

Apache Spark and Scala

Module 2: Spark and Big Data

Course Topics



Module 1

Getting Started / Introduction to Scala

Module 2

Spark and Big Data

Module 3

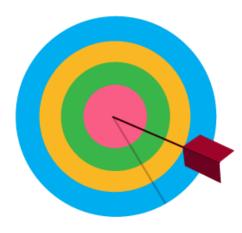
Understanding RDDs

Session Objectives



In this session, you will understand:

- ▶ Analyze Batch Processing and Real-time Processing
- ▶ Understand Spark Ecosystem
- ▶ Analyze MapReduce Limitations
- ▶ Go through Spark History
- ▶ Analyze Spark Architecture
- ▶ Understand Spark and Hadoop Advantages
- ▶ Analyze benefits of Spark and Hadoop combined
- ▶ Install Spark



Bombay Stock Exchange – Big Data Case Study



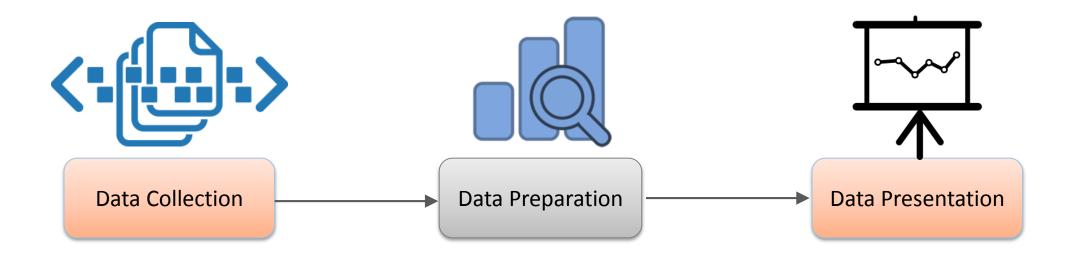
- ▶ When Bombay Stock Exchange (the seventh largest stock exchange in the world, in terms of market capitalization) wanted to ramp up / scale up its operations, the company faced major challenges
- ▶ These challenges were in terms of exponential growth of data (read big data), need for complex analytics and managing information that was scattered across multiple and monolithic system
- DataMetica (a Mumbai / Pune based big data organization) suggested a 3 phased solution to BSE:
 - In the first phase, they created a POC which demonstrated how a Hadoop based Big data implementation can work for BSE
 - In the second phase, they worked with BSE to pick up the most critical business use cases (which had the maximum ROI for BSE) and implemented them
 - Finally in the third phase they delivered the complete solution in a multi-faced manner for a full fledged implementation
- ▶ That's how Hadoop got implemented at BSE in a cost effective and scalable fashion





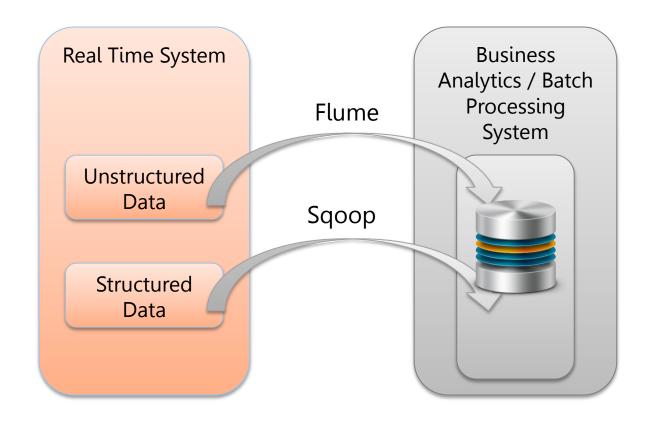


- Processing transactions in a group or batch
- ▶ Following three phases are common to batch processing or business analytics project, irrespective of the type of data (structured or unstructured)



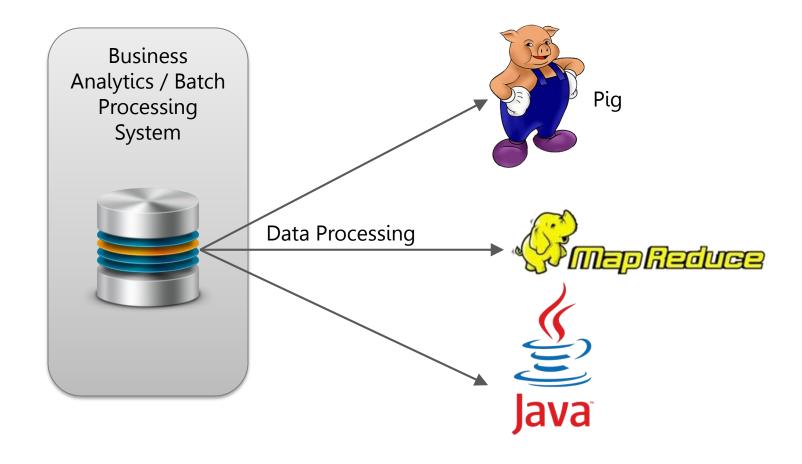
Data Collection





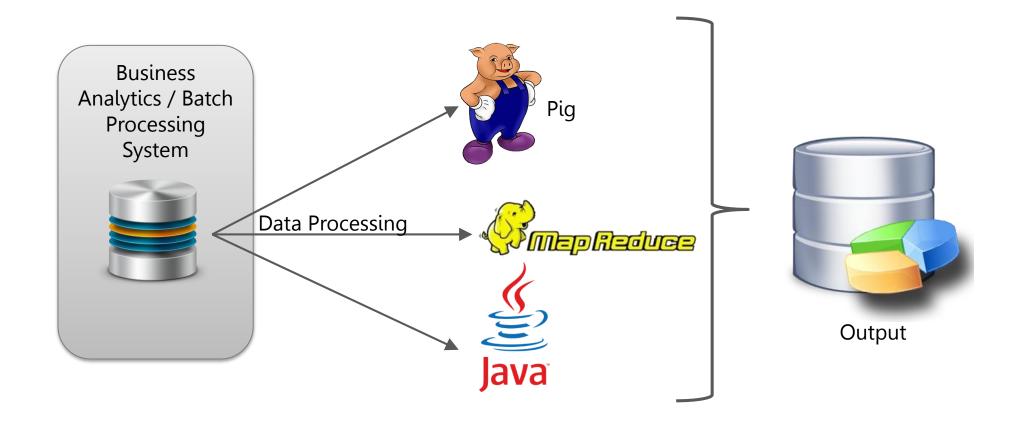
Data Preparation





Data Presentation





What is Hadoop?



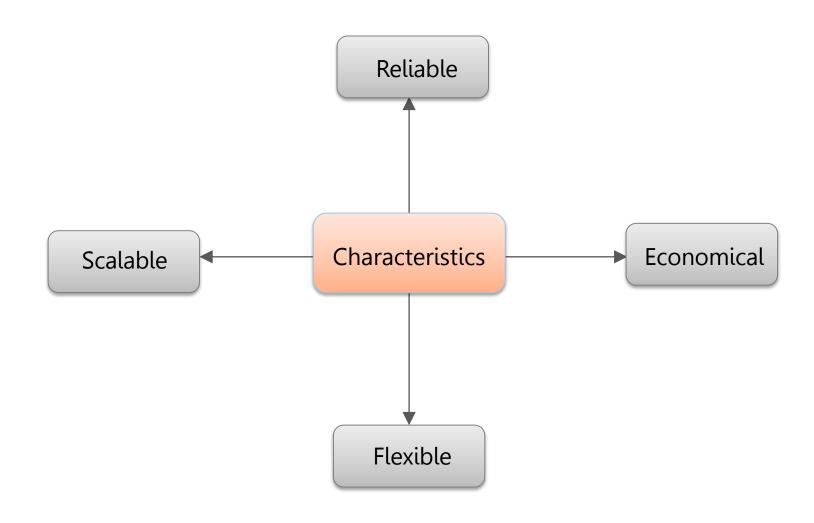
Apache Hadoop is a framework that allows the distributed processing of large data sets across clusters of commodity computers using a simple programming mode



It is an Open-source Data Management with scale-out storage and distributed processing

Hadoop Key Characteristics





What is Spark?



- ▶ Apache Spark is a fast and general engine for large-scale data processing
- ▶ Apache Spark is a general-purpose cluster in-memory computing system
- ▶ It is used for fast data analytics
- ▶ It abstracts APIs in Java, Scala and Python, and provides an optimized engine that supports general execution graphs
- ▶ Provides various high level tools like Spark SQL for structured data processing, Mlib for Machine Learning and more

Spark Ecosystem



Aplha/Pre-alpha

BlindDB (Approximate SQL)

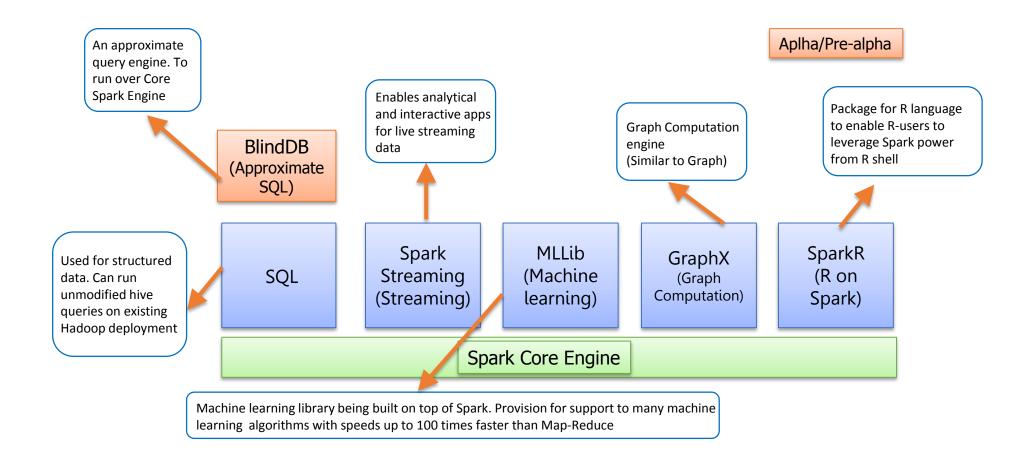
SQL

Spark Streaming (Streaming) MLLib (Machine learning) GraphX (Graph Computation) SparkR (R on Spark)

Spark Core Engine

Spark Ecosystem (Cont'd)





Spark Ecosystem (Cont'd)



- Spark Core Engine
 - The core engine for entire Spark framework
 - Provides utilities and architecture for other components
- Spark SQL
 - Spark SQL is the newest component of Spark and provides a SQL like interface
 - Used for Structured data
 - Can expose many datasets as tables
 - Spark SQL is tightly integrated with the various spark programming languages like hive
- Spark Streaming
 - Spark Streaming is an extension of the core Spark API that enables scalable, high-throughput, fault-tolerant stream processing of live data streams
 - A good alternative of Storm

Spark Ecosystem (Cont'd)



▶ BlinkDB

- An approximate query engine. To run over Core Spark Engine
- Accuracy trade-off for response time

▶ MLLib

- Machine learning library being built on top of Spark
- Provision for support to many machine learning algorithms with speeds up to 100 times faster than Map-Reduce
- Mahout is also being migrated to MLLib

▶ GraphX

- Graph Computation engine (Similar to Giraph)
- Combines data-parallel and graph-parallel concepts

▶ SparkR

• Package for R language to enable R-users to leverage Spark power from R shell

Why Spark?



- Spark exposes a simple programming layer which provides powerful caching and disk persistence capabilities
- ▶ The Spark framework can be deployed through Apache Mesos, Apache Hadoop via Yarn, or Spark's own cluster manager
- ▶ Spark framework is polyglot Can be programmed in several programming languages (Currently Scala, Java and Python supported)
- ▶ Has super active community
- Spark fits well with existing Hadoop ecosystem
 - Can be launched in existing YARN Cluster
 - Can fetch the data from Hadoop 1.0
 - Can be integrated with Hive

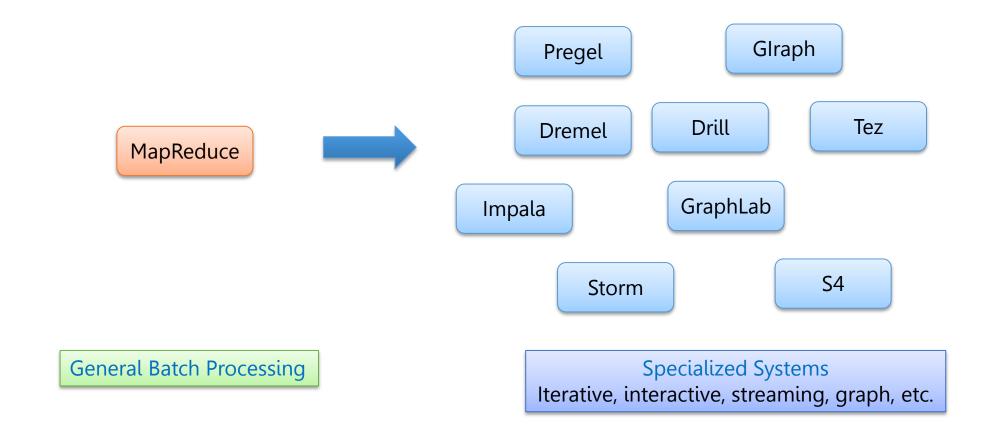
Brief History: M/R Limitations



- Map Reduce is a very powerful programming paradigm, but it has some limitations:
 - Difficult to Program an algorithm directly in Native Map Reduce
 - Performance bottlenecks, specifically for small batch not fitting the use cases
 - Many categories of algorithms not supported (e.g. iterative algorithms, asynchronous algorithms etc.)
- ▶ In short, MR doesn't compose well for large applications
- ▶ We are forced to take hybrid approaches many times
- ▶ Therefore, many specialized systems evolved over a period of time as workarounds







Brief History: Spark



- ▶ Unlike other evolved specialized systems, Spark's design goal is to generalize Map Reduce concept to support new apps within same engine
- ▶ Two reasonably small additions are enough to express the previous models:
 - Fast data sharing (For Faster Processing)
 - General DAGs (For Lazy Processing)
- ▶ This allows for an approach which is more efficient for the engine, and much simpler for the end users



140000 120000 100000

80000

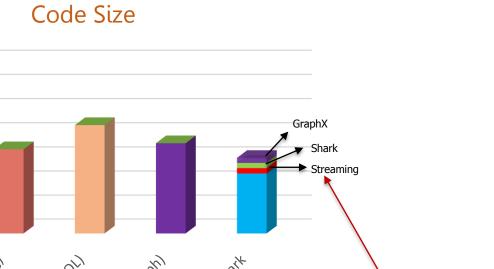
60000

40000 20000

Non-test, non example source lines

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*also calls into Hive

Used as libs, instead of specialized systems

The State of Spark, and where we're going next Matei Zaharia Spark Summit(2013) you.be/nU6v02EJAb4



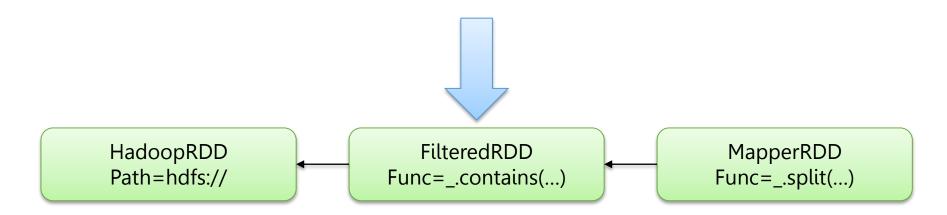


RDD Fault Tolerance

RDDs track the series of transformation used to build them (their lineage) to recomputed lost data

Example:

```
messages=textFile(...).filter(_.contains("error"))
.map(_.split('\t')(2))
```



Spark in Industry













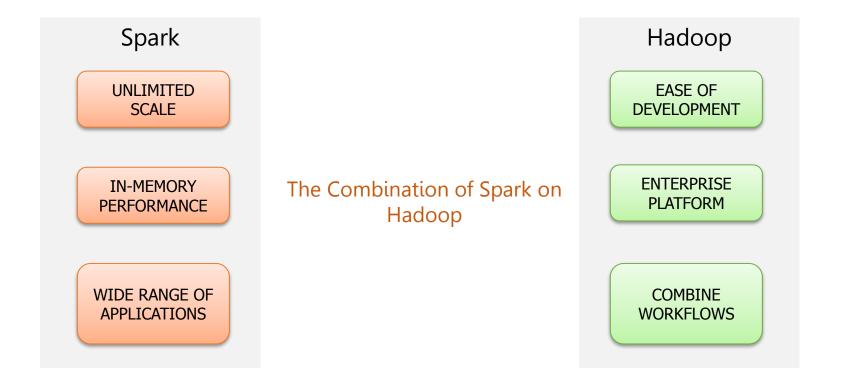








Operational Applications Augmented by In-Memory Performance







This simple program provides a good test case for parallel processing, since it:

- Requires a minimal amount of code
- ▶ Demonstrates use of both symbolic and numeric values
- ▶ Isn't many steps away from search indexing

```
val f = sc.textFile("README.md")
val wc = f.flatMap(l => l.split(" ")).map(word => (word, 1)).reduceByKey(_ + _)
wc.saveAsTextFile("wc_out")
```

Using Hadoop as Storage



- Spark can use Hadoop as Storage
 - Spark is NOT limited to HDFS only for it's storage needs
 - HDFS provides distributed storage of large datasets
 - High Availability is assured natively through HDFS
 - No extra software installation is required
 - Compatible with Hadoop 1.x also. Using HDFS as storage doesn't require Hadoop 2.x
 - Data Loss during computation is handled by HDFS itself

Using Hadoop as Execution Engine



- Spark can use Hadoop as execution engine
 - Spark can be integrated with Yarn for it's execution
 - Spark can be used with other engines (like Mesos, Spark Cluster manager) also
 - Yarn integration automatically provides processing scalability to Spark
 - Spark needs Hadoop 2.0+ versions in order to use it for execution
 - Every node in Hadoop cluster need Spark also to be installed
 - Using Hadoop cluster for Spark processes, requires RAM upgrading of data nodes
 - The integration distribution of Spark is quite new and still in the process of stabilization







