



# The Computer Science behind a Modern Distributed Database

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# Overview

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## Topics

- ▶ Resilience and Consensus
- ▶ Sorting
- ▶ Log-structured Merge Trees
- ▶ Hybrid Logical Clocks
- ▶ Distributed ACID Transactions

**Bottom line:** You need CompSci to implement a modern data store

# Resilience and Consensus

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## The Problem

A modern data store is **distributed**, because it needs to **scale out** and/or **be resilient**.

**Different parts of the system need to agree on things.**

**Consensus** is the **art** to achieve this **as well as possible** in software.

This is **relatively easy**, if things are good, **but very hard**, if:

- ▶ the network has **outages**,
- ▶ the network has **dropped**, **delayed** or **duplicated** packets,
- ▶ **disks fail** (and come back with corrupt data),
- ▶ **machines fail** (and come back with old data),
- ▶ **racks fail** (and come back with or without data).

(And we have not even talked about malicious attacks and enemy action.)

# Paxos and Raft

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Traditionally, one uses the **Paxos Consensus Protocol** (1989 ... 1998).  
More recently, **Raft** (2013) has been proposed.

- ▶ **Paxos** is **a challenge to understand and to implement efficiently**.
- ▶ **Various variants** exist.
- ▶ **Raft** is **designed to be understandable**.

My advice:

First **try to understand Paxos** for some time (do not implement it!), then enjoy **the beauty of Raft**, **but do not implement it either!**  
**Use some battle-tested implementation you trust!**

But most importantly: **DO NOT TRY TO INVENT YOUR OWN!**

## Raft in a slide

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- ▶ An **odd number** of servers each keep a persisted **log of events**.
- ▶ Everything is **replicated to everybody**.
- ▶ They democratically **elect a leader** with absolute majority.
- ▶ **Only the leader may append** to the replicated log.
- ▶ An append only counts when **a majority has persisted and confirmed** it.
- ▶ Very **smart logic** to ensure a **unique leader** and **automatic recovery from failure**.
- ▶ It is all **a lot of fun** to get right, but it is **proven to work**.
- ▶ One puts a **key/value store** on top, the log contains the **changes**.

# Demo

`http://raft.github.io/raftscope/index.html`

(by Diego Ongaro)

# Sorting

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## The Problem

Data stores need **indexes**. In practice, we need to **sort things**.

Most published algorithms are **rubbish** on **modern hardware**.

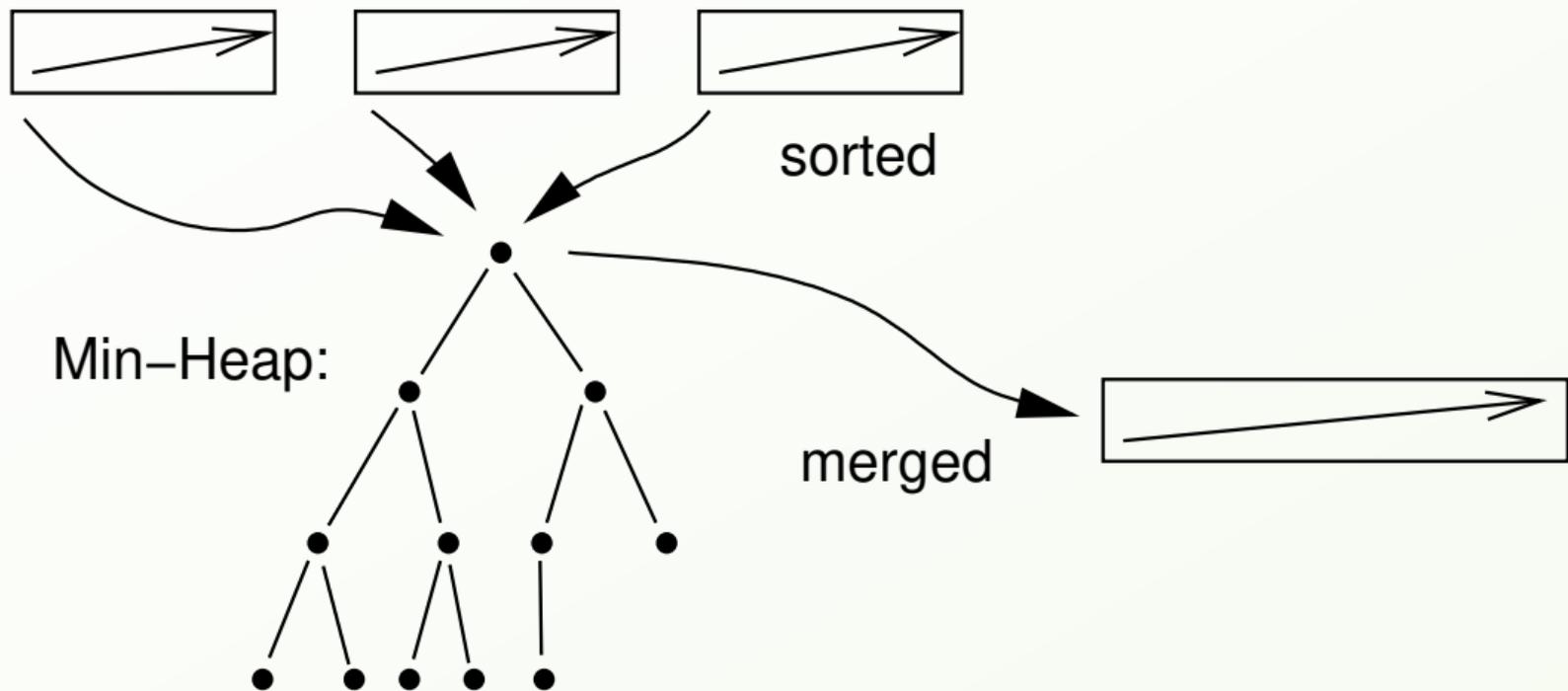
The problem is **no longer** the **comparison computations** but the **data movement**.

Since 1983 and the Apple IIe,

- ▶ compute power in one core has increased by about  $\times 20000$
- ▶ and now we have 32 cores in some CPUs
- ▶ a single memory access only by about  $\times 40$
- ▶ this means **computation** has outpaced **memory access** by  $\times 16000!$

# Idea for a parallel sorting algorithm: Merge Sort

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Nearly all comparisons hit the L2 cache!

# Log structured merge trees (LSM-trees)

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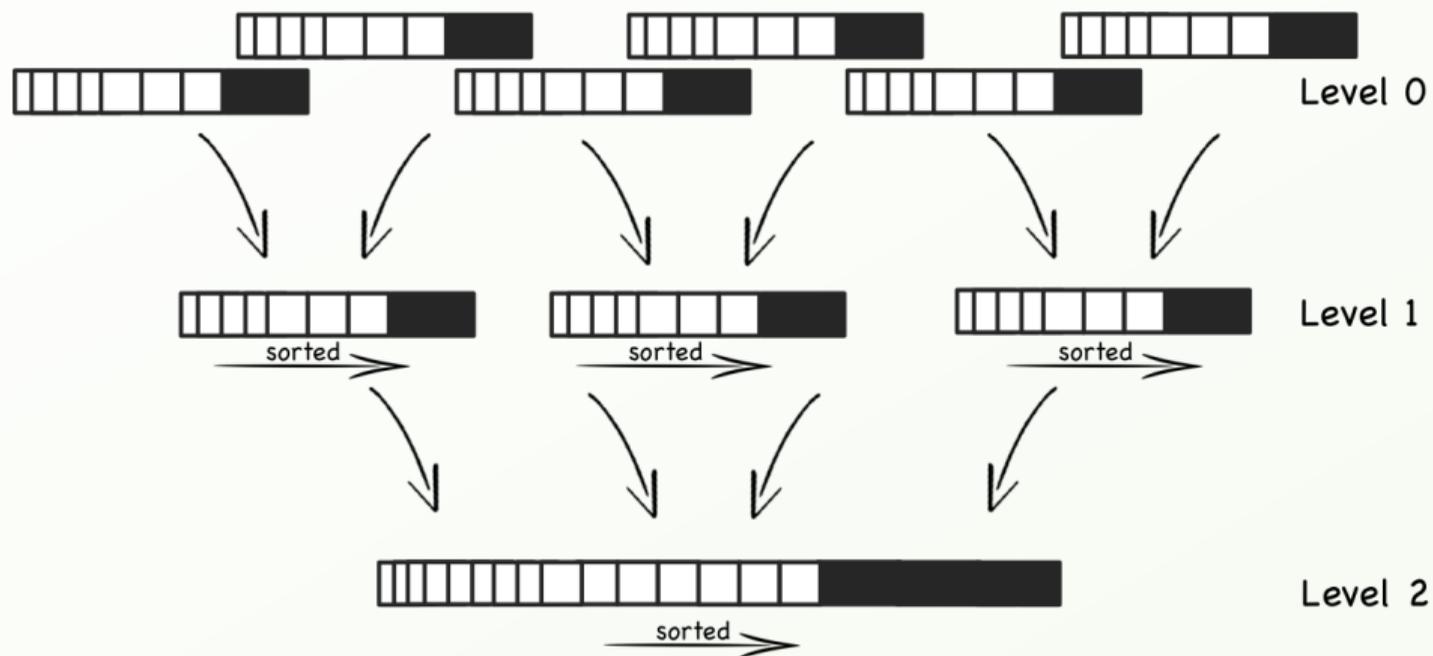
## The Problem

People rightfully expect from a data store, that it

- ▶ can hold **more data than the available RAM**,
- ▶ works well **with SSDs and spinning rust**,
- ▶ **allows fast bulk inserts** into large data sets, and
- ▶ **provides fast reads** in a hot set that fits into RAM.

Traditional B-tree based structures **often fail to deliver** with the last 2.

# Log structured merge trees (LSM-trees)



Compaction continues creating fewer, larger and larger files

# Log structured merge trees (LSM-trees)

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## LSM-trees — summary

- ▶ writes **first go into memtables**,
- ▶ all files are **sorted** and **immutable**,
- ▶ **compaction** happens in the background,
- ▶ **merge sort** can be used,
- ▶ all writes use **sequential I/O**,
- ▶ **Bloom filters** or **Cuckoo filters** for fast reads,
- ▶  $\implies$  **good write throughput** and **reasonable read performance**,
- ▶ used in [ArangoDB](#), [BigTable](#), [Cassandra](#), [FaunaDB](#), [HBase](#), [InfluxDB](#), [LevelDB](#), [MarkLogic](#), [MongoDB](#), [MySQL](#), [RocksDB](#), [SQLite4](#) and [WiredTiger](#), etc.

# Hybrid Logical Clocks (HLC)

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## The Problem

**Clocks** in different nodes of distributed systems **are not in sync**.

- ▶ general relativity poses **fundamental obstructions** to synchronicity,
- ▶ in practice, **clock skew happens**,
- ▶ Google can use **atomic clocks**,
- ▶ even with **NTP (network time protocol)** we have to live with  $\approx 20ms$ .

Therefore, we **cannot compare time stamps from different nodes!**

## Why would this help?

- ▶ establish **“happened after”** relationship between events,
- ▶ e.g. for **conflict resolution, log sorting, detecting network delays**,
- ▶ **time to live** could be implemented easily.

# Hybrid Logical Clocks (HLC)

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## The Idea

Every computer has a **local clock**, and we use **NTP** to synchronize. If two events **on different machines** are **linked by causality**, the **cause** should have a smaller time stamp than the **effect**.

**causality**  $\iff$  **a message is sent**

Send a time stamp **with every message**. The HLC always returns a value  
>  $\max(\text{local clock, largest time stamp ever seen})$ .

**Causality is preserved**, time can **"catch up"** with logical time eventually.

<http://muratbuffalo.blogspot.com.es/2014/07/hybrid-logical-clocks.html>

# Distributed ACID Transactions

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**Atomic**

either happens **in its entirety** or **not at all**

**Consistent**

reading **sees a consistent state**, writing **preserves consistency**

**Isolated**

concurrent transactions **do not see each other**

**Durable**

committed writes are **preserved after shutdown and crashes**

(All relatively doable when transactions happen one after another!)

# Distributed ACID Transactions

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## The Problem

In a distributed system:

- ▶ How to make sure, that all nodes **agree** on whether the transaction has happened? (**Atomicity**)
- ▶ How to create a **consistent snapshot** across nodes? (**Consistency**)
- ▶ How to **hide ongoing activities** until commit? (**Isolation**)
- ▶ How to handle **lost nodes**? (**Durability**)

We have to take **replication**, **resilience** and **failover** into account.

# Distributed ACID Transactions

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## WITHOUT

### Distributed databases **without ACID transactions:**

ArangoDB, BigTable, Couchbase, Datastax, Dynamo, Elastic, HBase, MongoDB, RethinkDB, Riak, and lots more ...

## WITH

### Distributed databases **with ACID transactions:**

(ArangoDB,) CockroachDB, FaunaDB, FoundationDB, MarkLogic, Spanner

⇒ **Very few distributed engines promise ACID, because this is hard!**

# Distributed ACID Transactions

## Basic Idea

Use **Multi Version Concurrency Control (MVCC)**, i.e. multiple revisions of a data item are kept.

Do **writes** and **replication** decentrally and distributed, **without them becoming visible from other transactions**.

Then have **some** place, where there is a **switch**, which decides **when the transaction becomes visible**.

These “switches” need to

- ▶ be **persisted** somewhere (**durability**),
- ▶ **scale out** (**no bottleneck for commit/abort**),
- ▶ be **replicated** (**no single point of failure**),
- ▶ be **resilient** in case of fail-over (**fault-tolerance**).

**Transaction visibility** needs to be implemented (MVCC), time stamps play a crucial role.

# Thank you!

## Further questions?

- ▶ Follow us on twitter: [@arangodb](https://twitter.com/arangodb)
- ▶ Join our slack: [slack.arangodb.com](https://slack.arangodb.com)
- ▶ Download and documentation: <https://arangodb.com>
- ▶ Issues and source (Star us!):  
<https://github.com/arangodb/arangodb>
- ▶ Info and slides:  
<https://arangodb.com/speakers/daniel-larkin-york>

## Links

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<http://the-paper-trail.org/blog/consensus-protocols-paxos>

<https://raft.github.io>

[https://en.wikipedia.org/wiki/Merge\\_sort](https://en.wikipedia.org/wiki/Merge_sort)

[http:](http://www.benstopford.com/2015/02/14/log-structured-merge-trees/)

[//www.benstopford.com/2015/02/14/log-structured-merge-trees/](http://www.benstopford.com/2015/02/14/log-structured-merge-trees/)

<http://muratbuffalo.blogspot.com.es/2014/07/hybrid-logical-clocks.html>

<https://research.google.com/archive/spanner.html>

[https:](https://www.cockroachlabs.com/docs/cockroachdb-architecture.html)

[//www.cockroachlabs.com/docs/cockroachdb-architecture.html](https://www.cockroachlabs.com/docs/cockroachdb-architecture.html)

<https://www.arangodb.com>

<http://mesos.apache.org>