

The Google File System

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Looking Back



🕒 Classics

🕒 Sun NFS (1985)

🕒 CMU Andrew FS (1988)

🕒 stateless server

🕒 fully POSIX

🕒 stateful server

🕒 location independent

🕒 Fault Tolerant

CMU Coda

🕒 Parallel [HPC]

Google FS, Oracle Lustre, IBM zFS

🕒 Serverless [Peer-to-Peer]

xFS, Frangipani, Global FS, GPFS

Outline

- ⦿ Design Overview
- ⦿ System Interactions
- ⦿ Performance
- ⦿ Conclusion

Design Overview

- ⦿ Assumptions

- ⦿ Design Decisions

- ⦿ Example

- ⦿ Metadata

- ⦿ files stored as chunks
- ⦿ single master
- ⦿ no data caching
- ⦿ familiar, customizable API

- ⦿ in-memory DS
- ⦿ persistent DS

Design Overview

Assumptions

- ⦿ component failures are a norm rather than an exception.
- ⦿ multi-GB files are a common case.
- ⦿ mutation on files:
 - ⦿ random read|writes are practically non-existent.
 - ⦿ large concurrent|sequential appends are common.
 - ⦿ large streaming reads are common.
- ⦿ high bandwidth > low latency

optimize |

Design Overview

Design Decisions

- ⦿ files stored as chunks
- ⦿ reliability through replication | across 3+ chunk servers
- ⦿ single master
- ⦿ no data caching
- ⦿ familiar but customizable API

Design Decisions

Files stored as Chunks

- files divided into **64MB fixed-size** chunks
- 64-bit chunk handle to identify each chunk
- replicated on multiple chunk-servers (default 3)
- replication level is customizable across namespaces

Design Decisions

Chunk Size (64MB)

- ⦿ advantages:
 - ⦿ reduces interaction with the master!
 - ⦿ reduces network overhead
 - ⦿ likely to perform many OPs on a chunk
 - ⦿ reduces size of the stored metadata

Design Decisions

Chunk Size (64MB)

- ➊ issues:
 - ➋ internal fragmentation within chunk
 - ➌ use lazy space allocation
 - ➋ chunk-servers may become hotspots
 - ➌ use higher replication factor
 - ➌ stagger application start times
 - ➌ enable client-client communication (in future ...)

Design Decisions

Single Master

- centralization for simplicity!
- global knowledge helps in:
 - sophisticated chunk placement
 - making replication decisions
- master also maintains all FS metadata.
... but this does NOT complement with our learning from distributed systems!

Design Decisions

Single Master

solves:
scalability bottleneck

- ⦿ shadow masters: read-only access
- ⦿ minimize master involvement
 - ⦿ data never moves through the master
 - ⦿ only metadata moves and is also cached
 - ⦿ large chunk size
 - ⦿ chunk leases: to delegate data mutations.

|
solves:
single-point
of failure

Design Decisions

No Data Caching

- clients do **NOT** cache file data.
- working-set too large to be cached locally.
- simplifies the client; no cache-coherence issues.
- chunk-servers do **NOT** cache file data.
- linux buffer-cache already caches the data.

Design Decisions

FS Interface

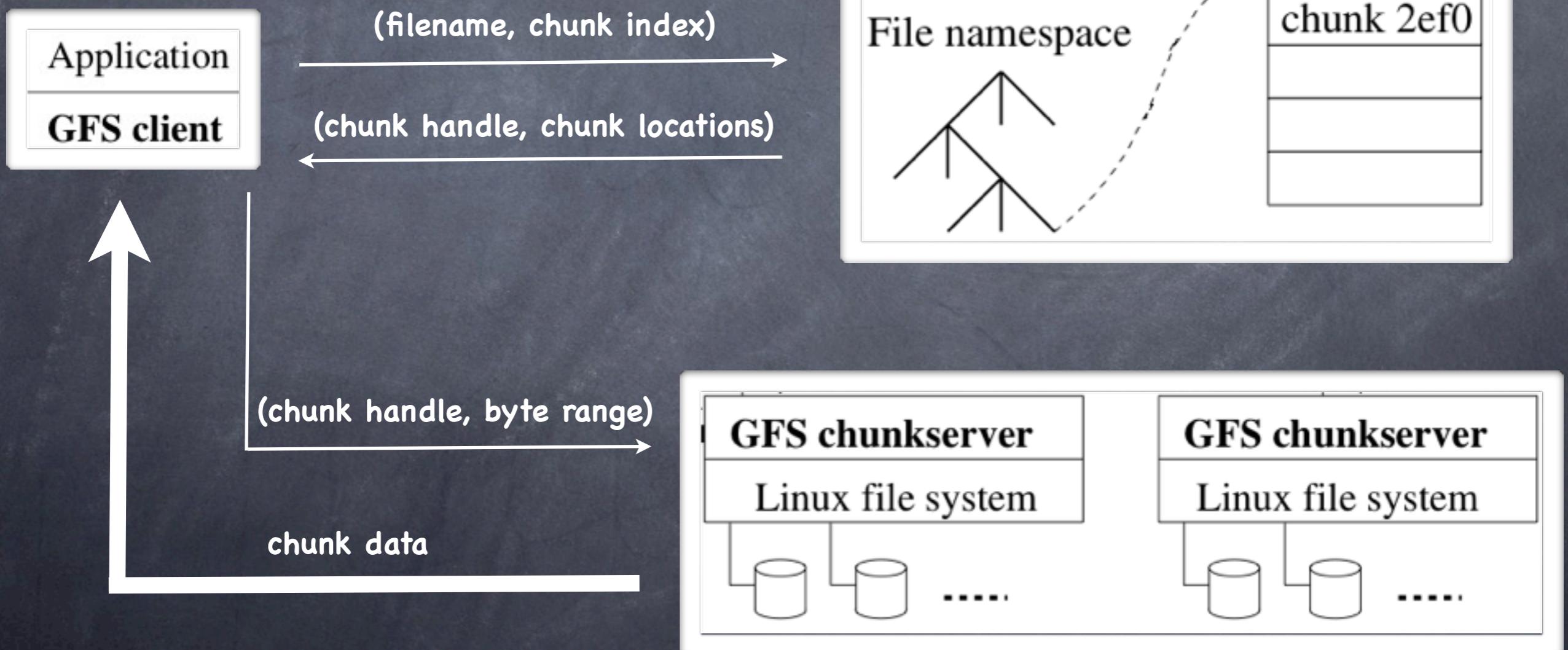
- ⦿ support for usual operations:
 - ⦿ create, delete, open, close, read, write.
- ⦿ snapshot operation:
 - ⦿ copy a file/directory tree at low cost.
- ⦿ record append operation:
 - ⦿ atomically and concurrently append data to a file from multiple clients.

Design Overview Example

cache as key:value

key=(filename, chunk index)

value=(chunk handle, chunk locations)



Design Overview

Metadata

- master stores three types of metadata:
 - file and chunk namespaces | persistent
 - file-to-chunk mappings |
 - chunk replica locations | in-memory

In-Memory Data Structures

- ➊ makes the master operations FAST!
- ➋ allows efficient periodic scan of the entire state
 - ➌ for chunk garbage collection
 - ➌ for re-replication on chunk-server failures
 - ➌ for load balancing by chunk migration
- ➌ capacity of the system limited by the master's memory size?
 - ➍ NO, a 64MB chunk needs less than 64B metadata.
 - ➍ that is, 640TB data needs less than 640MB memory!

Chunk Locations

- chunk locations do NOT have a persistent record
- to know the chunk locations, the master asks:
 - each chunk-server at startup.
or
 - whenever a chunk-server joins the cluster
- eliminates the issue of syncing master and chunk-server

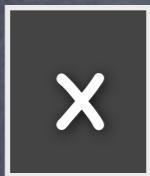
Operation Log

- defines the order of concurrent operations.
- replicated on multiple machines
- fast recovery using checkpoints (stored in B-trees)
- create checkpoints in separate thread

Design Overview | Metadata | Operation Log

Example

set of mutations
to the master



single master copy of
metadata is now corrupted!

have an operation log for
things you're going to write
before you write it

START
X
Y
END

Consistency Model

- **consistent**: all clients see the same data, regardless of which replica they read from
- **defined**: consistent AND clients see what the mutation has written in its entirety

Guarantees by GFS

- after a sequence of successful mutations, the region is guaranteed to be defined
 - by mutating in same order on all replicas
 - by chunk versioning to detect stale replicas
- data corruption is detected by checksums.

Implications for Apps

- single writer appends
 - writer periodically checkpoints the writes
 - readers ONLY process region upto last checkpoint
- multiple writer appends
 - writers use write-at-least-once semantics
 - readers discard paddings using checksums
 - readers discard duplicates using unique IDs

System Interactions

- Chunk Leases and Mutation Order

consistent

- Data and Control Flow

- Special Operations

- atomic record append
- snapshot

defined

- Master Operations

- namespace management and locking
- replica placement
- creation, re-replication, rebalancing
- garbage collection
- stale replica detection

System Interactions

Chunk Leases

- used to minimize the master involvement.
- primary replica: one granted with a chunk lease
 - it picks a serial order of mutation.
 - with initial timeout of 60s (can be extended)
 - can be revoked by the master

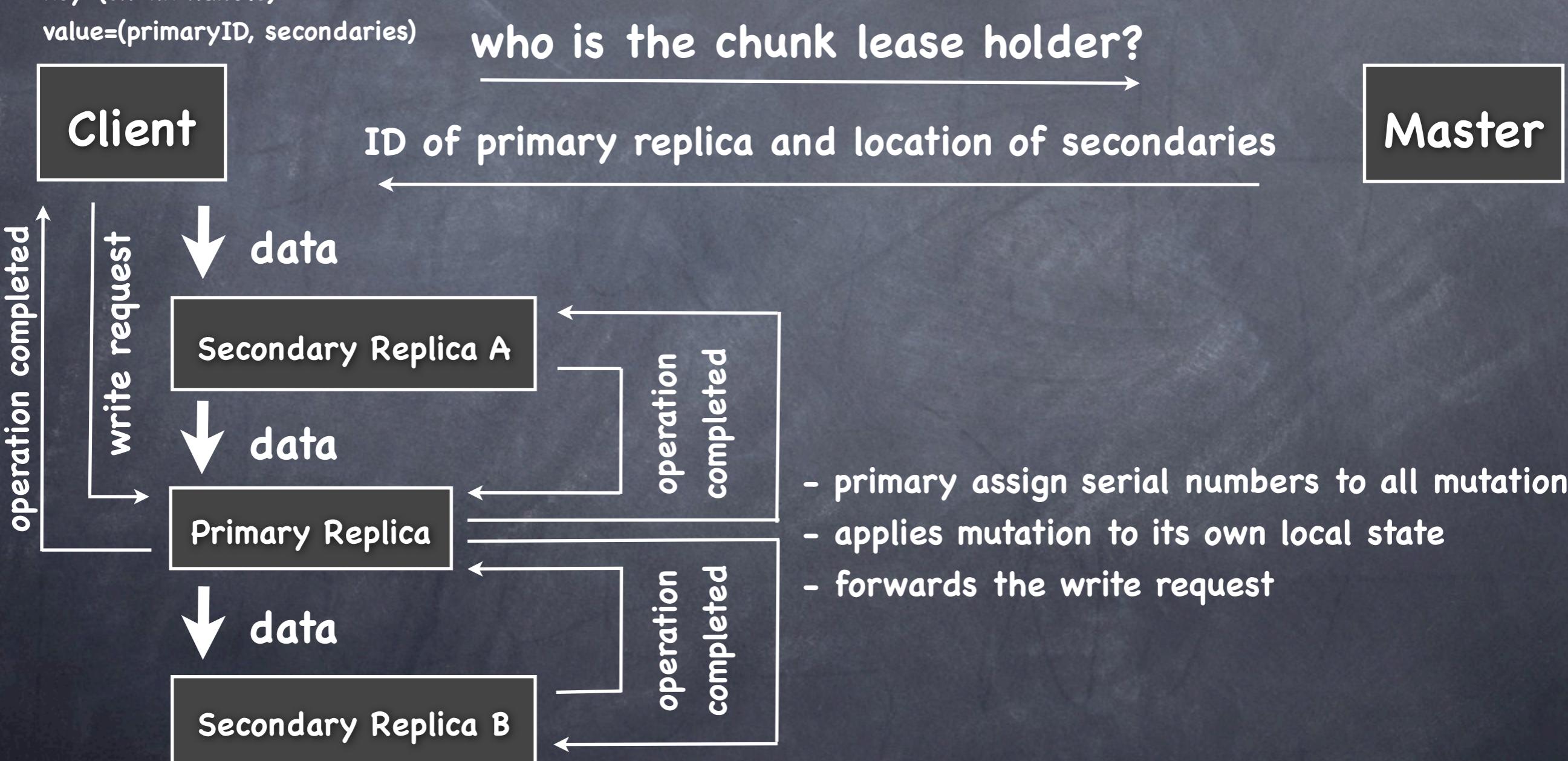
System Interactions

Mutation Order

cache as key:value

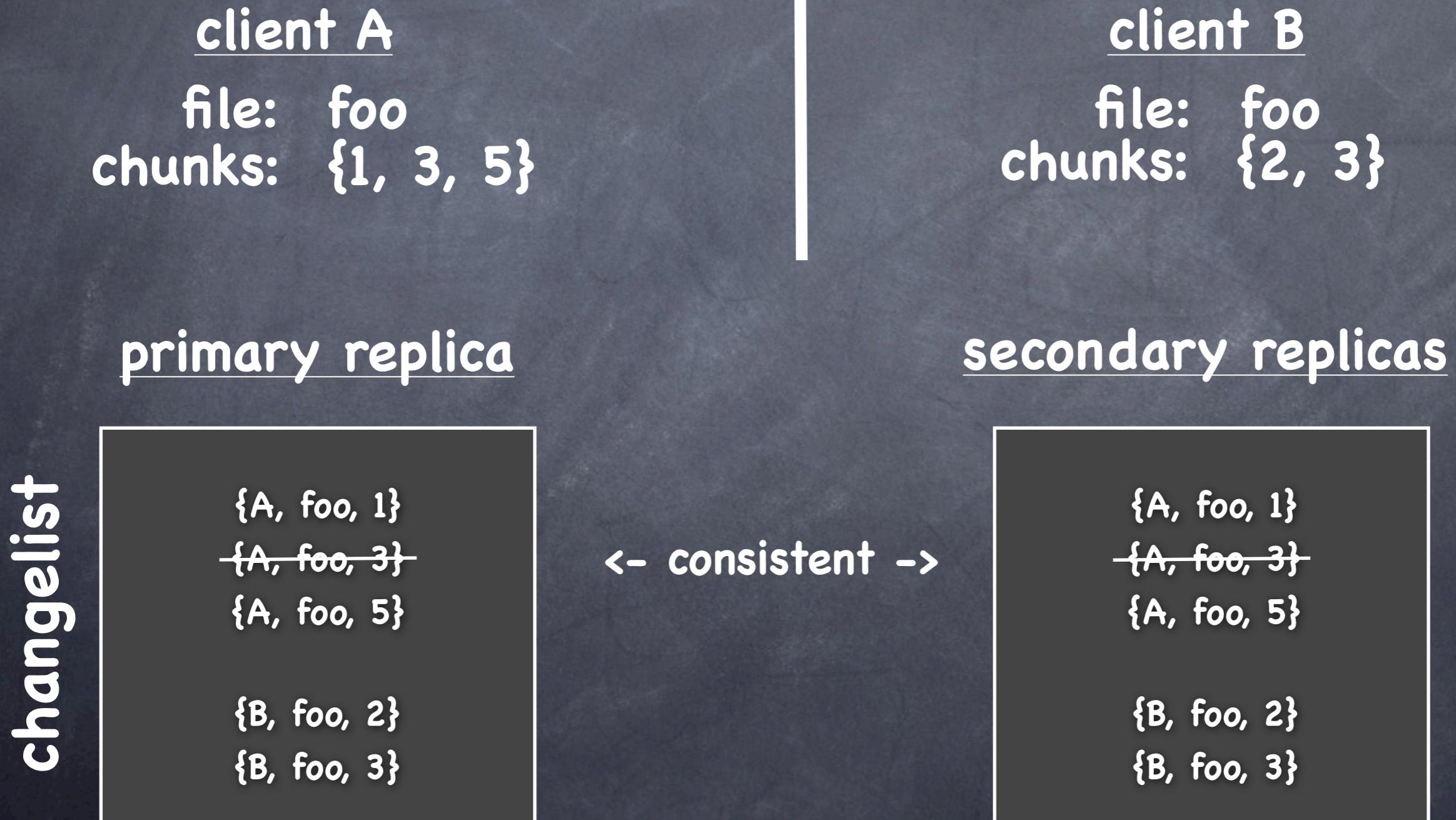
key=(chunk handle)

value=(primaryID, secondaries)



- primary assign serial numbers to all mutations
- applies mutation to its own local state
- forwards the write request

System Interactions | Mutation Order Example



System Interactions

Data and Control Flow

- decouple data flow and control flow
- control flow: client → primary → secondary
- data flow: pushed linearly along carefully picked chain of chunk-servers
 - forward to the closest first
 - distances estimated from IP addresses
 - use pipelining to exploit full-duplex links

atomic record append

- ⦿ traditional concurrent writes require a distributed lock manager
- ⦿ this operation ensures concurrent appends are serializable
 - ⦿ client only specifies the data
 - ⦿ primary lease chooses a mutation order
- ⦿ if a record-append fails at any replica, client retries
 - ⦿ some replicas may have duplicates
 - ⦿ GFS does NOT guarantee replicas are byte wise identical
 - ⦿ GFS ONLY guarantees data is written at-least once atomically

atomic record append

- concurrent writes require a distributed lock manager
- concurrent appends to same file appear side-by-side

record A

record B

- does NOT guarantee order of concurrent appends

record B

record A

- does guarantee writes within a record are NOT interleaved

record A
(part I)

record B
(part I)

record A
(part II)

record B
(part II)

System Interactions | Special Operations

Snapshots

- makes a copy of a file/directory tree instantaneously
- uses standard copy-on-write scheme | inspired from AFS
- steps of master operation:
 - revokes outstanding leases on files
 - logs the operation to disk
 - duplicates the in-memory metadata state
 - duplicates the chunks ONLY on first write request

Master Operations

- ⦿ Namespace Management and Locking
- ⦿ Policies
- ⦿ Garbage Collection
- ⦿ State Replica Detection

Master Operation Namespace Management

- ⦿ no per-directory data structure | unlike UNIX FS
- ⦿ no file/directory aliasing
- ⦿ namespace representation using a lookup table
 - ⦿ maps full pathnames to metadata
 - ⦿ using prefix-compression for efficient storage

Master Operation

Namespace Locking

- ability to lock over regions of namespaces: to allow multiple master operations to be active at once.
- example:
 - snapshot: /home/user to /save/user
 - write lock: /save/user and /home/user
 - create: /home/user/foo
 - read lock: /home and /home/user
- locks acquired in a consistent total order to prevent deadlocks

	read	write
read	TRUE	FALSE
write	FALSE	FALSE

Master Operation

Policies | Replica Creation

- place new replicas on chunk-servers with below average disk space utilization
- limit number of recent creations on chunk-servers
- spread replicas of chunks across racks

Master Operation

Policies | Re-replication

- replicate chunks further away from their replication goal FIRST
- replicate chunks for live files FIRST
- replicate chunks blocking clients FIRST

Master Operation Garbage Collection

- ⦿ lazy reclamation
- ⦿ master logs the deletion immediately
- ⦿ the storage is NOT reclaimed immediately
 - ⦿ renamed to hidden name with deletion stamp
 - ⦿ removed 3 days later (configurable)
 - ⦿ can be read/undeleted during this time

Master Operation | Garbage Collection

Steps of Operations

- ⦿ scan the FS namespace: remove hidden files
- ⦿ remove file-chunk mapping from in-memory metadata
- ⦿ scan the chunk namespace: identify orphaned chunks
- ⦿ remove the metadata for orphaned chunks
- ⦿ send message to chunk-servers to delete chunks

Master Operation | Garbage Collection Advantages

- simple and reliable
 - chunk creation may fail
 - replica deletion messages maybe lost
- done in batches and cost is amortized
- ONLY done when the master is relatively free
- safety net against accidental, irreversible deletion

Master Operation | Garbage Collection

Disadvantages

- deletion delay hinders when storage is tight
- different reclamation policy for separate namespaces
- cannot reuse the storage right away
- delete twice: expedites storage reclamation

Master Operation

Stale Replica Detection

- stale replica: when chunk-server fails and misses mutation to a chunk while it's down
- chunk version numbers to detect stale replicas
- reclaimed in a regular garbage collection

Fault Tolerance and Diagnosis

- ⦿ High Availability
- ⦿ Data Integrity
- ⦿ Diagnostic Tools

Fault Tolerance and Diagnosis

High Availability

- ⦿ Fast Recovery
- ⦿ Chunk Replication
- ⦿ Master Replication

Fault Tolerance and Diagnosis | High Availability

Fast Recovery

- designed to restore state and start in seconds
- no distinction: normal and abnormal termination

Fault Tolerance and Diagnosis | High Availability

Chunk Replication

- different replication levels for separate namespaces
- keep each chunk ALWAYS fully replicated
 - on chunk-server failure
 - on replica corruption

Fault Tolerance and Diagnosis | High Availability

Master Replication

- operation log and checkpoints are replicated
- on master failure:
 - monitoring infrastructure outside GFS starts a new master process
 - shadow masters: read-only access to FS
 - enhance read availability

Fault Tolerance and Diagnosis

Data Integrity

- checksums to detect data corruption
- chunk(64MB): 64KB blocks + 32bit checksum
- checksum verification prevents error propagation
- optimized for appends: incremental checksum update
- little effect on performance:
 - normal reads span multiple blocks anyway
 - reads aligned at checksum block boundaries
 - checksum calculations can be overlapped with IO

Fault Tolerance and Diagnosis

Diagnostic Tools

- ⦿ diagnostic logging on:
 - ⦿ chunk-servers going up and down
 - ⦿ RPC requests and replies
- ⦿ helps reconstruct history and diagnose problem
- ⦿ serve as traces for load testing and performance analysis
- ⦿ minimal performance impact: written sequentially and asynchronously

Performance

master metadata:
can fit in RAM

Cluster	A	B
Chuckservers	342	227
Available disk space	72 TB	180 TB
Used disk space	55 TB	155 TB
Number of Files	735 k	737 k
Number of Dead files	22 k	232 k
Number of Chunks	992 k	1550 k
Metadata at chunkservers	13 GB	21 GB
Metadata at master	48 MB	60 MB

| lot of occupied
disk space

| CS metadata:
well under 1%

Cluster	A	B
Read rate (last minute)	583 MB/s	380 MB/s
Read rate (last hour)	562 MB/s	384 MB/s
Read rate (since restart)	589 MB/s	49 MB/s
Write rate (last minute)	1 MB/s	101 MB/s
Write rate (last hour)	2 MB/s	117 MB/s
Write rate (since restart)	25 MB/s	13 MB/s
Master ops (last minute)	325 Ops/s	533 Ops/s
Master ops (last hour)	381 Ops/s	518 Ops/s
Master ops (since restart)	202 Ops/s	347 Ops/s

| efficient usage
of resources

Conclusions

- demonstrates how to support large scale processing workloads on commodity hardware
- designed to tolerate frequent h|w failures
- optimized for huge files: appends and streaming reads
- relax consistency model and extended FS interface
- simple solutions: single master are good enough

References

- Sanjay Ghemawat, Howard Gobioff, and Shun-Tak Leung. 2003. The Google file system. In Proceedings of the nineteenth ACM symposium on Operating systems principles (SOSP '03). ACM, New York, NY, USA, 29–43.