



# Lessons learned from autotuning PostgreSQL

A 5-year long journey

**Swiss PGDay**

June 28, 2024



**Luigi Nardi, Ph.D.**

Founder & CEO, DBtune

## About me



@luinardi



@nardiluigi

B.Sc and M.Sc. Computer Engineering at La Sapienza — Rome (Italy)

- 2006 M.Sc. thesis at LAAS-CNRS — Toulouse (France)
- 2007 Ph.D. Computer Science at Université Pierre et Marie Curie — Paris (France)
- 2011 Research Engineer at Murex SAS — Paris (France)
- 2014 Postdoc Imperial College London (UK)
- 2017 Research Staff at Stanford University (USA)
- 2019 Assistant Professor in Machine Learning at Lund University (Sweden)
- 2021 Founder & CEO at DBtune — Malmö (Sweden)
- 2024 Associate Professor in Machine Learning at Lund University (Sweden)

# The DBtune team



dbtune

## Leadership



**Founder & CEO**  
Dr. Luigi Nardi  
Stanford & Lund



**Strategy Advisor**  
Moritz Zimmermann  
42Cap, Hybris, SAP



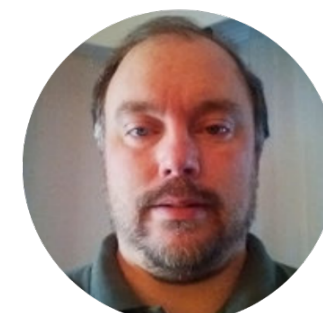
**Advisor**  
Dr. Kunle Olukotun  
Stanford & SambaNova



**Senior ML Engineer**  
Dr. Erik Hellsten  
Chalmers, DTU, LTH, Volvo



**Frontend Engineer**  
Aiman Mohsin  
Diya, Sia Smtech



**Special Consultant**  
Magnus Hagander  
Redpill, PG Core Team



**Strategy Advisor**  
Kingston Duffie  
Serial Entrepreneur



**Senior SW Engineer**  
Muhammad Umair  
Freie, Heidelberg, SAP



**Backend Engineer**  
Tahir Masood  
FAST, Ibex Global



**Senior DB Engineer**  
Dr. Curt Kolovson  
Berkeley, VMware, MariaDB



**Technology Advisor**  
Peter Zaitsev  
Co-founder & CTO Percona



**Tech Lead**  
Costa Alexoglou  
Co-founder VisualEyes, Neo4j



**Senior DevOps**  
Mohsin Ejaz  
EDB



**Senior ML Engineer**  
Raffaello Baluyot  
Volvo, Autoliv



**Technology Advisor**  
Johan Svensson  
Co-founder & CTO Neo4j

## M & S



**Marketing Coordinator**  
Ellyne Phneah  
LTH, ZDNet, Symantec



**Director of Sales**  
Tom Howcroft  
VoltDB



**Marketing Advisor**  
Mark Jennings  
Techstars, Notch



**Sales Advisor**  
Alan Facey  
B2B Sales Leader

# What is database tuning?

Keeping the database fit and responsive

- ✔ Databases change, grow and slow down
- ✔ Not all workloads and machines are the same
- ✔ **Tuning adapts a database to its current use-case, load and machine**
- ✔ It is a 'dark-art' yet an integral part of any DBA and developer's job
- ✔ Tuning includes query, DBMS parameter, index, OS parameter, etc.

# Why does it matter?

## Technical perspective

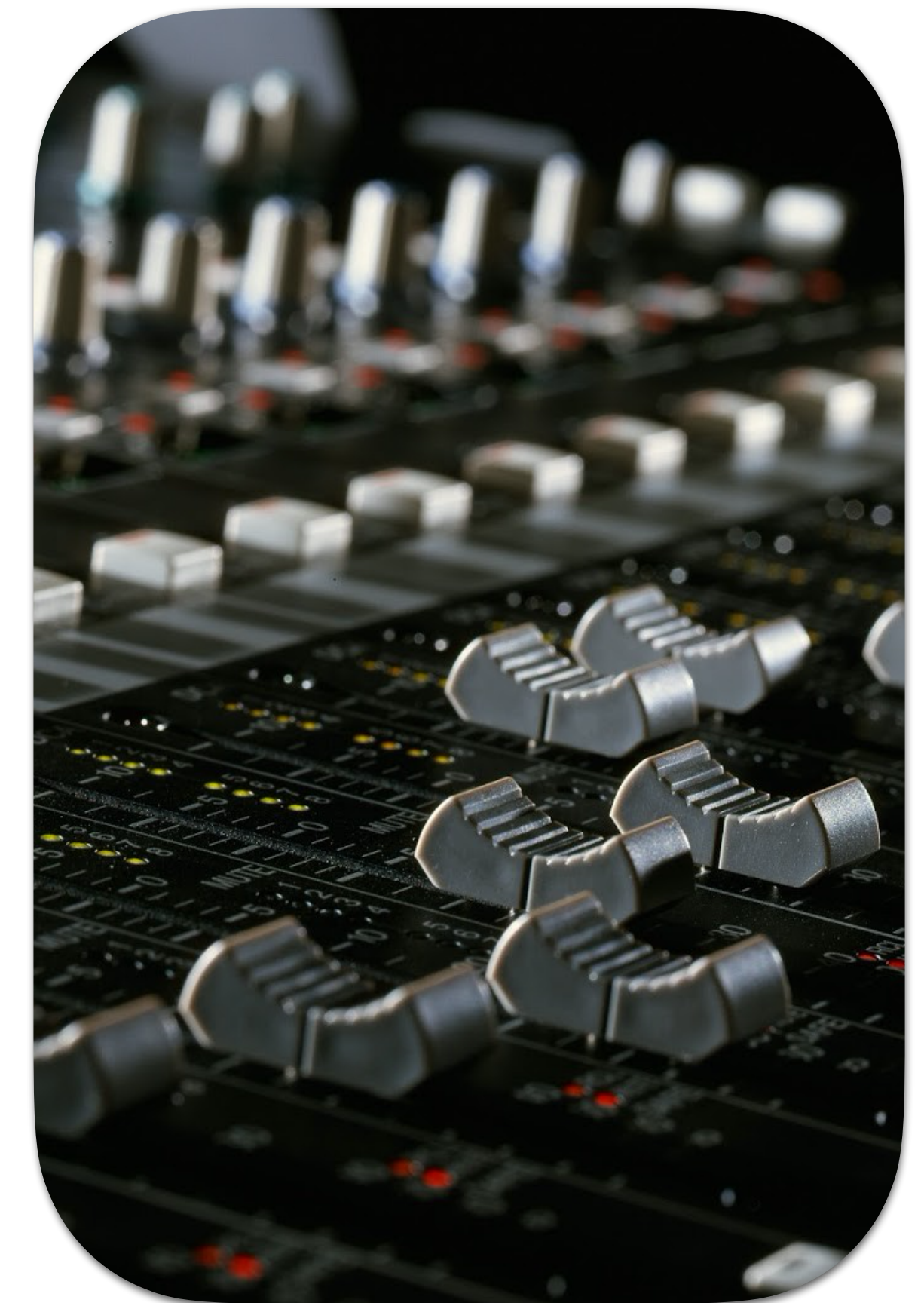
- Directly impacts system performance
  - Transactions per second — Throughput
  - Average query runtime — Latency
- Improves scalability / stability / reliability
- SLA

## Business perspective

- Decreases cloud / infrastructure spend
- Higher end-user satisfaction
- Reduces downtime
- Increases productivity
- Sustainability

# Database system parameter tuning

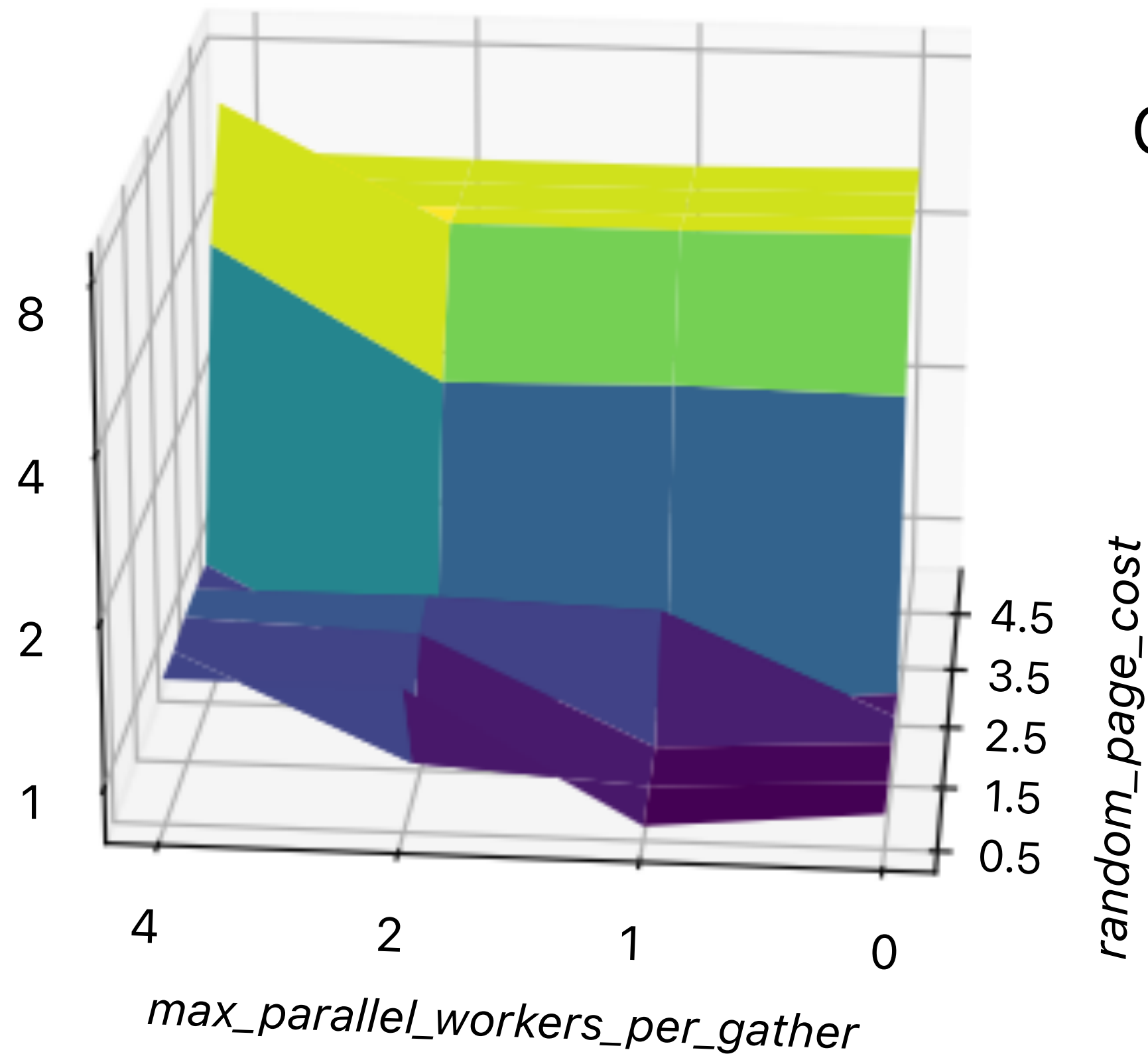
- ✓ Adjusting knobs to best fit the workload
- ✓ PostgreSQL parameters that are typically important: *work\_mem*, *shared\_buffers*, *max\_wal\_size*, etc.
- ✓ Example *max\_parallel\_workers\_per\_gather*:  
Max # of workers started by a Gather or Gather Merge node
- ✓ Example *random\_page\_cost*:  
Planner's cost of a non-sequentially fetched disk page
- ✓ These parameters highly depend on the application



# Average query runtime tuning

for *max\_parallel\_workers\_per\_gather* and *random\_page\_cost*

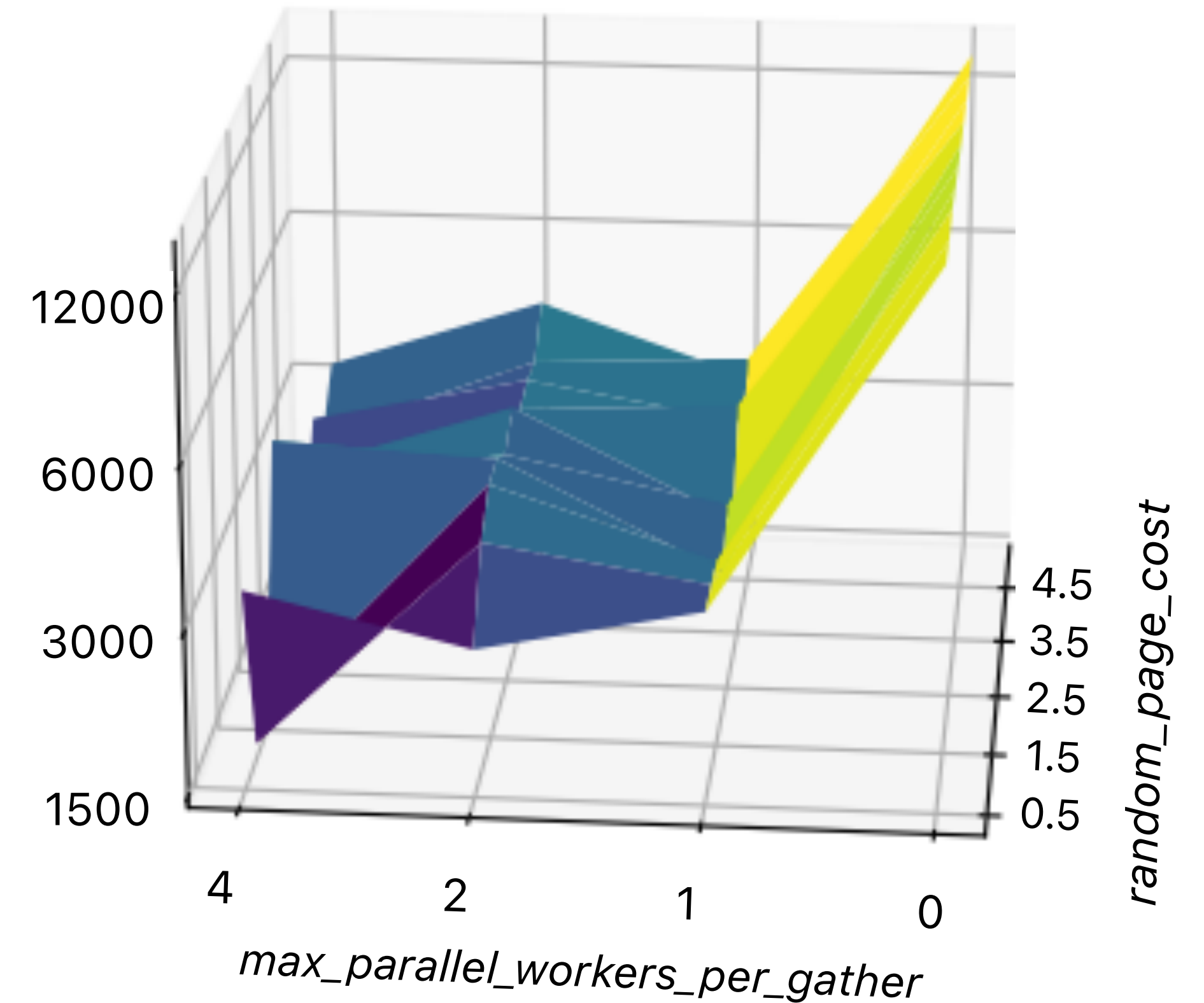
## Epinions



Query runtime in ms  
**Lower the better**

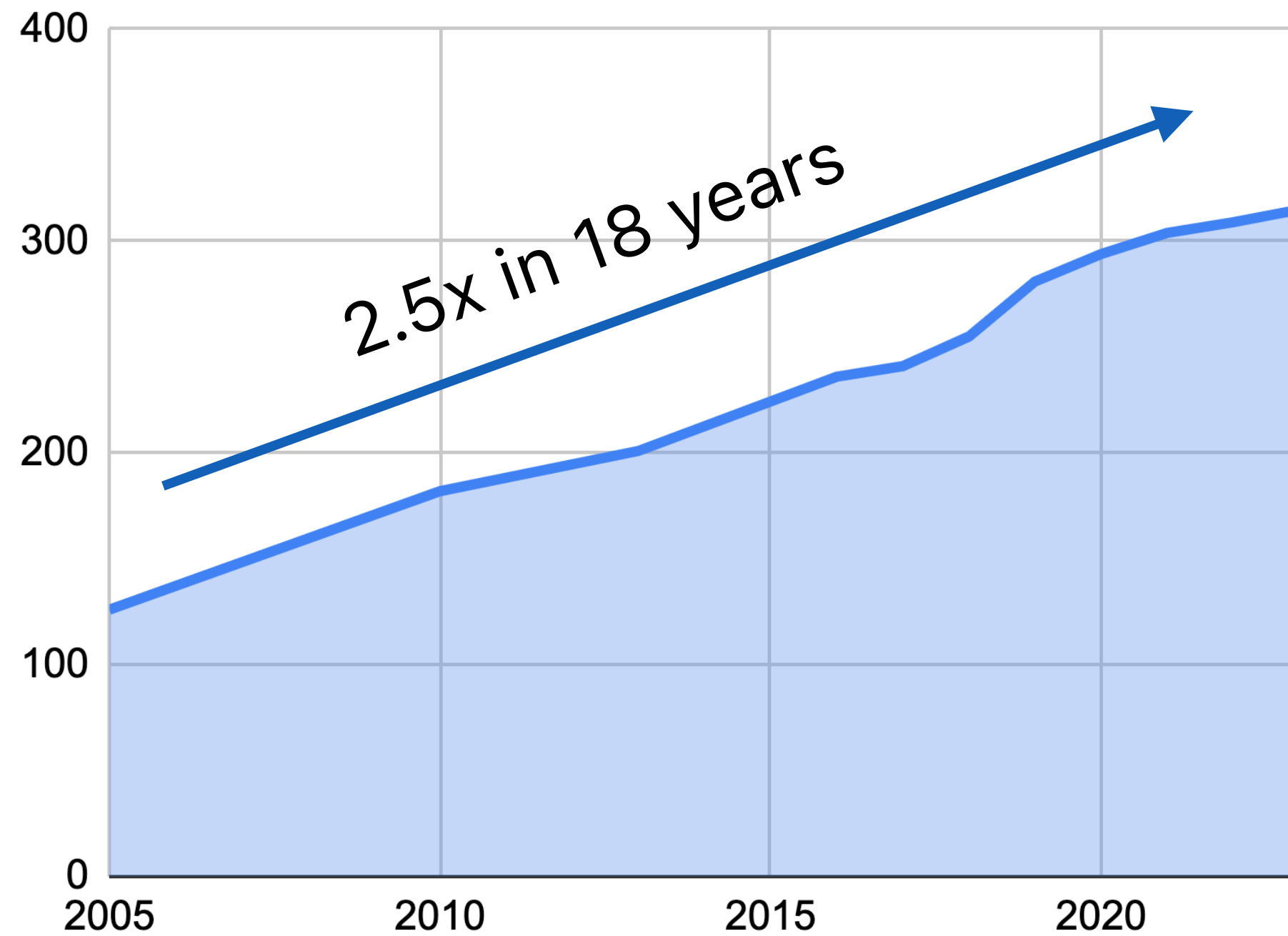


## TPC-H



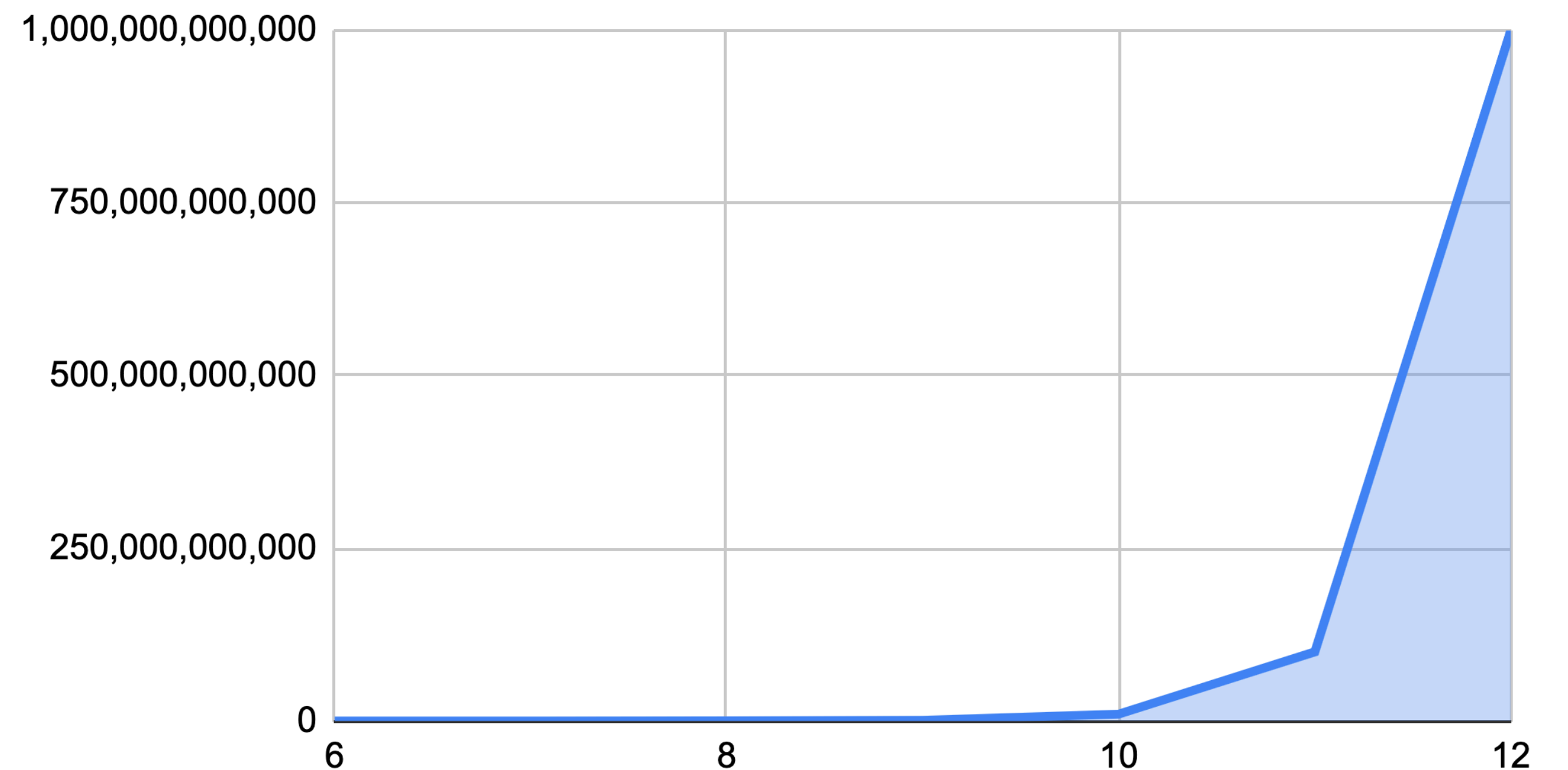
# Complexity is growing over time

The number of parameters is growing **linearly**



PostgreSQL number of parameters

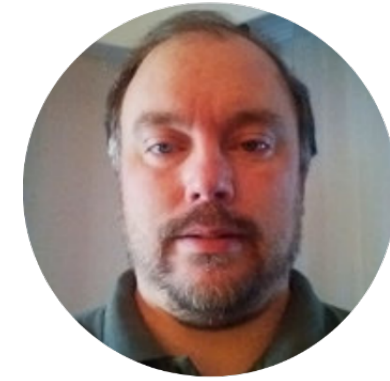
The number of configurations is growing **exponentially**



Example of complexity with 12 parameters



# How is parameter tuning tackled today by DBAs and developers?



Tuning  
guru

## Manual

Slow

Takes days

Painstaking

Needs high expertise

Ineffective

Tune again in a week

Inadequate

Seasonal workload

## Heuristics

One-size-fits-all

Uses generic rules

Workload agnostic

Not bespoke

Ineffective

Tune again in a week

Inadequate

Seasonal workload



## New approach

Ideally a solution that **learns** by **observation** and **autotunes**

A solution that **adapts** to changing workloads

# How often do you tune?

## Frequent

- ✓ Your workload changes — Change queries and application
- ✓ Your database grows and changes
- ✓ You scale your cloud instance — Up or down

## Infrequent

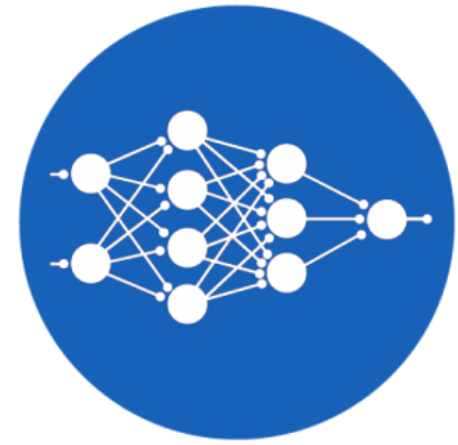
- ✓ You migrate from on-prem to the cloud — Or vice-versa
- ✓ You migrate DBMS — E.g., from Oracle to PostgreSQL
- ✓ You upgrade your version of PostgreSQL

# The reality of how most enterprises treat manual parameter tuning today

- ✓ Tuning is typically **reactive** to something going wrong — Not **proactive**
- ✓ Maybe looked at once or twice a year
- ✓ Often engage expensive external resources / experts
- ✓ Different workloads are not treated differently
- ✓ Modus operandi: Throw more hardware / compute at any issue (\$\$\$)

# We introduce DBtune

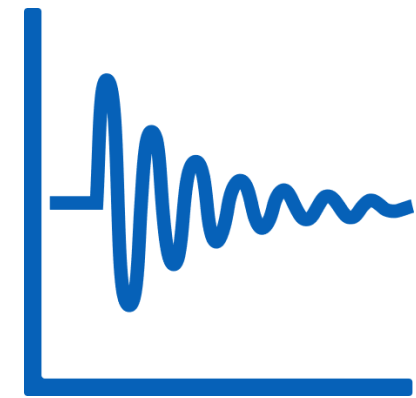
A unique ML-powered database tuning cloud hosted service



Machine learning approach



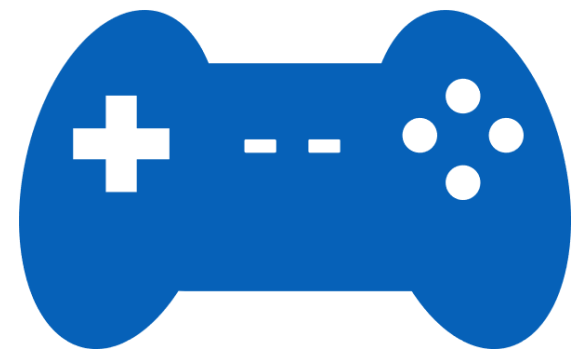
DBtune learns how to solve optimization challenges



Dynamic adaptation



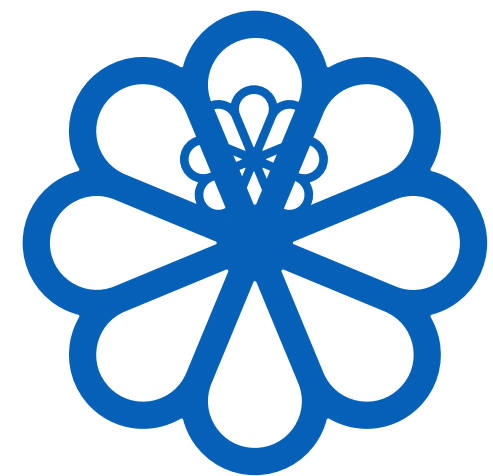
DBtune can tune a database irrespective of its size and complexity



Easy to use



No need for background in ML or database tuning



Highly scaleable



DBtune can tune multiple databases in heterogeneous environments

# User value propositions

DBtune boosts service performance / improves business margins



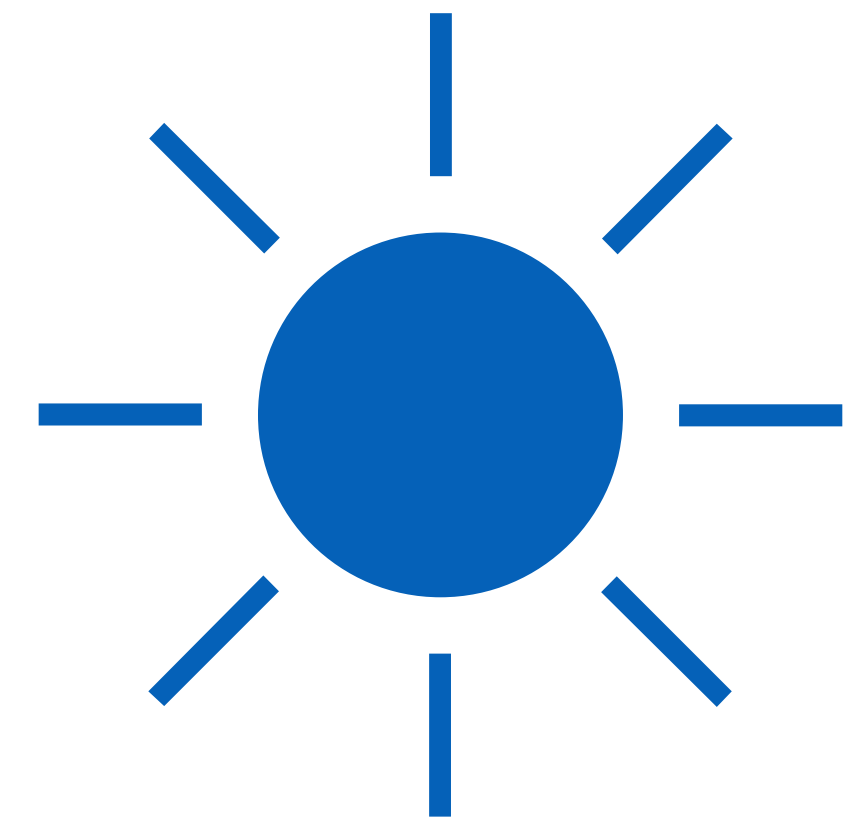
Reduce cloud /  
infrastructure costs



Make your service  
radically faster



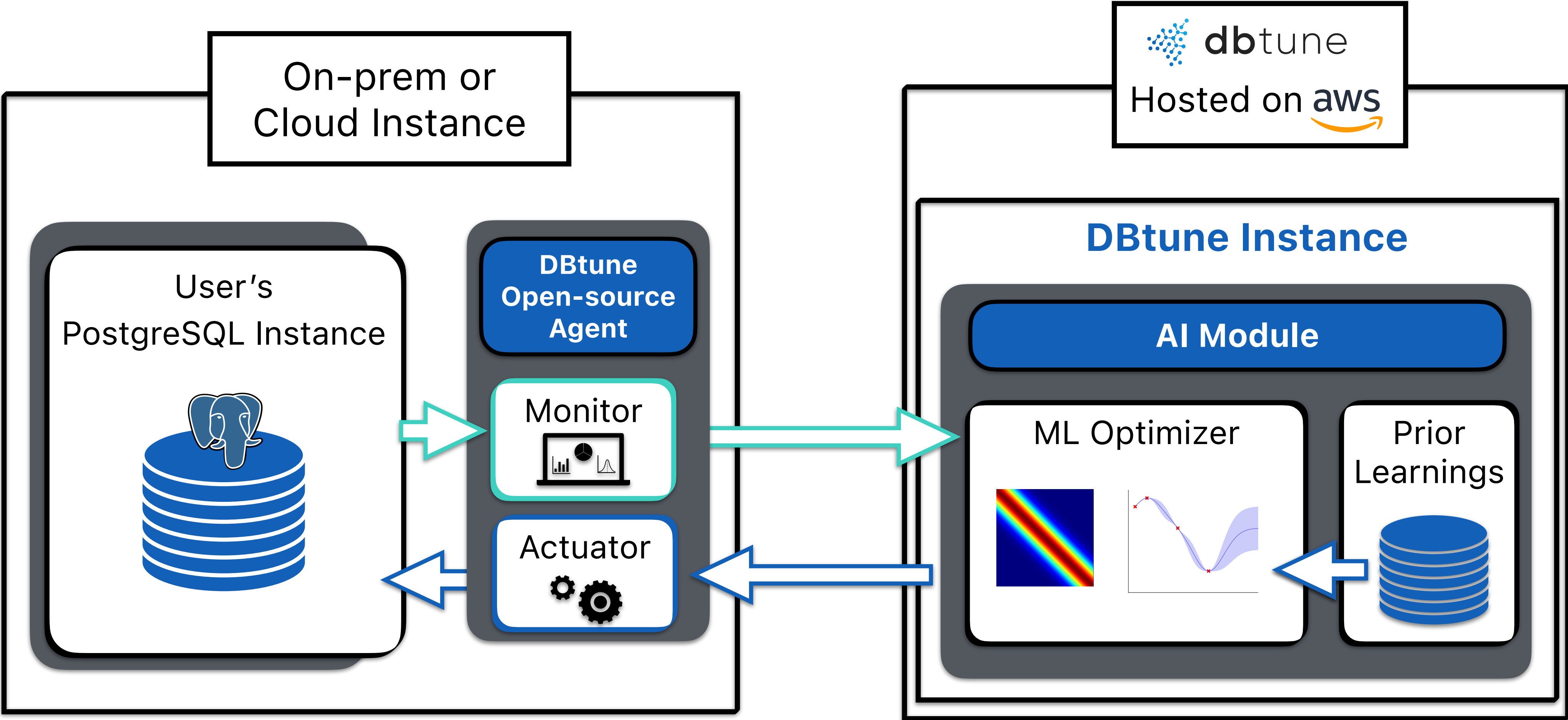
Free up your DBAs



Reduce energy  
consumption

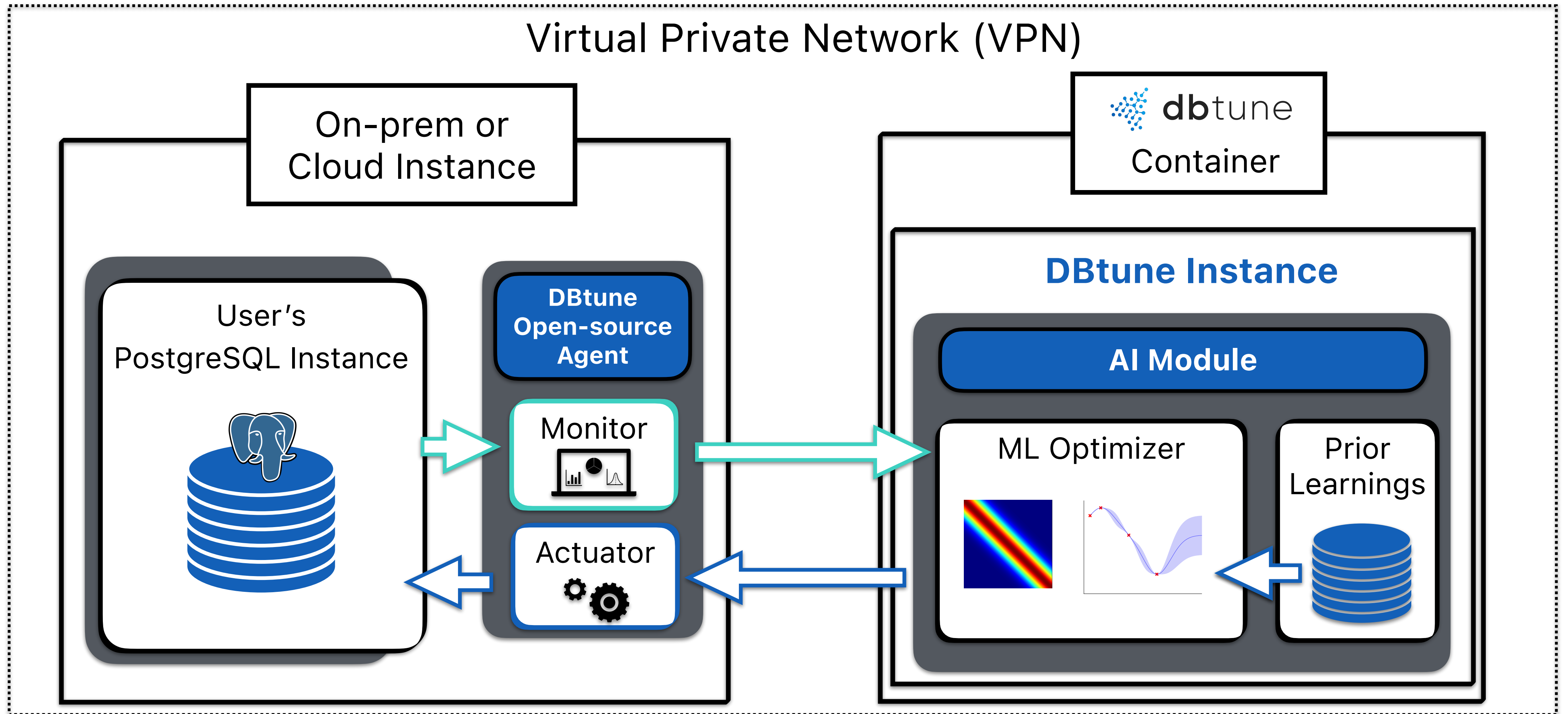
# DBtune architecture for self-managed PostgreSQL (1)

High-level view



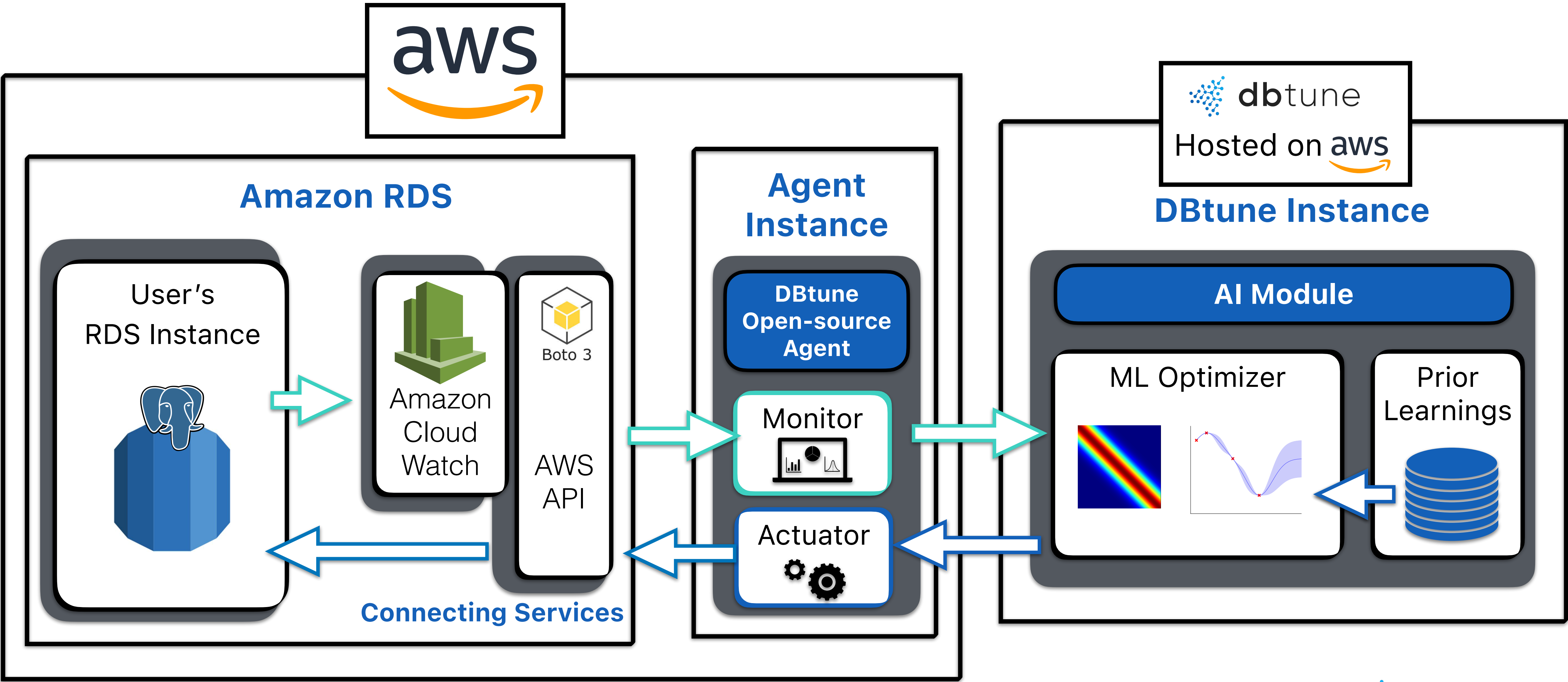
# DBtune architecture for instances that are offline (2)

## High-level view



# DBtune architecture for Database as a Service (DBaaS) (3)

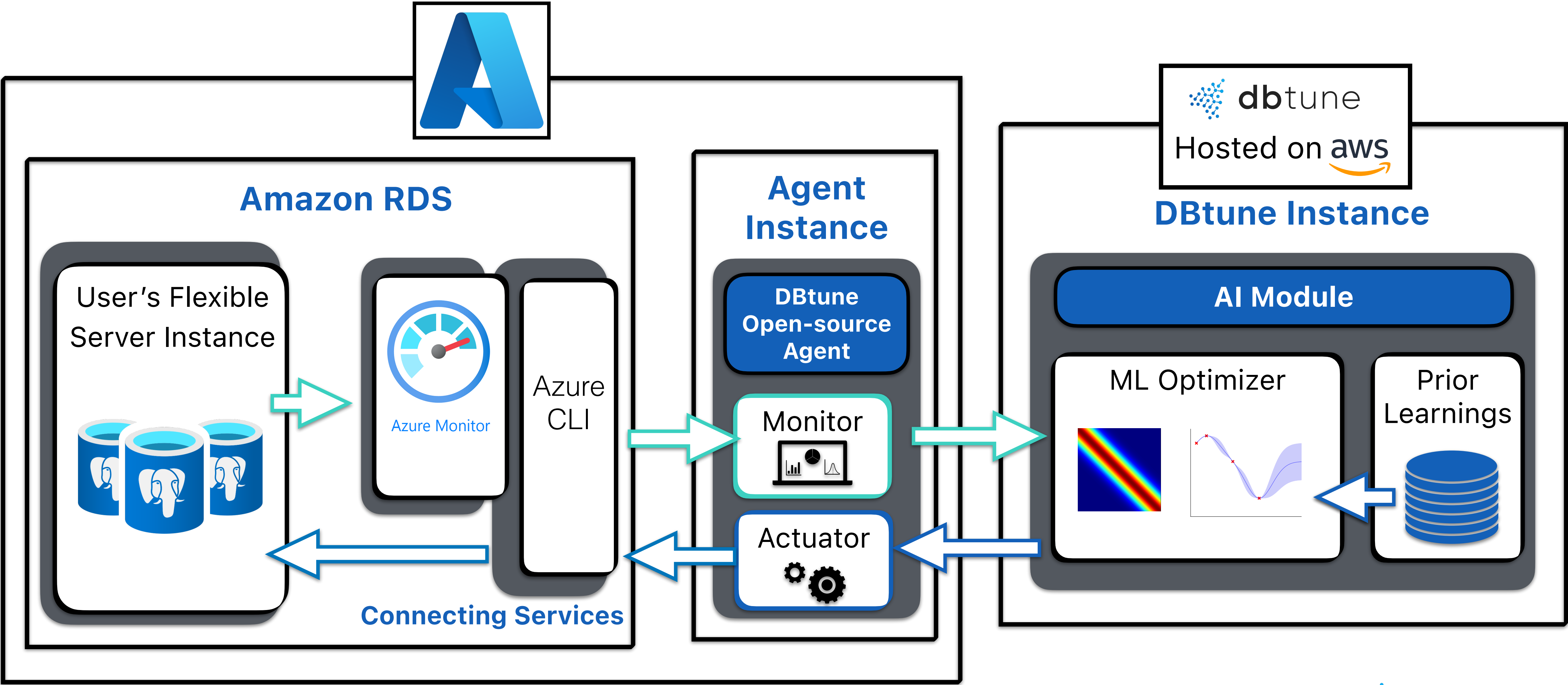
High-level view RDS PostgreSQL/Aurora





# DBtune architecture for Database as a Service (DBaaS) (4)

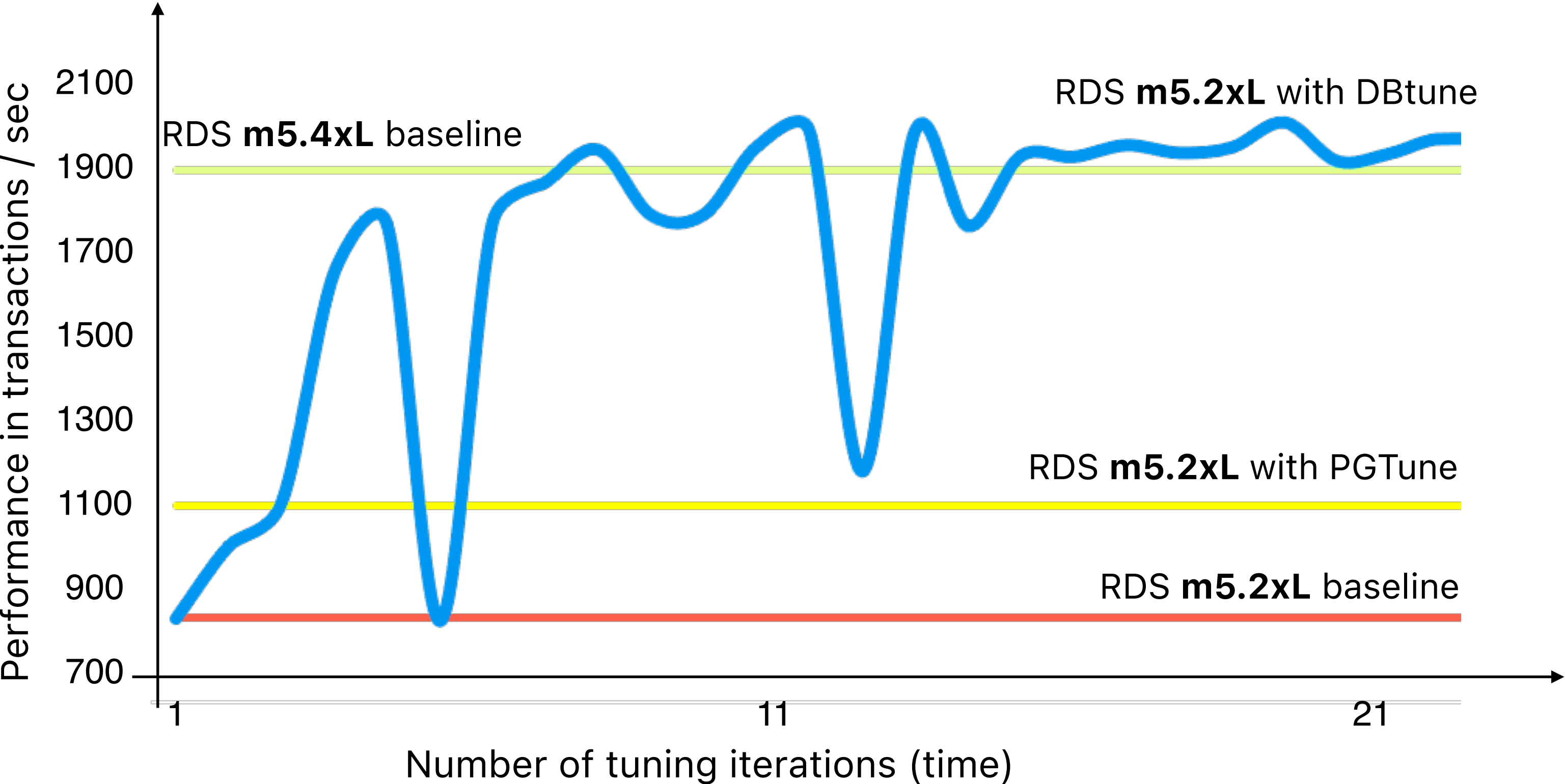
High-level view Azure Flexible Server




# Performance tuning results

## DBtune doubles the performance of PostgreSQL Amazon RDS

Performance impact of tuning RDS m5.2xLarge cloud instance on the TPC-C benchmark





DBtune on the smaller instance type achieves a level performance in excess of that achieved by an instance twice the size

# Proof of cost reduction: Detailed cost analysis

DBtune doubles the performance of PostgreSQL Amazon RDS

Hardware				Cost / Year		
AWS RDS Instance Type	Cores	RAM	IOPS	Instance	EBS	Total
db.m5.4xlarge	8	64 GBs	4000	\$12,475	\$4,800	\$17,275
db.m5.2xlarge	4	32 GBs	2000	\$6,237	\$2,400	\$8,637

Per instance savings: \$8,638

- ✔ DBtune halves RDS cost (50% saving)
- ✔ Matches 4xLarge performance on a 2xLarge instance
- ✔ Medium and large companies use hundreds\* of RDS instances

\*A16z article: "The Cost of Cloud, a Trillion Dollar Paradox"

# PostgreSQL parameters tuned by DBtune

## Database reload (11 parameters)

- ✓ *work\_mem*
- ✓ *max\_parallel\_workers*
- ✓ *max\_parallel\_workers\_per\_gather*
- ✓ *effective\_io\_concurrency*
- ✓ *bgwriter\_lru\_maxpages*
- ✓ *random\_page\_cost*
- ✓ *sequential\_page\_cost*
- ✓ *bgwriter\_delay*
- ✓ *max\_wal\_size*
- ✓ *min\_wal\_size*
- ✓ *checkpoint\_completion\_target*

## 0 or 1 restart with good defaults

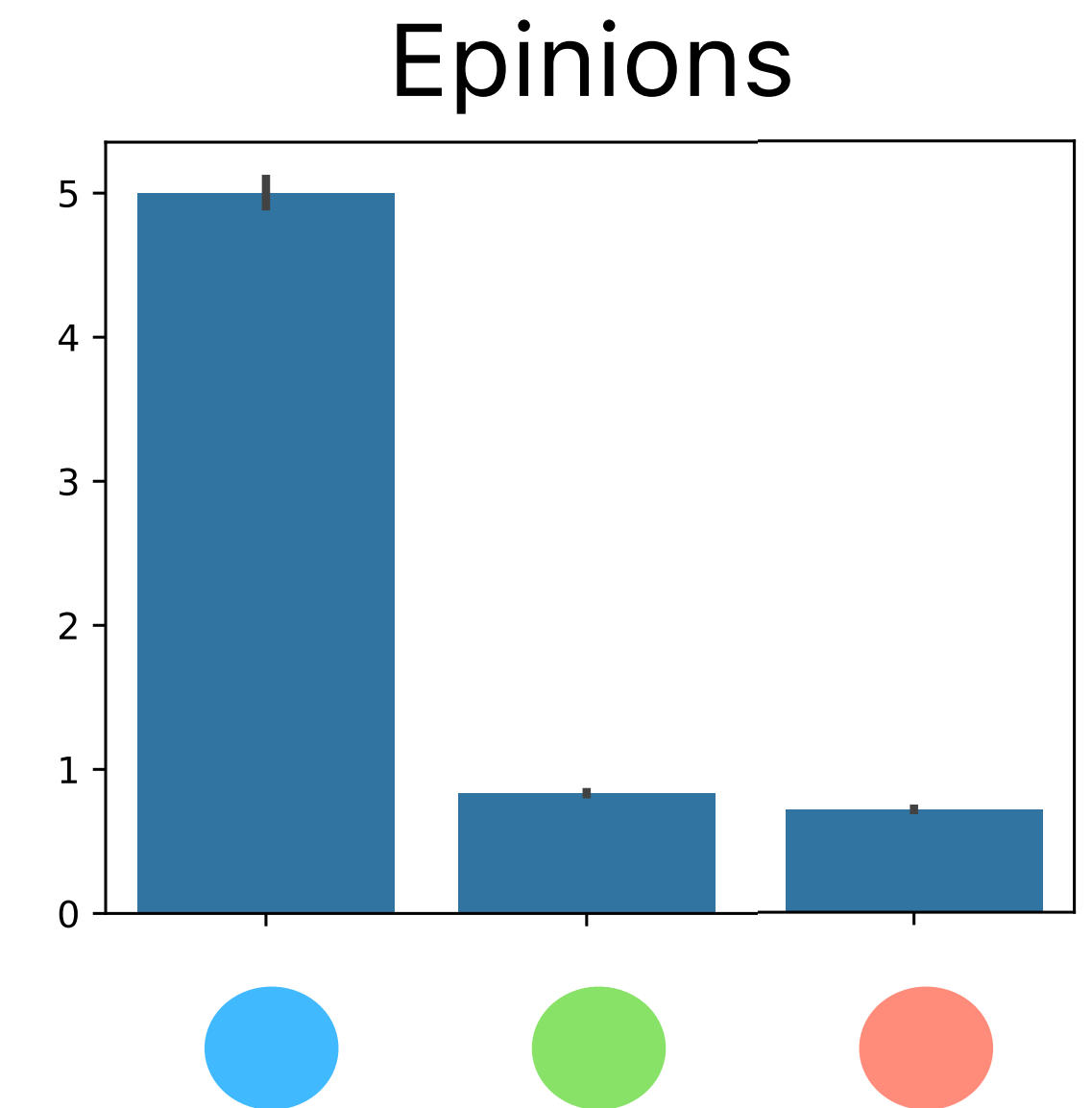
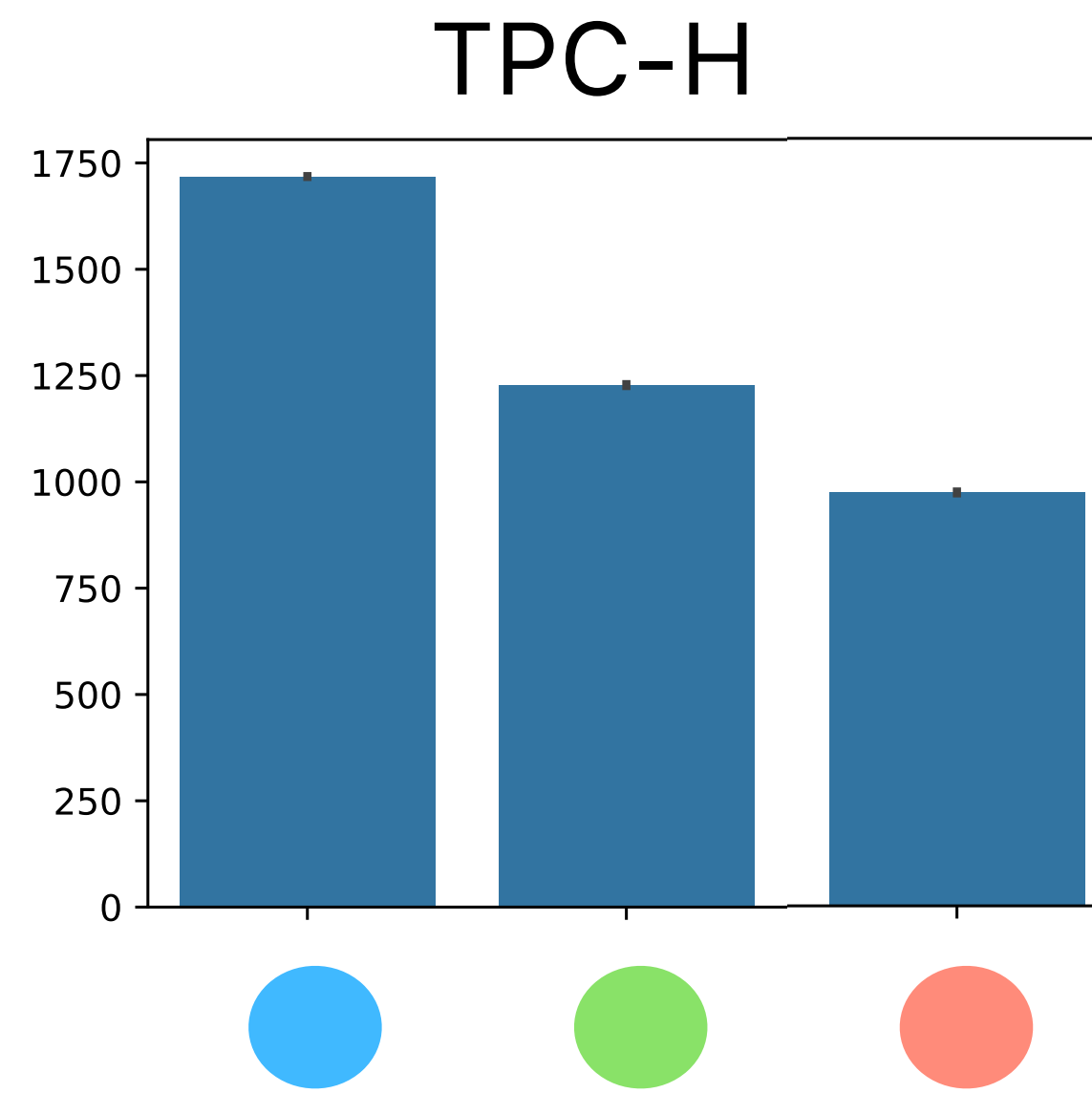
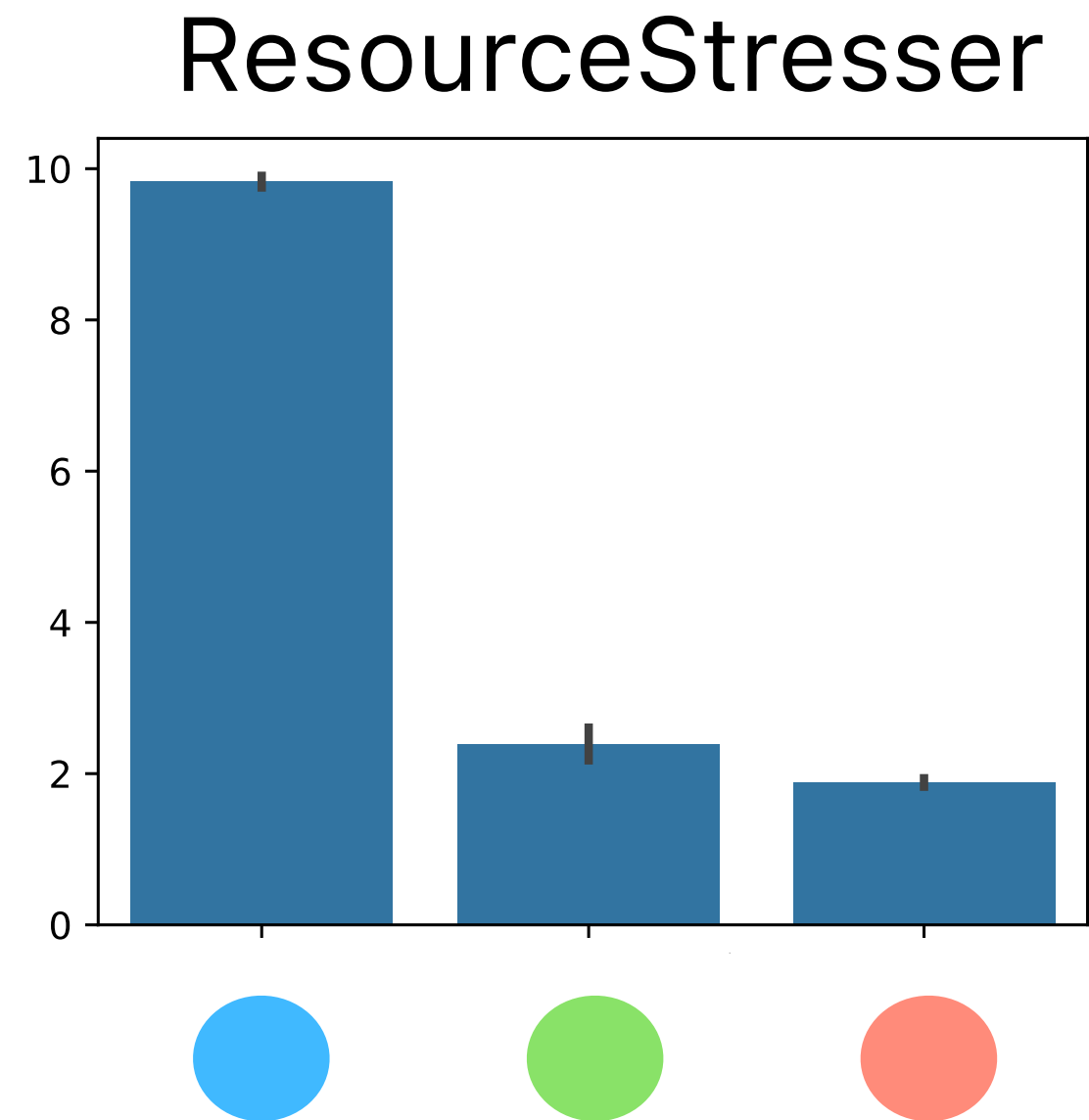
- ✓ *shared\_buffers = 25%*
- ✓ *max\_worker\_processes ~ vCPU*

## With many database restarts

- ✓ *shared\_buffers*
- ✓ *max\_worker\_processes*

# Performance downside of non-restart (reload-only) strategy

Average query runtime



- Default PostgreSQL configuration & no autotuning
- *shared\_buffers*=25% & reload-only & autotuning
- Restarts allowed & autotuning

# Safe tuning in production environments

## System guardrails to avoid unsafe configurations



### Constrained optimization

Parameters have safe upper / lower limits in place



### Memory monitoring guardrail

Real-time system memory monitoring to revert from potentially unsafe configurations

E.g. configuration that uses too much RAM — Triggered at 90% of RAM



### Early exit condition

Optimization space may result in configuration with worse performance than default

This triggers early exit from existing configuration and move to next iteration

# The sustainability angle — Out-of-the-envelop calculation

How much CO2 savings is at stake?

Database instance size largely impacts data center emissions

Impact on a single  
database

**-50%**

**CO2 emissions**

for a single database with DBtune<sup>1</sup>

Impact on average  
data center

**-32%**

**CO2 emissions**

for an average data center with DBtune<sup>2</sup>

Impact on the EU data  
center landscape

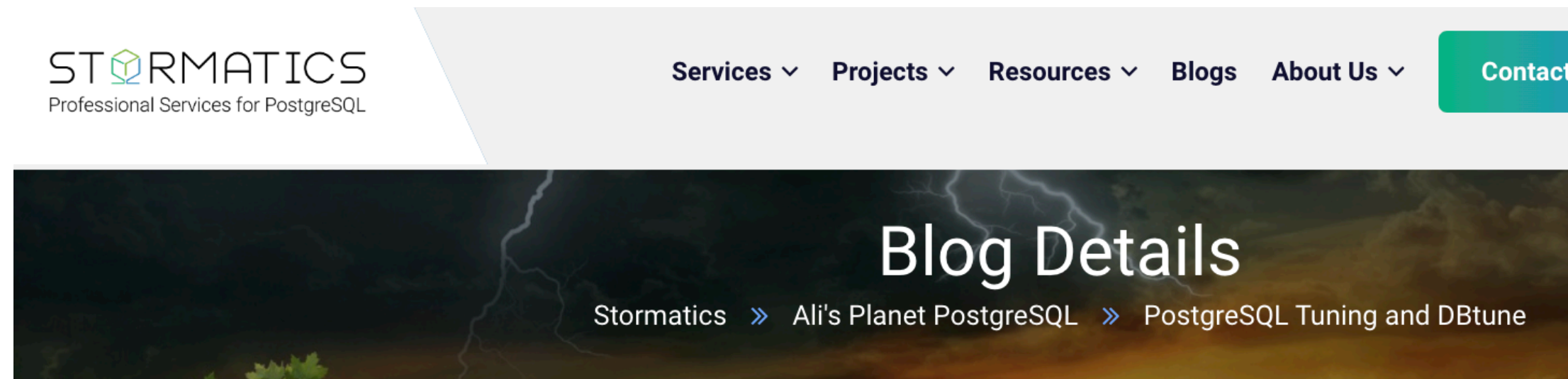
**-7Mt**

**CO2 savings p.a.**

across the EU with DBtune<sup>3,4</sup>

1) DBtune/Teads 2) Borderstep 3) Statista 4) EU digital strategy

# Independent evaluation by Stormatics



🕒 February 14, 2024    👤 By Muhammad Ali    📄 Ali's Planet PostgreSQL, Blog

## PostgreSQL Tuning and DBtune

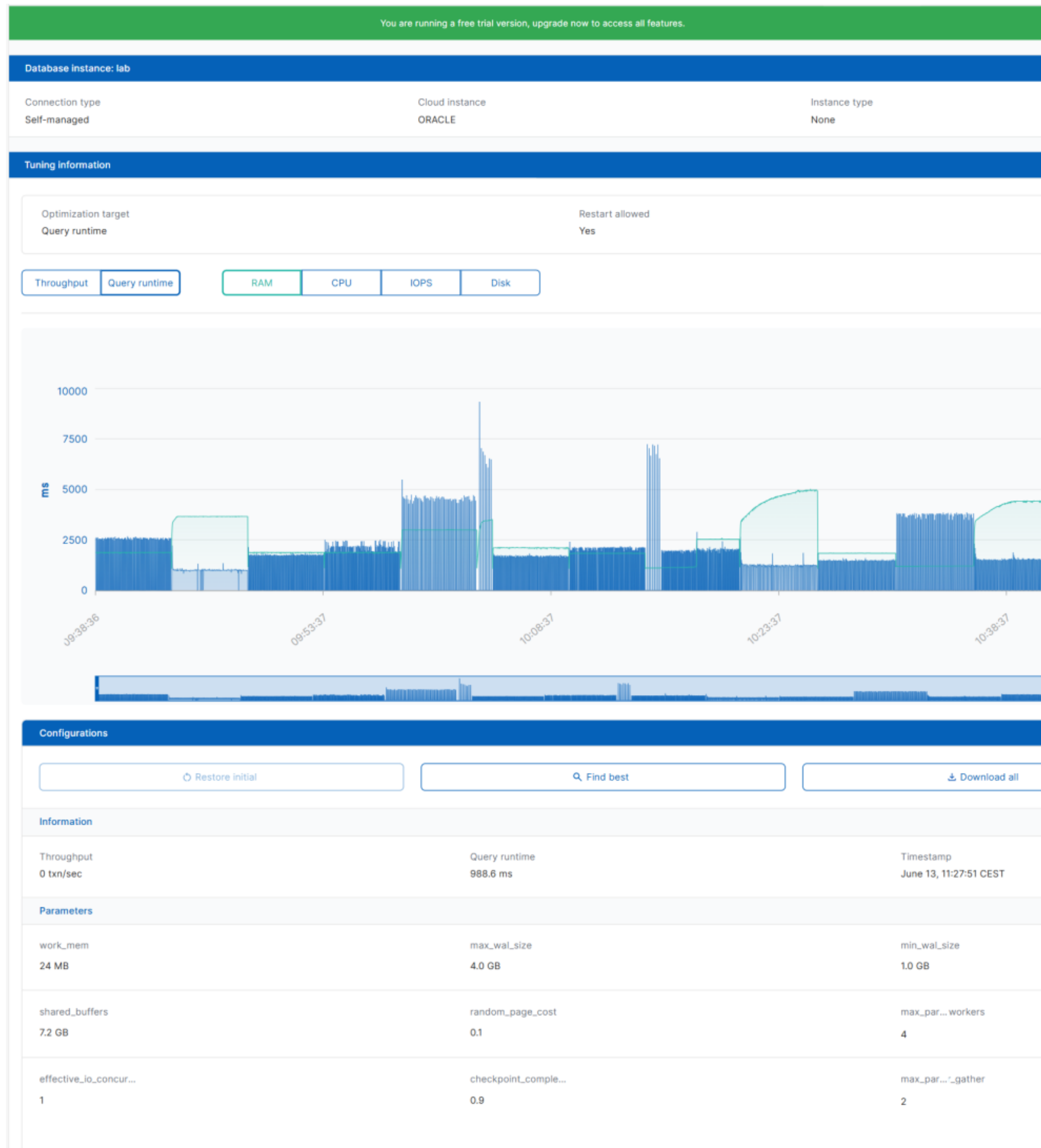
Parameter tuning in PostgreSQL involves the adjustment of various configuration settings inside `postgresql.conf` file which dictates how the database operates. These parameters affect many aspects of the database's operation which includes memory allocation, query planning, connection handling and disk I/O operations. Proper tuning ensures that PostgreSQL runs efficiently, making full use of the available hardware resources

- Across all tests cases DBtune delivered improvement in performance up to 13.6x
- Compared to manual tuning DBtune achieved 2.2x speedup

Blog: <https://stormatics.tech/alis-planet-postgresql/postgresql-tuning-and-dbtune>



# Independent technical analysis by Franck Pachot

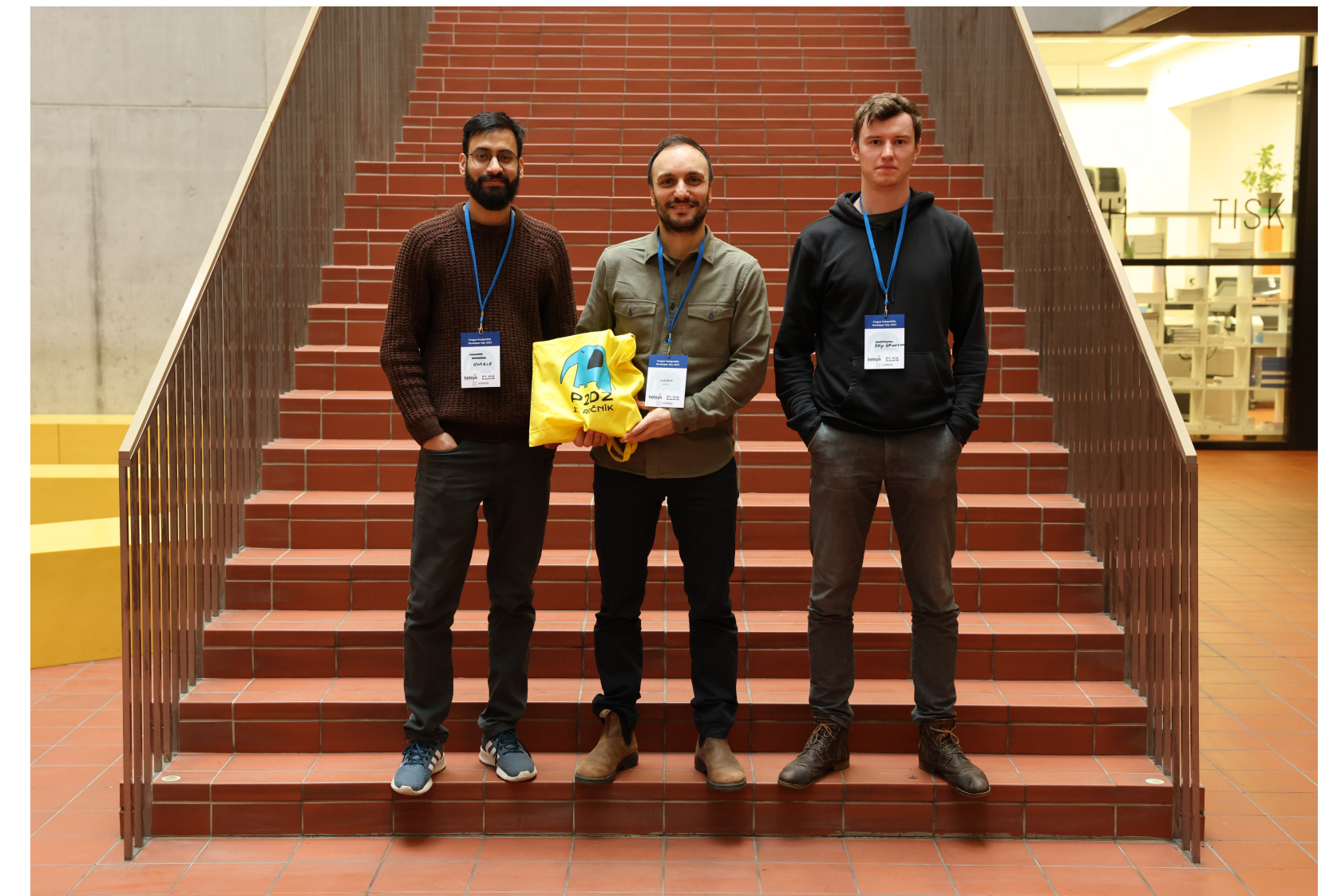


- DBTune proposes to optimize parameters you wouldn't think of
- Using DBTune doesn't mean that the DBA goes on vacation — DBTune does the boring stuff
- Humans prefer stable configuration, AI is more aggressive

Blog: <https://www.linkedin.com/pulse/testing-dbtune-showing-postgresql-double-buffering-some-franck-pachot-voyhe>

# PG Developer Day Prague DBtune training

Live DBtune tuning with 25 attendees (January 31st, 2023)



*On the left, a photo of our training session. On the top right three members of the DBtune team, Umair, Luigi and Filip, who delivered the training, and bottom the full event.*

Useful links -> [github.com/dbtuneai/synthetic\\_workload](https://github.com/dbtuneai/synthetic_workload)  
Handout to try DBtune on a synthetic workload

luigi@dbtune.com



**dbtune**