



#### Context

We take measurements from things. We make pictures from that data. We do offline analytics on that data. We do stream-based analytics for real-time alerting.

Simple, right?



#### Constraints

Billions of unique things being measured.Millions of measurements per second per thing.Things can be disconnected for a while.Multi-tenant.



## Agenda

#### Components

Message Queues Storage operations Storage performance Analytics

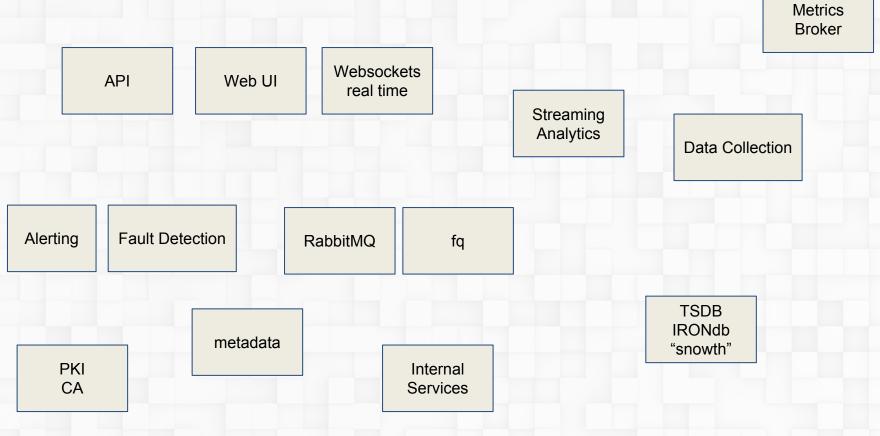
#### **Problems**

Performance and isolation
Space, ops burden
performance, and scale
Streaming vs. historic, model, performance





#### Architecture





#### Message Queues

More macroservice than microservice.

Components learn via control messages.

The streaming analytics and fault-detection services see measurement data.



## The failure of RabbitMQ

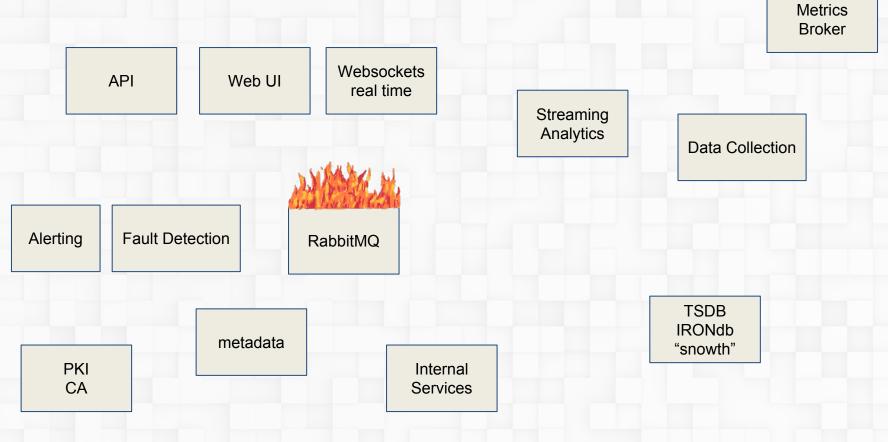
All software will break outside of operating parameters. RabbitMQ has/had:

- 1) poorly documented operating parameters
- 2) horrendous failure pathologies.

A failed data plane is disruptive. A failed control plane is debilitating.



#### Architecture



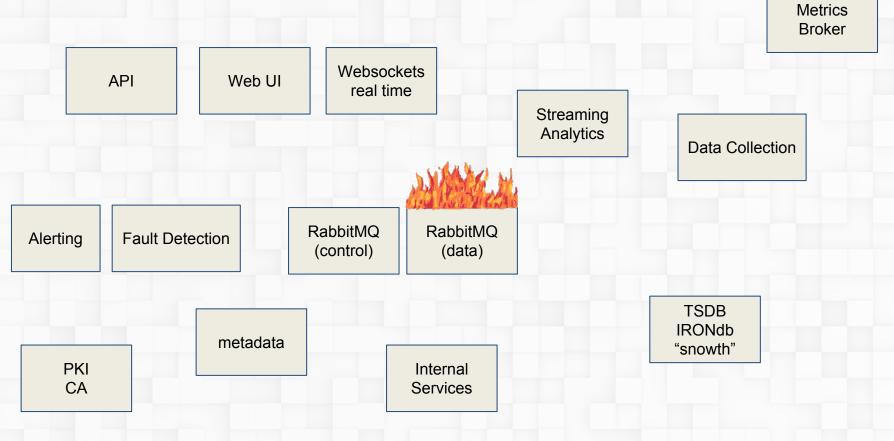




Separate our control plane and our data plane by running two completely independent RabbitMQ instances. This successfully isolated tragedy in our environment to the data plane.



#### Architecture







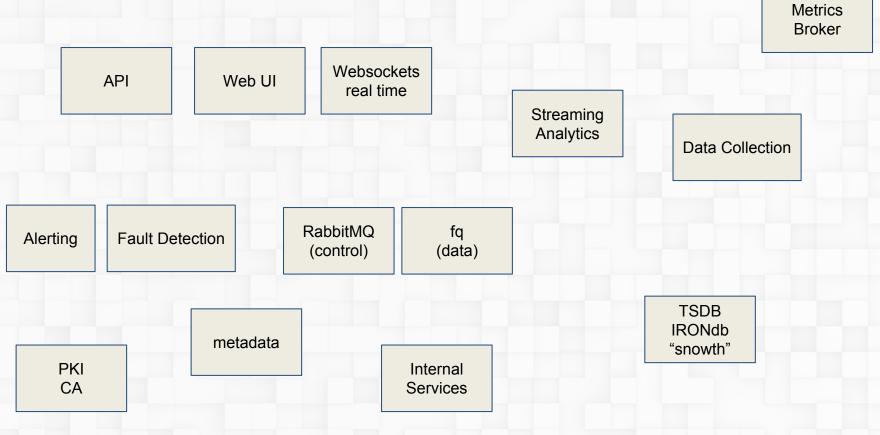
Authored and deployed fq for the data plane.

It is faster and more accommodating of our data patterns than Kafka.

If Kafka were available at the time, we'd have gone with that and not looked back... "good enough."

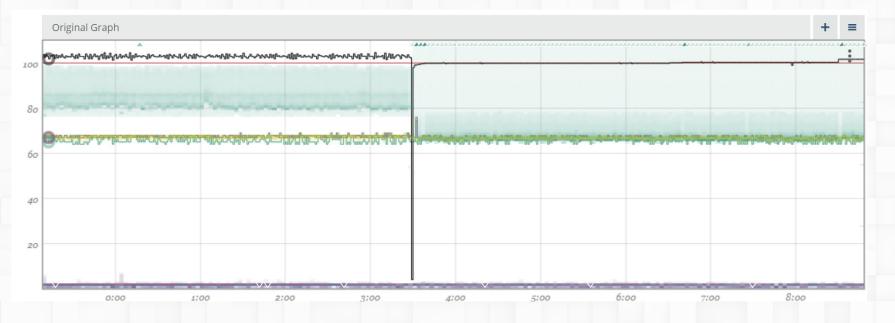


#### Architecture





#### Tracking end-to-end latencies







At launch (2010), we stored metrics in a highly dense columnar format in PostgreSQL (similar to how Timescaledb works)

Operational burden upon node failure was too high. Storage considerations were too inefficient. All "fixable," but it was clearly the wrong tool for the job.



#### We defined our own storage format.

- "NNT" statistical aggregate storing 7 aggregation facets per rollup.
- LMDB-backed block-extent format.
- OpenZFS safety and laz4 compression.
- 8.5 bits per facet in practice.



#### We defined our own storage format + histograms

- Ilhist a sparse 46k bin histogram format with an upper limit of 5% error.
- rocksdb stores time-series histograms in Ilhist format.

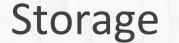


We built our own database: "snowth" now "IRONdb"

This was a huge endeavour with bold operational goals:

- Zero points of failure.
- Recovery and rebuild with no operator intervention.
- Resizing with minimal operator intervention.





Wait. Stop. Building a database is a cardinal sin.

Why build a DB when we've got: InfluxDB, Cassandra, Riak, OpenTSDB, etc.?

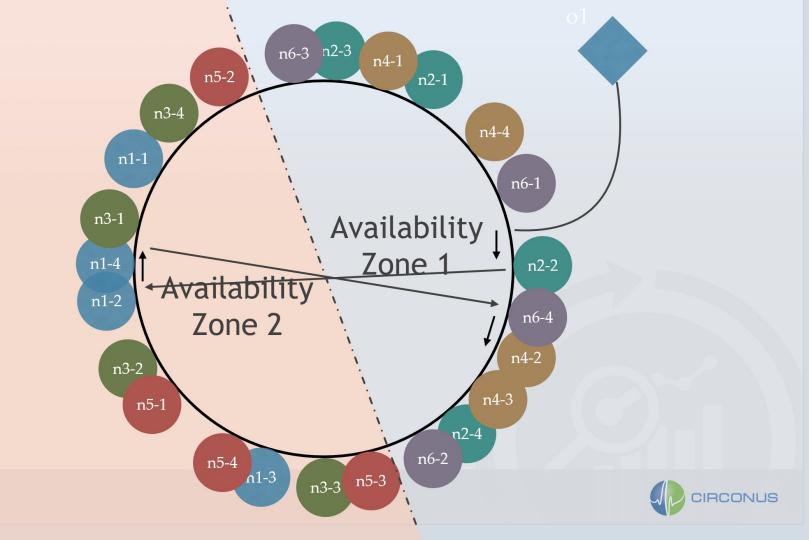
1) It's 2010
 2) We realized our problem scope was smaller.

- a) Incredibly predictable write patterns
- b) Commutative operations



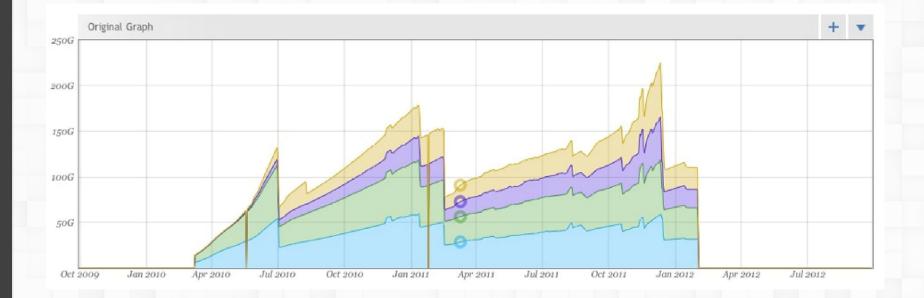
Performance, scale, and resiliency requirements:

- 1) Nodes on different continents
- 2) Full region failure
- 3) Uninterrupted ingest on failure
- 4) Uninterrupted read/analytics on failure
- 5) More than 1MM records/second/node sustained ingest





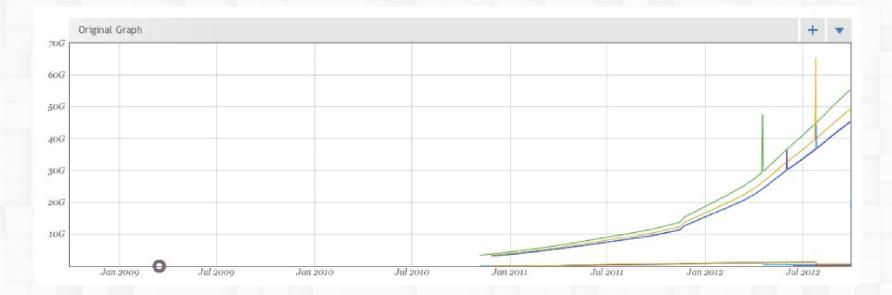
## PostgreSQL







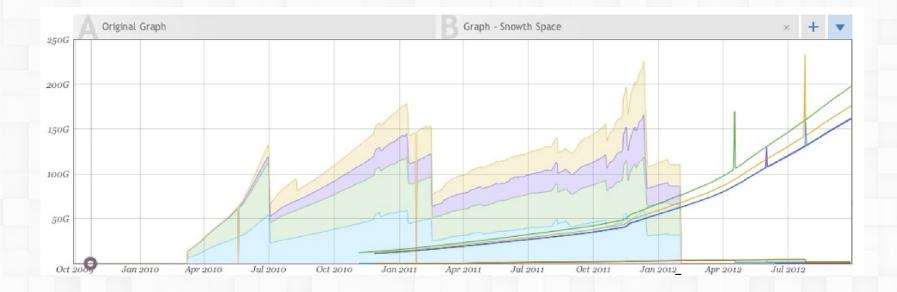
## snowth







## 11 months of safety

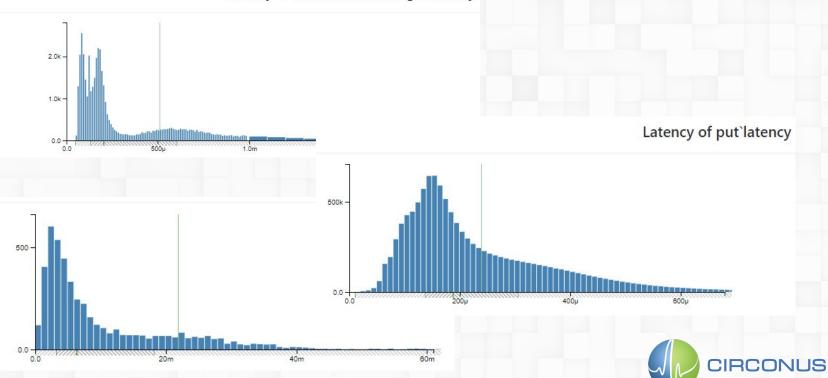






#### Histogram instrumentation

Latency of snowth.db.hist.60.get`latency



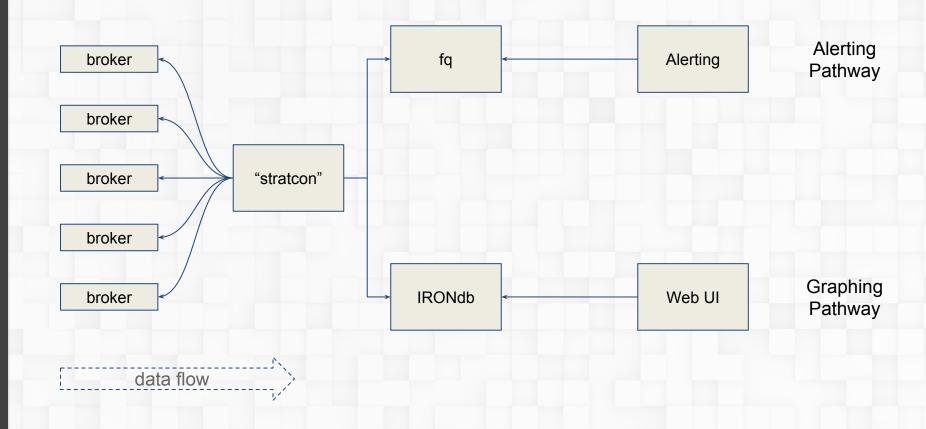


## Zipkin instrumentation

S	0.19ms	0.39ms		0.58ms	0.77m
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	/rollup/(^([0-9a-fA-F]		A-F]{12})/(.+)\$) Se	ervice: snowth-00011114   Duration: 0	e-afe4-d8eb69ff0cb8/nnt
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## Circonus in 2010: No Analytics.





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#### Feature: Stream Analytics

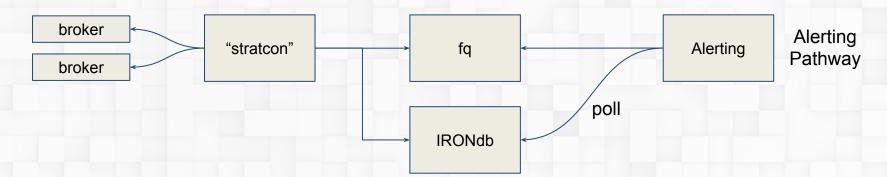
#### Allow the user to:

- Alert on forecasted values
- Alert on histogram percentiles

• Alert on custom analytics transformations (CAQL)

• Compute anomaly detection on all incoming metrics

#### First Approach: Polling the DB



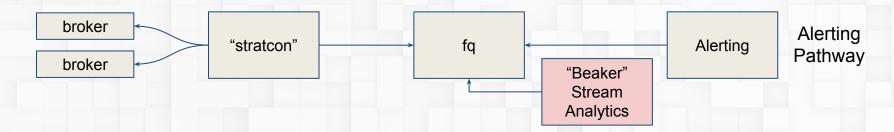
\* Alerting component reaches out to IRONdb every minute
\* Analytics transformations are computed on IRONdb from stored data

Tech: Java

Pros/Cons:

- + Simple
- High latency on metric data (seconds-minutes)
- Constant load on database
- Not suitable for alerting on all metrics

### Stream Analytics (2015): Beaker



\* New component "Beaker" executing stream transformations \* reads & writes data to fq

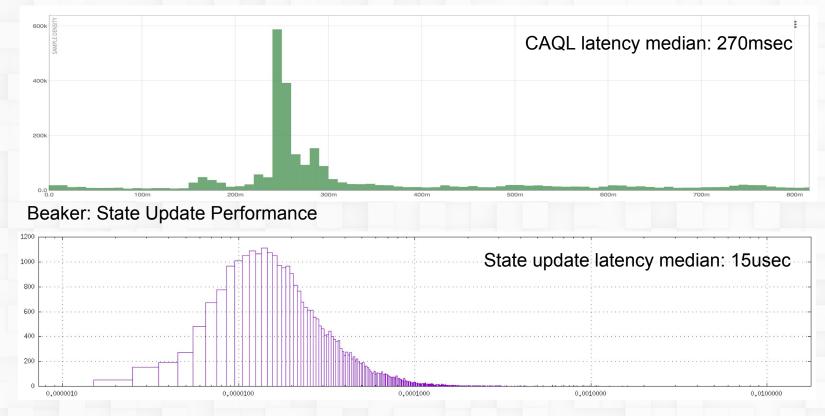
Tech: C++/luajit

#### Pros/Cons:

- + Minimally invasive architecture
- + Avoid load on IRONdb
- + Reuse existing analytics code-base (luajit)

## Performance of Beaker vs IRONdb

#### IRONdb: CAQL Query Performance





## The Regrets of Beaker

- (1) Minimal Architecture Changes =/= Minimal Product Changes
- (2) Intransparent alerting behavior. Missing History.
- (3) Underestimate development effort to build operations tooling
- (4) Requirement Oversight: Cross metric aggregation



#### **Regrets of Beaker: Cultural Aspects 2015**

New CEO: "When can I sell this?"

New CTO: "Don't break stuff."

New Team: "What is OmniOS?"

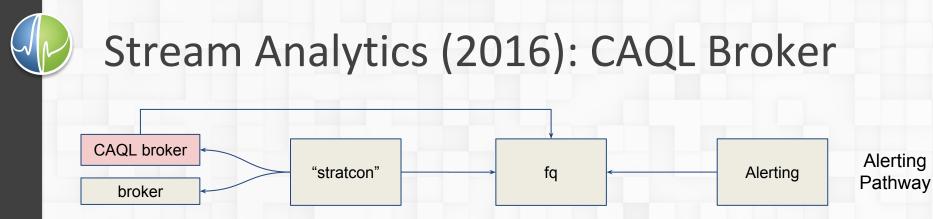


#### **Regrets of Beaker: Cultural Aspects 2016**

New Old CEO: "We need to redo this."

Old Team: "Yeah. It's not pretty."

New New CTO: "Why not re-use our broker tech?"



\* Repurpose existing broker tech for stream analytics

\* Publish results as metrics into the system

Tech: C/mtev/reconnoiter/luajit

#### Pros/Cons:

- + Reuse existing analytics code-base (luajit)
- + Reuse existing server framework inc. ops tooling (libmtev)
- + No new concepts for the UI
- High observability needs

# A

## CAQL Broker: Observability is Key

- CAQL state is kept over days and weeks
- Many issues can't be replicated in dev

> Need to understand the system while it's running!

- Extensive logging of state changes
- Instrumentation (/stat.json, RED, USE)
- Introspection capabilities (telnet, web)

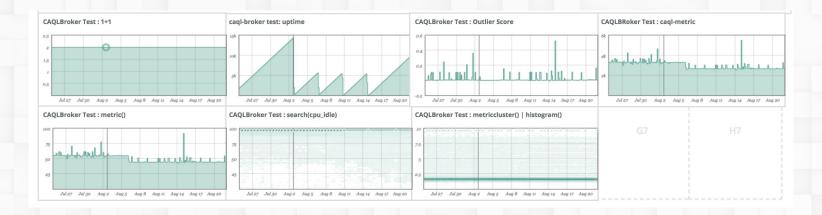


## CAQL Broker: Monitoring





## CAQL Broker: Self Monitoring



# **A**

### Log Analysis: "Poor man's Splunk / ELK"

./harvest.sh caqlbroker{1..5}.dev.circonus.net
make log.sqlite

# Top-5 slow queries

sqlite3 log.sqlite ".mode line" \

'select duration, query from log order by duration desc limit 5'

# Duration histogram

sqlite3 log.sqlite ".mode csv" 'select duration from log' \

| feedgnuplot --histogram 0 --binwidth 0.1 --with boxes

## **CAQL Broker: Check inspection**

Circonus CAQL Broker Overview Checks 🗯 Internals

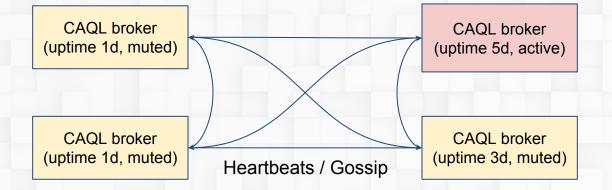
5230	000000000000000000000000000000000000000	C_1900_233	zuo::caqi	caqı	qcaqi	init ios	-м
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Check De	etails		Check	Config			
Last run	6971a639-d07d-466f-8dfb- f984c01703a0 qcaql c_1_168429::caql caql 1m 10s filterset_23419 2018/07/23 15:14:21 (3m25s ago) 2018/07/23 15:15:21 available good		query		9 d d d	netric:counter("e0ct 94d0-42a7-a46e- Id808f460ce2","excl delay(0,1d,2d,3d,4d,4 outlier:std_score(tri normalize=2)	hange 5d,6d)

Metrics			
Name	Туре	Value	
output[1]	double	0.0000000000e+00	

# AP

## CAQL Broker: High Availability

- \* Oldest node sends data
- \* Checks are replicated among cluster nodes
- \* Versioning of checks is operator provided
- \* Network partitions result in double submissions (OK)





## HA is a Game Changer for Ops

#### Without HA:

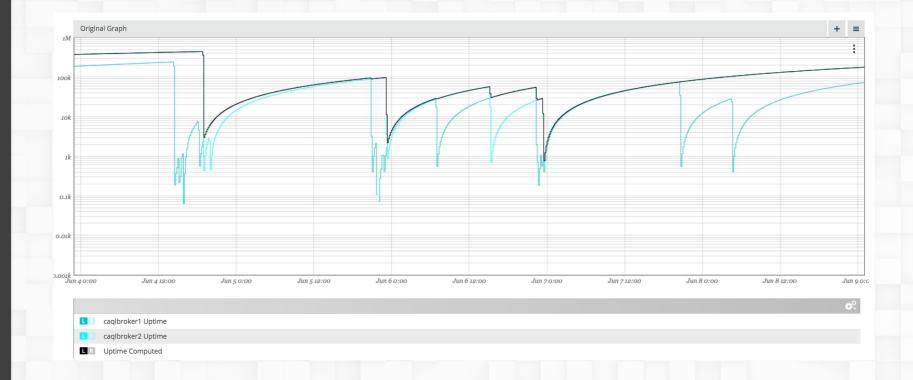
- Every update means downtime (1-3Min)
- Immediate rollback if any issue is hit (<5M)
- Try to reproduce in dev/stage

#### With HA:

- Deploy to standby node first
- Can debug stuff in prod for a good hour with low risk



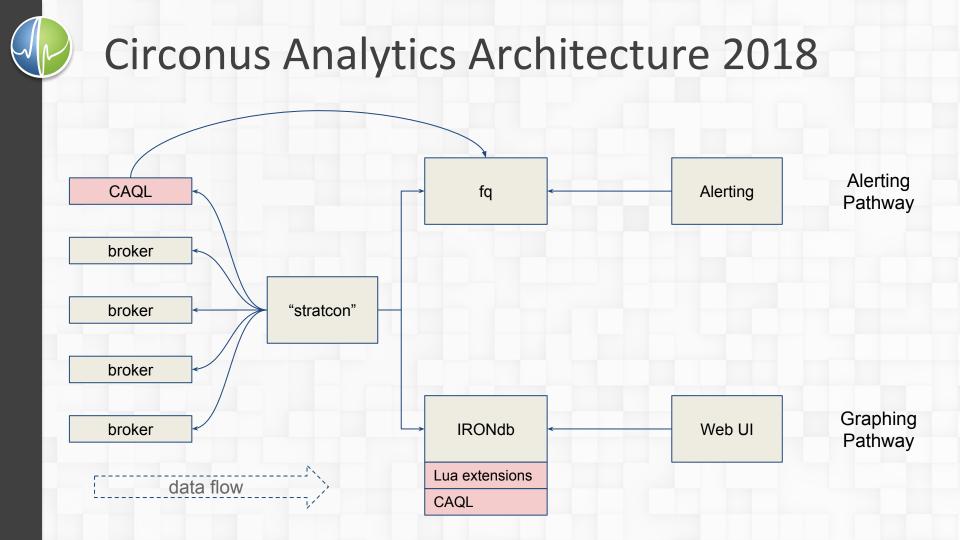
## CAQL Broker: Deployments gone wrong





#### Reminder: Don't run GC ... ALL THE TIME.





#### Lessons Learned

- With time as a real imposed constraint, your mistakes will include mistakes you knew would bite you. This is technical debt leveraged for time-to-market.
- Once you've been served a collection notice, focus on operability with a higher priority that correctness; you're unlikely to get either perfect & operability will pay dividends sooner.
- Instrumenting systems and retaining performance data is the only way to know you've actually succeeded, so get on that.
- Build systems resilient enough to allow risky behavior in production up to an including developing in production.