



# **1. BIG DATA**



STORM



FLUME

cloudera



**hadoop**

A P A C H E

**HBASE**

Hortonworks



**Spark**

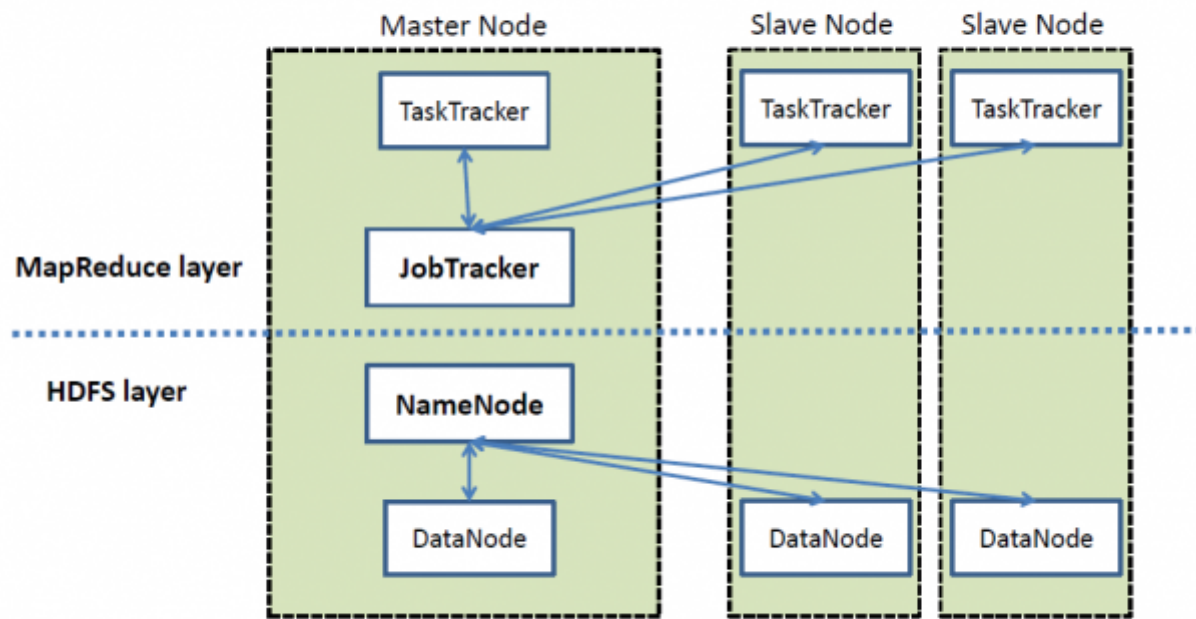


**Cassandra**

# **1.1. HADOOP**

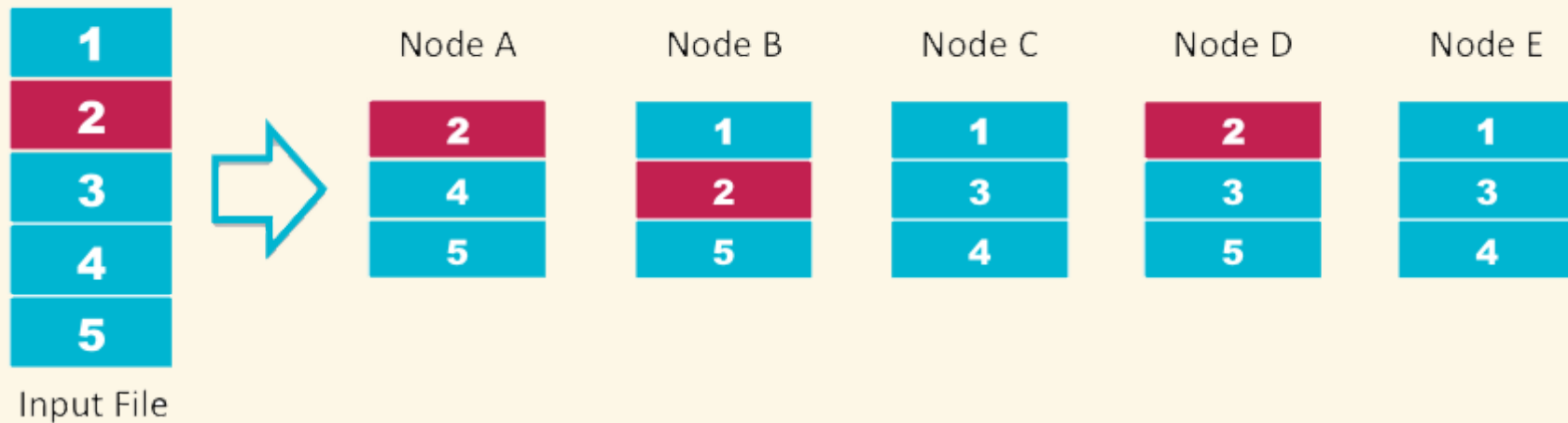
# ARCHITECTURE

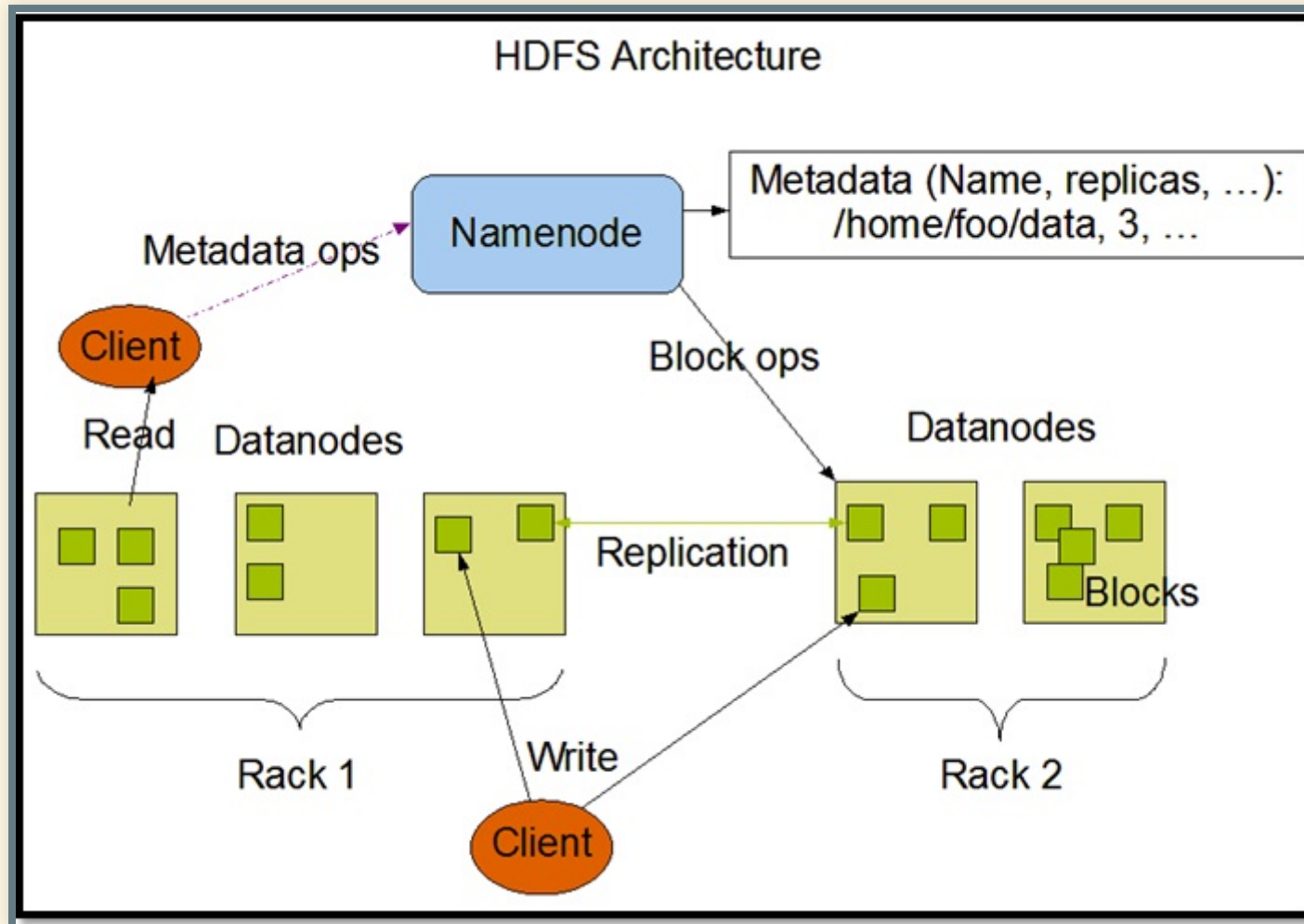
## High Level Architecture of Hadoop



# HDFS

## HDFS Data Distribution





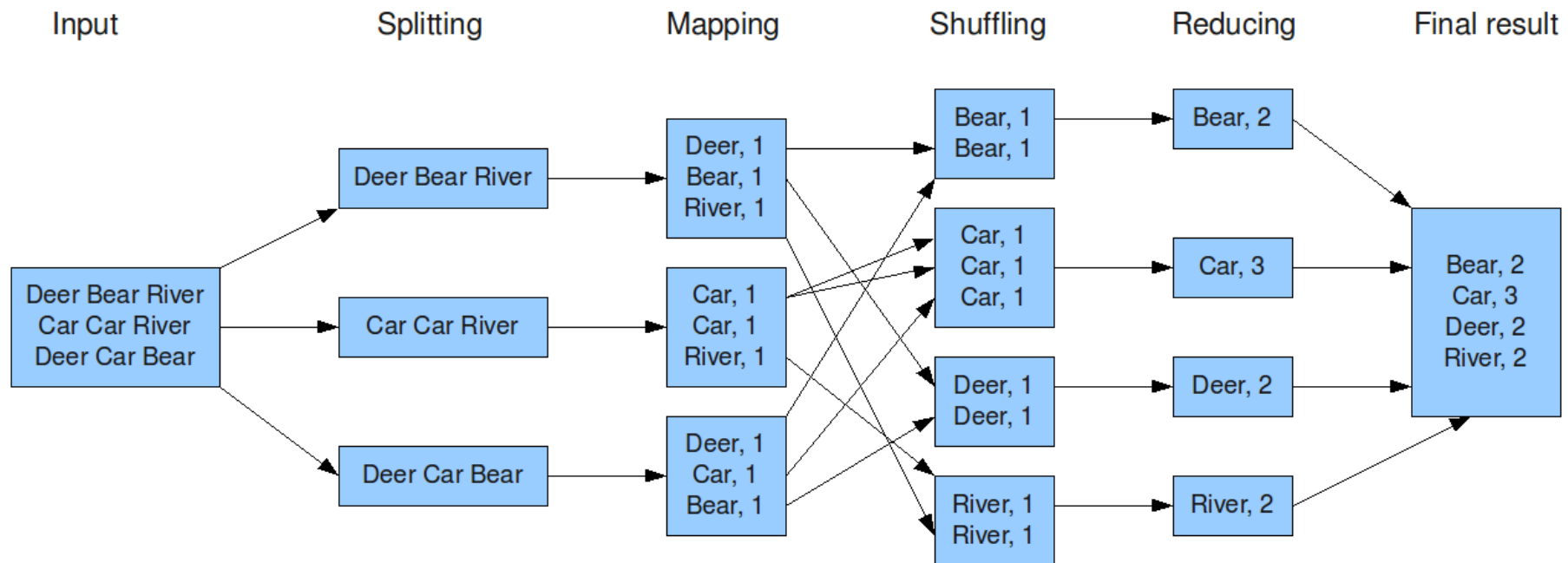
- NN (Namenode) is SPOF (Single Point of Failure)
- Normally HA (High availability) through a standby
- Zookeeper for coordination, bookkeeping



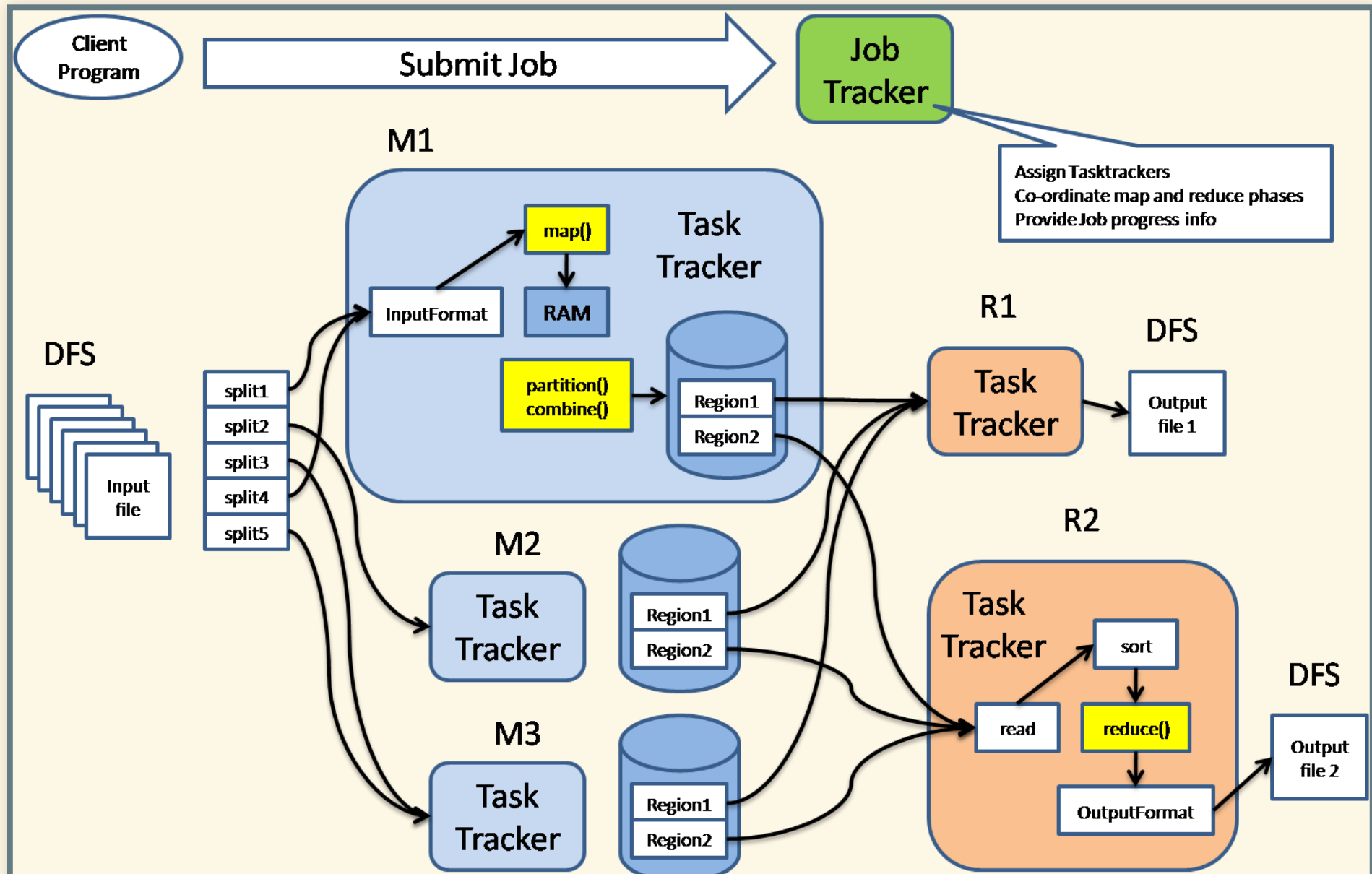


# WORD COUNT

The overall MapReduce word count process



# MAPREDUCE ARCHITECTURE





The diagram shows two horizontal curly braces at the top of the page. The left brace is positioned above the 'Map Phase' text, and the right brace is positioned above the 'Reduce Phase' text. Both braces are blue and have a small downward-pointing hook in the center.

**Map Phase**

**Reduce Phase**

# QUERYING

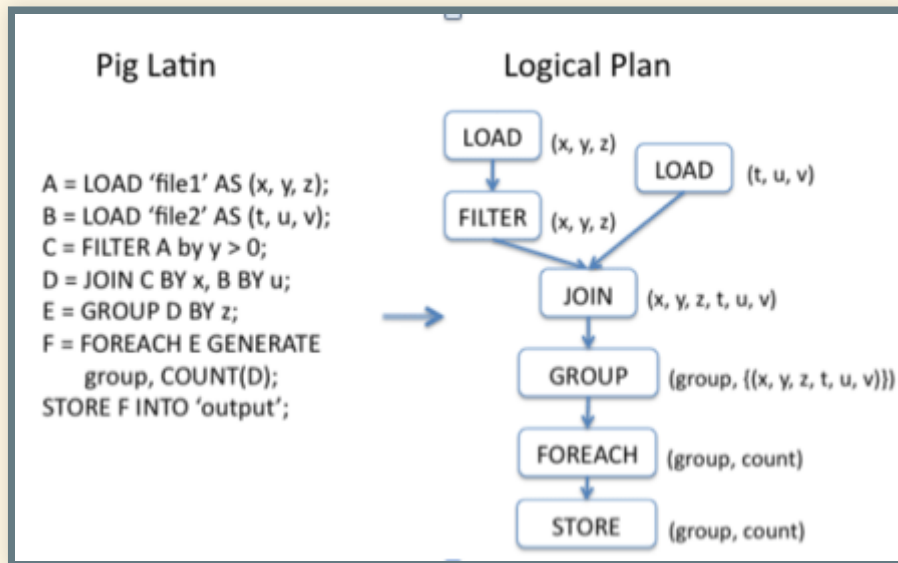
- Initially Java

**Sample MapReduce (small subset of the entire code which totals nearly 150 lines):**

```
public static class MapClass
extends Mapper<WordOffset, Text, Text, IntWritable> {
    private final static String delimiters =
        "'',./<>?:;\"'[]{}-=_+()&*% ^#$%!@`~ \\|<>>;¢£¤¥¦§¨ª«¬®¯°±²³´µ¶·¸¹º»¼½¾¿";
    private final static IntWritable one = new IntWritable(1);
    private Text word = new Text();
    public void map(WordOffset key, Text value, Context context)
        throws IOException, InterruptedException {
        String line = value.toString();
        StringTokenizer itr = new StringTokenizer(line, delimiters);
        while (itr.hasMoreTokens()) {
            word.set(itr.nextToken());
            context.write(word, one);
        }
    }
}
```

# QUERYING

- Apache Pig



- Apache Hive

```
SELECT pv_users.gender,  
count(DISTINCT pv_users.userid),
```

```
count(*), sum(DISTINCT  
pv_users.userid) FROM pv_users GROUP  
BY pv_users.gender;
```

# SQL

- Everyone knows
- Easy for analysts
- But there are actually alot of ways of querying HDFS
  - Cascading, Scalding, Cascalog, etc.

```
class WordCountJob(args : Args) extends Job(args) {  
  TypedPipe.from(TextLine(args("input")))  
    .flatMap { line => line.split("""\s+""") }  
    .groupBy { word => word }  
    .size  
    .write(TypedTsv(args("output")))  
}
```

```
(?- (stdout)  
  (<- [?word ?count]  
    (sentence :> ?line)
```

```
(tokenise :< ?line :> ?word)  
(c/count :> ?count))
```



**HDP**



## Hortonworks HDP 2.1

Batch

Map  
Reduce

Script

Pig

SQL

Hive/Tez,  
HCatalog

NoSQL

HBase  
Accumulo

Stream

Storm

Search

Solr

In-memory

Spark

others

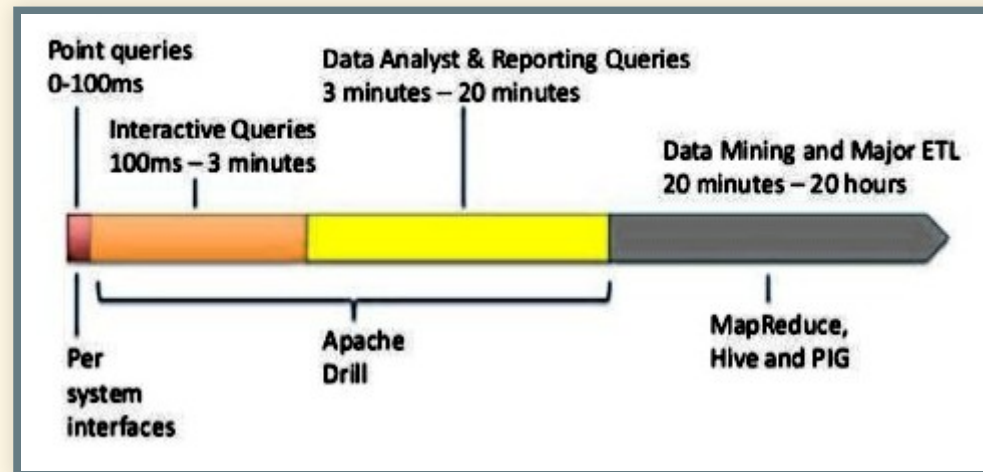
ISVs

**YARN : Data Operating System**

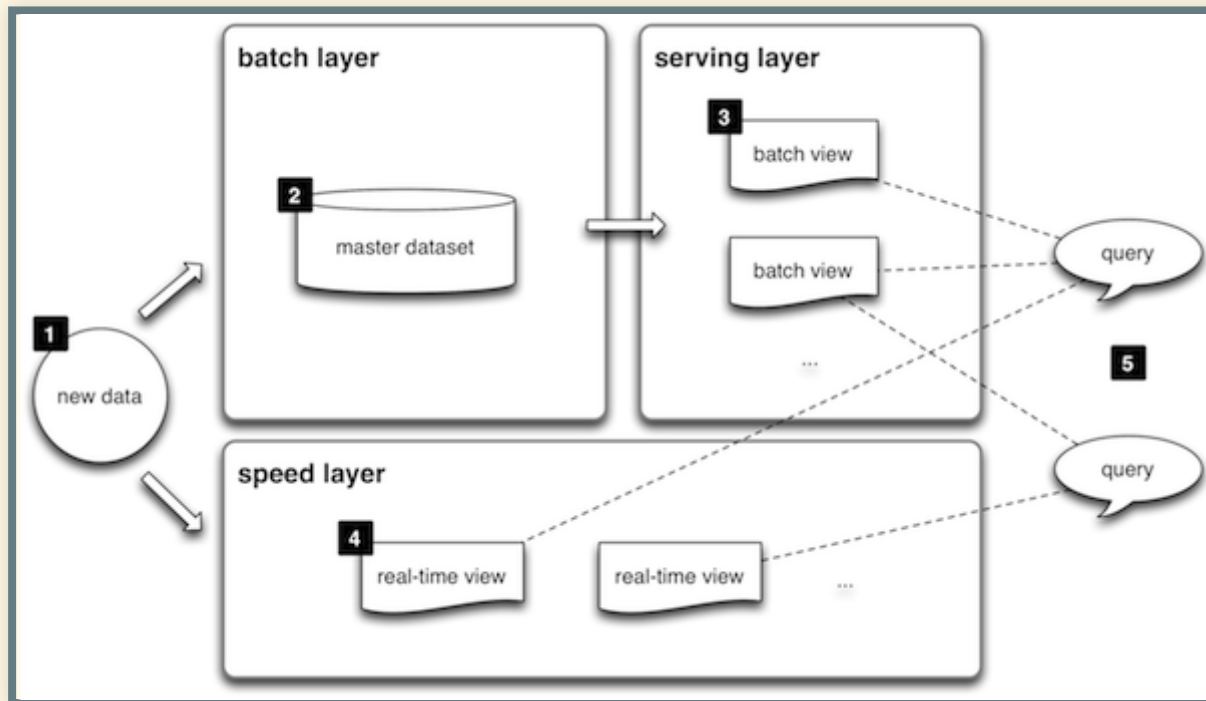
**HDFS**

(Hadoop Distributed File System)

# BUSINESS NEEDS



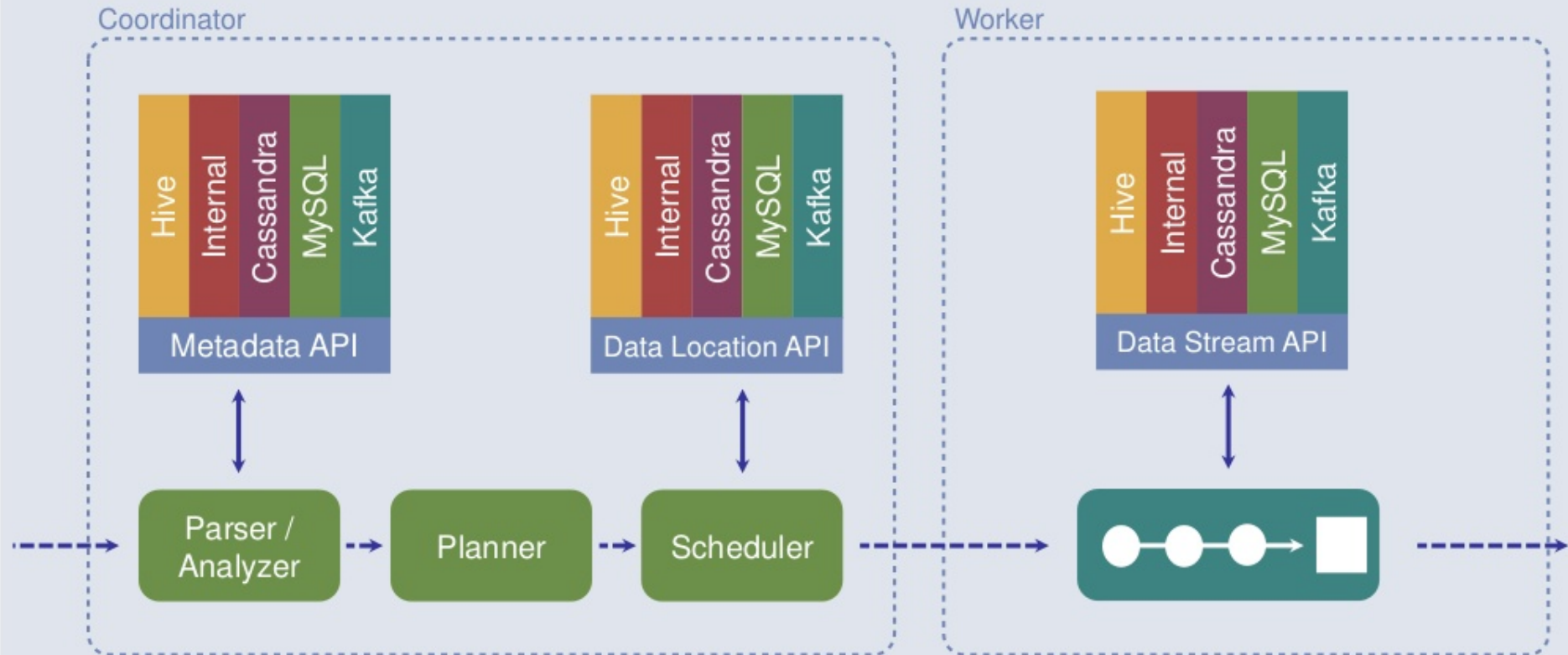
# LAMBDA ARCHITECTURE



## **2. PRESTO**

# ARCHITECTURE

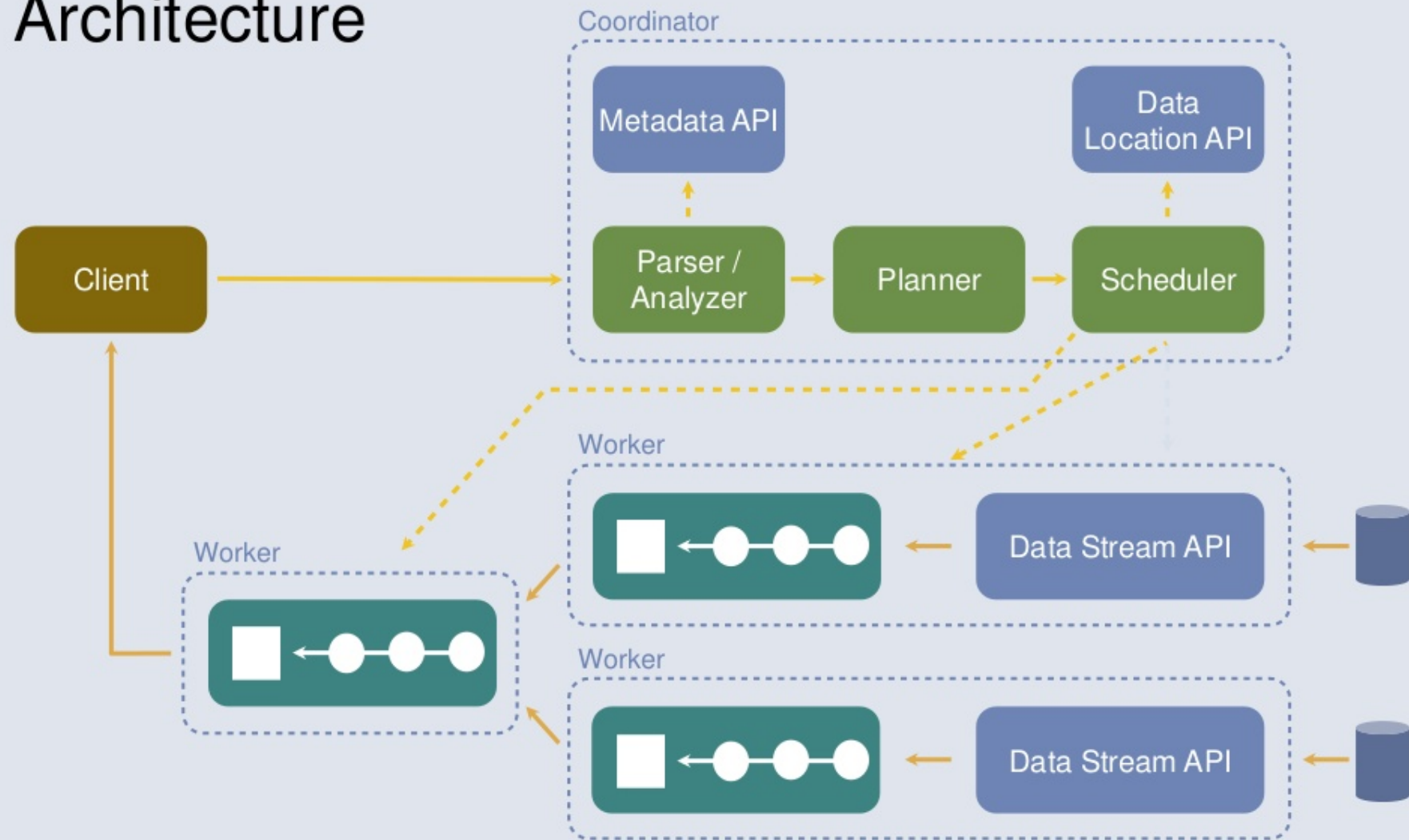
# Connectors



# ARCHITECTURE



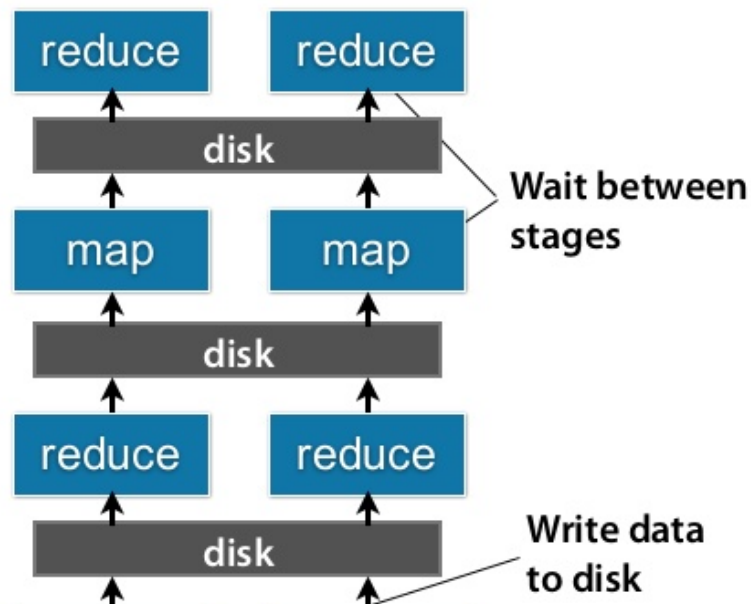
# Architecture



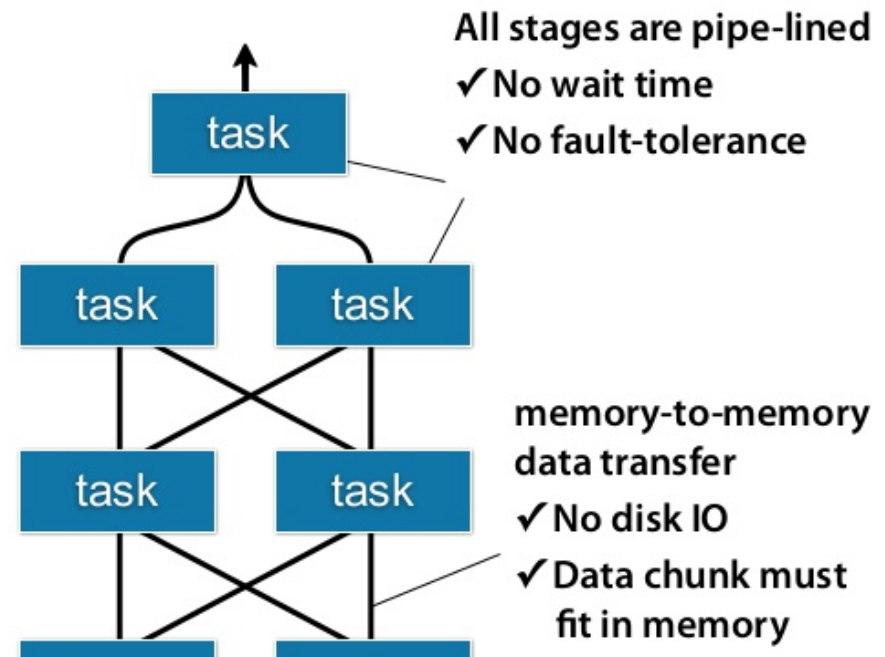
# MR VS PRESTO

## MapReduce vs. Presto

### MapReduce



### Presto



map

map

task

task

## DETAILS

- Data must fit in memory
- Uses connectors to several backends
  - Cassandra, Hive, JMX, Kafka, Mysql, Postgres
- Nodes are stateless

# SUPPORT

- Ansi SQL
- Approximation functions
- JSON functions
- PrestoML

**TRICKS**

## BEST ONES

- **Vectorized Reader:** read based on column vectors
- **Predicate Pushdown:** use statistics/logic to skip data
- **Lazy Load:** postpone loading until needed
- **Lazy materialization:** postpone decoding until needed

# 2.1 COLUMNAR STORE

## Columnar Storage

A	B	C
A1	B1	C1
A2	B2	C2
A3	B3	C3

row-oriented storage

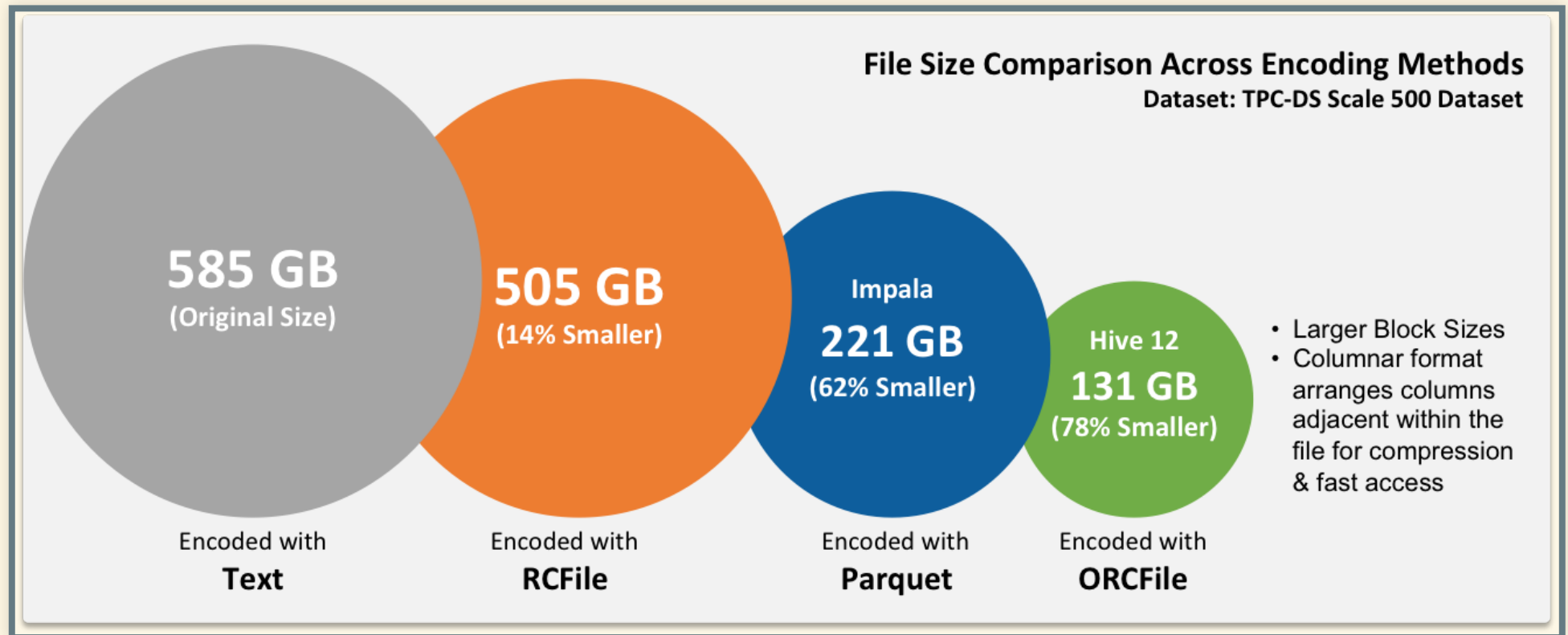
A1	B1	C1	A2	B2	C2	A3	B3	C3
----	----	----	----	----	----	----	----	----

column-oriented storage

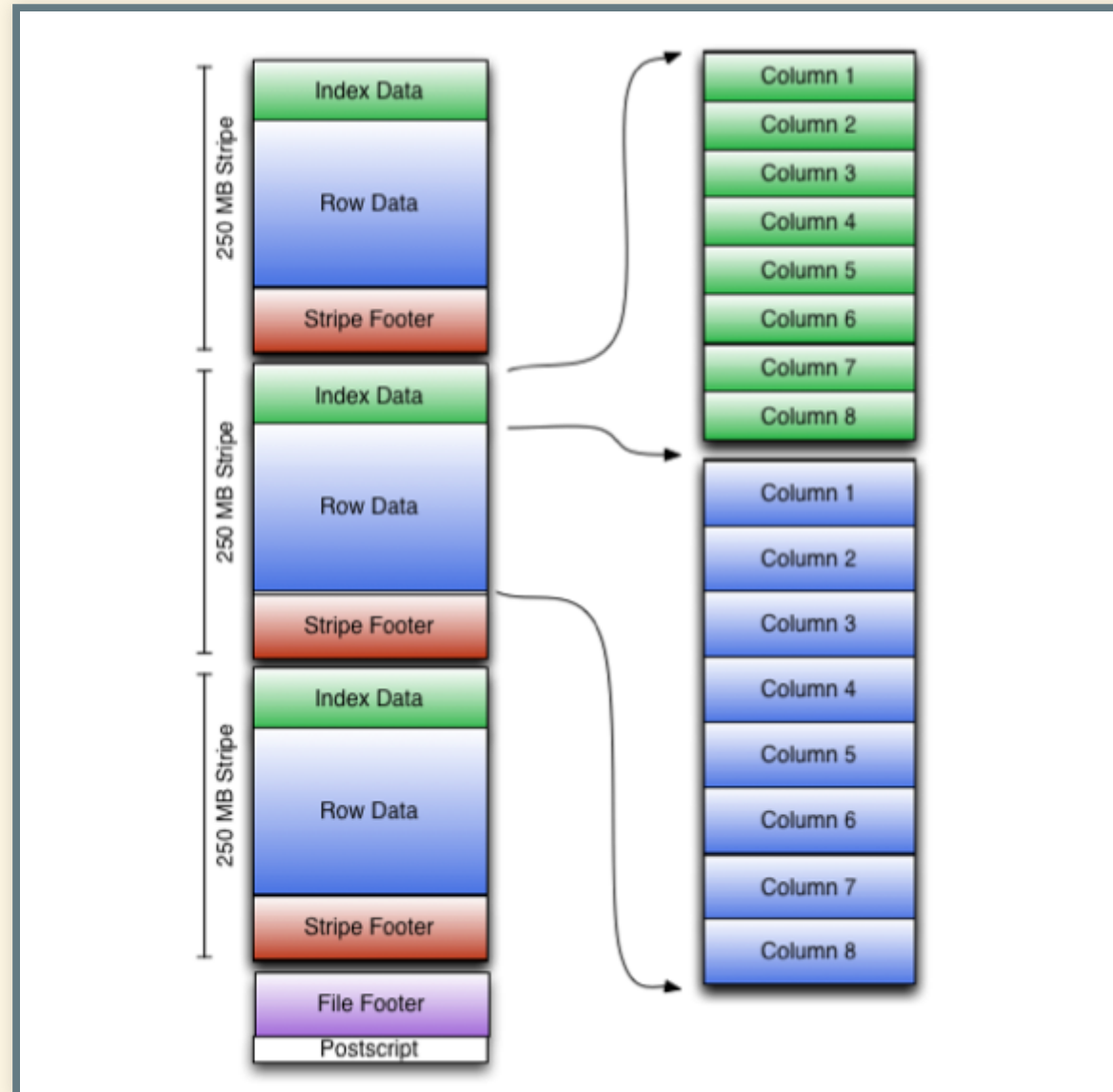
A1	A2	A3	B1	B2	B3	C1	C2	C3
----	----	----	----	----	----	----	----	----



## 2.2 FILE SIZE COMPARISON

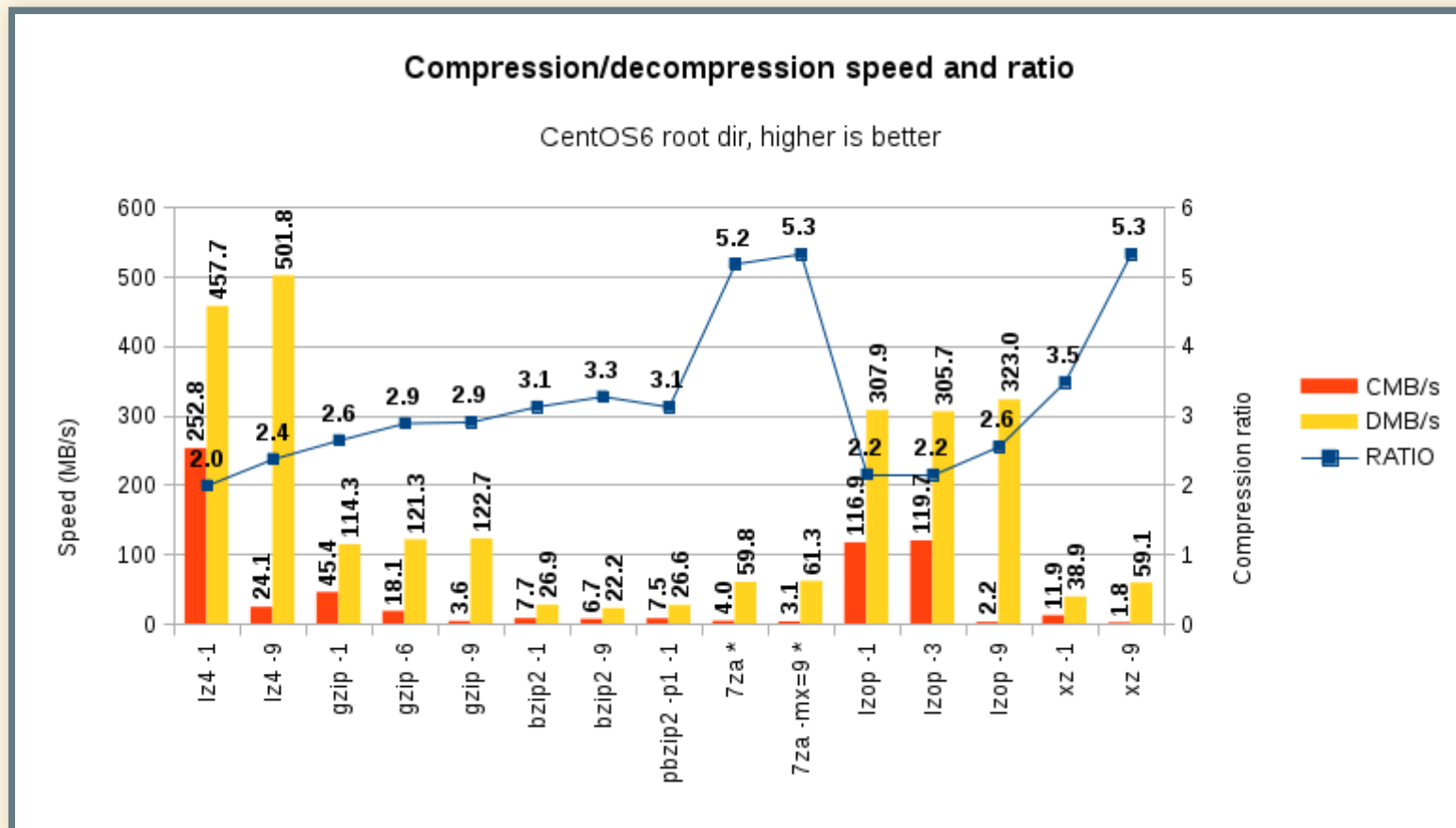


# FILE LAYOUT

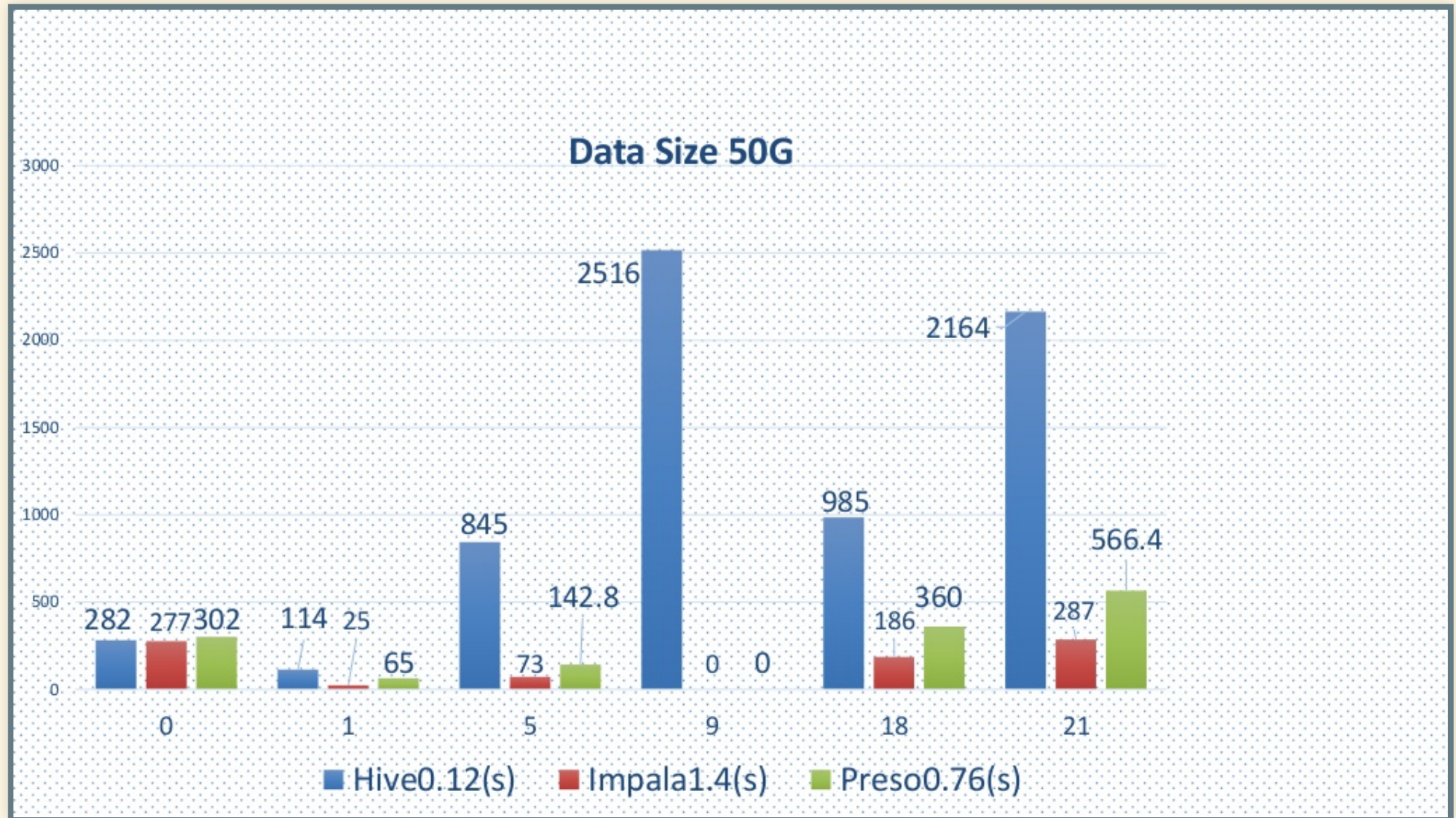




# COMPRESSION

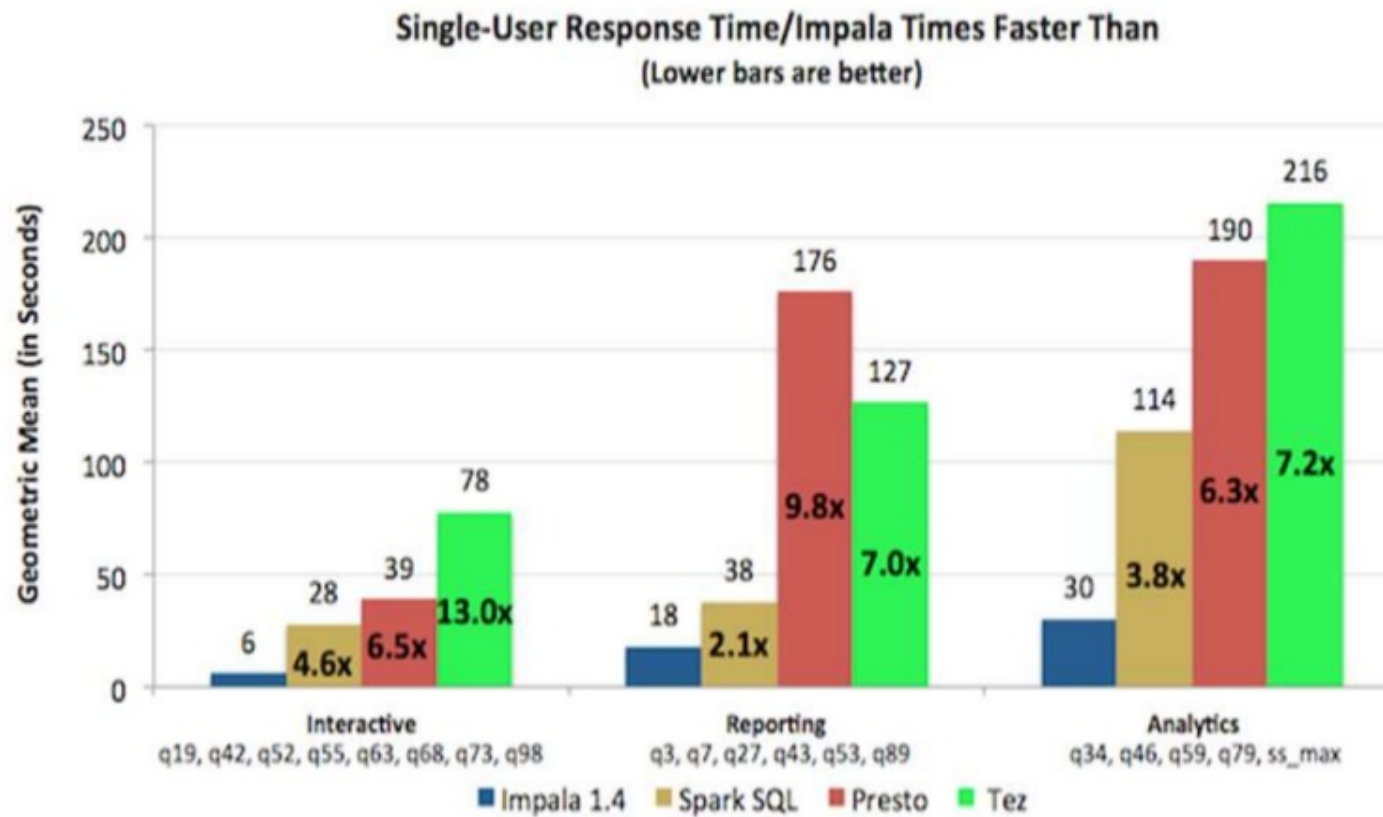


# BENCHMARKS





# BENCHMARKS



# OTHERS

- Fast inner loops (related to CPU cache)
- `sun.misc.Unsafe` (non-gc memory access)
- Pipelining, streaming

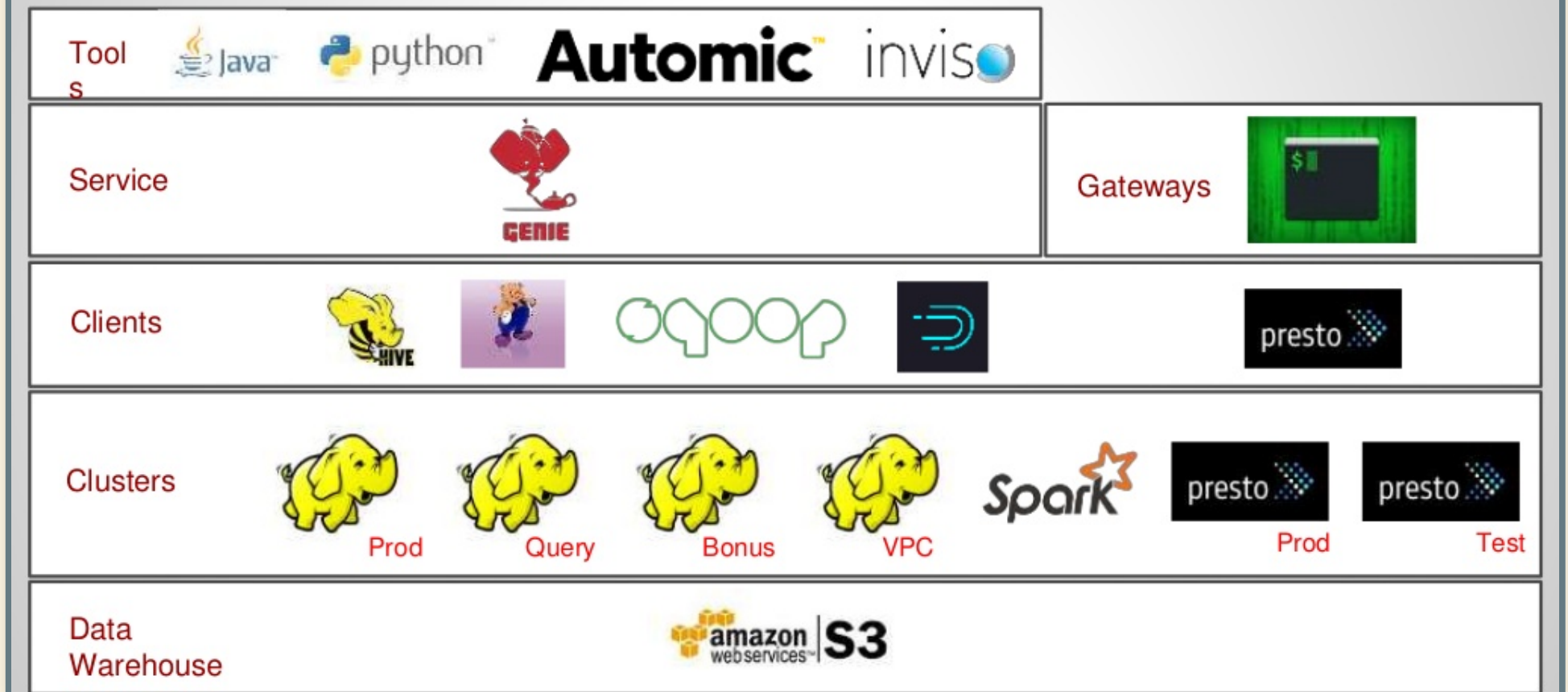
# NOTES

- SQL parser is being used in other projects (ex: [crate.io](https://crate.io))
- Airpal - UI for presto
- There's also Impala, Apache Drill, Apache Tajo, Redshift, Spark, etc
- PaaS - Presto as a service called Qubole



# NETFLIX

## Big Data Platform Architecture





[http://www.slideshare.net/treasure-data/2015-0311td-techtalkinternalsofprestoservice?  
qid=702c79ef-0632-476b-abb0-  
0aaff121cf00&v=default&b=&from\\_search=12](http://www.slideshare.net/treasure-data/2015-0311td-techtalkinternalsofprestoservice?qid=702c79ef-0632-476b-abb0-0aaff121cf00&v=default&b=&from_search=12)