



# Lesson 4: Spark Internals

4.9 Spark Performance: Monitoring and Optimization





# **Performance Tuning**

# Monitoring

- Web UI (application)
- History Server (application)
- Ganglia (infrastructure)
- jstack, jmap, jstat (JVM)

# **Optimization**

- Data (serialization + locality)
- Application
  - data structures
  - caching
  - broadcasting
  - shuffle
- Framework (parallelism + memory + GC)





# **Performance Tuning**

# **Monitoring**

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## **Optimization**

Data (serialization + locality)

- Application
  - data structures
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  - shuffle

• Framework (parallelism + memory + GC)





# Spark Web UI

Monitoring: Every SparkContext launches a web UI on the Driver machine defaulting to port 4040.

> Note: The Spark Standalone cluster manager launches its own web UI on the Master node



Spark Master at spark://127.0.0.1:7077

**URL:** spark://127.0.0.1:7077

**REST URL:** spark://127.0.0.1:6066 (cluster mode)

Workers: 2

Cores: 2 Total, 0 Used

Memory: 2.0 GB Total, 0.0 B Used Applications: 0 Running, 0 Completed Drivers: 0 Running, 0 Completed

Status: ALIVE

#### Workers

Worker Id	Address	State	Cores	Memory
worker-20150812221322-10.0.1.156-64391	10.0.1.156:64391	ALIVE	1 (0 Used)	1024.0 MB (0.0 B Used)
worker-20150812221322-10.0.1.156-64392	10.0.1.156:64392	ALIVE	1 (0 Used)	1024.0 MB (0.0 B Used)



### Spark Master at spark://127.0.0.1:7077

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Workers: 2

Cores: 2 Total, 2 Used

Memory: 2.0 GB Total, 1024.0 MB Used Applications: 1 Running, 1 Completed Drivers: 0 Running, 0 Completed

#### Workers

Status: ALIVE

Worker Id	Address	State	Cores	Memory
worker-20150812221322-10.0.1.156-64391	10.0.1.156:64391	ALIVE	1 (1 Used)	1024.0 MB (512.0 MB Used)
worker-20150812221322-10.0.1.156-64392	10.0.1.156:64392	ALIVE	1 (1 Used)	1024.0 MB (512.0 MB Used)

#### **Running Applications**

	Cores	Memory per Node	Submitted Time	User	State	Duration
app-20150812221733-0001 (kill) Performa	mance Tuning 2	512.0 MB	2015/08/12 22:17:33	jonathandinu	RUNNING	12 s

#### **Completed Applications**

Application ID	Name	Cores	Memory per Node	Submitted Time	User	State	Duration
app-20150812221435-0000	pyspark-shell	2	512.0 MB	2015/08/12 22:14:35	jonathandinu	FINISHED	2.6 min







ges Storage

orage Environment

Executors

### Spark Jobs (?)

Spark 1.4.1

cache config workers

Total Uptime: 2.1 h Scheduling Mode: FIFO Completed Jobs: 15

▶ Event Timeline

#### Completed Jobs (15)

Job Id (Job Group)	Description	Submitted	Duration	Stages: Succeeded/Total	Tasks (for all stages): Succeeded/Total
14 (Airline Data)	filtered first runJob at PythonRDD.scala:366	2015/08/13 14:56:52	0.2 s	2/2 (1 skipped)	12/12 (11 skipped)
13 (Airline Data)	filtered first sortBy at <ipython-input-23-46ff3fa9563d>:4</ipython-input-23-46ff3fa9563d>	2015/08/13 14:56:52	0.2 s	1/1 (1 skipped)	11/11 (11 skipped)
12 (Airline Data)	filtered first sortBy at <ipython-input-23-46ff3fa9563d>:4</ipython-input-23-46ff3fa9563d>	2015/08/13 14:45:57	11 min	2/2	22/22
11 (Airline Data)	no filter runJob at PythonRDD.scala:366	2015/08/13 14:38:40	18 s	2/2 (1 skipped)	12/12 (11 skipped)
10 (Airline Data)	no filter sortBy at <ipython-input-21-c58242d90558>:9</ipython-input-21-c58242d90558>	2015/08/13 14:38:21	19 s	1/1 (1 skipped)	11/11 (11 skipped)
9 (Airline Data)	no filter sortBy at <ipython-input-21-c58242d90558>:9</ipython-input-21-c58242d90558>	2015/08/13 14:25:31	13 min	2/2	22/22





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# **Actions initiate jobs**





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Enable zooming



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