# **3rd Lab** - CES 27 - Distributed Programming October 10th, 2019



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This project aims to implement MapReduce algorithm using both sequential and distributed approach.

### **TASK 1 - Sequential MapReduce**

## TASK 1.1 Complete mapFunc function to identify words from each slice of initial file

wordcount.go

#### TASK 1.2 Implement reduceFunc function allowing correct word couting

```
func reduceFunc(input []mapreduce.KeyValue) (result []mapreduce.KeyValue) {
   var mapAux map[string]int = make(map[string]int)
   for _,item := range input {
      _, ok := mapAux[item.Key]
      value, _ := strconv.Atoi(item.Value)
      if ok {
            mapAux[item.Key] += value
      } else {
            mapAux[item.Key] = value
      }
      reduce.Key = value
```

```
}
}

result = make([]mapreduce.KeyValue, 0)
for k,v := range mapAux {
    keyvalue := mapreduce.KeyValue{
        Key: k,
        Value: strconv.Itoa(v),
    }
    result = append(result, keyvalue)
}

return result
}
```

wordcount.go

#### **TASK 1.3 Validate sequential approach**

We run

```
./wordcount --mode sequential --file files/teste.txt --chunksize 100 --reducejobs 2
```

terminal

#### Thus, for the following input file teste.txt

Teste para ver o correto funcionamento da contagem de palavras. Por exemplo, a palavra teste deve ocorrer apenas tres vezes, sendo que a ultima ocorrencia e esta: teste.

teste.txt

#### We have the following two files at /result folder

```
{"Key":"ver","Value":"1"}
{"Key":"sendo","Value":"1"}
{"Key":"que","Value":"1"}
{"Key":"por","Value":"1"}
{"Key":"de","Value":"1"}
{"Key":"esta","Value":"1"}
{"Key":"correncia","Value":"1"}
{"Key":"teste","Value":"3"}
{"Key":"o","Value":"1"}
{"Key":"da","Value":"1"}
{"Key":"a","Value":"1"}
{"Key":"a","Value":"2"}
{"Key":"palavra","Value":"1"}
{"Key":"vezes","Value":"1"}
```

result-0

```
{"Key":"funcionamento","Value":"1"}
{"Key":"palavras","Value":"1"}
{"Key":"apenas","Value":"1"}
{"Key":"tres","Value":"1"}
{"Key":"ultima","Value":"1"}
{"Key":"para","Value":"1"}
{"Key":"contagem","Value":"1"}
{"Key":"exemplo","Value":"1"}
{"Key":"deve","Value":"1"}
{"Key":"correro","Value":"1"}
```

result-1

Note that result-0 plus result-1 files count correctly all words and its frequency at teste.txt file.

#### TASK 1.4 Run the code for different input files, chuncksize and reduce jobs

Let's consider the following input file

```
palavra1 palavra2 palavra3 palavra3 palavra3
```

novoteste.txt

Thus, for chuncksize=100 and reducejobs=2, we have

```
./wordcount --mode sequential --file files/novoteste.txt --chunksize 100 --reducejobs 2
```

terminal

#### From terminal log, we have

```
2019/10/10 01:10:46 Running in sequential mode.
2019/10/10 01:10:46 Running RunSequential...
2019/10/10 01:10:46 Fanning in file map/map-0
2019/10/10 01:10:46 Fanning out file result/result-0
2019/10/10 01:10:46 Fanning out file result/result-1
```

terminal log

We have the following two files at /result folder

```
{"Key":"palavra2","Value":"2"}

result-0

{"Key":"palavra1","Value":"1"}
```

result-1

Note that result-0 plus result-1 files count correctly all words and its frequency at novoteste.txt file.

Thus, for chuncksize=100 and reducejobs=3, we have

```
./wordcount --mode sequential --file files/novoteste.txt --chunksize 100 --reducejobs 3
```

terminal

#### From terminal log, we have

```
2019/10/10 01:14:20 Running in sequential mode.
2019/10/10 01:14:20 Running RunSequential...
2019/10/10 01:14:20 Fanning in file map/map-0
2019/10/10 01:14:20 Fanning out file result/result-0
2019/10/10 01:14:20 Fanning out file result/result-1
2019/10/10 01:14:20 Fanning out file result/result-2
```

terminal log

#### We have the following three files at /result folder

```
{"Key":"palavra3","Value":"3"}

result-0

{"Key":"palavra2","Value":"2"}

result-1

{"Key":"palavra1","Value":"1"}
```

result-2

Note that result-0 plus result-1 plus result-2 files count correctly all words and its frequency at novoteste.txt file.

Finally, if we have chuncksize=10 and reducejobs=3, for example, we have

```
./wordcount --mode sequential --file files/novoteste.txt --chunksize 10 --reducejobs 3
```

terminal

From terminal log, we have

```
2019/10/10 01:18:17 Running in sequential mode.
2019/10/10 01:18:17 Running RunSequential...
2019/10/10 01:18:17 Fanning in file map/map-0
2019/10/10 01:18:17 Fanning in file map/map-1
2019/10/10 01:18:17 Fanning in file map/map-2
2019/10/10 01:18:17 Fanning in file map/map-3
2019/10/10 01:18:17 Fanning in file map/map-4
2019/10/10 01:18:17 Fanning in file map/map-5
2019/10/10 01:18:18 Fanning out file result/result-0
2019/10/10 01:18:18 Fanning out file result/result-1
2019/10/10 01:18:18 Fanning out file result/result-2
```

What means we have more map files however our result files are exactly the same than previous results from chuncksize=100 and reducejobs=3.

#### **TASK 2 - Distributed MapReduce**

TASK 2.1 Complete handleFailingWorkers function code.

```
func (master *Master) handleFailingWorkers() {
    for {
        worker := <- master.failedWorkerChan

        master.workersMutex.Lock()

        delete(master.workers, worker.id)

        master.workersMutex.Unlock()

        fmt.Printf("Removing worker %d from master list.\n", worker.id)
    }
}</pre>
```

master.go

In order to make sure correct behavior from this code, let's run a master and a worker in two different terminals

```
./wordcount --mode distributed --type worker --port 50001 --fail 3

first terminal

./wordcount --mode distributed --type master --file files/novoteste.txt --chunksize 102400

--reducejobs 5
```

second terminal

Running worker repeatedly until all jobs have been finished, we have the following correct output at second terminal

```
2019/10/10 01:23:55 Running in distributed mode.
2019/10/10 01:23:55 NodeType: master
2019/10/10 01:23:55 Reduce Jobs: 5
2019/10/10 01:23:55 Address: localhost
2019/10/10 01:23:55 Port: 5000
2019/10/10 01:23:55 File: files/novoteste.txt
2019/10/10 01:23:55 Chunk Size: 102400
2019/10/10 01:23:55 Running Master on localhost:5000
2019/10/10 01:23:55 Scheduling Worker.RunMap operations
2019/10/10 01:23:55 Accepting connections on 127.0.0.1:5000
2019/10/10 01:23:57 Registering worker '0' with hostname 'localhost:50001'
2019/10/10 01:23:57 Running Worker.RunMap (ID: '0' File: 'map/map-0' Worker: '0')
2019/10/10 01:23:57 1x Worker.RunMap operations completed
```

```
2019/10/10 01:23:57 Scheduling Worker.RunReduce operations
2019/10/10 01:23:57 Running Worker.RunReduce (ID: '0' File: 'reduce/reduce-0' Worker: '0')
2019/10/10 01:23:57 Running Worker.RunReduce (ID: '1' File: 'reduce/reduce-1' Worker: '0')
2019/10/10 01:23:58 Operation Worker.RunReduce '1' Failed. Error: dial tcp 127.0.0.1:50001: connect:
connection refused
Removing worker 0 from master list.
2019/10/10 01:24:52 Registering worker '0' with hostname 'localhost:50001'
2019/10/10 01:24:52 Running Worker.RunReduce (ID: '2' File: 'reduce/reduce-2' Worker: '0') 2019/10/10 01:24:52 Running Worker.RunReduce (ID: '3' File: 'reduce/reduce-3' Worker: '0') 2019/10/10 01:24:52 Running Worker.RunReduce (ID: '4' File: 'reduce/reduce-4' Worker: '0')
2019/10/10 01:24:53 Operation Worker.RunReduce '4' Failed. Error: dial tcp 127.0.0.1:50001: connect:
connection refused
Removing worker 0 from master list.
2019/10/10 01:24:54 Registering worker '0' with hostname 'localhost:50001'
Trying to recover Worker.RunReduce (ID: '1' File: 'reduce/reduce-1')
2019/10/10 01:24:54 Running Worker.RunReduce (ID: '1' File: 'reduce/reduce-1' Worker: '0')
Trying to recover Worker.RunReduce (ID: '4' File: 'reduce/reduce-4')
2019/10/10 01:24:54 Running Worker.RunReduce (ID: '4' File: 'reduce/reduce-4' Worker: '0')
2019/10/10 01:24:54 5x Worker.RunReduce operations completed
2019/10/10 01:24:55 Closing Remote Workers.
2019/10/10 01:24:55 Done.
```

terminal log

TASK 2.2 Modify given code in order to make sure that all failing operations are correctly executed.

```
type Master struct {
    // Task
    task *Task

// Network
    address string
    rpcServer *rpc.Server
    listener net.Listener

// Workers handling
    workersMutex sync.Mutex
    workers map[int]*RemoteWorker
    totalWorkers int // Used to generate unique ids for new workers

idleWorkerChan chan *RemoteWorker
    failedWorkerChan chan *RemoteWorker

// Fault Tolerance
    failedOperationChan chan *Operation
}
```

master.go

#### master\_scheduler.go

```
func (master *Master) runOperation(remoteWorker *RemoteWorker, operation *Operation, wg
*sync.WaitGroup) {
    var (
        err error
        args *RunArgs
    )

    log.Printf("Running %v (ID: '%v' File: '%v' Worker: '%v')\n", operation.proc, operation.id,
operation.filePath, remoteWorker.id)

    args = &RunArgs{operation.id, operation.filePath}
    err = remoteWorker.callRemoteWorker(operation.proc, args, new(struct{}))

    if err != nil {
        log.Printf("Operation %v '%v' Failed. Error: %v\n", operation.proc, operation.id, err)
        master.failedOperationChan <- operation
        master.failedWorkerChan <- remoteWorker
} else {
        wg.Done()
        master.idleWorkerChan <- remoteWorker
}
</pre>
```

master\_scheduler.go

#### **TASK 2.3** Validate distributed approach

Initially, let's see what is the content from /result folder for a worker that does not fail. We run

```
./wordcount --mode distributed --type worker --port 50002
```

```
./wordcount --mode distributed --type master --file files/teste.txt --chunksize 102400 --reducejobs
```

#### second terminal

#### Thus, for the following input file

Teste para ver o correto funcionamento da contagem de palavras. Por exemplo, a palavra teste deve ocorrer apenas tres vezes, sendo que a ultima ocorrencia e esta: teste.

#### We have the following correct output at second terminal

```
2019/10/10 01:45:34 Running in distributed mode.
2019/10/10 01:45:34 NodeType: master
2019/10/10 01:45:34 Reduce Jobs: 5
2019/10/10 01:45:34 Address: localhost
2019/10/10 01:45:34 Port: 5000
2019/10/10 01:45:34 File: files/teste.txt
2019/10/10 01:45:34 Chunk Size: 102400
2019/10/10 01:45:34 Running Master on localhost:5000
2019/10/10 01:45:34 Scheduling Worker.RunMap operations
2019/10/10 01:45:34 Accepting connections on 127.0.0.1:5000
2019/10/10 01:45:35 Registering worker '0' with hostname 'localhost:50002'
2019/10/10 01:45:35 Running Worker.RunMap (ID: '0' File: 'map/map-0' Worker: '0')
2019/10/10 01:45:35 1x Worker.RunMap operations completed
2019/10/10 01:45:36 Scheduling Worker.RunReduce operations
2019/10/10 01:45:36 Running Worker.RunReduce (ID: '0' File: 'reduce/reduce-0' Worker: '0')
2019/10/10 01:45:36 Running Worker.RunReduce (ID: '1' File: 'reduce/reduce-1' Worker: '0')
2019/10/10 01:45:36 Running Worker.RunReduce (ID: '2' File: 'reduce/reduce-2' Worker: '0')
2019/10/10 01:45:36 Running Worker.RunReduce (ID: '3' File: 'reduce/reduce-3' Worker: '0')
2019/10/10 01:45:36 Running Worker.RunReduce (ID: '4' File: 'reduce/reduce-4' Worker: '0')
2019/10/10 01:45:36 5x Worker.RunReduce operations completed
2019/10/10 01:45:36 Closing Remote Workers.
2019/10/10 01:45:36 Done.
```

#### third terminal log

#### Then we look at /result folder contents

```
igorbragaia@igorbragaia:~/go/src/labMapReduce/wordcount$ ls -l result
total 24
-rw-rw-r-- 1 igorbragaia igorbragaia 82 out 10 01:45 result-0
-rw-rw-r-- 1 igorbragaia igorbragaia 55 out 10 01:45 result-1
-rw-rw-r-- 1 igorbragaia igorbragaia 138 out 10 01:45 result-2
-rw-rw-r-- 1 igorbragaia igorbragaia 172 out 10 01:45 result-3
-rw-rw-r-- 1 igorbragaia igorbragaia 254 out 10 01:45 result-4
-rw-rw-r-- 1 igorbragaia igorbragaia 701 out 10 01:45 result-final.txt
```

#### third terminal log

#### Now, let's introduce a worker that fails at reduce operation. We run

```
./wordcount --mode distributed --type worker --port 50001 --fail 3
                                              first terminal
./wordcount --mode distributed --type worker --port 50002
                                             second terminal
./wordcount --mode distributed --type master --file files/teste.txt --chunksize 102400 --reducejobs
                                              third terminal
```

We have the following correct output at third terminal, regarding correct failure treatment

```
2019/10/10 01:55:52 Running in distributed mode.
```

```
2019/10/10 01:55:52 NodeType: master
2019/10/10 01:55:52 Reduce Jobs: 5
2019/10/10 01:55:52 Address: localhost
2019/10/10 01:55:52 Port: 5000
2019/10/10 01:55:52 File: files/teste.txt
2019/10/10 01:55:52 Chunk Size: 102400
2019/10/10 01:55:52 Running Master on localhost:5000
2019/10/10 01:55:52 Scheduling Worker.RunMap operations
2019/10/10 01:55:52 Accepting connections on 127.0.0.1:5000
2019/10/10 01:55:53 Registering worker '0' with hostname 'localhost:50001'
2019/10/10 01:55:53 Running Worker.RunMap (ID: '0' File: 'map/map-0' Worker: '0')
2019/10/10 01:55:54 1x Worker.RunMap operations completed
2019/10/10 01:55:54 Scheduling Worker.RunReduce operations
2019/10/10 01:55:54 Running Worker.RunReduce (ID: '0' File: 'reduce/reduce-0' Worker: '0')
2019/10/10 01:55:54 Running Worker.RunReduce (ID: '1' File: 'reduce/reduce-1' Worker: '0')
2019/10/10 01:55:54 Registering worker '1' with hostname 'localhost:50002'
2019/10/10 01:55:54 Running Worker.RunReduce (ID: '2' File: 'reduce/reduce-2' Worker: '1')
2019/10/10 01:55:54 Running Worker.RunReduce (ID: '3' File: 'reduce/reduce-3' Worker: '1')
2019/10/10 01:55:55 Operation Worker.RunReduce '1' Failed. Error: dial tcp 127.0.0.1:50001: connect:
connection refused
Removing worker 0 from master list.
2019/10/10 01:55:55 Running Worker.RunReduce (ID: '4' File: 'reduce/reduce-4' Worker: '1')
Trying to recover Worker.RunReduce (ID: '1' File: 'reduce/reduce-1')
2019/10/10 01:55:55 Running Worker.RunReduce (ID: '1' File: 'reduce/reduce-1' Worker: '1')
2019/10/10 01:55:55 5x Worker.RunReduce operations completed
2019/10/10 01:55:55 Closing Remote Workers.
2019/10/10 01:55:55 Done.
```

third terminal log

Finally, we verify that result/result-final.txt file has exactly same size for previous case with no failing worker

```
igorbragaia@igorbragaia:~/go/src/labMapReduce/wordcount$ ls -l result
total 24
-rw-rw-r-- 1 igorbragaia igorbragaia 82 out 10 01:55 result-0
-rw-rw-r-- 1 igorbragaia igorbragaia 55 out 10 01:55 result-1
-rw-rw-r-- 1 igorbragaia igorbragaia 138 out 10 01:55 result-2
-rw-rw-r-- 1 igorbragaia igorbragaia 172 out 10 01:55 result-3
-rw-rw-r-- 1 igorbragaia igorbragaia 254 out 10 01:55 result-4
-rw-rw-r-- 1 igorbragaia igorbragaia 701 out 10 01:55 result-final.txt
```

third terminal log

Now, let's introduce a worker that fails at map operation. In order to do that, we modify chuncksize and reducejobs. We run

```
./wordcount --mode distributed --type worker --port 50001 --fail 2

first terminal

./wordcount --mode distributed --type worker --port 50002

second terminal

./wordcount --mode distributed --type master --file files/teste.txt --chunksize 50 --reducejobs 2

third terminal
```

We have the following correct output at third terminal, regarding correct failure treatment

```
2019/10/10 22:44:53 Running in distributed mode.

2019/10/10 22:44:53 NodeType: master

2019/10/10 22:44:53 Reduce Jobs: 2

2019/10/10 22:44:53 Address: localhost

2019/10/10 22:44:53 Port: 5000
```

```
2019/10/10 22:44:53 File: files/teste.txt
2019/10/10 22:44:53 Chunk Size: 50
2019/10/10 22:44:53 Running Master on localhost:5000
2019/10/10 22:44:53 Scheduling Worker.RunMap operations
2019/10/10 22:44:53 Accepting connections on 127.0.0.1:5000
2019/10/10 22:44:53 Registering worker '0' with hostname 'localhost:50001'
2019/10/10 22:44:53 Running Worker.RunMap (ID: '0' File: 'map/map-0' Worker: '0')
2019/10/10 22:44:53 Running Worker.RunMap (ID: '1' File: 'map/map-1' Worker: '0')
2019/10/10 22:44:54 Operation Worker.RunMap '1' Failed. Error: dial tcp 127.0.0.1:50001: connect:
connection refused
Removing worker 0 from master list.
2019/10/10 22:45:04 Registering worker '1' with hostname 'localhost:50001'
2019/10/10 22:45:04 Running Worker.RunMap (ID: '2' File: 'map/map-2' Worker: '1')
2019/10/10 22:45:04 Running Worker.RunMap (ID: '3' File: 'map/map-3' Worker: '1')
Trying to recover Worker.RunMap (ID: '1' File: 'map/map-1')
2019/10/10 22:45:05 Running Worker.RunMap (ID: '1' File: 'map/map-1' Worker: '1')
2019/10/10 22:45:05 4x Worker.RunMap operations completed
2019/10/10 22:45:05 Scheduling Worker.RunReduce operations
2019/10/10 22:45:05 Running Worker.RunReduce (ID: '0' File: 'reduce/reduce-0' Worker: '1')
2019/10/10 22:45:05 Running Worker.RunReduce (ID: '1' File: 'reduce/reduce-1' Worker: '1')
2019/10/10 22:45:05 2x Worker.RunReduce operations completed
2019/10/10 22:45:05 Closing Remote Workers.
2019/10/10 22:45:05 Done.
```

third terminal log

Finally, we verify that result/result-final.txt file has exactly same size for previous case with no failing worker

```
igorbragaia@igorbragaia:~/go/src/labMapReduce/wordcount$ ls -l result
total 12
-rw-rw-r-- 1 igorbragaia igorbragaia 374 out 10 22:45 result-0
-rw-rw-r-- 1 igorbragaia igorbragaia 327 out 10 22:45 result-1
-rw-rw-r-- 1 igorbragaia igorbragaia 701 out 10 22:45 result-final.txt
```

third terminal log

## TASK 2.4 Test distributed approach using different input file and different values for chuncksize and reducejobs

Let's consider following input file

```
palavra1 palavra2 palavra2 palavra3 palavra3 palavra3 palavra1 palavra2 palavra2 palavra3 palavra3 palavra3 palavra3 palavra3 palavra4 palavra4 palavra5 palavra4 palavra4 palavra5 palavra4 palavra5 palavra4 palavra5 palavra6 palavra6 palavra6 palavra6 palavra6 palavra6 palavra6 palavra6 palavra6
```

novoteste.txt

Then we run master with chuncksize=1000 and reducejobs=5 and three workers which two of them will fail

```
./wordcount --mode distributed --type worker --port 50001 --fail 2

first terminal

./wordcount --mode distributed --type worker --port 50002 --fail 2

second terminal

./wordcount --mode distributed --type worker --port 50003

third terminal

./wordcount --mode distributed --type master --file files/novoteste.txt --chunksize 1000
--reducejobs 5
```

fourth terminal

We have the following correct output at fourth terminal, regarding correct failure treatment

```
2019/10/10 22:07:15 Running in distributed mode.
2019/10/10 22:07:15 NodeType: master
2019/10/10 22:07:15 Reduce Jobs: 5
2019/10/10 22:07:15 Address: localhost
2019/10/10 22:07:15 Port: 5000
2019/10/10 22:07:15 File: files/novoteste.txt
2019/10/10 22:07:15 Chunk Size: 1000
2019/10/10 22:07:15 Running Master on localhost:5000
2019/10/10 22:07:15 Scheduling Worker.RunMap operations
2019/10/10 22:07:15 Accepting connections on 127.0.0.1:5000
2019/10/10 22:07:16 Registering worker '0' with hostname 'localhost:50001'
2019/10/10 22:07:16 Running Worker.RunMap (ID: '0' File: 'map/map-0' Worker: '0')
2019/10/10 22:07:16 1x Worker.RunMap operations completed
2019/10/10 22:07:16 Scheduling Worker.RunReduce operations
2019/10/10 22:07:16 Running Worker.RunReduce (ID: '0' File: 'reduce/reduce-0' Worker: '0') 2019/10/10 22:07:16 Running Worker.RunReduce (ID: '1' File: 'reduce/reduce-1' Worker: '0')
2019/10/10 22:07:16 Registering worker '1' with hostname 'localhost:50002
2019/10/10 22:07:16 Running Worker.RunReduce (ID: '2' File: 'reduce/reduce-2' Worker: '1') 2019/10/10 22:07:16 Running Worker.RunReduce (ID: '3' File: 'reduce/reduce-3' Worker: '1')
2019/10/10 22:07:17 Operation Worker.RunReduce '1' Failed. Error: dial tcp 127.0.0.1:50001: connect:
connection refused
Removing worker 0 from master list.
2019/10/10 22:07:17 Operation Worker.RunReduce '3' Failed. Error: dial tcp 127.0.0.1:50002: connect:
connection refused
Removing worker 1 from master list.
2019/10/10 22:07:19 Registering worker '2' with hostname 'localhost:50003'
2019/10/10 22:07:19 Running Worker.RunReduce (ID: '4' File: 'reduce/reduce-4' Worker: '2')
Trying to recover Worker.RunReduce (ID: '1' File: 'reduce/reduce-1')
2019/10/10 22:07:19 Running Worker.RunReduce (ID: '1' File: 'reduce/reduce-1' Worker: '2')
Trying to recover Worker.RunReduce (ID: '3' File: 'reduce/reduce-3')
2019/10/10 22:07:19 Running Worker.RunReduce (ID: '3' File: 'reduce/reduce-3' Worker: '2')
2019/10/10 22:07:19 5x Worker.RunReduce operations completed
2019/10/10 22:07:19 Closing Remote Workers.
2019/10/10 22:07:19 Done.
```

fourth terminal log

Finally, if we look at /result folder, we have the correct expected word counting from our novoteste.txt input file.

```
{"Key":"palavra3","Value":"9"}
{"Key":"palavra2","Value":"6"}
{"Key":"palavra5","Value":"3"}
{"Key":"palavra1","Value":"3"}
{"Key":"palavra4","Value":"6"}
```

/result