

"A Developer will never ask you, 'Hey, what filesystem is that?"

Patrick McFadin



Josh Lee Open Source Advocate *Altinity*

ClickHouse® is a registered trademark of ClickHouse, Inc. Altinity is not affiliated with or associated with ClickHouse, Inc. We are but humble open source contributors

Observability = Visibility + Understanding

50x

Observability data vs system data

What are we storing?

Metrics, Traces, Logs, Profiles, Events
Labels/Tags
Resource Metadata
Graphs & Topologies
Snapshots & Deltas
Configuration (e.g. alerts, users, dashboards)

What do we need for observability?

Fast streaming writes
Efficient compression & storage
Time-oriented management
"Real-time" analytics

"Anything you can do with a group by, that's what analytics is"

—Peter Marshall

More Requirements

Fast multi-row analytics
Full-text search
Tag/label search
Fast, frequent "last point" reads
Updates?

Database Archetypes

OLTP

OLAP

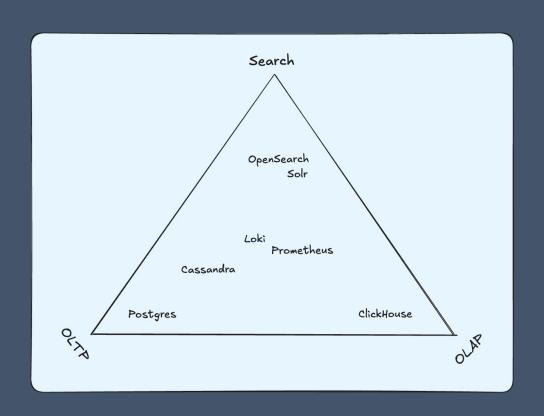
TSDB

Search/Analytics

Introducing the cast of characters

Postgres (OLTP)
Cassandra (OLTP)
OpenSearch (Search & Analytics)
Prometheus (TSDB)
ClickHouse (OLAP)

Taxonomies are challenging

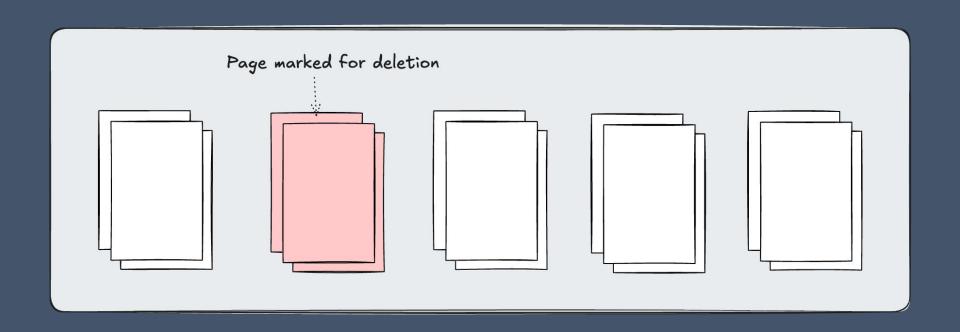


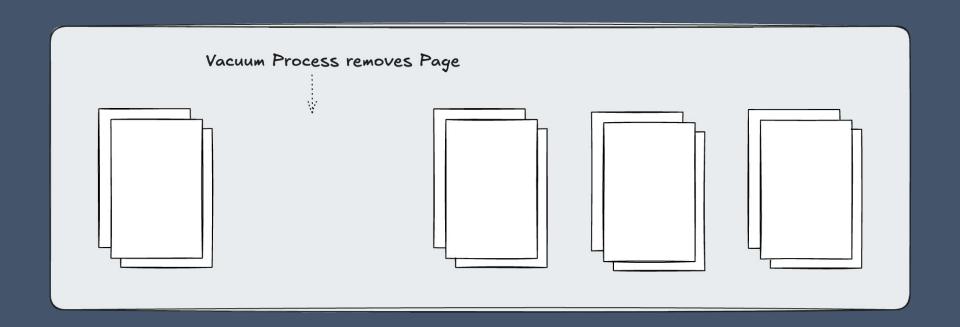
Storage on disk

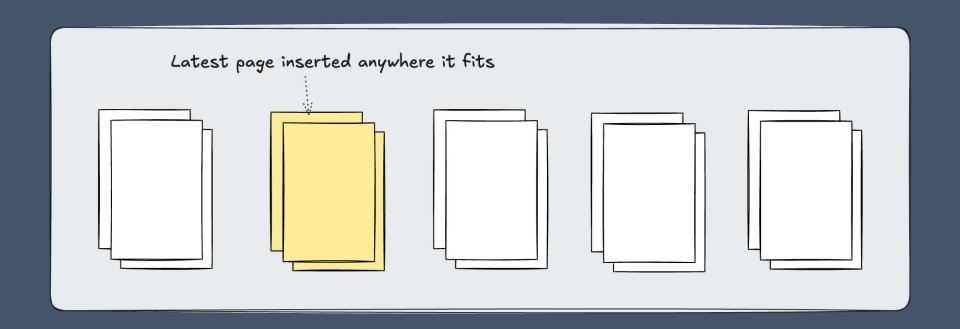
Database Storage Styles

Heap Pages + Commit Log Time-series Blocks Parts / Segments

* the JBOD of storage styles



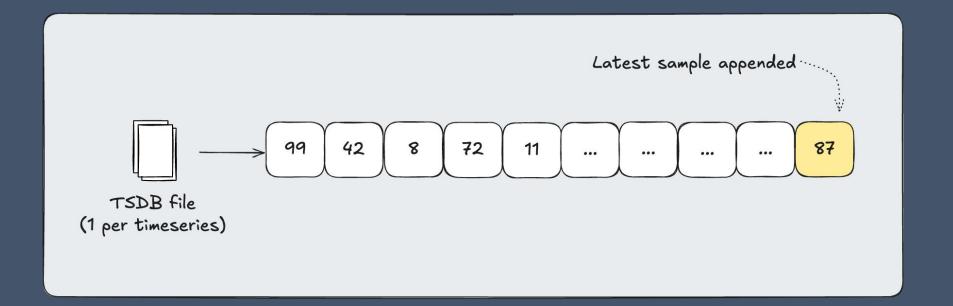




TSDB Blocks

Append-only

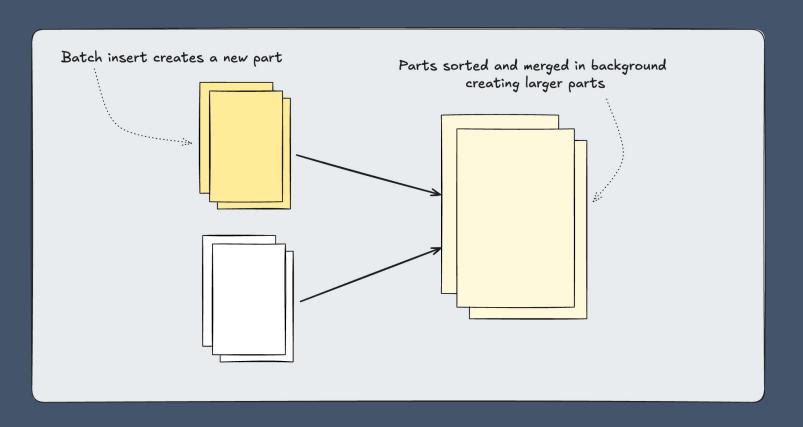
TSDB Blocks



Immutable Parts / Segments

w/ Background Compaction

Immutable Parts / Segments



Writing Data

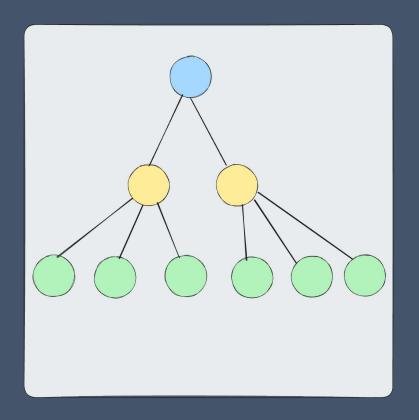
Write Ahead Log (WAL) / Commit Log

Buffered, unordered writes stored on disk

Concurrency Control Strategies

- MVCC + Vacuum
- "Tombstone" deletes
- Last-write wins

Balanced Trees (B-Trees)



Now we can build a Postgres

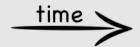
WAL
Heap Pages + MVCC
B-Tree Indexes

Postgres/MySQL/etc.

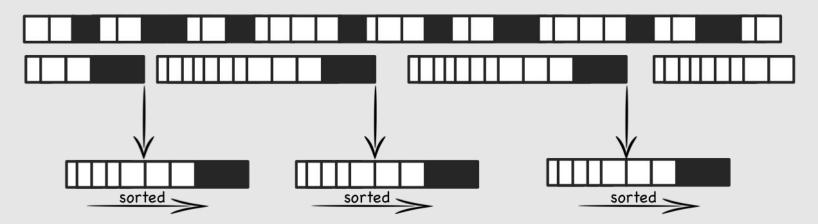
Optimized for updates/upserts and row-level reads Strong ACID guarantees Scaling horizontally is challenging

Analytics & Search Architecture

Log-Structured Merge Tree



Data stream of k-v pairs ... are buffered in sorted memtables



and periodically flushed to disk...forming a set of small, sorted files.

http://www.benstopford.com/2015/02/14/log-structured-merge-trees/

Lucene Family:

Cassandra, Elastic/OpenSearch, Apache Solr

A Lucene Query

```
(title:"database systems" OR content:(postgres OR "clickhouse"))
AND timestamp:[2025-01-01 TO 2025-12-31]
AND NOT tags:deprecated
```

Cassandra

Wide-event Scalable OLTP

Vector Engines & Search

Inverted Indexes

Bloom Filters

Approximate Nearest Neighbor (ANN Graph)

Inverted Indexes

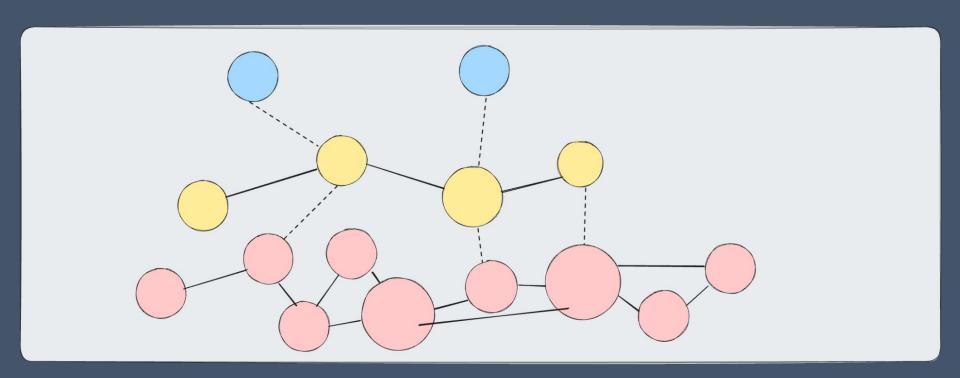
```
"cat" \rightarrow [doc1, doc3, doc7] "dog" \rightarrow [doc2, doc5] "parrot" \rightarrow [doc1, doc4]
```

Bloom Filters

No false negatives

```
"ae7c" → [doc1, doc3, doc7]
"f9b2" → [doc2, doc5]
"8c93" → [doc1, doc4]
```

Approximate Nearest Neighbor (ANN) A way to organize and filter vectors

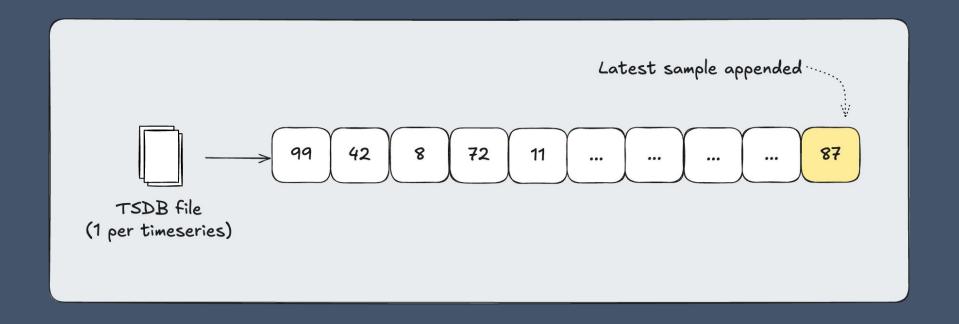


Prometheus (& friends)

Time-series Database

TSDB: Data is naturally ordered by time

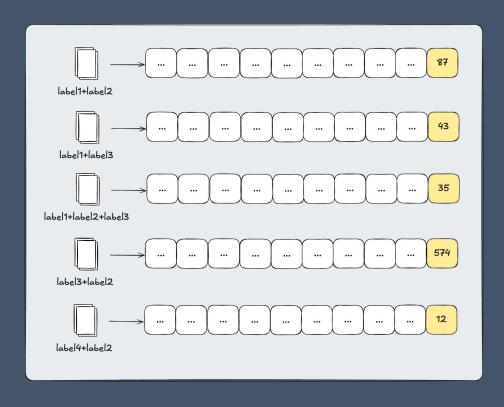
Excellent for frequent reads of last-sample



TSDB

No. of time series = cardinality^dimensionality

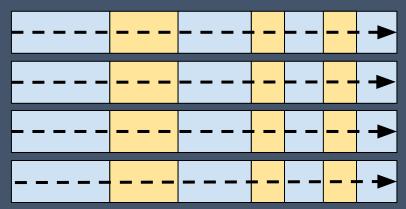
Cardinality Explosions



Row-oriented vs column-oriented storage

Row-oriented Storage

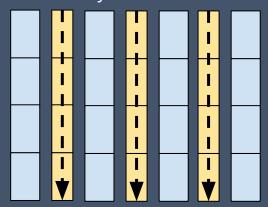
Read all columns in row



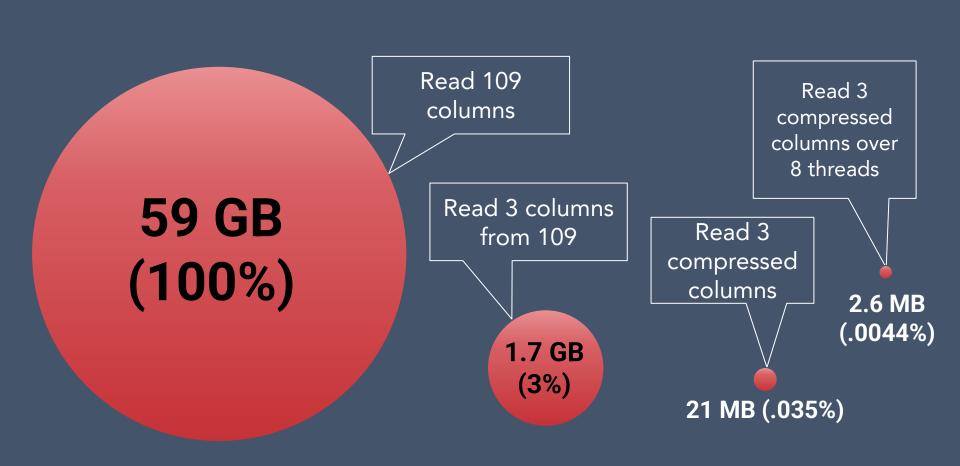
Rows compressed minimally or not at all

Column-oriented

Read only selected columns



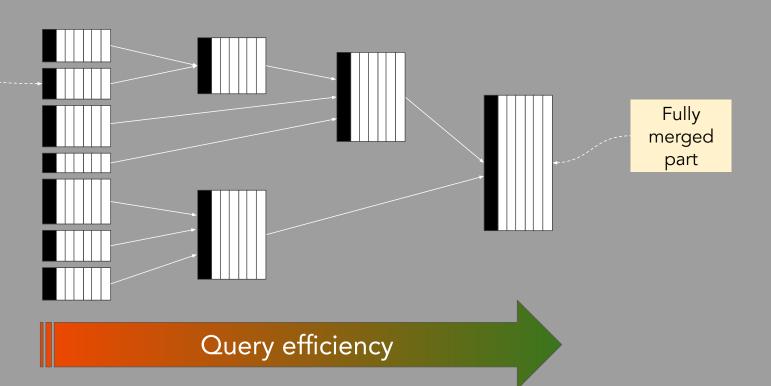
Columns highly compressed



ClickHouse

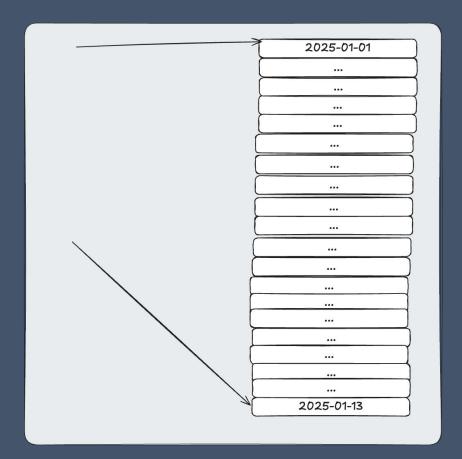
Column-oriented MergeTree

Unmerged, freshly inserted part

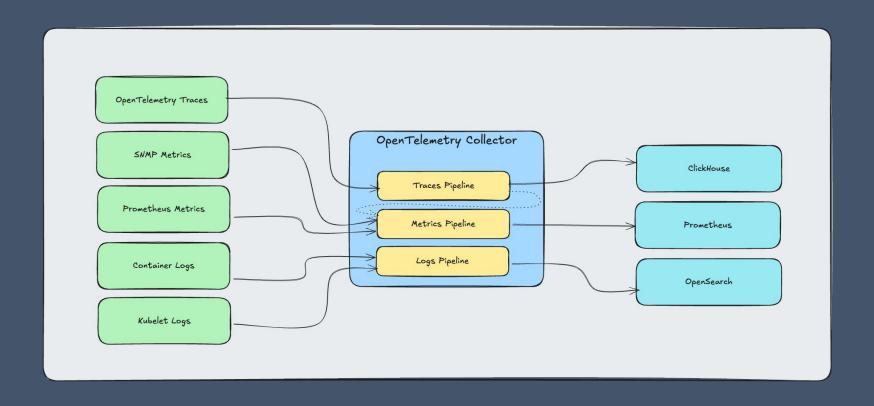


Sparse Indexes

Quickly & cheaply find data based on an ordered key



Which to choose?



VictoriaMetrics TSDB meets MergeTree

Loki Uncomplicated logging (with label indexes)

Honorable Mentions

Cortex, Thanos, Mimir, TimecaleDB, Solr, Druid...

At (very) small scale

Just use what you have until it breaks (Postgres)

Hooked-on full-text search

OpenSearch has your back

One database for everything

ClickHouse is pretty cool

Wide-event analytics

ClickHouse is awesome

Filtering heavily before analyzing

OpenSearch is also a good choice here

Lots of "last-sample" reads + alerts

Choose a TSDB like Prometheus or VictoriaMetrics

Wide-events analytics with transactional guarantees

Cassandra or Postgres->ClickHouse

Database (Orientation)	Style/QL	Storage	Indexes	Use Case
Postgres (Row)	OLTP/SQL	Heap Pages	B-Tree	Update/Upsert with Guarantees
Cassandra (Document)	OLTP/CQL	Lucene Segments	Inverted	Scalable Upserts
Prometheus (Columnar*)	TSDB/PromQL	TSDB files	By label	Time-series metrics, alerting
OpenSearch (Document)	Search/LuceneQL	Lucene Segments	Inverted, Bloom Filter, ANN	Full-text search, analytics
ClickHouse (Columnar)	OLAP/SQL	MergeTree Parts	Sparse, Inverted, and more	Wide-event analytics

