

# Big Data Analytics 3. Distributed File Systems

### Lars Schmidt-Thieme

Information Systems and Machine Learning Lab (ISMLL) Institute of Computer Science University of Hildesheim, Germany

original slides by Lucas Rego Drumond, ISMLL

Lars Schmidt-Thieme, Information Systems and Machine Learning Lab (ISMLL), University of Hildesheim, Germany

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# Outline



- 1. Why do we need a Distributed File System?
- 2. What is a Distributed File System?
- 3. GFS and HDFS
- 4. Hadoop Distributed File System (HDFS)

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# Outline



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# Why do we need a Distributed File System?







# Why do we need a Distributed File System?



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# Why do we need a Distributed File System?



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# Why do we need a Distributed File System?



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# Why do we need a Distributed File System?



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# Why do we need a Distributed File System?

We want to:

- ► Read large data fast
  - scalability: perform multiple parallel reads and writes



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  - ► fault tolerance: replication



# Why do we need a Distributed File System?

We want to:

- Read large data fast
  - scalability: perform multiple parallel reads and writes
- ► Have the files available even if one computer crashes
  - ► fault tolerance: replication
- ► Hide parallelization and distribution details
  - transparency: clients can access it like a local filesystem

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Big Data Analytics 2. What is a Distributed File System?

# What is a Distributed File System?





File Namespace

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Big Data Analytics 2. What is a Distributed File System?

# What is a Distributed File System?





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# Examples



- ► GFS (Google Inc.)
- ► HDFS (Apache Software Foundation)
- ► Ceph (Inktank, Red Hat)
- ► MooseFS (Core Technology / Gemius)
- Windows Distributed File System (DFS) (Microsoft)
- FhGFS (Fraunhofer)
- ► GlusterFS (Red Hat)
- Lustre
- ► Ibrix

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Components



A typical distributed filesystem contains the following components

► Clients - they interface with the user

Components



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- ► Clients they interface with the user
- Chunk nodes stores chunks of files

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Components



A typical distributed filesystem contains the following components

- ► Clients they interface with the user
- Chunk nodes stores chunks of files
- ► Master node stores which parts of each file are on which chunk node

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# Distributed File Systems

### The Google File System Architecture



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# Distributed File Systems - Storing files





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# Read Example







► Make sure each replica contains the same data all the time



- ► Make sure each replica contains the same data all the time
- One replica is designated to be the primary replica



- ► Make sure each replica contains the same data all the time
- One replica is designated to be the primary replica
- ► Master pings the nodes to make sure they are alive







Reads are very efficient operations

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- Reads are very efficient operations
- ► Writes are efficient if they are appends to the end of the file



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- ► Write in the middle of a file can be problematic



- ► Reads are very efficient operations
- ► Writes are efficient if they are appends to the end of the file
- ► Write in the middle of a file can be problematic
- ► Primary replica decides the order in which to make writes:
  - Data is always consistent in all replicas

#### 

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### GFS vs. HDFS



	HDFS	GFS
Chunk Size	128Mb	64Mb
Default replicas	2 Files (data and	3 Chunknodes
	generation stamp)	
Master	NameNode	GFS Master
Chunk Nodes	DataNode	Chunk Server

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# Google File System





Big Data Analytics 3. GFS and HDFS



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# Hadoop Overall Architecture





#### source: http://www.tutorialspoint.com/hadoop/hadoop\_introduction.htm

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# Hadoop hdfs Setup (1/3)

- 1. Prerequisites:
  - $\blacktriangleright$  several machines ( $\geq 1)$  with password-less ssh login
    - ▶ here: h0, h1, h2
    - test: on h0: ssh h1 brings up a shell on h1
  - Java installed on all machines
    - ► test: on h0: java -version and ssh h1 java -version shows version
  - hadoop downloaded and unpacked on all machines (http://hadoop.apache.org/releases.html; here for v2.7.2)
    - ▶ put hadoop-2.7.2/bin and hadoop-2.7.2/sbin in the path
    - or always use full path names to hadoop binaries
    - ► test: on h0: hadoop version and ssh h1 hadoop version shows version



# Hadoop hdfs Setup (2/3)



- create a configuration directory somewhere, say in /tmp/hadoop-conf
- set environment variable HADOOP\_CONF\_DIR accordingly
- put there two files, core-site.xml:

```
6 <value>hdfs://h0:54310</value>
```

```
7 </property>
```

```
8 </configuration>
```

### and hdfs-site.xml:

```
1 <?xml version="1.0" encoding="UTF-8"?>
```

```
2 <?xml-stylesheet type="text/xsl" href="configuration.xsl"?>
```

```
3 <configuration>
```

```
4 <property>
```

5 <name>dfs.replication</name>

```
6 <value>2</value>
```

```
7 </property>
```

```
8 </configuration>
```

### ► test: on h0: hdfs getconf -namenodes and ssh h1 hdfs getconf -namenodes yields h0.



# Hadoop hdfs Setup (3/3)



- 3. Start hdfs:
  - ► on h0:
    - hdfs namenode -format: format disk / create data structures
    - hdfs namenode: start namenode daemon
    - hdfs datanode: start datanode daemon
  - ▶ on h1 and h2:
    - hdfs datanode: start datanode daemon
  - ► test: on h0: hdfs dfsadmin -report shows h0, h1 and h2. alternatively, visit the web interface at http://h0:50070

Lars Schmidt-Thieme, Information Systems and Machine Learning Lab (ISMLL), University of Hildesheim, Germany

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# Hadoop hdfs Setup / Web Interface



Hadoop Overview Datanodes Datanode Volume Failures Snapshot Startup Progress Utilities -

#### Datanode Information

In operation

Node		Last contact	Admin State	Capacity	Used	Non DFS Used	Remaining	Blocks	Block pool used	Failed Volumes	Version
s1.ismll.c (147.172.	le:50010 223.225:50010)	2	In Service	449.78 GB	4 KB	135.81 GB	313.97 GB	0	4 KB (0%)	0	2.7.2
147.172.1 (147.172	223.14:50010 223.14:50010)	0	In Service	49.97 GB	4 KB	10.67 GB	39.31 GB	0	4 KB (0%)	0	2.7.2
Decomissioning											
Node	Last contact U	nder replicated t	llocks	Blocks with r		L h no live replicas li		Inder Replicated Blocks า files under construction			
Hadoop, :	2015.										

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hdfs Filesystem Interface hdfs dfs - $\langle command \rangle$  ...:

 df (*path*), e.g., df / show free disk space

hdfs Filesystem Interface hdfs dfs -<*command*> ...:

- df (*path*), e.g., df / show free disk space
- ► Is (path), e.g., ls / list directory



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# hdfs Filesystem Interface hdfs dfs -<*command*> ...:

- df (*path*), e.g., df / show free disk space
- ► Is (path), e.g., ls / list directory
- mkdir (*path*), e.g., mkdir /mydata create directory



#### 

hdfs Filesystem Interface hdfs dfs -<*command*> ...:

- df (*path*), e.g., df / show free disk space
- ► Is (path), e.g., ls / list directory
- mkdir (*path*), e.g., mkdir /mydata create directory
- ▶ put (*files*)...(*path*), e.g., put abc.csv /mydata upload files to hdfs

Lars Schmidt-Thieme, Information Systems and Machine Learning Lab (ISMLL), University of Hildesheim, Germany

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hdfs dfs - $\langle command \rangle$  ...:

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- ► Is (path), e.g., ls / list directory
- mkdir (*path*), e.g., mkdir /mydata create directory
- ▶ put (*files*)...(*path*), e.g., put abc.csv /mydata upload files to hdfs
- ► get (paths)...(dir), e.g., get /mydata/abc.csv abc-copy.csv download files from hdfs





hdfs dfs - $\langle command \rangle$  ...:

- df (*path*), e.g., df / show free disk space
- ► Is (path), e.g., ls / list directory
- mkdir (*path*), e.g., mkdir /mydata create directory
- ▶ put (*files*)...(*path*), e.g., put abc.csv /mydata upload files to hdfs
- ▶ get (paths)... (dir), e.g., get /mydata/abc.csv abc-copy.csv download files from hdfs
- ► cat (paths)..., e.g., cat /mydata/abc.csv pipe files from hdfs to stdout

Lars Schmidt-Thieme, Information Systems and Machine Learning Lab (ISMLL), University of Hildesheim, Germany

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hdfs dfs - $\langle command \rangle$  ...:

- df (*path*), e.g., df / show free disk space
- ► Is (path), e.g., ls / list directory
- mkdir (*path*), e.g., mkdir /mydata create directory
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- ▶ get (paths)... (dir), e.g., get /mydata/abc.csv abc-copy.csv download files from hdfs
- ► cat (paths)..., e.g., cat /mydata/abc.csv pipe files from hdfs to stdout
- ► mv (src)... (dest), e.g., mv /mydata/abc.csv /mydata/abc.txt move or rename files on hdfs





### hdfs dfs - $\langle \textit{command} \rangle$ . . . :

► cp (src)... (dest), e.g., cp /mydata/abc.csv /mydata/abc-copy.txt copy files on hdfs

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# hdfs dfs - $\langle command \rangle$ ...:

► cp (src)... (dest), e.g., cp /mydata/abc.csv /mydata/abc-copy.txt copy files on hdfs

URLs can be used as path names:

- ► / denotes the hdfs root.
- ► file:/// denotes the root of the local filesystem

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# hdfs Inspect File Health



### hdfs fsck $\langle path \rangle$ -files -blocks -locations

shows information about where (datanode) which parts (blocks) of a file are stored.

Connecting to namenode via http://lst-uni.ismll.de:50070/fsck?ugi=lst&files=1&blocks=1&locations=1&path=%2Files

Status: HEALTHY

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Total size: 1207864838 B		
Total dirs: 0		
Total files: 1		
Total symlinks:	0	
Total blocks (validated):	9 (avg. block size 134207204 B)	
Minimally replicated blocks:	9 (100.0 %)	
Over-replicated blocks:	0 (0.0 %)	
Under-replicated blocks:	0 (0.0 %)	
Mis-replicated blocks:	0 (0.0 %)	
Default replication factor:	2	
Average block replication:	2.0 《 다 논 《 쿱 논 《 쿱 논 《 쿱 논	ヨー つくぐ
SCorright Tolocks; Information Sys Missing replicas:	stems and Machine Learning Lab (ISMLL), University of Hildesheim, 0 (0.0 %)	Germany
Number of data-nodes:	3	23 / 23

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hdfs Inspect File Health



hdfs fsck  $\langle path \rangle$  -files -blocks -locations shows information about where (datanode) which parts (blocks) of a file are stored.

test.binarv

3.14:50011,DS-783f2c65-69ea-46ff-88ed-deebabf73158,DISK], DatanodeInfoWithStorage[147.172.223.14:50010,DS-e3b3aadb-3.14:50011,DS-783f2c65-69ea-46ff-88ed-deebabf73158,DISK], DatanodeInfoWithStorage[147.172.223.14:50010,DS-e3b3aadb-3.14:50010,DS-e3b3aadb-4f1c-49d1-872b-1879362f35c1,DISK], DatanodeInfoWithStorage[147.172.223.225:50010,DS-8aa58eb8 3.14:50010.DS-e3b3aadb-4f1c-49d1-872b-1879362f35c1.DISK], DatanodeInfoWithStorage[147.172.223.225:50010.DS-8aa58eb5 3.14:50010.DS-e3b3aadb-4f1c-49d1-872b-1879362f35c1,DISK], DatanodeInfoWithStorage[147.172.223.14:50011,DS-783f2c65-3.14:50010,DS-e3b3aadb-4f1c-49d1-872b-1879362f35c1,DISK], DatanodeInfoWithStorage[147.172.223.225:50010,DS-8aa58eb8 3.14:50011.DS-783f2c65-69ea-46ff-88ed-deebabf73158.DISK], DatanodeInfoWithStorage[147.172.223.225:50010.DS-8aa58eb 3.14:50010,DS-e3b3aadb-4f1c-49d1-872b-1879362f35c1,DISK], DatanodeInfoWithStorage[147.172.223.14:50011,DS-783f2c65-3.14:50010,DS-e3b3aadb-4f1c-49d1-872b-1879362f35c1,DISK], DatanodeInfoWithStorage[147.172.223.225:50010,DS-8aa58eb8

Dace