**Magical Mystery Tour:** 

# A Roundup of Observability Datastores

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

Patrick McFadin



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# Observability = Visibility + Understanding

## 50x

Observability data vs system data

# What are we storing?

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

## What do we need for observability?

Fast streaming writes
Fast multi-row analytics
Full-text search
Tag/label search

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

—Peter Marshall

## **More Requirements**

Efficient compression & storage Time-oriented management Fast, frequent "last point" reads Updates?

# Database Archetypes

**OLTP** 

**OLAP** 

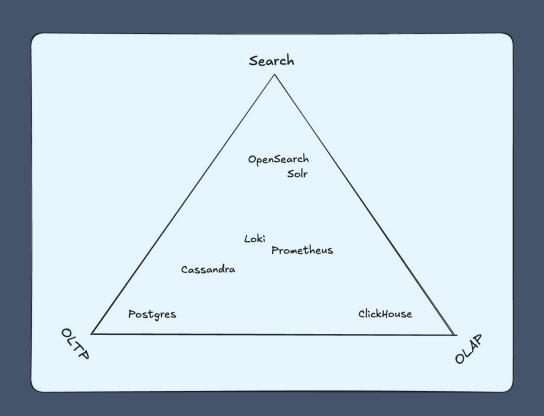
**TSDB** 

**Search/Analytics** 

# Introducing the cast of characters

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

### Taxonomies are challenging



# Storage on disk

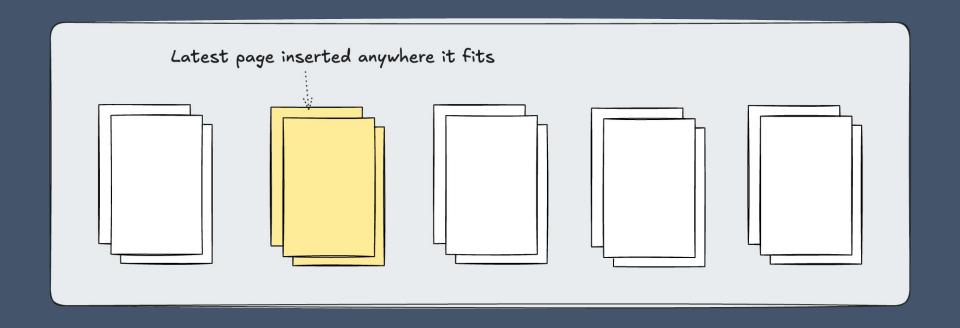
## **Database Storage Styles**

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

### **Heap Pages**

\* the JBOD of storage styles

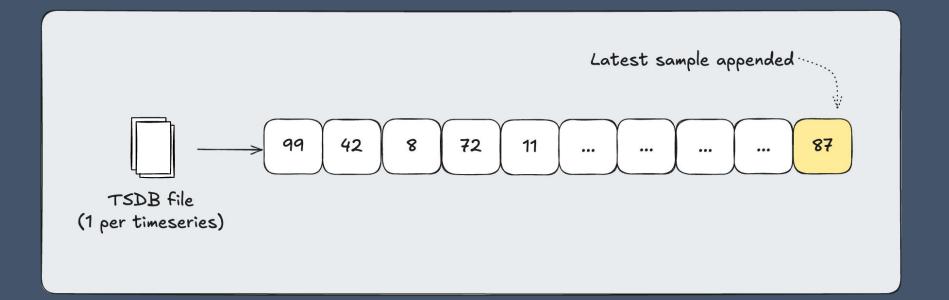
### **Heap Pages**



### **TSDB Blocks**

**Append-only** 

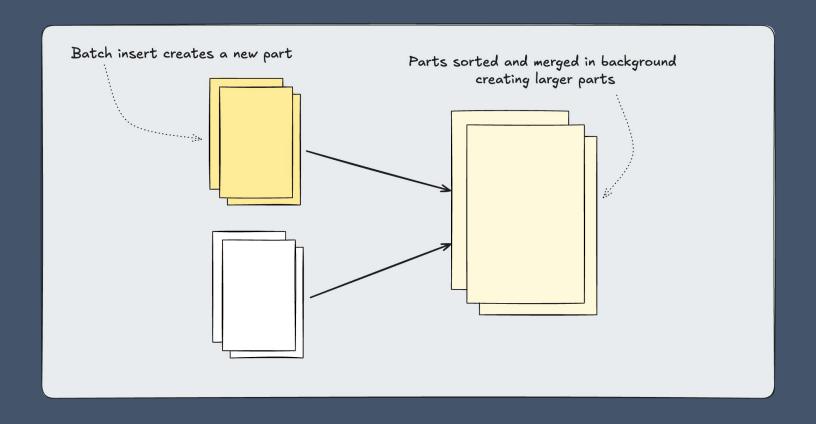
### **TSDB Blocks**



### **Immutable Parts / Segments**

w/ Background Compaction

### **Immutable Parts / Segments**



# **Writing Data**

### Write Ahead Log (WAL) / Commit Log

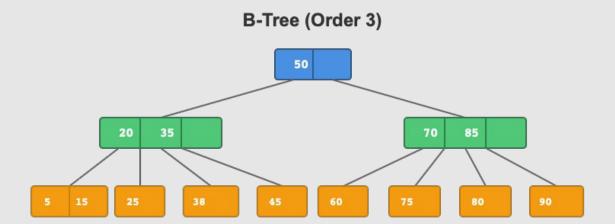
Buffered, unordered writes stored on disk

### **Concurrency Control Strategies**

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

# **Balanced Trees (B-Trees)**

#### **Balanced Trees (B-Trees)**





#### **Key Properties:**

- · All leaf nodes at the same level
- Each node has max 2 keys (order 3)
- · Keys in sorted order within nodes
- · Self-balancing structure

### Now we can build a Postgres

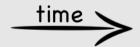
WAL
Heap Pages + MVCC
B-Tree Indexes

### **Postgres**

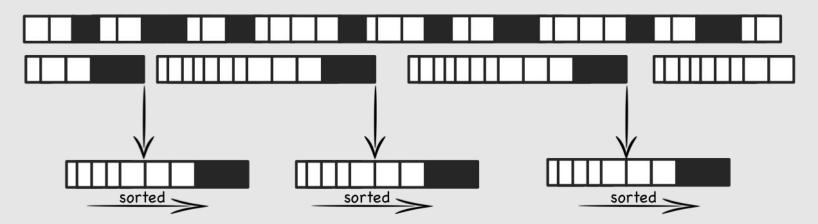
Optimized for updates/upserts and row-level reads Strong ACID guarantees Scaling horizontally is challenging

# 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**

Call me maybe

### **Bloom Filters**

No false negatives

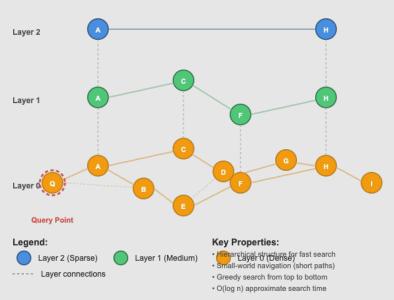
### **Sparse Indexes**

Great for finding parts based on time

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

#### **Approximate Nearest Neighbor (ANN) Graph**

HNSW (Hierarchical Navigable Small World) Structure

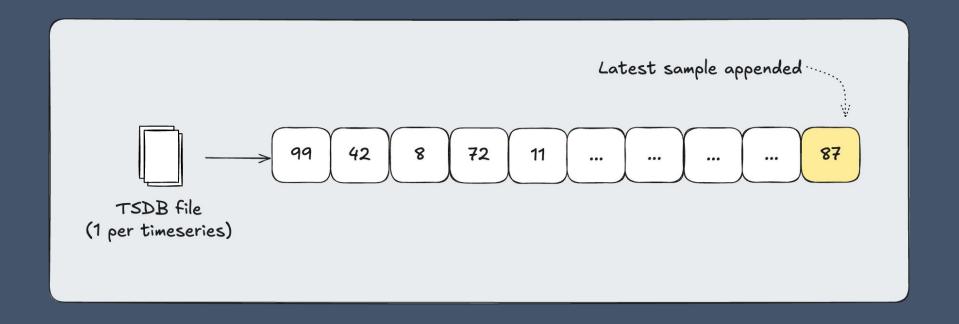


# Prometheus (& friends)

**Time-series Database** 

#### TSDB: Data is naturally ordered by time

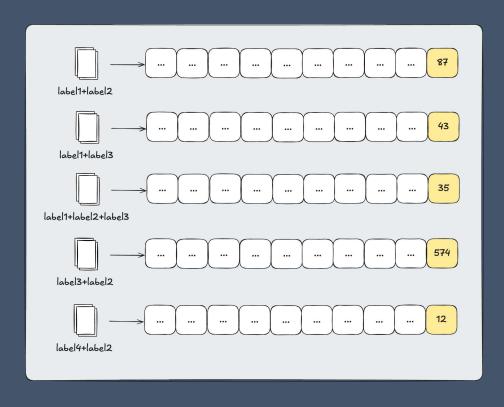
**Excellent for frequent reads of last-sample** 



### **TSDB**

No. of time series = cardinality^dimensionality

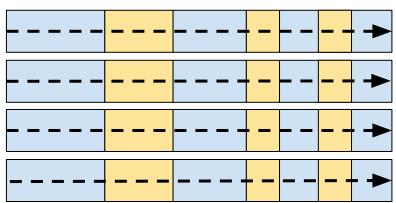
### **Cardinality Explosions**



# Row-oriented vs column-oriented storage

#### Row-oriented Storage

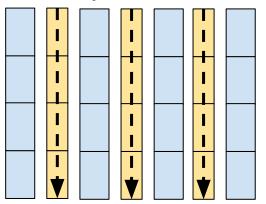
Read all columns in row



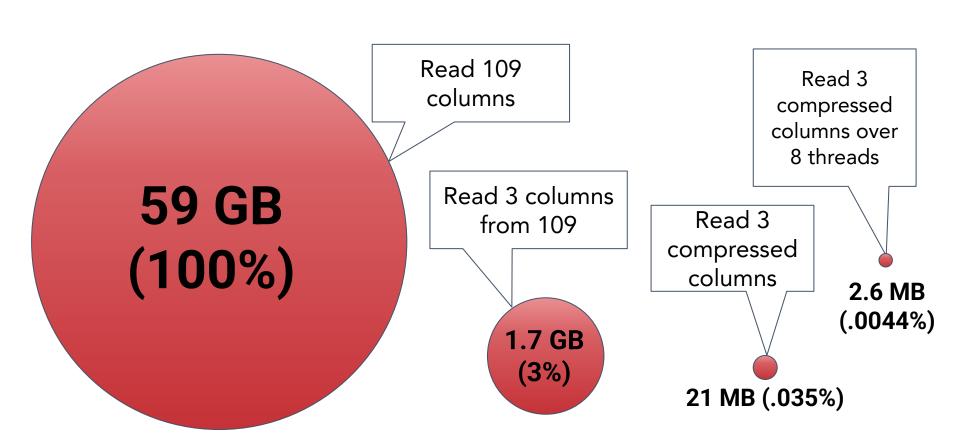
Rows compressed minimally or not at all

#### Column-oriented

Read only selected columns

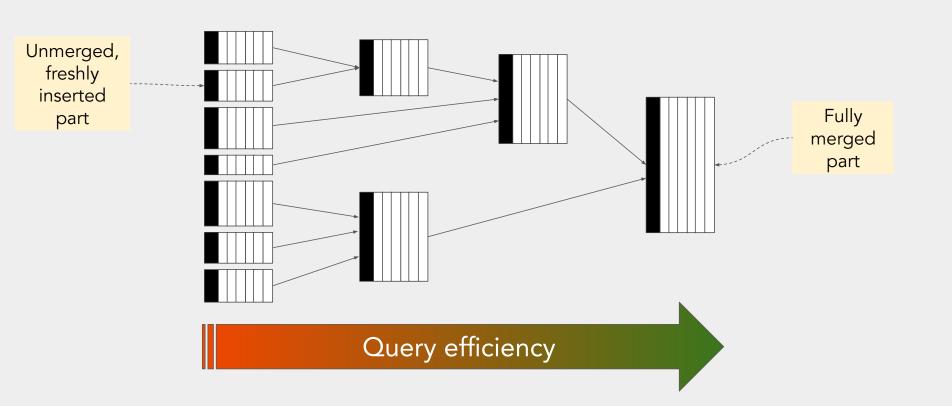


Columns highly compressed



### ClickHouse

**Column-oriented MergeTree** 

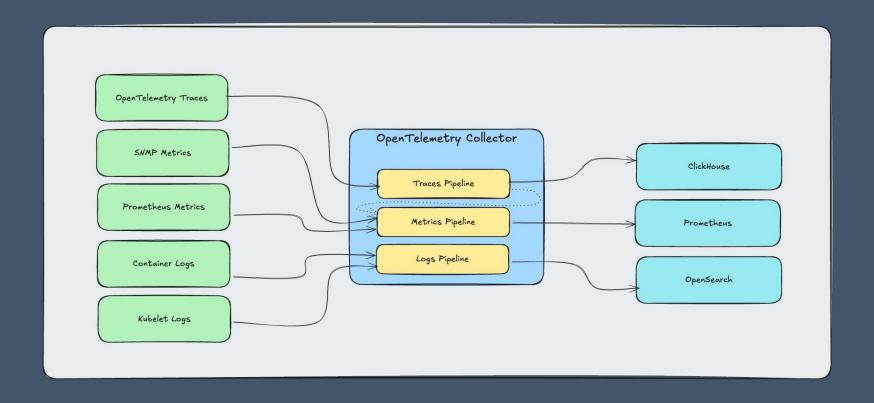


# VictoriaMetrics TSDB meets MergeTree

### **Honorable Mentions**

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

### Which to choose?



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



# Thank you and happy querying!

Josh Lee - Altinity



onnect with me



Resources & slides