



**International Symposium on Grids & Clouds 2011**

**The Cloud-Based Sensor Data  
Warehouse**

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# Outline

- **Introduction**
- **Cloud-Based Database – HBase**
- **Design of Sensor Data Structure**
- **Experiment**
- **Conclusion**

# Introduction

- The sensors have been widely used in **human observation, environment monitoring or biological activities**
- Sensor data with time characteristic
- Historic sensor data will require a large amount of data storage



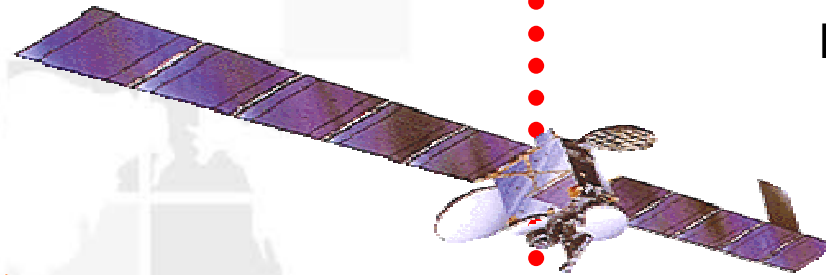


# Debris Flow Observation Station

Monitoring sensor

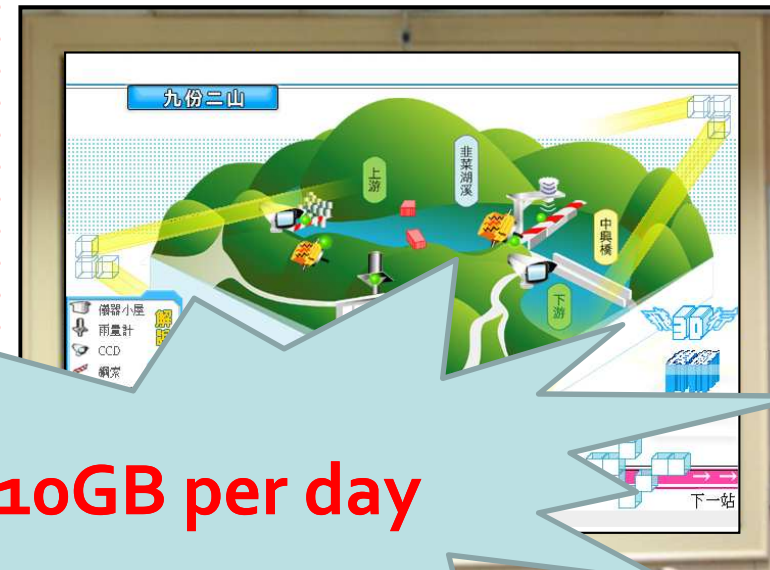


Data receiving



Satellite

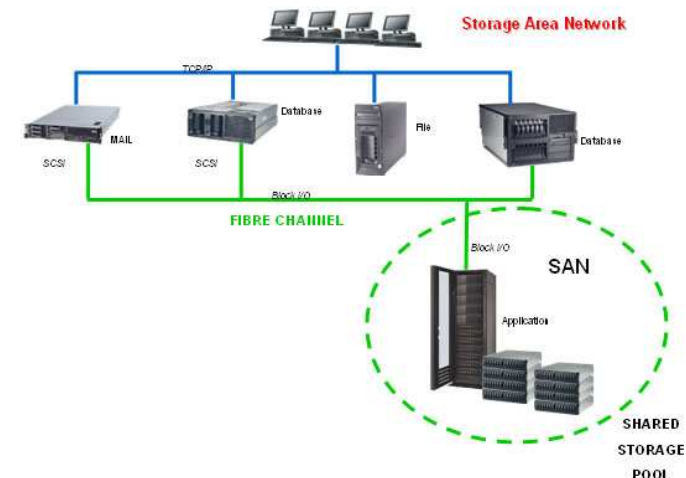
Data Center



10GB per day

# Introduction(cont'd)

- The RDBMS is the most widely used database
- Advantage: easy to manage data (like SQL supported, join...)
- Disadvantage: extremely expensive if huge amount of data storage (PB above) is needed



# Cloud-Based Database-HBase

## ➤ *What is HBase*

- is the Hadoop database
- is a distributed column-oriented
- is a distributed data store that can scale to 1,000s of commodity servers
- integrated into the Hadoop MapReduce framework

## ➤ *Benefits*

- High scalability
- High availability
- High performance



# Design of Sensor Data Structure

## ➤ Rowkey design

- HBase is Key-Value database
  - HBase only has a indexed key : RowKey
- *RowKey format:*
  - *<SensorID>\_<YYYYMMDDHHmmss>*

Ex. SensorID: Geophone001

Time: 2011/03/01 08:00:00

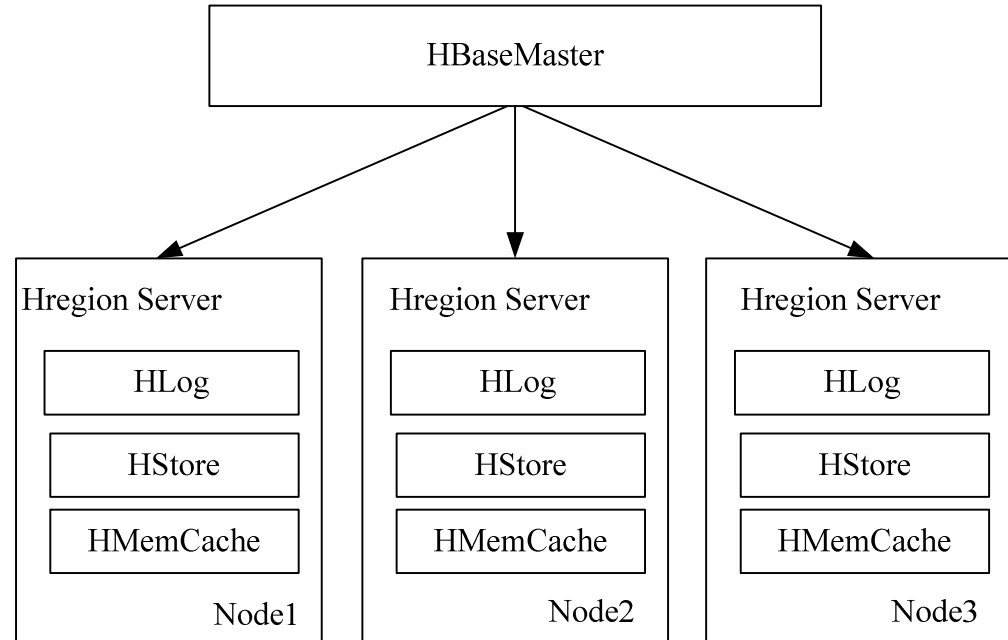
RowKey	Column: "Sensor:X"
"Geophone001_20110301080000"	"124.4"
RowKey	Column: "Sensor:Y"
"Geophone001_20110301080000"	"102.6"
RowKey	Column: "Sensor:Z"
"Geophone001_20110301080000"	"95.1"



# Experiment(1/5)

## Experimental Environment

- AMD Phenom 2.3G X 4, 4G RAM, 3 machines
- Ubuntu 9.10
- Hadoop 0.20.1
- HBase 0.20.3

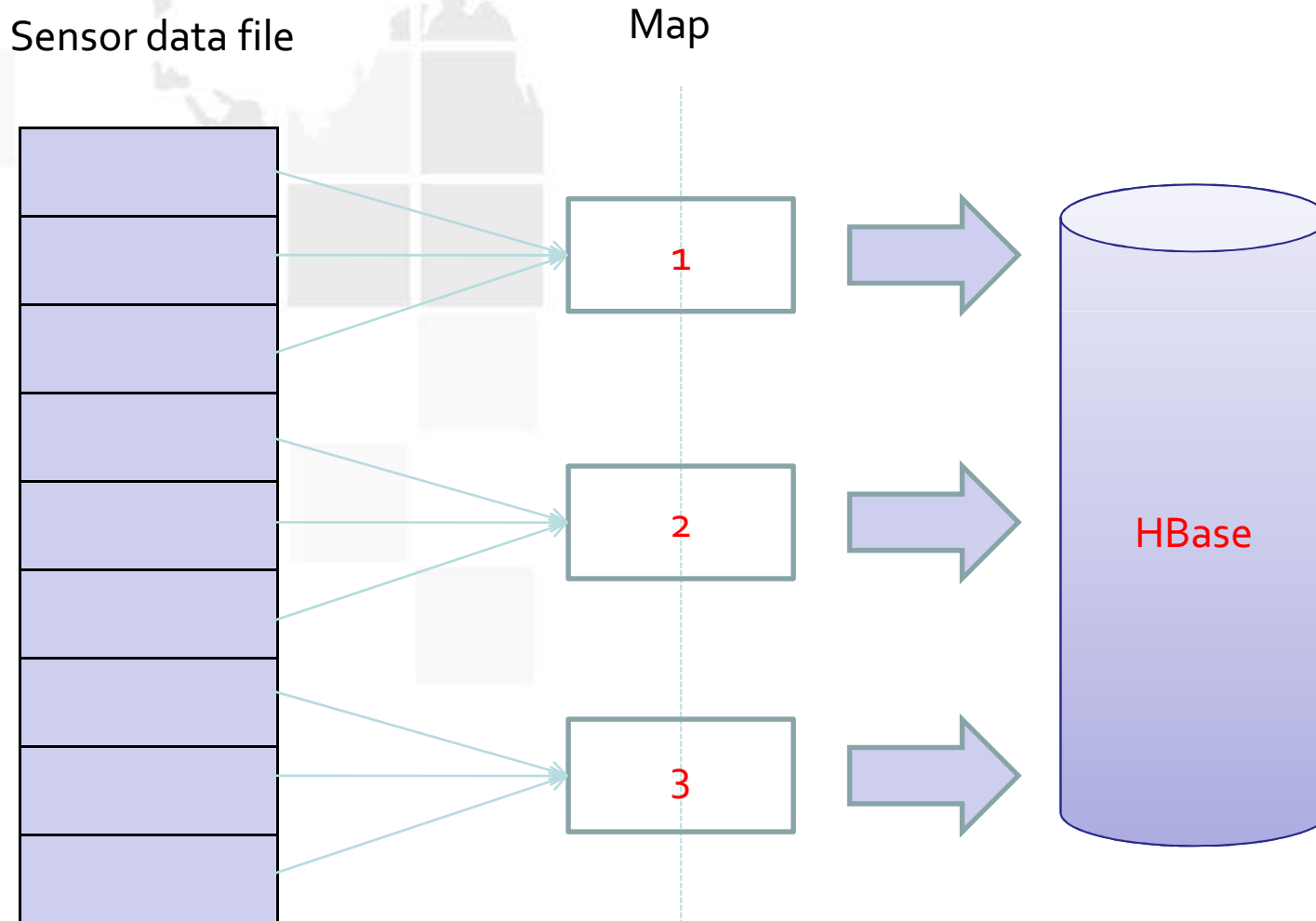






# Experiment(2/5)

**Imported 100 million records by MapReduce**





# Experiment(3/5)

Source data :13.6GB

Spent time: 6hr,3mins,5sec

Written 5000 records/sec

## Hadoop job\_201011121703\_0012 on cloud-a

User: hadoop

Job Name: SkyEye

Job File: [hdfs://cloud-a:9000/opt/hadoop-data/mapred/system/job\\_201011121703\\_0012/job.xml](hdfs://cloud-a:9000/opt/hadoop-data/mapred/system/job_201011121703_0012/job.xml)

Job Setup: [Successful](#)

Status: Succeeded

Started at: Thu Nov 18 10:28:40 CST 2010

Finished at: Thu Nov 18 16:31:46 CST 2010

Finished in: 6hrs, 3mins, 5sec

Job Cleanup: [Successful](#)

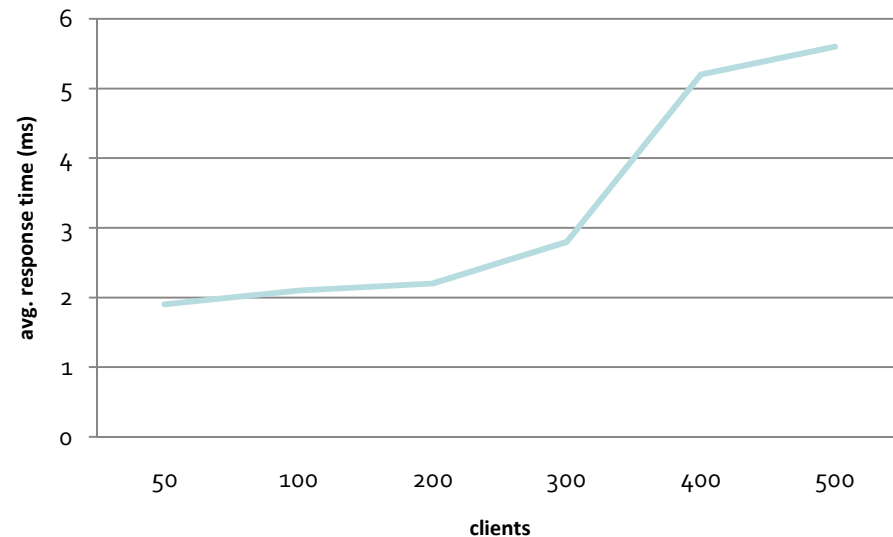
Kind	% Complete	Num Tasks	Pending	Running	Complete	Killed	<a href="#">Failed/Killed Task Attempts</a>
map	100.00%	243	0	0	243	0	0 / 3
<a href="#">reduce</a>	100.00%	0	0	0	0	0	0 / 0

	Counter	Map	Reduce	Total
Job Counters	Launched map tasks	0	0	246
	Data-local map tasks	0	0	246
FileSystemCounters	HDFS_BYTES_READ	14,632,152,164	0	14,632,152,164
Map-Reduce Framework	Map input records	102,638,374	0	102,638,374
	Spilled Records	0	0	0
	Map input bytes	14,631,529,419	0	14,631,529,419
	Map output records	0	0	0

# Experiment (4/5)

## ➤ *Reading performance*

- **simulate** 50, 100, 200, 300, 400, 500 client
- Read data randomly for 2 minutes
- Take average response time
  - 50 clients : 1.9ms
  - 500 clients: 5.6ms



# Experiment (5/5)

## ▶ *Writing performance*

▶ Writing 1000 records into HBase

▶ Number of Columns

▶ 1, 10, 100, 500

	# of columns			
Experiment	1	10	100	500
Write Columns/Sec	944	949	940	951
Write Rows/Sec	944	94.9	9.4	1.92

# Conclusion

- ▶ Sensor-produced data is calculated in GBs.
- ▶ If using distributed column-oriented database, e.g. HBase, data will be stored on separated machines for more efficient I/O
- ▶ From our experimental test results, the number of columns in the table will affect performance of data accessing. More columns a data row has, more data access time it will increase

## Conclusion(cont'd)

- It will increase the efficiency of database I/O if data can be converted to XML format and save XML data to single column
- We imported 100 million records into Hbase and simulated 50 to 500 clients for accessing the HBase at the same time. The average response time is less than 6ms.
- It proves that HBase is very suitable for sensor data warehouse



**Thanks for your listening.**