

## How building an industry DBMS differs from building a research one

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#### Background



- 2015 2021: PhD student at the chair of Prof. Plattner @ HPI Potsdam
  - Built Hyrise, an open-source in-memory research DBMS\*
- Since April 2021: Senior Software Engineer at Snowflake in our Berlin office

- This talk is based on my personal experience
- It is neither representative nor comprehensive

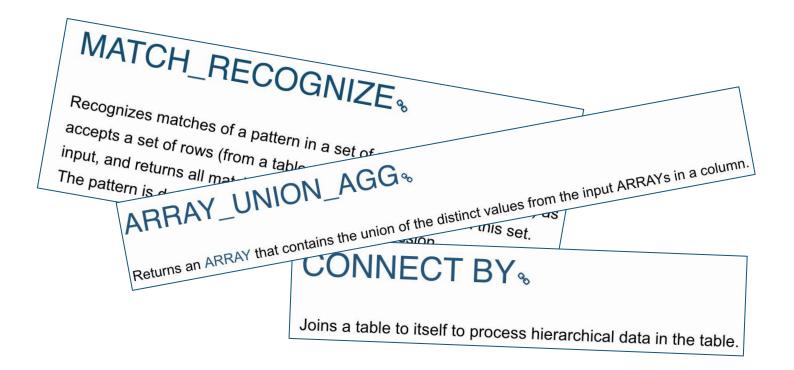
\*) Dreseler et al., Hyrise Re-engineered: An Extensible Database System for Research in Relational In-Memory Data Management (EDBT 2019) - https://github.com/hyrise/hyrise

### Snowflake builds a DBMS, right?

• When I was looking for jobs, I thought that Snowflake built a cloud DBMS



#### But at least I know SQL...

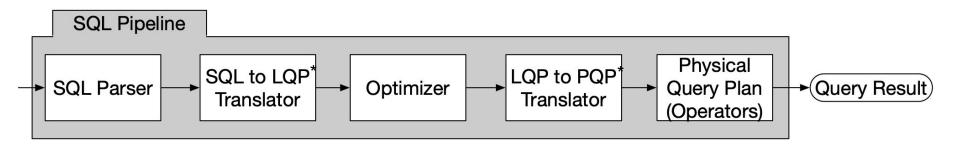


### Similarities



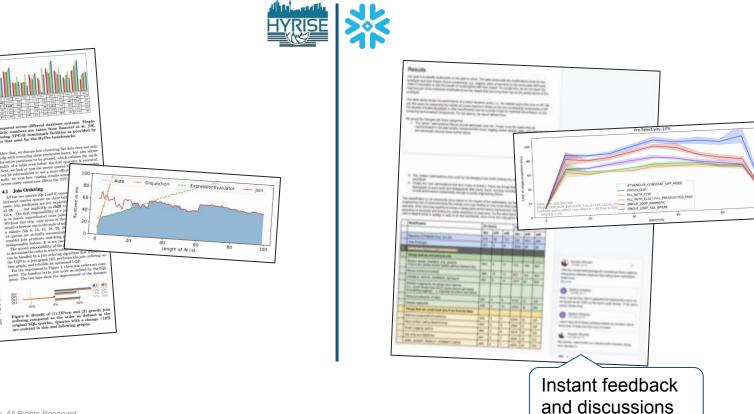
### Databases really work like they teach in university

Everything is more complex in an industry database, but the SQL core is similar:



\*) Logical / Physical Query Plan

### Still doing R&D and still writing papers



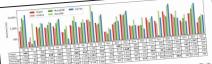


Figure 3: TFC-II query association time in milliconoide nonpared across different database nonress. Single-Daniel, M. Y. 16. Yur. HyPey, which is no exclusible publicly, numbers are taken for the star of the s

The system used is a 2017 Fujitsu Primergy RX4770 M4

#### 4. PLAN-LEVEL CHOKE POINTS

4. PLAN-LEVEL CHORE POINTS The first graup of data points contained much and first the entire updates fragments and the star in the star of the star of the star of the star on a high multiple divergence of point and the star in the star of the star of the latter is better graph index these of the star of the star of the star barry on the star of the star of the star of the star index of the star of the star of the star of the star index of the star of the star of the star of the star index of the star of the star of the star of the star index of the star of the star of the star of the star index of the star of the star of the star of the star index of the star of the star of the star of the star index of the star of the star of the star of the star index of the star of the star of the star of the star index of the star of the star of the star of the star index of the star of the star of the star of the star index of the star of the star of the star of the star index of the star of the star of the star of the star index of the star of the star of the star of the star index of the star of the star of the star of the star index of the star index of the star index of the star index of the star index of the star index of the star index of the star of the star

<sup>4</sup>For Hyrise, GCC performs consistently better than change GCC 9.2 binaries have a TPC-H throughput that is 11% higher than that of chang 9. <sup>5</sup>https://github.com/hyrise/tpch\_paper

After that, we discuss how clustering the data does not only After that, we discuss how clustering the data does not only help with executing these predicates faster, but also allows for entire partitions to be preund, which reduces the cardi-forentire partitions to help the state of the second help of a last even before the first operator is executed. Next, we look at how the twelve queries it on the reformalized to use a more official

can be reformulated to use a more efficie nally, we look how reusing results arrow across query executions affects the TPC 4.1 Join Ordering

All but two queries (Qs 1 and 6) of All but two queries (Q4 I and 0.7 Per and most queries operate on three tab-cases, join predicates are not explicitly as the mathematical predicates are not explicitly as FRIN 11 t2.a. The first responsibility of a jo is to match unpredicated cross joins is to match unpredicated cross joint Without this step, only seven of the would otherwriter run in the scale of mi a minute (Qs 4, 13, 15, 18, 20, 21 14 queries are virtually unexecutad consider join predicate matching a indispensable feature. It is not par-indispensable feature. It is not par-



Figure 4: Benefit of (1) DPccp and (2) greedy join Figure 4: Benefit of (1) DFcep and (2) greedy join ordering compared to the order as defined in the original SQL quories. Queries with a change <10% are omitted in this and following graphs.



# Workloads and Optimizations

### **Relevance of optimizations**

- In research, incremental improvements rarely cause much excitement
- In industry, if we make every query 1ms faster, we save a year worth of compute a day
  - Optimizations do not have to be fancy
- Finding the right thing to work on
  - Customer requests
  - 15+ PB of metadata in Snowhouse
  - Background tooling across the entire fleet
- But: Having 5% of queries regress is only fine in research

How to use this tool			
🖋 Fetch the data and create the flamegraph			
۵			
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## Reliability



#### **Testing and Validation**



Unit Tests End-to-End Regression Tests Sanitizer Builds Static Code Analysis Query Permutation Testing Re-executing production queries\* Up- and downgrade testing

We had this in Hyrise

This was new for me

#### Parameter protection (aka. feature flags)

#### • Used to guard new code paths:

603		<pre>_ m_missSel-&gt;fillWithSubtractedVectors(*probeSel, *selection);</pre>
	609	<pre>+ if (InitParams::getParamBool(PRM_ENABLE_FIX_360233)) {</pre>
	610	<pre>+ m_missSel-&gt;fillWithSubtractedSubsequenceVectors(*probeSel, *selection);</pre>
	611	+ } else {
	612	<pre>+ m_missSel-&gt;fillWithSubtractedVectors(*probeSel, *selection);</pre>
	613	+ }

- Multi-level can be enabled for individual queries
- This allows us to have a **single binary** while still supporting
  - Running code in test environments first
  - Private and public previews
  - Behavior changes

#### **Edge Cases and Resilience**

• At **2,400,000,000 queries a day**, everything you can think of happens

- Race conditions if it is in the code, it will happen
- ECC RAM failing / Bit Rot
- Cloud providers being out of instances
- Cloud providers giving us bad instances

A researcher could just restart the experiment

# Wrapping up



### What do I miss?

- Being able to know each part of the code
- Hacking up a performance improvement between a lecture and lunch
- Not worrying about regressions

### What is great?

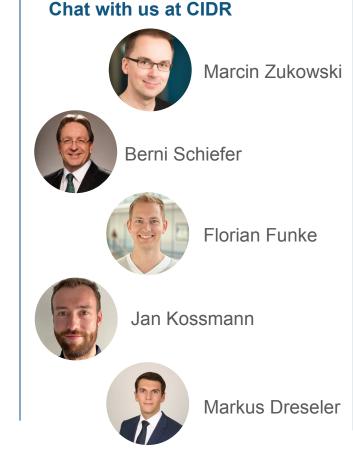
- Code is used billion times a day
- Data-driven development (Snowhouse)
- Support Rotation is stressful, but allows you to have an immediate impact on blocked customers
- Working alongside hundreds of engineers with different expertise

### How can you be part of this?

#### Try Snowflake

You can try Snowflake for 30 days and spend \$400 on us:

https://signup.snowflake.com/



#### Join us



 Engineering offices in Berlin, San Mateo, Warsaw, Toronto, Bellevue