

Presented By

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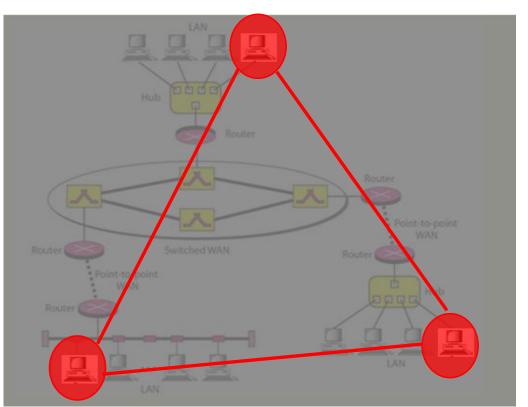
## What is a Distributed Computing Platform?

□ A Distributed System is a Collection of SMALL independent computers that appears to its users as a single BIG coherent system.

- ☐ Multiple Processes
- ☐ Interprocess Communication
- ☐ Disjoint Address Spaces
- ☐ Collective Goal



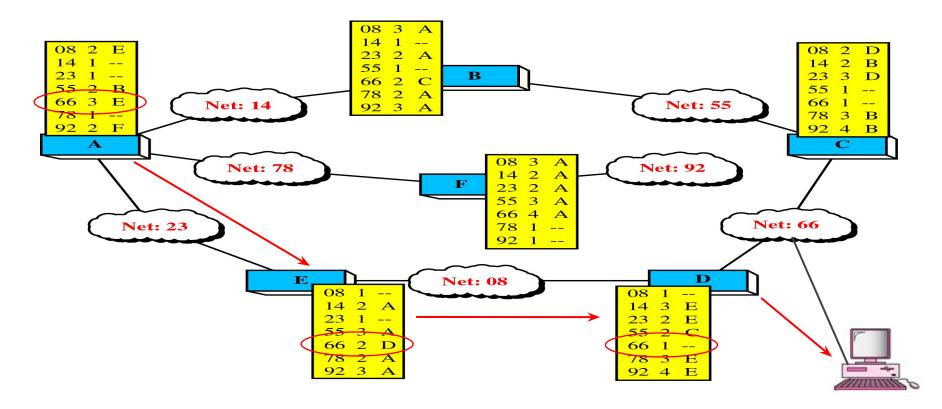
The Gulliver's

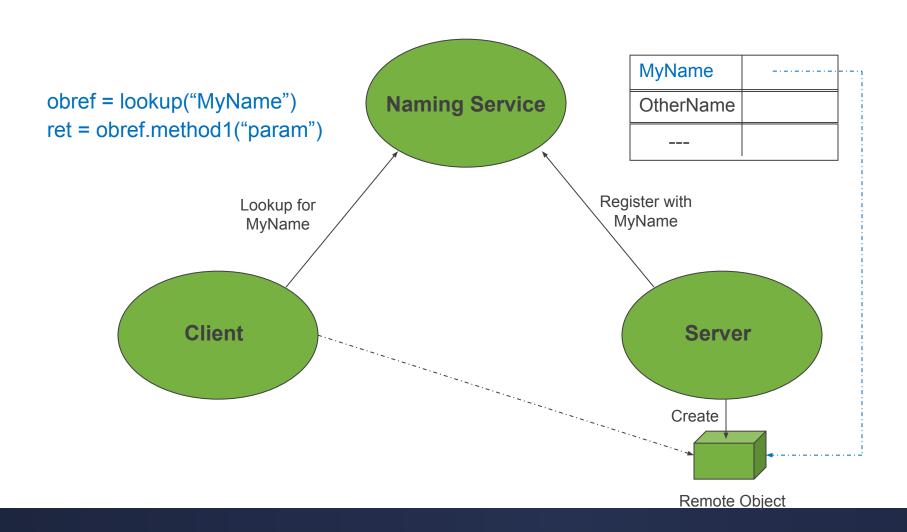


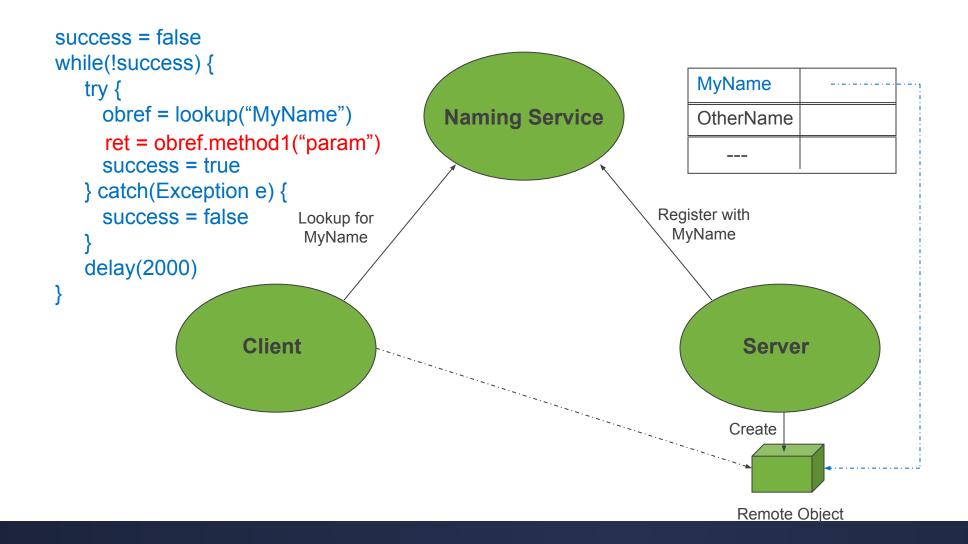
## What is a Distributed Computing Platform?

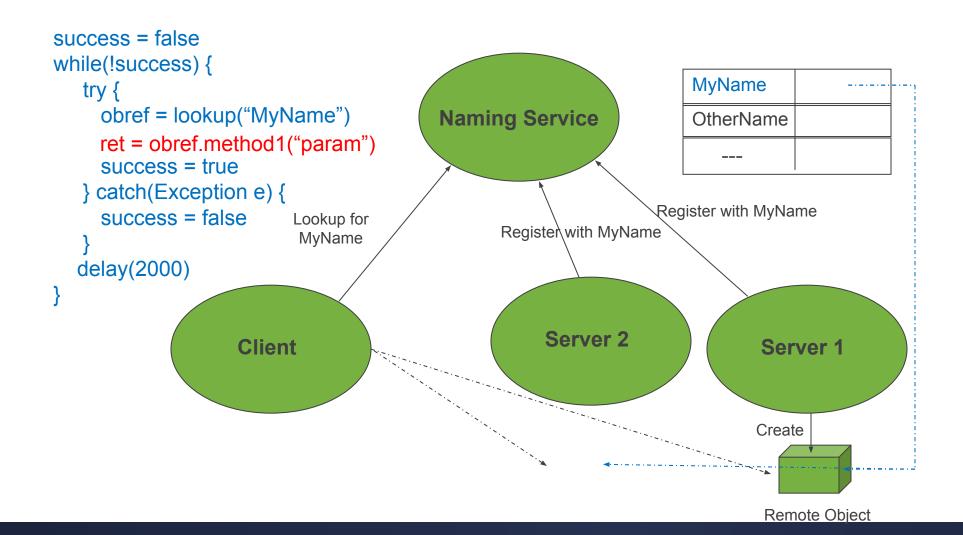
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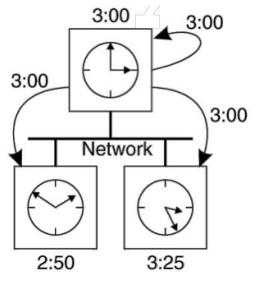
Routing Algorithm : An Example









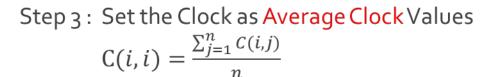


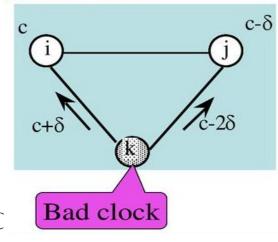
# $\begin{array}{c} c \\ 1 \\ 0 \\ c \\ k \\ t \\ i \\ m \\ e \end{array}$ $\begin{array}{c} \frac{\check{s} \delta}{\delta} \\ -- \operatorname{clock} 1 \\ -- \operatorname{clock} 2 \end{array}$ Newtonian time

#### **Algorithm: Berkley for Node**

Step 1: Read all the Clock Values for(j=1;  $j \le n$ ; j++)
Read C(i, j)

Step 2 : Discard Bad Clocks 
$$\begin{aligned} &\text{for}(j=1;\,j{<}{=}n;\,j{+}{+})\\ &\text{if}(|\textbf{C}(i,j)-\textbf{C}(i,\,i)|>\delta) \ \text{ then } C(i,\,j)=C \end{aligned}$$





Byzantine Clocks

$$\frac{3\delta t}{n} < \delta$$

Berkley Algorithm can tolerate t byzantine clocks if n > 3t

$$R = \frac{\delta - \frac{3\delta t}{n}}{\rho}$$

$$R = \frac{\delta}{\rho}$$

$$R = \frac{\delta}{\rho(3t+1)}$$

$$\square Multiple Processes$$

$$\square Interprocess Communication$$

$$\square Disjoint Address Spaces$$

$$\square Collective Goal$$

Impossibility
Conditions!!

- 1. At least once: Try until a reply received.
- 2. At most once: Report failure without retry.
- 3. *Exactly once*: No way to guaranty.

Client Reissue Strategy

Always
Never
Only when ACKed
Only when not ACKed

Strategy  $R \rightarrow E$ 

REC RC(E) C(RE)

DUP	ONE	ONE
ONE	ZERO	ZERO
DUP	ONE	ZERO
ONE	ZERO	ONE

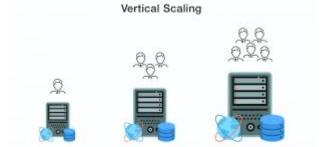
Server Strategy E -> R

ERC EC(R) C(ER)

DUP	DUP	ONE
ONE	ONE	ZERO
DUP	ONE	ZERO
ONE	DUP	ONE

A scalable distributed system can adapt to changes in demand by expanding its resources or redistributing tasks effectively.

- 1. Vertical Scalability (Scale-Up):
  - Increasing the capacity of existing nodes by adding more resources

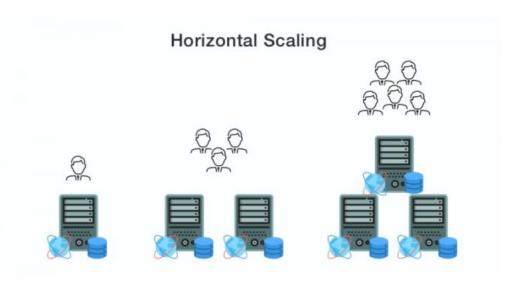


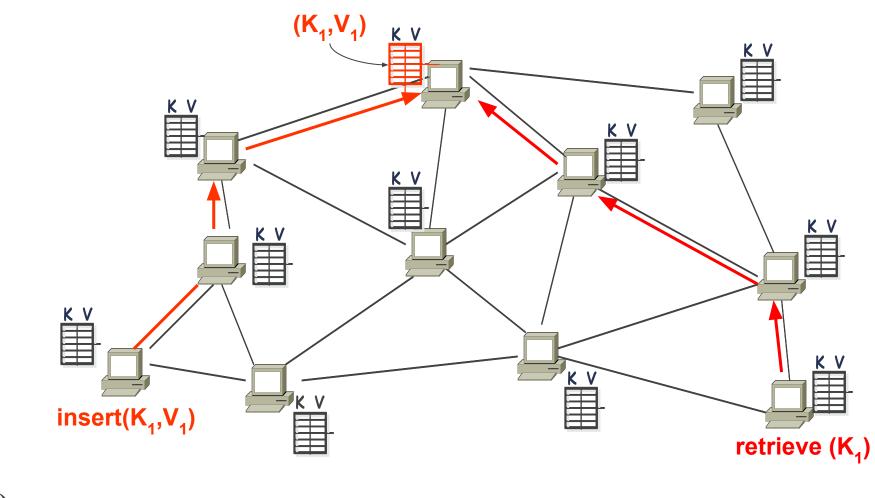
2. Horizontal Scalability (Scale-Out):

Adding more nodes to the system to handle increased demand.

Distributed Hash Table

- □ insert(key, value)
- $\square$  value = lookup(key)

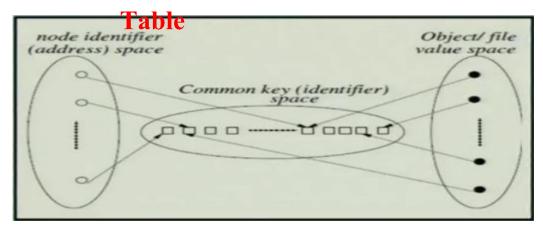




Distributed Hash Table

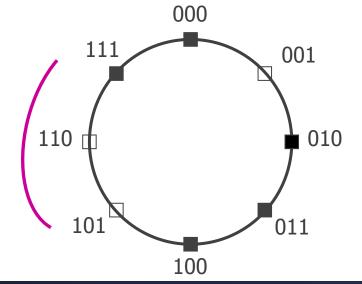
- □ insert(key, value)

#### **Chord Distributed Hash**

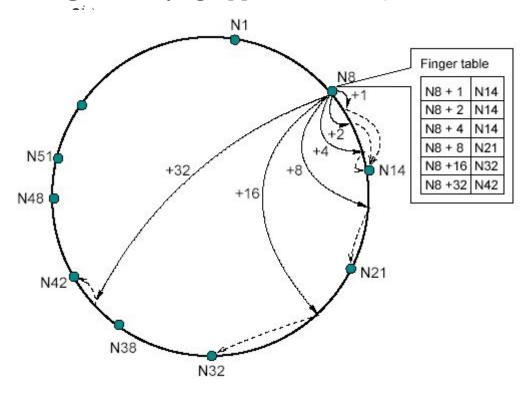


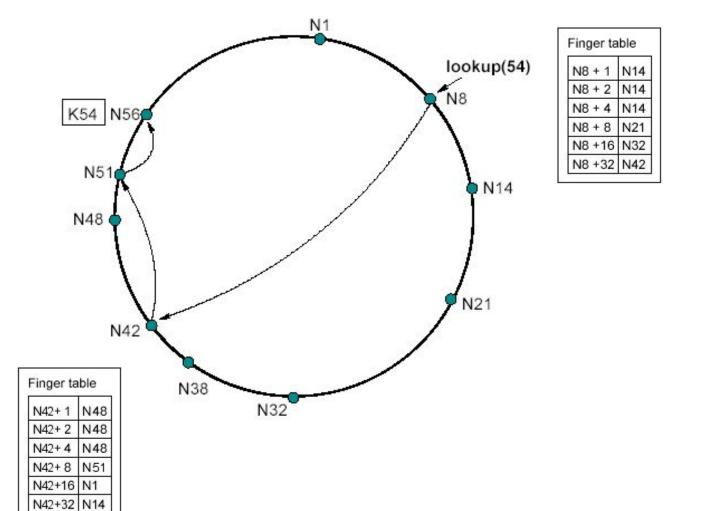
 $h(IP) \square m$ -bit id

 $h(file\ name)\ \square\ m$ -bit id

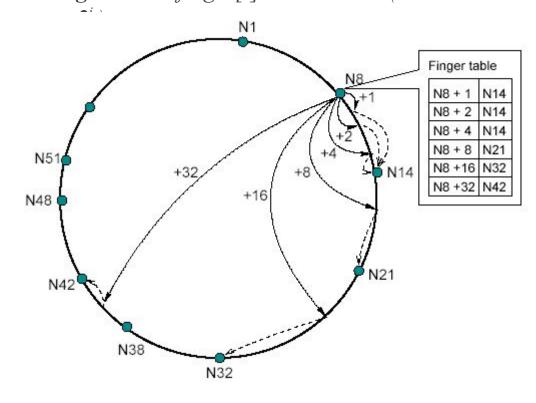


Finger table: finger[i] = successor(n +





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# High Availability in Distributed Systems

Replicate Data Items across multiple Nodes.

Data Items needs to be Locked for multiple Transactions.

There are 3 different approached to Lock.

#### Primary Copy Approach:

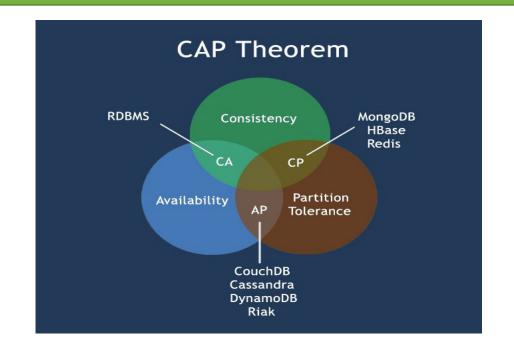
- ✓One of the replica is chosen as the Primary Copy.
- ✓ All lock/unlock requests goes to the Node containing Primary Copy.
- ✓ Disadvantage If the primary Site fails, the data becomes inaccessible.

#### Majority Protocol Approach

- ✓ If the data item is replicated in n no. of sites, then the lock/unlock request must be sent to more than n/2 sites containing a replica of the data item.
- ✓ It requires 2(n/2 + 1) messages for handling Lock request & (n/2 + 1) messages for handling Unlock request.

#### Biased Protocol Approach

- ✓ Here shared locks are given more preference over exclusive locks.
- ✔For shared lock it sends lock/unlock request to any one site containing a replica.
- ✓ For exclusive lock, it has to sent lock/unlock request to all the replica sites.

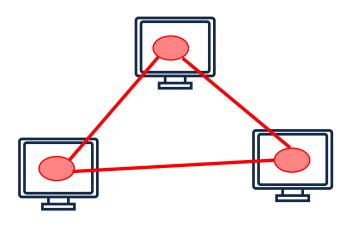


# What is Distributed Computing Platform?

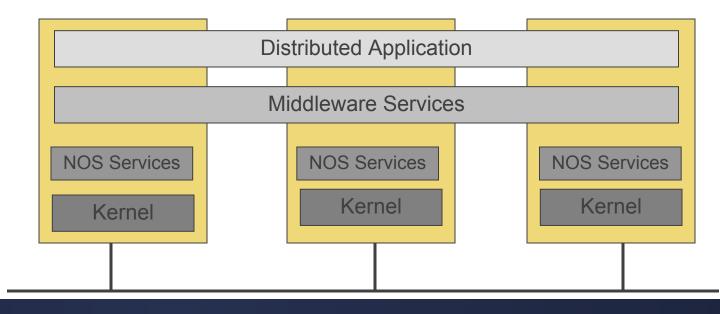
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# What is a Big Data?

#### **Data Volume**

- 44x increase from 2009 2020
- From 0.8 zettabytes to 35zb

Data volume is increasing exponentially

terabytes petabytes exabytes zettabytes

the amount of data stored by the average company today

#### **Data Variety**

- Semi structure Data
- Unstructured Data

#### **Data Velocity**

- Data is generated very fast and need to be processed very fast (Stream Computing)
- $\square$  Late decisions  $\square$  missing opportunities

#### **Data Veracity**

- ☐ Erroneous Data
- Missing Data

#### **Data Value**

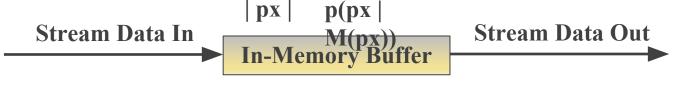
- Business Insight
- □ Inherent Pattern



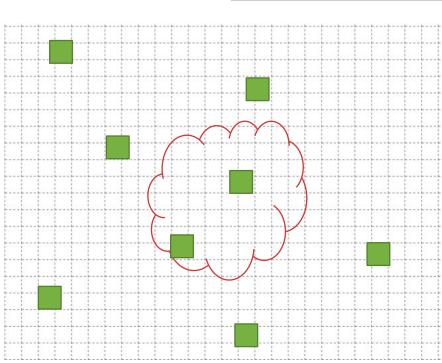
# Considering Velocity: Stream Computing

#### **Data Velocity**

- ☐ Data is generated very fast and need to be processed very fast (Stream Computing)
- □ Late decisions □ missing opportunities

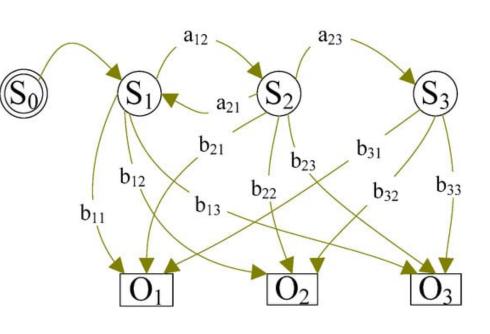






Given the Membership M(px) = 1 if px is inside the region

## Considering Veracity: Error Correction



Hidden Markov Model

#### Maximum Likelihood Estimation Algorithm

```
Algorithm:
function VITERBI(O, S, \pi, A, T,B): X
for each state s from 1 to N do
Viterbi[s,1] \leftarrow \pi_s * B_{s,o1}
Backpointer[s,1] \leftarrow 0
for each time step t from 2 to T do
      for each state s from 1 to N do
           Viterbi[s, t] \leftarrow m_{k=3}^{N} \times (Viterbi[k, t-1] *A_{k,s} *B_{s,o_{+}})
           Backpointer[s, t] ← argmax (Viterbi [k, t-1] * Ak, s * Bs, o+)
        End for
End for
```

# Challenges with Big Data

#### How to access Big Data?

Size = 200 TB with Disk access speed = 50 MB/s Time to just read = 4 million seconds = 46+ days

#### **Solution?**

**Distribute Data** 

#### **How to handle Node Failure?**

Let Node lifetime = 1000 days 1000 nodes cluster □ 1 failure/day 1M nodes cluster □ 1000 failures/day

#### **Solution**

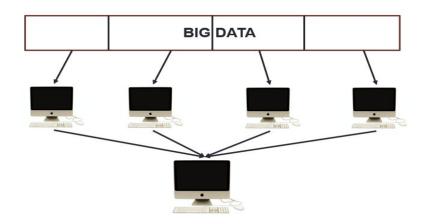
**Data Replication to 3 or more Nodes** 

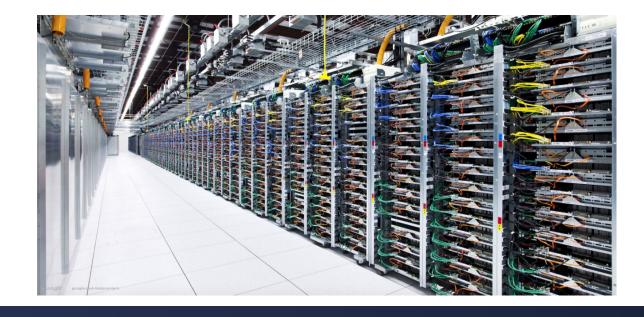
#### **Network Bottleneck**

Let Network bandwidth = 1gpps Moving 10 TB of data required 1

#### Solution

**Move Code to Data source** 





# Challenges with Big Data

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Let Node lifetime = 1000 days 1000 nodes cluster □ 1 failure/day 1M nodes cluster □ 1000 failures/day

#### **Solution**

**Data Replication to 2 or more Nodes** 

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#### Solution

**Move Code to Data source** 

#### Hadoop and Spark are one stop Solution

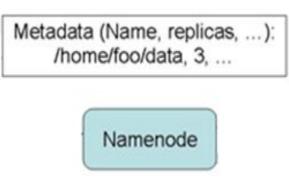
**Storage** 

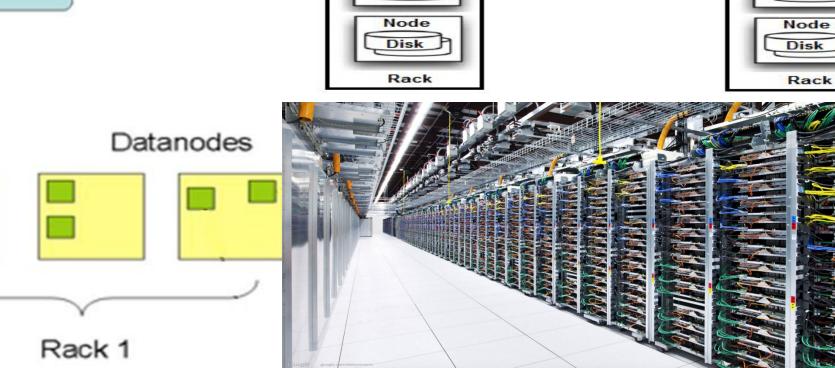
**Map Reduce** 

Parallel Processing

**Computing** 

## HDFS for Distributed Storage





Node

Disk

Node

Disk

Agreegation Switch

Commodity Hardware

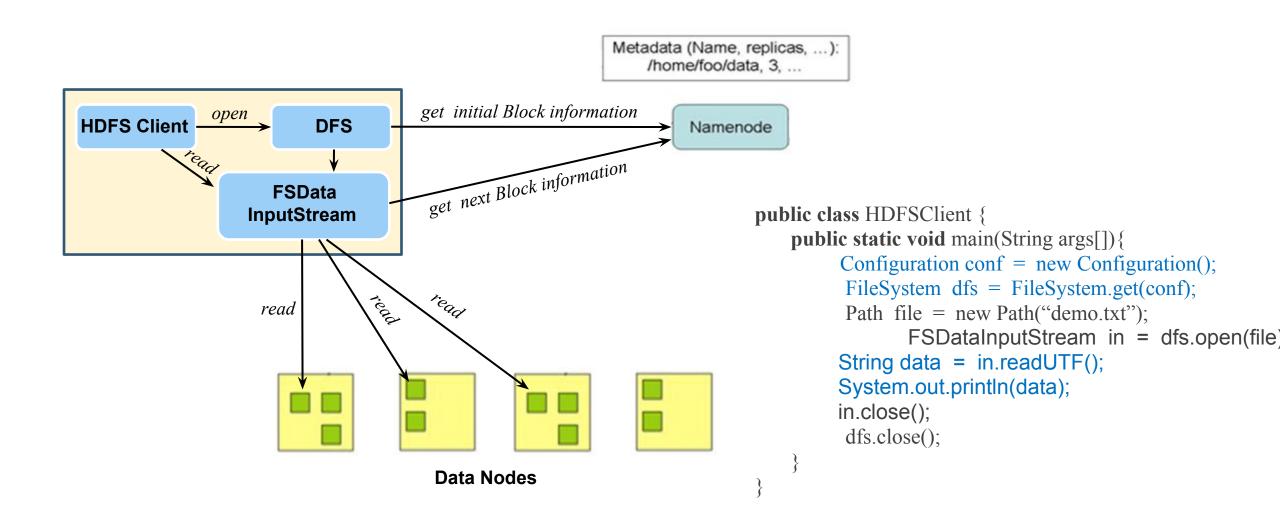
Node

Disk

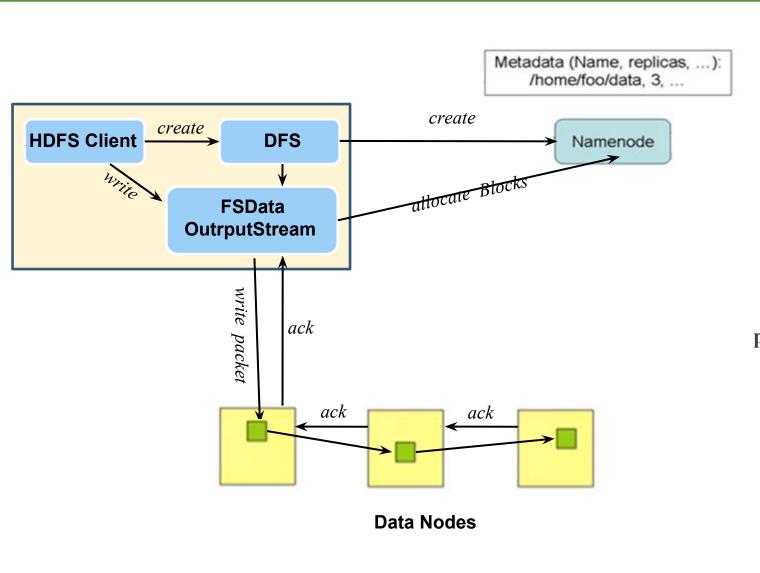
Node

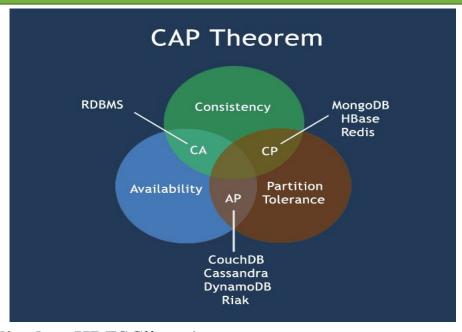
Disk

## **HDFS** Read Operation



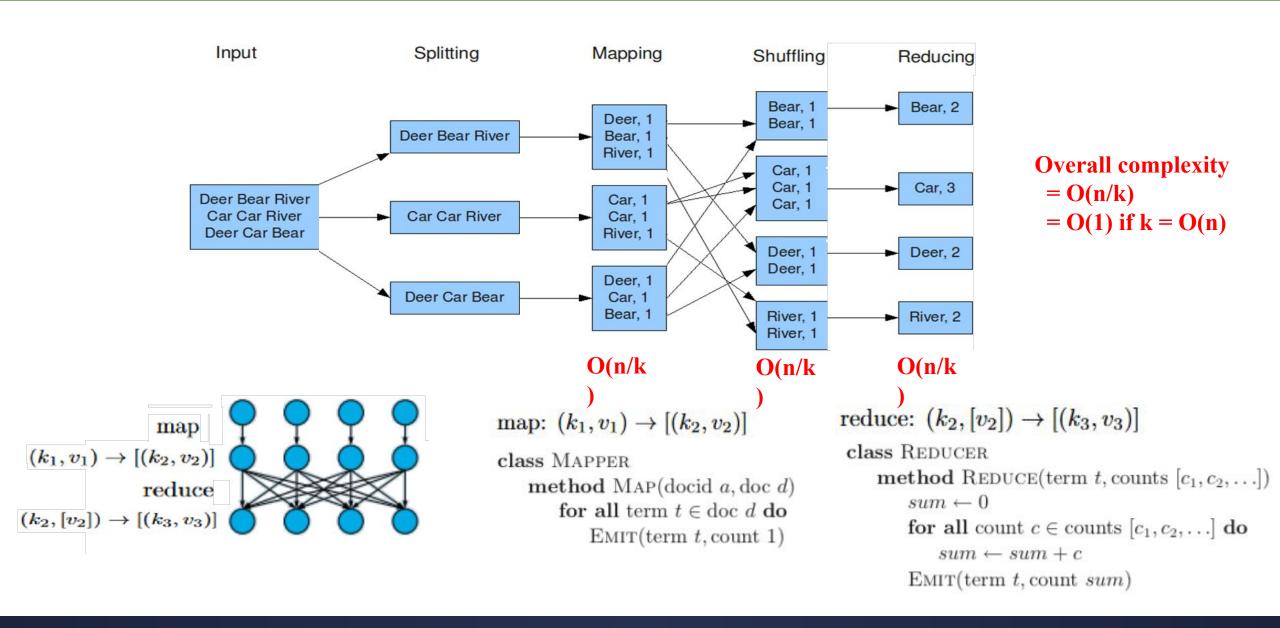
### **HDFS** Write Operation





```
public class HDFSClient {
   public static void main(String args[]) {
      Configuration conf = new Configuration();
      FileSystem dfs = FileSystem.get(conf);
      Path file = new Path("demo.txt");
            FSDataOutputStream out = dfs.create(file);
      out.writeUTF("Welcome to HDFS using Java");
      out.close();
      dfs.close();
}
```

# Map Reduce for Distributed Processing



## Data Analytics using Map Reduce: Matrix Addition

1	2	3
4	5	6
7	8	9

1		1
2	2	2
3	3	3







$$(1, \{1,2,3\})$$
  $(1, [\{1,2,3\},\{1,1,1\}])$ 



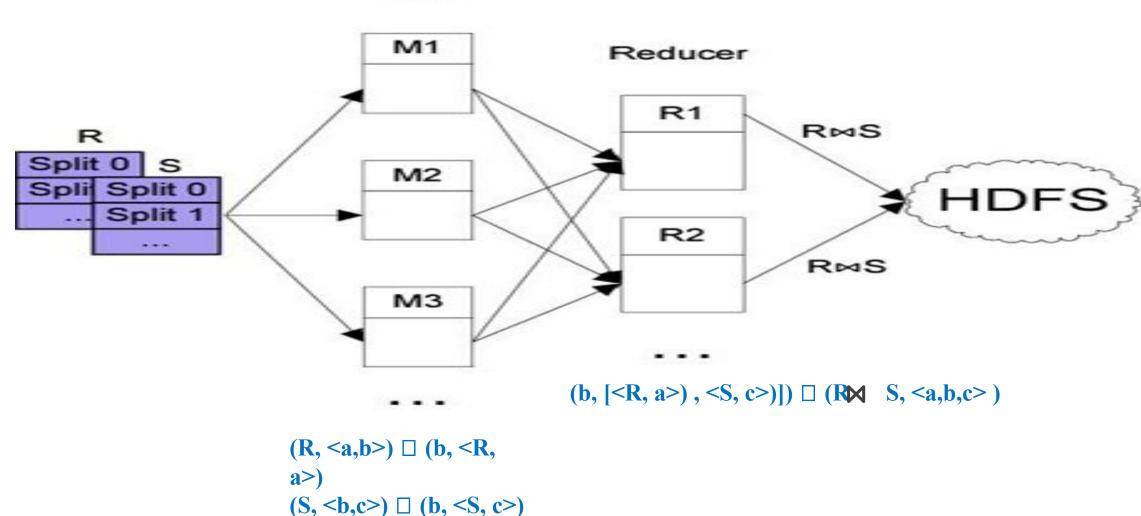
$$(2, \{2,2,2\})$$

{3,3,3})

#### Reduce

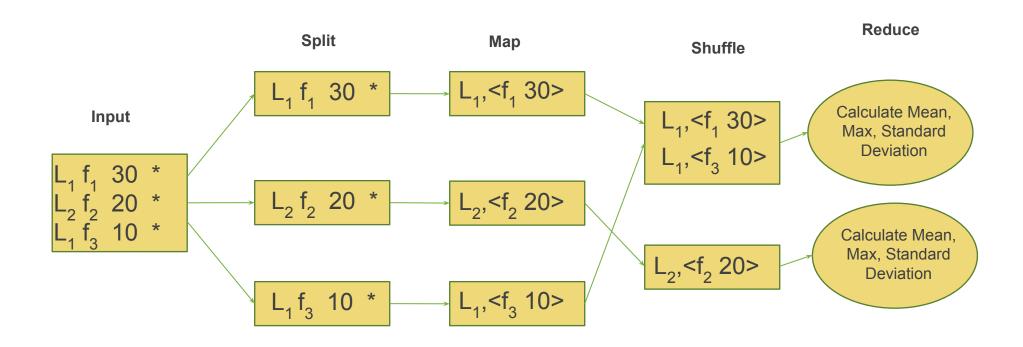
# Data Analytics using Map Reduce : $R(A,B) \bowtie S(B,C)$ ?

#### Mapper

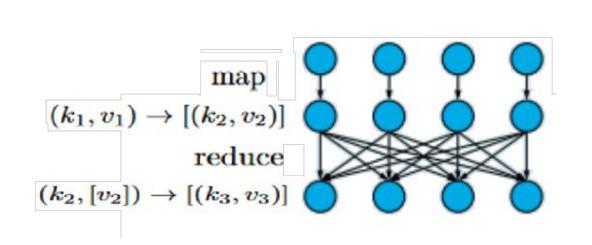


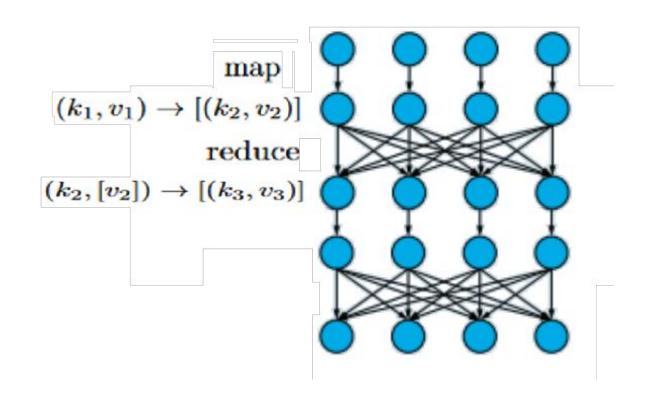
# Data Analytics using Map Reduce: Group By Query

Find Mean, Max and Standard Deviation of the sizes of Files downloaded from NASA Server through each link.

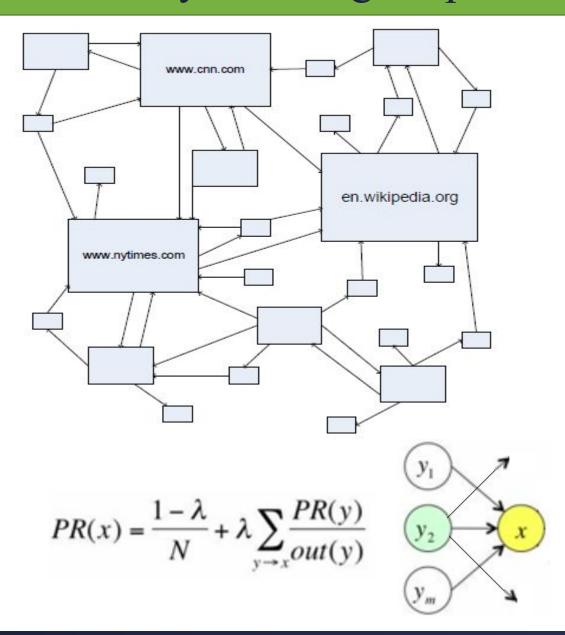


# Data Analytics using Map Reduce: Single Pass vs Iterative

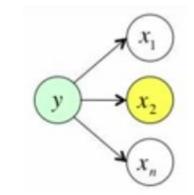


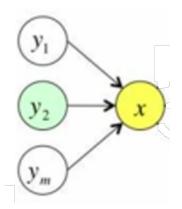


## Data Analytics using Map Reduce: Page Rank Calculation



Mapper: 
$$\langle y, \{x_1 \cdots x_n\} \rangle$$
  
for j=1...n: emit  $\langle x_j, \frac{PR(y)}{out(y)} \rangle$ 





**Reducer**: 
$$\left\langle x, \left\{ \frac{PR(y_1)}{out(y_1)}, \dots, \frac{PR(y_m)}{out(y_m)} \right\} \right\rangle$$

$$PR(x) = \frac{1 - \lambda}{N} + \lambda \sum_{y \to x} \frac{PR(y)}{out(y)}$$