalore
```

Q) Each row of the 'emp_data' file stored in HDFS contains the id, name, age and city of an employee. Data transformation is performed using PIG script below.

```
emp_data = LOAD 'emp_data.txt' USING PigStorage(',')as (id:int, name:chararray, age:int,  
city:chararray);  
substring_data = FOREACH emp_data GENERATE (id,name), SUBSTRING (city, 0, 3);  
Dump substring_data ;
```

What is the output of the code?

A) (Del)
(Ban)

C) (001,Mary,Del)
(002,Ram, Ban)

B) (1,Del)
(2, Ban)

D) ((1,Mary),Del)
((2,Ram), Ban)

THANK YOU