

Enterprise Data Problems in Investment Banks

“BigData” History and Trend – Driven by Google

CAP Theorem for Distributed Computer System

Open Source Building Blocks: Hadoop, Solr, Storm..

Hypothetical Solution using Lambda Architecture

Where “BigData” Industry is Going?

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**SQL + NOSQL + NEWSQL + REALTIME
FOR INVESTMENT BANKS**

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ASHWANI ROY

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Presenter: Charles Cai

- Charles Cai makes a living by designing and implementing trading and risk systems for investment banks.
- Currently a Chief Front Office Technical Architect in a global energy trading firm.
- Twitter: [@caidong](#)
- LinkedIn: [charlescai](#)

Presenter: Ashwani Roy

- Ashwani Roy – Masters in Finance Student at London Business School and VP at a Tier 1 Investment Bank.
- Love to mix programming and Applied Mathematics to solve difficult problems in Investment Banking
- Twitter: [@Ashwani_Roy](https://twitter.com/@Ashwani_Roy)
- LinkedIn: [ashwaniroy](https://www.linkedin.com/in/ashwaniroy)



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Why Finance Industry should care ?

- We care because of
 - ▣ Compliance requirements
 - ▣ Risk Management
 - ▣ Pricing
 - ▣ Rise of Machines (Ecommerce)
 - ▣ Cost Cutting
 - ▣ BTW: Twitter is also part of Market Data

Sample Interest Model / Simulations

$$dr = k(r_l - r_t)dt + \sigma * dw_t$$

A quick Monte Carlo Demo

- Demo – Computing this is functional

Some Terminology

- PV = present value = Cash flows discounted to current time
- Delta = change in price / change in interest rate
- Gamma .. Vega .. Rho .. Theta .. Vanna And other Greeks

Monte Carlo Simulations -Results

- $\langle \text{results} \rangle = \text{func} \langle l, j, k, \dots \rangle$
- Parallelize computation with mappers
- Save results and run reducers
- ```
[[trade: 1 curveid: Orig PV:100 Delta:200]{ to OLAP}
 ..[trade: 1 curveid: Sim1 PV:100 Delta:200] {big data}
 ..[trade: 1 curveid: Sim2 PV:99 Delta:220]{big data}]]
```



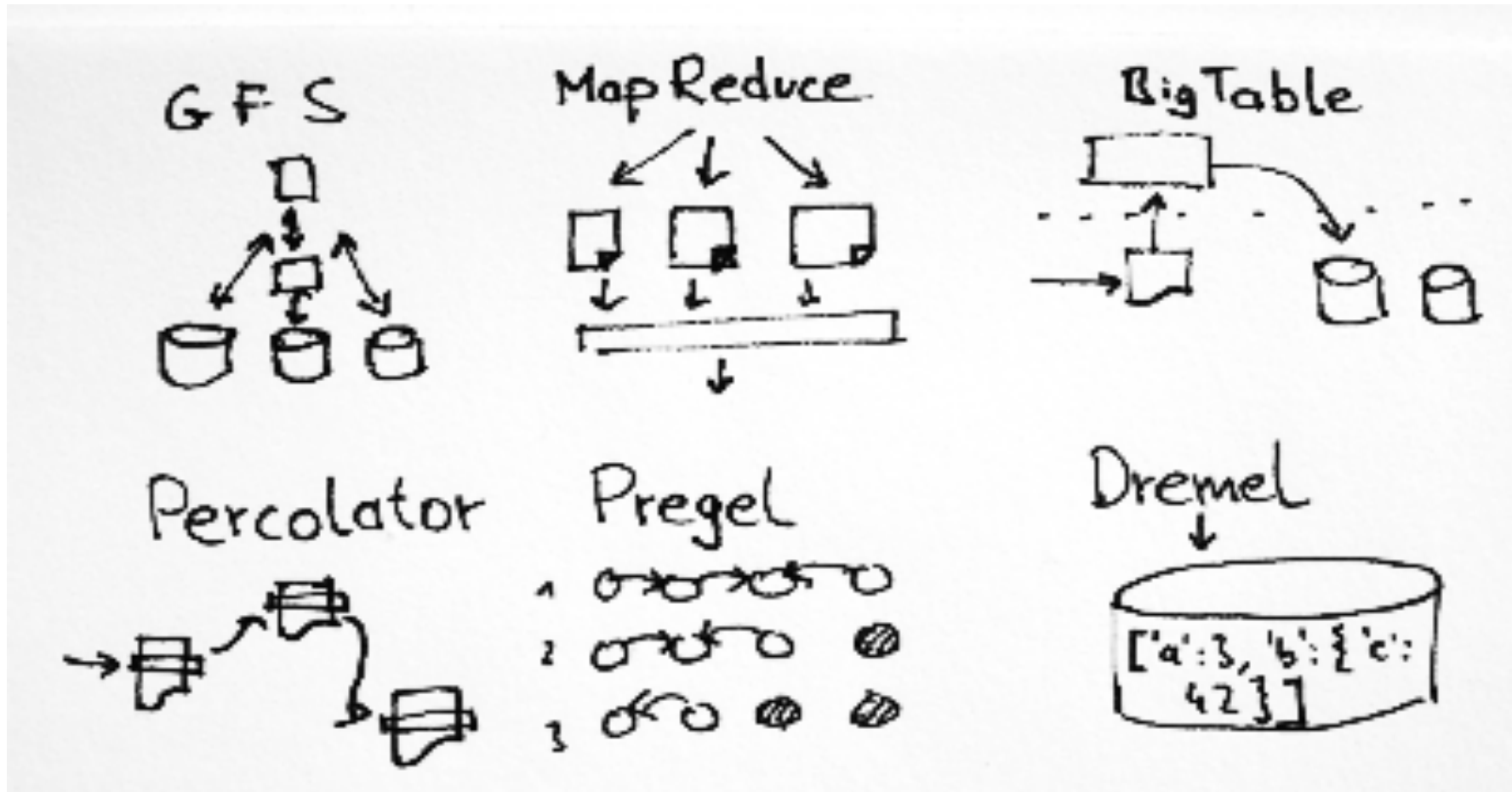
# Compliance

- ▣ Dodd-Frank requires  $\geq$  **five years** records
- ▣ Fast Disaster recovery requirements (Tapes backup not acceptable)
- ▣ All Bloomberg and other chats to be saved in quick reportable form
- ▣ ... Many more in Basel 3 and Dodd Frank Act

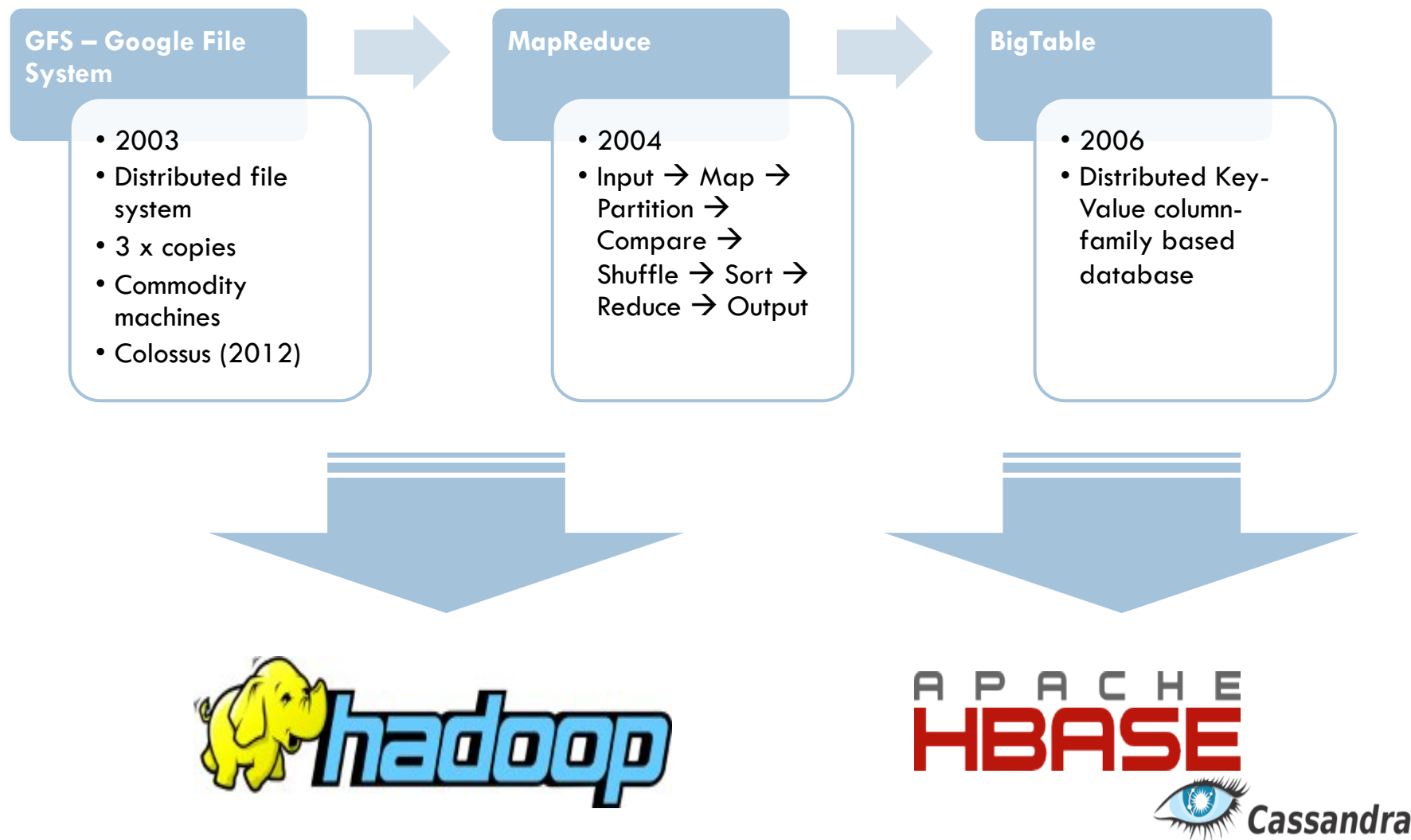
## You need to

- # get **chats** for [AshwaniRoy@bloomberg.net](mailto:AshwaniRoy@bloomberg.net) and [ashwaniR@reuters.net](mailto:ashwaniR@reuters.net)
  - # from the 5 years Bloomberg and Reuters log of a global investment bank of **1TB** (assume 1MB/Day/Trader \* 220 trading days \* 1000 traders \* 5 years)
  - # for all EURUSD swaps only
- ..... Additional filters and aggregation requirements**

# Big Data Industry History: Google's Papers

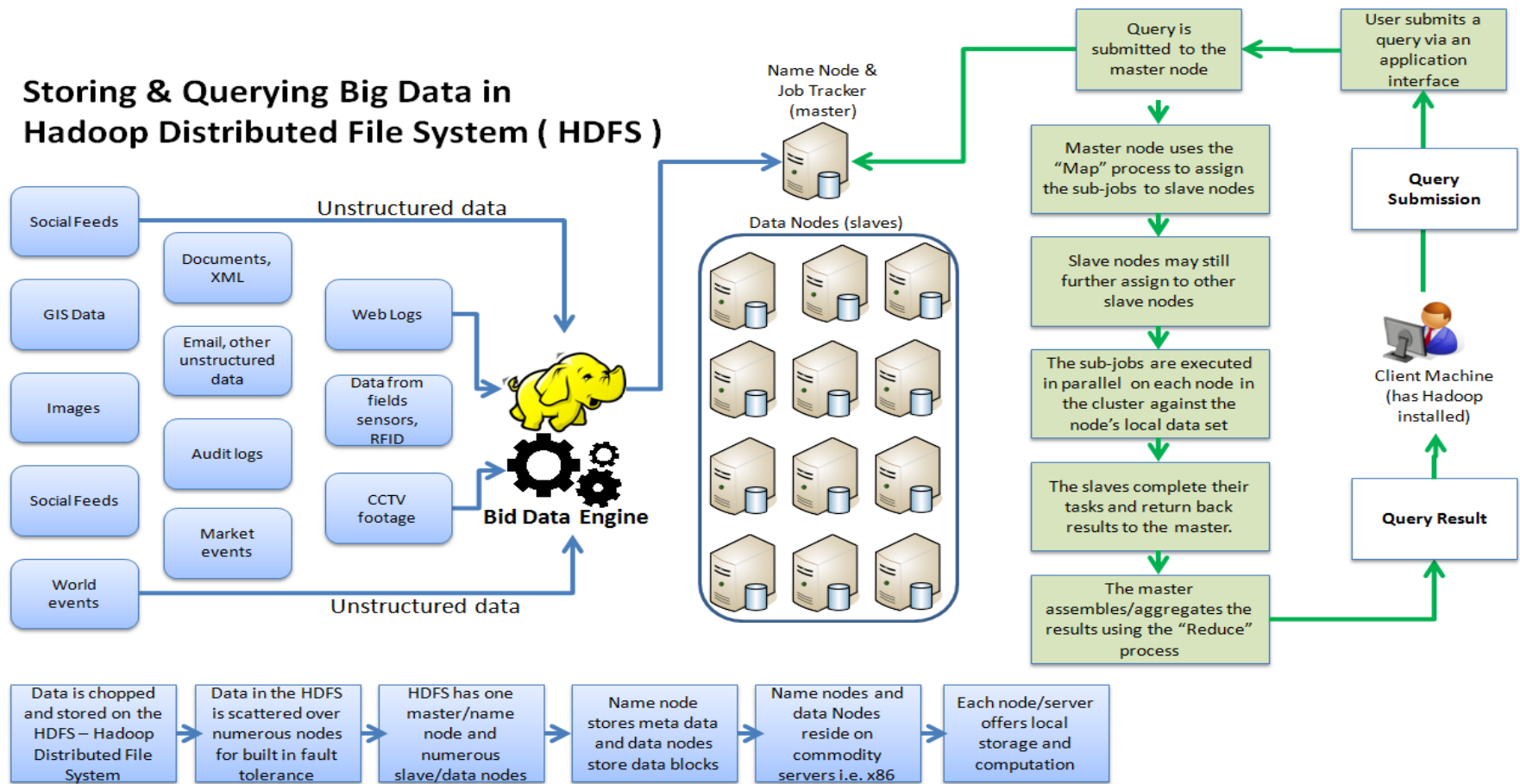


# Google's Big Data Papers: 2003 – 2006



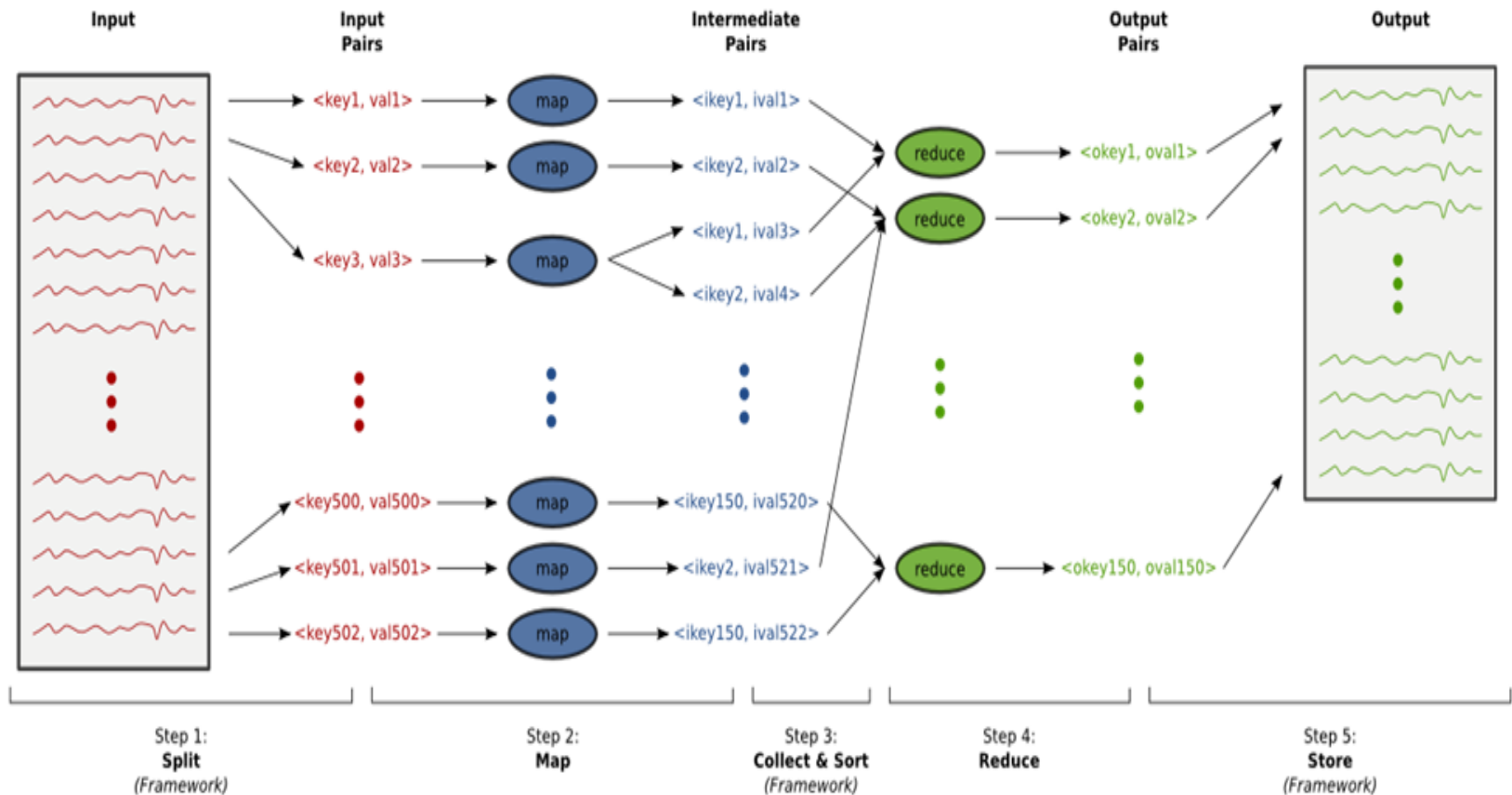
# Hadoop Distributed File System (HDFS)

## Storing & Querying Big Data in Hadoop Distributed File System (HDFS)

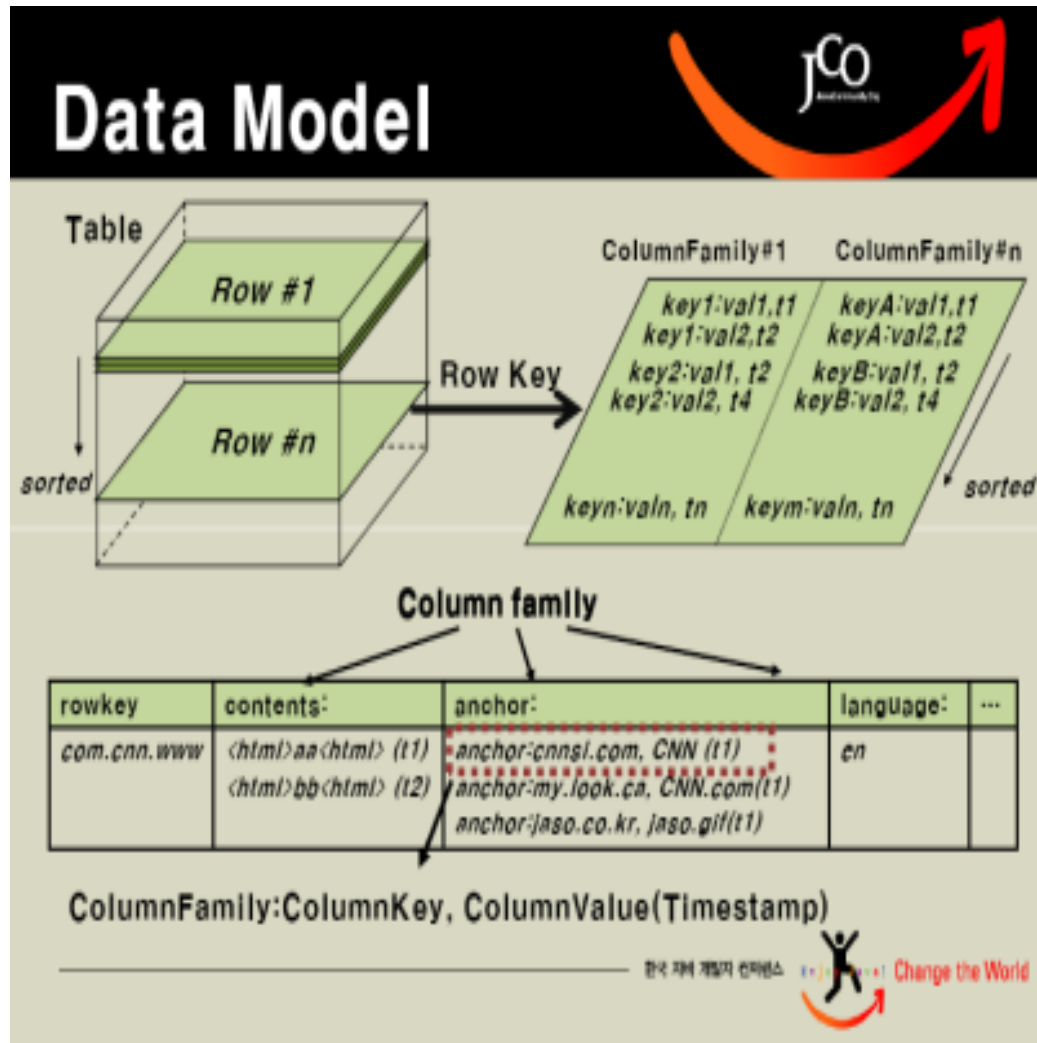
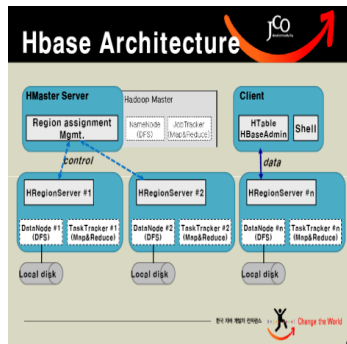


Designed by Sri Prakash, November 2012

# Google's MapReduce Programming Model



# Apache Hbase: Column Family Distributed K-V Store



**Table example**

document-term Table

| Rowkey                    | term:        | content:                 | title:     |
|---------------------------|--------------|--------------------------|------------|
| www.jaso.co.kr/123        | term:java 2  | content: <html>1/</html> | title: 제책1 |
|                           | term:ajax 5  | content: <html>2/</html> | title: 제책2 |
|                           | term:hbase 2 |                          |            |
| www.okjss.pe.kr?article=1 | term:java 3  |                          |            |

term-document Table

| Rowkey | document:                            |
|--------|--------------------------------------|
| java   | document:www.jaso.co.kr/123 2        |
|        | document:www.okjss.pe.kr?article=1 3 |
|        | ...                                  |
| ajax   |                                      |

# Google's Big Data Papers 2: 2010 - now

## Percolator

- 2010
- Incremental update/compute
- built on BigTable
- Adds transactions, locks, notifications
- SPFs: "Stream Processing Frameworks" + underlying database

## Dremel

- 2010
- Online analytics and visualization
- SQL like language for structured data
- Each row is JSON object – in protobuf format
- Column based
- **Spanner (2012), BigQuery, F1**

## Pregel

- 2010
- Scalable graph computing
- Worker threads → nodes → parallel "superstep" → messages → nodes → Aggregator/Combiners (global statistics)
- **PageRank**, shortest path, bipartite matching



Impala

Tez/Stinger



Microsoft  
Trinity

# Unstructured Data: Index/Search Engine



□ Github Code Search: 17 TB



# Apache Lucene/SOLR

- Open Source Indexing and Search Engine
- 4,000+ Enterprise users
  - ▣ IBM, HP, Cisco
  - ▣ Apple, LinkedIn
  - ▣ Wikipedia
  - ▣ CNet, Sky
  - ▣ Twitter



# What's Next for Hadoop? Real-time!



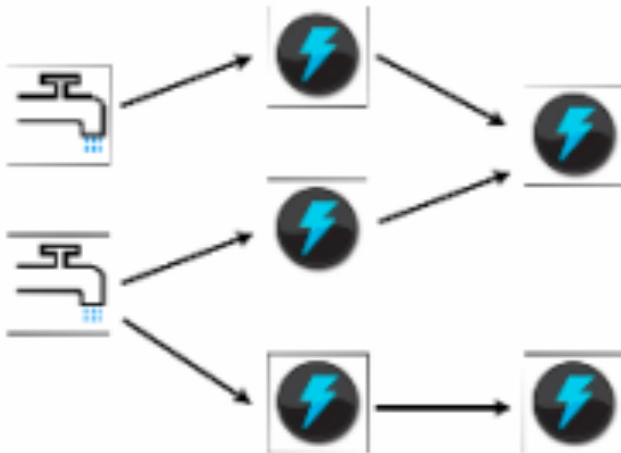
**Storm**

*Distributed and fault-tolerant realtime computation*

## Background

Nathan Marz

## Backtype, Storm, and Twitter



<http://storm-project.net/>

<http://www.manning.com/marz/>



# Some more use cases

- ▣ Save money to save your jobs
- ▣ Save money to your firm can do more
- ▣ E Commerce is norm...
- ▣ Market sentiment analysis cannot be relied on using  
“Bloomberg's sentiment analysis” only
- ▣ .. Add some more

## “Lambda Architecture” – Nathan Marz, BackType/Twitter

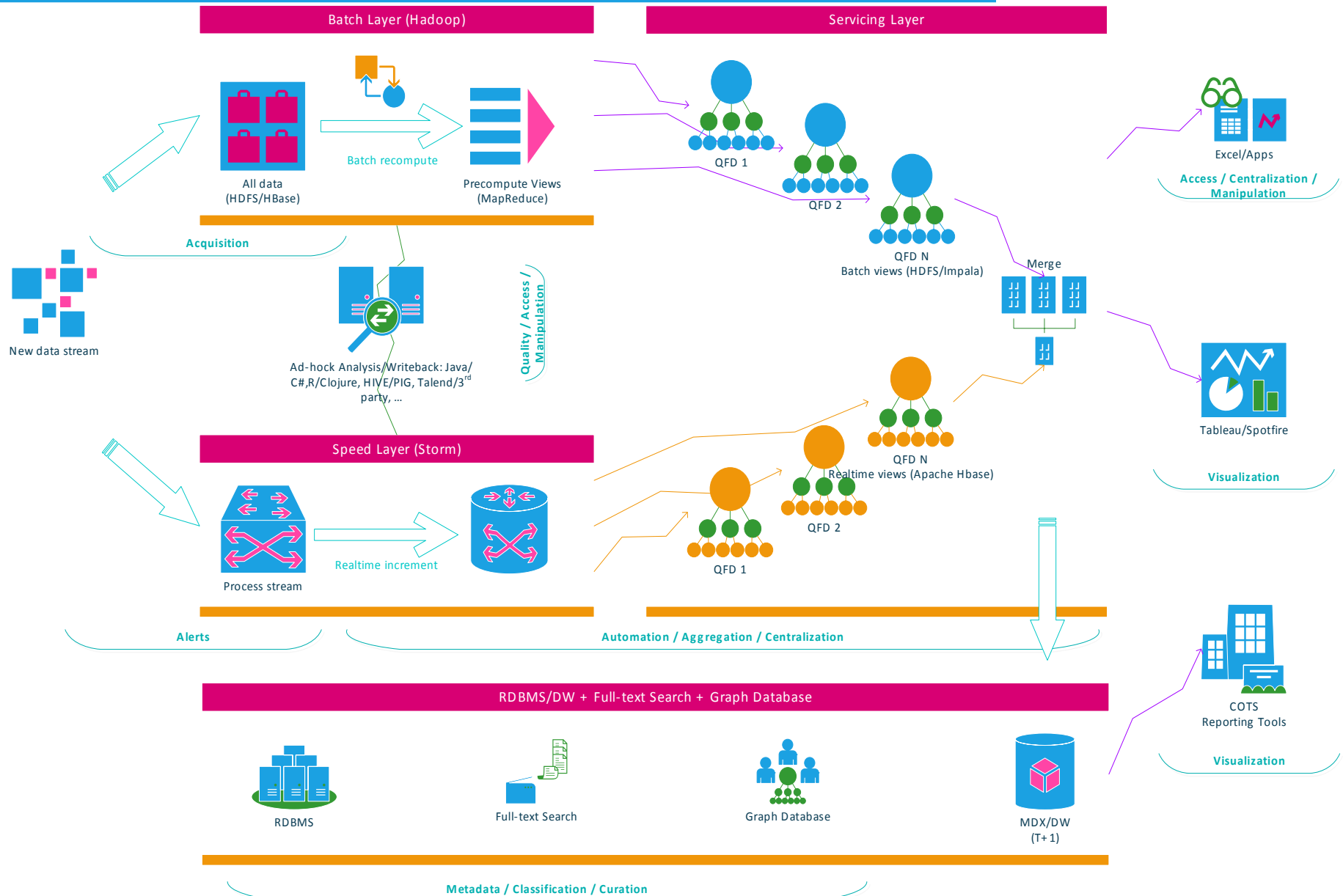
□ **query = func (data, ...)**

- Excel / VBA
- Java, C#/F#...
- MatLab
- 3<sup>rd</sup> party ETL Tools
- R
- ...

- Technical analysis...
- Alerts...
- Join across data sources (e.g. correlation among weather / energy)
- Curating/cleanse curves...
- Derive curves, building models...
- Back-testing models...
- Visualization of the above!
- ...

- Real-time ticks, events...
- Historical (all history data points)
- Curated/cleansed curves...
- Derived curves...
- Back-testing models...
- ...

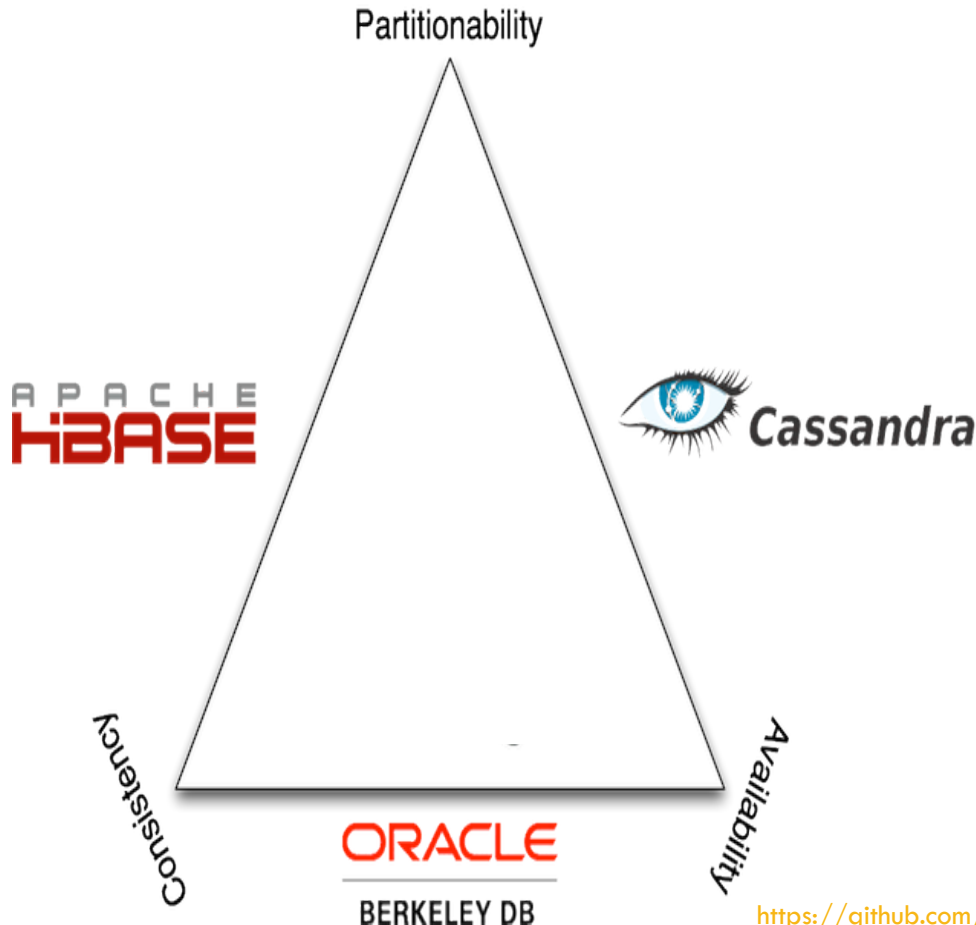
# Lambda Architecture : query = func (data, ...)



# Online resources and alternative stacks

- ❑ [An Introduction to Data Science.PDF](#) – Free e-book on Data Science with R under Creative Commons Licenses
- ❑ [Berkeley Data Analytics Stack](#) (Open Source: Mesos – cluster management, Spark/Streaming – cluster computing, Shark-SQL/DW)
- ❑ Learning Statistics with R, [Free Big Data Education: Advanced Data Science](#)
- ❑ [DataStax Enterprise \(Apache C\\*/Cassandra, Apache Hadoop, Apache Solr...\)](#)
- ❑ [An example “lambda architecture” for real-time analysis of hashtags using Trident, Hadoop and Splout SQL](#)
- ❑ Nathan Marz (BackType, acquired by Twitter) [Big Data Lambda Architecture](#)
- ❑ Open source clustered Lucene: [elasticsearch](#) used by GitHub (17 TB code)

# Distributed Computing System: CAP Theorem



## Consistency

- all nodes see the same data at the same time

## Availability

- a guarantee that every request receives a response about whether it was successful or failed

## Partition tolerance

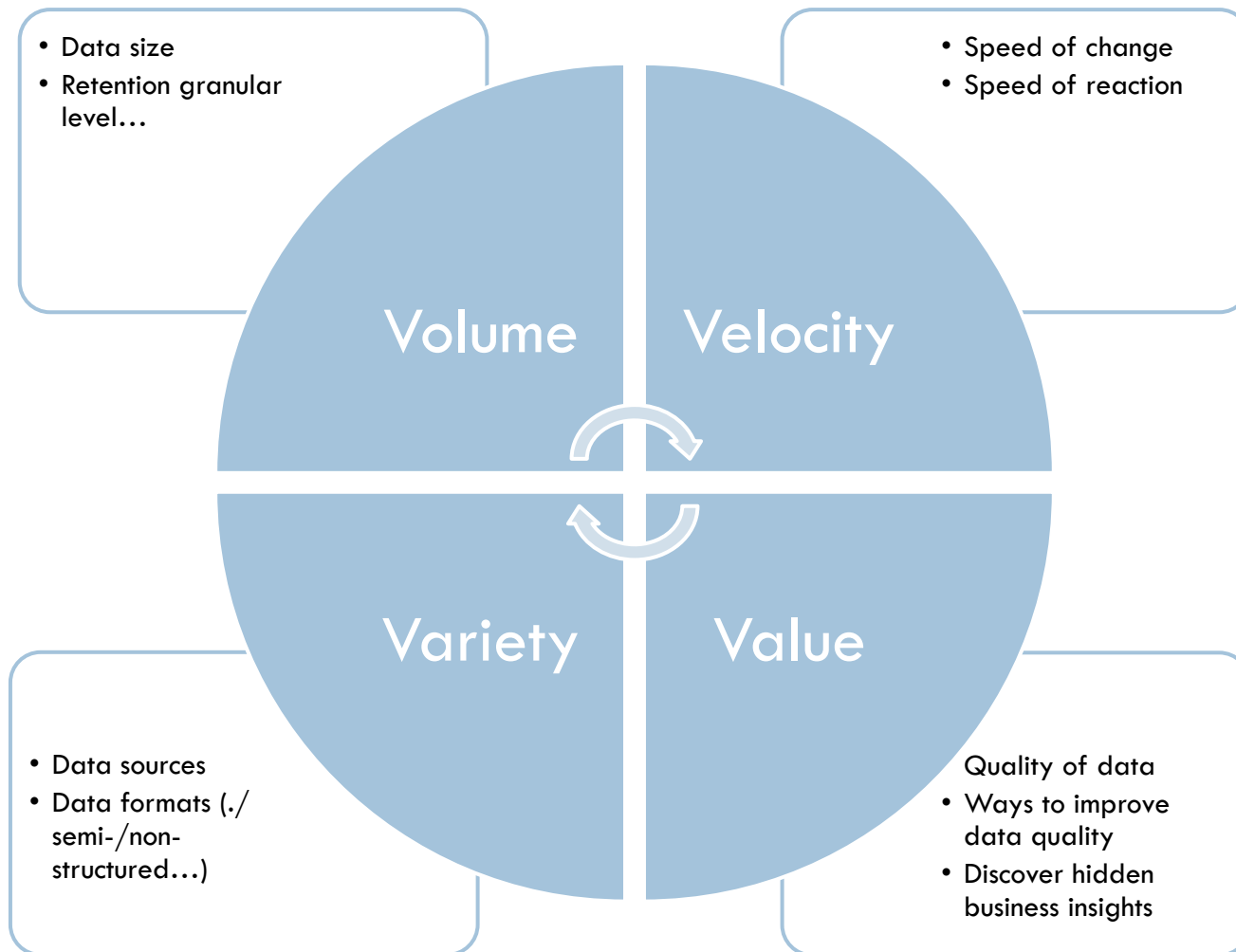
- the system continues to operate despite arbitrary message loss or failure of part of the system

<https://github.com/thinkaurelius/titan/wiki/Storage-Backend-Overview>

[http://en.wikipedia.org/wiki/CAP\\_theorem](http://en.wikipedia.org/wiki/CAP_theorem)

<http://www.infoq.com/articles/cap-twelve-years-later-how-the-rules-have-changed>

# “Lambda Architecture”: Enterprise Data





# “Lambda Architecture” – Nathan Marz, BackType/Twitter

## □ Design Principle:

- Human fault-tolerance
- Immutability
- Pre-computation

## □ Lambda Architecture:

- Batch Layer
- Serving Layer
- Speed Layer

## □ Technology Stack

- Apache Hadoop/HBase/Cloud
- Twitter Storm

