

# HW #1 Spark SQL

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## (1) SQL query (1점\*Query2개)

문제1) select project,title,count from wiki

where project='de' and title<>'Woodkid' and count >=800 and count<1000

order by count desc

문제2) select owner,avg(count) as avg\_count from wiki

natural join owner

group by owner

## (2) jupyter notebook에 보여지는 Query 실행결과 스크린샷 (1점\*Query2개)

문제1)

```
In [30]: # df.createOrReplaceTempView("...", " ")
# selected = ss.sql("...", " ")
# selected.show()
df.createOrReplaceTempView('wiki') # create temp view
no1 = ss.sql("select project,title,count #
              from wiki #
              where project='de' and title<>'Woodkid' and count >=800 and count<1000 #
              order by count desc")
no1.show()
```

| project | title                | count |
|---------|----------------------|-------|
| de      | Wikipedia:Auskunf... | 900   |
| de      | Spezial:Beobachtu... | 882   |
| de      | Spezial:Beobachtu... | 804   |

문제2)

```
In [31]: ownertable_raw = [('Woodkid','Lila'),('Sia','Jane'),('Ryuichi_Sakamoto','Sam')]
ownerrdd = sc.parallelize(ownertable_raw)
ownerdf = ss.createDataFrame(ownerrdd,['title','owner'])
ownerdf.show()
```

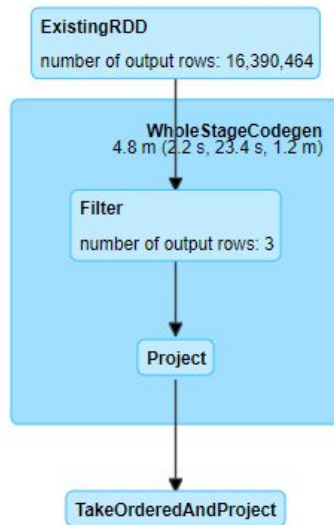
| title            | owner |
|------------------|-------|
| Woodkid          | Lila  |
| Sia              | Jane  |
| Ryuichi_Sakamoto | Sam   |

```
In [32]: ownerdf.createOrReplaceTempView('owner')
no2 = ss.sql("select owner,avg(count) as avg_count#
              from wiki#
              natural join owner#
              group by owner")
no2.show()
```

| owner | avg_count |
|-------|-----------|
| Lila  | 2.3       |
| Sam   | 14.0      |
| Jane  | 10.0      |

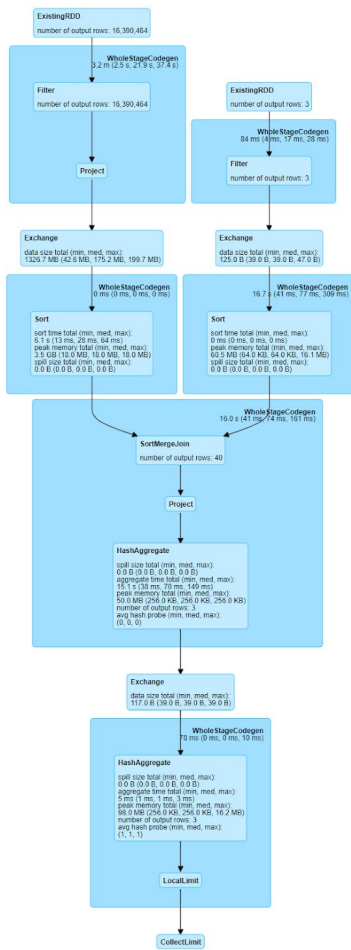
(3) Spark Web UI 'SQL' tab 에서 보여지는 Query plan 그래프의 스크린샷 (1점\*Query2개)  
문제1)

Submitted Time: 2019/04/18 10:11:03  
Duration: 36 s  
Succeeded Jobs: 20



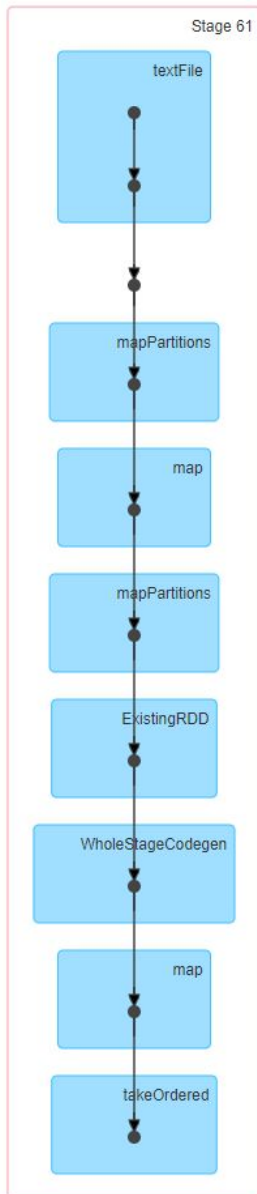
문제2)

Submitted Time: 2019/04/18 10:31:15  
 Duration: 43 s  
 Succeeded Jobs: 32 33 34 35 36



Details

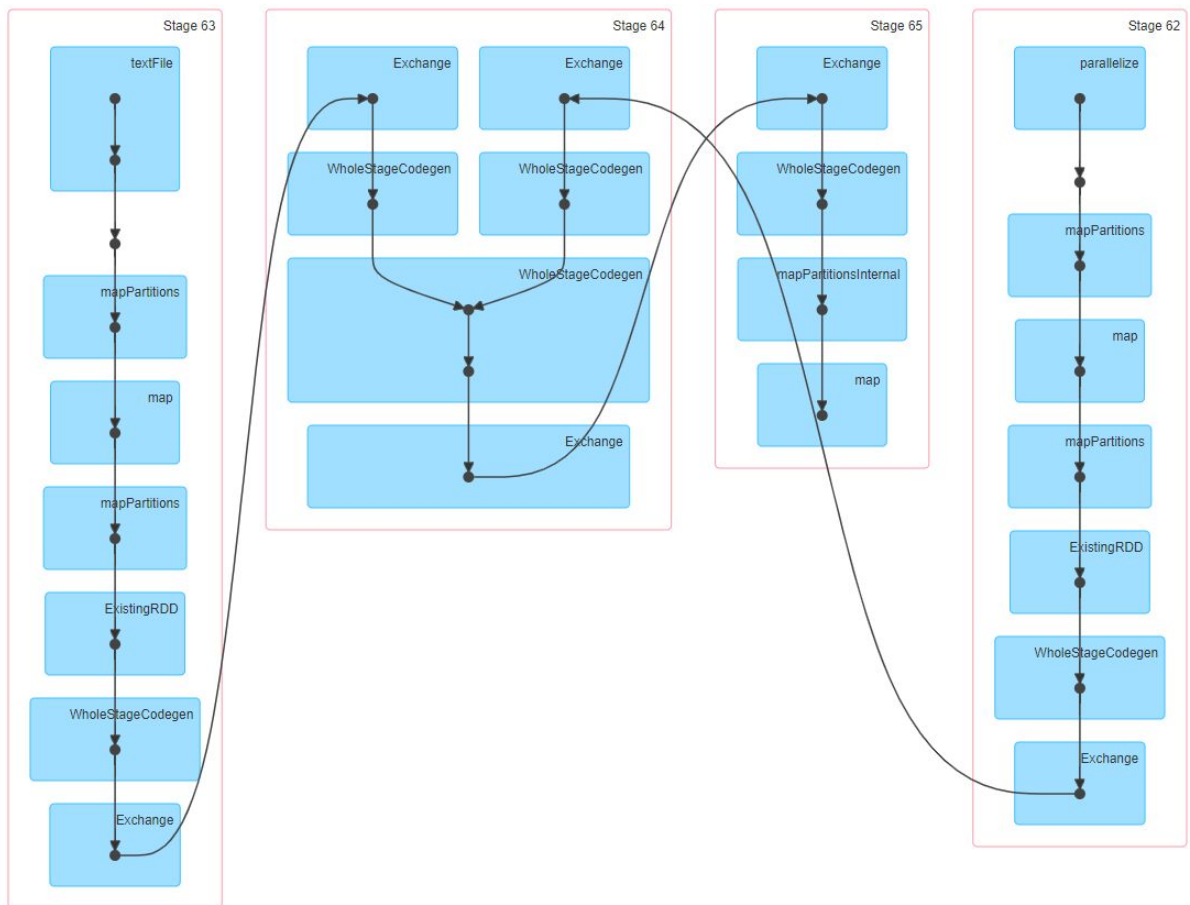
(4) Spark Web UI 'Jobs' tab 에서 보여지는 DAG Visualization 그래프의 스크린샷  
 (1점\*Query2개)  
 문제1)



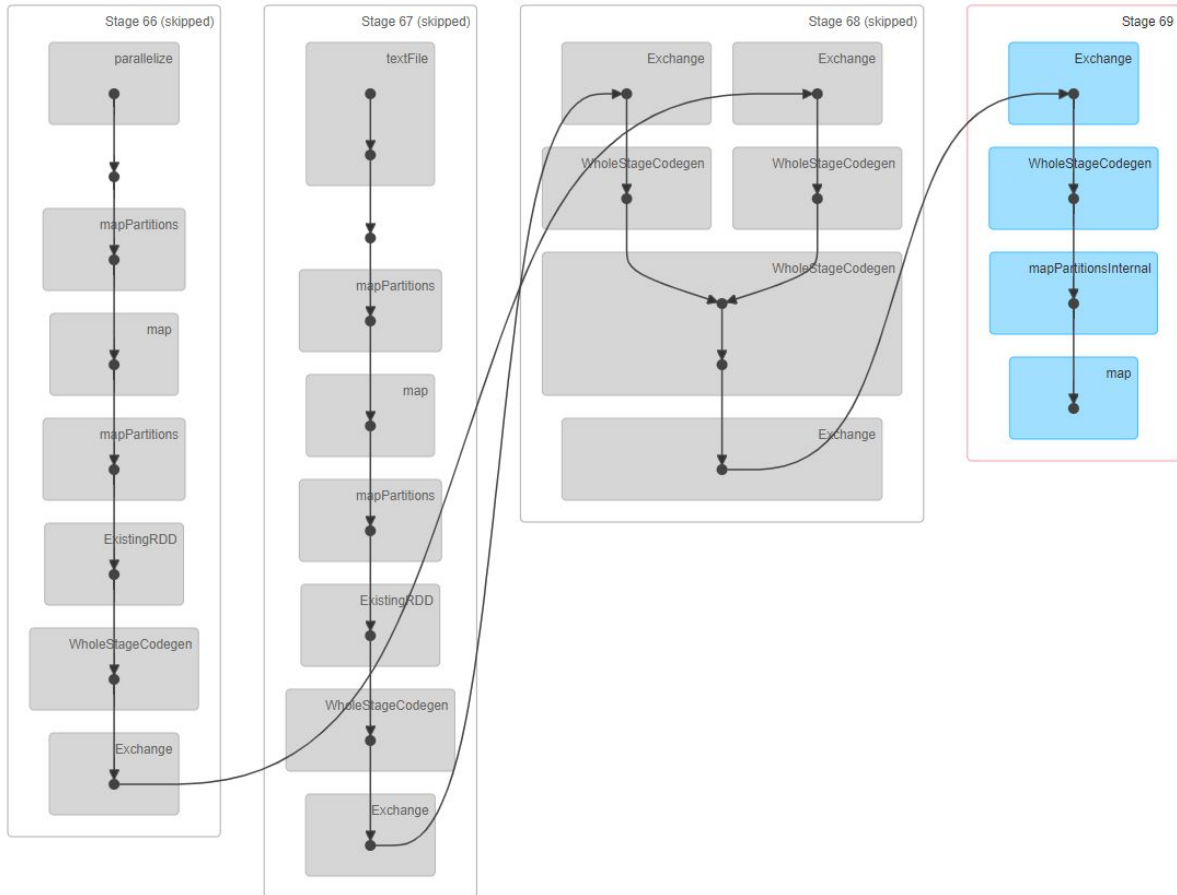
## 문제2) 총 5개의 Job 으로 진행됨

| Job Id | Description  | Submitted           | Duration | Stages: Succeeded/Total | Tasks (for all stages): Succeeded/Total |
|--------|--|---------------------|----------|-------------------------|---|
| 36     | showString at NativeMethodAccessorImpl.java:0<br>showString at NativeMethodAccessorImpl.java:0 | 2019/04/18 10:31:58 | 0.2 s    | 1/1 (3 skipped)         | 75/75 (215 skipped)                     |
| 35     | showString at NativeMethodAccessorImpl.java:0<br>showString at NativeMethodAccessorImpl.java:0 | 2019/04/18 10:31:57 | 0.2 s    | 1/1 (3 skipped)         | 100/100 (215 skipped)                   |
| 34     | showString at NativeMethodAccessorImpl.java:0<br>showString at NativeMethodAccessorImpl.java:0 | 2019/04/18 10:31:57 | 48 ms    | 1/1 (3 skipped)         | 20/20 (215 skipped)                     |
| 33     | showString at NativeMethodAccessorImpl.java:0<br>showString at NativeMethodAccessorImpl.java:0 | 2019/04/18 10:31:57 | 25 ms    | 1/1 (3 skipped)         | 4/4 (215 skipped)                       |
| 32     | showString at NativeMethodAccessorImpl.java:0<br>showString at NativeMethodAccessorImpl.java:0 | 2019/04/18 10:31:15 | 42 s     | 4/4                     | 216/216                                 |

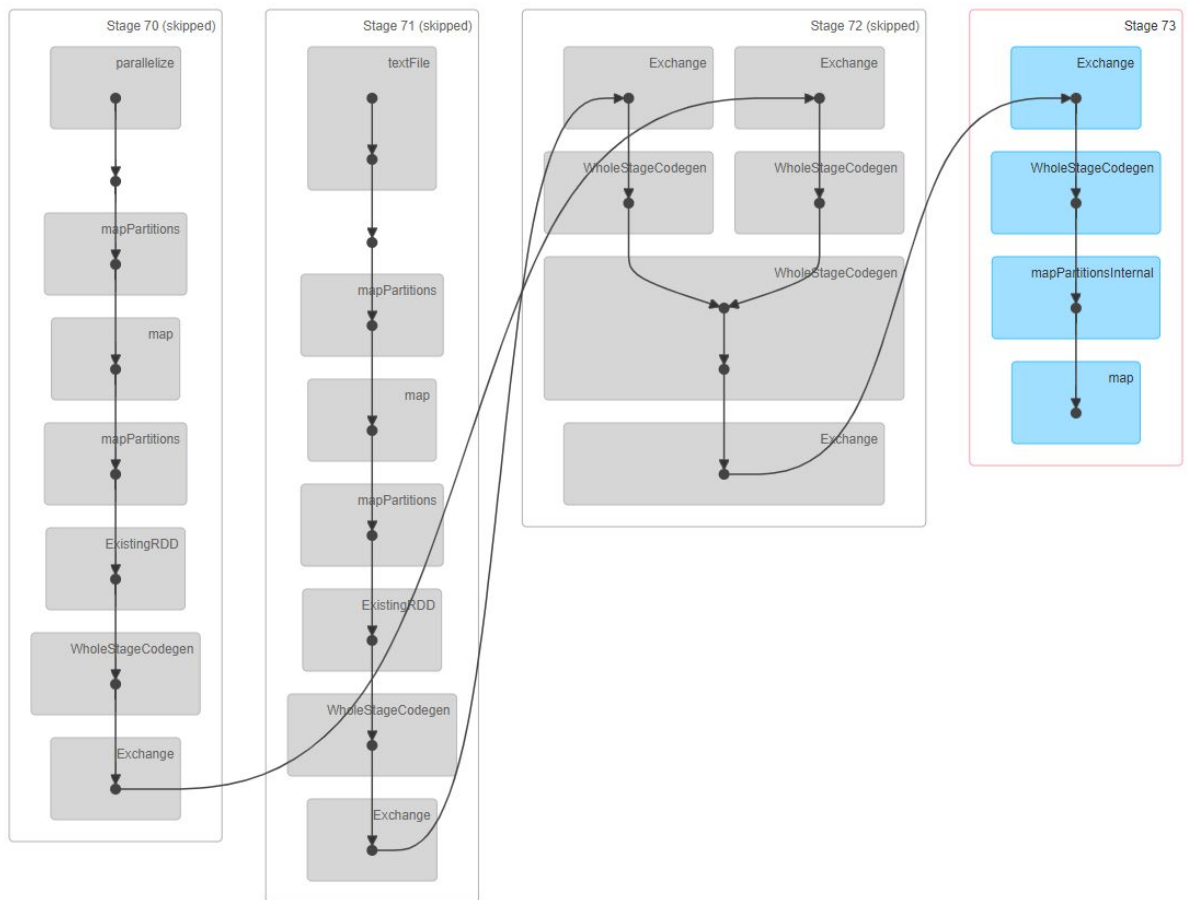
JobID 32 (Stages 4/4)



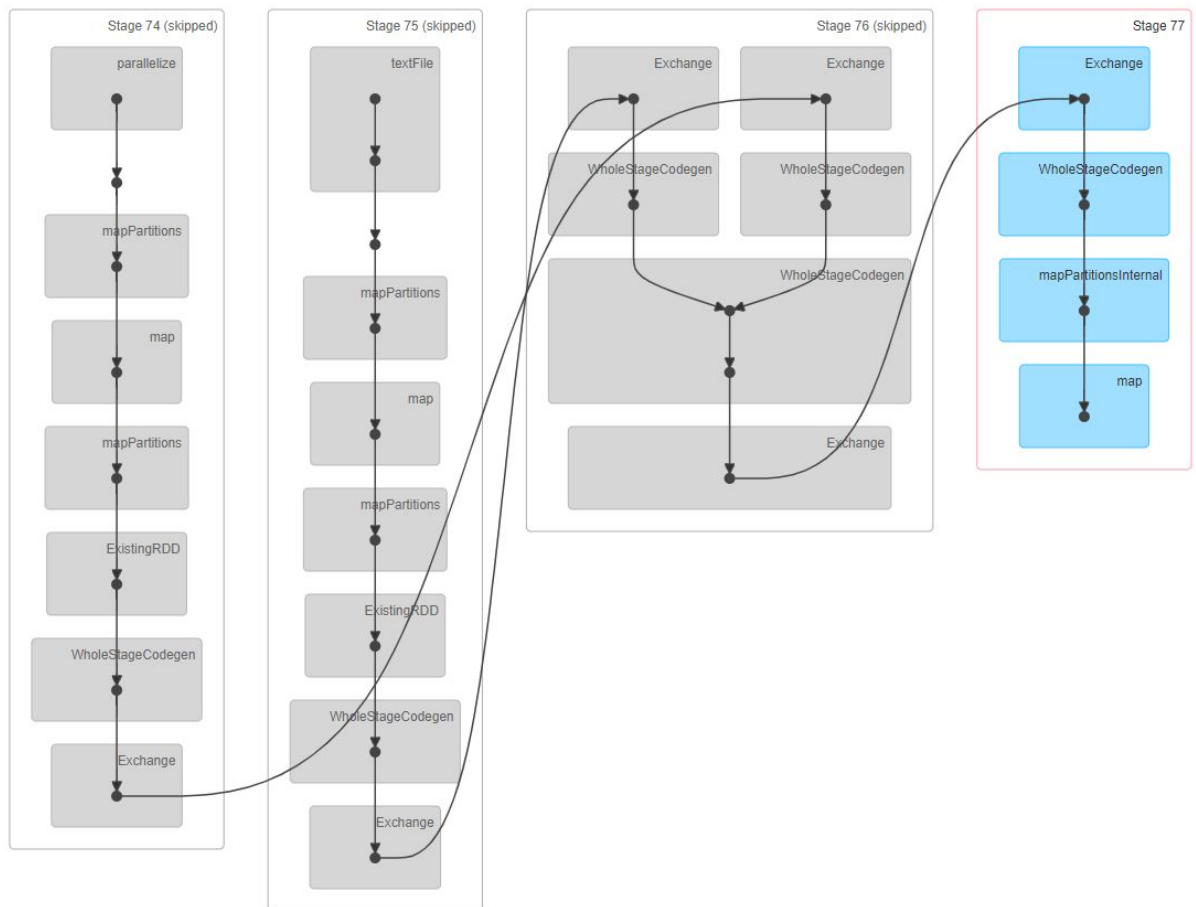
JobID 33 (1/1 (3 skipped))



JobID 34 (1/1 (3 skipped))

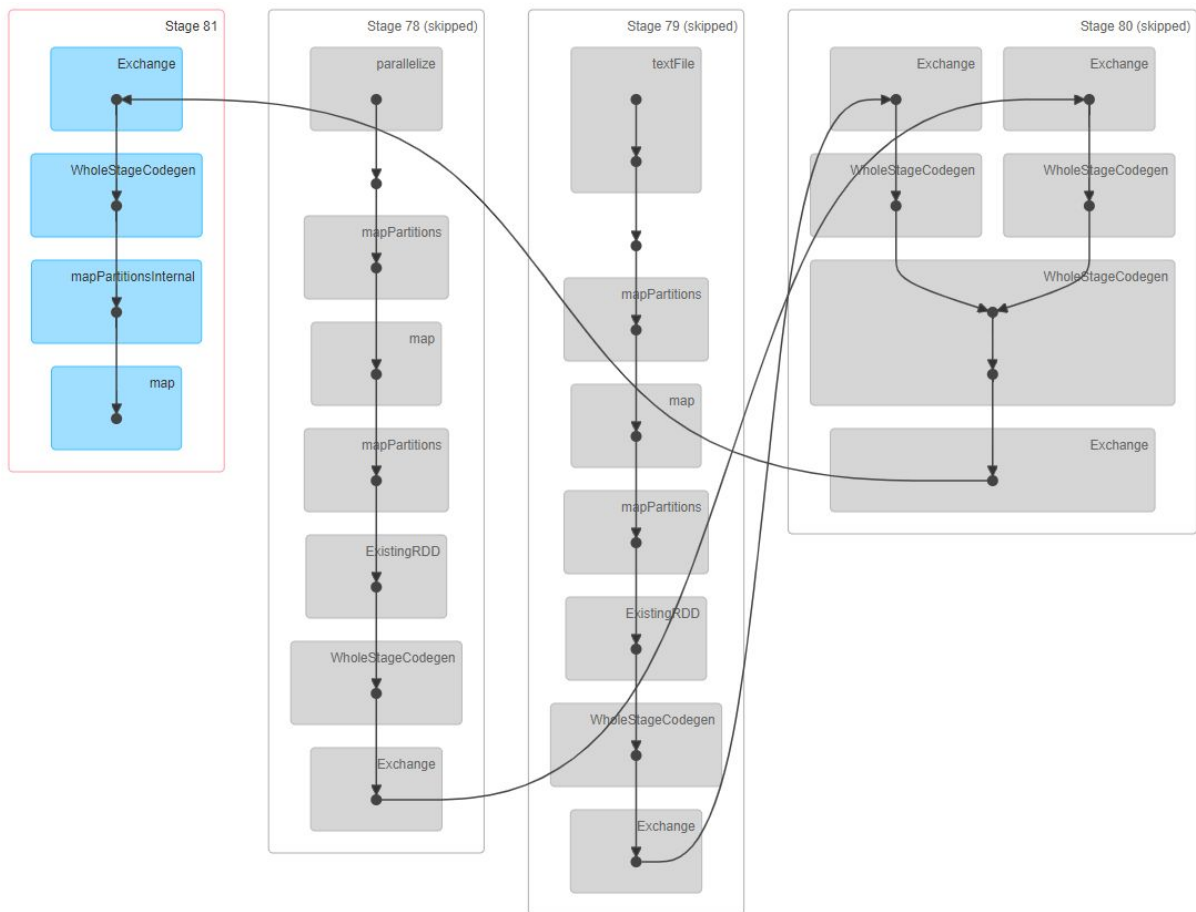


JobID 35 (1/1 (3 skipped))



JobID 36 (1/1 (3 skipped))





(5) Spark Web UI 'Stages' tab에서 보여지는, 해당 Query에 대응하는 Job에 속하는 모든 Stage들의 'Summary Metrics for N Completed Tasks' 테이블의 스크린샷  
(1점\*Query2개)

문제1)

|    |   |                     |       |     |  |  |  |         |
|----|---|---------------------|-------|-----|--|--|--|---------|
| 62 | <a href="#">showString at NativeMethodAccessorImpl.java:0</a><br>+details | 2019/04/18 10:31:15 | 98 ms | 6/6 |  |  |  | 258.0 B |
|----|---|---------------------|-------|-----|--|--|--|---------|

#### Summary Metrics for 9 Completed Tasks

| Metric               | Min              | 25th percentile  | Median             | 75th percentile    | Max                |
|----------------------|------------------|------------------|--------------------|--------------------|--------------------|
| Duration             | 2 s              | 7 s              | 24 s               | 32 s               | 34 s               |
| GC Time              | 40 ms            | 0.1 s            | 0.3 s              | 0.4 s              | 0.4 s              |
| Input Size / Records | 39.2 MB / 148050 | 96.7 MB / 521200 | 128.1 MB / 2133942 | 128.1 MB / 3159349 | 128.1 MB / 3261669 |

문제2)

| Stage Id<br>▼ | Description   | Submitted           | Duration | Tasks: Succeeded/Total | Input    | Output | Shuffle Read | Shuffle Write |
|---------------|---|---------------------|----------|------------------------|----------|--------|--------------|---------------|
| 81            | <a href="#">showString at NativeMethodAccessorImpl.java:0</a><br>+details | 2019/04/18 10:31:58 | 0.1 s    | 75/75                  |          |        | 78.0 B       |               |
| 77            | <a href="#">showString at NativeMethodAccessorImpl.java:0</a><br>+details | 2019/04/18 10:31:57 | 0.2 s    | 100/100                |          |        | 156.0 B      |               |
| 73            | <a href="#">showString at NativeMethodAccessorImpl.java:0</a><br>+details | 2019/04/18 10:31:57 | 40 ms    | 20/20                  |          |        |              |               |
| 69            | <a href="#">showString at NativeMethodAccessorImpl.java:0</a><br>+details | 2019/04/18 10:31:57 | 21 ms    | 4/4                    |          |        |              |               |
| 65            | <a href="#">showString at NativeMethodAccessorImpl.java:0</a><br>+details | 2019/04/18 10:31:57 | 15 ms    | 1/1                    |          |        |              |               |
| 64            | <a href="#">showString at NativeMethodAccessorImpl.java:0</a><br>+details | 2019/04/18 10:31:54 | 3 s      | 200/200                |          |        | 550.8 MB     | 234.0 B       |
| 63            | <a href="#">showString at NativeMethodAccessorImpl.java:0</a><br>+details | 2019/04/18 10:31:15 | 39 s     | 9/9                    | 966.5 MB |        |              | 550.8 MB      |

### Details for Stage 63 (Attempt 0)

**Total Time Across All Tasks:** 3.2 min  
**Locality Level Summary:** Any: 9  
**Input Size / Records:** 966.5 MB / 16390464  
**Shuffle Write:** 550.8 MB / 16390464

- ▶ [DAG Visualization](#)
- ▶ [Show Additional Metrics](#)
- ▶ [Event Timeline](#)

**Summary Metrics for 9 Completed Tasks**

| Metric                       | Min              | 25th percentile  | Median             | 75th percentile    | Max                |
|------------------------------|------------------|------------------|--------------------|--------------------|--------------------|
| Duration                     | 3 s              | 8 s              | 22 s               | 32 s               | 38 s               |
| GC Time                      | 57 ms            | 0.2 s            | 0.5 s              | 0.6 s              | 0.6 s              |
| Input Size / Records         | 39.2 MB / 148050 | 96.7 MB / 521200 | 128.1 MB / 2133942 | 128.1 MB / 3159349 | 128.1 MB / 3261669 |
| Shuffle Write Size / Records | 12.5 MB / 148050 | 30.0 MB / 521200 | 73.8 MB / 2133942  | 92.1 MB / 3159349  | 93.6 MB / 3261669  |

### Details for Stage 64 (Attempt 0)

**Total Time Across All Tasks:** 18 s  
**Locality Level Summary:** Node local: 200  
**Shuffle Read:** 550.8 MB / 16390467  
**Shuffle Write:** 234.0 B / 3

- ▶ [DAG Visualization](#)
- ▶ [Show Additional Metrics](#)
- ▶ [Event Timeline](#)

**Summary Metrics for 200 Completed Tasks**

| Metric                       | Min            | 25th percentile | Median         | 75th percentile | Max            |
|------------------------------|----------------|-----------------|----------------|-----------------|----------------|
| Duration                     | 47 ms          | 77 ms           | 86 ms          | 98 ms           | 0.2 s          |
| GC Time                      | 0 ms           | 0 ms            | 0 ms           | 0 ms            | 74 ms          |
| Shuffle Read Size / Records  | 2.7 MB / 80568 | 2.7 MB / 81610  | 2.8 MB / 81978 | 2.8 MB / 82249  | 2.8 MB / 83177 |
| Shuffle Write Size / Records | 0.0 B / 0      | 0.0 B / 0       | 0.0 B / 0      | 0.0 B / 0       | 78.0 B / 1     |

### Details for Stage 65 (Attempt 0)

**Total Time Across All Tasks:** 6 ms  
**Locality Level Summary:** Process local: 1

- ▶ [DAG Visualization](#)
- ▶ [Show Additional Metrics](#)
- ▶ [Event Timeline](#)

**Summary Metrics for 1 Completed Tasks**

| Metric   | Min  | 25th percentile | Median | 75th percentile | Max  |
|----------|------|-----------------|--------|-----------------|------|
| Duration | 6 ms | 6 ms            | 6 ms   | 6 ms            | 6 ms |
| GC Time  | 0 ms | 0 ms            | 0 ms   | 0 ms            | 0 ms |

### Details for Stage 69 (Attempt 0)

**Total Time Across All Tasks:** 21 ms  
**Locality Level Summary:** Process local: 4

- ▶ [DAG Visualization](#)
- ▶ [Show Additional Metrics](#)
- ▶ [Event Timeline](#)

**Summary Metrics for 4 Completed Tasks**

| Metric   | Min  | 25th percentile | Median | 75th percentile | Max   |
|----------|------|-----------------|--------|-----------------|-------|
| Duration | 1 ms | 3 ms            | 5 ms   | 12 ms           | 12 ms |
| GC Time  | 0 ms | 0 ms            | 0 ms   | 0 ms            | 0 ms  |

### Details for Stage 73 (Attempt 0)

**Total Time Across All Tasks:** 60 ms  
**Locality Level Summary:** Process local: 20

- ▶ [DAG Visualization](#)
- ▶ [Show Additional Metrics](#)
- ▶ [Event Timeline](#)

**Summary Metrics for 20 Completed Tasks**

| Metric   | Min  | 25th percentile | Median | 75th percentile | Max   |
|----------|------|-----------------|--------|-----------------|-------|
| Duration | 1 ms | 2 ms            | 2 ms   | 4 ms            | 10 ms |
| GC Time  | 0 ms | 0 ms            | 0 ms   | 0 ms            | 0 ms  |

## Details for Stage 77 (Attempt 0)

Total Time Across All Tasks: 0.3 s

Locality Level Summary: Node local: 2; Process local: 98

Shuffle Read: 156.0 B / 2

▶ DAG Visualization

▶ Show Additional Metrics

▶ Event Timeline

### Summary Metrics for 100 Completed Tasks

| Metric                      | Min       | 25th percentile | Median    | 75th percentile | Max        |
|-----------------------------|-----------|-----------------|-----------|-----------------|------------|
| Duration                    | 1 ms      | 1 ms            | 2 ms      | 3 ms            | 9 ms       |
| GC Time                     | 0 ms      | 0 ms            | 0 ms      | 0 ms            | 0 ms       |
| Shuffle Read Size / Records | 0.0 B / 0 | 0.0 B / 0       | 0.0 B / 0 | 0.0 B / 0       | 78.0 B / 1 |

## Details for Stage 81 (Attempt 0)

Total Time Across All Tasks: 0.2 s

Locality Level Summary: Node local: 1; Process local: 74

Shuffle Read: 78.0 B / 1

▶ DAG Visualization

▶ Show Additional Metrics

▶ Event Timeline

### Summary Metrics for 75 Completed Tasks

| Metric                      | Min       | 25th percentile | Median    | 75th percentile | Max        |
|-----------------------------|-----------|-----------------|-----------|-----------------|------------|
| Duration                    | 1 ms      | 1 ms            | 2 ms      | 3 ms            | 12 ms      |
| GC Time                     | 0 ms      | 0 ms            | 0 ms      | 0 ms            | 0 ms       |
| Shuffle Read Size / Records | 0.0 B / 0 | 0.0 B / 0       | 0.0 B / 0 | 0.0 B / 0       | 78.0 B / 1 |

(6) (보너스 점수 2점 - 각각 1점) 수행하면서 발견한 재미있는 현상 2개에 대해 기술 발견한 사항)

1) DAG 관점 발견 사항 (문제1 vs 문제2)

- 문제1 : 1 Stage 에서 완료됨 => shuffle 이 일어나지 않았다는 점. 그것은 Narrow dependencies(map,filter,union등) 동일한 partition에 의한 연산만 수행된다고 판단됨
- 문제2 : 총 5job(총8stage : 12개 stage 는 skipped) 에 거쳐 연산이 수행되는데, 잦은 shuffling이 발생하는 것으로 보아 Wide dependencies 연산으로 보인다. 해당 연산이 많이 발생하는 이유로는 join, groupBy(avg 연산)을 진행할 때 partition 간의 shuffling 이 다수 일어난 것으로 보인다.(하지만 확인 결과 최초 job 외에서는 계획과는 다르게 실제로는 shuffling 이 발생하지 않는 것으로 보인다)

## Details for Job 0

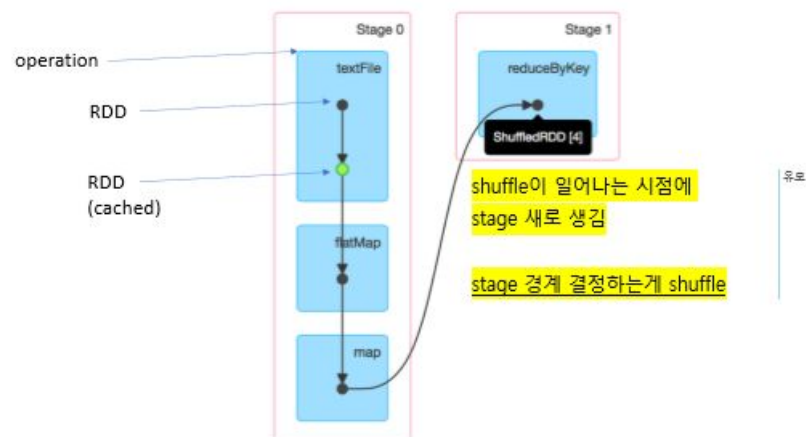
Status: SUCCEEDED

Completed Stages: 2

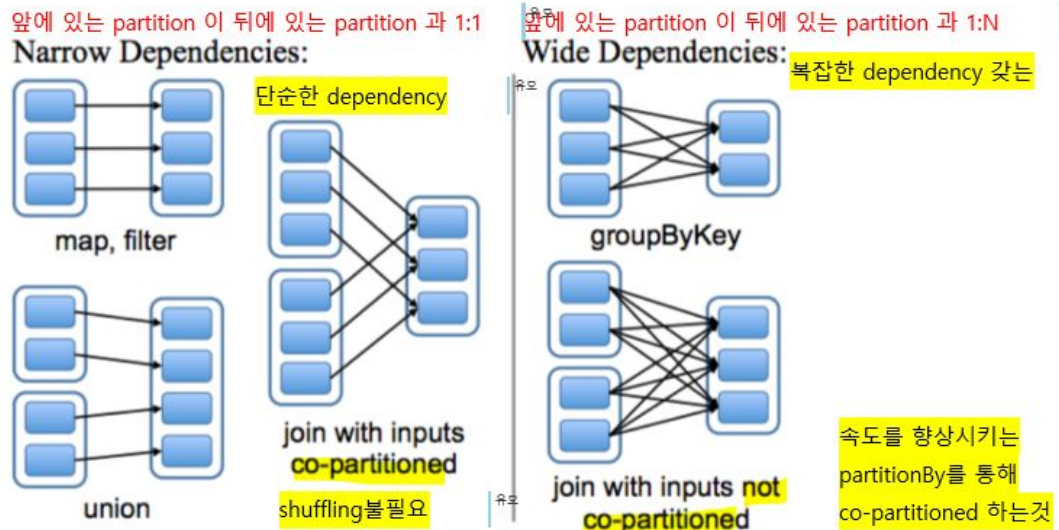
▶ Event Timeline

▼ DAG Visualization

### Stages



# Narrow and Wide Dependencies



- 2) 문제2의 DAG Graph의 수많은 Skipped stage와 Summary Metrics 의 Garbage collection time 로 부터 들은 궁금점을 Stack over flow를 통해 해답을 얻었다. 일단 Stage 에서 Skipped 된 것은 후속 stage 에서 HDFS로부터 데이터를 가져오는 것이 아닌 자주 연산되는 것을 caching하여 연산을 최적화 한것으로 보이고, 첫 Stage외에 모든 Garbage Collection time 이 0 인 점이 모든 것을 in mermory 에서 caching하여 후속 처리를 하는 것에 따라 발생 된 결과로 생각된다.

<https://stackoverflow.com/questions/34580662/what-does-stage-skipped-mean-in-apache-spark-web-ui>

일반적으로 캐시에서 데이터를 가져오고 지정된 스테이지를 다시 실행할 필요가 없음을 의미합니다. 다음 단계에서 셔플이 필요함을 보여주는 DAG와 일치합니다 ( `reduceByKey`). 셔플 링이있을 때마다 Spark는 자동으로 생성 된 데이터를 캐시합니다 .

Shuffle은 또한 디스크에 많은 수의 중간 파일을 생성합니다. Spark 1.3에서이 파일들은 해당 RDD가 더 이상 사용되지 않고 가비지 수집 될 때까지 보존됩니다. 이는 계보가 다시 계산 될 때 셔플 파일을 다시 만들 필요가 없도록하기 위해 수행됩니다.