How To Take Prometheus Planet Scale - Massively Large Metrics Installations

Vijay Samuel - Architect, Observability
Agenda

Observability @ eBay
Where It Began
How We Solved It
Lessons Learnt
What's Next
Questions
Observability @ eBay

1. **Instrument**
   Developers through open source libraries shipped with managed frameworks instruments metrics, logs, traces.

2. **Onboard**
   Through eBay's Cloud Console, end users let the platform know that their application needs to be monitored.

3. **Harvest**
   Agents deployed across eBay's data centers collect user instrumented data and ship them into Sherlock.io - eBay's observability platform.

4. **Alert**
   Users can set up alerts (threshold based and anomaly detection model based) to be notified of issues in their applications.

5. **Visualize**
   Sherlock.io's console allows users to visualize their data.
## Scale

<table>
<thead>
<tr>
<th>Endpoints Scraped</th>
<th>Ingest Per Second</th>
<th>Active Time Series</th>
<th>Queries Per Second</th>
<th>Raw Metric Retention</th>
</tr>
</thead>
<tbody>
<tr>
<td>1.25 Million</td>
<td>41 Million</td>
<td>2 Billion</td>
<td>8000</td>
<td>1 year</td>
</tr>
</tbody>
</table>
Where it began...

The year… **2018**. Cloud Native is catching up within eBay along with Prometheus becoming more and more popular.

Stand alone Prometheus are now used by individual teams with a growing ask to support Prometheus as a centralized Observability platform offering.

**Legacy System**
- Modified version of OpenTSDB
- Custom protocols, DR inefficiencies, data inconsistencies
- HBase scaling, availability challenges
- Excessive tribal knowledge

**The Need**
- A system that scales a lot better
- Support community focused ingest
- Richer ad-hoc query support
- Support cloud native monitoring
Prometheus

- Short-lived jobs
  - Pushgateway

- Service Discovery
  - DNS
  - Kubernetes
  - Consul
  - Custom integration

- Find targets
  - Prometheus Server

- Storage

- Push alerts
  - Alertmanager
  - PagerDuty
  - Email
  - ... notify

- Prometheus Server
  - HDD / SSD

- Node

- Jobs / Exporters

- Web UI
  - Grafana
  - API clients


Highlights
- Open Source CNCF backed TSDB
- Offers PromQL as a query language
- Simple to operate - single server
- Offers instrumentation clients
- Standard exposition format to announce metrics
- Efficient storage of series with delta-delta encoding
Challenges With Adopting Prometheus

No Support for HTTP Push (at the time)
Necessary for feature parity with legacy platform.
Prometheus didn’t support remote write.

Federated View of Data Was Complicated
Setting up federation over 100s of Prometheus instances is tedious.

Scaling Is Hard
More targets to monitor requires vertical scaling of Prometheus.

Deploying multiple Prometheus to get around vertical limits has operational overheads.
Initial Goals

Keep It Simple
Solving replication is hard. Instead do fanout writes.
Do deduplication at query time.
Use Prometheus TSDB as-is.

Integrate Tightly With Kubernetes
Discover shards using the Kube API Server. An Operator can manage the clusters.

Alerting and Recording
End users must be able to onboard recording and alerting rules.

Simple Tenanting
Route “namespaces” to dedicated clusters of Prometheus TSDBs

Support PromQL and Grafana
End users must be able to fully leverage Grafana to build out their user experiences.

Support Twice The Cardinality Limits Of Legacy Platform
Boy! Were we surprised with the outcome :)}
The First Pass - Centralized
**Data Flow & Availability**

Reads / Writes are routed based on tenant availability by controlling the number of deployed replicas across Kubernetes clusters.
Storage Discovery & Management

Replica resources contain deployment, partitioning, and tenanting details.
Challenges Still...

Can’t Keep Up With New Use Case Onboarding
   Platform grew 100% YoY many years in a row.
   2 → 4 → 8 → 16 → 24 → 40M/sec ingest

Hard To Support High Cardinality
   A single TSDB cluster has horizontal limits before deteriorating query performance

Tenant Based Query Routing Is Flawed
   Reserved _namespace_ keyword always required.
   Prevents supporting things like Labels API

Too Many Dependencies Involved
   Load balancers, cross region networks involved in monitoring path.
Introducing Aggregators...

Drop Labels Before Series Hits Storage
Stream based aggregation of raw series.

Massive Savings!
60% CPU, 80% Memory savings as compared to doing recording rules to drop cardinality

Raw Labels Aren’t Always Necessary
Some labels like containerID churn a lot and aren’t queried as much.

High Cost To Store Raw Series
Each series on Prometheus Head block has a cost that adds up as we store more raw series.

Higher the cardinality, greater the storage cost.
Let’s Take Things Planet Scale...
Unveiling Of Monarch

Google published a white paper on Monarch; it’s “planet scale time series database”

Like every curious engineer we went - “is it possible to replicate this inside of eBay”

Stating The Obvious…

- We don’t have the same awesome tech that Google has :)
  - Substitutions need to be made with Open Source technology
- Spec management is critical
  - GitOps
- The white paper is all that we had to go with
  - Some aspects weren’t fully talked about.
Anatomy Of A Planet Scale Installation

Data is closer to the source
- Deployed per Region / AZ / Kubernetes cluster
- Number of tiers are composable based on scale requirements

Rollups Get Bubbled Up
- Leaf - Stores raw data
- Zone - Rolled up data for the given region
- Root - Higher level roll ups (user queries)

Queries are federated
- Field Hint Indices provide knowledge on where a series might reside
- Scatter queries to only matched targets.
- User is oblivious to the data layout

Delivery through GitOps
- Manage specs of leaves/zones/root on Git
- Control loops watch over Git and deliver the changes into the cluster
Ingest Routing - Overview

Root
- Root Ingest DNS
- Ingestor
- TSDB

Zone
- Zone Ingest DNS
- Ingestor
- TSDB

Leaf
- Leaf Ingest DNS
- Ingestor
- TSDB
- Scraper

Legend:
- Ingest Data
- Persist State
- Write
Query Routing - Overview

Root

Indexer

Querier

Root Query DNS

Other Roots

Zone

Zone Router

Leaf

Indexer

Querier

TSDB

Other Zones

Cluster 1

...

Cluster N

Execute Queries

Persist State

Query

Index
Query Pushdown & Projection

```
histogram_quantile(0.9,
  sum by (cluster, le)
    rate(etcd_request_duration_seconds_bucket[5m]))
```

TSDB Querier

Execute Queries
Persist State
Pushdown
Read
Merge
What Did We Get Out Of This...

Better Scaling Capabilities For High Cardinality
Leafs per Kubernetes cluster or AZ can break down the cardinality into more manageable chunks.
Zones have rolled up data that is easier to query.
More runway for growing needs of end users.

Better Ingest/Query Performance
Internal gRPC based optimized ingest and query APIs cheaper on network.
Query pushdown + projection ensures the root only sees rolled up data with required set of labels.

Independently Usable Metricstores
Each leaf / zone is now a fully functional metricstore than can be independently used for visualization and alerting.

Fixed Shard Sizing
Horizontal scaling based on zone/leaf installations allows fixed size shards.
Easier to operate.
Lessons Learned

Independently Usable Metricstores
Each leaf / zone is now a fully functional metricstore than can be independently used for visualization and alerting.

Internal APIs Aren’t a Bad Thing
Reusing the Prometheus contract end-to-end wasn’t required.
Internal gRPC based API had massive cost savings.
Enabled query push-down and projection.

GitOps Makes Life Easy!
Ensures changes are reviewed, automated and easy to roll back.
A spec can never be lost.
A massively distributed system can’t succeed without proper spec management!

Continuous Observation And Evolution Is Key
Learning new tricks goes a long way!
Sometimes that rewrite we shy away from is probably necessary ;)


What’s next

Automatic Rollups
Metrics being ingested at the leaf can be automatically rolled up and stored in the zone.
Drop high cardinality labels like pod, node, etc.
Queries can be intelligent to pull data from the right tier.

Support Native Histograms
How would query push down work?
How much would we save in cardinality?

Open source... Maybe?
If you think that this is interesting... let’s chat :)

Questions?
Thank you