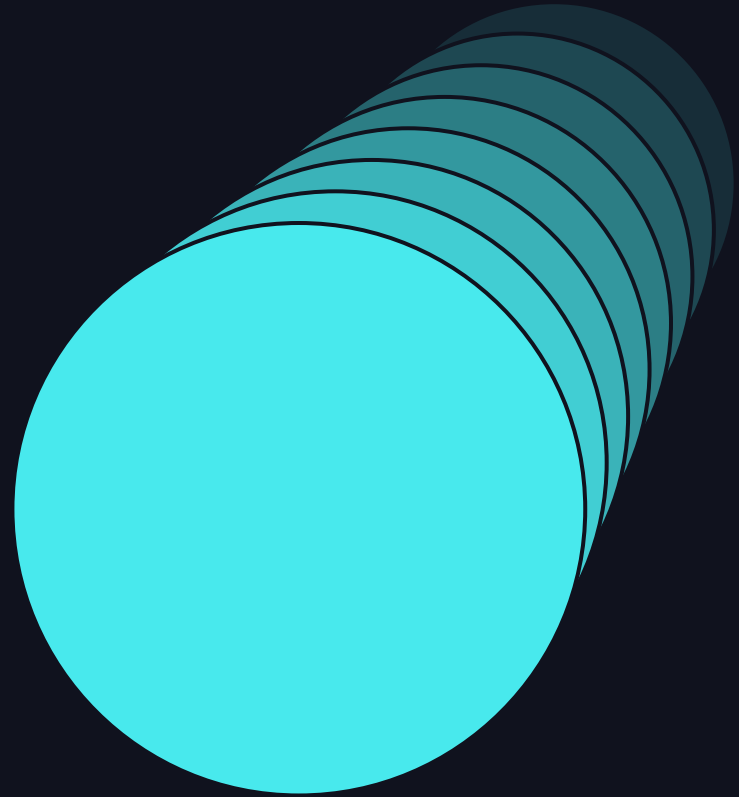


# Power Up Your Lakehouse with Git Semantics & Delta Lake

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Oz Katz, June 2024

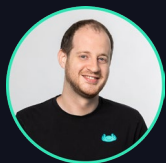




# HI



Oz Katz



CTO, Co-Creator @ lakeFS



[github.com/ozkatz](https://github.com/ozkatz)



[@ozkatz100](https://twitter.com/ozkatz100)

Lottie the Axolotl



CCO, Mascot @ lakeFS



[github.com/treeverse/lakeFS](https://github.com/treeverse/lakeFS)

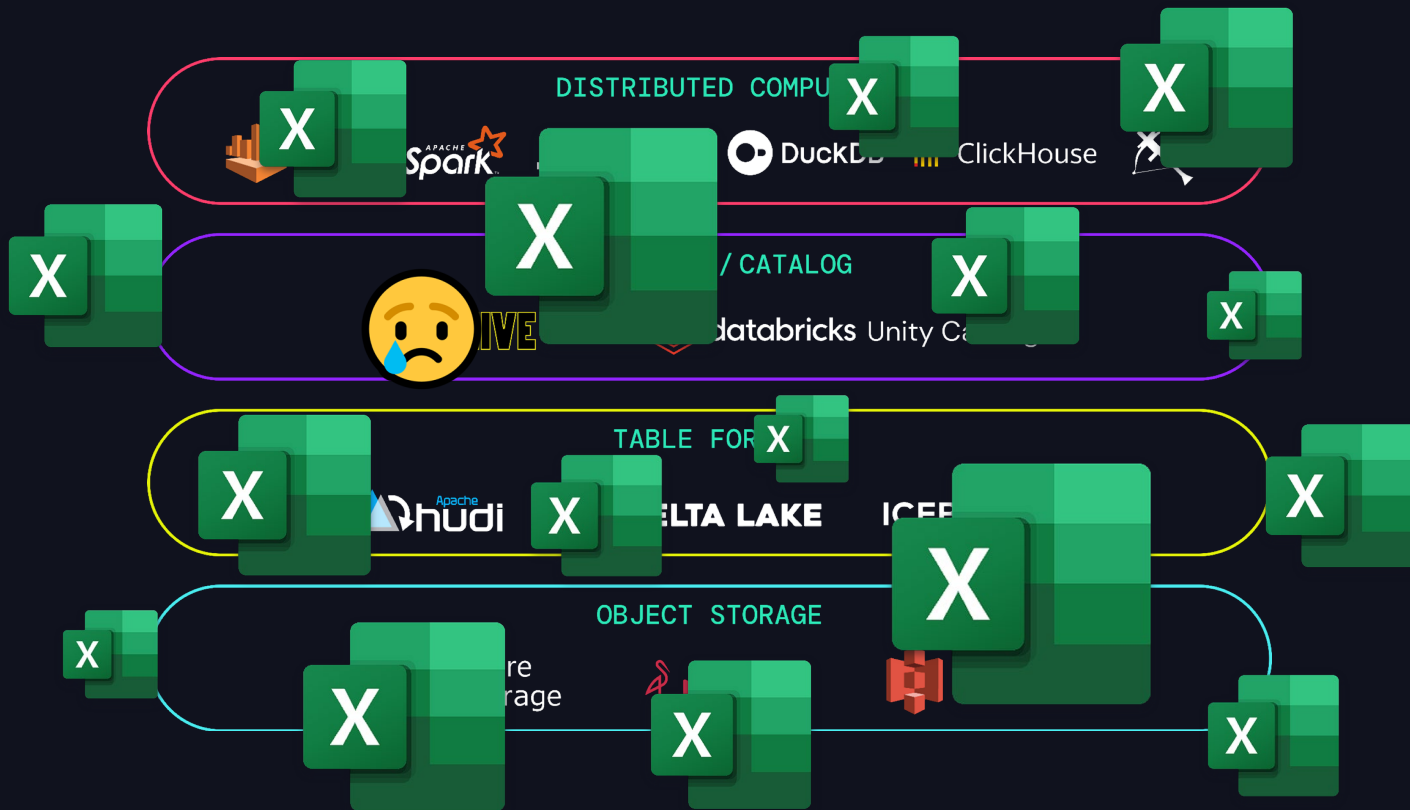


[linkedin.com/company/  
lakefs-treeverse/](https://linkedin.com/company/lakefs-treeverse/)



# YOUR DATA LAKE

Might look something like this



# Data Lake Resiliency

## Ingredients

Reproducible outputs



Write-Audit-Publish



A big red button



# REPRODUCIBLE OUTPUTS

## Why should we care?

- code + data = output
- Improving either requires a feedback loop!

But also



# ACHIEVING REPRODUCIBILITY

## Thank You, Delta Lake Time Travel

```
SELECT * FROM image_classification  
WHERE label <> 'Hot Dog'  
WHERE version < 5238
```



Hot dogs over time

# ACHIEVING REPRODUCIBILITY

## Across Tables?

```
SELECT * FROM images VERSION AS OF 5238
JOIN labels VERSION AS OF 83111 ON ...
JOIN image_licensing VERSION AS OF 3489 ON ...
JOIN privacy_settings VERSION AS OF 2371 ON ...
JOIN exif_info VERSION AS OF 45821 ON ...
WHERE label <> 'Hot Dog'
```



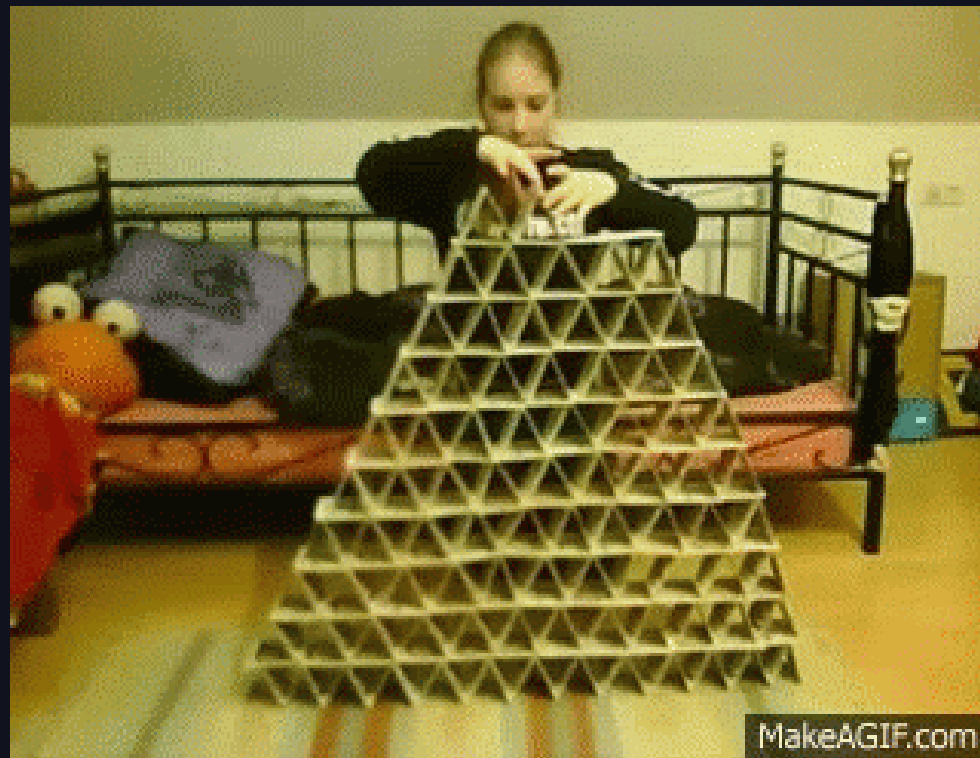
Hot dogs over time



# WRITE-AUDIT-PUBLISH

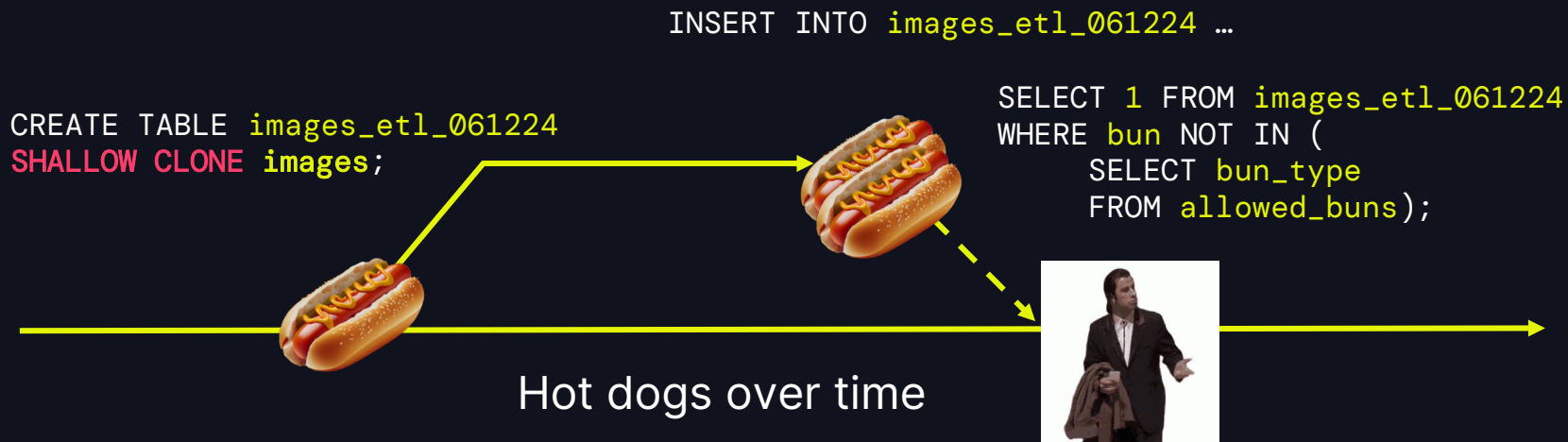
## Why should we care?

- All datasets have downstream consumers
- All failures cascade
- But successes cascade *harder*



# ACHIEVING WRITE-AUDIT-PUBLISH

## Delta Lake Shallow Clones

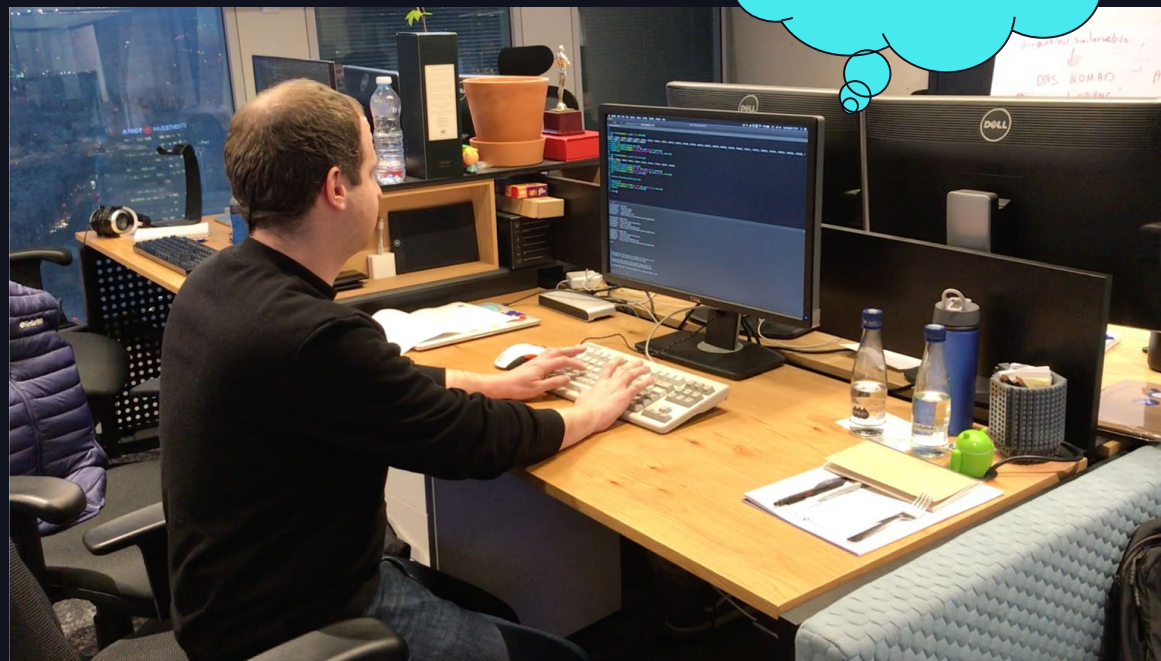


# BIG RED BUTTONS

A story about how *\*someone\**  
completely F\*\*\*ed production

# BIG RED BUTTONS

T-3h



# BIG RED BUTTONS

T+1m

OH BOY

-6h

NOW

- Task Failed.
- Task Fa
- Task Fai
- Task Fail
- Task Failed.
- Task Failed.

- 66572+00:00 [failed]>
- 03724+00:00 [failed]>
- 37093+00:00 [failed]>
- 48914+00:00 [failed]>
- [failed]>
- [failed]>



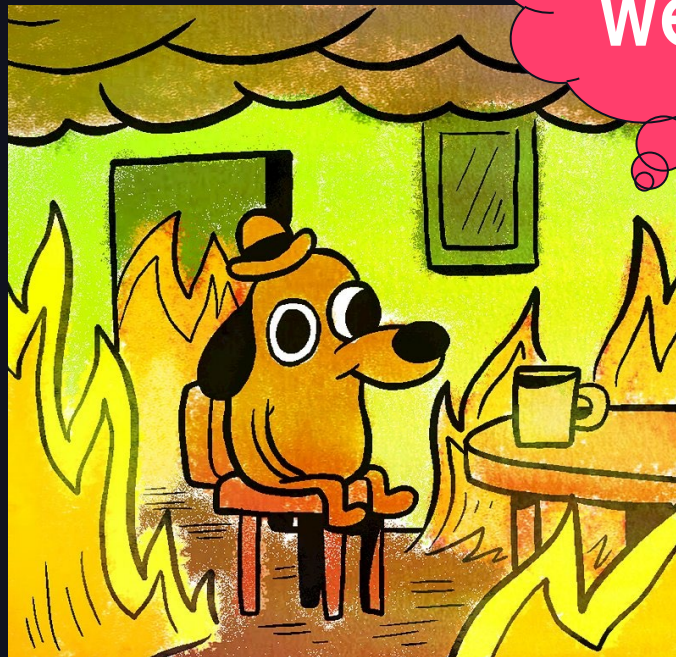
# BIG RED BUTTONS

T+12h



# BIG RED BUTTONS

T+2  
weeks



# BIG RED BUTTONS

## Delta Lake's RESTORE... AS OF

```
RESTORE TABLE images  
TO VERSION AS OF 2392;
```





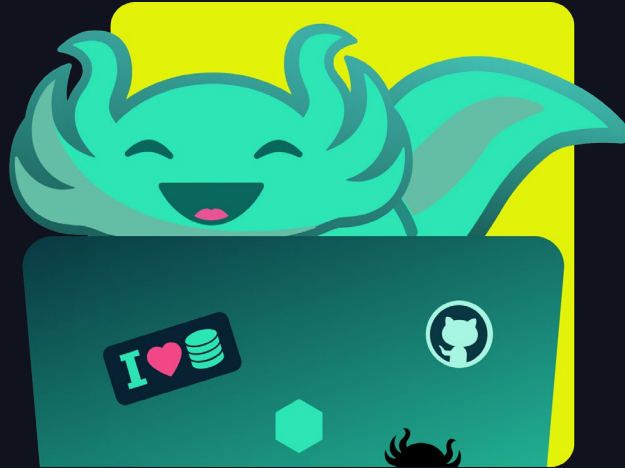
# ACHIEVING PROD ROLLBACKS

WITH 2,340 PRODUCTION TABLES



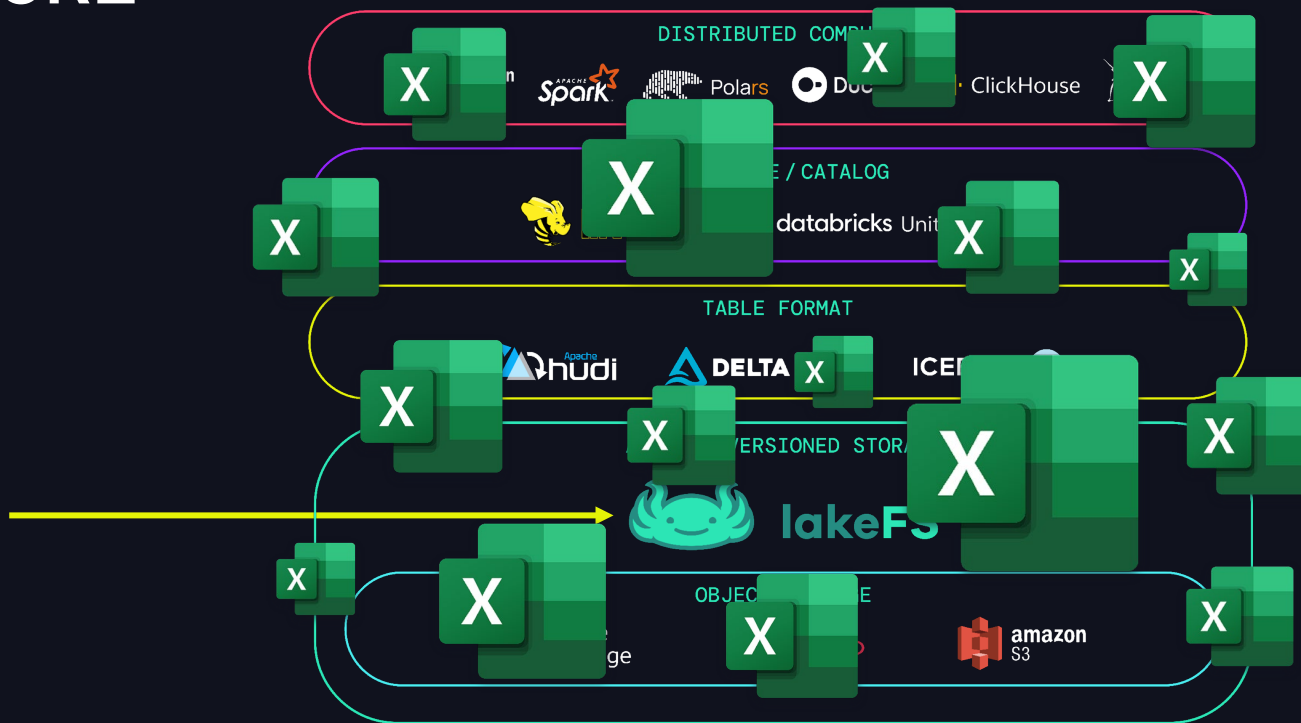
# POWERING UP WITH GIT SEMANTICS

# REMEMBER ME?

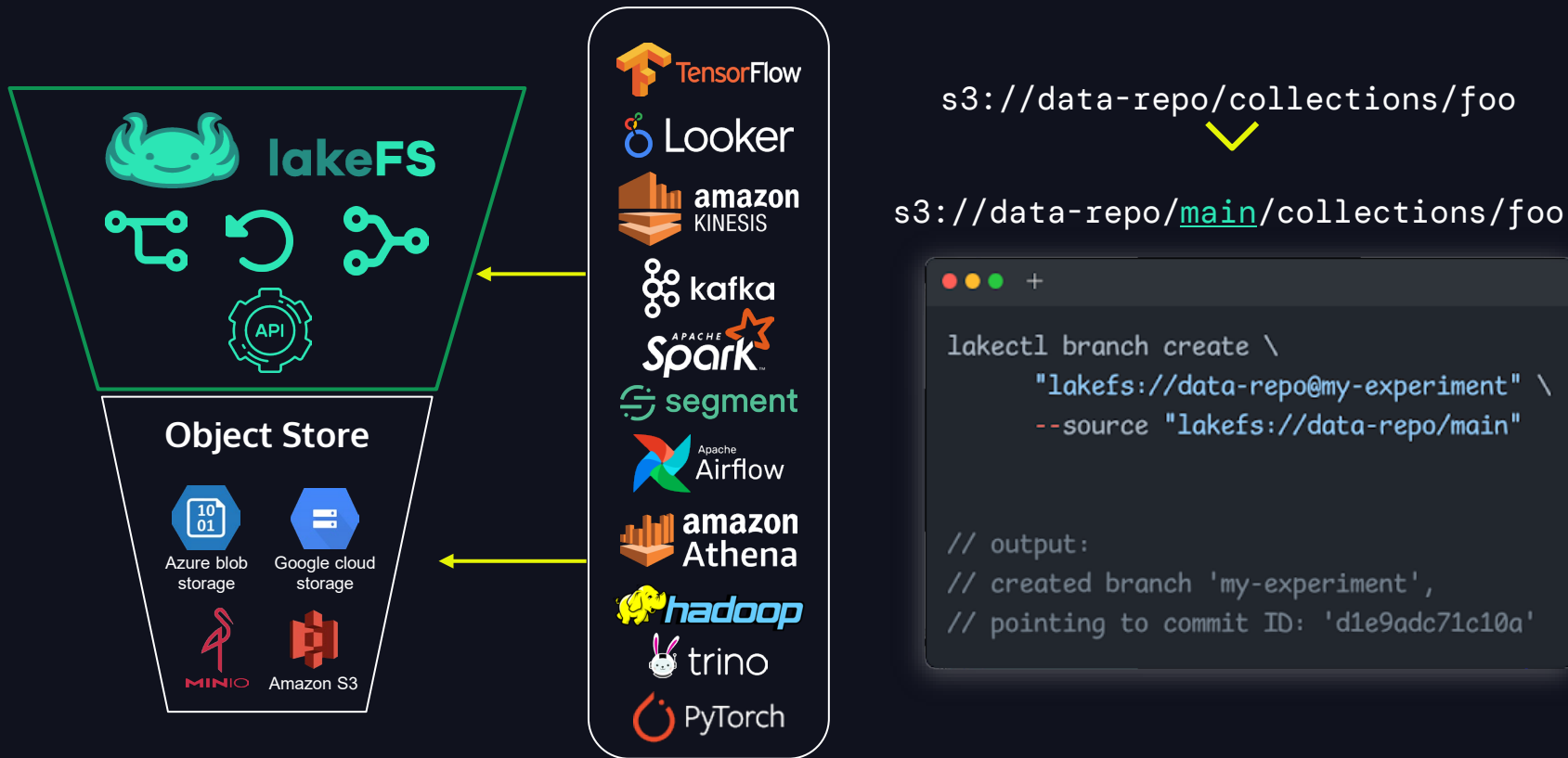


# lakeFS IN 30 SECONDS OR ~~LESS~~ MORE

This is where  
I fit in



# LAKEFS IN 30 SECONDS OR ~~LESS~~ MORE



# ACHIEVING REPRODUCIBILITY

## Across Tables!

```
USE unity.model_v15_prod;
```

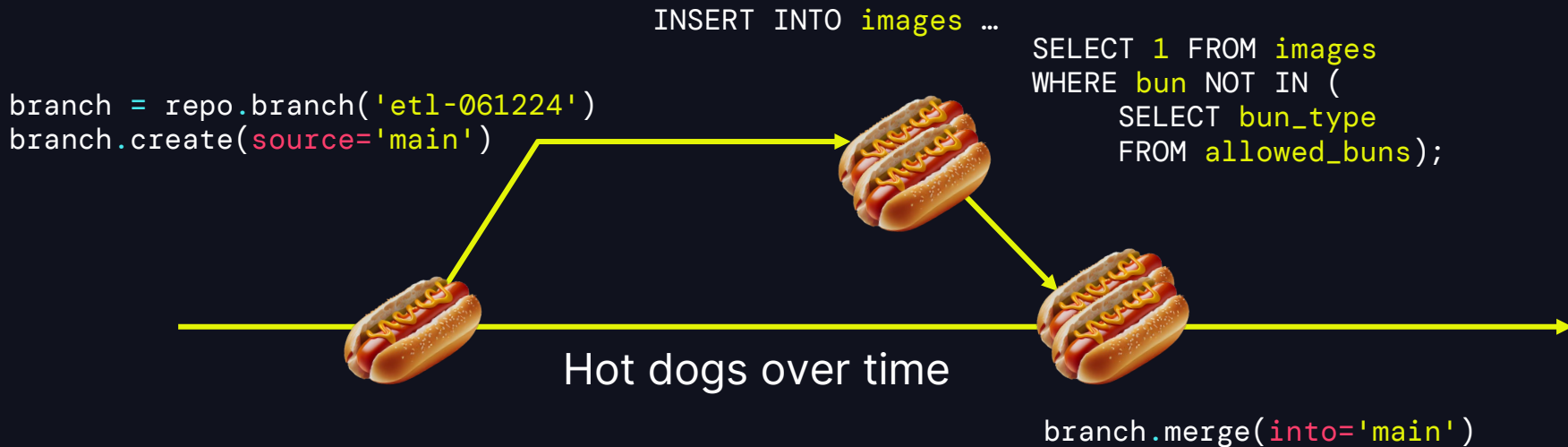
```
SELECT * FROM images  
JOIN labels ON ...  
JOIN image_licensing ON ...  
JOIN privacy_settings ON ...  
JOIN exif_info ON ...  
WHERE label <> 'Hot Dog';
```



Hot dogs over time

# ACHIEVING WRITE-AUDIT-PUBLISH

## Branches



# BIG RED BUTTON

## Revert commit!

The screenshot shows the lakeFS web interface for a repository named 'my-data-lake'. The 'Commits' tab is selected, and the current branch is 'main'. A list of commits is displayed, with the following details:

Commit Title	Commit Hash	Author	Timestamp	Age
<a href="#">Airflow :: Ingest events 06/11/24</a>	1916ccdd8a9d1d35	oz.katz@treeverse.io	05/09/2024 16:07:57	14 days ago
<a href="#">Add labels for moar hotdogz</a>	5fc2bb1f39bc4052	oz.katz@treeverse.io	05/09/2024 16:07:13	14 days ago
<a href="#">F'ing up completely and deleting a bunch of things!</a>	2fbee807d3428173	oz.katz@treeverse.io	03/28/2024 15:36:57	2 months ago
<a href="#">Merge 'dev' into 'main'</a>	4eb6a700fe641f5a	oz.katz@treeverse.io	03/28/2024 15:35:27	2 months ago

The commit titled "F'ing up completely and deleting a bunch of things!" is highlighted with a red box, and a red horizontal line is drawn below its hash and icons.



# BIG RED BUTTON

On any number of table

## PYTHON

```
import lakefs

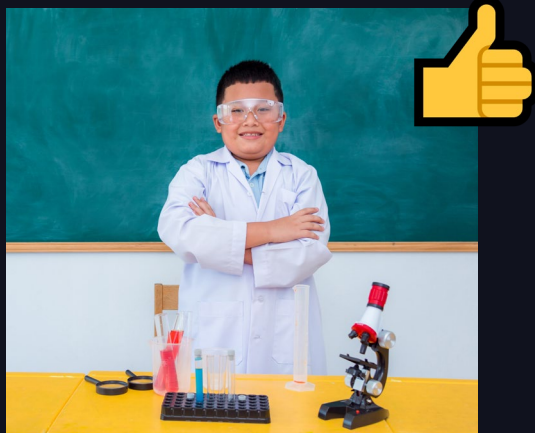
repo = lakefs.repository('my-
main = repo.branch('main')

bad_commit_id = '2fbee807d34'
main.revert(repo.ref(bad_commit_id))
```



# Data Lake Resiliency

Reproducible outputs



Write-Audit-Publish



A big red button



# BONUS: HOOKS

hotdogz.csv



# BONUS: HOOKS

```
_lakefs_actions/pre-merge.py:
```

```
for change in source.diff('main'):  
    if change.path.endswith('csv'):  
        hook.fail('NO CSVs!!!')
```

hotdogz.csv



Hot dogs over time

# THANK YOU

## Oz & your production DAGs

# LEARN MORE

 [lakefs.io/slack](https://lakefs.io/slack)

 [github.com/treeverse/lakeFS](https://github.com/treeverse/lakeFS)

 [docs.lakefs.io/quickstart](https://docs.lakefs.io/quickstart)



Come meet me  
at Booth #69

EXPO HALL

