

Multi-node Spark & Zeppelin

Lab 7

November 23th, 2017

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Index

- Multi-node Setting
- HiBench
- Ganglia
- Zeppelin
- Exercise

Student's VM IP List

■ Virtual Machine IP List

- https://docs.google.com/spreadsheets/d/1X9Uavr2PACqgflC3rOcQ7Gqo4-NQNKoBhvcaL_86g9E/edit#gid=0

Exercise Answer (1)

■ The longest delay in this dataset? (2)

```
1 >>> tripGraph.edges.groupBy().max("delay")
```

■ The number of delayed versus on-time/early flights (2)

```
1 >>> tripGraph.edges.filter(" delay <= 0 ").count()
```

```
2 >>> tripGraph.edges.filter(" delay > 0 ").count()
```

■ What flights departing Seattle are most likely to have significant delays? (2)

- Seattle == 'SEA'

```
1 >>> tripGraph.edges.filter("src = 'SEA' and delay > 0").groupBy("src",  
"dst").avg("delay").sort(desc("avg(delay)")).show(5)
```

Exercise Answer (2)

■ Top 5 busiest airports (most flights in and out) (2)

- Use vertex degrees

```
1 >>> tripGraph.degrees.sort(desc("degree")).show(5)
```

■ Airport ranking using PageRank (2)

- Reset probability=0.15, max iteration = 5

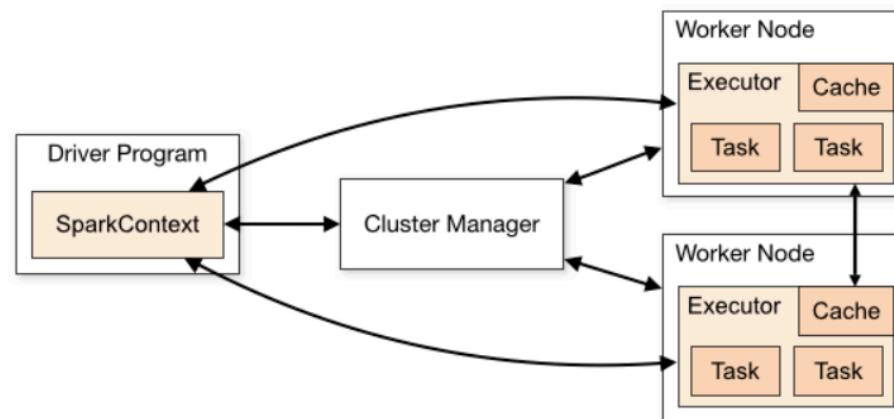
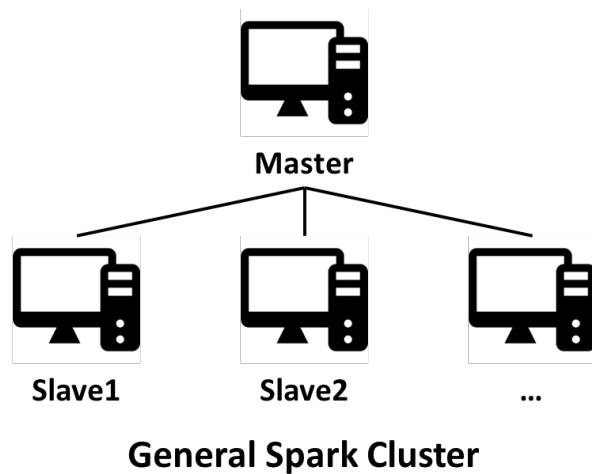
```
1 >>> ranks = tripGraph.pageRank(resetProbability=0.15, maxIter=5)
```

Multi-node Setting in Spark

Multi-node Setting: Overview

■ Cluster setup

- 1 master node + multiple slave nodes
 - Driver program
 - convert user program into tasks & schedule the tasks
 - Executors
 - run individual tasks in a given Spark job



Multi-node Setting: Networking

■ Add new machine's hostname and IP

- **xxx.xxx.xxx.xxx**: virtual machine IP
 - ex) 172.31.1.25
- **HostName**: host name of virtual machine
 - ex) ip-172-31-1-25
 - Master and slave

```
1 ubuntu@ip-x-x-x-x:~$ sudo vim /etc/hosts
```

/etc/hosts

```
1 127.0.0.1 localhost
```

```
2 xxx.xxx.xxx.xxx Master_Host_Name
```

```
3 xxx.xxx.xxx.xxx Slave_Host_Name
```


Multi-node Setting: SSH Access (1)

■ Set ubuntu password

```
1  ubuntu@ip-x-x-x-x:~$ sudo passwd ubuntu
2  Enter new UNIX password:
3  Enter new UNIX password
4  passwd: password updated successfully
```

Multi-node Setting: SSH Access (2)

■ Password authentication yes

```
1 ubuntu@ip-x-x-x-x:~$ sudo vim /etc/ssh/sshd_config
```

```
/etc/ssh/sshd_config
```

```
1 # Change to no to disable tunnelled clear text
```

```
2 PasswordAuthentication yes
```

Multi-node Setting: SSH Access (3)

■ Create public key

```
1  ubuntu@ip-x-x-x-x:~$ ssh-keygen -t rsa -P ""
2  Generating public/private rsa key pair.
3  Enter file in which to save the key (/home/ubuntu/.ssh/id_rsa):
4  /home/ubuntu/.ssh/id_rsa already exists.
5  Overwrite (y/n)? y
```

Multi-node Setting: SSH Access (4)

■ Copy public key to new virtual machine

```
1  ubuntu@ip-x-x-x-x:~$ ssh-copy-id -i $HOME/.ssh/id_rsa.pub ubuntu@ip-x-x-x-x
2  ubuntu@ip-x-x-x-x's password:
3  Number of key(s) added: 1
4  Now try logging into the machine, with:  "ssh 'ubuntu@ip-x-x-x-x'"
5  and check to make sure that only the key(s) you wanted were added.
```

■ Check network connection

```
1  ubuntu@ip-x-x-x-x:~$ ssh ip-x-x-x-x
```

Multi-node setting: Hadoop Configuration (1)

■ Add new machine's IP (Master node only)

- ex) ip-172-31-15-72

```
1 ubuntu@ip-x-x-x-x:~$ vim $HADOOP_HOME/etc/hadoop/slaves
```

```
$HADOOP_HOME/etc/hadoop/slaves
```

```
1 Master_Host_Name
```

```
2 Slave_Host_Name
```

Multi-node setting: Hadoop Configuration (2)

■ Set hadoop configuration (new machine)

```
1 ubuntu@ip-x-x-x-x:~$ vim $HADOOP_HOME/etc/hadoop/hadoop-env.sh
```

```
$HADOOP_HOME/etc/hadoop/hadoop-env.sh
```

```
1 export JAVA_HOME=/usr/lib/jvm/java-8-oracle
```

Multi-node setting: Hadoop Configuration (3)

■ Set hadoop configuration (new machine)

```
1 ubuntu@ip-x-x-x:~$ vim $HADOOP_HOME/etc/hadoop/core-site.xml
```

```
$HADOOP_HOME/etc/hadoop/core-site.xml
```

```
1 <configuration>
2     <property>
3         <name>fs.defaultFS</name>
4         <value>hdfs://Master_Host_Name:9000</value>
5     </property>
6 </configuration>
```

Multi-node setting: Hadoop Configuration (4)

■ Set hadoop configuration (new machine)

```
1  ubuntu@ip-x-x-x-x:~$ vim $HADOOP_HOME/etc/hadoop/hdfs-site.xml
                                $HADOOP_HOME/etc/hadoop/hdfs-site.xml
1  <configuration>
2      <property>
3          <name>dfs.replication</name>
4          <value>1</value>
5      </property>
6      <property>
7          <name>dfs.namenode.name.dir</name>
8          <value>file:/home/ubuntu/hadoop-2.7.4/hdfs/namenode</value>
9      </property>
10     <property>
11         <name>dfs.datanode.data.dir</name>
12         <value>file:/home/ubuntu/hadoop-2.7.4/hdfs/datanode</value>
13     </property>
14 </configuration>
```


Multi-node setting: Hadoop Configuration (5)

■ Format name node (Master node only)

```
1 ubuntu@ip-x-x-x-x:~/hadoop-2.7.4$ rm -rf hdfs
```

```
2 ubuntu@ip-x-x-x-x:~/hadoop-2.7.4$ bin/hdfs namenode -format
```

Multi-node setting: Hadoop Configuration (6)

■ Start hadoop

```
1 ubuntu@ip-x-x-x-x:~/hadoop-2.7.4$ sbin/start-dfs.sh
```

■ Validation

```
1 ubuntu@ip-x-x-x-x:~/hadoop-2.7.4$ jps
2 # Master node
3 10690 NameNode
4 10860 DataNode
5 11119 SecondaryNameNode
6 # Slave node
7 2458 DataNode
```

Multi-node setting: Spark Configuration (1)

■ Set spark configuration (new machine)

```
1 ubuntu@ip-x-x-x-x:~$ vim $SPARK_HOME/conf/spark-env.sh
```

```
$SPARK_HOME/conf/spark-env.sh
```

```
1 export SPARK_WORKER_CORES=1
```

```
2 export SPARK_WORKER_MEMORY=10g
```

```
3 export SPARK_WORKER_INSTANCES=1
```

```
4 export SPARK_LOCAL_IP=Current_Machine_IP
```

```
5 export SPARK_MASTER_HOST=MASTER_IP
```

Multi-node setting: Spark Configuration (2)

■ Set spark configuration (new machine)

```
1 ubuntu@ip-x-x-x-x:~$ vim $SPARK_HOME/conf/spark-defaults.conf
```

```
$SPARK_HOME/conf/spark-defaults.conf
```

```
1 spark.master                spark://MASTER_IP:7077
```

```
2 spark.driver.memory         2g
```

```
3 spark.executor.memory       10g
```

Multi-node setting: Spark Configuration (3)

■ Add new machine IP (Master node only)

```
1 ubuntu@ip-x-x-x-x:~$ vim $SPARK_HOME/conf/slaves
```

```
$SPARK_HOME/conf/slaves
```

```
1 Master_IP
```

```
2 Slave_IP
```

Multi-node setting: Spark Configuration (4)

■ Start-all

```
1 ubuntu@ip-x-x-x-x:~/spark-2.1.0$ sbin/start-all.sh
```

■ Validation

```
1 ubuntu@ip-x-x-x-x:~/spark-2.1.0$ jps
2 # Master node
3 10690 NameNode
4 10860 DataNode
5 11119 SecondaryNameNode
6 11373 Master
7 11512 Worker
8 # Slave node
9 2458 DataNode
10 2690 Worker
```

Intel HiBench

■ Big data benchmark suite

- helps evaluate different big data frameworks in terms of speed, throughput and system resource utilizations

■ Types of workloads (19)

- Micro benchmark: sort, wordcount, tersort, ...
- Machine learning: bayesian classification, k-means clustering, ...
- SQL: scan, join, aggregate
- Websearch benchmark: pagerank, nutch indexing
- ...

■ <https://github.com/intel-hadoop/HiBench>

HiBench: Installation (1)

■ Download HiBench

```
1 ubuntu@ip-x-x-x-x:~$ git clone https://github.com/intel-hadoop/HiBench.git
```

■ Build

```
1 ubuntu@ip-x-x-x-x:~$ sudo apt-get install maven
```

```
2 ubuntu@ip-x-x-x-x:~$ mvn -Psparkbench -Dspark=2.1 -Dscala=2.11 clean package
```

```
[INFO] -----
[INFO] Reactor Summary:
[INFO]
[INFO] hibench ..... SUCCESS [4.622s]
[INFO] hibench-common ..... SUCCESS [1:49.776s]
[INFO] HiBench data generation tools ..... SUCCESS [36.920s]
[INFO] sparkbench ..... SUCCESS [0.006s]
[INFO] sparkbench-common ..... SUCCESS [41.949s]
[INFO] sparkbench micro benchmark ..... SUCCESS [5.658s]
[INFO] sparkbench machine learning benchmark ..... SUCCESS [16.643s]
[INFO] sparkbench-websearch ..... SUCCESS [4.170s]
[INFO] sparkbench-graph ..... SUCCESS [14.790s]
[INFO] sparkbench-sql ..... SUCCESS [8.787s]
[INFO] sparkbench-streaming ..... SUCCESS [6.965s]
[INFO] sparkbench project assembly ..... SUCCESS [14.749s]
[INFO] -----
[INFO] BUILD SUCCESS
[INFO] -----
[INFO] Total time: 4:25.234s
[INFO] Finished at: Tue Nov 21 12:47:17 UTC 2017
[INFO] Final Memory: 61M/450M
[INFO] -----
ubuntu@ip-172-31-1-25:~/HiBench$
```


HiBench: Configuration (2)

■ Hadoop configuration in HiBench

```
1 ubuntu@ip-x-x-x-x:~$ vim $HIBENCH_HOME/conf/hadoop.conf
```

```
$HIBENCH_HOME/conf/hadoop.conf
```

```
1 hibench.hadoop.home      /home/ubuntu/hadoop-2.7.4
```

```
2 hibench.hdfs.master      hdfs://Master_IP:9000
```

HiBench: Configuration (3)

■ Spark configuration in HiBench

```
1 ubuntu@ip-x-x-x-x:~$ vim $HIBENCH_HOME/conf/spark.conf
```

```
$HIBENCH_HOME/conf/spark.conf
```

```
1 hibench.spark.home      /home/ubuntu/spark-2.1.0
```

```
2 hibench.spark.master    spark://Master_IP:7077
```

```
spark.executor.memory    10g
```

```
spark.driver.memory      2g
```

HiBench: Configuration (4)

■ HiBench configuration

```
1 ubuntu@ip-x-x-x-x:~$ vim $HIBENCH_HOME/conf/hibench.conf
```

```
$HIBENCH_HOME/conf/hibench.conf
```

```
1 hibench.scale.profile      small
```

HiBench: WordCount (1)

■ Prepare workload's input

```
1  ubuntu@ip-x-x-x-x:~/HiBench$  
   bin/workloads/micro/wordcount/prepare/prepare.sh  
2  ...  
3  start HadoopPrepareWordcount bench  
4  ...  
5  finish HadoopPrepareWordcount bench
```

HiBench: WordCount (2)

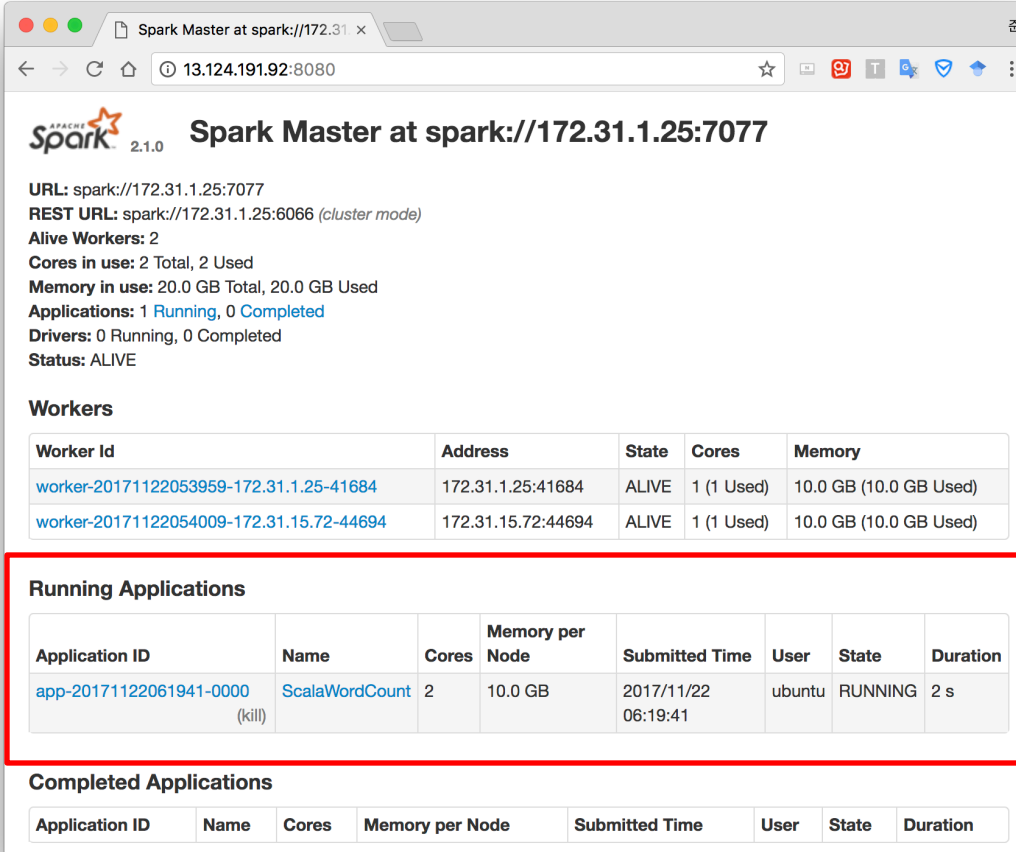
■ Run workload

```
1  ubuntu@ip-x-x-x-x:~/HiBench$ bin/workloads/micro/wordcount/spark/run.sh
2  ...
3  start ScalaSparkWordcount bench
4  ...
5  finish ScalaSparkWordcount bench
```

HiBench: WordCount (3)

■ Check running application

- http://Master_IP:8080



The screenshot shows the Spark Master web interface at `spark://172.31.1.25:7077`. The interface displays the following information:

- URL:** `spark://172.31.1.25:7077`
- REST URL:** `spark://172.31.1.25:6066 (cluster mode)`
- Alive Workers:** 2
- Cores in use:** 2 Total, 2 Used
- Memory in use:** 20.0 GB Total, 20.0 GB Used
- Applications:** 1 Running, 0 Completed
- Drivers:** 0 Running, 0 Completed
- Status:** ALIVE

Workers

Worker Id	Address	State	Cores	Memory
worker-20171122053959-172.31.1.25-41684	172.31.1.25:41684	ALIVE	1 (1 Used)	10.0 GB (10.0 GB Used)
worker-20171122054009-172.31.15.72-44694	172.31.15.72:44694	ALIVE	1 (1 Used)	10.0 GB (10.0 GB Used)

Running Applications

Application ID	Name	Cores	Memory per Node	Submitted Time	User	State	Duration
app-20171122061941-0000 (kill)	ScalaWordCount	2	10.0 GB	2017/11/22 06:19:41	ubuntu	RUNNING	2 s

Completed Applications

Application ID	Name	Cores	Memory per Node	Submitted Time	User	State	Duration
----------------	------	-------	-----------------	----------------	------	-------	----------

Profiling Tool: Ganglia

Ganglia: Installation

■ Install ganglia and related packages

1

```
ubuntu@ip-x-x-x-x:~$ sudo apt-get install ganglia-monitor rrdtool gmetad  
ganglia-webfrontend
```

■ Copy apache.conf

1

```
ubuntu@ip-x-x-x-x:~$ sudo cp /etc/ganglia-webfrontend/apache.conf  
/etc/apache2/sites-enabled/ganglia.conf
```


Ganglia: Configuration

■ Gmetad configuration

```
1 ubuntu@ip-x-x-x-x:~$ vim /etc/ganglia/gmetad.conf
```

```
/etc/ganglia/gmetad.conf
```

```
1 data_source "my cluster" 60 Master_IP
```

Ganglia: Configuration

■ Gmond configuration

```
1  ubuntu@ip-x-x-x-x:~$ vim /etc/ganglia/gmond.conf
```

```
/etc/ganglia/gmond.conf
```

```
1  udp_send_channel {  
2      host = 172.31.1.25  
3      #mcast_join = 239.2.11.71  
4      port = 8649  
5      ttl = 1 }  
6  ...  
7  udp_recv_channel {  
8      #mcast_join = 239.2.11.71  
9      port = 8649  
10     #bind = 239.2.11.71
```

Ganglia

■ Restart ganglia-monitor, gmetad, and apache

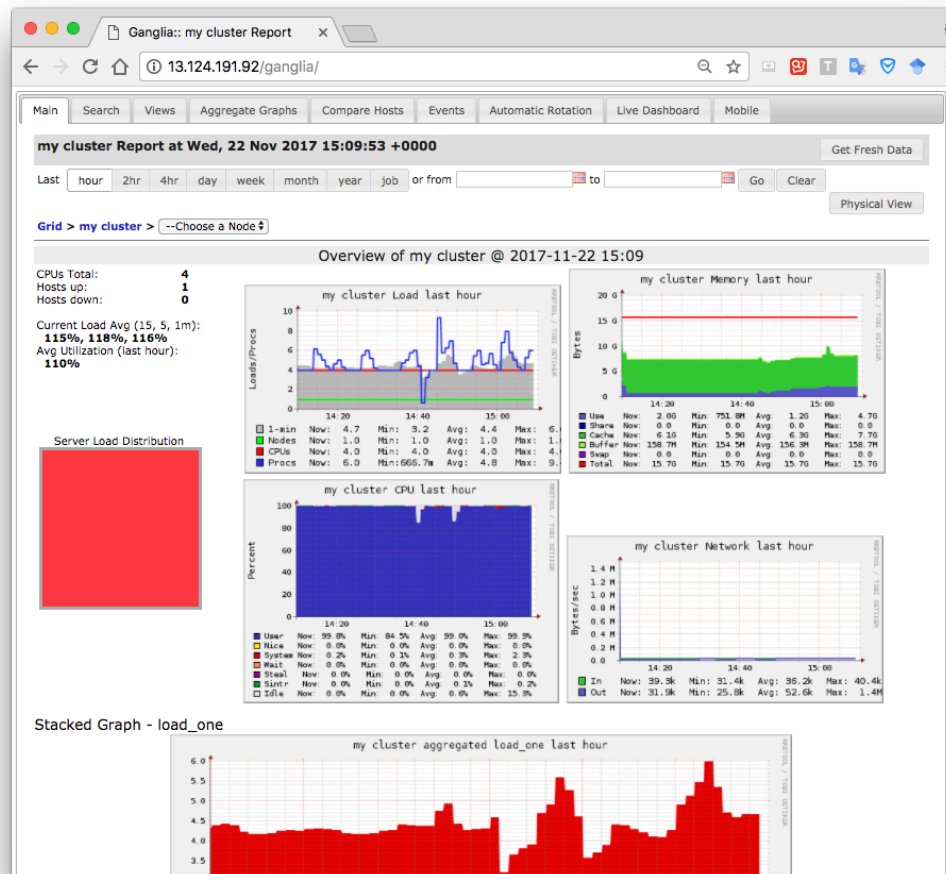
1

```
ubuntu@ip-x-x-x-x:~$ sudo service ganglia-monitor restart && sudo service gmetad restart  
&& sudo service apache2 restart
```

Ganglia: Web UI

■ Start web UI

- http://Master_IP/ganglia



Zeppelin

Zeppelin: Installation

■ Download and unzip zeppelin.tgz (Master node)

```
ubuntu@ip-x-x-x-x:~$ wget
1 http://apache.mirror.cdnetworks.com/zeppelin/zeppelin-0.7.3/zeppelin-
  0.7.3-bin-all.tgz
2 ...
3 ubuntu@ip-x-x-x-x:~$ tar xvf zeppelin-0.7.3-bin-all.tgz
4 ...
```

Zeppelin: Settings

■ Zeppelin configuration

```
1 ubuntu@ip-x-x-x-x:~$ vim $ZEPPELIN_HOME/conf/zeppelin-env.sh
```

```
$ZEPPELIN_HOME/conf/zeppelin-env.sh
```

```
1 export ZEPPELIN_PORT=8082
```

```
2 export JAVA_HOME=/usr/lib/jvm/java-8-oracle
```

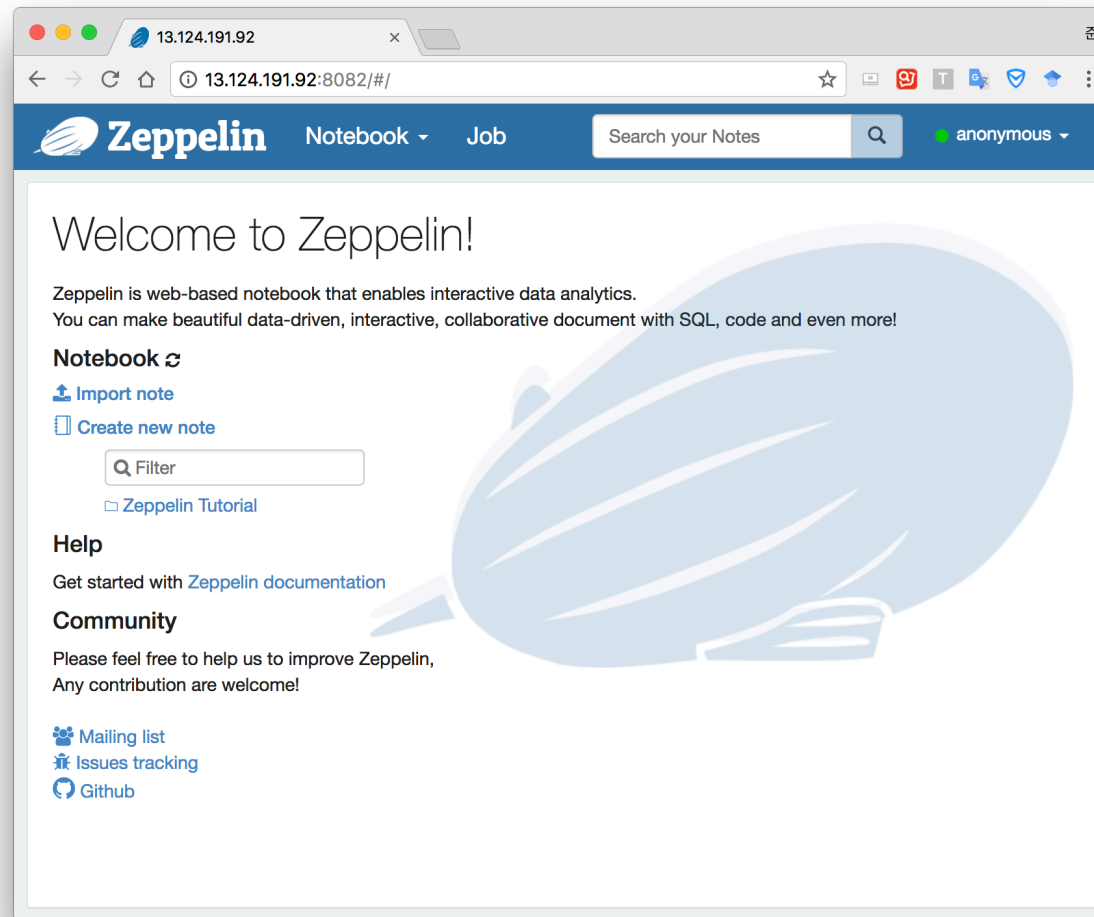
Zeppelin: Starting Daemon

■ Start Zeppelin daemon program

```
1 ubuntu@ip-x-x-x-x:~$ bin/zeppelin-daemon.sh start
2 Zeppelin start      [OK]
```

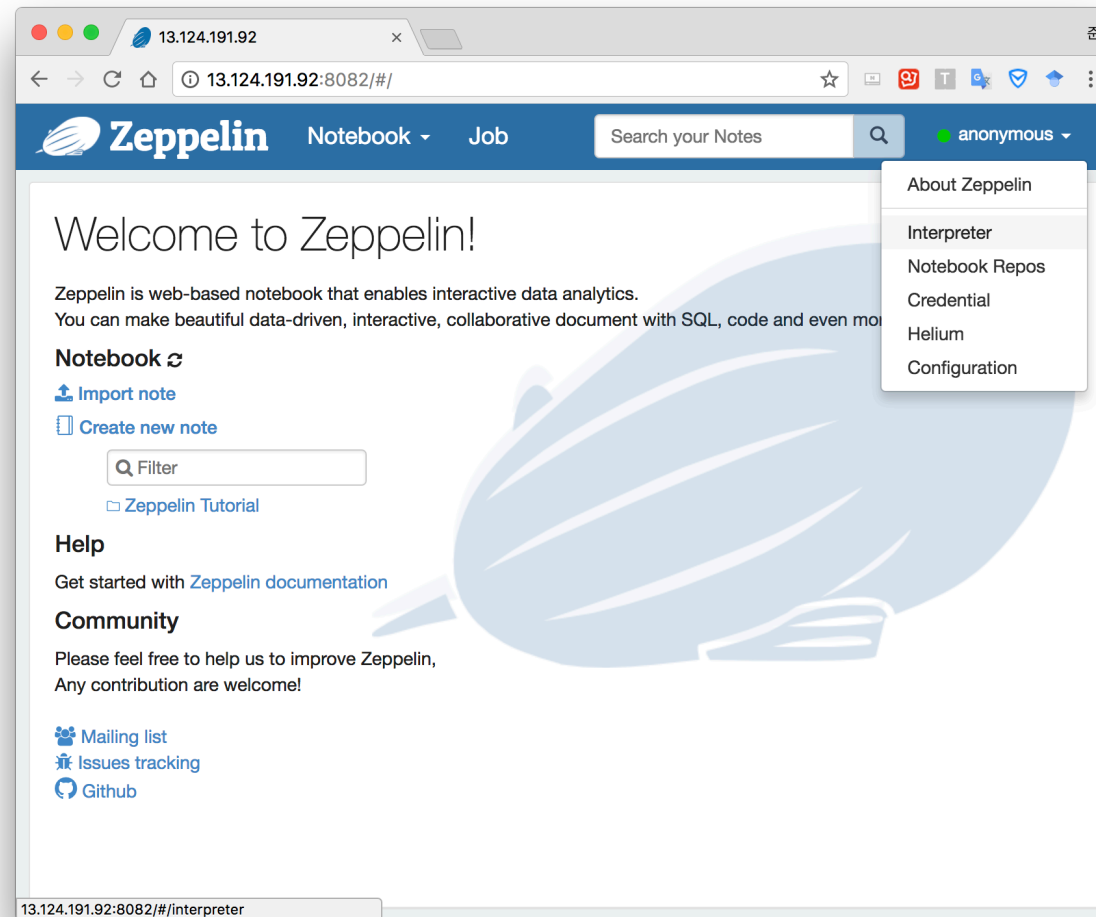

Zeppelin: Web UI

■ http://Master_IP:8082



Zeppelin: Interpreter Setting (1)

- Need to set interpreter configuration (Spark)



Zeppelin: Interpreter Setting (2)

■ Find spark interpreter

Zeppelin Notebook Job Search your Notes anonymous

Interpreters

Manage interpreters settings. You can create / edit / remove settings. Note can bind / unbind these interpreter settings.

spark

spark %spark, %sql, %dep, %pyspark, %r

spark ui edit restart remove

Option

The interpreter will be instantiated Globally in shared process.

☐ Connect to existing process

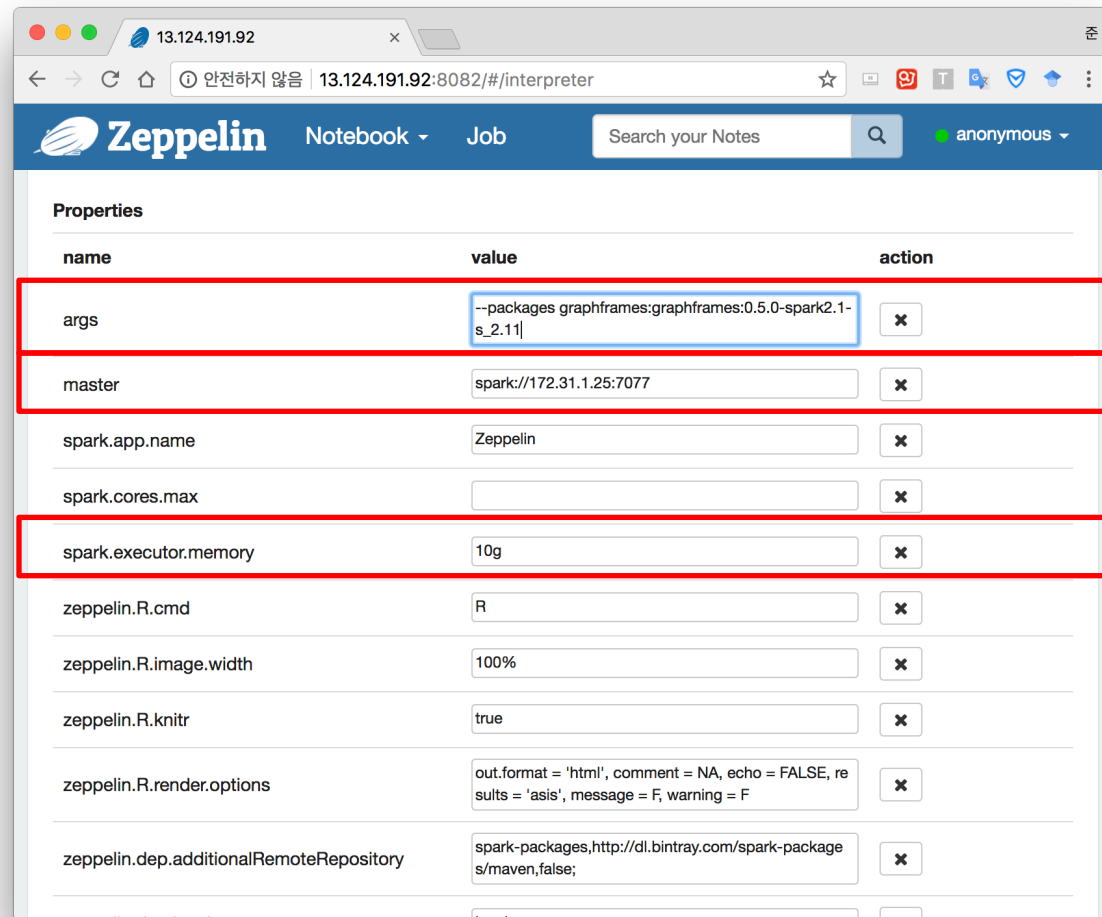
☐ Set permission

Properties

name	value
args	
master	spark://172.31.1.25:7077
spark.app.name	Zeppelin
spark.cores.max	

Zeppelin: Interpreter Setting (3)

■ Set parameters related to spark



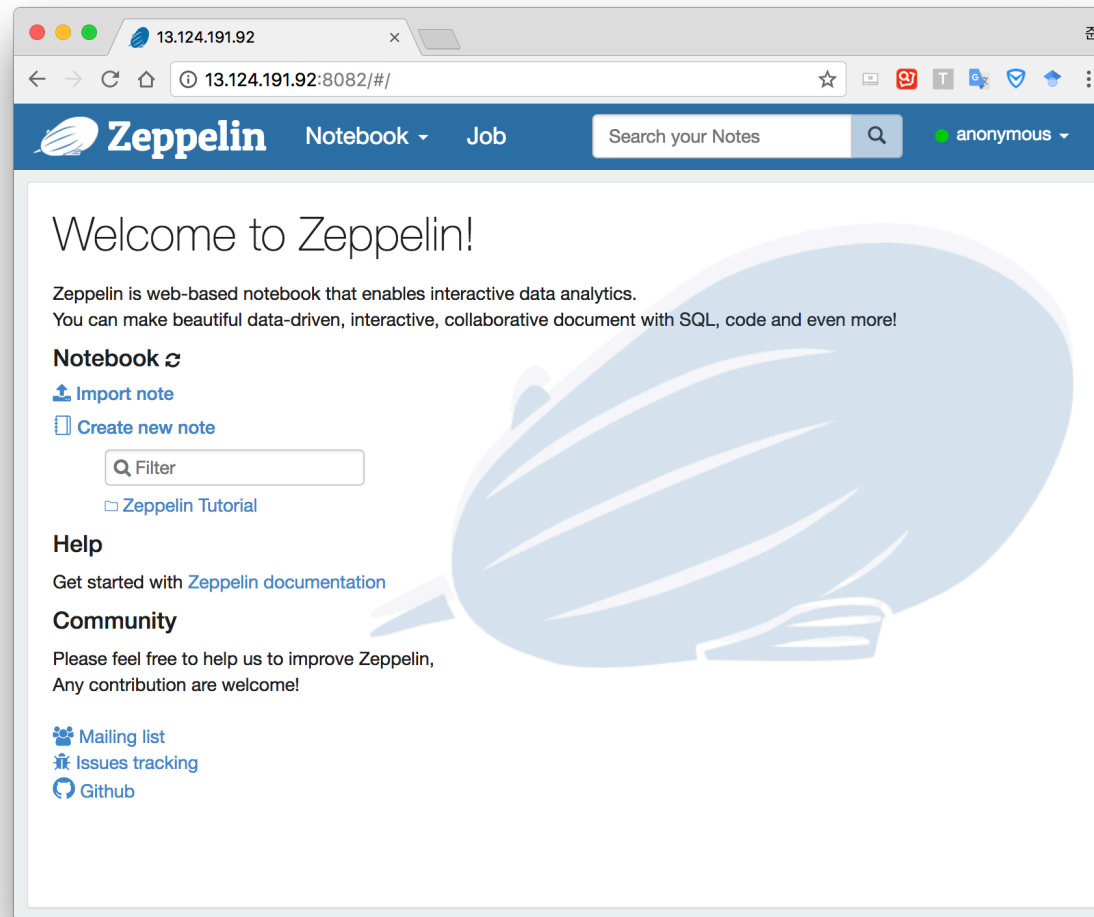
Zeppelin Notebook Job Search your Notes anonymous

Properties

name	value	action
args	--packages graphframes:graphframes:0.5.0-spark2.1-s_2.11	x
master	spark://172.31.1.25:7077	x
spark.app.name	Zeppelin	x
spark.cores.max		x
spark.executor.memory	10g	x
zeppelin.R.cmd	R	x
zeppelin.R.image.width	100%	x
zeppelin.R.knitr	true	x
zeppelin.R.render.options	out.format = 'html', comment = NA, echo = FALSE, results = 'asis', message = F, warning = F	x
zeppelin.dep.additionalRemoteRepository	spark-packages, http://dl.bintray.com/spark-package/s/maven,false;	x

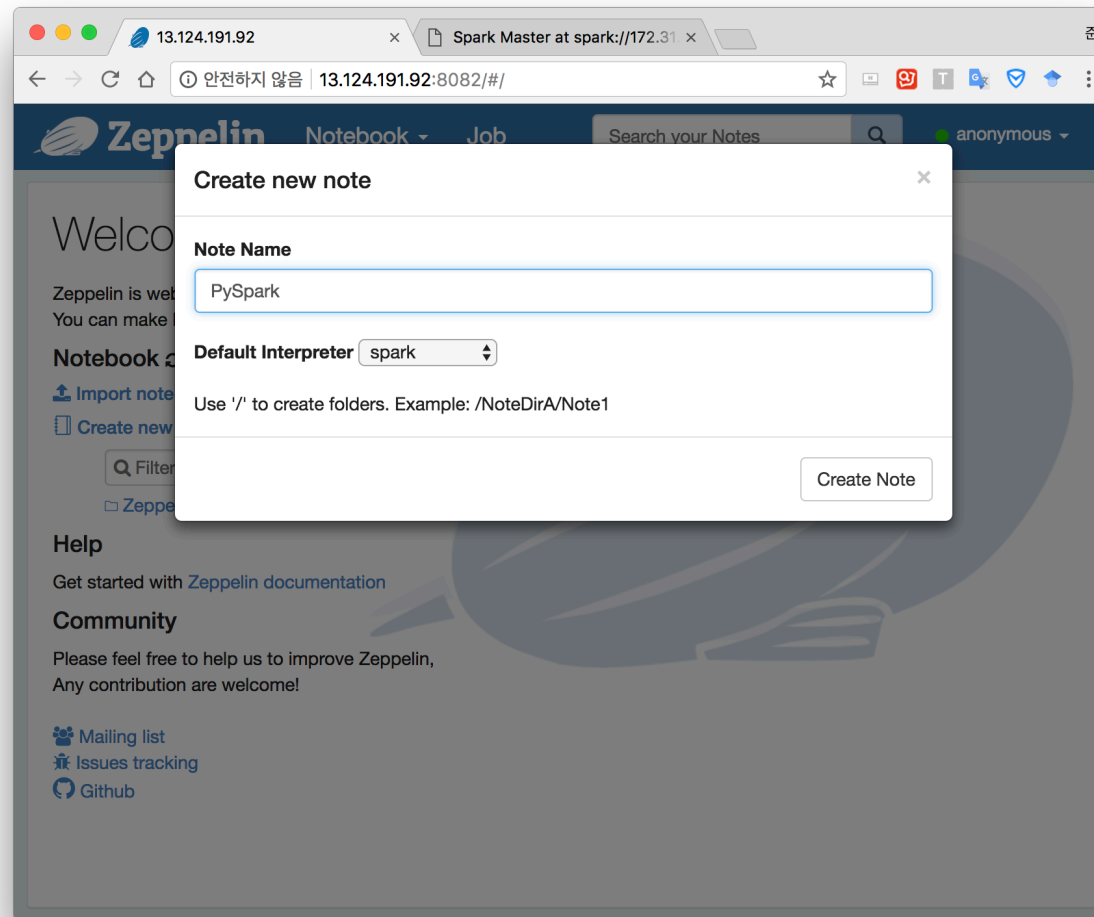
Zeppelin: Creating New Note (1)

■ Create new note



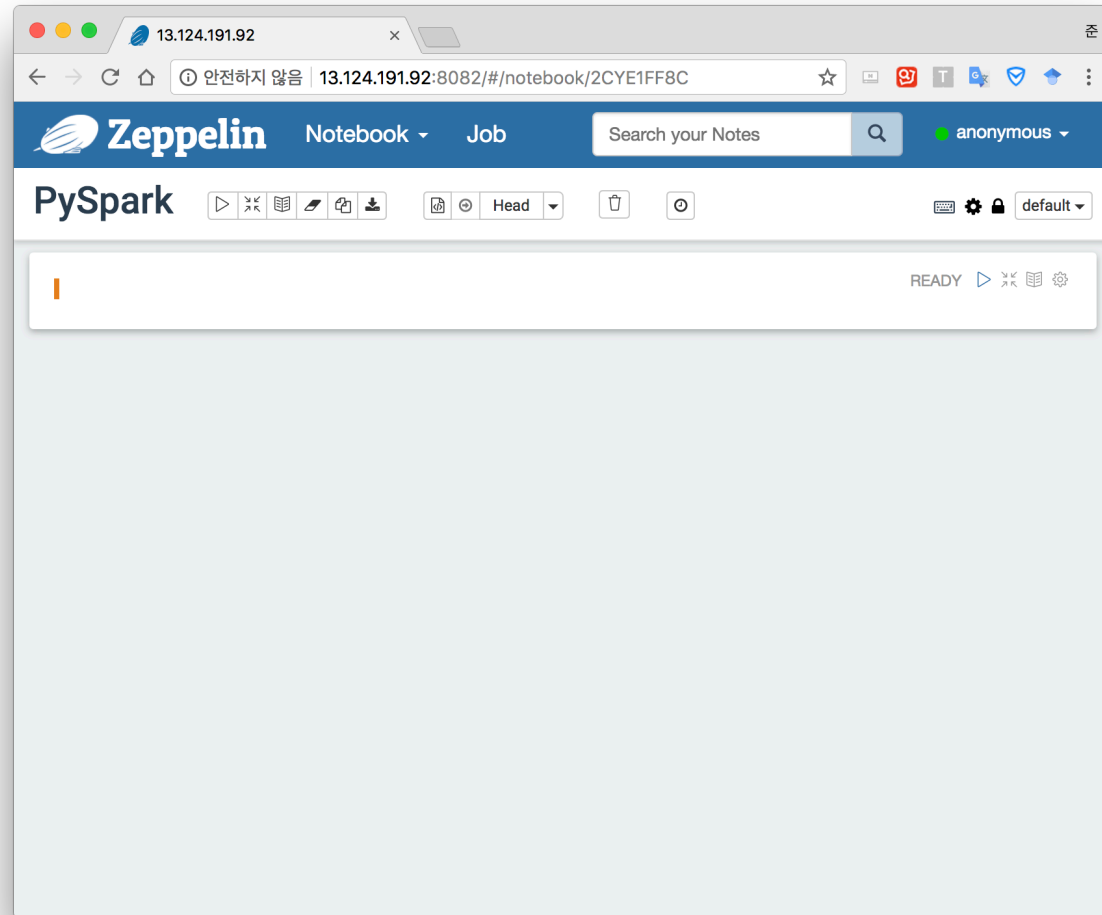
Zeppelin: Creating New Note (2)

■ Set note name



Zeppelin: Creating New Note (3)

■ Zeppelin note window



Zeppelin: Visualization Example (1)

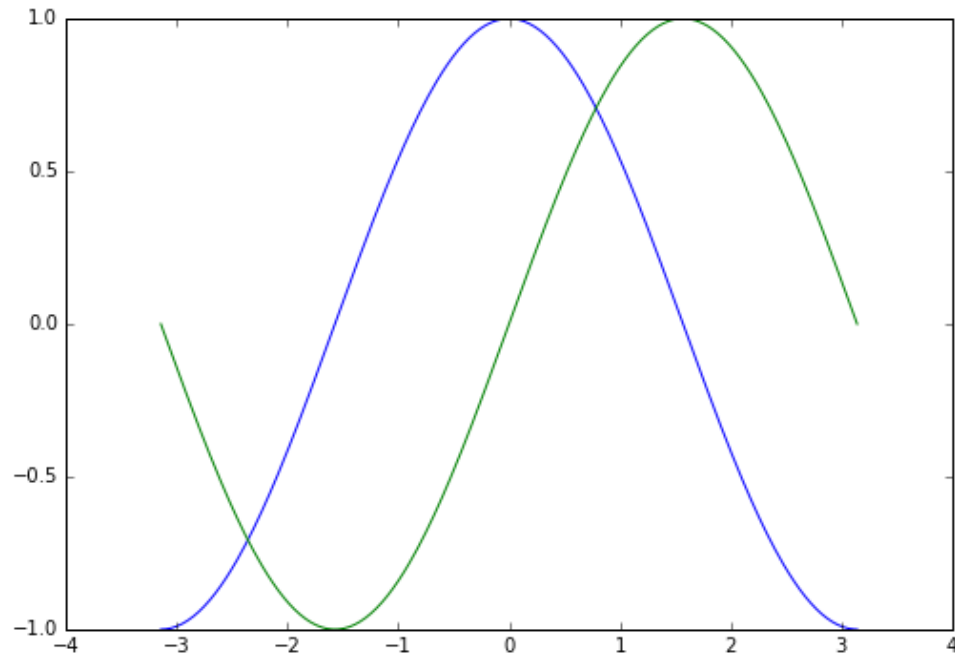
■ Import matplotlib

```
1 %pyspark
2 import matplotlib.pyplot as plt
3 import numpy as np
4 from numpy.random import rand
```


Zeppelin: Visualization Example (2)

■ Simple Graph

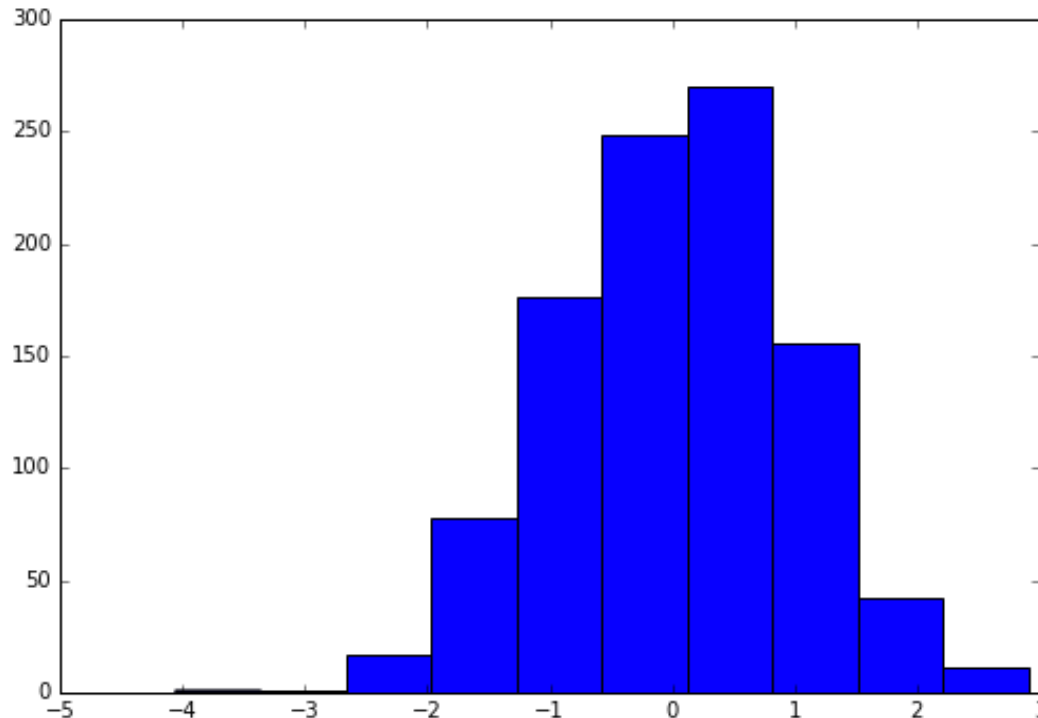
```
1 X = np.linspace(-np.pi, np.pi, 256, endpoint=True)
2 C,S = np.cos(X), np.sin(X)
3 plt.plot(X,C)
4 plt.plot(X,S)
```



Zeppelin: Visualization Example (3)

■ Histogram

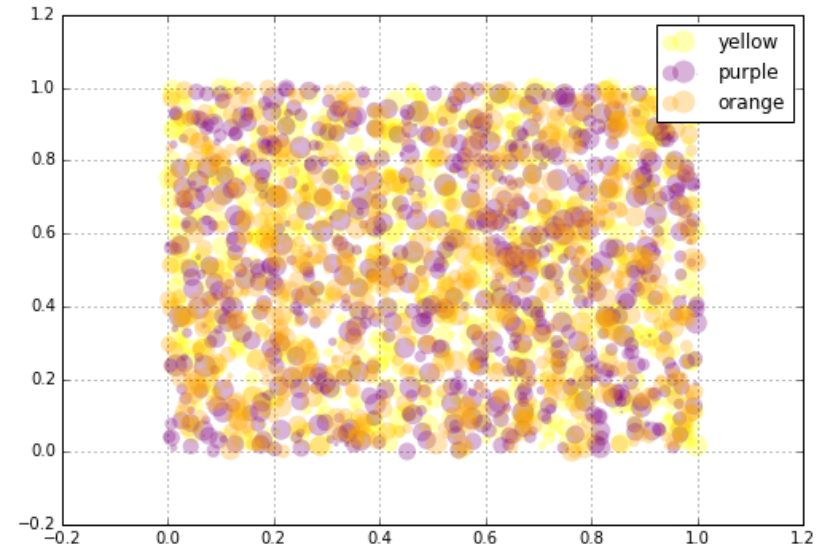
```
1 gaussian_numbers = np.random.randn(1000)
2 plt.hist(gaussian_numbers)
```



Zeppelin: Visualization Example (4)

■ Scatter

```
1 fig, ax = plt.subplots()
2 for color in ['yellow', 'purple', 'orange']:
3     n = 750
4     x, y = rand(2, n)
5     scale = 200.0 * rand(n)
6     ax.scatter(x, y, c=color, s=scale, label=color, alpha=0.3, edgecolors='none')
7 ax.legend()
8 ax.grid(True)
9 plt.show()
```



Exercise (1)

■ SQL with Zeppelin

- Make dataframe
 - data-07.txt (**need to save this file in zeppelin_home and spark_home**)
 - <https://drive.google.com/drive/folders/0B91DOcPTZ5DzWWpIT1N3OEdDWVE>
 - schema = ["custID", "gender", "state", "cardholder", "balance", "numTrans"]
- Questions
 - 1) Count frequencies of gender column (1=male, 2=female)
 - 2) Computes statistics for numeric and string columns
 - Hint: <http://spark.apache.org/docs/2.1.0/api/python/pyspark.sql.html>
 - Column: cardholder, balance, numTrans
 - Result: count, mean, stddev, min, max

Exercise (1)

■ SQL with Zeppelin

■ Questions

- 3) Create correlations matrix
 - Column: cardholder, balance, numTrans
 - 3 by 3 matrix
 - Hint: <http://spark.apache.org/docs/2.1.0/api/python/pyspark.sql.html>
- 4) Draw histogram (balance)
 - API: select, rdd, flatMap
 - Hint: <http://spark.apache.org/docs/2.1.0/api/python/pyspark.sql.html>
 - Hint: <http://spark.apache.org/docs/2.1.0/api/python/pyspark.html>
 - Draw a figure by using other program (ex. Excel, ...)

■ Submit screenshot of result

Exercise (2)

■ Analyze workloads in HiBench

- Workloads
 - WordCount, PageRank, TeraSort
 - Data size = large
- Question
 - What are the bottlenecks in each workload?
 - cpu-bound / memory-bound
 - Submit screenshot and the reason
 - Attach a reason for thinking like that (one sentence)

■ Notification

- E-mail: heojun18@gmail.com
- Deadline: 11/26, PM 23:59:59

Exercise (3)

- **Before starting the assignment, you should check the list below**
 - Check all configurations (hadoop, spark, hibenach)
 - `hdfs://x.x.x.x:9000` & `spark://x.x.x.x:7077`
 - `x.x.x.x` should always be the same between configurations (localhost / IP)
 - IP is `172.x.x.x`
 - If there are some errors, you should check **spacing words** or **spelling mistake**
 - Please attach a screenshot to your email to get a quick response
 - `heojun18@gmail.com`

Appendix