Apache Spark Through Email

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Intro, Slides And Code

- Slides: https://github.com/medale/sparkmail/blob/master/presentation/ApacheSparkThroughEmail.pdf
- Spark Code Examples: https://github.com/medale/spark-mail/
 - README.md describes how to get and parse Enron email dataset

Data Science for Small Dataset



Figure 1: Laptop

Data Science for Larger Dataset



Figure 2: Standalone Server

Data Science for Larger Dataset (Vertical Scaling)



Figure 3: Beefed-up Server

Data Science for Large Datasets (Horizontal Scaling)

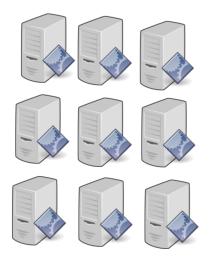


Figure 4: Multiple cooperating Servers

Big Data Framework - Apache Hadoop



Figure 5: HDFS, MapReduce

Hadoop Ecosystem

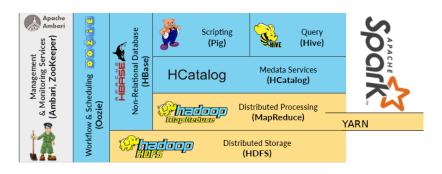


Figure 6: Some Frameworks Around Hadoop

Apache Spark Components

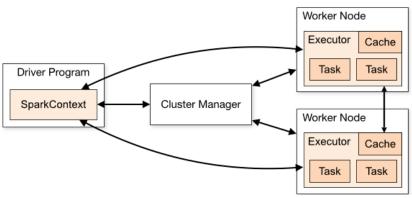
Structured Advanced Libraries & Streaming Ecosystem Analytics Structured APIS Datasets SQL DataFrames Low-level APIS Distributed Variables RDDs

Source: Spark: The Definitive Guide

Hello, Spark Email World!

- ► Jupyter Notebook with Apache Toree
- ► See ApacheSparkThroughEmail1

Cluster Manager, Driver, Executors, Tasks



Source: Apache Spark website

SparkSession: Entry to cluster

spark: spark.sql.SparkSession

//SparkSession provided by notebook as spark
val records = spark.read.
 parquet("/datasets/enron/enron-small.parquet")

//In regular code for spark-submit
//com.uebercomputing.spark.dataset.TopNEmailMessageSenders
val spark = SparkSession.builder().
 appName("TopNEmailMessageSenders").
 master("local[2]").getOrCreate()

DataFrameReader: Input for structured data

- spark.read: spark.sql.DataFrameReader
 - ▶ jdbc
 - json
 - parquet
 - text...
 - ► Also: https://spark-packages.org Avro, Redshift, MongoDB...

Scaling Behind the Scenes



Spark Jobs (?)

User: jovyan Total Uptime: 3.3 min Scheduling Mode: FIFO Completed Jobs: 3

- ▶ Event Timeline
- **▼** Completed Jobs (3)

Job Id ▼	Description	Submitted	Duration	Stages: Succeeded/Total	Tasks (for all stages): Succeeded/Total
2	show at <console>:40 show at <console>:40</console></console>	2018/11/25 01:06:16	2 s	3/3	209/209
1	count at <console>:28 count at <console>:28</console></console>	2018/11/25 01:06:04	4 s	2/2	9/9
0	parquet at <console>:27 parquet at <console>:27</console></console>	2018/11/25 01:05:57	1.0 s	1/1	1/1

Figure 7: Jobs and Tasks

Stages: Pipeline work per stage - shuffle

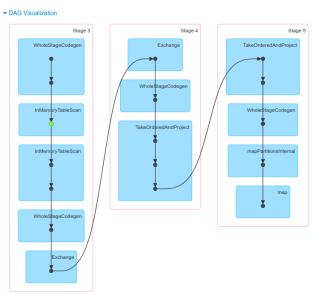


Figure 8: Stages

Where clause, Column methods, Built-in functions

► See Apache Spark Through Email Notebook 2

Parallelism and Partitioning

- Goldilocks not too many, not too few
- Initial parallelism number of input "blocks"
- ► Shuffle spark.sql.shuffle.partitions configuration

Explode, Shuffle Partitions, UDF, Parquet partition

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Questions?



Figure 9: medale@asymmetrik.com

- ► Baltimore Scala Meetup
- ► Spark Mail repo https://github.com/medale/spark-mail/