50th International Conference on Very Large Databases

# When Amnesia Strikes: Understanding and Reproducing Data Loss Bugs with Fault Injection

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INESC TEC University of Minho Jepsen\*







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- Storage systems use caches to avoid disk accesses.
- Cached data is **lost** in the event of a power or OS failure.



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## Trade-off between performance and reliability



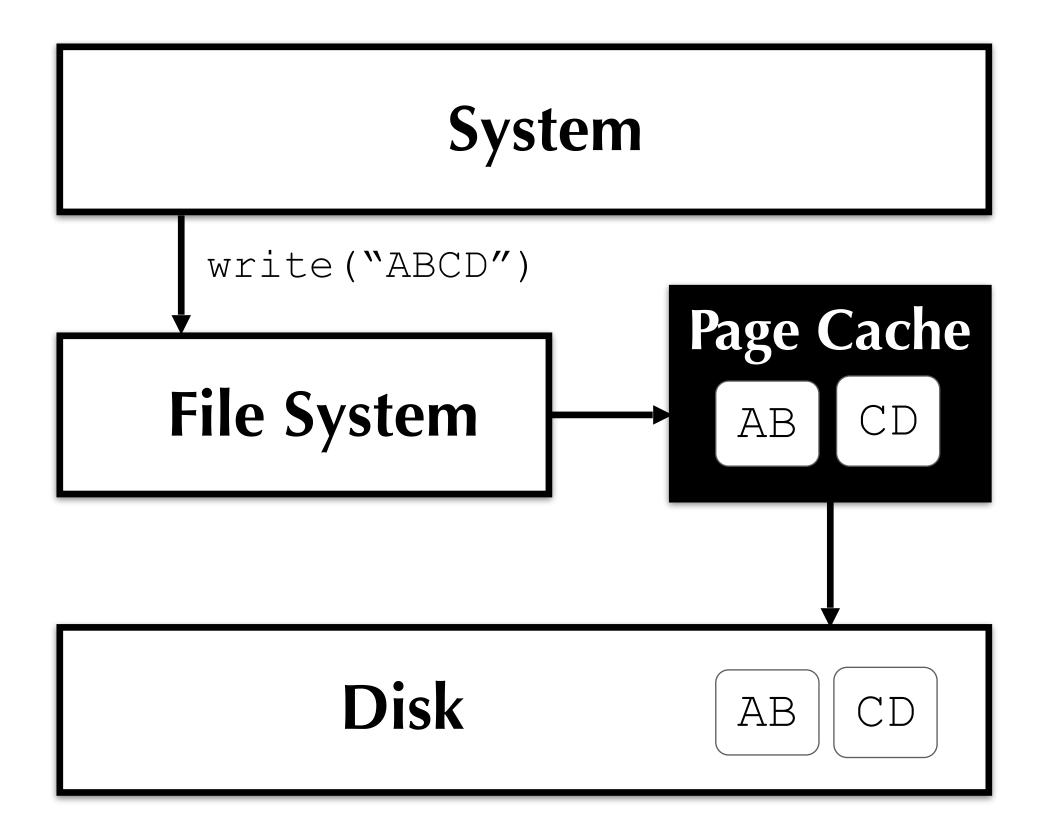


File System

## Disk

Page Cache



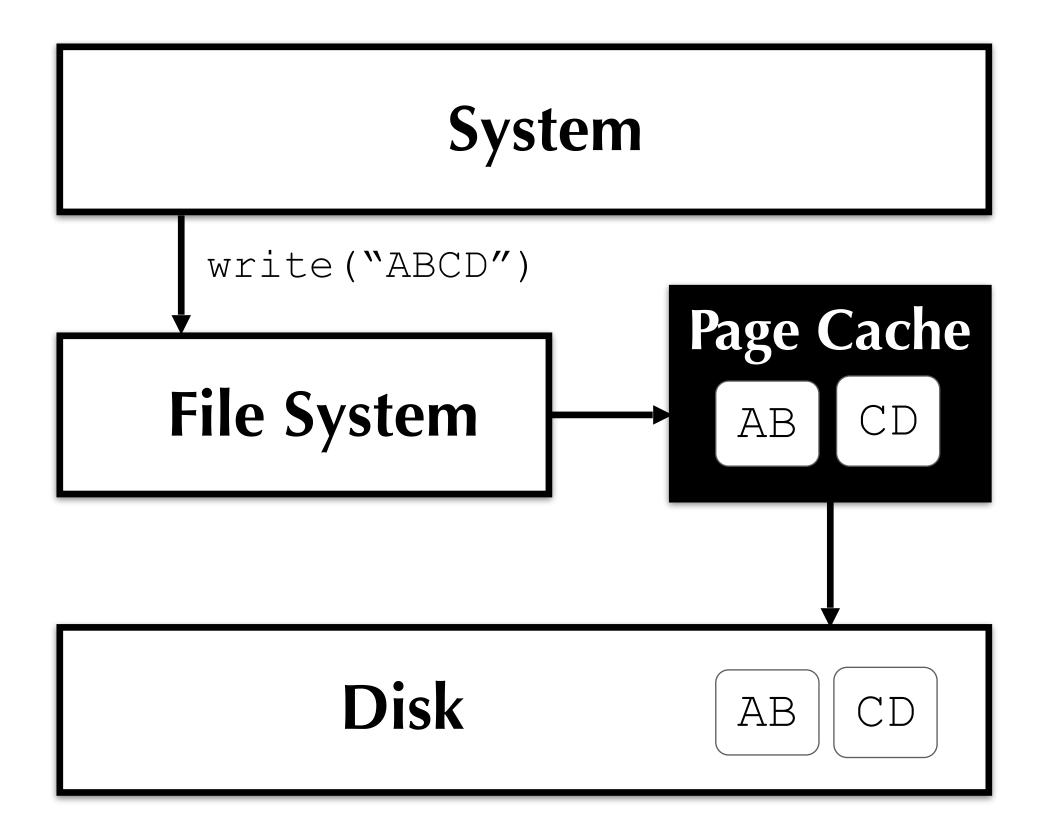


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## Cached data is flushed to disk by:

- OS pressure
- fsync() call





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Writes can be asynchronous



3

• Writes can be persisted **partially** and **out-of-order**.

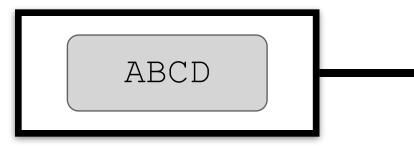
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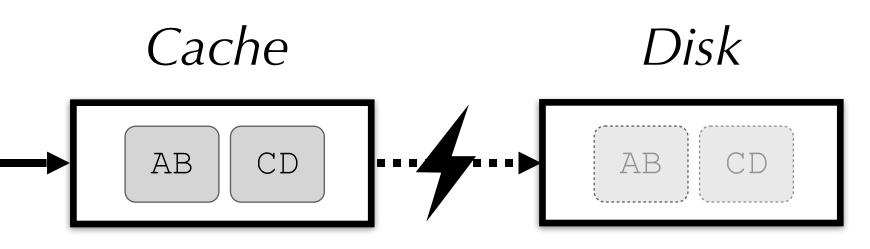


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Database

Lost write





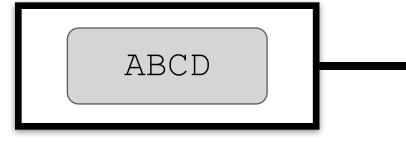
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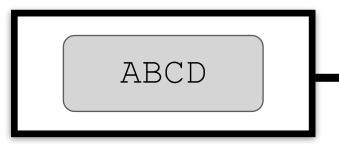
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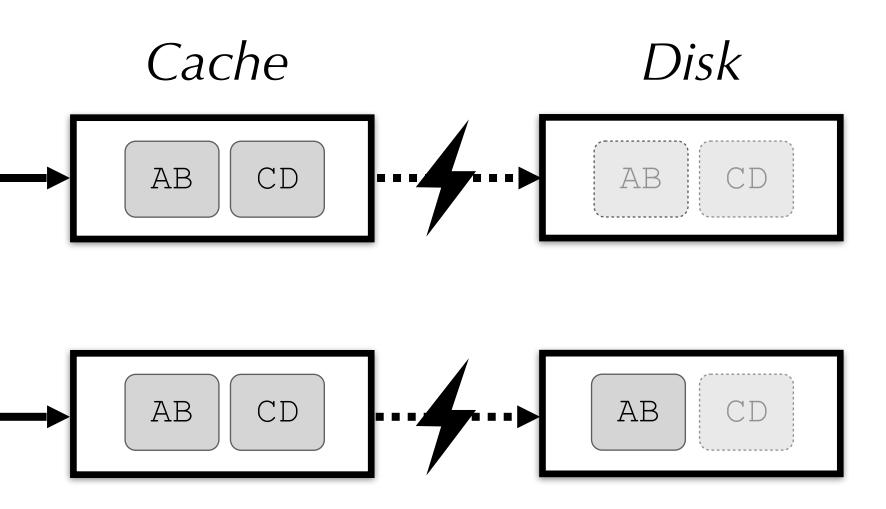
Lost write



Linear torn write

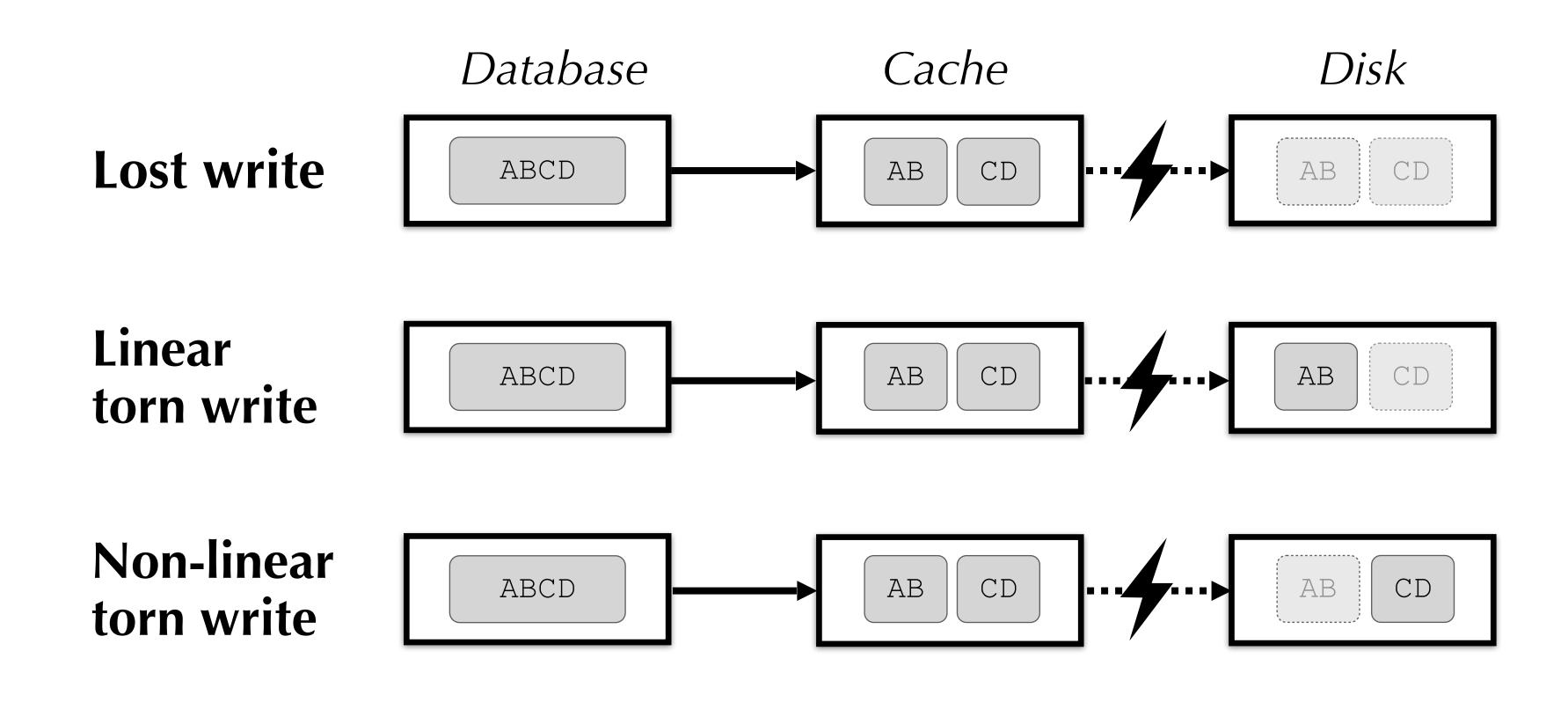


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# Crash consistency bugs Study

- Study of 12 reported crash consistency bugs:
  - symptoms reported
  - **reproduction** steps
  - applied/suggested **fixes**
- Studied systems:



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## Lightning Network Daemon ZooKeeper



• Known bugs



- Known bugs
- Ambiguous bugs



- Known bugs
- Ambiguous bugs

## "modify the leveldb source code" "within the next 5 seconds, switch off the machine by pulling the cord"

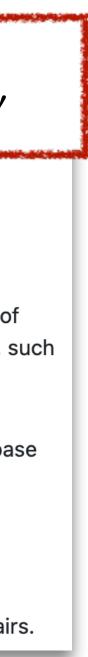
#### What steps will reproduce the problem?

- 1. Use a Linux machine with ext4 (default mount options). Modify the leveldb source code so that the background compaction thread does a big sleep() call before updating the MANIFEST file.
- 2. Create a LevelDB database on a partition that is unused by other applications. Design a workload that issues a lot of asynchronous Put() requests, till the current log file gets filled up, and then issues one synchronous Put() request, such that the request goes to a new log file. Run the workload on the created database.
- 3. As soon as the workload finishes running, within the next 5 seconds (I think you can actually do within the next 30 seconds), switch off the machine by pulling the chord. After rebooting the machine, make LevelDB open the database and list all key-value pairs in the database.

#### What is the expected output? What do you see instead?

Expected output: Leveldb either lists all the key-value pairs, including that of the last synchronous Put() operation.

Observed output: Leveldb does list the pair corresponding to the last synchronous operation, but does not list older pairs.





- Known bugs
- Ambiguous bugs

## "modify the leveldb source code" "within the next 5 seconds, switch off the machine by pulling the cord"

## "After the reboot, etcd was unable to read the WAL due to crc mismatch"

I am using etcd as a library embedded inside an application. Etcd version is 3.3.0+git, commit hash 688043a

One node had a hard reboot. Node is running on bare metal, ubuntu 16.04. Data directory resides in an lvm partition. After the reboot, etcd was unable to read the WAL due to crc mismatch.

walpb: crc mismatch, can only repair unexpected EOF

I recovered the system by deleting the etcd data directory and then adding that node back to the cluster.

I ran the last WAL (I took a backup of them before deleting the data directory) through od and it showed many of the final entries were zeroes.

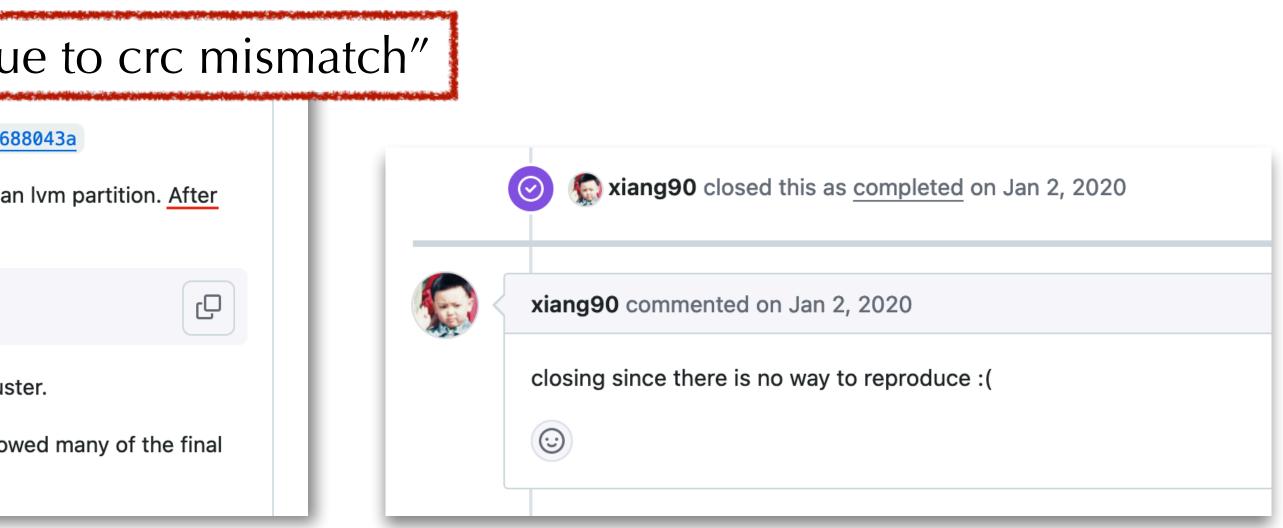
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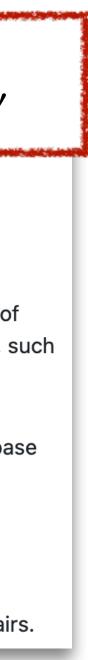
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# Study findings Reproducibility

- Modification of systems' codebases (e.g., add sleep() call)
- Specific and complex deployments (e.g., restore from cold backup)
- Lack of means to validate fixes

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• Bugs are time-sensitive (e.g., switching off machines in specific time windows)



# **Study findings Understanding ambiguous bugs**

- Sometimes dismissed by developers
- Hard to associate reported errors with type of fault
- Developers lean on external tools (e.g., strace)
- Data loss and corruption are common symptoms
- Similar error messages and affected files across different systems (e.g., checksum errors and log files, respectively)



# Goals

X code changes

- data that can be lost or torn.

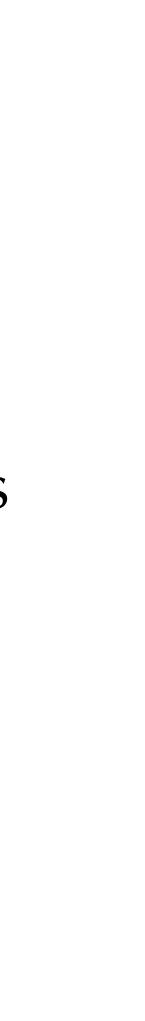
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## • Non-intrusive and automated way to reproduce storage-level data loss bugs.

X power off machine X counting time X specific setup

• Provides insightful information for understanding the **root cause of bugs**, such as

• Users can use it directly or it can be used as a module of other testing systems.





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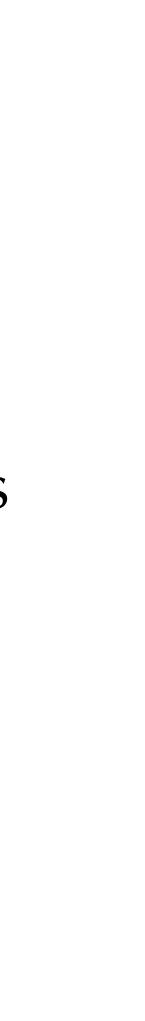
## LazyFS

Software-based tool for injecting lost and torn write faults at the file system level.

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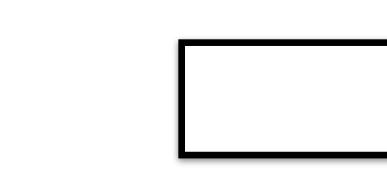
Lazy	FS
System	overview

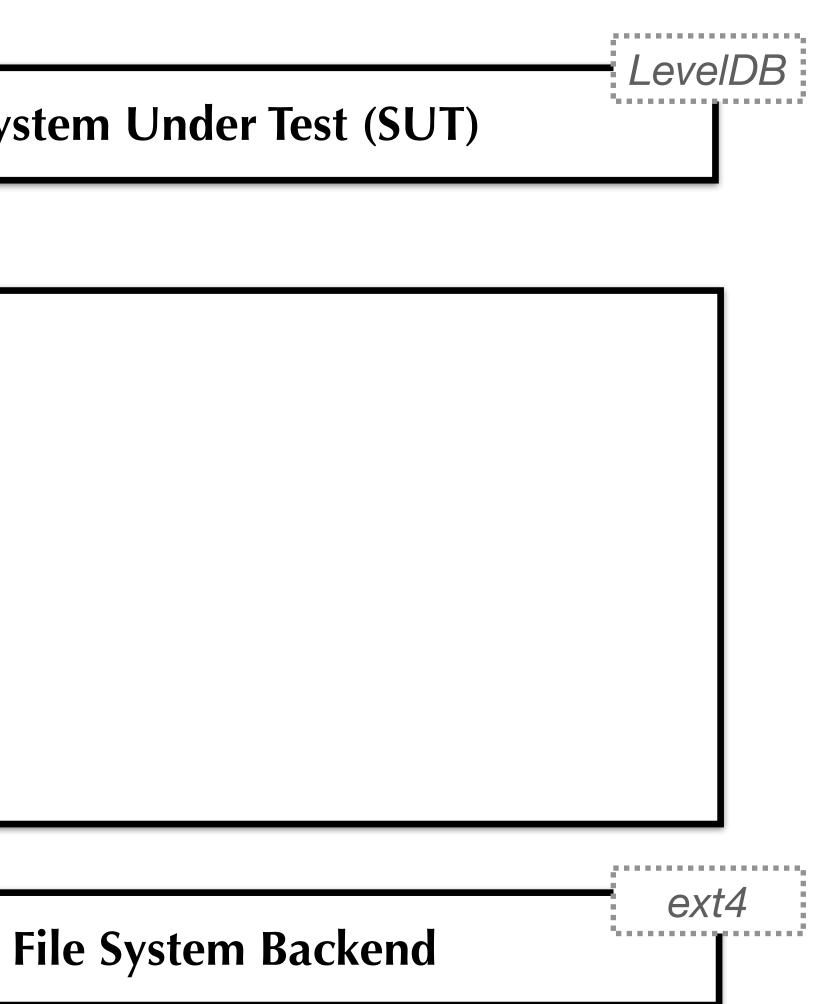
LazyFS component

*Control flow* 

→ I/O flow

	Syste
LazyFS	



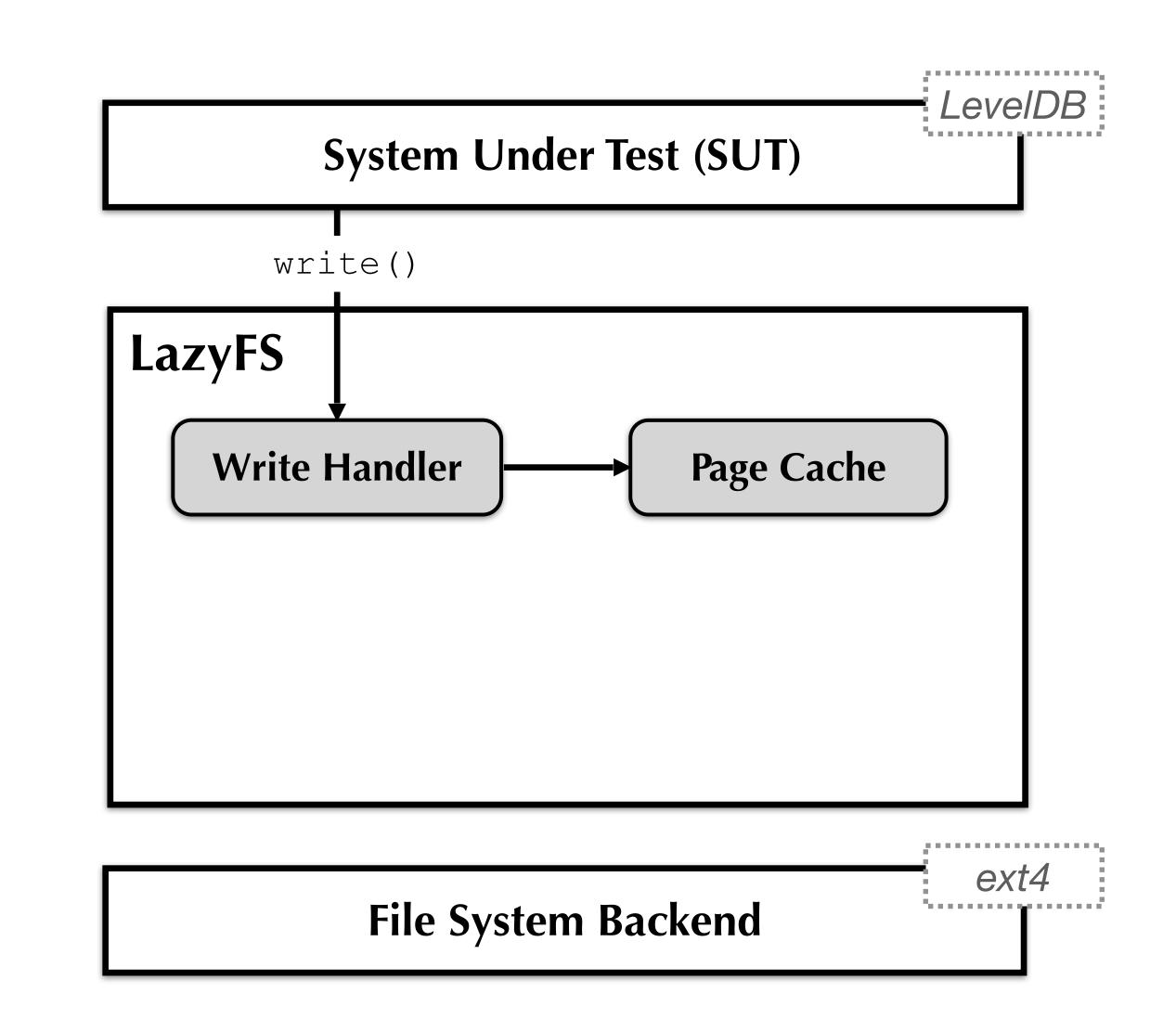




LazyFS component

•••• Control flow

 $\rightarrow$  I/O flow

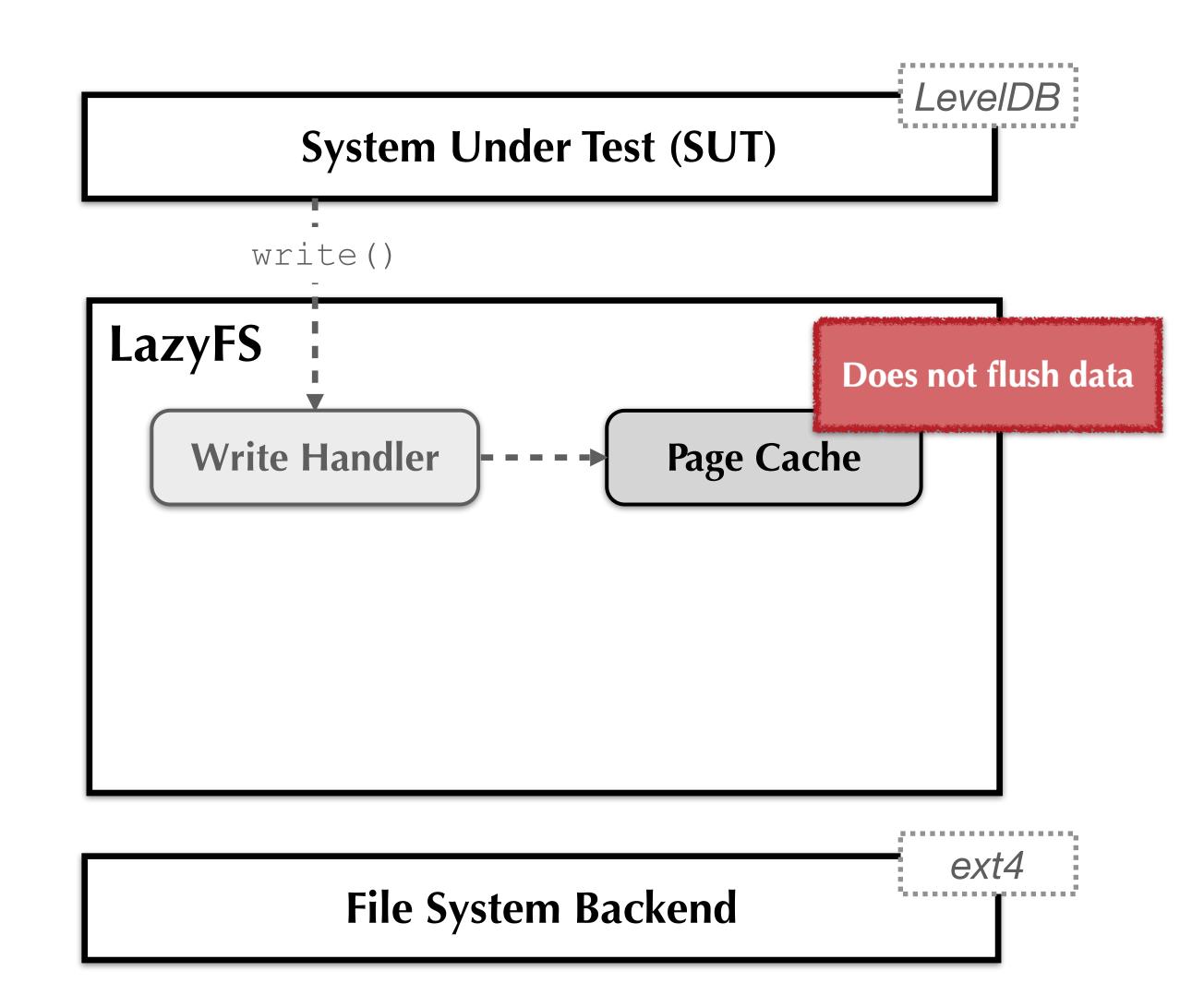




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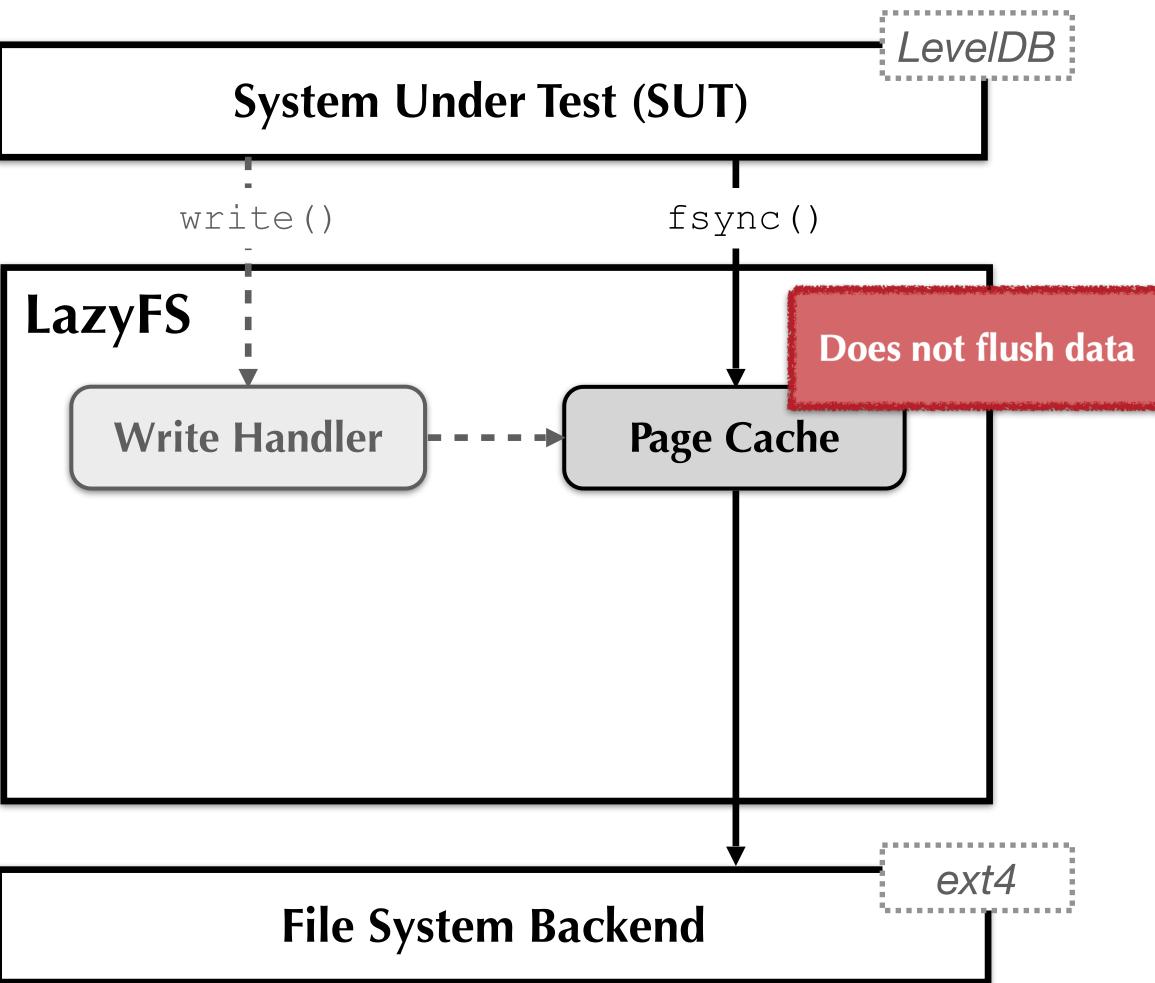


Controlling when data is written to disk allows to mimic the behavior of lost and torn writes

LazyFS component

···· Control flow

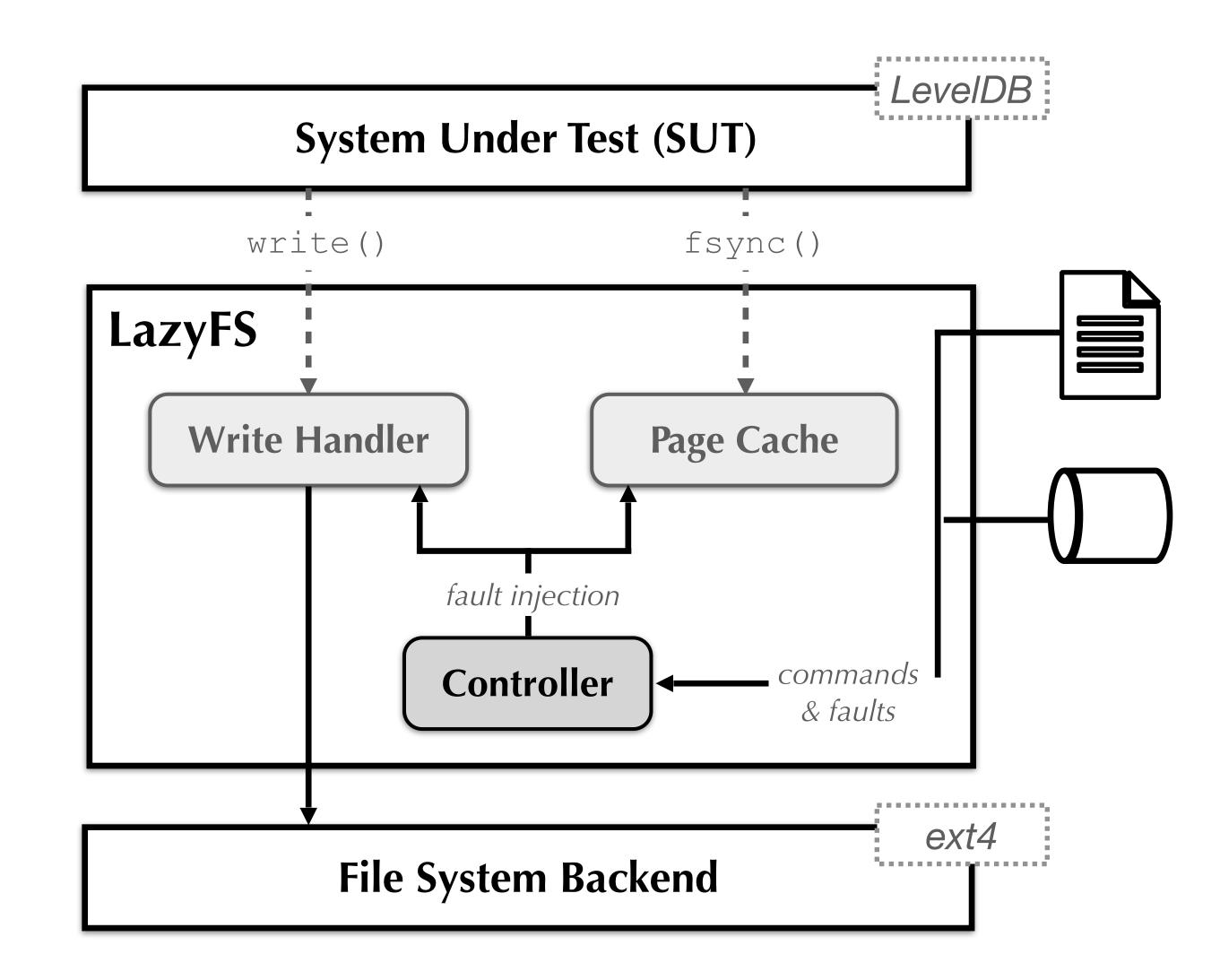
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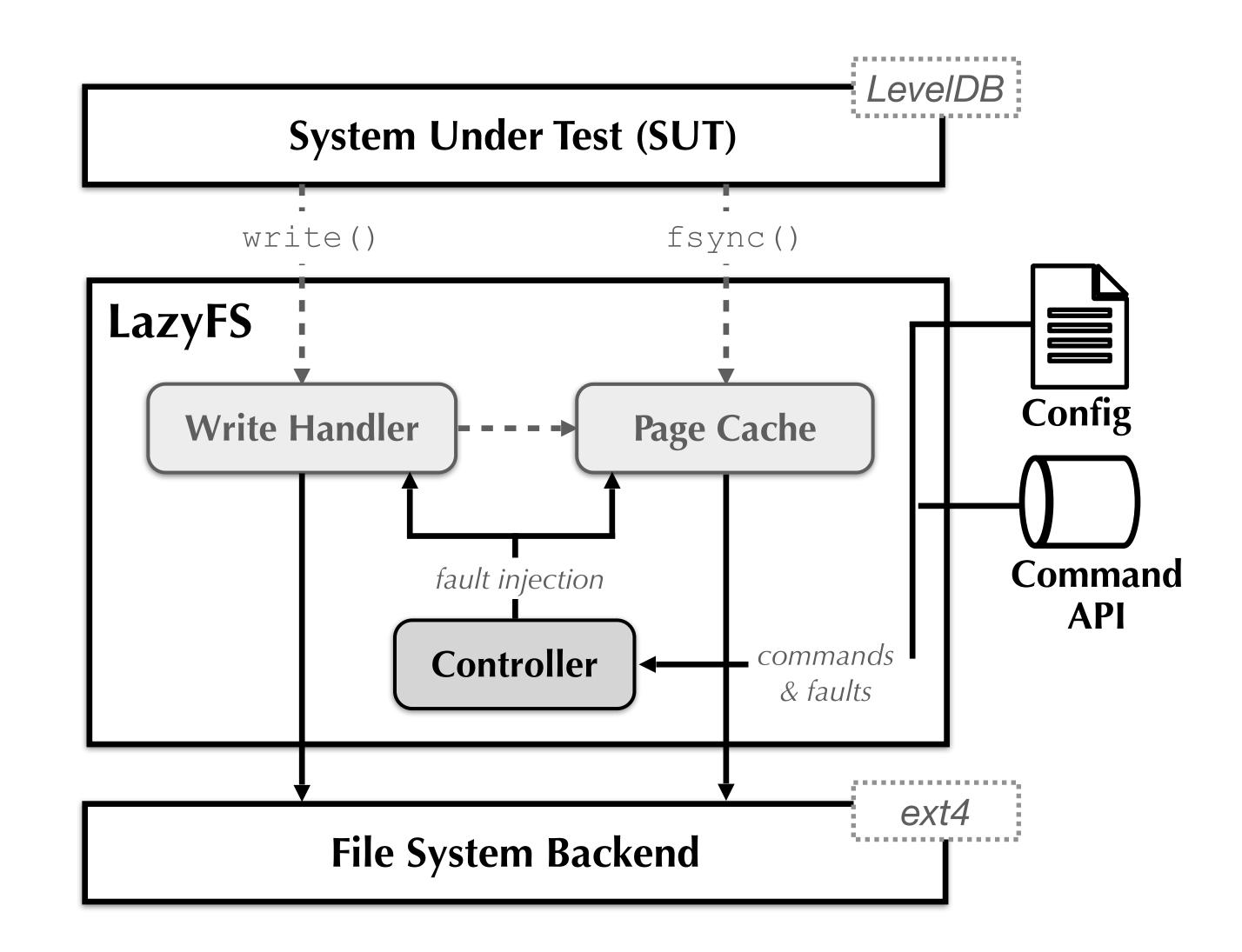




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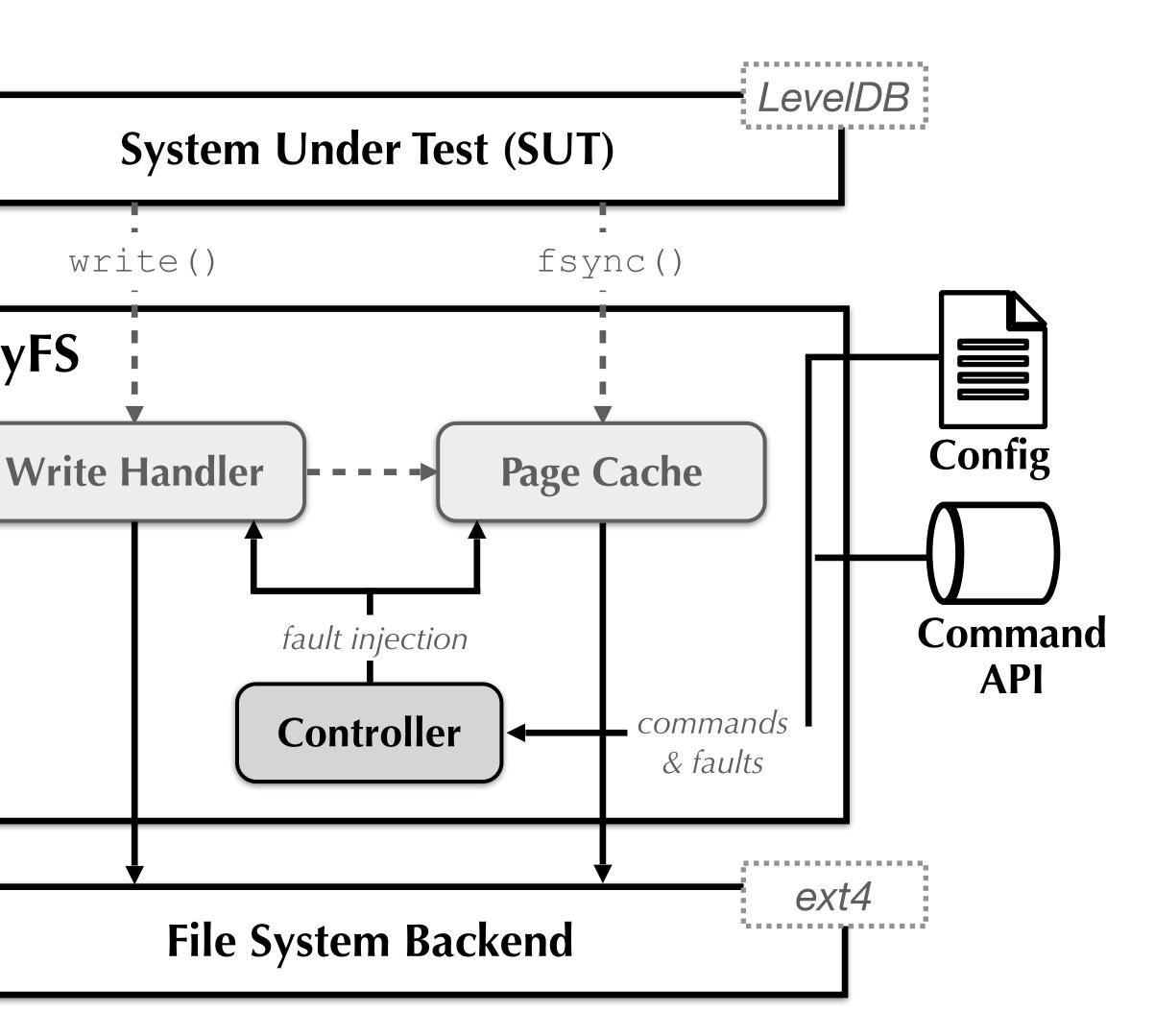
## Example: Inject a lost write fault after renaming file wal

LazyFS component

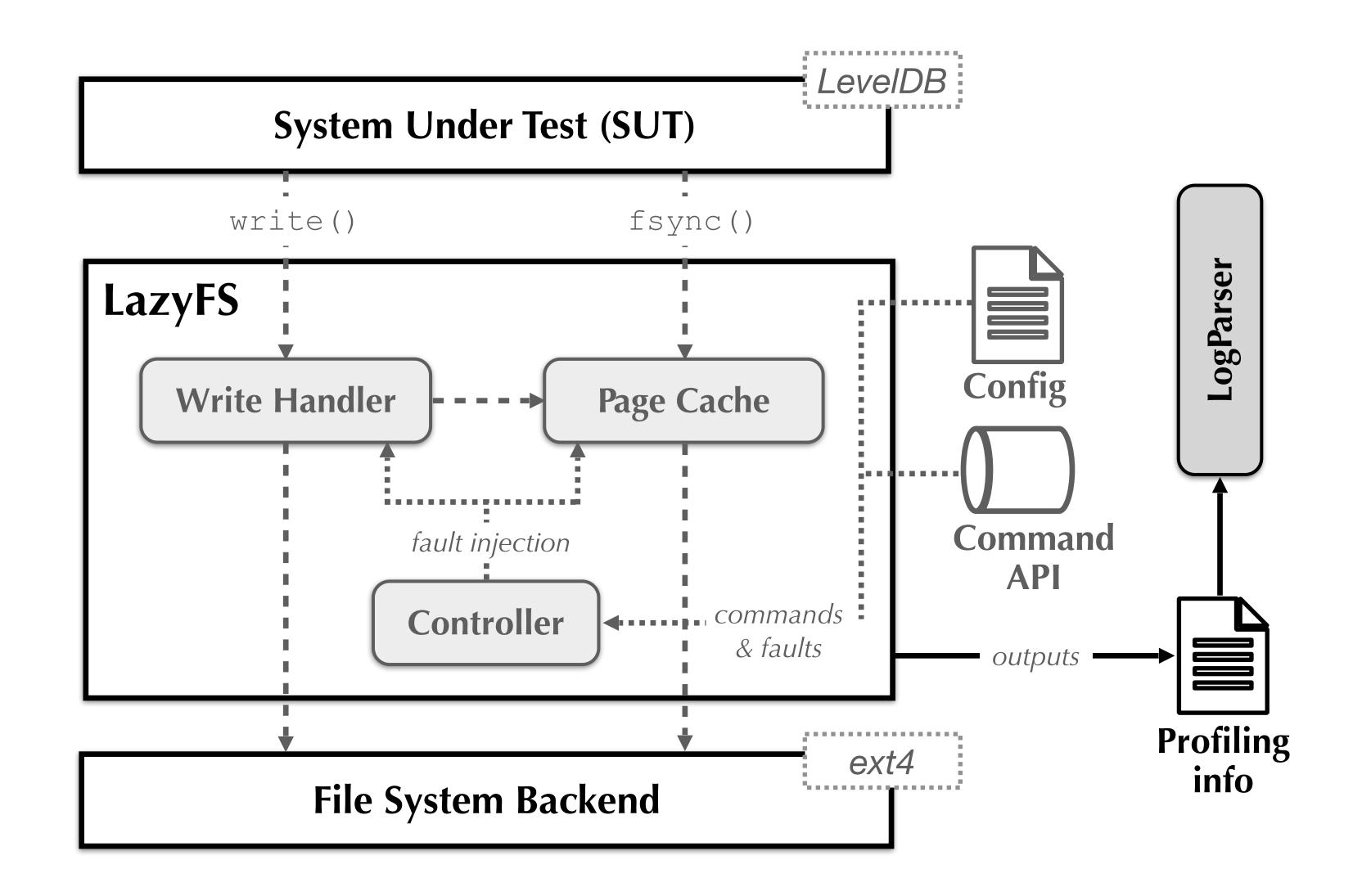
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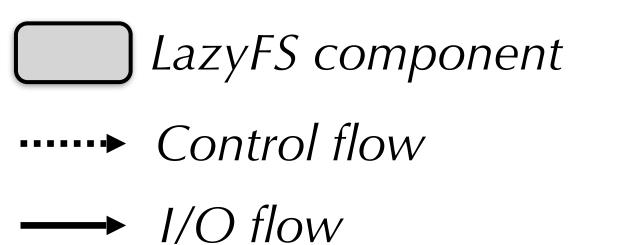
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LazyFS











	Number of bugs	Impact	Bugs in recent versions	
PostgreSQL	1		1	
LevelDB	4		2	13 Unavailability
ZooKeeper	3		3	1 Data corruption
Redis	1		0	4 Data corruption
Lightning N.	1		1	2 Silent data loss
etcd	2		0	1
PebblesDB	3		3	1 Data inconsiste
etcd	5		4	
Total	20			

## When Amnesia Strikes: Understanding and Reproducing Data Loss Bugs with Fault Injection

## ption/loss





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	Total	20	+2 crash consisten	cy mechanisms





4 Data corruption/loss



Silent data loss



Data inconsistency





# Known bug LevelDB Bug #6

### What steps will reproduce the problem?

- 1. Use a separate partition with the ext3 file system under the writeback mode (mount -o data=writeback), for the interleaving necessary for the bug to happen.
- that call, add an fdatasync() to the log file. This is again for the timing interleaving.
- 3. Insert a 45000 characters-long key-value pair, using an asynchronous Put(), and then do an infinite loop.
- second).

What is the expected output? What do you see instead? The inserted value, or an empty database, is expected. A corrupted value is seen.

What version of the product are you using? On what operating system? LevelDB 1.15, on Ubuntu 12.04.

1. Use ext3 file system in writeback mode in a separate partition. 2. Add fsync() in function of source code. 3. Insert a 45000 characters-long key-value pair and do an infinite loop. Wait 5 seconds and pull off the power chord.

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database. No other background process should be writing to the file system; this lets us easily simulate the timing

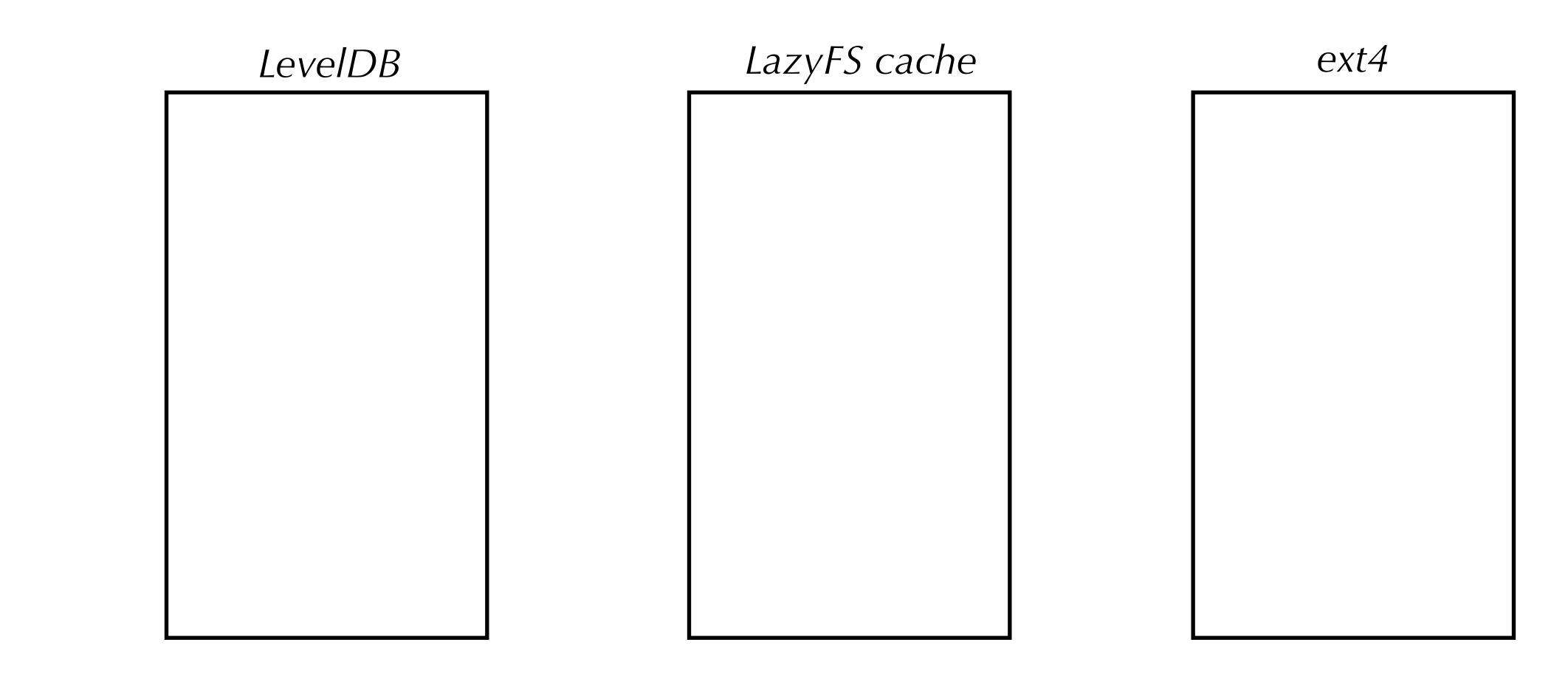
2. The EmitPhysicalRecord function in log\_writer.cc has a Flush() call on the log file (line 94 in version 1.15). Just before

4. Wait for 5 seconds, and pull off the power chord (the power chord should be pulled back between the 5th and the 25th

5. After rebooting the machine, re-open the database with paranoid checksums, run RepairDB, and try reading the values.

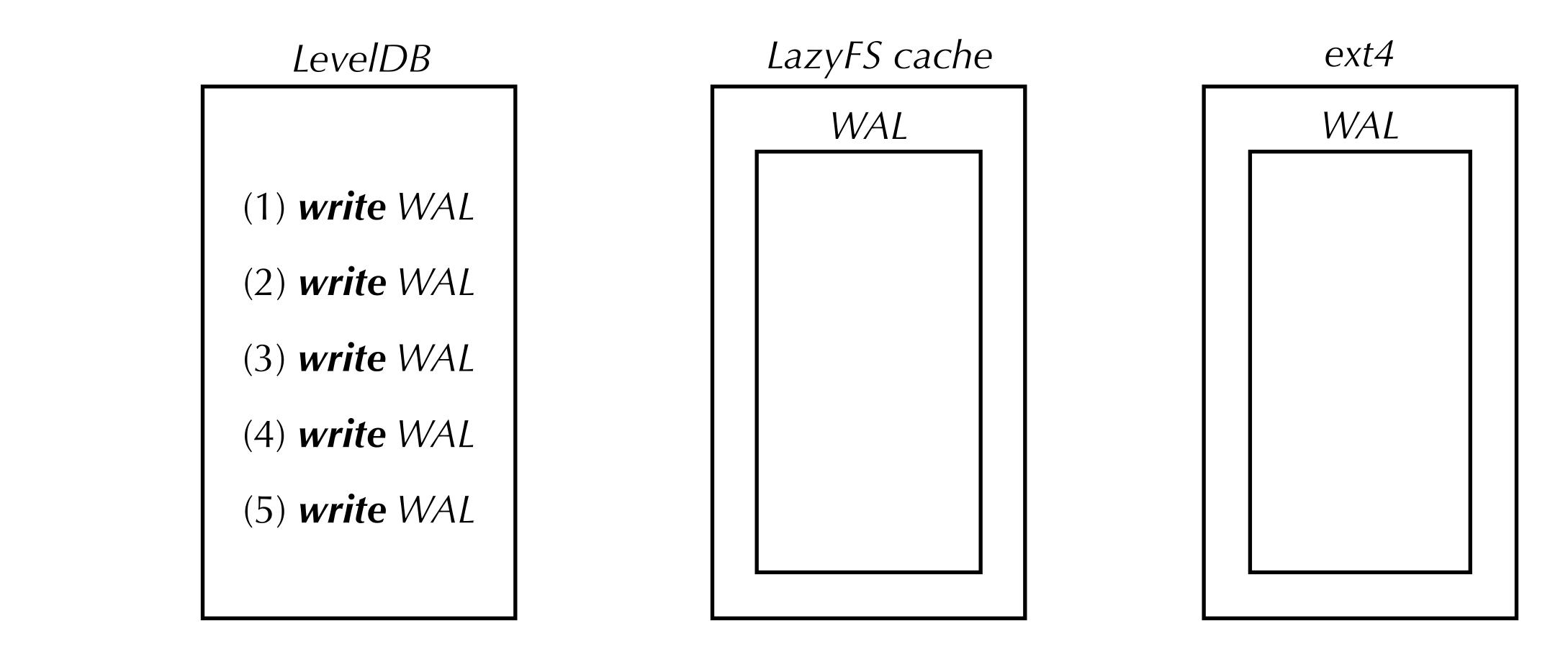


# Known bug LevelDB *Bug* #6



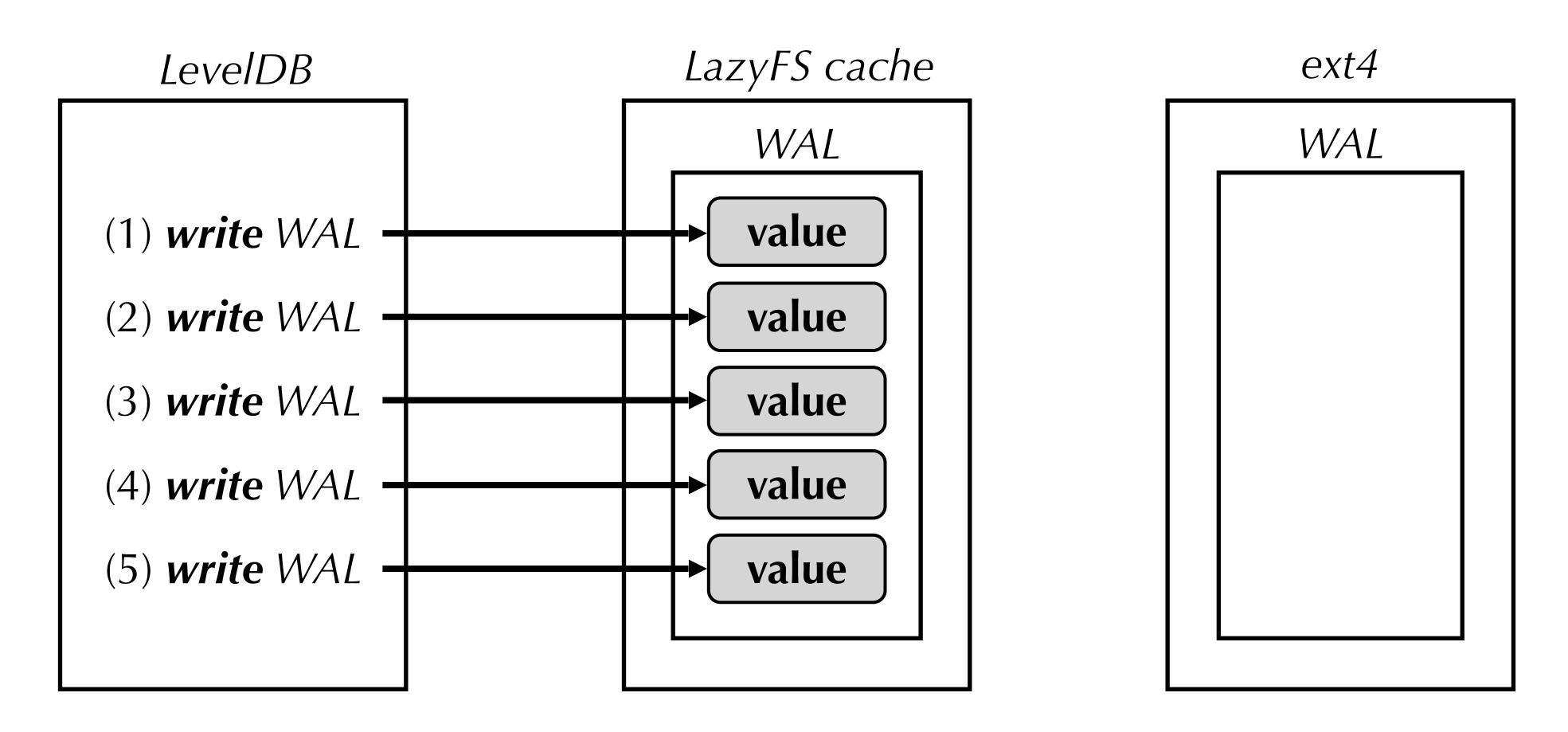


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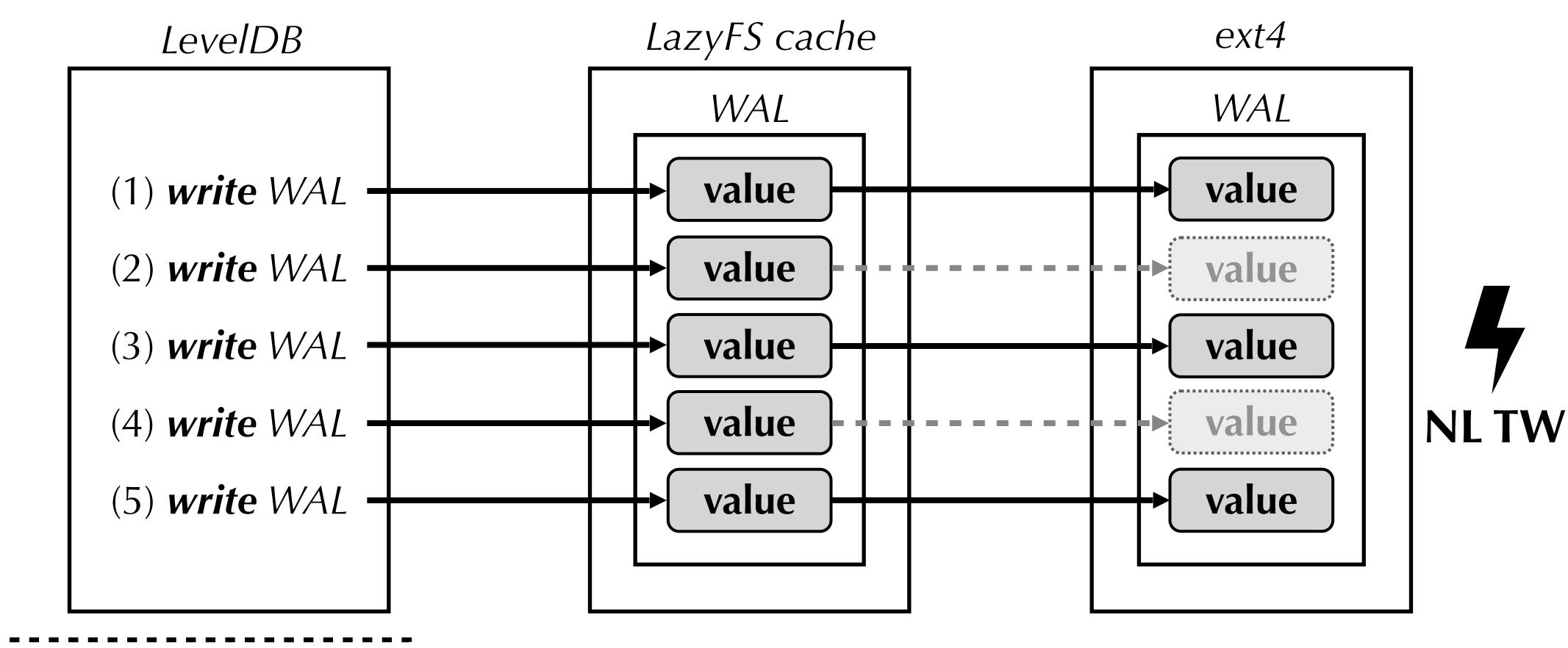


### Known bug LevelDB *Bug* #6





## Known bug LevelDB *Bug* #6



**NLTW**→Non-Linear Torn Write



ZooKeeper / ZOOKEEPER-2332

Zookeeper failed to start for empty txn log

Details

Description

We found that the zookeeper server with version 3.4.6 failed to start for there is a empty txn log in log dir. I think we should skip the empty log file during restoring the datatree. Any suggestion?

Shaohui Liu added a comment - 07/Dec/15 03:47

rgs

how did the empty txnlog happened in the first place?

The zookeeper server was killed after creating a new txn log file before flushing the log header to the log. So a txn log is left without a valid header and makes the the zookeeper server fail to start.

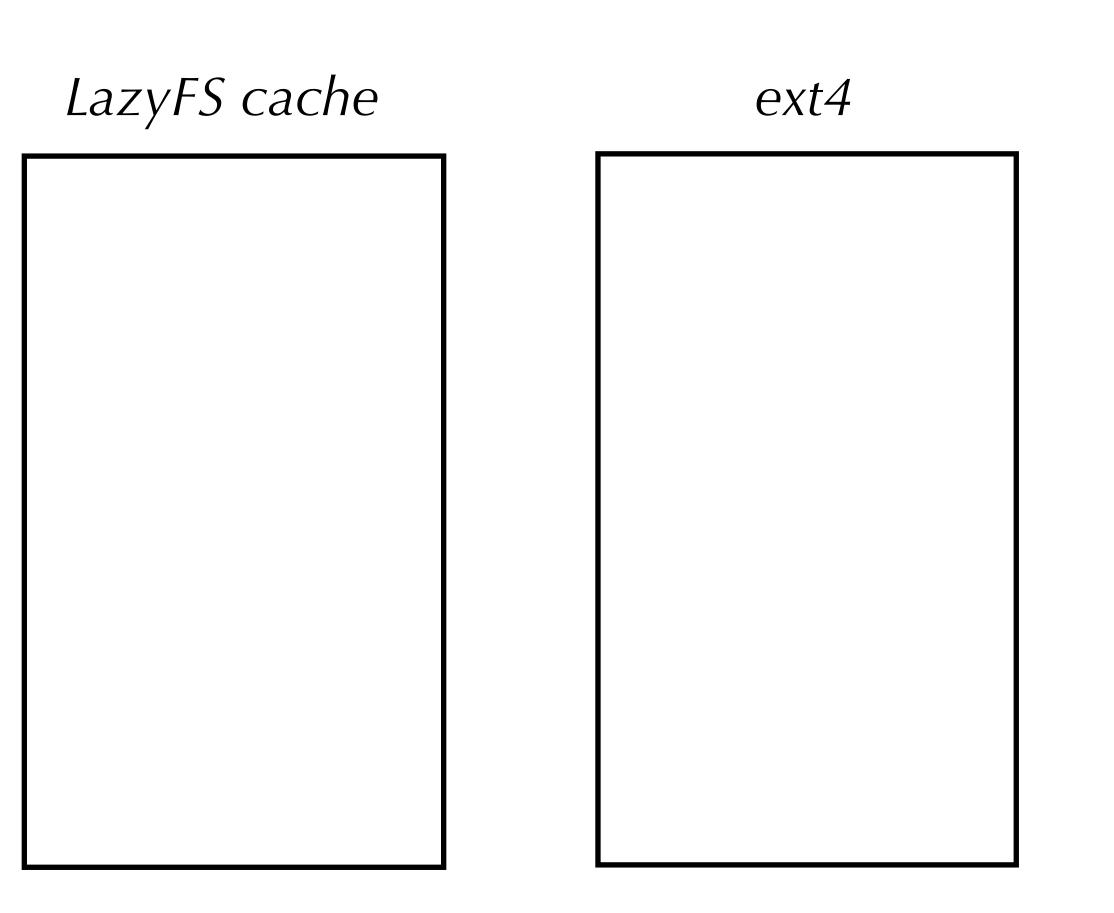
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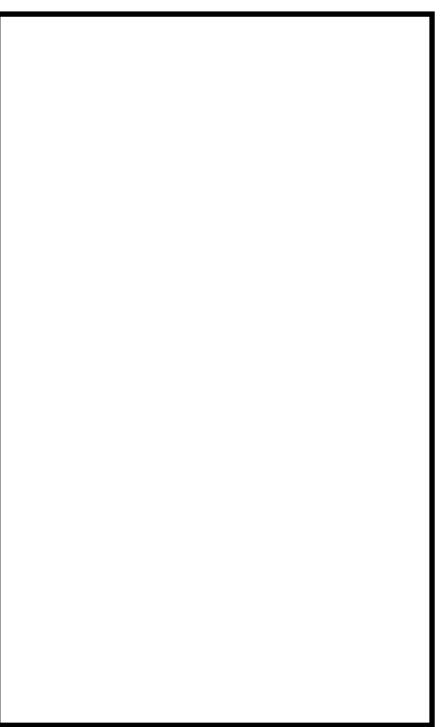
#### Fails to start with empty log file. • ZooKeeper server killed after creating log file but before flushing log header.



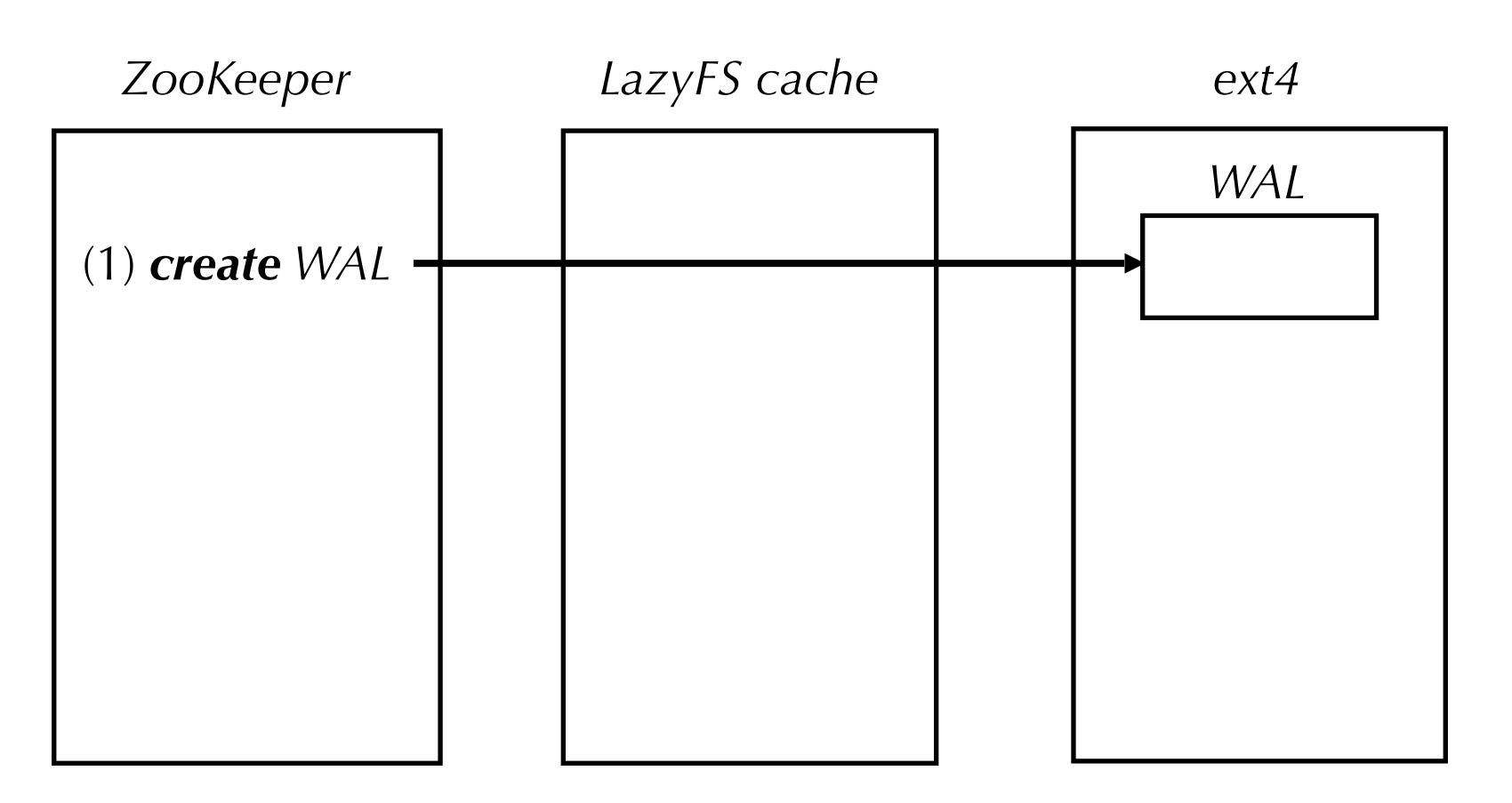




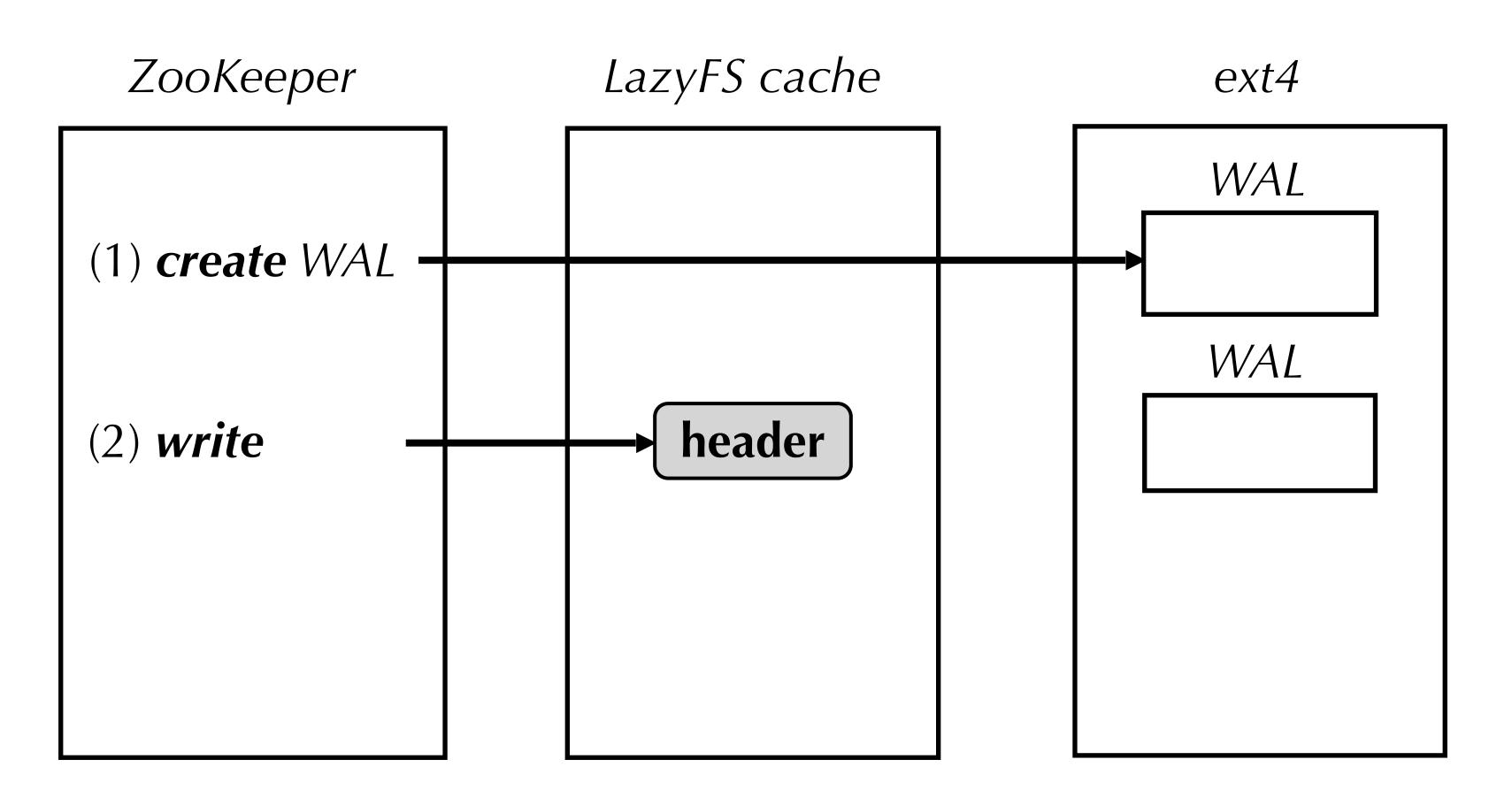




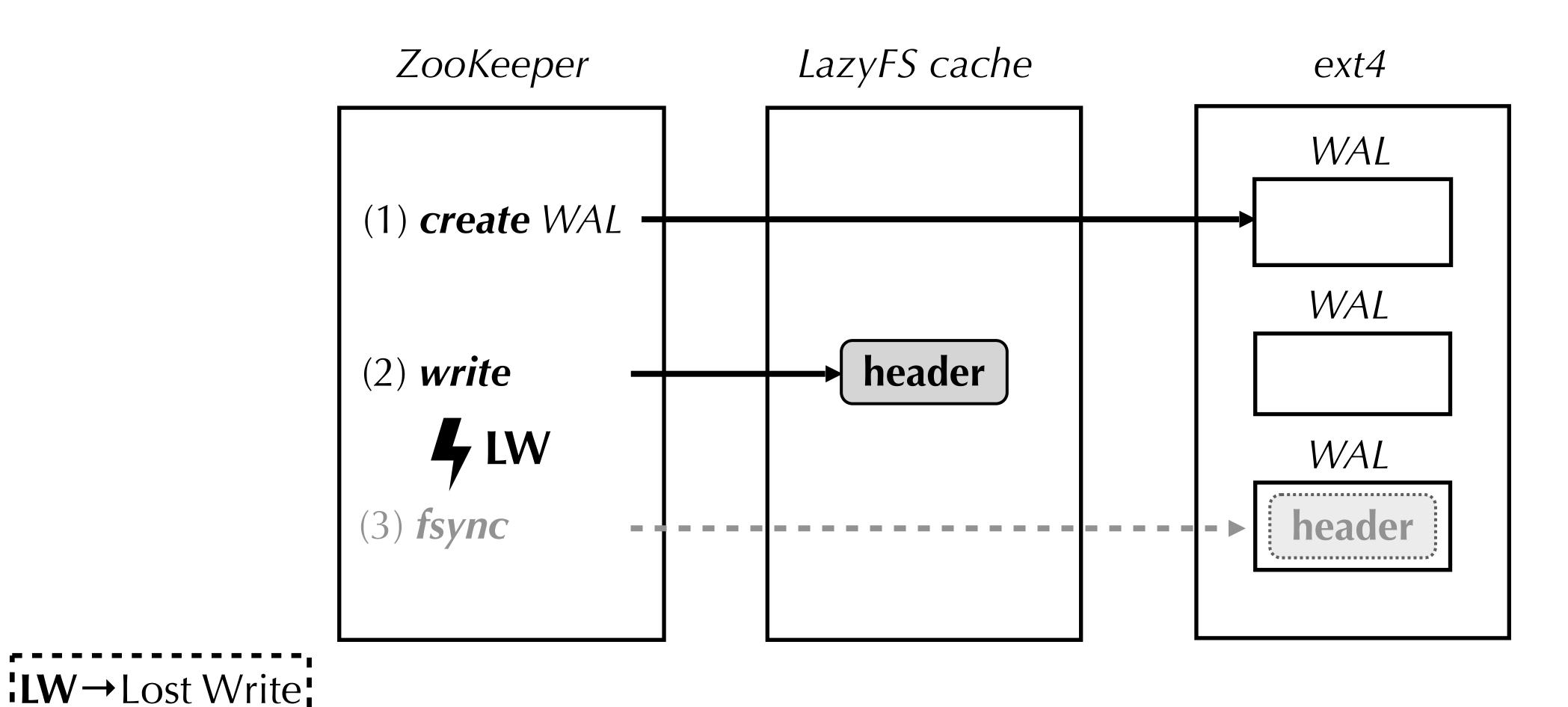














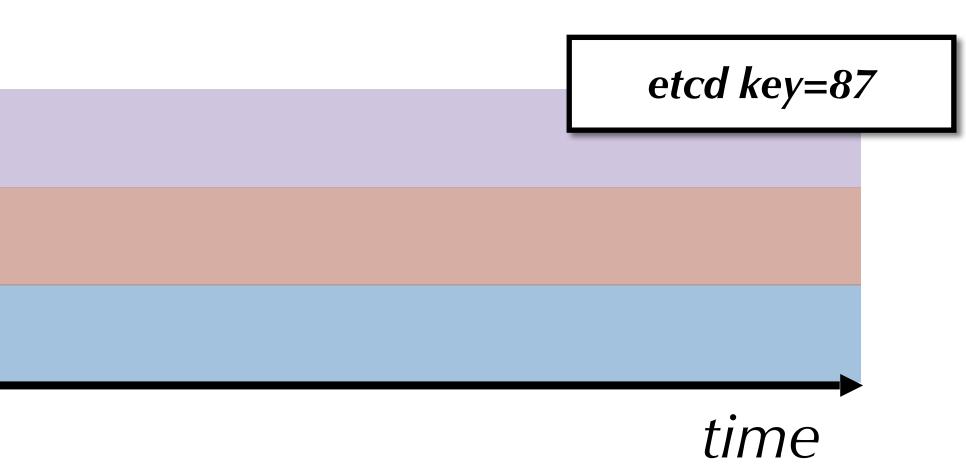
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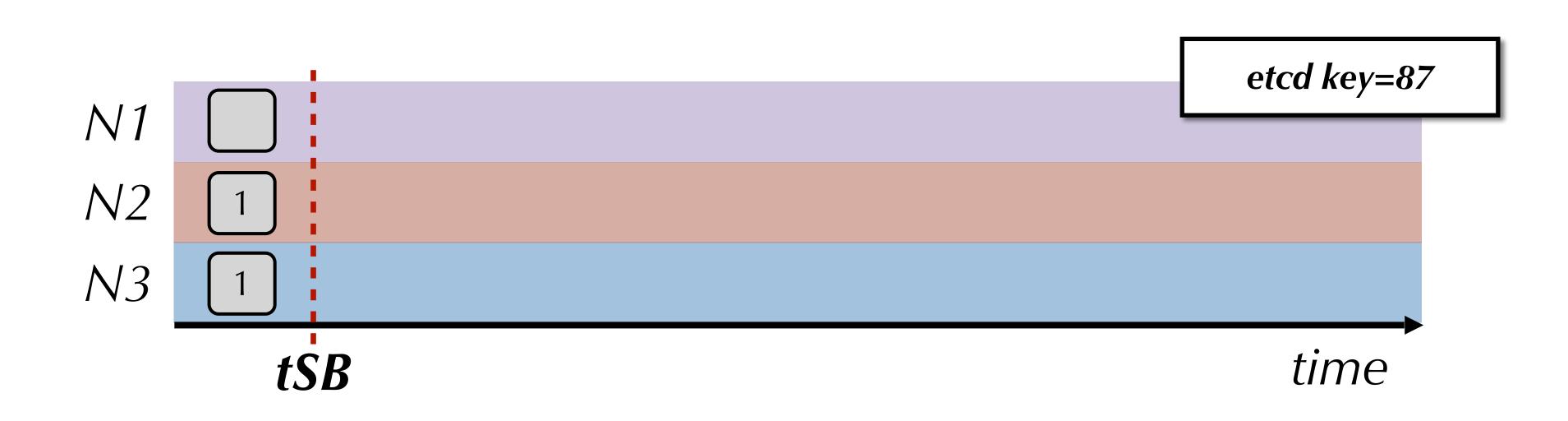


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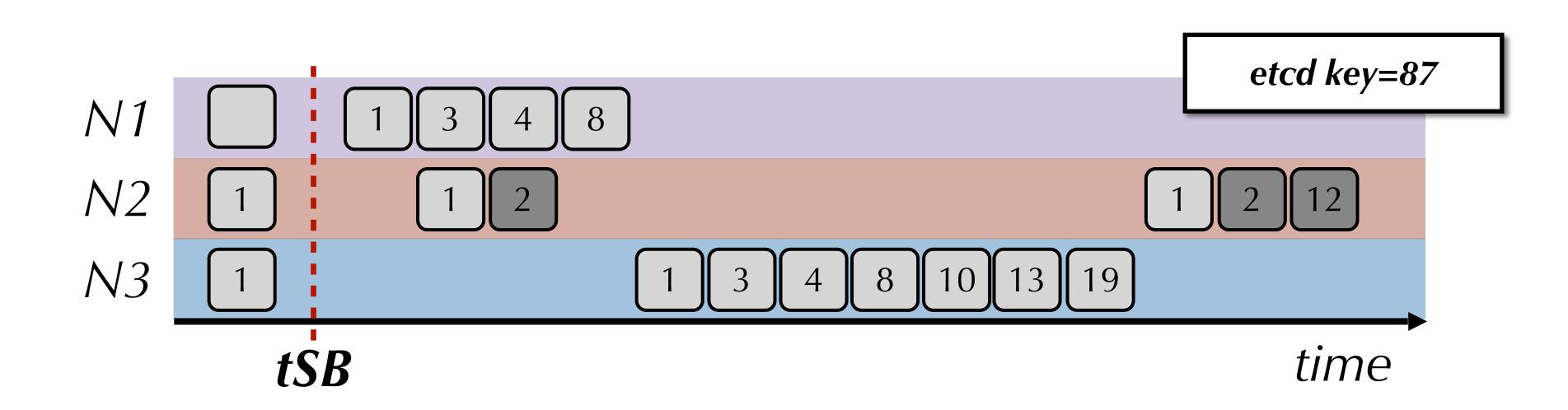


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## Conclusion

- Widely used systems are **still affected** by crash consistency bugs.
- LazyFS provides a way to reproduce bugs caused by lost and torn writes.
- LazyFS helps to **understand** the root cause of bugs.
- LazyFS helps to validate crash consistency mechanisms.

Known systems that used LazyFS:

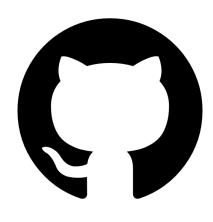
#### PostgreSQL e



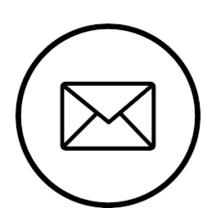




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dsrhaslab/lazyfs



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