

TP 02 – MapReduce : Implémentation et Exploration

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1. Décompresser le fichier TP_MapRed.rar fourni et copier le dossier Tp_MapRed dans le dossier local /home/cloudera de votre VM

```
[cloudera@quickstart ~]$ mkdir ~/TP_MapRed
[cloudera@quickstart ~]$ sudo mount -t vmhgfs .host:/TP_MapRed ~/TP_MapRed
[cloudera@quickstart ~]$ ls -la ~/TP_MapRed
total 450616
drwxrwxrwx  1 root    root          4096 Mar 29  2020 .
drwxrwxr-x 28 cloudera cloudera    4096 May  6 06:24 ..
drwxrwxrwx  1 root    root           0 Dec  8  2019 build
-rwxrwxrwx  1 root    root        2278 Sep  1  2015 Makefile
-rwxrwxrwx  1 root    root        1401 Mar  7  2019 maman.txt
-rwxrwxrwx  1 root    root    461369589 Mar 28  2018 Voll.csv
-rwxrwxrwx  1 root    root     23392 Apr 19  2018 vol.csv
-rwxrwxrwx  1 root    root        5164 Apr  3  2018 wordcount.jar
-rwxrwxrwx  1 root    root        4713 Sep  1  2015 WordCount.java
```

2. Créer le dossier HDFS : /user/cloudera/wordcount/input

```
[cloudera@quickstart ~]$ hdfs dfs -mkdir -p /user/cloudera/wordcount/input
[cloudera@quickstart ~]$
```

3. Charger le fichier texte maman.txt dans le dossier HDFS

/user/cloudera/wordcount/input

```
[cloudera@quickstart ~]$ hdfs dfs -put /home/cloudera/TP_MapRed/maman.txt /user/cloudera/wordcount/input
[cloudera@quickstart ~]$ hdfs dfs -ls /user/cloudera/wordcount/input

Found 1 items
-rw-r--r--  1 cloudera cloudera      1401 2025-05-06 06:41 /user/cloudera/wordcount/input/maman.txt
```

4. Exercices Pratiques MapReduce

PARTIE 1 : WordCount et WordTotal

4.1 Exécution du Job WordCount

Le programme WordCount est l'exemple classique d'application MapReduce. Il compte les occurrences de chaque mot dans un ensemble de textes.

1. Se positionner dans le dossier du TP :

```
[cloudera@quickstart ~]$ cd /home/cloudera/TP_MapRed
[cloudera@quickstart TP_MapRed]$
```

2. Exécution de wordcount.jar dont la classe principale est WordCount du package org.myorg :

```
[cloudera@quickstart TP_MapRed]$ hadoop jar wordcount.jar org.myorg.WordCount /user/cloudera/wordcount/input /user/cloudera/w
ordcount/output
25/05/06 06:48:25 INFO client.RMProxy: Connecting to ResourceManager at /6.6.0.0:8032
25/05/06 06:48:28 INFO input.FileInputFormat: Total input paths to process : 1
25/05/06 06:48:29 INFO mapreduce.JobSubmitter: number of splits:1
25/05/06 06:48:30 INFO mapreduce.JobSubmitter: Submitting tokens for job: job_1746535709625_0001
25/05/06 06:48:33 INFO impl.YarnClientImpl: Submitted application application_1746535709625_0001
25/05/06 06:48:34 INFO mapreduce.Job: The url to track the job: http://quickstart.cloudera:8088/proxy/application_17465357096
25_0001/
25/05/06 06:48:34 INFO mapreduce.Job: Running job: job_1746535709625_0001
25/05/06 06:49:16 INFO mapreduce.Job: Job job_1746535709625_0001 running in uber mode : false
25/05/06 06:49:16 INFO mapreduce.Job: map 0% reduce 0%
25/05/06 06:49:41 INFO mapreduce.Job: map 100% reduce 0%
25/05/06 06:50:01 INFO mapreduce.Job: map 100% reduce 100%
25/05/06 06:50:02 INFO mapreduce.Job: Job job_1746535709625_0001 completed successfully
25/05/06 06:50:02 INFO mapreduce.Job: Counters: 49
File System Counters
  FILE: Number of bytes read=1046
  FILE: Number of bytes written=290417
  FILE: Number of read operations=0
  FILE: Number of large read operations=0
  FILE: Number of write operations=0
  HDFS: Number of bytes read=1537
  HDFS: Number of bytes written=1873
  HDFS: Number of read operations=4
  HDFS: Number of large read operations=0
  HDFS: Number of write operations=2
Job Counters
  Launched map tasks=1
  Launched reduce tasks=1
  Data-local map tasks=1
  Total time spent by all maps in occupied slots (ms)=23875
  Total time spent by all reduces in occupied slots (ms)=16103
  Total time spent by all map tasks (ms)=23875
  Total time spent by all reduce tasks (ms)=16103
  Total vcore-milliseconds taken by all map tasks=23875
  Total vcore-milliseconds taken by all reduce tasks=16103
  Total megabyte-milliseconds taken by all map tasks=24448000
  Total megabyte-milliseconds taken by all reduce tasks=16409472
Map-Reduce Framework
  Map input records=37
  Map output records=366
  Map output bytes=3018
  Map output materialized bytes=1646
  Map output materialized bytes=1646
  Input split bytes=136
  Combine input records=366
  Combine output records=143
  Reduce input groups=143
  Reduce shuffle bytes=1646
  Reduce input records=143
  Reduce output records=143
  Spilled Records=286
  Shuffled Maps =1
  Failed Shuffles=0
  Merged Map outputs=1
  GC time elapsed (ms)=446
  CPU time spent (ms)=4948
  Physical memory (bytes) snapshot=362192896
  Virtual memory (bytes) snapshot=3017383936
  Total committed heap usage (bytes)=226627584
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=1401
File Output Format Counters
  Bytes Written=1873
```

3. Afficher le contenu des fichiers résultats dans HDFS :

```
[cloudera@quickstart TP_MapRed]$ hdfs dfs -cat /user/cloudera/wordcount/output/*
.      15
'      2
)      4
,      29
.      1
.      4
abracadabra      1
aile      1
aime      1
amour      4
ange      1
ann      1
apparaît      1
as      1
attentions      1
au      3
avais      2
baguette      1
baisers      1
berceuse      1
bleu      1
bois      1
bouquet      2
bout      1
ces      1
cette      1
ch      1
chancet      1
chant      1
chasse      1
chemine      1
ciel      1
claircit      1
coeur      2
colore      1
connivence      1
coup      1
croyais      1
d      7
dans      4
de      6
depuis      3
des      1
dors      1
```

4.2 Création du Programme WordTotal

```
[cloudera@quickstart TP_MapRed]$ cp WordCount.java WordTotal.java
[cloudera@quickstart TP_MapRed]$
```

Dans cette partie, nous allons adapter WordCount pour compter le nombre total de mots dans les

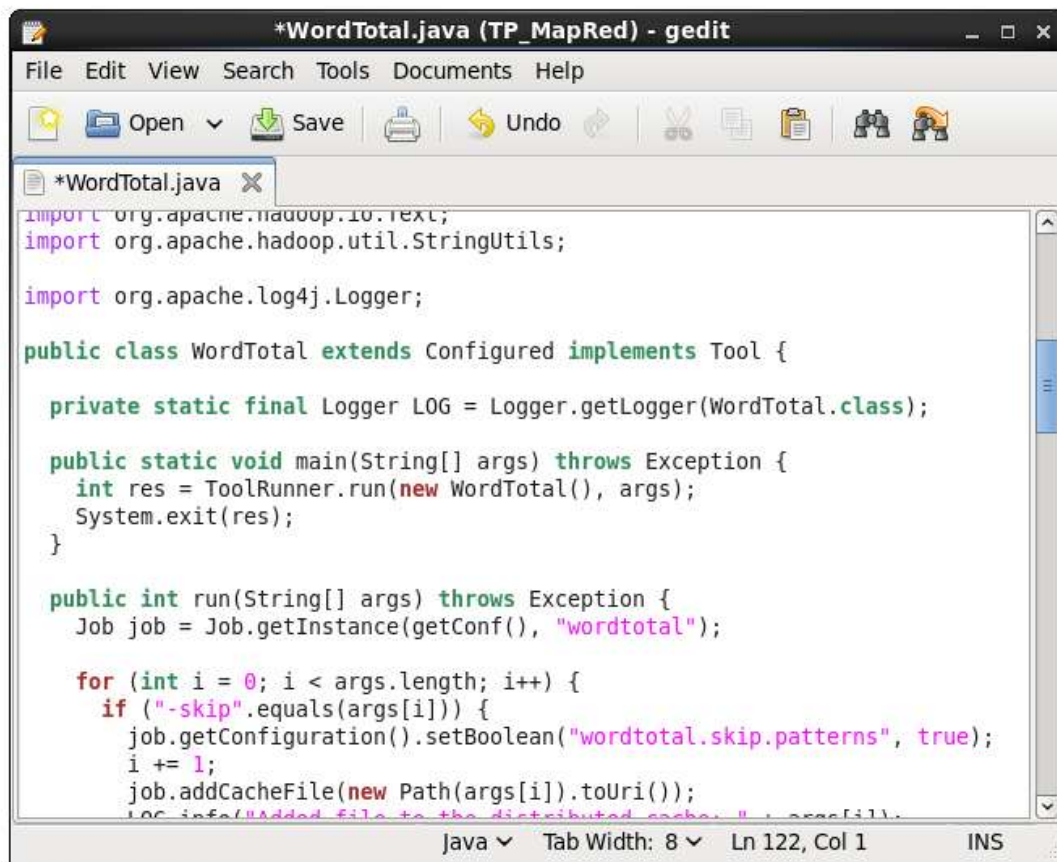
fichiers (et non pas le nombre d'occurrences de chaque mot).

1. Dans le dossier Tp_MapRed, faire une copie de WordCount.java dans WordTotal.java

```
[cloudera@quickstart TP_MapRed]$ cp WordCount.java WordTotal.java
[cloudera@quickstart TP_MapRed]$
```

2. Dans WordTotal.java, remplacer « WordCount » par « WordTotal » et « wordcount » par « wordtotal »

3. Modifier les méthodes Map et Reduce dans WordTotal.java pour calculer le nombre total de mots.



```
*WordTotal.java (TP_MapRed) - gedit
File Edit View Search Tools Documents Help
Open Save Undo
*WordTotal.java X
import org.apache.hadoop.io.Text;
import org.apache.hadoop.util.StringUtils;
import org.apache.log4j.Logger;

public class WordTotal extends Configured implements Tool {
    private static final Logger LOG = Logger.getLogger(WordTotal.class);

    public static void main(String[] args) throws Exception {
        int res = ToolRunner.run(new WordTotal(), args);
        System.exit(res);
    }

    public int run(String[] args) throws Exception {
        Job job = Job.getInstance(getConf(), "wordtotal");

        for (int i = 0; i < args.length; i++) {
            if ("-skip".equals(args[i])) {
                job.getConfiguration().setBoolean("wordtotal.skip.patterns", true);
                i += 1;
                job.addCacheFile(new Path(args[i]).toUri());
                LOG.info("Added file to the distributed cache: " + args[i]);
            }
        }
    }
}
```

Java Tab Width: 8 Ln 122, Col 1 INS

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Indication : Tous les tuples produits par la tâche Map doivent avoir la même clé (par exemple: « Nombre de mots »)

4. Compiler le code source et exécuter votre Job :

```

[cloudera@quickstart TP_Mapped]$ rm -rf build
[cloudera@quickstart TP_Mapped]$ mkdir build
[cloudera@quickstart TP_Mapped]$ javac -cp /usr/lib/hadoop/*:/usr/lib/hadoop-mapreduce/* WordTotal.java -d build -Xlint
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/jaxb-api.jar": no such 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/jax-173_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
WordTotal.java:12: warning: [rawtypes] found raw type: Mapper.Context
    protected void setup(Mapper.Context context) throws IOException, InterruptedException {
                        ^
  missing type arguments for generic class Mapper<KEYIN,VALUEIN,KEYOUT,VALUEOUT>.Context
  where KEYIN,VALUEIN,KEYOUT,VALUEOUT are type-variables:
    KEYIN extends Object declared in class Mapper
    VALUEIN extends Object declared in class Mapper
    KEYOUT extends Object declared in class Mapper
    VALUEOUT extends Object declared in class Mapper
3 warnings
[cloudera@quickstart TP_Mapped]$ jar -cvf wordtotal.jar -C build /
added manifest
adding: org/lin = 81 (out= 0)(stored 0%)
adding: org/myorg/lin = 0 (out= 0)(stored 0%)
adding: org/myorg/WordTotal$Map.class(in = 3982) (out= 1363)(deflated 52%)
adding: org/myorg/WordTotal$Reduce.class(in = 1647) (out= 690)(deflated 58%)
adding: org/myorg/WordTotal.class(in = 2765) (out= 1394)(deflated 49%)
[cloudera@quickstart TP_Mapped]$ hdfs dfs -rm -r -f /user/cloudera/wordcount/output
Deleted /user/cloudera/wordcount/output
[cloudera@quickstart TP_Mapped]$ hadoop jar wordtotal.jar org.myorg.WordTotal /user/cloudera/wordcount/input /user/cloudera/wordcount/output
25/05/06 07:10:51 INFO Client.RMProxy: Connecting to ResourceManager at /0.0.0.0:8032
25/05/06 07:10:52 INFO input.FileInputFormat: Total input paths to process : 1
25/05/06 07:10:52 WARN hdfs.DFSClient: Caught exception
java.lang.InterruptedException
    at java.lang.Object.wait(Native Method)
    at java.lang.Thread.join(Thread.java:1281)
    at java.lang.Thread.join(Thread.java:1255)
    at org.apache.hadoop.hdfs.DFSOutputStream$DataStreamer.closeResponder(DFSOutputStream.java:967)
    at org.apache.hadoop.hdfs.DFSOutputStream$DataStreamer.endBlock(DFSOutputStream.java:765)
    at org.apache.hadoop.hdfs.DFSOutputStream$DataStreamer.run(DFSOutputStream.java:894)
25/05/06 07:10:52 INFO mapreduce.JobSubmitter: number of splits:1
25/05/06 07:10:53 INFO mapreduce.JobSubmitter: Submitting tokens for job: job_1746535709625_0002
25/05/06 07:10:53 INFO impl.YarnClientImpl: Submitted application application_1746535709625_0002
25/05/06 07:10:53 INFO mapreduce.Job: The url to track the job: http://quickstart.cloudera:8088/prxy/application_1746535709625_0002/
25/05/06 07:10:53 INFO mapreduce.Job: Running job: job_1746535709625_0002
25/05/06 07:11:05 INFO mapreduce.Job: Job job_1746535709625_0002 running in uber mode : false
25/05/06 07:11:05 INFO mapreduce.Job: map 0% reduce 0%
25/05/06 07:11:23 INFO mapreduce.Job: map 100% reduce 0%

```

```

Launched reduce tasks=1
Data-local map tasks=1
Total time spent by all maps in occupied slots (ms)=16083
Total time spent by all reduces in occupied slots (ms)=6816
Total time spent by all map tasks (ms)=16083
Total time spent by all reduce tasks (ms)=6816
Total vcore-milliseconds taken by all map tasks=16083
Total vcore-milliseconds taken by all reduce tasks=6816
Total megabyte-milliseconds taken by all map tasks=16468992
Total megabyte-milliseconds taken by all reduce tasks=6979504
Map-Reduce Framework
  Map input records=37
  Map output records=366
  Map output bytes=5498
  Map output materialized bytes=23
  Input split bytes=136
  Combine input records=366
  Combine output records=1
  Reduce input groups=1
  Reduce shuffle bytes=23
  Reduce input records=1
  Reduce output records=1
  Spilled Records=2
  Shuffled Maps=1
  Failed Shuffles=0
  Merged Map outputs=1
  GC time elapsed (ms)=200
  CPU time spent (ms)=2480
  Physical memory (bytes) snapshot=364040192
  Virtual memory (bytes) snapshot=3015446528
  Total committed heap usage (bytes)=226627584
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=1481
File Output Format Counters
  Bytes Written=15
[cloudera@quickstart TP_Mapped]$ hdfs dfs -cat /user/cloudera/wordcount/output/*
TotalWords 366

```

PARTIE 2 : Analyse de Données de Vol

Dans cette partie, nous allons travailler avec un fichier CSV contenant des données de vols aériens.

4.3 Préparation des Données

1. Charger le fichier vol.csv dans le dossier HDFS à créer : /user/cloudera/data_vol/input

```
[cloudera@quickstart TP_MapRed]$ hdfs dfs -mkdir -p /user/cloudera/data_vol/input
[cloudera@quickstart TP_MapRed]$ hdfs dfs -put vol.csv /user/cloudera/data_vol/input
[cloudera@quickstart TP_MapRed]$ █
```

```
[cloudera@quickstart TP_MapRed]$ hdfs dfs -ls /user/cloudera/data_vol/input
Found 1 items
-rw-r--r-- 1 cloudera cloudera 23392 2025-05-06 07:21 /user/cloudera/data_vol/input/vol.csv
[cloudera@quickstart TP_MapRed]$ █
```

2. Afficher le contenu du dossier HDFS :

3. Explorer l'arborescence HDFS via l'interface Web : <http://localhost:50070> → Utilities

Browse Directory

<input type="text" value="/user/cloudera/data_vol/input"/>								<input type="button" value="Go!"/>
Permission	Owner	Group	Size	Last Modified	Replication	Block Size	Name	
-rw-r--r--	cloudera	cloudera	22.84 KB	Tue May 06 07:21:46 -0700 2025	1	128 MB	vol.csv	

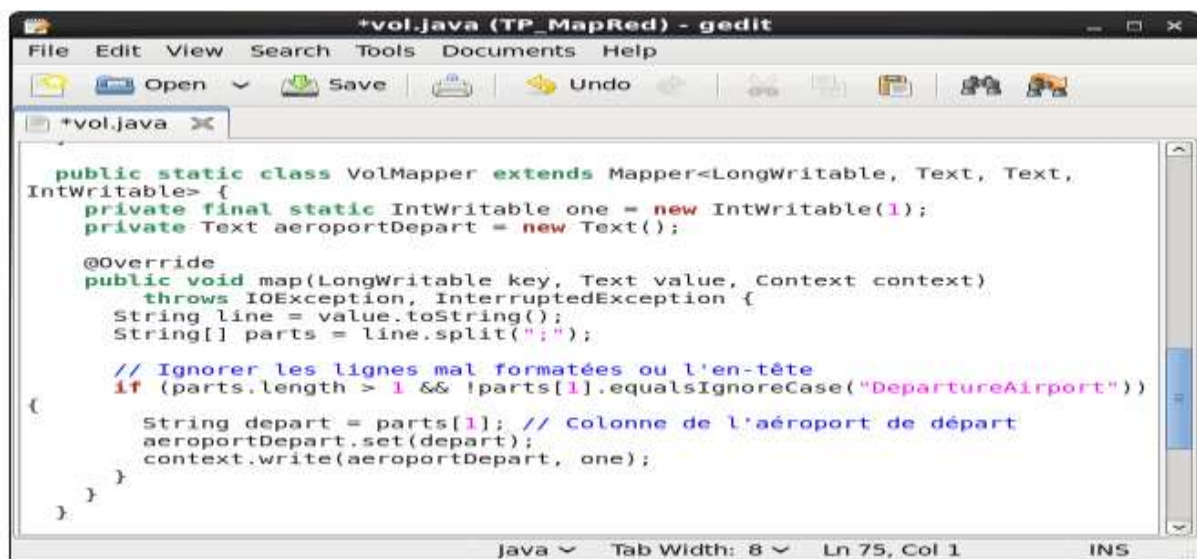
4.4 Analyse des Vols par Aéroport de Départ

1. Enregistrer WordCount.java sous le nom Vol.java

```
[cloudera@quickstart TP_MapRed]$ cp WordCount.java Vol.java
[cloudera@quickstart TP_MapRed]$ █
```

2. Modifier Vol.java pour calculer le nombre de vols en partance de chaque aéroport.

```
[cloudera@quickstart TP_MapRed]$ gedit vol.java
```



3. Compiler et exécuter le programme :

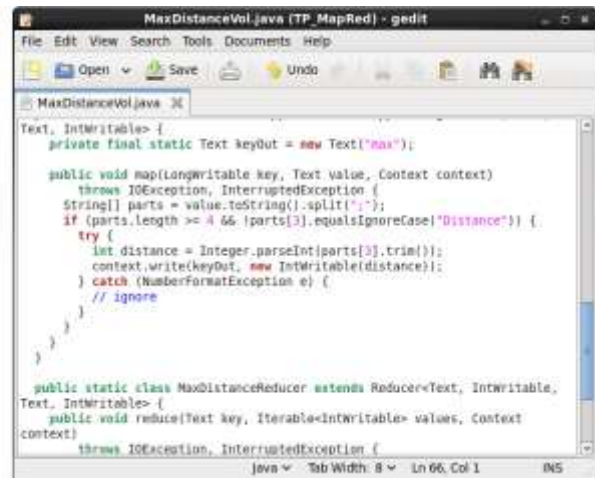
```
[cloudera@quickstart TP_MapRed]$ rm -rf build
[cloudera@quickstart TP_MapRed]$ mkdir build
[cloudera@quickstart TP_MapRed]$ javac -cp /usr/lib/hadoop/*:/usr/lib/hadoop-mapreduce/* Vol.java -d build -Xlint
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/jaxb-api.jar": no such file or directory
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
[cloudera@quickstart TP_MapRed]$ jar -cvf vol.jar -C build/ .
added manifest
adding: org/(in = 8) (out= 8)(stored 8%)
adding: org/myorg/(in = 0) (out= 0)(stored 0%)
adding: org/myorg/Vol$VolMapper.class(in = 1963) (out= 816)(deflated 58%)
adding: org/myorg/Vol$VolReducer.class(in = 1637) (out= 607)(deflated 58%)
adding: org/myorg/Vol.class(in = 1885) (out= 914)(deflated 49%)
[cloudera@quickstart TP_MapRed]$ hdfs dfs -rm -r -f /user/cloudera/data_vol/output
Deleted /user/cloudera/data_vol/output
[cloudera@quickstart TP_MapRed]$ hadoop jar vol.jar org.myorg.Vol /user/cloudera/data_vol/input /user/cloudera/data_vol/output
25/05/06 07:42:56 INFO client.RMProxy: Connecting to ResourceManager at /0.0.0.0:8032
25/05/06 07:42:57 INFO input.FileInputFormat: Total input paths to process : 1
25/05/06 07:42:57 WARN hdfs.DFSClient: Caught exception
java.lang.InterruptedException
    at java.lang.Object.wait(Native Method)
    at java.lang.Thread.join(Thread.java:1281)
    at java.lang.Thread.join(Thread.java:1355)
    at org.apache.hadoop.hdfs.DFSOutputStream$DataStreamer.closeResponder(DFSOutputStream.java:967)
    at org.apache.hadoop.hdfs.DFSOutputStream$DataStreamer.endBlock(DFSOutputStream.java:705)
    at org.apache.hadoop.hdfs.DFSOutputStream$DataStreamer.run(DFSOutputStream.java:894)
25/05/06 07:42:57 WARN hdfs.DFSClient: Caught exception
java.lang.InterruptedException
    at java.lang.Object.wait(Native Method)
    at java.lang.Thread.join(Thread.java:1281)
    at java.lang.Thread.join(Thread.java:1355)
    at org.apache.hadoop.hdfs.DFSOutputStream$DataStreamer.closeResponder(DFSOutputStream.java:967)
    at org.apache.hadoop.hdfs.DFSOutputStream$DataStreamer.endBlock(DFSOutputStream.java:705)
    at org.apache.hadoop.hdfs.DFSOutputStream$DataStreamer.run(DFSOutputStream.java:894)
25/05/06 07:42:57 INFO mapreduce.JobSubmitter: number of splits:1
25/05/06 07:42:58 INFO mapreduce.JobSubmitter: Submitting tokens for job: job_1746535709625_0004
25/05/06 07:42:58 INFO impl.YarnClientImpl: Submitted application application_1746535709625_0004
25/05/06 07:42:58 INFO mapreduce.Job: The url to track the job: http://quickstart.cloudera:8088/proxy/application_1746535709625_0004/
25/05/06 07:42:58 INFO mapreduce.Job: Running job: job_1746535709625_0004
25/05/06 07:43:09 INFO mapreduce.Job: Job job_1746535709625_0004 running in uber mode : false
25/05/06 07:43:09 INFO mapreduce.Job:  map 0% reduce 0%

Launched reduce tasks=1
Data-local map tasks=1
Total time spent by all maps in occupied slots (ms)=5999
Total time spent by all reduces in occupied slots (ms)=5214
Total time spent by all map tasks (ms)=5999
Total time spent by all reduce tasks (ms)=5214
Total vcore-milliseconds taken by all map tasks=5999
Total vcore-milliseconds taken by all reduce tasks=5214
Total megabyte-milliseconds taken by all map tasks=6142976
Total megabyte-milliseconds taken by all reduce tasks=5339136
Map-Reduce Framework
  Map input records=800
  Map output records=800
  Map output bytes=4800
  Map output materialized bytes=14
  Input split bytes=133
  Combine input records=800
  Combine output records=1
  Reduce input groups=1
  Reduce shuffle bytes=14
  Reduce input records=1
  Reduce output records=1
  Spilled Records=2
  Shuffled Maps =1
  Failed Shuffles=0
  Merged Map outputs=1
  GC time elapsed (ms)=180
  CPU time spent (ms)=1800
  Physical memory (bytes) snapshot=365953024
  Virtual memory (bytes) snapshot=3015176192
  Total committed heap usage (bytes)=226627584
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=23392
File Output Format Counters
  Bytes Written=6
[cloudera@quickstart TP_MapRed]$ hdfs dfs -cat /user/cloudera/data_vol/output/*
1      800      -
```

4.5 Analyse de la Distance Maximale

Créez une version modifiée de votre programme pour calculer la distance maximale de vol.

```
[cloudera@quickstart TP_MapRed]$ cp WordCount.java MaxDistanceVol.java
[cloudera@quickstart TP_MapRed]$ gedit MaxDistanceVol.java
```



```
Text, IntWritable> {
    private final static Text keyOut = new Text("max");

    public void map(LongWritable key, Text value, Context context)
        throws IOException, InterruptedException {
        String[] parts = value.toString().split(";");
        if (parts.length >= 4 && !parts[3].equalsIgnoreCase("Distance")) {
            try {
                int distance = Integer.parseInt(parts[3].trim());
                context.write(keyOut, new IntWritable(distance));
            } catch (NumberFormatException e) {
                // ignore
            }
        }
    }

    public static class MaxDistanceReducer extends Reducer<Text, IntWritable,
        Text, IntWritable> {
        public void reduce(Text key, Iterable<IntWritable> values, Context
            context)
            throws IOException, InterruptedException {
            // ...
        }
    }
}
```

```
[cloudera@quickstart TP_MapRed]$ mkdir -p build
[cloudera@quickstart TP_MapRed]$ javac -cp "$(hadoop classpath)" -d build MaxDistanceVol.java -Xlint
warning: [path] bad path element "/usr/lib/hadoop/lib/jaxb-api.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop/lib/activation.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop/lib/jsr173_1.0_api.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop/lib/jaxb1-impl.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-yarn/lib/jaxb-api.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-yarn/lib/activation.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-yarn/lib/jsr173_1.0_api.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-yarn/lib/jaxb1-impl.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/lib/jaxb-api.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/lib/activation.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/lib/jsr173_1.0_api.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/lib/jaxb1-impl.jar": no such file or directory
12 warnings
[cloudera@quickstart TP_MapRed]$ jar -cvf vol.jar -C build/ .
added manifest
adding: org/(in = 0) (out= 0)(stored 0%)
adding: org/myorg/(in = 0) (out= 0)(stored 0%)
adding: org/myorg/MaxDistanceVol$MaxDistanceMapper.class(in = 2007) (out= 821)(deflated 59%)
adding: org/myorg/MaxDistanceVol$MaxDistanceReducer.class(in = 1792) (out= 760)(deflated 57%)
adding: org/myorg/MaxDistanceVol.class(in = 1845) (out= 906)(deflated 50%)
[cloudera@quickstart TP_MapRed]$ hdfs dfs -rm -r -f /user/cloudera/data_vol/output
Deleted /user/cloudera/data_vol/output
[cloudera@quickstart TP_MapRed]$ hadoop jar vol.jar org.myorg.MaxDistanceVol /user/cloudera/data_vol/input /user/cloudera/data_vol/output
25/05/06 08:07:55 INFO client.RMProxy: Connecting to ResourceManager at /0.0.0.0:8032
25/05/06 08:07:56 INFO InputFileInputFormat: Total input paths to process : 1
25/05/06 08:07:56 WARN hdfs.DFSClient: Caught exception
java.lang.InterruptedException
    at java.lang.Object.wait(Native Method)
    at java.lang.Thread.join(Thread.java:1281)
    at java.lang.Thread.join(Thread.java:1355)
    at org.apache.hadoop.hdfs.DFSOutputStream$DataStreamer.closeResponder(DFSOutputStream.java:967)
    at org.apache.hadoop.hdfs.DFSOutputStream$DataStreamer.endBlock(DFSOutputStream.java:785)
    at org.apache.hadoop.hdfs.DFSOutputStream$DataStreamer.run(DFSOutputStream.java:894)
25/05/06 08:07:56 INFO mapreduce.JobSubmitter: number of splits:1
25/05/06 08:07:57 INFO mapreduce.JobSubmitter: Submitting tokens for job: job_1746535789625_0007
25/05/06 08:07:57 INFO Impl.YarnClientImpl: Submitted application application_1746535789625_0007
25/05/06 08:07:57 INFO mapreduce.Job: The url to track the job: http://quickstart.cloudera:8088/proxy/application_1746535789625_0007/
25/05/06 08:07:57 INFO mapreduce.Job: Running job: job_1746535789625_0007
25/05/06 08:08:06 INFO mapreduce.Job: Job job_1746535789625_0007 running in uber mode : false
25/05/06 08:08:06 INFO mapreduce.Job: map 0% reduce 0%
25/05/06 08:08:15 INFO mapreduce.Job: map 100% reduce 0%
25/05/06 08:08:22 INFO mapreduce.Job: map 100% reduce 100%
```



```

Launched reduce tasks=1
Data-local map tasks=1
Total time spent by all maps in occupied slots (ms)=4973
Total time spent by all reduces in occupied slots (ms)=5082
Total time spent by all map tasks (ms)=4973
Total time spent by all reduce tasks (ms)=5082
Total vcore-milliseconds taken by all map tasks=4973
Total vcore-milliseconds taken by all reduce tasks=5082
Total megabyte-milliseconds taken by all map tasks=5092352
Total megabyte-milliseconds taken by all reduce tasks=5203960
Map-Reduce Framework
  Map input records=800
  Map output records=800
  Map output bytes=6400
  Map output materialized bytes=8006
  Input split bytes=133
  Combine input records=0
  Combine output records=0
  Reduce input groups=1
  Reduce shuffle bytes=8006
  Reduce input records=800
  Reduce output records=1
  Spilled Records=1600
  Shuffled Maps =1
  Failed Shuffles=0
  Merged Map outputs=1
  GC time elapsed (ms)=176
  CPU time spent (ms)=1530
  Physical memory (bytes) snapshot=359612416
  Virtual memory (bytes) snapshot=3015176192
  Total committed heap usage (bytes)=220627584
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=23392
File Output Format Counters
  Bytes Written=18
[cloudera@quickstart TP_MapRed]$ hdfs dfs -cat /user/cloudera/data_vol/output/*
Distance Max      2298

```

4.6 Analyse des Paires d'Aéroports

Modifiez votre programme pour compter le nombre de vols pour chaque paire d'aéroports, sans distinction entre départ et arrivée.

The image shows a terminal window on the left and a code editor window on the right. The terminal window displays the command to run the MapReduce job and its output. The code editor window shows the source code for the `CountVol.java` file, which implements a MapReduce program to count the number of flights between pairs of airports.

```

[cloudera@quickstart TP_MapRed]$ hdfs dfs -cat /user/cloudera/data_vol/output/*
Distance Max      2298

```

```

// CountVol.java (TP_MapRed) - gedit
File Edit View Search Tools Documents Help
+CountVol.java X
public static class AirportMapper extends Mapper<Object, Text, Text,
IntWritable> {
    private final static IntWritable one = new IntWritable(1);
    private Text pair = new Text();

    public void map(Object key, Text value, Context context) throws
IOException, InterruptedException {
        String[] columns = value.toString().split("\t");
        if (columns.length == 7) {
            String depart = columns[4]; // Aéroport de départ
            String arrivee = columns[5]; // Aéroport d'arrivée

            String airportPair = depart + "-" + arrivee;
            pair.set(airportPair);
            context.write(pair, one);
        }
    }
}

// Reducer Class
public static class AirportReducer extends Reducer<Text, IntWritable,

```

```
[cloudera@quickstart TP_MapRed]$ rm -rf build
[cloudera@quickstart TP_MapRed]$ mkdir -p build
[cloudera@quickstart TP_MapRed]$ javac -cp "$(hadoop classpath)" -d build CountVol.java -Xlint
warning: [path] bad path element "/usr/lib/hadoop/lib/job-api.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop/lib/activation.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop/lib/jsr173-1.0-api.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop/lib/jobapi-impl.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/activation.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-yarn/lib/activation.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-yarn/lib/jsr173-1.0-api.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-yarn/lib/jobapi-impl.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/jobapi-impl.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/activation.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/jsr173-1.0-api.jar": no such file or directory
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/jobapi-impl.jar": no such file or directory
22 warnings
[cloudera@quickstart TP_MapRed]$ hdfs dfs -m -r -f /user/cloudera/data_vol/output
[cloudera@quickstart TP_MapRed]$ hadoop jar vol.jar org.mycorg.CountVol /user/cloudera/data_vol/input /user/cloudera/data_vol/output
25/05/06 08:21:39 INFO client.RMProxy: Connecting to ResourceManager at /0.0.0.0:8032
25/05/06 08:22:49 WARN mapreduce.JobResourceUploader: Hadoop command-line option parsing not performed. Implement the Tool interface and execute your application with ToolRunner to remedy this.
25/05/06 08:22:49 INFO input.FileInputFormat: Total input paths to process : 1
25/05/06 08:22:49 INFO mapreduce.JobSubmitter: number of splits=1
25/05/06 08:22:41 INFO mapreduce.JobSubmitter: Submitting tokens for job: job_1746535709625_0000
25/05/06 08:21:41 INFO impl.YarnClientImpl: Submitted application application_1746535709625_0000
25/05/06 08:22:42 INFO mapreduce.Job: The url to track the job: http://quickstart.cloudera:8088/proxy/application_1746535709625_0000/
25/05/06 08:22:42 INFO mapreduce.Job: Running job: job_1746535709625_0000
25/05/06 08:21:52 INFO mapreduce.Job: Job: job_1746535709625_0000 running in uber mode : false
25/05/06 08:22:52 INFO mapreduce.Job: map 0% reduce 0%
25/05/06 08:23:58 INFO mapreduce.Job: map 100% reduce 0%
25/05/06 08:22:08 INFO mapreduce.Job: map 100% reduce 100%
25/05/06 08:22:08 INFO mapreduce.Job: Job: job_1746535709625_0000 completed successfully
25/05/06 08:22:08 INFO mapreduce.Job: Counters: 49
  File System Counters
    FILE: Number of bytes read=11206
    FILE: Number of bytes written=168960
    FILE: Number of read operations=0
    FILE: Number of large read operations=0
    FILE: Number of write operations=0
    HDFS: Number of bytes read=23535
    HDFS: Number of bytes written=425
    HDFS: Number of read operations=6
    HDFS: Number of large read operations=0
    HDFS: Number of write operations=2
  Job Counters
```

Resulta :

```
[cloudera@quickstart TP_MapRed]$ hdfs dfs -cat /user/cloudera/data_vol/output/*
```

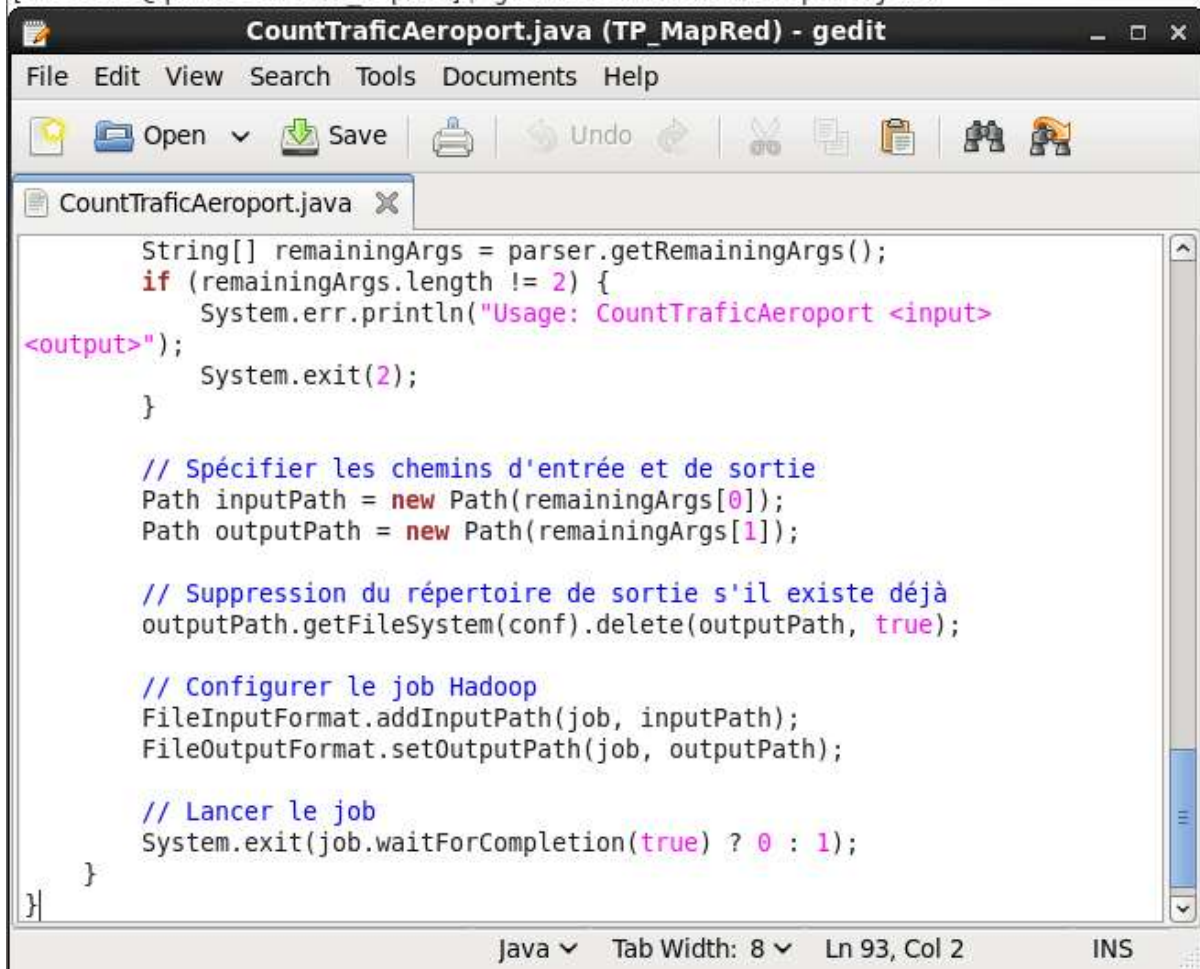
```
IAD-TPA 8
IND-BWI 24
IND-JAX 8
IND-LAS 16
IND-MCI 16
IND-MCO 16
IND-MDW 32
IND-PHX 16
IND-TPA 8
ISP-BWI 56
ISP-FLL 24
ISP-LAS 8
ISP-MCO 48
ISP-MDW 32
ISP-PBI 24
ISP-RSW 8
ISP-TPA 24
JAN-BWI 16
JAN-HOU 32
JAN-MCO 8
JAN-MDW 16
JAX-BHM 8
JAX-BNA 32
JAX-BWI 24
JAX-FLL 48
JAX-HOU 8
JAX-IND 8
JAX-ORF 16
JAX-PHL 16
JAX-TPA 24
LAS-ABQ 56
LAS-ALB 8
LAS-AMA 8
LAS-AUS 24
LAS-BDL 8
LAS-BHM 8
LAS-BNA 32
LAS-BOI 16
LAS-BUF 8
LAS-BUR 8
```

```
[cloudera@quickstart TP_MapRed]$ █
```

4.7 Analyse du Trafic par Aéroport

Modifiez votre programme pour compter les vols en partance et en arrivée pour chaque aéroport.

```
[cloudera@quickstart TP_MapRed]$ cp WordCount.java CountTrafficAeroport.java  
[cloudera@quickstart TP_MapRed]$ gedit CountTrafficAeroport.java
```



```
CountTrafficAeroport.java (TP_MapRed) - gedit  
File Edit View Search Tools Documents Help  
Open Save Undo  
CountTrafficAeroport.java  
String[] remainingArgs = parser.getRemainingArgs();  
if (remainingArgs.length != 2) {  
    System.err.println("Usage: CountTrafficAeroport <input>  
<output>");  
    System.exit(2);  
}  
  
// Spécifier les chemins d'entrée et de sortie  
Path inputPath = new Path(remainingArgs[0]);  
Path outputPath = new Path(remainingArgs[1]);  
  
// Suppression du répertoire de sortie s'il existe déjà  
outputPath.getFileSystem(conf).delete(outputPath, true);  
  
// Configurer le job Hadoop  
FileInputFormat.addInputPath(job, inputPath);  
FileOutputFormat.setOutputPath(job, outputPath);  
  
// Lancer le job  
System.exit(job.waitForCompletion(true) ? 0 : 1);  
}
```

Java Tab Width: 8 Ln 93, Col 2 INS

```
[cloudera@quickstart TP_MapRed]$ mkdir -p build
[cloudera@quickstart TP_MapRed]$ javac -cp `hadoop classpath` CountTrafficAeroport.java -d build
[cloudera@quickstart TP_MapRed]$ jar -cvf traffic.jar -C build/ .
added manifest
adding: org/(in = 8) (out= 0)(stored 0%)
adding: org/myorg/(in = 0) (out= 0)(stored 0%)
adding: org/myorg/CountTrafficAeroportsTrafficMapper.class(in = 2132) (out= 931)(deflated 56%)
adding: org/myorg/CountTrafficAeroportsTrafficReducer.class(in = 1789) (out= 749)(deflated 58%)
adding: org/myorg/CountTrafficAeroport.class(in = 1933) (out= 1004)(deflated 48%)
[cloudera@quickstart TP_MapRed]$ hdfs dfs -rm -r -f /user/cloudera/data_vol/output_traffic
[cloudera@quickstart TP_MapRed]$ hadoop jar traffic.jar org.myorg.CountTrafficAeroport /user/cloudera/data_vol/input /user/cloudera/data_vol/o
25/05/06 09:07:41 INFO Client.RMProxy: Connecting to ResourceManager at /8.0.0.0:8032
25/05/06 09:07:41 INFO input.FileInputFormat: Total input paths to process : 1
25/05/06 09:07:42 INFO mapreduce.JobSubmitter: number of splits:1
25/05/06 09:07:42 INFO mapreduce.JobSubmitter: Submitting tokens for job: job_1746535709625_0013
25/05/06 09:07:42 INFO impl.YarnClientImpl: Submitted application application_1746535709625_0013
25/05/06 09:07:42 INFO mapreduce.Job: The url to track the job: http://quickstart.cloudera:8088/proxy/application_1746535709625_0013/
25/05/06 09:07:42 INFO mapreduce.Job: Running job: job_1746535709625_0013
25/05/06 09:07:51 INFO mapreduce.Job: Job job_1746535709625_0013 running in uber mode : false
25/05/06 09:07:51 INFO mapreduce.Job: map 0% reduce 0%
25/05/06 09:07:58 INFO mapreduce.Job: map 100% reduce 0%
25/05/06 09:08:06 INFO mapreduce.Job: map 100% reduce 100%
25/05/06 09:08:07 INFO mapreduce.Job: Job job_1746535709625_0013 completed successfully
25/05/06 09:08:07 INFO mapreduce.Job: Counters: 49
File System Counters
  FILE: Number of bytes read=29606
  FILE: Number of bytes written=346097
  FILE: Number of read operations=0
  FILE: Number of large read operations=0
  FILE: Number of write operations=0
  HDFS: Number of bytes read=23525
  HDFS: Number of bytes written=486
  HDFS: Number of read operations=6
  HDFS: Number of large read operations=8
  HDFS: Number of write operations=2
Job Counters
  Launched map tasks=1
  Launched reduce tasks=1
  Data-local map tasks=1
  Total time spent by all maps in occupied slots (ms)=4935
  Total time spent by all reduces in occupied slots (ms)=5565
  Total time spent by all map tasks (ms)=4935
  Total time spent by all reduce tasks (ms)=5565
  Total vcore-milliseconds taken by all map tasks=4935
  Total vcore-milliseconds taken by all reduce tasks=5565
```

```
[cloudera@quickstart TP_MapRed]$ hdfs dfs -cat /user/cloudera/data_vol/output_traffic/*
```

```
ABQ Arrivée 56
ALB Arrivée 8
AMA Arrivée 8
AUS Arrivée 24
BDL Arrivée 8
BHM Arrivée 16
BNA Arrivée 64
BOI Arrivée 16
BUF Arrivée 8
BUR Arrivée 8
BWI Arrivée 120
FLL Arrivée 72
HOU Arrivée 40
IAD Départ 8
IND Arrivée 8
IND Départ 136
ISP Départ 224
JAN Départ 72
JAX Arrivée 8
JAX Départ 184
LAS Arrivée 24
LAS Départ 176
MCI Arrivée 16
MCO Arrivée 72
MDW Arrivée 80
ORF Arrivée 16
PBI Arrivée 24
PHL Arrivée 16
PHX Arrivée 16
RSW Arrivée 8
TPA Arrivée 64
```

```
[cloudera@quickstart TP_MapRed]$ █
```

5. Optimisation des Performances

5.1 Exercice : Mesurer l'impact des Combiners

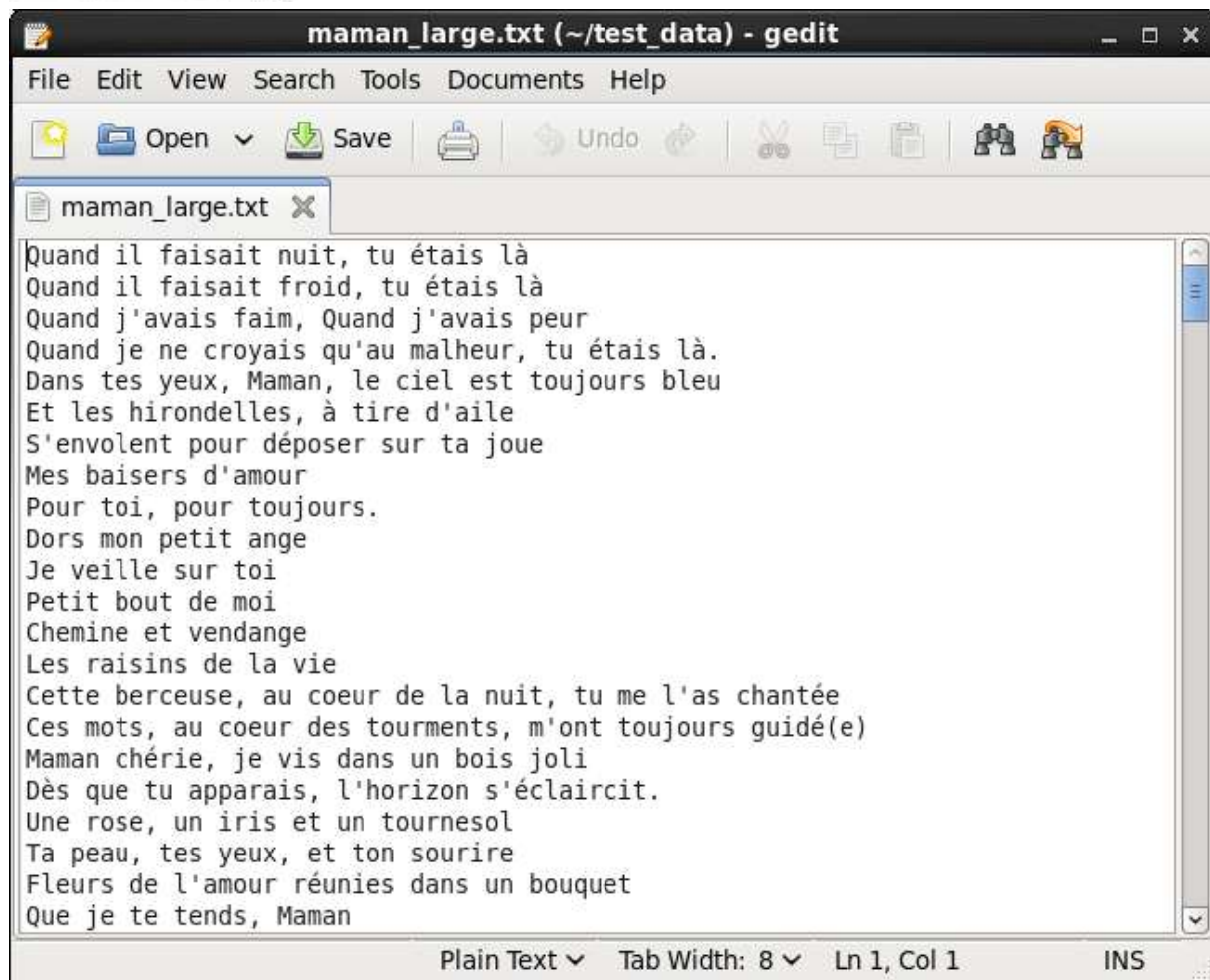
Dans cette activité, nous allons comparer les performances du programme WordCount avec et sans combiner.

1. Préparation des données pour le test :

```
[cloudera@quickstart TP_MapRed]$ mkdir -p /home/cloudera/test_data  
[cloudera@quickstart TP_MapRed]$
```

2. Test avec le Combiner (déjà activé dans WordCount.java) :

```
[cloudera@quickstart TP_MapRed]$ for i in {1..20}; do cat /home/cloudera/TP_MapRed/maman.txt >> /home/cloudera/test_data/maman_large.txt; done  
[cloudera@quickstart TP_MapRed]$
```



```
[cloudera@quickstart TP_MapRed]$ hdfs dfs -mkdir -p /user/cloudera/wordcount/input_large  
[cloudera@quickstart TP_MapRed]$ hdfs dfs -put /home/cloudera/test_data/maman_large.txt /user/cloudera/wordcount/input_large/  
[cloudera@quickstart TP_MapRed]$
```



```
[cloudera@quickstart TP_MapRed]$ make -p build
[cloudera@quickstart TP_MapRed]$ javac -cp /usr/lib/hadoop/*:/usr/lib/hadoop-mapreduce/* WordCount.java -d build -Xlint
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
WordCount.java:79: warning: [rawtypes] found raw type: Mapper.Context
    protected void setup(Mapper.Context context)
                           ^
    missing type arguments for generic class Mapper<KEYIN,VALUEIN,KEYOUT,VALUEOUT>.Context
    where KEYIN,VALUEIN,KEYOUT,VALUEOUT are type-variables:
      KEYIN extends Object declared in class Mapper
      VALUEIN extends Object declared in class Mapper
      KEYOUT extends Object declared in class Mapper
      VALUEOUT extends Object declared in class Mapper
5 warnings
[cloudera@quickstart TP_MapRed]$ hdfs dfs -rm -r -f /user/cloudera/wordcount/output_with_combiner

[cloudera@quickstart TP_MapRed]$
[cloudera@quickstart TP_MapRed]$ time hadoop jar wordcount.jar org.myorg.WordCount /user/cloudera/wordcount/input_large /user/cloudera/wordcount/output_with_combiner
25/05/06 09:20:44 INFO client.RMProxy: Connecting to ResourceManager at /0.0.0.0:8032
25/05/06 09:20:45 INFO input.FileInputFormat: Total input paths to process : 1
25/05/06 09:20:45 INFO mapreduce.JobSubmitter: number of splits:1
25/05/06 09:20:46 INFO mapreduce.JobSubmitter: Submitting tokens for job: job_1746535789625_0014
25/05/06 09:20:46 INFO impl.FarmHashImpl: Submitted application_1746535789625_0014
25/05/06 09:20:46 INFO mapreduce.Job: The url to track the job: http://quickstart.cloudera:8088/proxy/application_1746535789625_0014/
25/05/06 09:20:46 INFO mapreduce.Job: Waiting for job: job_1746535789625_0014
25/05/06 09:20:56 INFO mapreduce.Job: Job job_1746535789625_0014 running in uber mode : false
25/05/06 09:20:56 INFO mapreduce.Job:  map 0% reduce 0%
25/05/06 09:21:06 INFO mapreduce.Job:  map 100% reduce 0%
25/05/06 09:21:14 INFO mapreduce.Job:  map 100% reduce 100%
25/05/06 09:21:14 INFO mapreduce.Job: Job job_1746535789625_0014 completed successfully
25/05/06 09:21:15 INFO mapreduce.Job: Counters: 49
  File System Counters
    FILE: Number of bytes read=1657
    FILE: Number of bytes written=290479
    FILE: Number of read operations=0
    FILE: Number of large read operations=0
    FILE: Number of write operations=0
    HDFS: Number of bytes read=28168
    HDFS: Number of bytes written=1236
    HDFS: Number of read operations=6
    HDFS: Number of large read operations=0

real    0m34.176s
user    0m4.870s
sys     0m0.349s
```

Time Avec Combiner

```
Map-Reduce Framework
  Map input records=721
  Map output records=7320
  Map output bytes=60219
  Map output materialized bytes=1657
  Input split bytes=148
  Combine input records=7320
  Combine output records=144
  Reduce input groups=144
  Reduce shuffle bytes=1657
  Reduce input records=144
  Reduce output records=144
  Spilled Records=288
  Shuffled Maps =1
  Failed Shuffles=0
  Merged Map outputs=1
  GC time elapsed (ms)=184
  CPU time spent (ms)=3110
  Physical memory (bytes) snapshot=365498368
  Virtual memory (bytes) snapshot=3015458816
  Total committed heap usage (bytes)=226627584

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=28020
File Output Format Counters
  Bytes Written=1236
```

```
real    0m34.176s
user    0m4.870s
sys     0m0.349s
```

3. Test sans Combiner :

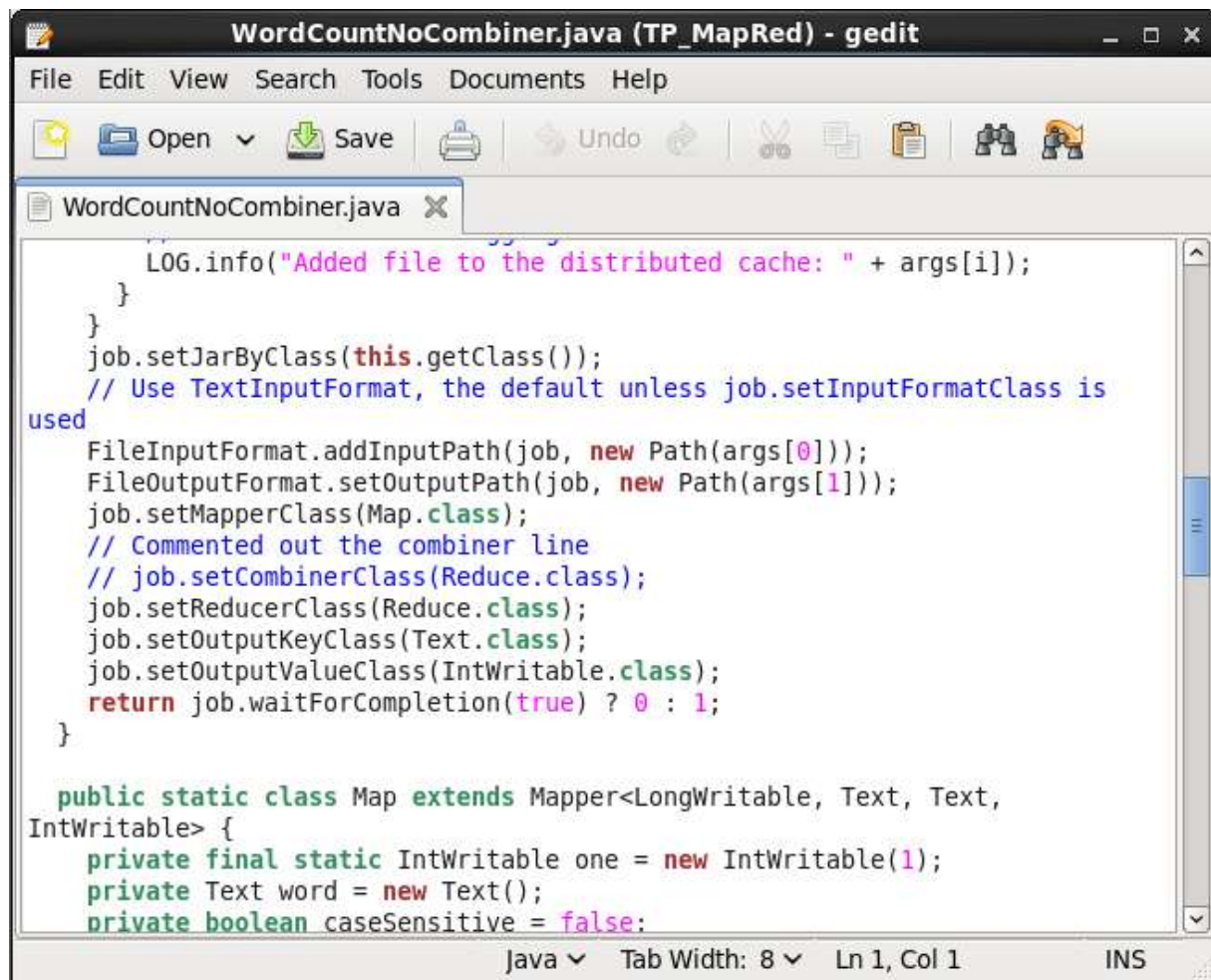
#Copier le fichier source

```
[cloudera@quickstart TP_MapRed]$ cp WordCount.java WordCountNoCombiner.java
[cloudera@quickstart TP_MapRed]$
```

Modifier le fichier pour retirer le combiner

Ouvrez le fichier et commentez la ligne job.setCombinerClass(Reduce.class);

Renommez aussi la classe en WordCountNoCombiner



```
WordCountNoCombiner.java (TP_MapRed) - gedit
File Edit View Search Tools Documents Help
Open Save Undo
WordCountNoCombiner.java
LOG.info("Added file to the distributed cache: " + args[i]);
}
}
job.setJarByClass(this.getClass());
// Use TextInputFormat, the default unless job.setInputFormatClass is
used
FileInputFormat.addInputPath(job, new Path(args[0]));
FileOutputFormat.setOutputPath(job, new Path(args[1]));
job.setMapperClass(Map.class);
// Commented out the combiner line
// job.setCombinerClass(Reduce.class);
job.setReducerClass(Reduce.class);
job.setOutputKeyClass(Text.class);
job.setOutputValueClass(IntWritable.class);
return job.waitForCompletion(true) ? 0 : 1;
}

public static class Map extends Mapper<LongWritable, Text, Text,
IntWritable> {
    private final static IntWritable one = new IntWritable(1);
    private Text word = new Text();
    private boolean caseSensitive = false;
```

Exécution :

```
[cloudera@quickstart TP_MapRed]$ mkdir -p build_nocombiner
[cloudera@quickstart TP_MapRed]$ javac -cp /usr/lib/hadoop/*:/usr/lib/hadoop-mapreduce/* WordCountNoCombiner.java -d build_nocombiner -Xlint
warning: [path] bad path element "/usr/lib/hadoop-mapreduce/jaxb-api.jar": no such 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
WordCountNoCombiner.java:71: warning: [rawtypes] found raw type: Mapper.Context
    protected void setup(Mapper.Context context)
                           ^
    missing type arguments for generic class Mapper<KEYIN,VALUEIN,KEYOUT,VALUEOUT>.Context
    where KEYIN,VALUEIN,KEYOUT,VALUEOUT are type-variables:
      KEYIN extends Object declared in class Mapper
      VALUEIN extends Object declared in class Mapper
      KEYOUT extends Object declared in class Mapper
      VALUEOUT extends Object declared in class Mapper
5 warnings
[cloudera@quickstart TP_MapRed]$ jar -cvf wordcount-no-combiner.jar -C build_nocombiner/ .
added manifest
adding: org/lin = 0) (out= 0)(stored 0%)
adding: org/myorg/lin = 0) (out= 0)(stored 0%)
adding: org/myorg/WordCountNoCombiner$Map.class(in = 4430) (out= 2114)(deflated 52%)
adding: org/myorg/WordCountNoCombiner$Reduce.class(in = 1677) (out= 702)(deflated 58%)
adding: org/myorg/WordCountNoCombiner.class(in = 2765) (out= 1384)(deflated 49%)
[cloudera@quickstart TP_MapRed]$ hdfs dfs -rm -r -f /user/cloudera/wordcount/output no-combiner
```

Test Sans Combiner

```
Map-Reduce Framework
  Map input records=721
  Map output records=7320
  Map output bytes=60219
  Map output materialized bytes=74865
  Input split bytes=148
  Combine input records=0
  Combine output records=0
  Reduce input groups=144
  Reduce shuffle bytes=74865
  Reduce input records=7320
  Reduce output records=144
  Spilled Records=14640
  Shuffled Maps =1
  Failed Shuffles=0
  Merged Map outputs=1
  GC time elapsed (ms)=188
  CPU time spent (ms)=3260
  Physical memory (bytes) snapshot=352571392
  Virtual memory (bytes) snapshot=3015581696
  Total committed heap usage (bytes)=226627584
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=28020
File Output Format Counters
  Bytes Written=1236

real    0m39.461s
user    0m4.953s
sys     0m0.321s
```

1. Quelle version s'est exécutée plus rapidement et pourquoi ?

Généralement, **avec combiner** est plus rapide, car moins de données sont envoyées au réseau (réduction du shuffle).

2. Quel est le taux de réduction de données obtenu grâce au combiner ?

Calcul = (nombre de paires sans combiner - avec combiner) / sans combiner * 100%

3. Pourquoi peut-on utiliser la classe Reduce comme combiner ?

Parce que l'opération de réduction (somme des occurrences) est **associative et commutative**, ce qui est une condition pour les combineurs.