

Track: Data Science	<b>Assignment 2</b>
Name: Sofia Gamershmidt	<b>Introduction to Big Data</b>
Email: s.gamershmidt@innopolis.university	

# Report

## Methodology

### Data collection and preparation

I will proceed with my work with a.parquet file.

Initially, I needed to explore the docker-compose.yaml file to understand at which point and in which file the data is processed. The cluster-master container runs the /app/app.sh script. The app/app.sh runs prepare\_data.sh, which runs spark-submit prepare\_data.py and puts everything in the hdfs. So I need only to modify prepare\_data.py in order to prepare data.

I took the code from assignment description as base, but made some modifications:

1. Add some configs(to avoid random problems with javaerrors)
2. Got rid of line .sample(fraction=100 \* n / df.count(), seed=0) because of javaheap error
3. Added filter on nonempty and nonnull texts
4. A bit modified filename creation
5. Added PySpark RDD operations, fixed issues with addition of existing paths

Additionally, I faced problems with functions like df\_sample.collect(). It caused also JavaHeap errors.

Everything I run manually for step by step execution and full control at the developing stage

### Indexer tasks

I will create 3 tables:

1. term\_freq (term, doc\_id, TF)
2. doc\_freq (term, DF)
3. doc\_stats (doc\_id, length, title)

term\_freq will contain information about each term, document id for which the TF was calculated, and TF value (calculation is explained in assignment description)

doc\_freq will contain term and document frequency (I will add + 1 to document frequency, because I will use in denominator in BM25 calculation and I want to avoid division by 0 problem)

doc\_stats will contain doc id, number of tokens in it and doc title

To do it I am going to use 2 mappers and reducers: since they communicate via stdin, I needed to use mapper1 to process input documents and create triplets (word, doc\_id, 1), then reducer aggregates it to triplets (word, doc\_id, tf), mapper2 creates tuples (doc\_id, title) and reducer2 deletes duplicates

Index.sh runs two Hadoop streaming jobs to generate the term frequency index and to extract document titles and launches the Cassandra insertion using app.py

Issues I faced: errors connected to existence of certain paths. The solution is to delete them before:

```
hdfs dfs -rm -r -f "$OUTPUT_PATH"
```

```
hdfs dfs -rm -r -f "$OUTPUT_TITLE_PATH"
```

## Ranker tasks

search.sh runs query.py file using spark-submit. In this file I connect to cassandra and read three tables: term\_freq, doc\_freq, and doc\_stats. Then I take user query, split it into words, and search only for those terms in index.

I calculate BM25 score using formula provided in the assignment description. I sum scores for same document and take top 10 results with highest score. I also show title of document from doc\_stats table. I added +1 in denominator in previous step to avoid division by zero.

The results are in the next section

I tried this on the test sample with 10 documents only and if there are files with 0 bm25 they are not included into final answer(so there can be even 0 matches for small data sizes)

## Demonstration

ATTENTION: code may fail due to cache reasons, to overcome this you need just to clear docker cache and restart the docker-compose. This will solve all problems

To run the code you need to print in shell:  
**docker-compose up**

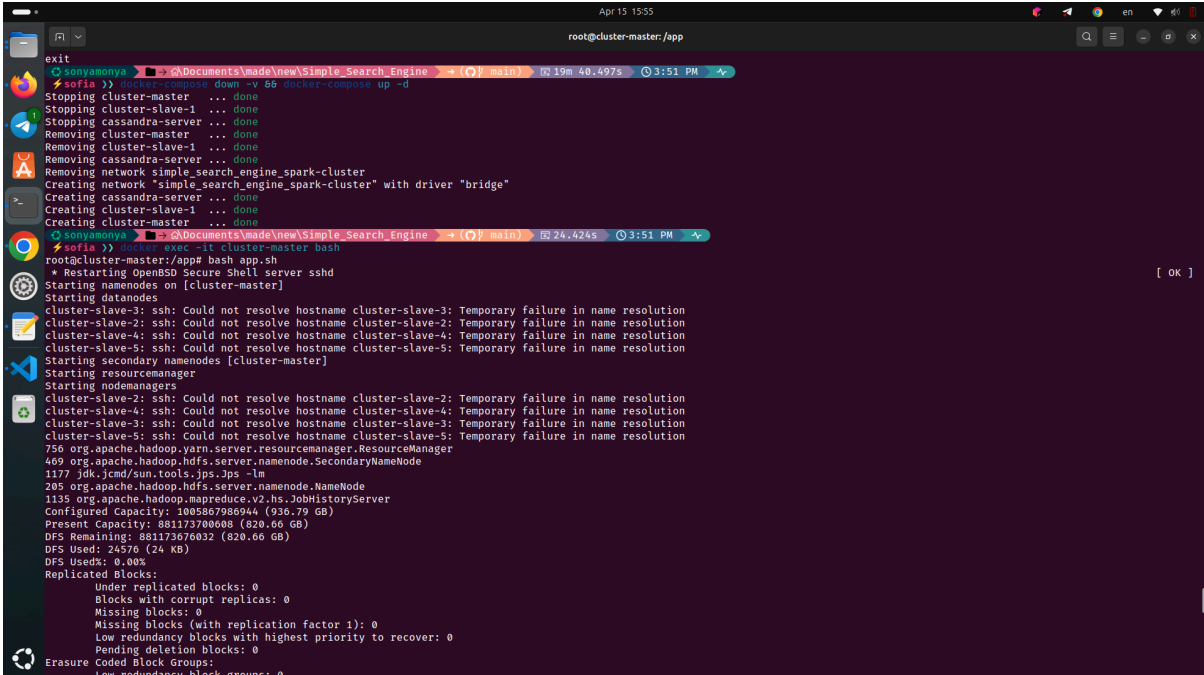
But I will run manually for demonstration

**cd project/path**

**docker-compose up -d**

**docker exec -it cluster-master bash**

**bash app.sh**



```
exit
root@cluster-master:/app
sofia >> docker-compose down -v && docker-compose up -d
Stopping cluster-master ... done
Stopping cluster-slave-1 ... done
Stopping cassandra-server ... done
Removing cluster-master ... done
Removing cluster-slave-1 ... done
Removing cassandra-server ... done
Removing network simple_search_engine_spark-cluster
Creating network "simple_search_engine_spark-cluster" with driver "bridge"
Creating cassandra-server ... done
Creating cluster-slave-1 ... done
Creating cluster-master ... done
sofia >> docker exec -it cluster-master bash
root@cluster-master:/app# bash app.sh
* Restarting OpenSSH Secure Shell server sshd
Starting namenodes on [cluster-master]
Starting datanodes
cluster-slave-3: ssh: Could not resolve hostname cluster-slave-3: Temporary failure in name resolution
cluster-slave-2: ssh: Could not resolve hostname cluster-slave-2: Temporary failure in name resolution
cluster-slave-4: ssh: Could not resolve hostname cluster-slave-4: Temporary failure in name resolution
cluster-slave-5: ssh: Could not resolve hostname cluster-slave-5: Temporary failure in name resolution
Starting secondary namenodes [cluster-master]
Starting resourcemanager
Starting nodemanagers
cluster-slave-2: ssh: Could not resolve hostname cluster-slave-2: Temporary failure in name resolution
cluster-slave-4: ssh: Could not resolve hostname cluster-slave-4: Temporary failure in name resolution
cluster-slave-3: ssh: Could not resolve hostname cluster-slave-3: Temporary failure in name resolution
cluster-slave-5: ssh: Could not resolve hostname cluster-slave-5: Temporary failure in name resolution
756 org.apache.hadoop.yarn.server.resourcemanager.ResourceManager
469 org.apache.hadoop.hdfs.server.namenode.SecondaryNameNode
1177 jdk.jcmd/sun.tools.jps -lm
205 org.apache.hadoop.hdfs.server.namenode.NameNode
1135 org.apache.hadoop.mapreduce.v2.hs.JobHistoryServer
Configured Capacity: 1005867986944 (936.79 GB)
Present Capacity: 881173700608 (820.66 GB)
DFS Remaining: 88117376032 (820.66 GB)
DFS Used: 24576 (24 KB)
DFS Used: 0.00%
Replicated Blocks:
  Under replicated blocks: 0
  Blocks with corrupt replicas: 0
  Missing blocks: 0
  Missing blocks (with replication factor 1): 0
  Low redundancy blocks with highest priority to recover: 0
  Pending deletion blocks: 0
Erasure Coded Block Groups:
  Low redundancy block groups: 0
```

data preparation started:

```
Apr 15 15:57
root@cluster-master:/app

25/04/15 12:55:08 INFO ShuffleBlockFetcherIterator: Started 0 remote fetches in 11 ms
25/04/15 12:55:08 INFO Executor: Finished task 0.0 in stage 2.0 (TID 8). 398377 bytes result sent to driver
25/04/15 12:55:08 INFO TaskSetManager: Finished task 0.0 in stage 2.0 (TID 8) in 288 ms on cluster-master (executor driver) (1/1)
25/04/15 12:55:08 INFO TaskSchedulerImpl: Removed TaskSet 2.0, whose tasks have all completed, from pool
25/04/15 12:55:08 INFO DAGScheduler: ResultStage 2 (toLocalIterator at /app/prepare_data.py:38) finished in 0.313 s
25/04/15 12:55:08 INFO DAGScheduler: Job 1 is finished. Cancelling potential speculative or zombie tasks for this job
25/04/15 12:55:08 INFO TaskSchedulerImpl: Killing all running tasks in stage 2: Stage finished

writing files!

Writing: 100% [██████████] 110/110 [00:00<00:00, 5180.94it/s]

rdd!

25/04/15 12:55:08 INFO MemoryStore: Block broadcast_4 stored as values in memory (estimated size 344.9 KiB, free 2.4 GiB)
25/04/15 12:55:08 INFO MemoryStore: Block broadcast_4_piece0 stored as bytes in memory (estimated size 33.6 KiB, free 2.4 GiB)
25/04/15 12:55:08 INFO BlockManagerInfo: Added broadcast_4_piece0 in memory on cluster-master:38937 (size: 33.6 KiB, free: 2.4 GiB)
25/04/15 12:55:08 INFO SparkContext: Created broadcast 4 from wholeTextFiles at NativeMethodAccessorImpl.java:0
25/04/15 12:55:09 INFO FileInputFormat: Total input files to process : 107
25/04/15 12:55:08 INFO deprecated: mapred.output.dir is deprecated. Instead, use mapreduce.output.fileoutputformat.outputdir
25/04/15 12:55:08 INFO HadoopMapRedCommitProtocol: Using output committer class org.apache.hadoop.mapred.FileOutputCommitter
25/04/15 12:55:08 INFO FileOutputCommitter: File Output Committer Algorithm version is 1
25/04/15 12:55:08 INFO FileOutputCommitter: FileOutputCommitter skip cleanup_temporary folders under output directory:false, ignore cleanup failures: false
25/04/15 12:55:09 INFO SparkContext: Starting job: runJob at SparkHadoopWriter.scala:83
25/04/15 12:55:09 INFO DAGScheduler: Got job 2 (runJob at SparkHadoopWriter.scala:83) with 1 output partitions
25/04/15 12:55:09 INFO DAGScheduler: Final stage: ResultStage 3 (runJob at SparkHadoopWriter.scala:83)
25/04/15 12:55:09 INFO DAGScheduler: Parents of final stage: List()
25/04/15 12:55:09 INFO DAGScheduler: Missing parents: List()
25/04/15 12:55:09 INFO DAGScheduler: Submitting ResultStage 3 (MapPartitionsRDD[10] at saveAsTextFile at NativeMethodAccessorImpl.java:0), which has no missing parents
25/04/15 12:55:09 INFO MemoryStore: Block broadcast_5 stored as values in memory (estimated size 109.0 KiB, free 2.4 GiB)
25/04/15 12:55:09 INFO MemoryStore: Block broadcast_5_piece0 stored as bytes in memory (estimated size 11.4 KiB, free 2.4 GiB)
```

```
Apr 15 16:00
root@cluster-master:/app

25/04/15 12:55:11 INFO ShutdownHookManager: Deleting directory /tmp/spark-3d310147-1da7-481a-932d-3798cd009099/pyspark-7b43ea4d-ba7c-4526-b915-c1cdf25e69bc
25/04/15 12:55:11 INFO ShutdownHookManager: Deleting directory /tmp/spark-3d310147-1da7-481a-932d-3798cd009099
Putting data to hdfs
Found 107 items
-rw-r--r-- 1 root supergroup 2890 2025-04-15 12:55 /data/10119231_A_Balladeer.txt
-rw-r--r-- 1 root supergroup 1414 2025-04-15 12:55 /data/10223157_A_Ballinese_Trance_Seance.txt
-rw-r--r-- 1 root supergroup 2806 2025-04-15 12:55 /data/1107293_A_Bad_Spell_in_Vurt.txt
-rw-r--r-- 1 root supergroup 1648 2025-04-15 12:55 /data/11319167_A_2_Violes_Esgales.txt
-rw-r--r-- 1 root supergroup 444 2025-04-15 12:55 /data/11506718_A_B_Wood_Medal.txt
-rw-r--r-- 1 root supergroup 2529 2025-04-15 12:55 /data/11631735_A_Ballad_of_the_West.txt
-rw-r--r-- 1 root supergroup 4714 2025-04-15 12:55 /data/1177256_A_Bag_of_Marbles.txt
-rw-r--r-- 1 root supergroup 1272 2025-04-15 12:55 /data/12005290_A_Baby_Story.txt
-rw-r--r-- 1 root supergroup 5201 2025-04-15 12:55 /data/13491239_A_44-Calibre_Mystery.txt
-rw-r--r-- 1 root supergroup 726 2025-04-15 12:55 /data/15423655_A_Arte_de_Amar_Bem.txt
-rw-r--r-- 1 root supergroup 9251 2025-04-15 12:55 /data/15547032_A_5_G_Price.txt
-rw-r--r-- 1 root supergroup 216 2025-04-15 12:55 /data/15904376_A_Alao.txt
-rw-r--r-- 1 root supergroup 730 2025-04-15 12:55 /data/16504749_A_Aquarii.txt
-rw-r--r-- 1 root supergroup 4393 2025-04-15 12:55 /data/165709_A_(Jethro_Tull_album).txt
-rw-r--r-- 1 root supergroup 2056 2025-04-15 12:55 /data/18750450_A_Bad_Goodbye.txt
-rw-r--r-- 1 root supergroup 2177 2025-04-15 12:55 /data/19609298_A_Aa_E_Ee_(2009_Tamil_film).txt
-rw-r--r-- 1 root supergroup 900 2025-04-15 12:55 /data/20010647_A_(1965_film).txt
-rw-r--r-- 1 root supergroup 1731 2025-04-15 12:55 /data/20091554_A_Baby_Changes_Everything.txt
-rw-r--r-- 1 root supergroup 622 2025-04-15 12:55 /data/21250874_A_Agualea,_Coristanco.txt
-rw-r--r-- 1 root supergroup 462 2025-04-15 12:55 /data/21875355_A_Balloon_Called_Moaning.txt
-rw-r--r-- 1 root supergroup 206 2025-04-15 12:55 /data/22220936_A_Aa_E_Ee.txt
-rw-r--r-- 1 root supergroup 8996 2025-04-15 12:55 /data/2240580_A_Ballads.txt
-rw-r--r-- 1 root supergroup 1386 2025-04-15 12:55 /data/22811539_A_Aa_E_Ee_(2009_Telugu_film).txt
-rw-r--r-- 1 root supergroup 8429 2025-04-15 12:55 /data/23488527_A_(1998_Kannada_film).txt
-rw-r--r-- 1 root supergroup 1003 2025-04-15 12:55 /data/24604084_A_(1998_Japanese_film).txt
-rw-r--r-- 1 root supergroup 1119 2025-04-15 12:55 /data/2479389_A_Ass_Pocket_of_Whiskey.txt
-rw-r--r-- 1 root supergroup 317 2025-04-15 12:55 /data/25602400_A_(hangul).txt
-rw-r--r-- 1 root supergroup 1133 2025-04-15 12:55 /data/25900879_A_Badly_Broken_Code.txt
-rw-r--r-- 1 root supergroup 3093 2025-04-15 12:55 /data/2828410_A_(musical_note).txt
-rw-r--r-- 1 root supergroup 1394 2025-04-15 12:55 /data/28380942_A_6_P_Food_Stores_Building.txt
-rw-r--r-- 1 root supergroup 2494 2025-04-15 12:55 /data/29703221_A_Ballad_For_Chankhale.txt
-rw-r--r-- 1 root supergroup 843 2025-04-15 12:55 /data/32226335_A_Bailar_(Banghra_album).txt
-rw-r--r-- 1 root supergroup 12374 2025-04-15 12:55 /data/3427439_A_(Ayumi_Hamasaki_EP).txt
-rw-r--r-- 1 root supergroup 4348 2025-04-15 12:55 /data/34380842_A_(Rainbow_song).txt
-rw-r--r-- 1 root supergroup 4195 2025-04-15 12:55 /data/34488106_A_Ball_For_Daisy.txt
-rw-r--r-- 1 root supergroup 1968 2025-04-15 12:55 /data/35688614_A_Bahraini_Tale.txt
-rw-r--r-- 1 root supergroup 5605 2025-04-15 12:55 /data/3579086_A_5_C_Black.txt
-rw-r--r-- 1 root supergroup 3311 2025-04-15 12:55 /data/35987054_A_Bag_of_Hammers.txt
-rw-r--r-- 1 root supergroup 2935 2025-04-15 12:55 /data/36481868_A_Bad_Boy_Can_Be_Good_For_a_Girl.txt
-rw-r--r-- 1 root supergroup 39106 2025-04-15 12:55 /data/38061693_A_(Pretty_Little_Liars).txt
-rw-r--r-- 1 root supergroup 1635 2025-04-15 12:55 /data/38370970_A_(Jimmy_Raney_album).txt
-rw-r--r-- 1 root supergroup 632 2025-04-15 12:55 /data/38770923_A_Bachelor's_Life_Abroad.txt
-rw-r--r-- 1 root supergroup 966 2025-04-15 12:55 /data/38903665_A_Balcony_in_Paris.txt
-rw-r--r-- 1 root supergroup 11839 2025-04-15 12:55 /data/38966582_A_6_R_Recording.txt
-rw-r--r-- 1 root supergroup 8862 2025-04-15 12:55 /data/39204695_A_Bad_Wind_Blow_in_My_Heart.txt
```

## indexing

```
Virtual memory (bytes) snapshot=7776387072
Total committed heap usage (bytes)=999292928
Peak Map Physical memory (bytes)=367643904
Peak Map Virtual memory (bytes)=2591711232
Peak Reduce Physical memory (bytes)=256290816
Peak Reduce Virtual memory (bytes)=2593222656

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=380858
File Output Format Counters
Bytes Written=3027

2025-04-15 12:56:31,424 INFO streaming.StreamJob: Output directory: /tmp/doc_titles
Preview output:
0 41801556 1
0 39204695 1
0 41801556 1
0 15547032 3
0 15547032 3
0 70800868 1
0 5405379 1
0 15547032 3
0 41205399 1
0 15547032 4
0 1177256 1
cat: Unable to write to output stream.
Populating Cassandra index...
Cassandra keyspace and tables created.
Connecting to Cassandra...
Downloading HDFS file: /tmp/index1 to local file: index_output.txt...
Loading document titles from second pipeline...
Downloading HDFS files: /tmp/doc_titles to local file: titles.txt...
Data written to term_index table.
Vocabulary table updated.
Document statistics table updated.
Cassandra index insertion completed.
Indexing complete.
This script will include commands to search for documents given the query using Spark RDD
:: loading settings :: url = jar:file:/usr/local/spark/jars/ivy-2.5.1.jar!/org/apache/ivy/core/settings/ivysettings.xml
Ivy Default cache set to: /root/.ivy2/cache
The jars for the packages stored in: /root/.ivy2/jars
com.datastax.spark#spark-cassandra-connector-2.12 added as a dependency
:: resolving dependencies :: org.apache.spark#spark-submit-parent-2a09cde4-a11c-4a7f-83b7-609c963a1e8f;1.0
confs: [default]
found com.datastax.spark#spark-cassandra-connector-2.12;3.4.1 in central
found com.datastax.spark#spark-cassandra-connector-driver-2.12;3.4.1 in central
```

## “Film” search

```
25/04/15 12:58:41 INFO DAGScheduler: failed: Set()
25/04/15 12:58:41 INFO DAGScheduler: Submitting ResultStage 9 (PythonRDD[38] at takeOrdered at /app/query.py:55), which has no missing parents
25/04/15 12:58:41 INFO MemoryStore: Block broadcast_7 stored as values in memory (estimated size 12.2 KiB, free 366.1 MiB)
25/04/15 12:58:41 INFO BlockManagerInfo: Added broadcast_7_piece0 stored as bytes in memory (estimated size 7.1 KiB, free 366.1 MiB)
25/04/15 12:58:41 INFO BlockManagerInfo: Added broadcast_7_piece0 in memory on cluster-master:33189 (size: 7.1 KiB, free: 366.2 MiB)
25/04/15 12:58:41 INFO SparkContext: Created broadcast 7 from broadcast at DAGScheduler.scala:1585
25/04/15 12:58:41 INFO DAGScheduler: Submitting 1 missing tasks from ResultStage 9 (PythonRDD[38] at takeOrdered at /app/query.py:55) (first 15 tasks are for partitions Vector(0))
25/04/15 12:58:41 INFO YarnScheduler: Adding task set 9.0 with 1 tasks, resource profile 0
25/04/15 12:58:41 INFO TaskSetManager: Starting task 0.0 in stage 9.0 (TID 22) (cluster-slave-1, executor 2, partition 0, NODE_LOCAL, 8828 Bytes)
25/04/15 12:58:41 INFO BlockManagerInfo: Added broadcast_7_piece0 in memory on cluster-slave-1:45787 (size: 7.1 KiB, free: 366.3 MiB)
25/04/15 12:58:41 INFO MapOutputTrackerMasterEndpoint: Asked to send map output locations for shuffle 2 to 172.27.0.3:33360
25/04/15 12:58:42 INFO TaskSetManager: Finished task 0.0 in stage 9.0 (TID 22) in 464 ms on cluster-slave-1 (executor 2) (1/1)
25/04/15 12:58:42 INFO YarnScheduler: Removed TaskSet 9.0, whose tasks have all completed, from pool
25/04/15 12:58:42 INFO DAGScheduler: ResultStage 9 (takeOrdered at /app/query.py:55) finished in 0.473 s
25/04/15 12:58:42 INFO DAGScheduler: Job 6 is finished. Cancelling potential speculative or zombie tasks for this job
25/04/15 12:58:42 INFO YarnScheduler: Killing all running tasks in stage 9: Stage finished
25/04/15 12:58:42 INFO DAGScheduler: Job 6 finished: takeOrdered at /app/query.py:55, took 1.010300 s

Top 10 Results:
63462998 A.Ballad_About_Green_Wood Score: 2.1197
22220930 A.Aa_E_Ee Score: 1.8969
38770923 A.Bachelor's_Life_Abroad Score: 1.7919
62921681 A.3_Minute_Hug Score: 1.7841
15423655 A.Arte_de_Amar_Bem Score: 1.7594
51755157 A.Bachelor's_Baby Score: 1.7538
20016047 A.(1965_film) Score: 1.7067
24004084 A.(1999_Japanese_film) Scores: 1.6704
45682364 A.Bachelor_Husband Score: 1.6292
10223157 A.Balinese_Trance_Seance Score: 1.6007
25/04/15 12:58:42 INFO SparkContext: Invoking stop() from shutdown hook
25/04/15 12:58:42 INFO SparkContext: SparkContext is stopping with exitCode 0.
25/04/15 12:58:42 INFO SparkUI: Stopped Spark web UI at http://cluster-master:4040
25/04/15 12:58:42 INFO CassandraConnector: Disconnected from Cassandra cluster.
25/04/15 12:58:42 INFO SerialShutdownHooks: Successfully executed shutdown hook: Clearing session cache for C* connector
25/04/15 12:58:42 INFO YarnClientSchedulerBackend: Interrupting monitor thread
25/04/15 12:58:42 INFO YarnClientSchedulerBackend: Shutting down all executors
25/04/15 12:58:42 INFO YarnSchedulerBackend$YarnDriverEndpoint: Asking each executor to shut down
25/04/15 12:58:42 INFO YarnClientSchedulerBackend: YARN client scheduler backend Stopped
25/04/15 12:58:42 INFO MapOutputTrackerMasterEndpoint: MapOutputTrackerMasterEndpoint stopped!
25/04/15 12:58:42 INFO MemoryStore: MemoryStore cleared
25/04/15 12:58:42 INFO BlockManager: BlockManager stopped
25/04/15 12:58:42 INFO BlockManagerMaster: BlockManagerMaster stopped
25/04/15 12:58:42 INFO OutputCommitCoordinator$OutputCommitCoordinatorEndpoint: OutputCommitCoordinator stopped!
25/04/15 12:58:42 INFO SparkContext: Successfully stopped SparkContext
25/04/15 12:58:42 INFO ShutdownHookManager: Shutdown hook called
25/04/15 12:58:42 INFO ShutdownHookManager: Deleting directory /tmp/spark-24633482-1ed5-4e8c-829d-d9594499a824
25/04/15 12:58:42 INFO ShutdownHookManager: Deleting directory /tmp/spark-ae3f16b-3deb-4b03-baf9-3829723529bd/pyspark-5c7c49da-aecf-41b2-a232-6328a8dee13f
25/04/15 12:58:42 INFO ShutdownHookManager: Deleting directory /tmp/spark-ae3f16b-3deb-4b03-baf9-3829723529bd
This script will include commands to search for documents given the query using Spark RDD
:: loading settings :: url = jar:file:/usr/local/spark/jars/ivy-2.5.1.jar!/org/apache/ivy/core/settings/ivysettings.xml
```

## “Food” search

```
Apr 15 16:04
root@cluster-master:/app

25/04/15 12:59:33 INFO DAGScheduler: Submitting ResultStage 9 (PythonRDD[38] at takeOrdered at /app/query.py:55), which has no missing parents
25/04/15 12:59:33 INFO MemoryStore: Block broadcast_7 stored as values in memory (estimated size 12.2 KiB, free 366.1 MiB)
25/04/15 12:59:33 INFO MemoryStore: Block broadcast_7_piece0 stored as bytes in memory (estimated size 7.1 KiB, free 366.1 MiB)
25/04/15 12:59:33 INFO BlockManagerInfo: Added broadcast_7_piece0 in memory on cluster-master:44425 (size: 7.1 KiB, free: 366.3 MiB)
25/04/15 12:59:33 INFO SparkContext: Created broadcast 7 from broadcast at DAGScheduler.scala:1585
25/04/15 12:59:33 INFO DAGScheduler: Submitting 1 missing tasks from ResultStage 9 (PythonRDD[38] at takeOrdered at /app/query.py:55) (first 15 tasks are for partitions Vector(0))
25/04/15 12:59:33 INFO YarnScheduler: Adding task set 9.0 with 1 tasks resource profile 0
25/04/15 12:59:33 INFO TaskSetManager: Starting task 0.0 in stage 9.0 (TID 22) (cluster-slave-1, executor 1, partition 0, NODE_LOCAL, 8828 bytes)
25/04/15 12:59:33 INFO BlockManagerInfo: Added broadcast_7_piece0 in memory on cluster-slave-1:46277 (size: 7.1 KiB, free: 366.3 MiB)
25/04/15 12:59:33 INFO MapOutputTrackerMasterEndpoint: Asked to send map output locations for shuffle 2 to 172.27.0.3:53078
25/04/15 12:59:33 INFO TaskSetManager: Finished task 0.0 in stage 9.0 (TID 22) in 536 ms on cluster-slave-1 (executor 1) (1/1)
25/04/15 12:59:33 INFO YarnScheduler: Removed TaskSet 9.0, whose tasks have all completed, from pool
25/04/15 12:59:33 INFO DAGScheduler: ResultStage 9 (takeOrdered at /app/query.py:55) finished in 0.549 s
25/04/15 12:59:33 INFO DAGScheduler: Job 6 is finished. Cancelling potential speculative or zombie tasks for this job
25/04/15 12:59:33 INFO YarnScheduler: Killing all running tasks in stage 9: Stage finished
25/04/15 12:59:33 INFO DAGScheduler: Job 6 finished: takeOrdered at /app/query.py:55, took 1.332804 s

Top 10 Results:
28388942 A.P.Food.Stores.Building Score: 5.2874
41801556 A.(The.Walking.Dead) Score: 2.6290
25/04/15 12:59:33 INFO SparkContext: Invoking stop() from shutdown hook
25/04/15 12:59:33 INFO SparkContext: SparkContext is stopping with exitCode 0.
25/04/15 12:59:33 INFO SparkUI: Stopped Spark web UI at http://cluster-master:4040
25/04/15 12:59:34 INFO CassandraConnector: Disconnected from Cassandra cluster.
25/04/15 12:59:34 INFO SerialShutdownHooks: Successfully executed shutdown hook: Clearing session cache for C* connector
25/04/15 12:59:34 INFO YarnClientSchedulerBackend: Interrupting monitor thread
25/04/15 12:59:34 INFO YarnClientSchedulerBackend: Shutting down all executors
25/04/15 12:59:34 INFO YarnSchedulerBackend$YarnDriverEndpoint: Asking each executor to shut down
25/04/15 12:59:34 INFO YarnClientSchedulerBackend: YARN client scheduler backend stopped
25/04/15 12:59:34 INFO MapOutputTrackerMasterEndpoint: MapOutputTrackerMasterEndpoint stopped!
25/04/15 12:59:34 INFO MemoryStore: MemoryStore cleared
25/04/15 12:59:34 INFO BlockManager: BlockManager stopped
25/04/15 12:59:34 INFO BlockManagerMaster: BlockManagerMaster stopped
25/04/15 12:59:34 INFO OutputCommitCoordinator$OutputCommitCoordinatorEndpoint: OutputCommitCoordinator stopped!
25/04/15 12:59:34 INFO SparkContext: Successfully stopped SparkContext
25/04/15 12:59:34 INFO ShutdownHookManager: Shutdown hook called
25/04/15 12:59:34 INFO ShutdownHookManager: Deleting directory /tmp/spark-64e07a51-f09e-41a3-9797-4da5a810d103
25/04/15 12:59:34 INFO ShutdownHookManager: Deleting directory /tmp/spark-efca028b-9903-48c5-bc94-7a4867abdb96
25/04/15 12:59:34 INFO ShutdownHookManager: Deleting directory /tmp/spark-64e07a51-f09e-41a3-9797-4da5a810d103/pyspark-927c02e6-c239-480d-abab-90a1a743df81
This script will include commands to search for documents given the query using Spark RDD
:: loading settings :: url = jar:file:/usr/local/spark/jars/ivy-2.5.1.jar!/org/apache/ivy/core/settings/ivysettings.xml
Ivy Default Cache set to: /root/.ivy2/cache
The jars for the packages stored in: /root/.ivy2/jars
com.datastax.spark.spark-cassandra-connector-2.12 added as a dependency
:: resolving dependencies :: org.apache.spark/spark-submit-parent-816d0d99-6af6-4405-a5e6-2e02bdf205c2;1.0
comfs: [default]
found com.datastax.spark.spark-cassandra-connector-2.12;3.4.1 in central
found com.datastax.spark.spark-cassandra-connector-driver-2.12;3.4.1 in central
found org.scala-lang.modules#scala-collection-compat-2.12;2.11.0 in central
found com.datastax.oss/java-driver-core-shaded-4.13.0 in central
```

## “Baby” search

```
Apr 15 16:05
root@cluster-master:/app

25/04/15 13:00:30 INFO DAGScheduler: running: Set()
25/04/15 13:00:30 INFO DAGScheduler: waiting: Set(ResultStage 9)
25/04/15 13:00:30 INFO DAGScheduler: failed: Set()
25/04/15 13:00:30 INFO DAGScheduler: Submitting ResultStage 9 (PythonRDD[38] at takeOrdered at /app/query.py:55), which has no missing parents
25/04/15 13:00:30 INFO MemoryStore: Block broadcast_7 stored as values in memory (estimated size 12.2 KiB, free 366.1 MiB)
25/04/15 13:00:30 INFO MemoryStore: Block broadcast_7_piece0 stored as bytes in memory (estimated size 7.1 KiB, free 366.1 MiB)
25/04/15 13:00:30 INFO BlockManagerInfo: Added broadcast_7_piece0 in memory on cluster-master:40397 (size: 7.1 KiB, free: 366.2 MiB)
25/04/15 13:00:30 INFO SparkContext: Created broadcast 7 from broadcast at DAGScheduler.scala:1585
25/04/15 13:00:30 INFO DAGScheduler: Submitting 1 missing tasks from ResultStage 9 (PythonRDD[38] at takeOrdered at /app/query.py:55) (first 15 tasks are for partitions Vector(0))
25/04/15 13:00:30 INFO YarnScheduler: Adding task set 9.0 with 1 tasks resource profile 0
25/04/15 13:00:30 INFO TaskSetManager: Starting task 0.0 in stage 9.0 (TID 22) (cluster-slave-1, executor 1, partition 0, NODE_LOCAL, 8828 bytes)
25/04/15 13:00:30 INFO BlockManagerInfo: Added broadcast_7_piece0 in memory on cluster-slave-1:46277 (size: 7.1 KiB, free: 366.3 MiB)
25/04/15 13:00:30 INFO MapOutputTrackerMasterEndpoint: Asked to send map output locations for shuffle 2 to 172.27.0.3:54400
25/04/15 13:00:30 INFO TaskSetManager: Finished task 0.0 in stage 9.0 (TID 22) in 588 ms on cluster-slave-1 (executor 1) (1/1)
25/04/15 13:00:31 INFO YarnScheduler: Removed TaskSet 9.0, whose tasks have all completed, from pool
25/04/15 13:00:31 INFO DAGScheduler: ResultStage 9 (takeOrdered at /app/query.py:55) finished in 0.599 s
25/04/15 13:00:31 INFO DAGScheduler: Job 6 is finished. Cancelling potential speculative or zombie tasks for this job
25/04/15 13:00:31 INFO YarnScheduler: Killing all running tasks in stage 9: Stage finished
25/04/15 13:00:31 INFO DAGScheduler: Job 6 finished: takeOrdered at /app/query.py:55, took 1.187857 s

Top 10 Results:
61795157 A.Bachelor's.Baby Score: 3.8666
54064782 A.Ballad.Album Score: 3.5989
12005290 A.Baby.Story Score: 3.5394
20699154 A.Baby.Changes.Everything Score: 3.2372
70132625 A.Bachelor's.Wife Score: 3.1020
05392111 A.Babysitter's.Guide.to.Monster.Hunting Score: 2.1493
47880532 A.Aa Score: 1.5930
38001693 A.(Pretty.Little.Liars) Score: 0.4681
25/04/15 13:00:31 INFO SparkContext: Invoking stop() from shutdown hook
25/04/15 13:00:31 INFO SparkContext: SparkContext is stopping with exitCode 0.
25/04/15 13:00:31 INFO SparkUI: Stopped Spark web UI at http://cluster-master:4040
25/04/15 13:00:31 INFO CassandraConnector: Disconnected from Cassandra cluster.
25/04/15 13:00:31 INFO SerialShutdownHooks: Successfully executed shutdown hook: Clearing session cache for C* connector
25/04/15 13:00:31 INFO YarnClientSchedulerBackend: Interrupting monitor thread
25/04/15 13:00:31 INFO YarnClientSchedulerBackend: Shutting down all executors
25/04/15 13:00:31 INFO YarnSchedulerBackend$YarnDriverEndpoint: Asking each executor to shut down
25/04/15 13:00:31 INFO YarnClientSchedulerBackend: YARN client scheduler backend stopped
25/04/15 13:00:31 INFO MapOutputTrackerMasterEndpoint: MapOutputTrackerMasterEndpoint stopped!
25/04/15 13:00:31 INFO MemoryStore: MemoryStore cleared
25/04/15 13:00:31 INFO BlockManager: BlockManager stopped
25/04/15 13:00:31 INFO BlockManagerMaster: BlockManagerMaster stopped
25/04/15 13:00:31 INFO OutputCommitCoordinator$OutputCommitCoordinatorEndpoint: OutputCommitCoordinator stopped!
25/04/15 13:00:31 INFO SparkContext: Successfully stopped SparkContext
25/04/15 13:00:31 INFO ShutdownHookManager: Shutdown hook called
25/04/15 13:00:31 INFO ShutdownHookManager: Deleting directory /tmp/spark-40a5eac3-4488-4b2d-9fb8-fb3215f63a82/pyspark-43613cb7-5d25-42b1-b551-174fb8ed089e
25/04/15 13:00:31 INFO ShutdownHookManager: Deleting directory /tmp/spark-40a5eac3-4488-4b2d-9fb8-fb3215f63a82
25/04/15 13:00:31 INFO ShutdownHookManager: Deleting directory /tmp/spark-8626bc65-048f-4ad8-9a43-01a831e50404
root@cluster-master:/app
```

As you can notice, the search finds relevant items even if the search query is not in the title of the article, for some words the search may output empty results if there are no relevant items.