

# Experimentação em Engenharia de Software

On the Performance of the Python Language

PG 54232  
PG 55972  
PG 57539

# Content

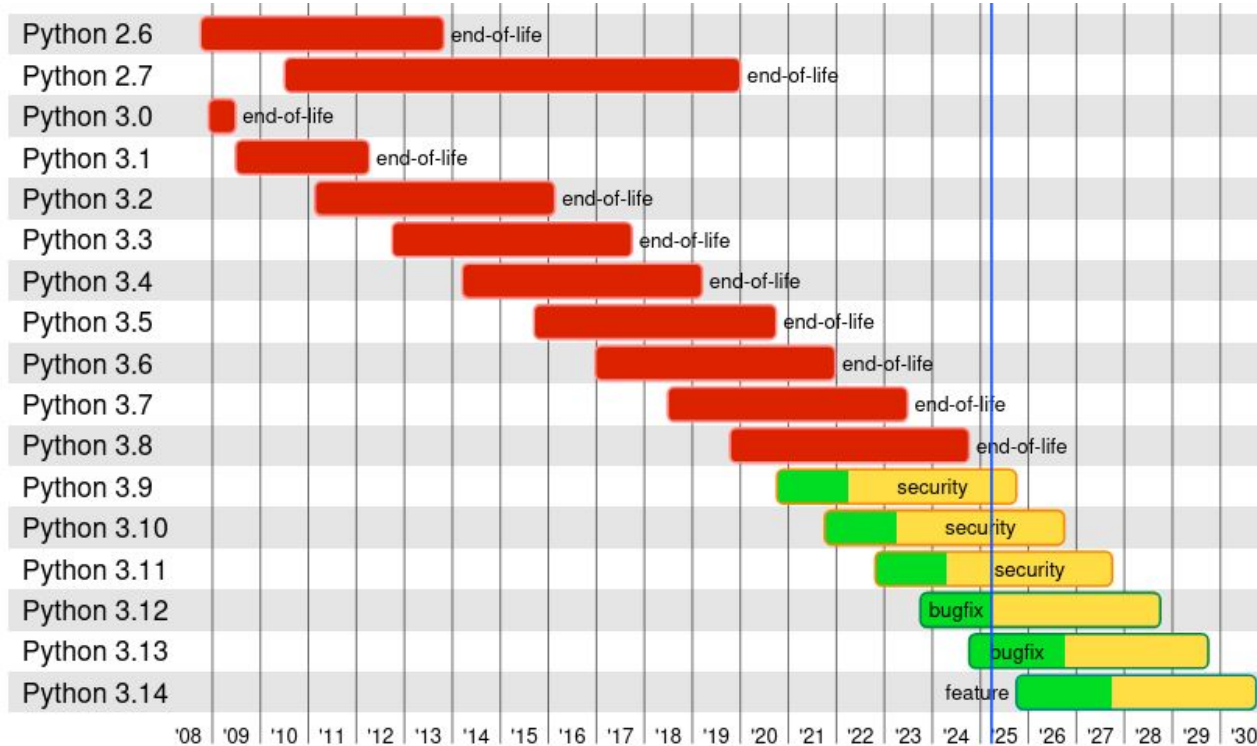
- Python
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- Methodology
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  - Data querying
- Authors Notes
  - Threats to validity
  - Future work
  - Conclusion

Python

# Python – Lifespan

<https://devguide.python.org/versions/#versions>

<https://endoflife.date/python>



# Python – Chosen Versions

| Version | Release Date  | Maintenance status |
|---------|---------------|--------------------|
| 3.13.2  | Feb. 4, 2025  | Bugfix             |
| 3.13.1  | Dec. 3, 2024  | Bugfix             |
| 3.12.9  | Feb. 4, 2025  | Bugfix             |
| 3.12.8  | Dec. 3, 2024  | Bugfix             |
| 3.12.3  | April 9, 2024 | Bugfix             |
| 3.11.11 | Dec. 3, 2024  | Security           |
| 3.10.16 | Dec. 3, 2024  | Security           |
| 3.9.21  | Dec. 3, 2024  | Security           |
| 2.0.1   | June 22, 2001 | End-of-life        |

<https://www.python.org/downloads/>

# Python – 2.0.x

Release: October 16, 2000

New features: Regular expressions w/ **re** module  
List Comprehensions  
String Methods

Curiosities:

No Boolean data type  
No **datetime** module!

# Python – 2.0.x :: List Comprehensions

## Traditional Loop:

```
squares = []  
  
for x in range(10):  
    squares.append(2**x)  
  
# [1, 2, 4, 8, 16, 32, 64, 128, 256, 512]
```



## List Comprehension:

```
squares = [2**x for x in range(10)]  
  
# [1, 2, 4, 8, 16, 32, 64, 128, 256, 512]
```



Inspired by Haskell

Provide a concise and often more readable way to create lists.

Combine a for loop, a optional if condition and the list creation into a single line.

# Python – 2.7

**Release:** June 22, 2001

**New features:**

Ordered dictionaries

*Imported from 3.1:*

**io** module rewritten in C



# Python – 2.7 :: Order dictionaries

```
>>> from collections import OrderedDict
>>> d = OrderedDict( [
...     ('A', 1) ,
...     ('C', 3) ,
...     ('B', 2)
... ] )

>>> d.items()
[('A', 1), ('B', 2), ('C', 3)]
```



Python 2.7 introduces a new **OrderedDict** class in the **collections** module.

# Python – 3.9.x

**Release:** Dec. 3, 2024

**Features:**

- Dictionary Merge
- Update Operator

**Curiosities:**

- Last version of python 3 with full backward 2.x compatibility

# Python – 3.9.x :: Dictionary Merge & Update Operators

```
>>> x = {"key1": "A", "key2": "B"}  
>>> y = {"key2": "100", "key3": "200"}
```

```
>>> y | x  
>>> y  
{  
    'key2': '100',  
    'key3': '200',  
    'key1': 'A'  
}
```

```
>>> y |= x  
>>> y  
{  
    'key2': 'B',  
    'key3': '200',  
    'key1': 'A'  
}
```



Merge ( | ) and update ( |= ) operators have been added to the built-in dict class.

# Python – 3.10.16

**Release:** Dec. 3, 2024

**New features:**

- Better error messages

# Python – 3.10.16 :: Better error messages

```
expected = {9: 1, 18: 2, 19: 2, 27: 3, 28: 3, 29: 3, 36: 4, 37: 4,  
            38: 4, 39: 4, 45: 5, 46: 5, 47: 5, 48: 5, 49: 5, 54: 6,  
some_other_code = foo()
```



## Previous:

```
File "example.py", line 3  
    some_other_code = foo()  
                        ^
```

SyntaxError: invalid syntax



## Current:

```
File "example.py", line 1  
expected = {9: 1, 18: 2, 19: 2, 27: 3, 28: 3, 29: 3, 36: 4, 37: 4,  
            ^
```

SyntaxError: '{' was never closed



# Python – 3.12.9

**Release:** Feb. 4, 2025

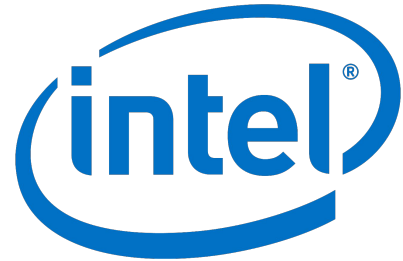
**New features:**

Thread locking mechanism – GIL

# Methodology

# Benchmarking Methodology

- Run 10x *via* RAPL
  - Delete min and max outliers
    - Mean

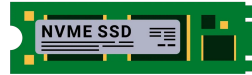
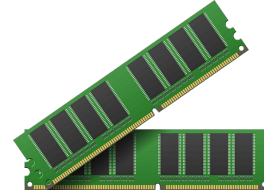
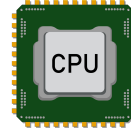




Environment

# Inspects

- CPU
  - Intel(R) Core(TM) i3-9100F CPU @ 3.60GHz
    - 4 Cores - 4 Threads
- RAM
  - DDR4 @ 2400 MHz
    - 8GB Dual Band (16 GB)
- ROM
  - M.2 2280 NVMe SSD
    - R 2,400 MB/s
- OS
  - Ubuntu 24.04.2 LTS
    - Linux 6.11.0-19-generic x86\_64



# C Language Compiler

- GCC
  - V 13.3.0



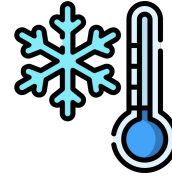
Core 0: 25.0°C

Core 1: 25.0°C

Core 2: 25.0°C

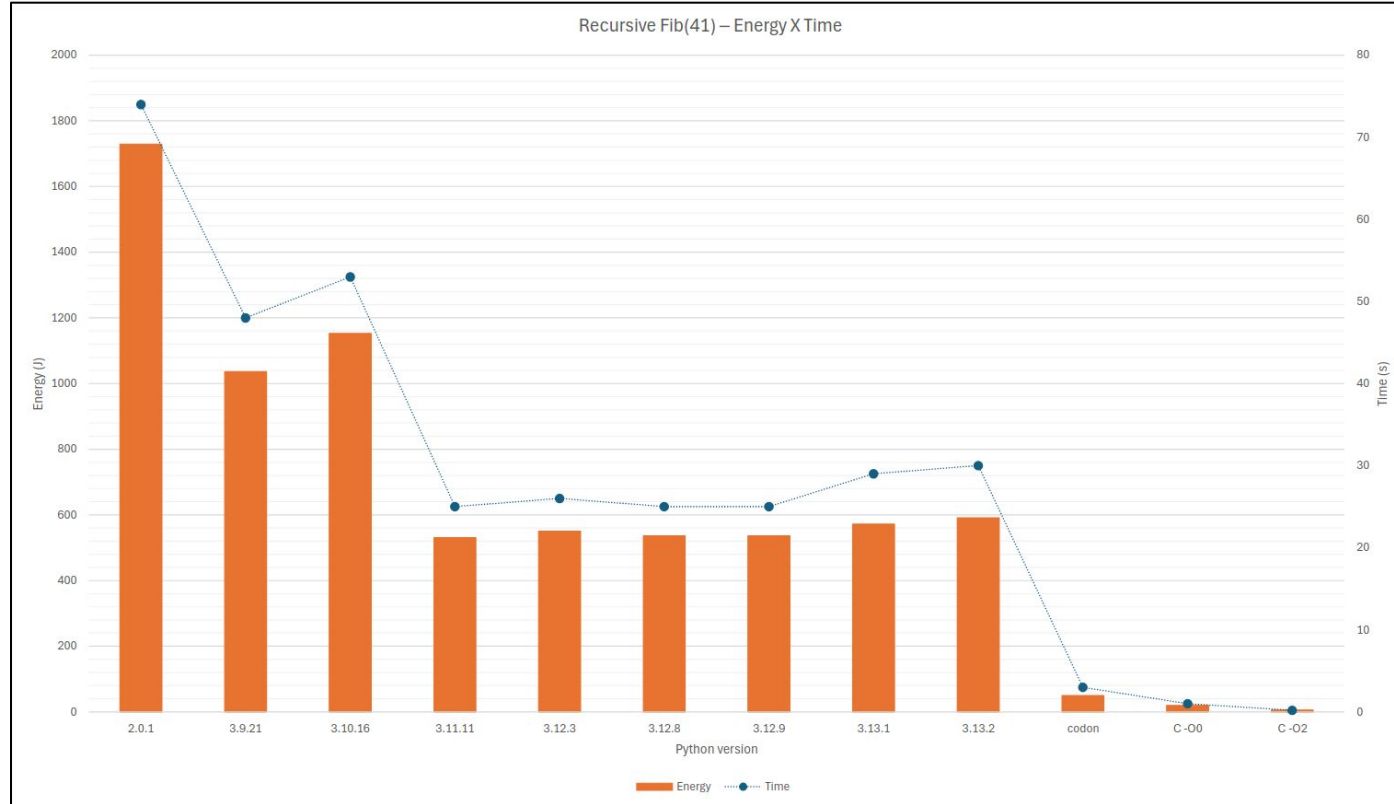
Core 3: 25.0°C

Average Temperature: 25.0°C



# Fibonacci Recursive

# Fibonacci Recursive (41) – Energy X Time



# Fibonacci Recursive (41) – Energy X Time

| Version | Energy (J) | Time (s) |
|---------|------------|----------|
| 2.0.1   | 1 729.51   | 74.1     |
| 3.9.21  | 1 036.47   | 48.6     |
| 3.10.16 | 1 153.91   | 53.8     |
| 3.11.11 | 531.16     | 25.5     |
| 3.12.3  | 550.93     | 26.3     |
| 3.12.8  | 536.45     | 25.2     |
| 3.12.9  | 536.49     | 25.3     |
| 3.13.1  | 572.52     | 29.1     |
| 3.13.2  | 591.31     | 29.4     |
| codon   | 50.4       | 2.4      |
| C -O0   | 20.79      | 1.1      |
| C -O2   | 5.58       | 0.3      |

# Fibonacci Recursive (41) – Powerup X Speedup X Greenup

| Version | Powerup | Speedup | Greenup |
|---------|---------|---------|---------|
| 2.0.1   | 1       | 1       | 1       |
| 3.9.21  | 0.9     | 1.5     | 1.7     |
| 3.10.16 | 0.9     | 1.4     | 1.5     |
| 3.11.11 | 0.9     | 2.9     | 3.3     |
| 3.12.3  | 0.9     | 2.8     | 3.1     |
| 3.12.8  | 0.9     | 2.9     | 3.2     |
| 3.12.9  | 0.9     | 2.9     | 3.2     |
| 3.13.1  | 0.8     | 2.6     | 3.0     |
| 3.13.2  | 0.9     | 2.5     | 2.9     |
| codon   | 0.9     | 30.6    | 34.3    |
| C -O0   | 0.8     | 63.4    | 83.2    |
| C -O2   | 0.8     | 248.9   | 309.9   |



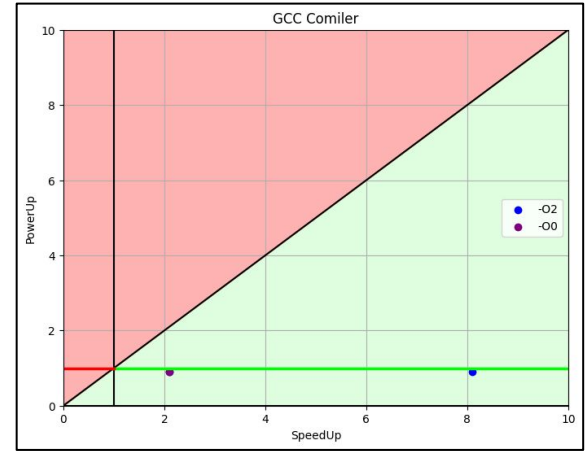
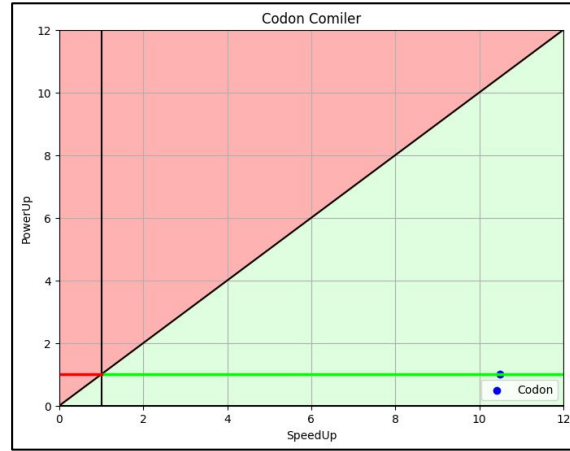
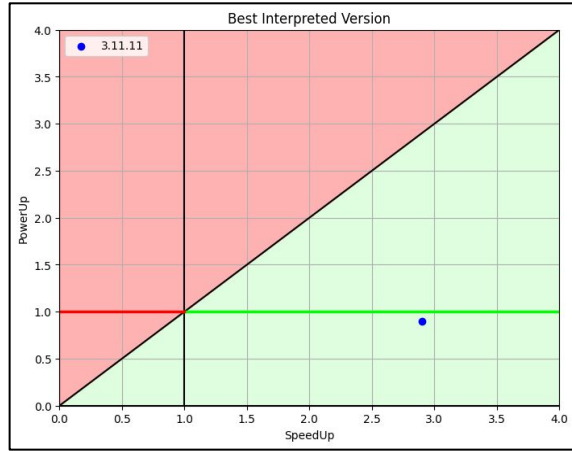
# Fibonacci Recursive (41) – Powerup X Speedup X Greenup

| Version | Powerup | Speedup | Greenup |
|---------|---------|---------|---------|
| 2.0.1   | 1       | 1       | 1       |
| 3.9.21  | 0.9     | 1.5     | 1.7     |
| 3.10.16 | 0.9     | 1.4     | 1.5     |
| 3.11.11 | 0.9     | 2.9     | 3.3     |
| 3.12.3  | 0.9     | 2.8     | 3.1     |
| 3.12.8  | 0.9     | 2.9     | 3.2     |
| 3.12.9  | 0.9     | 2.9     | 3.2     |
| 3.13.1  | 0.8     | 2.6     | 3.0     |
| 3.13.2  | 0.9     | 2.5     | 2.9     |
| codon   | 0.9     | 30.6    | 34.3    |
| C-O0    | 0.8     | 63.4    | 83.2    |
| C-O2    | 0.8     | 248.9   | 309.9   |

| Version | Powerup | Speedup | Greenup |
|---------|---------|---------|---------|
| 3.11.11 | 1       | 1       | 1       |
| codon   | 1.0     | 10.5    | 10.5    |
| C-O0    | 0.9     | 21.8    | 25.5    |
| C-O2    | 0.9     | 85.7    | 95.2    |

| Version | Powerup | Speedup | Greenup |
|---------|---------|---------|---------|
| codon   | 1       | 1       | 1       |
| C-O0    | 0.9     | 2.1     | 2.4     |
| C-O2    | 0.9     | 8.1     | 9.0     |

# Fibonacci Recursive (41) – GPS



# Querying

# Querying – Data

| USER             |             |            |
|------------------|-------------|------------|
| Field            | Type        | Constraint |
| username         | VARCHAR(75) | PK         |
| name             | VARCHAR(75) | –          |
| gender           | VARCHAR(1)  | ENUM       |
| birth_date       | DATE        | –          |
| account_creation | DATE        | –          |
| pay_method       | VARCHAR(16) | ENUM       |
| account_status   | VARCHAR(8)  | ENUM       |

| RIDE         |             |            |
|--------------|-------------|------------|
| Field        | Type        | Constraint |
| id           | VARCHAR(75) | PK         |
| date         | DATE        | –          |
| driver       | INTEGER     | FK         |
| user         | VARCHAR(75) | FK         |
| city         | VARCHAR(64) | –          |
| distance     | INTEGER     | –          |
| score_user   | FLOAT       | –          |
| score_driver | FLOAT       | –          |
| tip          | FLOAT       | –          |
| comment      | TEXT        | –          |

| DRIVER           |             |            |
|------------------|-------------|------------|
| Field            | Type        | Constraint |
| id               | INTEGER     | PK         |
| name             | VARCHAR(75) | –          |
| gender           | VARCHAR(1)  | ENUM       |
| birth_date       | DATE        | –          |
| account_creation | DATE        | –          |
| account_status   | VARCHAR(8)  | ENUM       |
| car_class        | VARCHAR(8)  | ENUM       |
| license_plate    | VARCHAR(8)  | –          |
| city             | VARCHAR(64) | –          |

# Querying – Data

| USER             |             |            |
|------------------|-------------|------------|
| Field            | Type        | Constraint |
| username         | VARCHAR(75) | PK         |
| name             | VARCHAR(75) | –          |
| gender           | VARCHAR(1)  | ENUM       |
| birth_date       | DATE        | –          |
| account_creation | DATE        | –          |
| pay_method       | VARCHAR(16) | ENUM       |
| account_status   | VARCHAR(8)  | ENUM       |

| RIDE         |             |            |
|--------------|-------------|------------|
| Field        | Type        | Constraint |
| id           | VARCHAR(75) | PK         |
| date         | DATE        | –          |
| driver       | INTEGER     | FK         |
| user         | VARCHAR(75) | FK         |
| city         | VARCHAR(64) | –          |
| distance     | INTEGER     | –          |
| score_user   | FLOAT       | –          |
| score_driver | FLOAT       | –          |
| tip          | FLOAT       | –          |
| comment      | TEXT        | –          |

# Relationships

| DRIVER           |             |            |
|------------------|-------------|------------|
| Field            | Type        | Constraint |
| id               | INTEGER     | PK         |
| name             | VARCHAR(75) | –          |
| gender           | VARCHAR(1)  | ENUM       |
| birth_date       | DATE        | –          |
| account_creation | DATE        | –          |
| account_status   | VARCHAR(8)  | ENUM       |
| car_class        | VARCHAR(8)  | ENUM       |
| license_plate    | VARCHAR(8)  | –          |
| city             | VARCHAR(64) | –          |

# Querying – Process

Load

Validation

Structure

Query

1.38 GB

1 000 001

+

100 001

+

10 000 001

=

11 100 003

Index by '**username**'

Access structures

Index by '**driver\_id**'

Calculate

Index by *fit*

# Querying – Process

Load

1.38 GB

Validation

$$\begin{array}{r} 1\ 000\ 001 \\ + \\ 100\ 001 \\ + \\ 10\ 000\ 001 \\ \\ = \\ 11\ 100\ 003 \end{array}$$

Structure

Index by '**username**'

Index by '**driver\_id**'

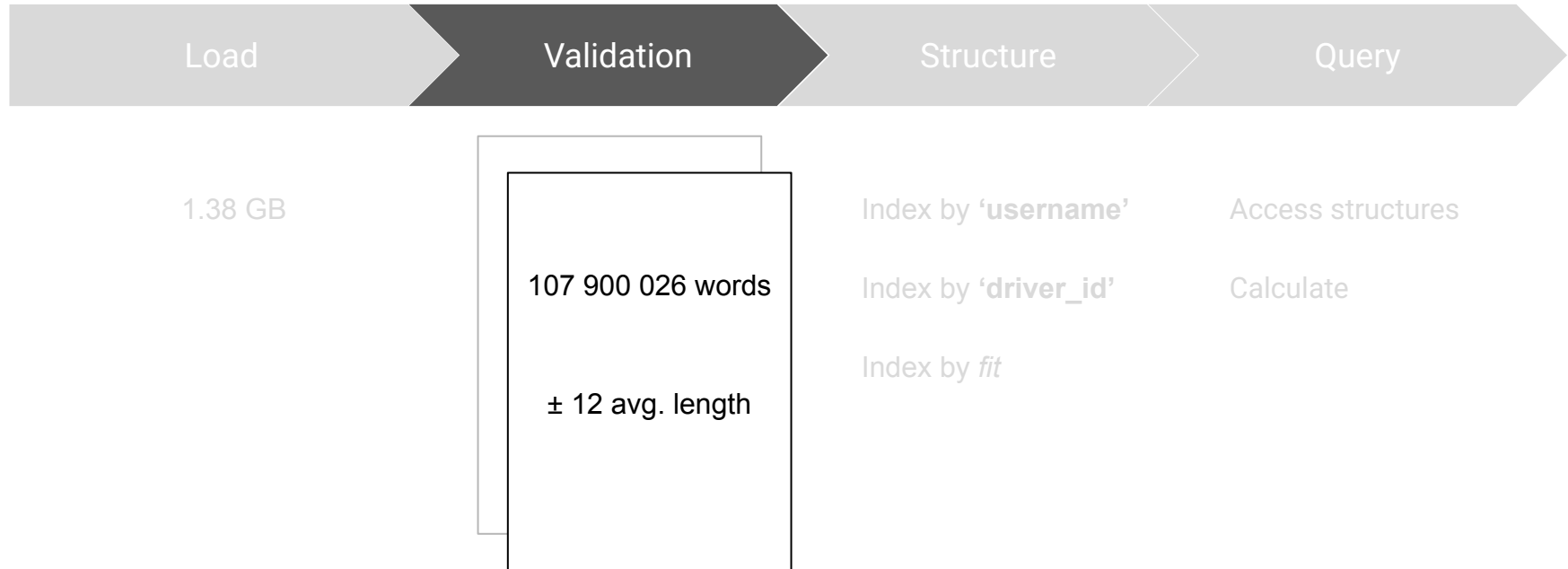
Index by *fit*

Query

Access structures

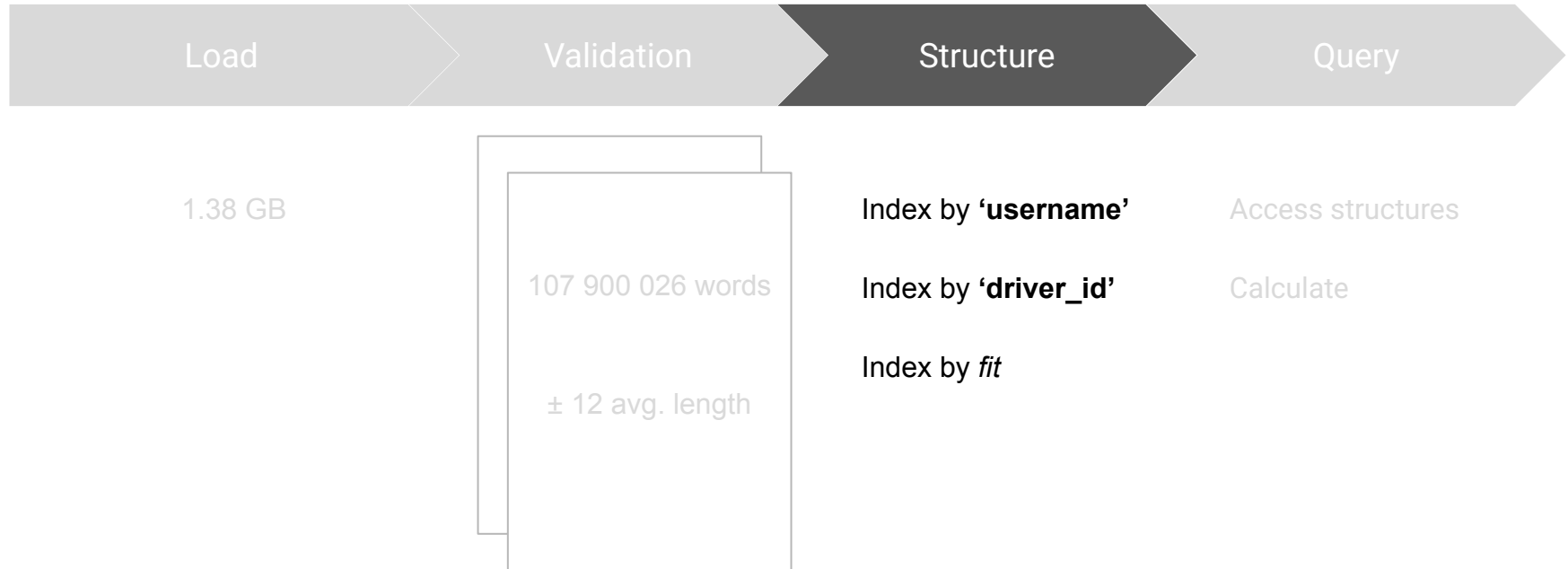
Calculate

# Querying – Process





# Querying – Process



# Querying – Process

Load

Validation

Structure

Query

1.38 GB

107 900 026 words

± 12 avg. length

Index by **'username'**

Index by **'driver\_id'**

Index by *fit*

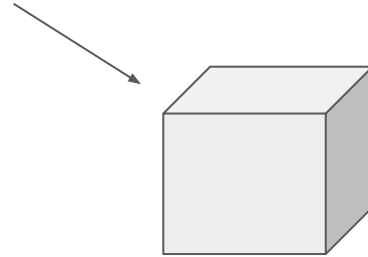
Access structures

Calculate

# User Profiling

# Querying – User profiling

username



- ★ Nome
- ★ Género
- ★ Idade
- ★ Avaliação média
- ★ Número de viagens
- ★ Total gasto €

# Querying – User profiling

| USER             |             |            |
|------------------|-------------|------------|
| Field            | Type        | Constraint |
| username         | VARCHAR(75) | PK         |
| name             | VARCHAR(75) | –          |
| gender           | VARCHAR(1)  | ENUM       |
| birth_date       | DATE        | –          |
| account_creation | DATE        | –          |
| pay_method       | VARCHAR(16) | ENUM       |
| account_status   | VARCHAR(8)  | ENUM       |

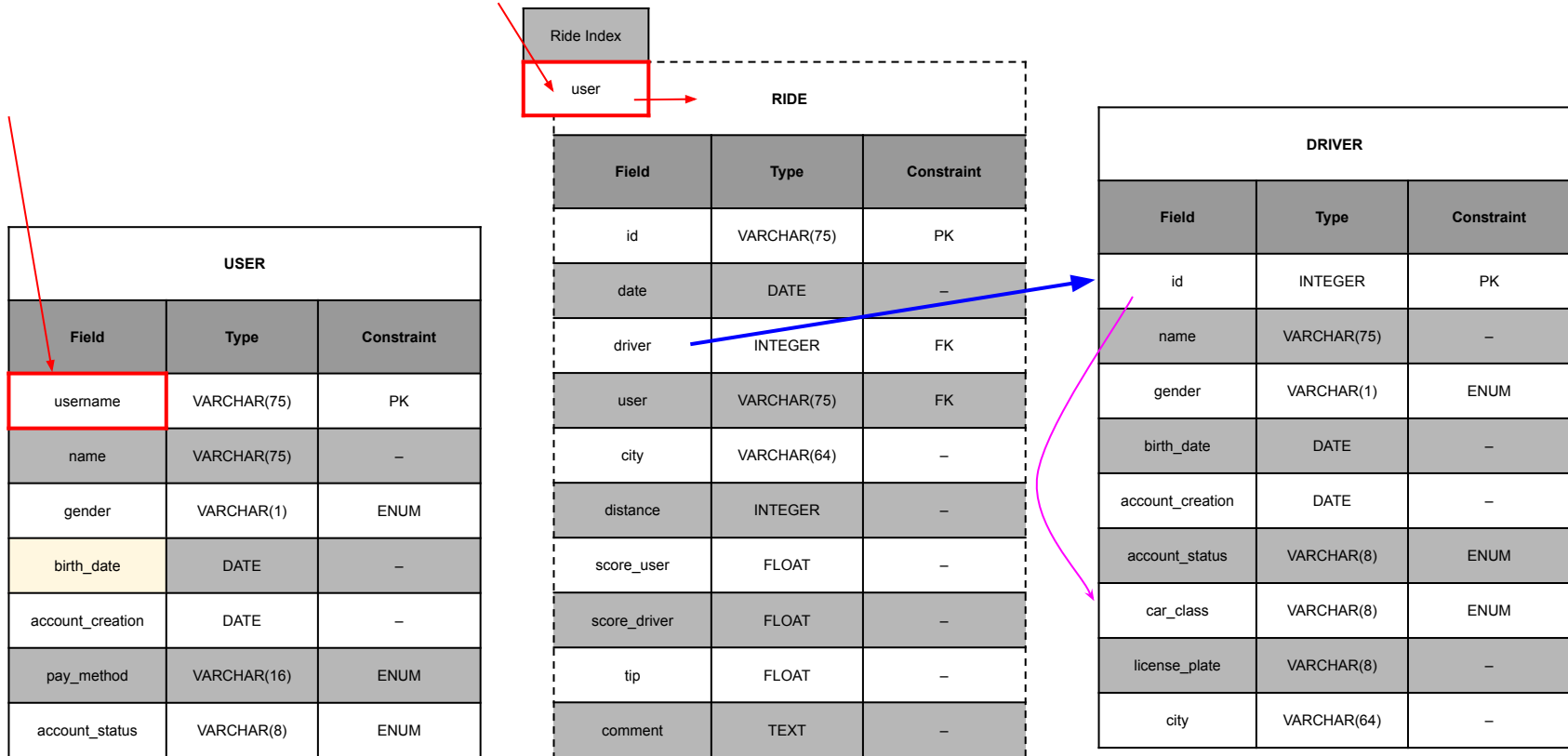
| RIDE         |             |            |
|--------------|-------------|------------|
| Field        | Type        | Constraint |
| id           | VARCHAR(75) | PK         |
| date         | DATE        | –          |
| driver       | INTEGER     | FK         |
| user         | VARCHAR(75) | FK         |
| city         | VARCHAR(64) | –          |
| distance     | INTEGER     | –          |
| score_user   | FLOAT       | –          |
| score_driver | FLOAT       | –          |
| tip          | FLOAT       | –          |
| comment      | TEXT        | –          |

# Structure

| DRIVER           |             |            |
|------------------|-------------|------------|
| Field            | Type        | Constraint |
| id               | INTEGER     | PK         |
| name             | VARCHAR(75) | –          |
| gender           | VARCHAR(1)  | ENUM       |
| birth_date       | DATE        | –          |
| account_creation | DATE        | –          |
| account_status   | VARCHAR(8)  | ENUM       |
| car_class        | VARCHAR(8)  | ENUM       |
| license_plate    | VARCHAR(8)  | –          |
| city             | VARCHAR(64) | –          |

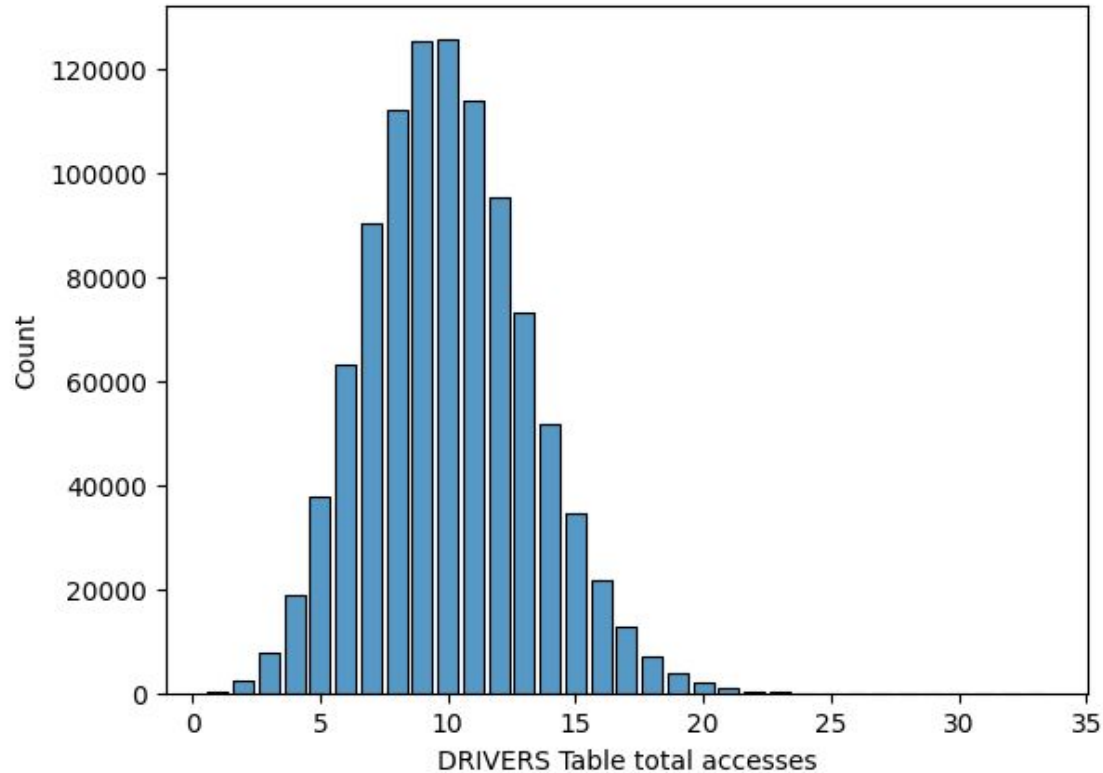
# Querying – User profiling

# Relating



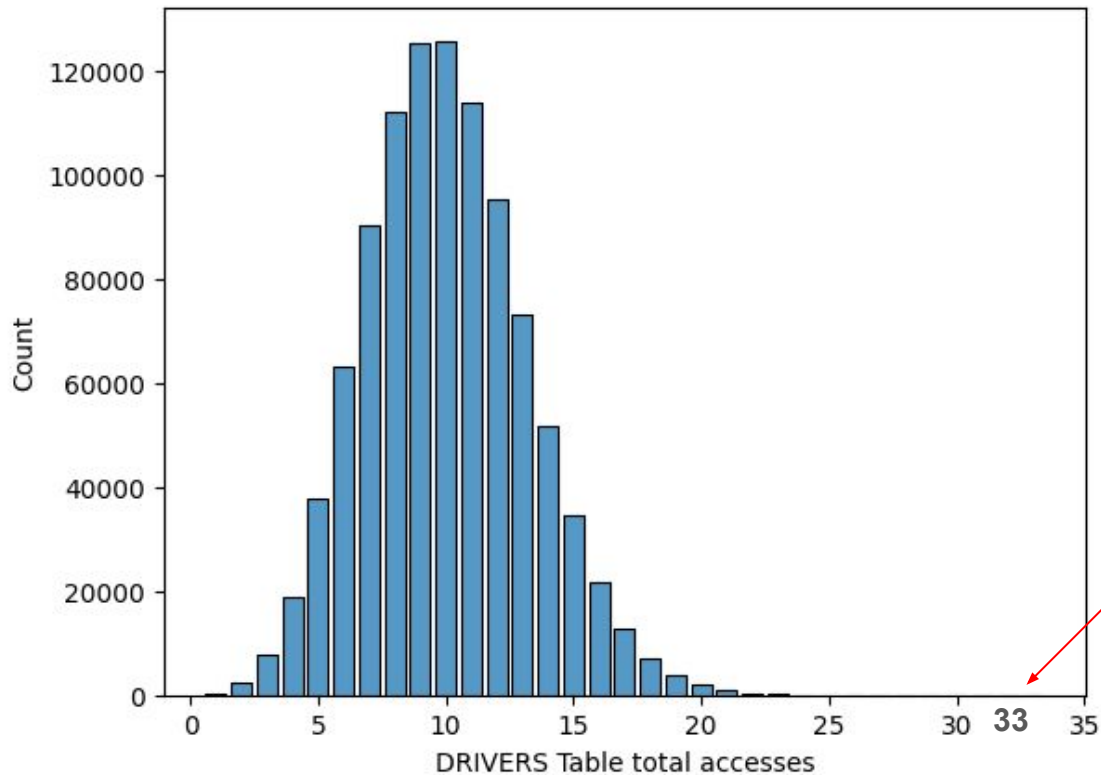
## Querying – User profiling

## Benchmark representativeness



# Querying – User profiling

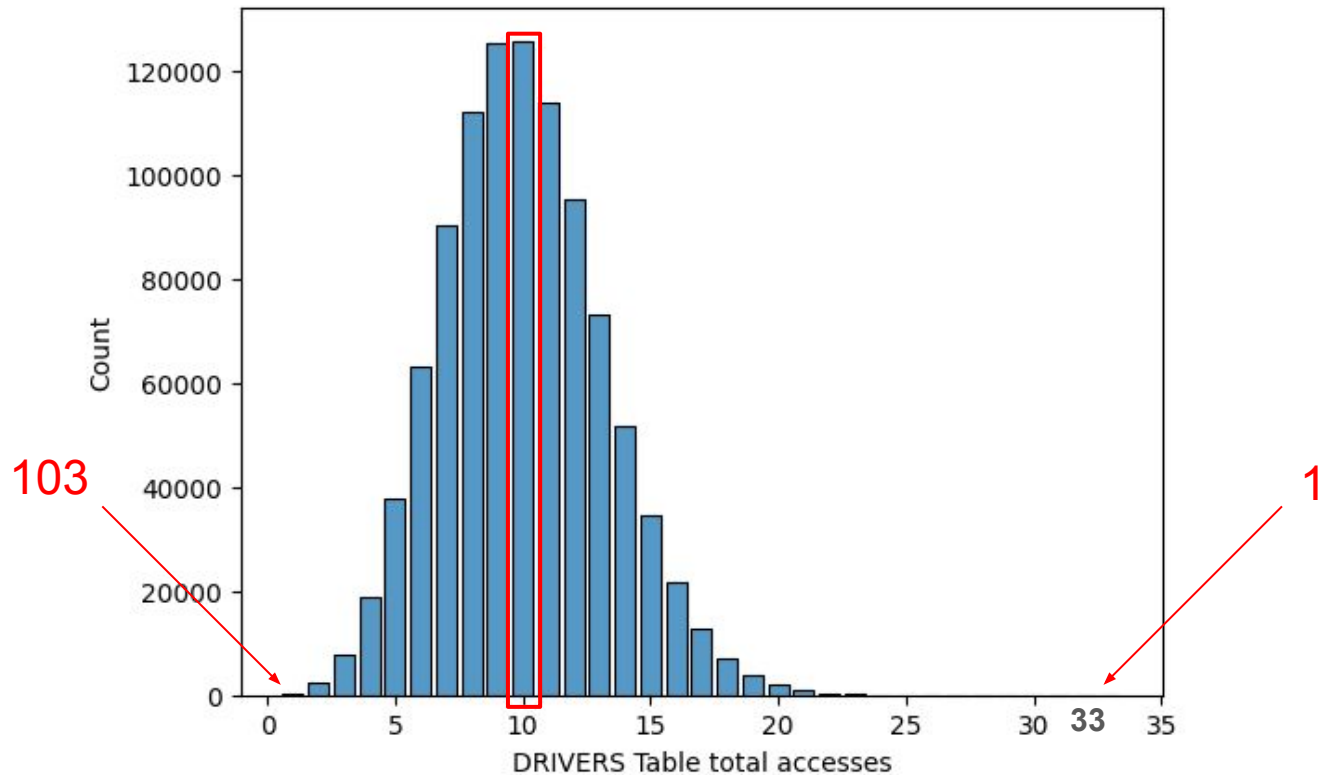
## Benchmark representativeness





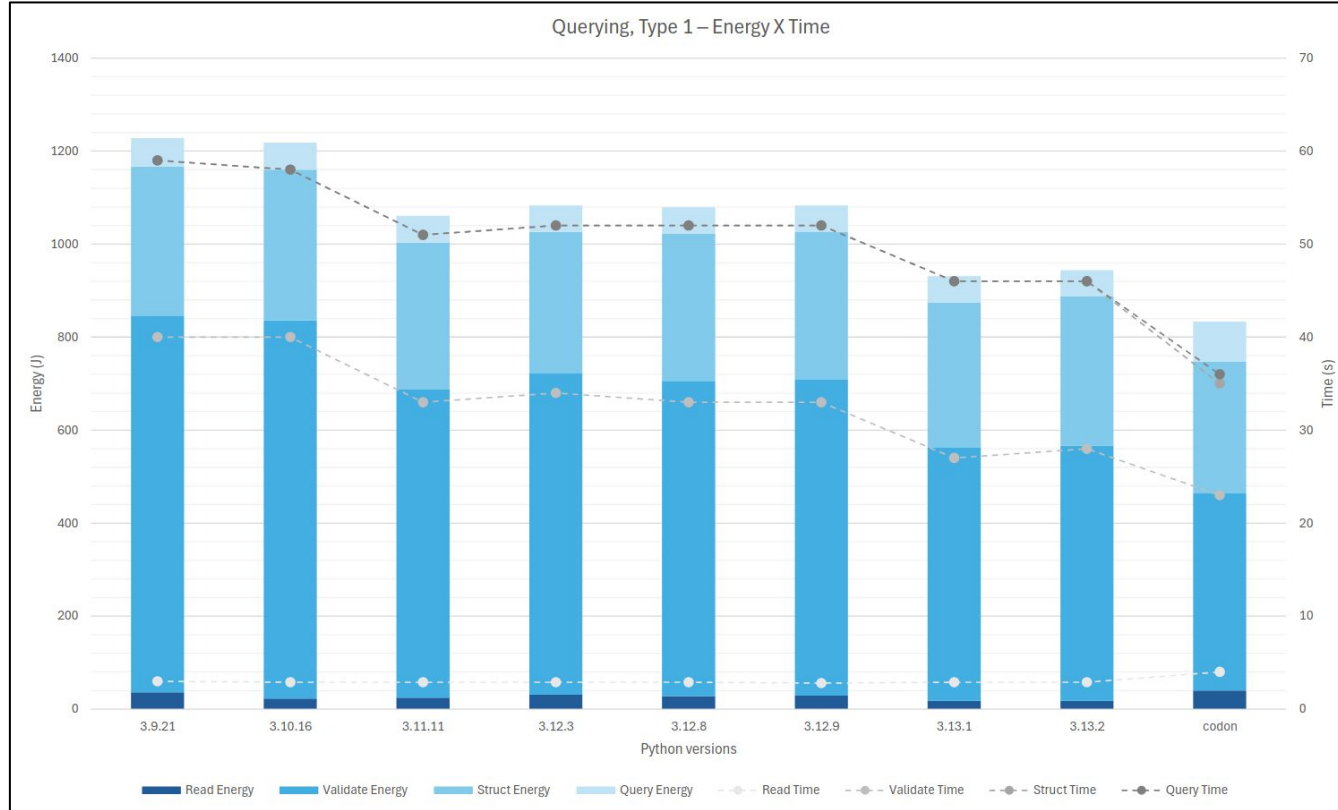
## Querying – User profiling

## Benchmark representativeness



# Querying – Process

# Energy X Time



# Querying

# Energy X Time

Load

Validation

Structure

Query

## 1 access

| Version | Energy (J) | Time (s) |
|---------|------------|----------|
| 3.9.21  | 1 228.51   | 59.4     |
| 3.10.16 | 1 218.98   | 58.6     |
| 3.11.11 | 1 061.06   | 51.5     |
| 3.12.3  | 1 083.83   | 52.5     |
| 3.12.8  | 1 079.52   | 52.4     |
| 3.12.9  | 1 083.32   | 52.7     |
| 3.13.1  | 931.24     | 46.0     |
| 3.13.2  | 944.55     | 46.3     |
| Codon   | 833.02     | 36.6     |

## 10 accesses

| Version | Energy (J) | Time (s) |
|---------|------------|----------|
| 3.9.21  | 1 196.07   | 59.5     |
| 3.10.16 | 1 202.63   | 59.3     |
| 3.11.11 | 1 040.57   | 51.8     |
| 3.12.3  | 1 062.77   | 52.9     |
| 3.12.8  | 1 049.75   | 52.5     |
| 3.12.9  | 1 061.43   | 52.9     |
| 3.13.1  | 918.22     | 46.3     |
| 3.13.2  | 926.41     | 46.4     |
| Codon   | 832.95     | 36.6     |

## 33 accesses

| Version | Energy (J) | Time (s) |
|---------|------------|----------|
| 3.9.21  | 1 224.36   | 59.4     |
| 3.10.16 | 1 224.84   | 59.1     |
| 3.11.11 | 1 066.10   | 51.6     |
| 3.12.3  | 1 083.56   | 52.6     |
| 3.12.8  | 1 081.10   | 52.6     |
| 3.12.9  | 1 086.38   | 52.8     |
| 3.13.1  | 932.25     | 46.1     |
| 3.13.2  | 941.65     | 46.4     |
| Codon   | 835.38     | 36.6     |

# Querying

# Powerup X Speedup X Greenup



33 accesses

| Version | Powerup | Speedup | Greenup |
|---------|---------|---------|---------|
| 3.9.21  | 1       | 1       | 1       |
| 3.10.16 | 1.01    | 1.01    | 1.00    |
| 3.11.11 | 1.00    | 1.15    | 1.15    |
| 3.12.3  | 1.00    | 1.13    | 1.13    |
| 3.12.8  | 1.00    | 1.13    | 1.13    |
| 3.12.9  | 1.00    | 1.12    | 1.13    |
| 3.13.1  | 0.98    | 1.29    | 1.31    |
| 3.13.2  | 0.98    | 1.28    | 1.30    |
| Codon   | 1.11    | 1.62    | 1.47    |

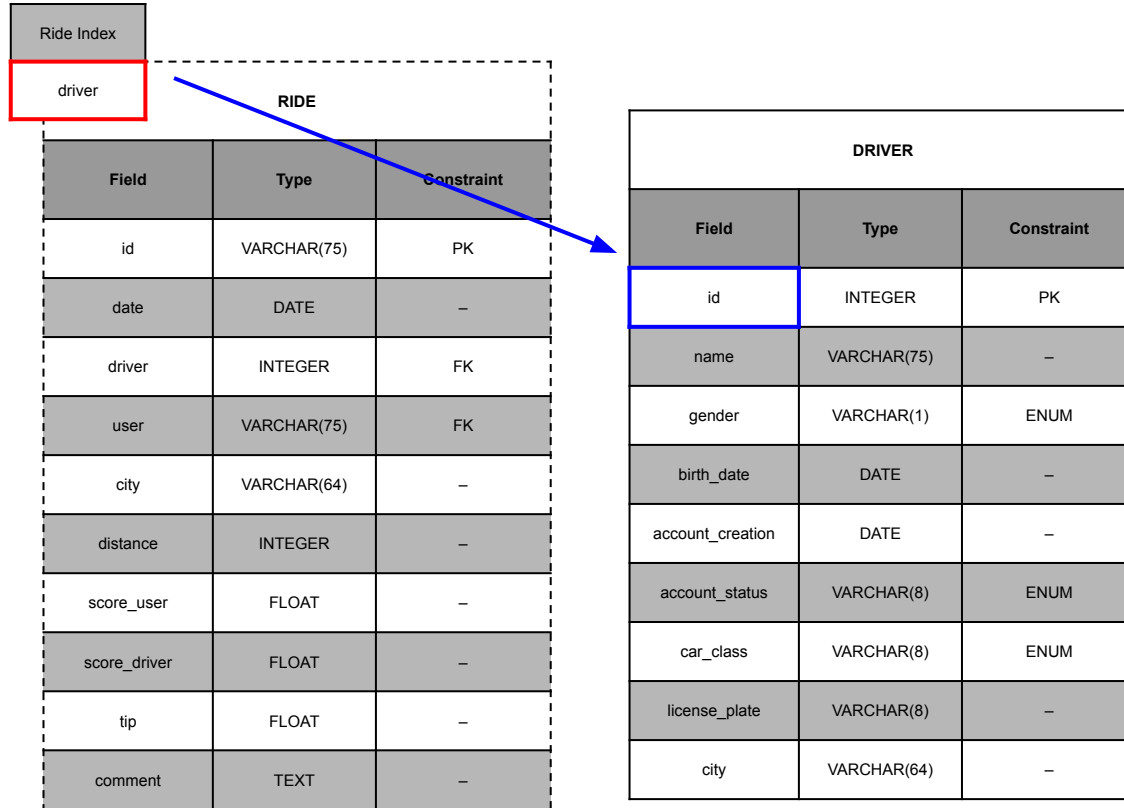
33 accesses

| Version | Powerup | Speedup | Greenup |
|---------|---------|---------|---------|
| 3.13.1  | 1       | 1       | 1       |
| Codon   | 1.13    | 1.26    | 1.12    |

Drivers Score Rank

# Querying – Driver score rank

## Structure



# Querying

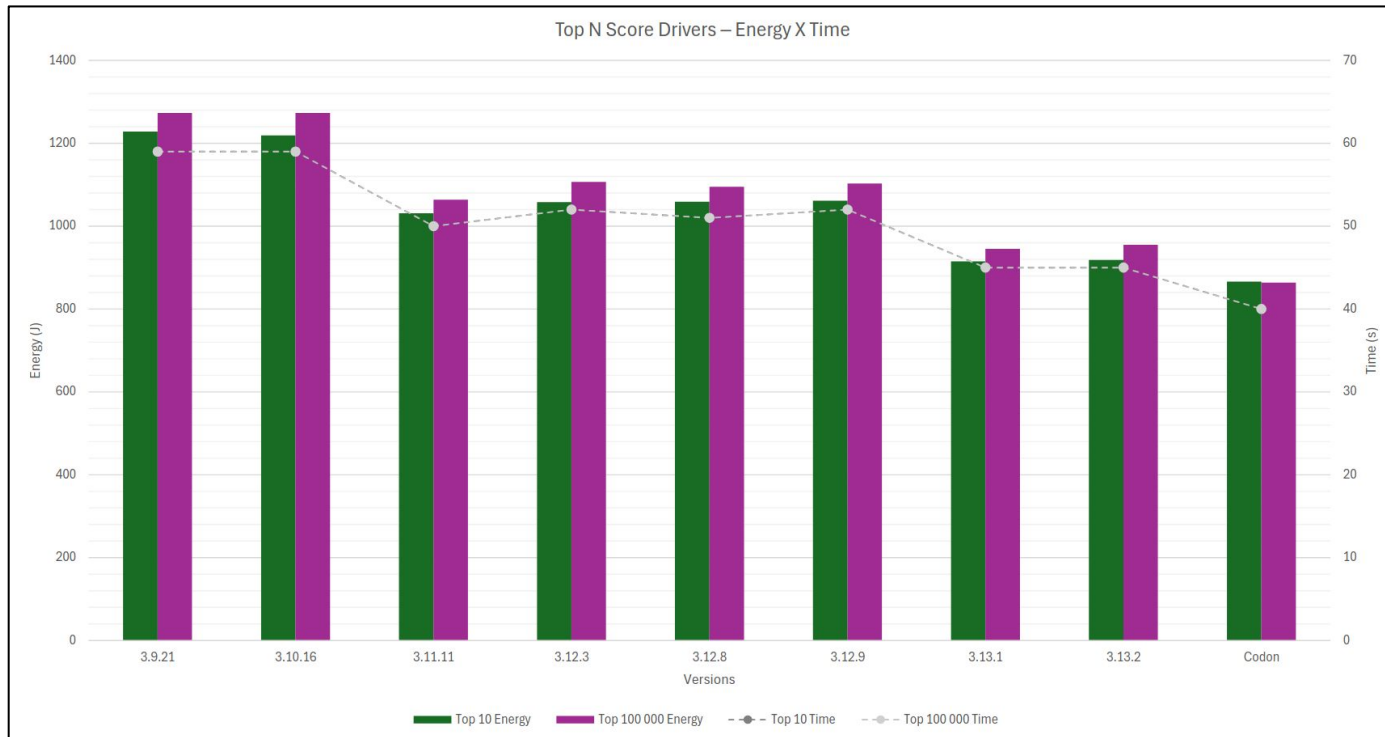
# Energy X Time

Load

Validation

Structure

Query





## Top 10

| Version | Energy (J) | Time (s) |
|---------|------------|----------|
| 3.9.21  | 1 228      | 59.3     |
| 3.10.16 | 1 219.12   | 58.6     |
| 3.11.11 | 1 030.53   | 50.1     |
| 3.12.3  | 1 057.81   | 51.4     |
| 3.12.8  | 1 058.46   | 51.3     |
| 3.12.9  | 1 060.90   | 51.5     |
| 3.13.1  | 914.72     | 45.1     |
| 3.13.2  | 917.76     | 45.3     |
| Codon   | 863.69     | 39.5     |

## Top 100 000

| Version | Energy (J) | Time (s) |
|---------|------------|----------|
| 3.9.21  | 1 273.43   | 59.2     |
| 3.10.16 | 1 272.59   | 58.9     |
| 3.11.11 | 1 063.56   | 50.1     |
| 3.12.3  | 1 106.79   | 51.7     |
| 3.12.8  | 1 095.12   | 51.3     |
| 3.12.9  | 1 103.01   | 51.5     |
| 3.13.1  | 945.25     | 45.0     |
| 3.13.2  | 955.16     | 45.4     |
| Codon   | 865.74     | 39.6     |



# Querying

# Powerup X Speedup X Greenup

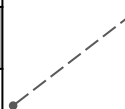


Top 100 000

| Version | Powerup | Speedup | Greenup |
|---------|---------|---------|---------|
| 3.9.21  | 1       | 1       | 1       |
| 3.10.16 | 1.00    | 1.01    | 1.00    |
| 3.11.11 | 0.99    | 1.18    | 1.20    |
| 3.12.3  | 1.00    | 1.15    | 1.15    |
| 3.12.8  | 0.99    | 1.15    | 1.16    |
| 3.12.9  | 1.00    | 1.15    | 1.15    |
| 3.13.1  | 0.98    | 1.32    | 1.35    |
| 3.13.2  | 0.98    | 1.30    | 1.33    |
| Codon   | 1.02    | 1.49    | 1.47    |

Top 100 000

| Version | Powerup | Speedup | Greenup |
|---------|---------|---------|---------|
| 3.13.1  | 1       | 1       | 1       |
| Codon   | 1.04    | 1.14    | 1.09    |



# Authors Notes

# Threats to Validity

- Representativeness
- Energy consumption as a whole

# Future Work

- Benchmark sorting algorithms
- Benchmark data structures
- Develop data analysis

# Conclusion

- Optimized interpreters
- Compiled
  - Best performance

# Experimentação em Engenharia de Software

On the Performance of the Python Language

PG 54232  
PG 55972  
PG 57539