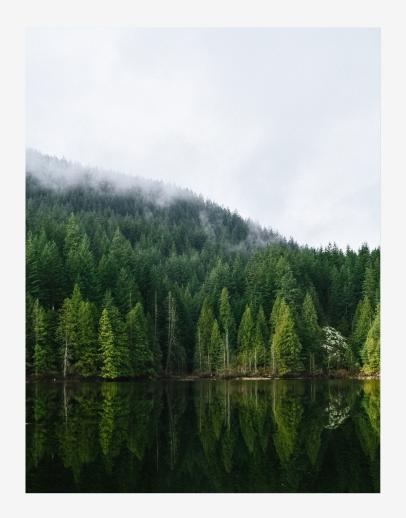
# real-time analytics for small data teams



matt helm

head of analytics materialize





shopify
merchant analytics
11 years



materialize
internal analytics
1 year

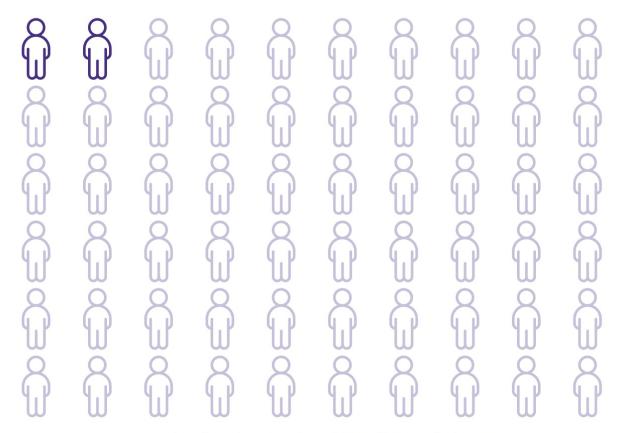
## analytics team



matt



jonathan







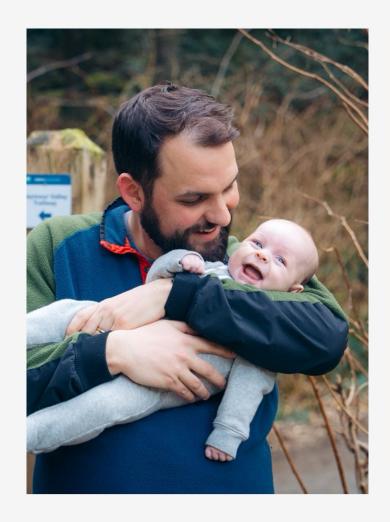
batch 8 hours

hot-loop

15 minutes

real-time

2 seconds



"i am an enthusiast, not a sponsor,

matt helm

## historical reporting

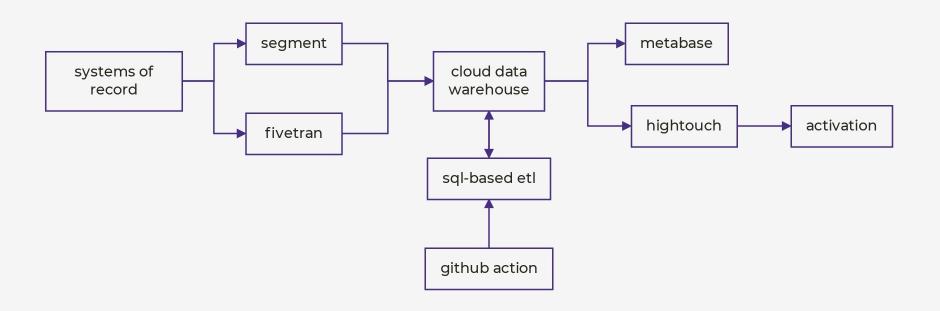




day-to-day metrics

business reviews

## architecture



## sql-based etl

```
-- purchases.sql

CREATE OR REPLACE TABLE purchases AS (
...
)
```

```
-- run.yml
on:
schedule:
- cron: '0 */8 * * *' -- every 8 hours
```

## operational workflows









authentication

expiration dates

access control

resource limits

alerting

customer support

marketing

product marketing

batch
8 hours

hot-loop
15 minutes

real-time
2 seconds

## sql-based etl

```
-- purchases.sql

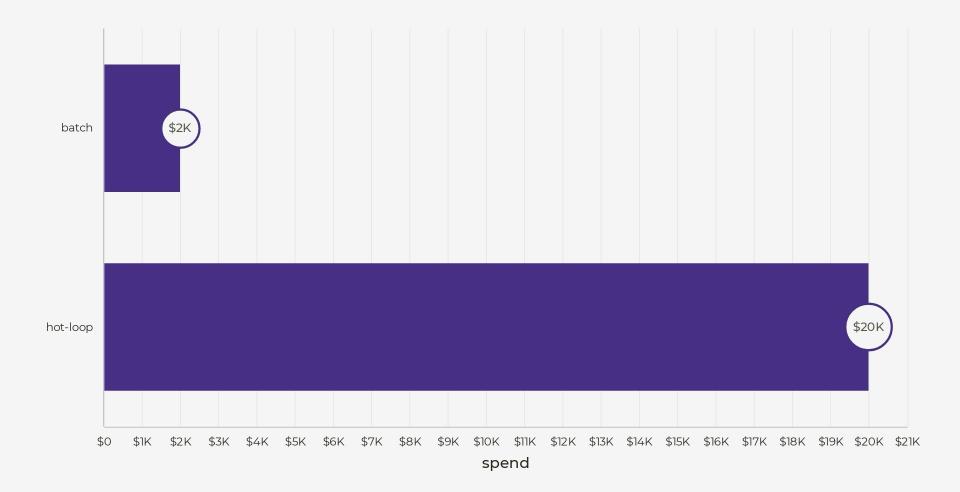
CREATE OR REPLACE TABLE purchases AS (
...
)
```

```
-- run.yml
on:
schedule:
- cron: '*/10 * * * *' -- every 10 minutes
```

latency

## 15 minutes ♥ 97%

vs 8 hours with batch



## hot-loop

more complex than batch processing



### noisy errors in slack

running dbt 4,000 times per month meant rare but flaky errors created meaningful noise in slack



### orchestrator

an increasing number of dbt pipelines meant we couldn't run our whole dbt project each time

batch
8 hours

hot-loop
15 minutes

real-time
2 seconds

## sql-based etl



drop and re-build

new data on each refresh



deploy once

always up to date

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- Special pages
- Printable version
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Want to edit, but don't see an edit button when logged in? Click here.

### Incremental View Maintenance

This page describes Incremental View Maintenance (IVM) proposed in pgsql-hackers.

Contents [show]

### Overview

PostgreSQL has supported materialized views since 9.3. This feature is used to speed up query evaluation by storing the results of specified queries. One problem of materialized view is its maintenance. Materialized views have to be brought up to date when the underling base relations are updated.

Incremental View Maintenance (IVM) is a technique to maintain materialized views which computes and applies only the incremental changes to the materialized views rather than recomputing the contents as the current REFRESH command does. This feature is not implemented on PostgreSQL yet. Implementing this into PostgreSQL core was proposed firstly at PgCon 2013 Developer Meeting and [1] [1] [2] . There were also other discussions on IVM [3] [4] [4] . The first patch was submitted in 2019[5] [6].

### Basic Theory of IVM

IVM computes and applies only the incremental changes to the materialized views. Suppose that view V is defined by query Q over a state of base relations D. When D changes D' = D + dD, we can get the new view state V' by calculating from D' and Q, and this is re-computation performed by REFRESH MATERIALIZED VIEW command. On the other hand, IVM calculates the delta for view (dV) from the base tables delta (dD) and view definition (Q), and applies this to get the new view state, V' = V + dV.

In theory, the view definition is described in a relational algebra (or bag algebra) form. For example, a (inner) join view of table R and S is defined as V = R × S.

When table R is changed in a transaction, this can be described as R  $\leftarrow$  R -  $\forall$ R +  $\Delta$ R, where  $\forall$ R and  $\Delta$ R denote tuples deleted from and inserted into R, respectively. (To be accurate, instead of - and +, - and ⊎ are used by tradition in bag algebra.) In this condition, the deltas of the view are calculated as  $\nabla V = \nabla R \bowtie S$  and  $\Delta V = \Delta R \bowtie S$ , then the view can be updated as  $V \leftarrow V - \nabla V + \Delta V$ .

### Multiple Tables Modification

For example, suppose that we have a view V joining table R,S and T, and new tuples are inserted to each table, dR, dS, and dT respectively.

V = R\*S\*TR new = R + dRS new = S + dST new = T + dT Blog > Company News Feb 18, 2020

## **Introducing Materialize: the Streaming Data Warehouse**

Materialize offers a streaming data warehouse for real-time analytics & interoperability with millisecond latency, revolutionizing data handling.





Arjun Narayan



Sign In

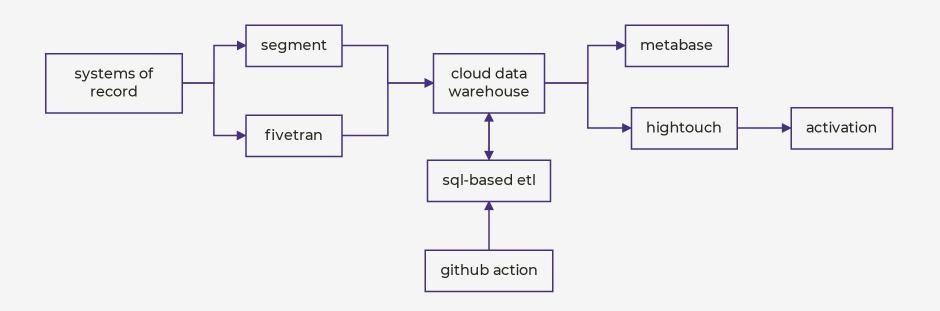
Databases, and data infrastructure generally, have made substantial progress over the years.

We now have access to cloud-native infrastructure that allows just about anyone to set up, maintain, and query databases at substantial scale. This is a serious

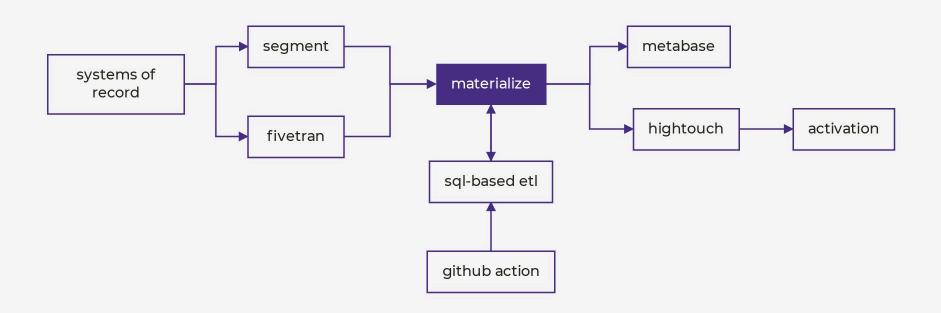
SEE MATERIALIZE IN ACTION

SIGN UP FOR A LIVE DEMO >

## architecture



## architecture



## business impact

compared to hot-loop

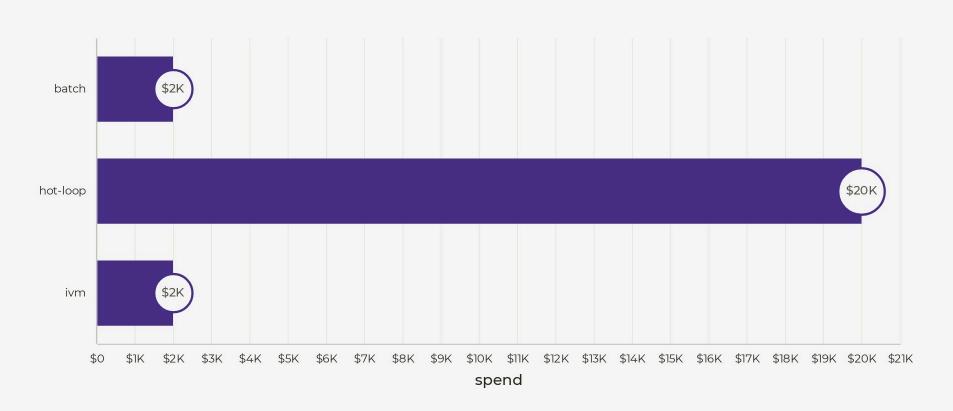
latency

2 seconds ♦ 99.8%

vs 15 minutes with hot-loop

## business impact

compared to hot-loop



## developer experience

compared to hot-loop



less noisy
no longer hitting flaky errors



less complex

no longer need complex orchestration

## developer experience

compared to stateful stream processing



### streaming data lake

easily ingest, process, and hold your company's streaming data



### automatic backfills

new views are backfilled automatically



### sub-second query engine

connect BI tools and run ad-hoc queries with consistent results

## business impact

compared to **stateful stream** processing



### ready out-of-the-box

no need to build your own data platform



### easy to build

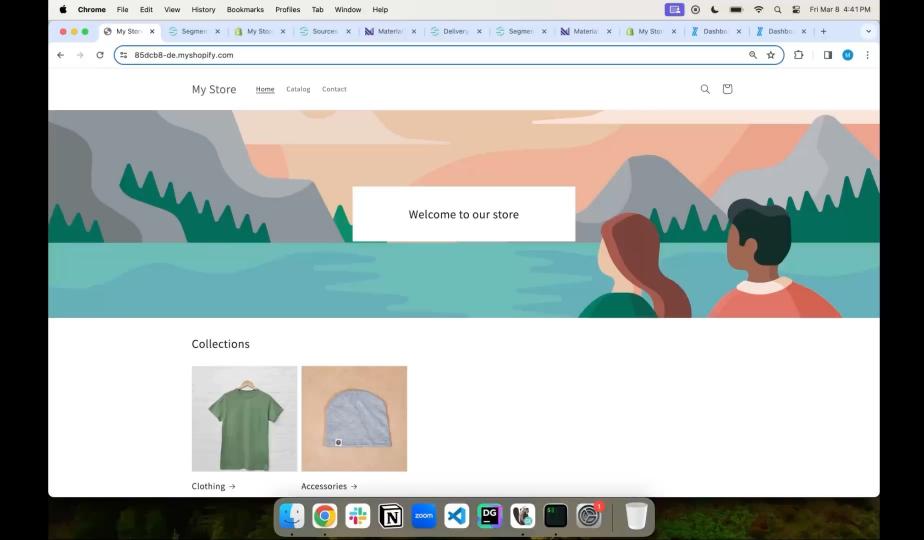
prototype, iterate on, and ship new analytics in an afternoon

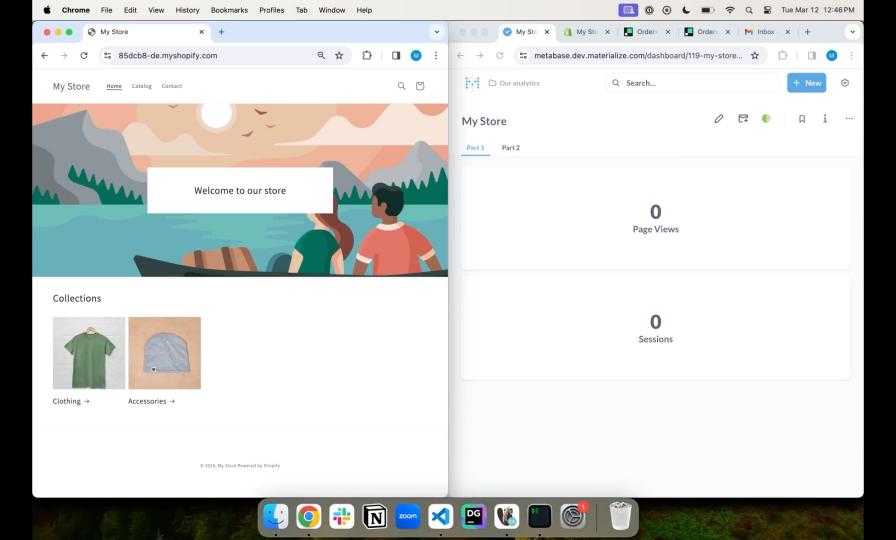


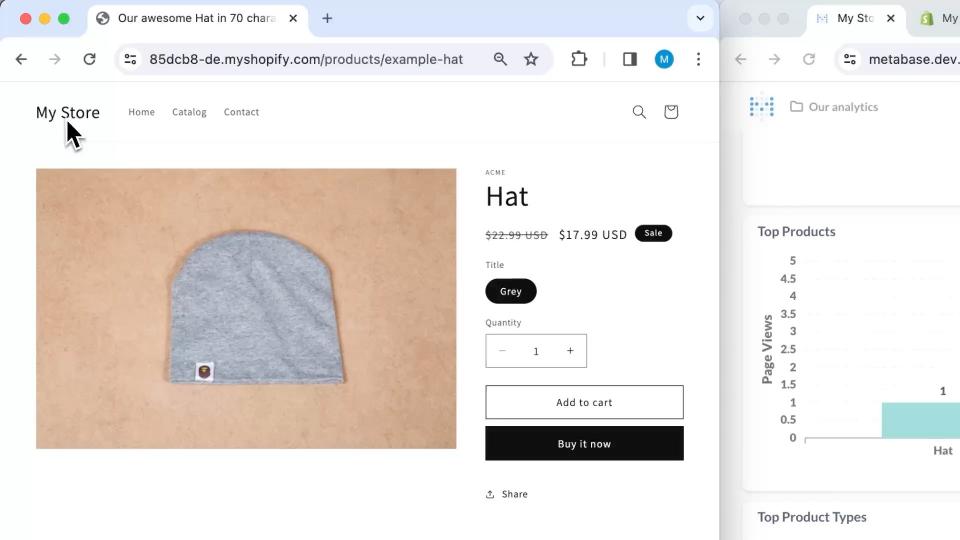
### easier to hire

build real-time datasets as easily as batch









## analytics today

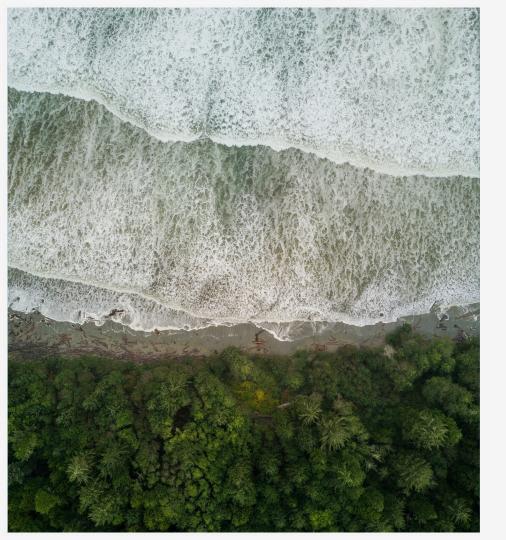
- sql-based etl is as prevalent as ever
- operational workloads benefits from real-time
- real-time has been inaccessible

## what's changing

- incremental view maintenance is emerging as an alternative to full drop and re-builds
- materialize makes real-time far more accessible than stateful stream processing

## opportunity

- any of us can try real-time analytics, including small teams of analytics engineers
- enables analytics teams to enable more operational workflows



thank you