

# Towards conveniently debuggable distributed systems

Stevan Andjelkovic   Daniel Gustafsson

24th Mar, 2022

## Recap and motivation

- ▶ Distributed systems are hard
- ▶ In a previous episode, we showed how to do so called *simulation testing*
  - ▶ Run your software system in a simulated world
  - ▶ “Digital twin” in business speak
  - ▶ Analogy: wind tunnel
  - ▶ Speed up time
  - ▶ Fast and deterministic system tests
- ▶ Today we will show how to build upon these ideas to enable debuggability of live systems
  - ▶ Live as in deployed systems, not just systems running in a test environment
  - ▶ Time traveling debugger (step forward *and backwards* and see how the system evolves over time)
  - ▶ Analogy: black-box in a plane (journal of all events that happened from takeoff to crash)
  - ▶ More than merely logging, we can *replay* the exact concurrent execution of the system deterministically
  - ▶ Quickly diagnose problems in production
  - ▶ Verify that bug fixes work in production environments (not just test environment)

# Overview

- ▶ High-level technical idea of how we achieve conveniently debuggable distributed systems
- ▶ The design of the journal of events (our “black-box”)
  - ▶ Low performance overhead
  - ▶ Also useful for efficient crash recovery
- ▶ Demo comparing our journal design vs SQLite
  - ▶ Collect performance metrics in the software under test
  - ▶ Simple benchmarking library using said metrics
- ▶ Show how rich debugging information is computed/derived from journal

# Inspiration and prior work

- ▶ Erlang
  - ▶ Perhaps best known for: lightweight threads and message passing (“everything is a process”)
  - ▶ Deeper point stressed in Armstrong’s thesis (Armstrong 2003): behaviours (better known as interfaces)
    - ▶ separate application code (“business logic”) which is *sequential* from networking/communication which is *concurrent*
- ▶ Mozilla’s rr tool, “time traveling debugger”, deterministic replay for concurrent executions (very low-level, syscalls)
- ▶ Event sourcing (don’t necessarily allow deterministic replay, but they could)
- ▶ Write-ahead-log (WAL) in databases (atomicity and durability of transactions)
- ▶ Chuck’s [Bandwagon](#) framework
- ▶ Martin “LMAX” Thompson et al’s [Aeron](#)
  - ▶ [Aeron: Open-source high-performance messaging](#) (Strange Loop 2014)
  - ▶ [Cluster Consensus: when Aeron met Raft](#) (GOTO 2018)

## High-level idea

- ▶ Follow Armstrong's advice:
  - ▶ Sequential business logic: state machine (function from input and state to output and new state)
  - ▶ Event loop which hides the concurrency associated with client requests and internal communication between state machines
  - ▶ The sequential state machines run on top of the event loop, and get fed one event/message/input at the time (assuming the state machines are deterministic, the whole system will be deterministic)
- ▶ Keep a journal/write-ahead-log/event store of all events received/processed by the event loop, this can then be used to *replay* a concurrent execution in a deterministic way
  - ▶ Snapshots of the application state can be used to truncate/compact the journal so it doesn't grow too big
- ▶ While replaying we can dump intermediate states when stepping the state machines, allowing us to visualise how state machines change over time giving us a time traveling debugger à la rr but on an application-level (high-level application events) rather than OS-level (low-level syscalls)
- ▶ Can you imagine how all these things together *could* enable convenient debugging of distributed systems?

## Design of the journal

- ▶ Heavily inspired by Martin “LMAX” Thompson et al's Aeron log buffer
- ▶ Circular buffer implemented on top of `mmap`ed byte array
- ▶ Three (virtual) files (clean, active, dirty)
- ▶ `recv` zero-copied straight to byte array (and persisted)
- ▶ Lock- and wait-free concurrency

## Design of the journal

Event 0

Event 1

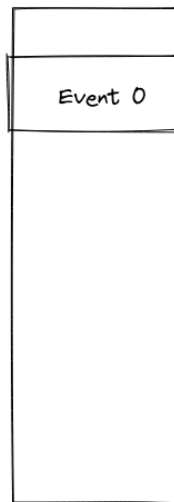
Event 2



## Design of the journal

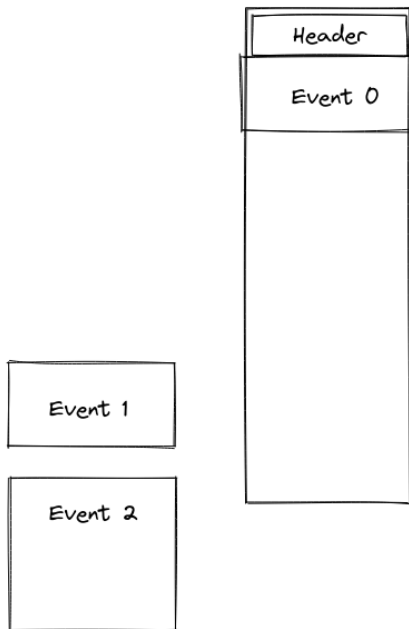
Event 1

Event 2

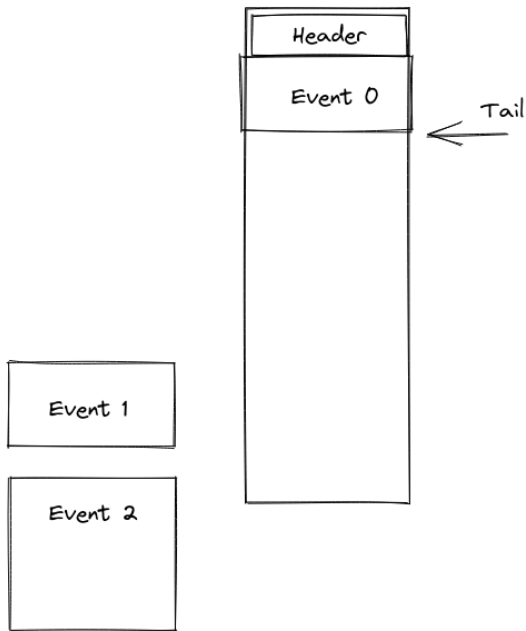




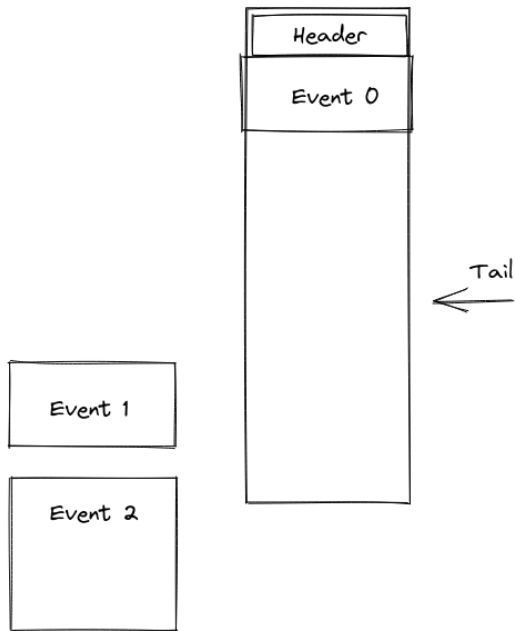
## Design of the journal



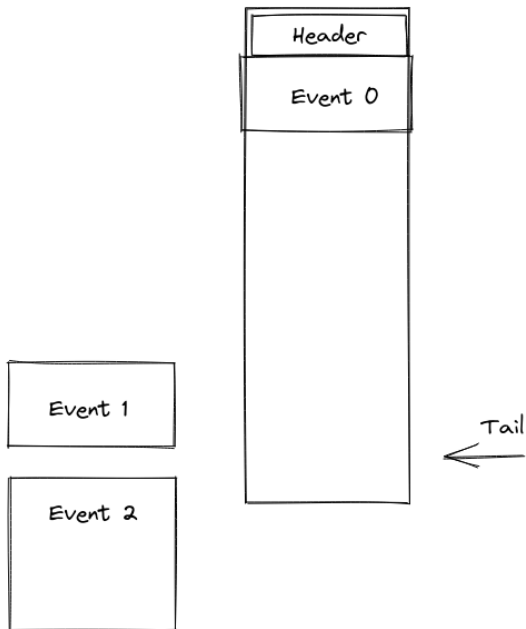
## Design of the journal



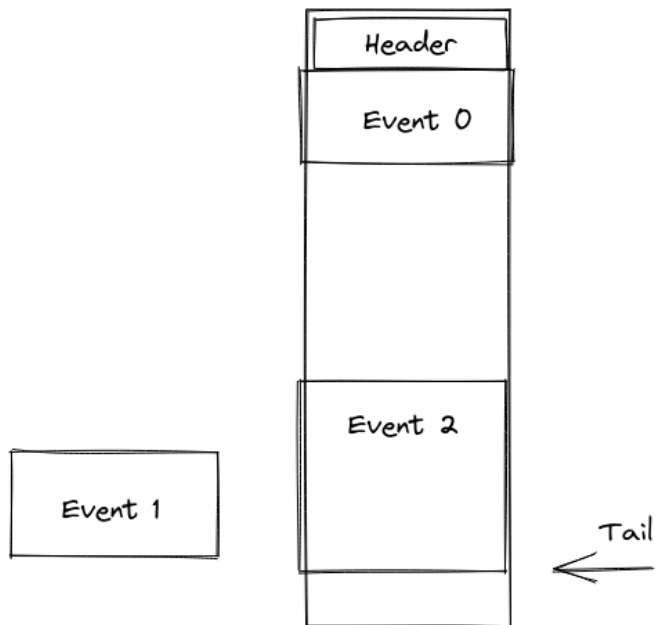
## Design of the journal



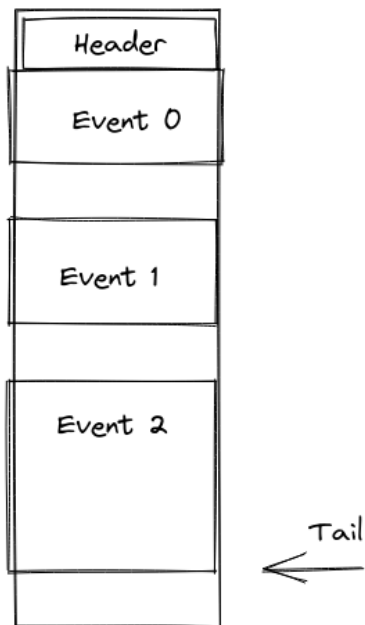
## Design of the journal



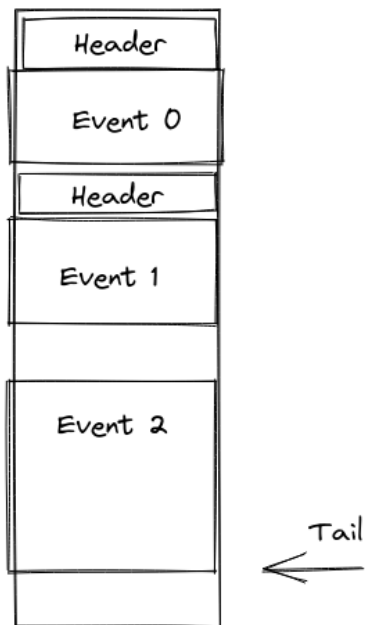
## Design of the journal



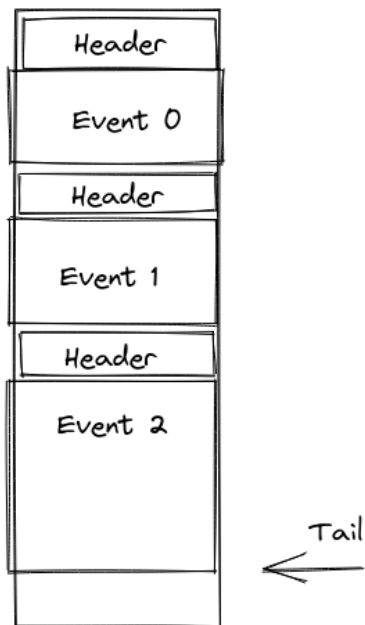
## Design of the journal



## Design of the journal

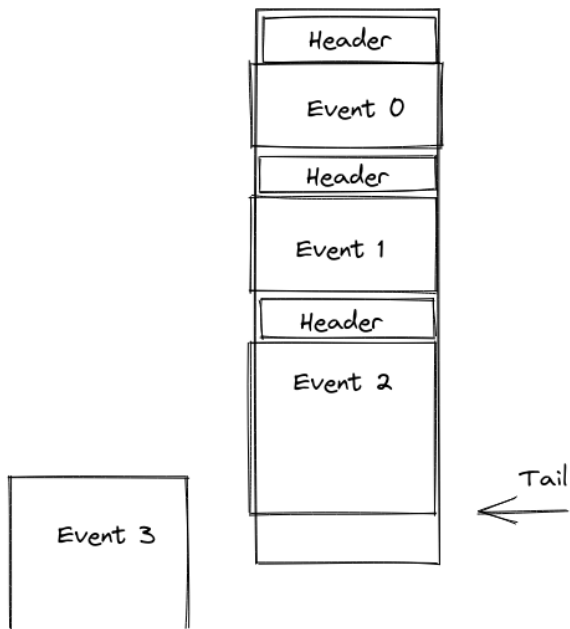


## Design of the journal

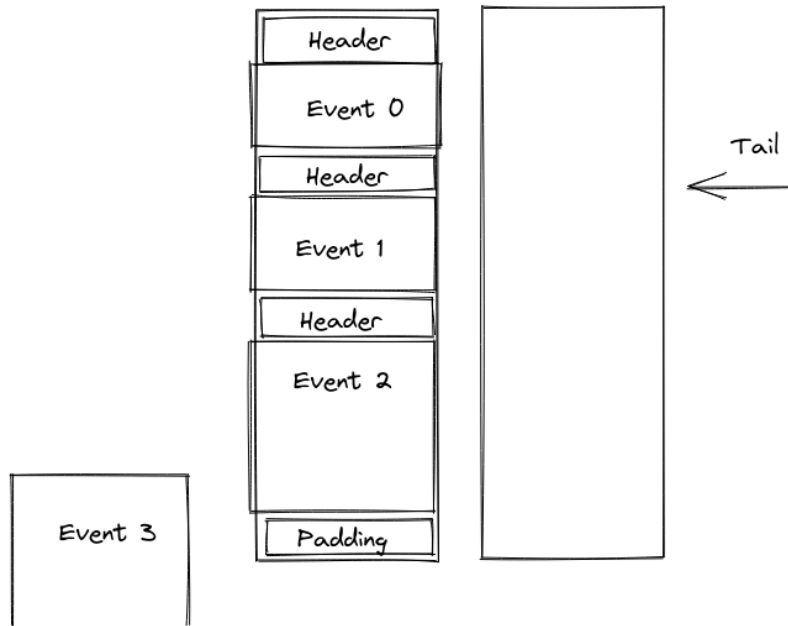




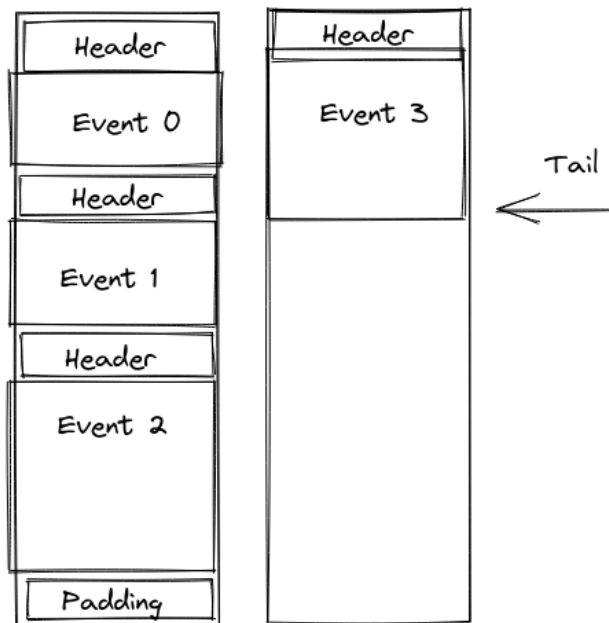
## Design of the journal



## Design of the journal



## Design of the journal



## Design of the event loop

1. Start a webserver where the request handlers have concurrent write access to a shared journal/channel (in the SQLite case);
2. Request handlers merely write the entire request into the journal/channel (this gives us a linearised sequence of requests);
3. A separate “worker” thread reads the journal/channel entries and updates/queries the state of the database (sequential access to db).

```
main() {  
    journalOrChannel := createJournalOrChannel()  
    fork (worker journalOrChannel)  
    startWebserver (requestHandler journalOrChannel)  
}
```

## Demo

- ▶ The first version uses SQLite to persist the application log, all reads and writes go through the database.
- ▶ The second version uses a on-disk journal which records all incoming data, and an in-memory application log is built from the journal. Writes are therefore indirectly persisted via the journal, and replaying the log lets us rebuild the in-memory application log in case of crashes. All reads go directly via the in-memory log. Snapshots of the journal can be taken and recovered from.
- ▶ The two implementations are benchmarked and compared. Metrics are collected via built-in profilers in both versions.
- ▶ For the journaled version we also show how it can be debugged via the snapshot and journal using deterministic replay to show how the state machines change over time (whether the server is running or not).

## Demo script

*# Show Dumblog API*

echo hi | http POST :8054 *# Append to log, returns index, e.g. 0;*

http GET :8054/0 *# Read at index from log, returns string,  
# e.g. "hi".*

## Benchmarks

```
# Use the performance governor instead of powersave (for laptops).
for policy in /sys/devices/system/cpu/cpufreq/policy*; do
    echo "${policy}"
    echo "performance" | sudo tee "${policy}/scaling_governor"
done

# Disable turbo boost.
echo 1 | sudo tee /sys/devices/system/cpu/intel_pstate/no_turbo

# The following run is just a (CPU) warm up, the results are discarded.
./bench-sqlite

for i in $(seq 10); do
    for j in $(seq 2 12); do
        ./bench-journal -- $((2**$j)) >> /tmp/bench-journal-$j.txt
        ./bench-sqlite -- $((2**$j)) >> /tmp/bench-sqlite-$j.txt
    done
done
```

## Benchmark statistics

```
Input512=(  
  workload          throughput  
  journal-512       6129.90  
  ...  
  journal-512       5756.72  
  sqlite-512        4851.46  
  ...  
  sqlite-512        6735.40  
")
```

```
df512 = read.table(textConnection(Input512),header=TRUE)  
bartlett.test(df512$throughput ~ df512$workload, data=df512)
```

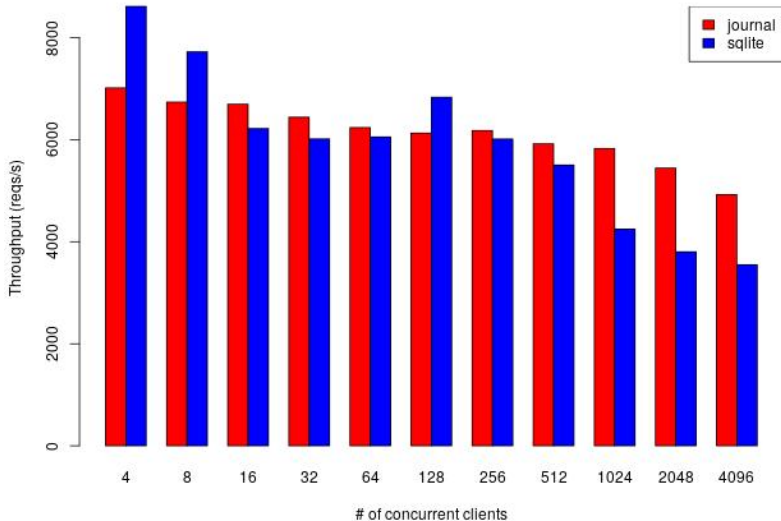
```
t.test(df512$throughput ~ df512$workload, data=df512,  
       var.equal=TRUE,  
       conf.level=0.95)
```

### ► Output

```
data: df512$throughput by df512$workload  
t = 0.29646, df = 18, p-value = 0.7703  
mean in group journal-512  mean in group sqlite-512  
      5937.373              5839.218
```

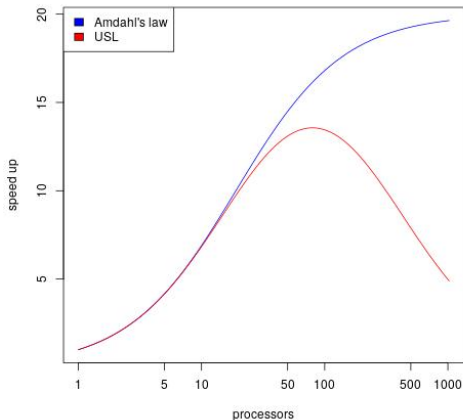


## Benchmark plot



## Amdahl's law vs the Universal scalability law

- ▶  $C(N) = N / (1 + a(N - 1) + ((b * N) * (N - 1)))$ 
  - ▶  $C$  = capacity or throughput
  - ▶  $N$  = number of processors
  - ▶  $a$  = contention penalty (time under some kind of lock)
  - ▶  $b$  = coherence penalty (time to agree, e.g. load the cache line with the shared reference)



## Built-in profiler/metrics

- ▶ Ideas due to Tyler “sled” Neely and Thompson et al
- ▶ Brendan Gregg’s U(tilisation) S(aturation) E(rrors)
- ▶ (Atomic) counters (an 64-bit signed integer)
- ▶ Histograms ( $2 + 2^{16}$  counters) uses log and exp for compression/decompression
- ▶ mmaped bytearray (8 bytes per counter) allows for atomic update (lock xadd in x86 asm) and access for different processes
- ▶ No third party dependencies or extra processes that need to be deployed



# Summary

- ▶ We have shown how to use the journal to:
  - ▶ Faster write path than with a database (lock-free, append only and zero-copy)
  - ▶ Get faster crash recovery for free
  - ▶ Get all the deterministic testing stuff for free
  - ▶ Rich time traveling debugger
- ▶ How to add a built-in a profiler and how to use it in benchmarks
- ▶ Zero third-party dependency observability (metrics/logs/tracing)

## Future work

- ▶ Add ability to download remote nodes' snapshots and journals in the debugger for a complete complete view of how the system as a whole changed over time (partial views are OK, in case not all nodes wants to give access);
- ▶ Save journal prefixes that lead up to crashes in a separate location so they can be debugged after the fact, even if the journal has been rotated (we don't want to keep all of the journal forever due to space limitations);
  - ▶ Broken analogy: have several black-boxes, one for each crash. . .
- ▶ Work out all corner cases with regards to versioning of journal and snapshots, following Chuck's Bandwagon approach;
- ▶ Event loop integration: all the above should be implemented on at the event loop level so that state machines (sequential code / "business logic") running on top of it get all this for free.

## Even further in the future work

- ▶ The journal variant currently saves the whole bytestrings in-memory, more realistically one could only save keys/topics and offset/length pairs (pointing to disk locations) in-memory and use `sendfile` for zero-copy reads for the journal version of the service;
- ▶ Using the Linux kernel's `io_uring` to amortise the cost of syscalls (by batching and doing them async);
- ▶ But protocol improvements are likely much more important for performance than these low-level database engine and event loop improvements!

Thanks! Questions? References:

Armstrong, Joe. 2003. "Making Reliable Distributed Systems in the Presence of Software Errors." PhD thesis, Royal Institute of Technology, Stockholm, Sweden.  
<https://nbn-resolving.org/urn:nbn:se:kth:diva-3658>.