



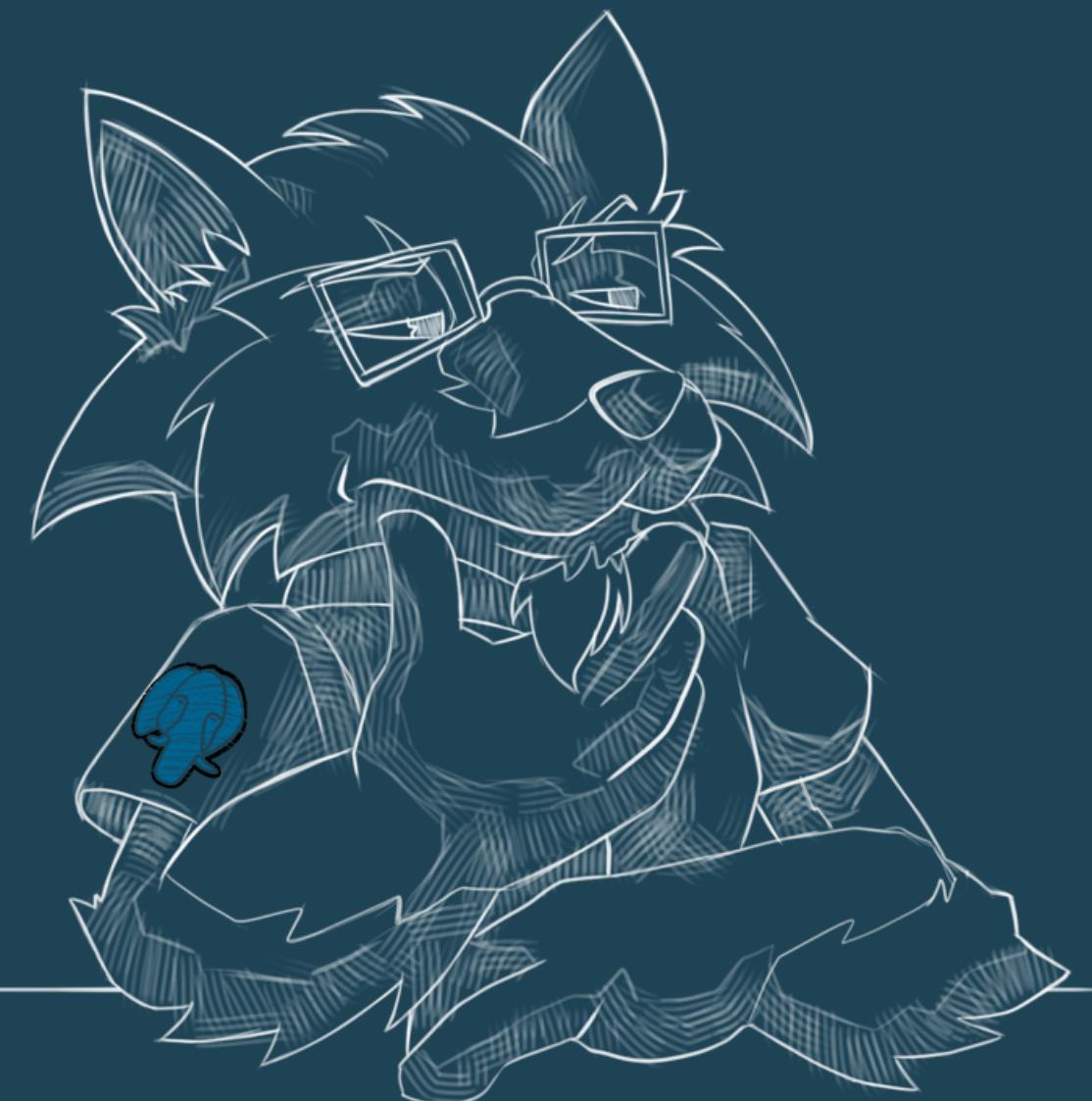
Hi! I'm Wolfnik. Postgres
DBA and developer, today
someone notified me that
database slow...



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Have you ever heard?

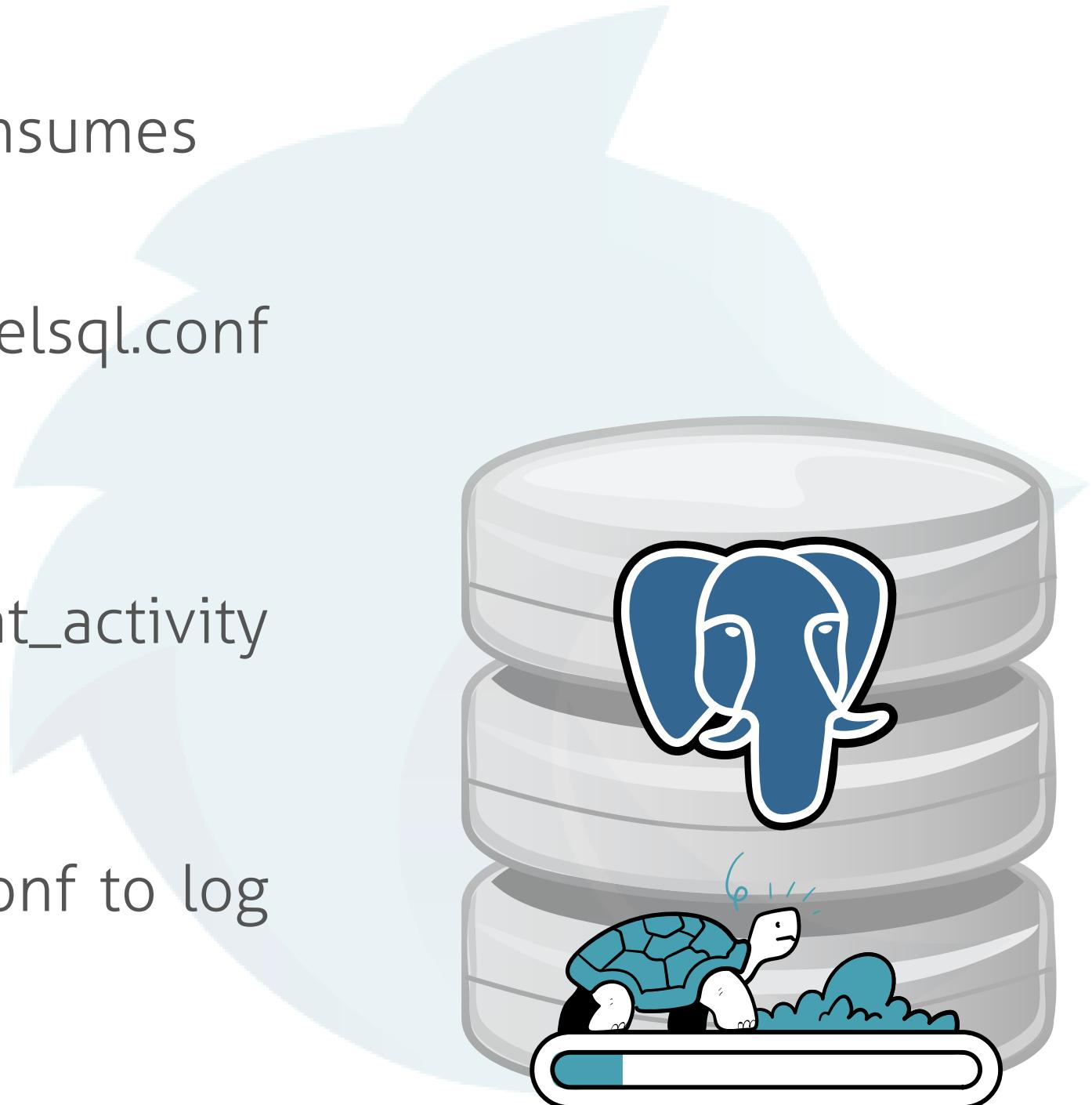
“the database is slow....”



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Possibles causes of the slow database

1. The hardware is not enough
 - a. To monitor resources of your hardware
 - b. To monitor how many OS's resources your database consumes
2. A bad configuration
 - a. After monitoring check your parameters in postgresql.conf mainly memory section
3. Poorly designed queries
 - a. First you need find the queries, some queries on pg_stat_activity could help you.
 - b. Just a simple top command in Linux helps you too.
 - c. Temporally, modify the log parameters in postgresql.conf to log slow queries
4. Another thousand possibles causes...



How to improve my query?



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When we found slow query...



Fix it! you're the DBA!!...

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**Wolfnik read about a sentence
that could help us to improve a
Query**



EXPLAIN

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Wolfnik doesn't know what EXPLAIN does and how it works...



`EXPLAIN [my_slow_query];`



What can be wrong?

just execute it...

```
$ psql wolfgres_db wolfnik_dba  
prod_db=# EXPLAIN SELECT * FROM my_slow_query;
```



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QUERY PLAN

```

WindowAgg (cost=353394.22..353394.24 rows=1 width=1487) (actual time=13655.595..13655.634 rows=36 loops=1)
  -> Sort (cost=353394.22..353394.22 rows=1 width=1479) (actual time=13655.595..13655.563 rows=36 loops=1)
    Sort Key: tango_seven.delta DESC
    Sort Method: quicksort Memory: 43kB
  -> Nested Loop (cost=67915.41..353394.21 rows=1 width=1479) (actual time=13042.811..13655.436 rows=36 loops=1)
    -> Nested Loop (cost=67915.27..353394.04 rows=1 width=1491) (actual time=13042.800..13655.280 rows=36 loops=1)
      -> Nested Loop (cost=67915.00..353391.11 rows=1 width=1503) (actual time=13042.788..13655.086 rows=36 loops=1)
        Join Filter: ((hotel_seven.uniform = three_xray.uniform) AND (hotel_seven.yankee = three_xray.yankee))
      -> Nested Loop (cost=67914.57..353386.87 rows=1 width=1507) (actual time=13042.726..13653.510 rows=36 loops=1)
        -> Gather (cost=67914.14..353382.83 rows=1 width=1495) (actual time=13042.686..13700.001 rows=21 loops=1)
          Workers Planned: 2
          Workers Launched: 2
        -> Hash Join (cost=66914.14..352382.73 rows=1 width=1495) (actual time=13156.217..13641.035 rows=7 loops=3)
          Hash Cond: (hotel_seven.seven_six1 = papa_golf.two)
        -> Parallel Hash Join (cost=66821.47..352288.89 rows=4 width=1499) (actual time=13017.340..13612.669 rows=152560 loops=3)
          Hash Cond: ((tango_seven.uniform = hotel_seven.uniform) AND (tango_seven.yankee = hotel_seven.yankee))
        -> Parallel Seq Scan on six_whiskey tango_seven (cost=0.00..284103.16 rows=181898 width=1479) (actual time=5.950..11805.629 rows=156382 loops=3)
          Filter: ((foxtrot_papa = 'four_uniform'::bit(1)) AND (kilo_juliet = 'kilo_india'::bpchar))
          Rows Removed by Filter: 1159958
        -> Parallel Hash (cost=66819.34..66819.34 rows=142 width=20) (actual time=1061.731..1061.731 rows=291342 loops=3)
          Buckets: 65536 (originally 1024) Batches: 16 (originally 1) Memory Usage: 3552kB
        -> Hash Join (cost=2.64..66819.34 rows=142 width=20) (actual time=0.124..798.322 rows=291342 loops=3)
          Hash Cond: ((hotel_seven.six_lima = foxtrot_xray.six_lima) AND (hotel_seven.foxtrot_six = foxtrot_xray.foxtrot_six))
        -> Parallel Seq Scan on tango_sierra hotel_seven (cost=0.00..64142.91 rows=356315 width=20) (actual time=0.037..621.636 rows=291342 loops=3)
          Filter: ((foxtrot_papa = 'four_uniform'::bit(1)) AND (golf = 'seven_tango'::bpchar))
          Rows Removed by Filter: 87444
        -> Hash (cost=2.62..2.62 rows=1 width=8) (actual time=0.066..0.066 rows=49 loops=3)
          Buckets: 1024 Batches: 1 Memory Usage: 10kB
        -> Seq Scan on oscar foxtrot_xray (cost=0.00..2.62 rows=1 width=8) (actual time=0.015..0.050 rows=49 loops=3)
          Filter: (foxtrot_papa = 'four_uniform'::bit(1))
          Rows Removed by Filter: 1
        -> Hash (cost=89.80..89.80 rows=230 width=4) (actual time=0.705..0.705 rows=15 loops=3)
          Buckets: 1024 Batches: 1 Memory Usage: 9kB
        -> Seq Scan on three_seven papa_golf (cost=0.00..89.80 rows=230 width=4) (actual time=0.039..0.693 rows=15 loops=3)
          Filter: ((foxtrot_papa = 'four_uniform'::bit(1)) AND ((golf)::bpchar = 'alpha'::bpchar))
          Rows Removed by Filter: 1515
        -> Index Scan using three_alpha on papa_charlie charlie (cost=0.43..4.03 rows=1 width=12) (actual time=0.014..0.015 rows=2 loops=21)
          Index Cond: ((uniform = hotel_seven.uniform) AND (yankee = hotel_seven.yankee))
          Filter: ((foxtrot_papa = 'four_uniform'::bit(1)) AND (hotel_seven.six_lima = six_lima))
        -> Index Scan using sierra on six_sierra three_xray (cost=0.43..4.23 rows=1 width=8) (actual time=0.025..0.042 rows=1 loops=36)
          Index Cond: ((uniform = charlie.uniform) AND (yankee = charlie.yankee))
          Filter: ((foxtrot_papa = 'four_uniform'::bit(1)) AND (bravo_six = 'kilo_india'::bpchar))
          Rows Removed by Filter: 16
        -> Index Scan using whiskey on xray_victor four_alpha (cost=0.27..2.92 rows=1 width=4) (actual time=0.003..0.004 rows=1 loops=36)
          Index Cond: (uniform = hotel_seven.uniform)
          Filter: ((foxtrot_papa)::text = 'four_uniform'::text)
        -> Index Scan using hotel_charlie on xray_november bravo_two (cost=0.14..0.16 rows=1 width=4) (actual time=0.002..0.003 rows=1 loops=36)
          Index Cond: (six_lima = charlie.six_lima)
          Filter: (foxtrot_papa = 'four_uniform'::bit(1))

```

Planning time: 56.132 ms



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How to understand EXPLAIN without dying in the attempt

Alfredo Rodríguez



@AlfredoDrakoRod



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SELECT * FROM me ;

- PostgreSQL Architect
- Wolfgres founder and start up
- I use PostgreSQL since 2010
- I'm really enthusiastic about Open Source and PostgreSQL community
- Call me Drako



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Before all! We need to understand basis

1. PostgreSQL basis
2. What is EXPLAIN
 - a. ANALYZE
3. Scan Methods
4. Join Methods
5. Overview other elements
 - a. Tools

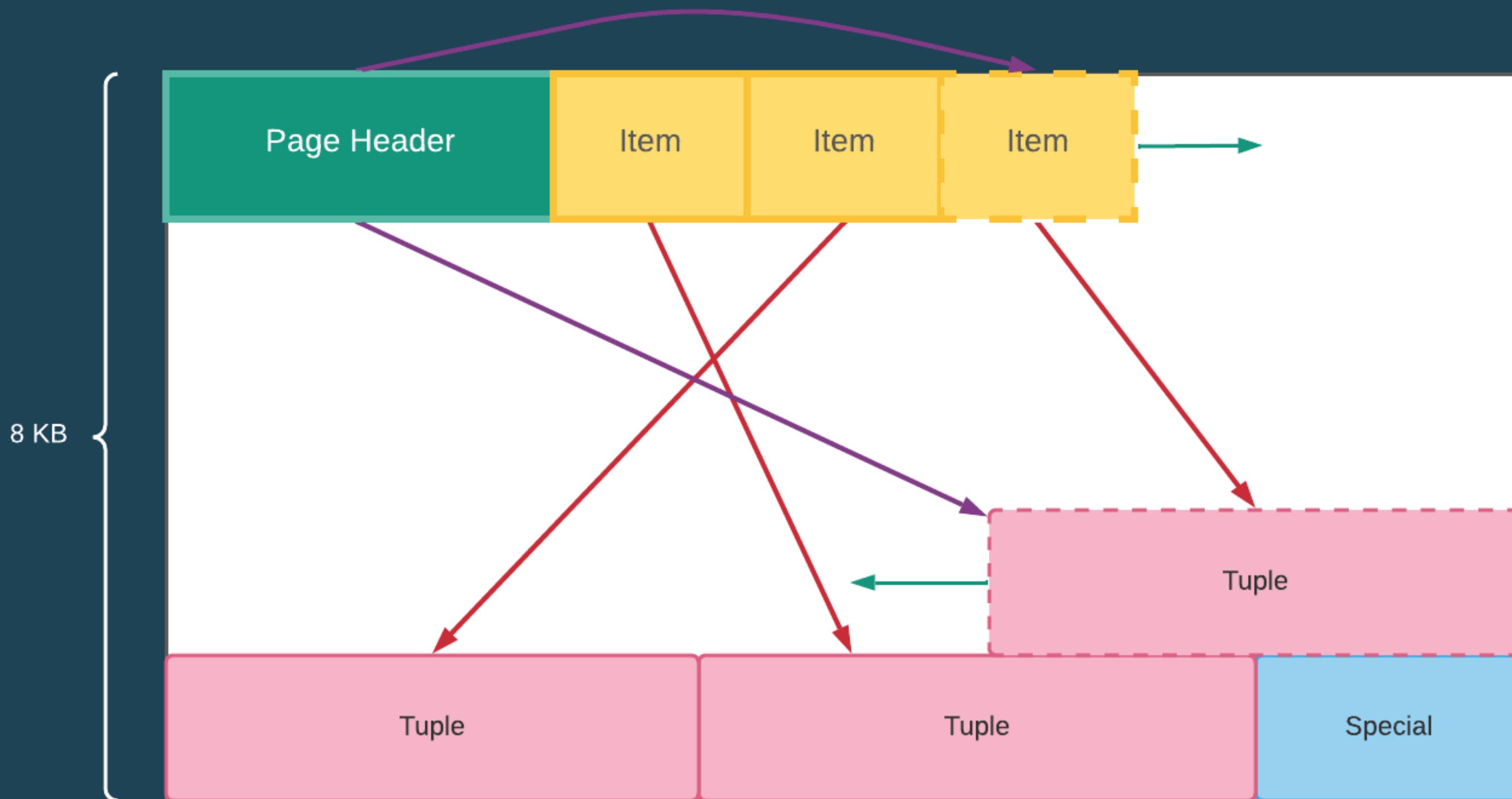


PostgreSQL Basis



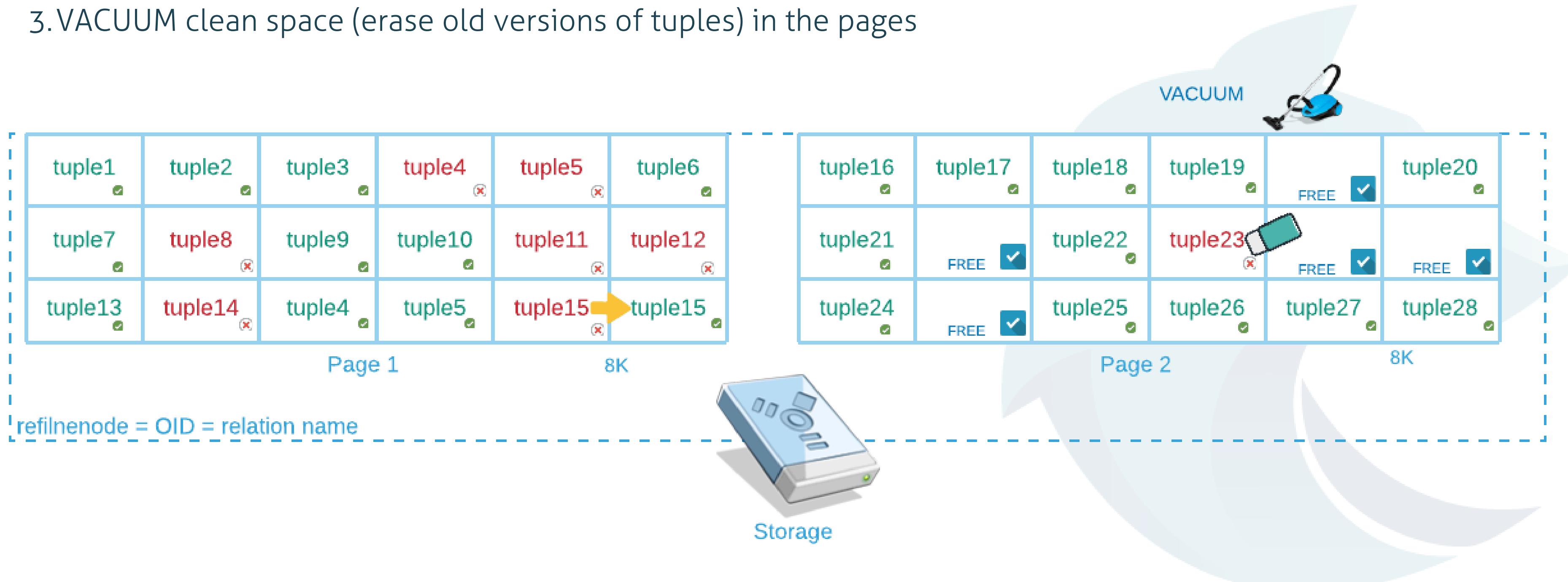
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Where is data stored and scanned?



How does relation storage look like?

- 1.Relation is a table or index
- 2.MVCC generates tuples versions when the data changes
- 3.VACUUM clean space (erase old versions of tuples) in the pages



EXPLAIN Sentence



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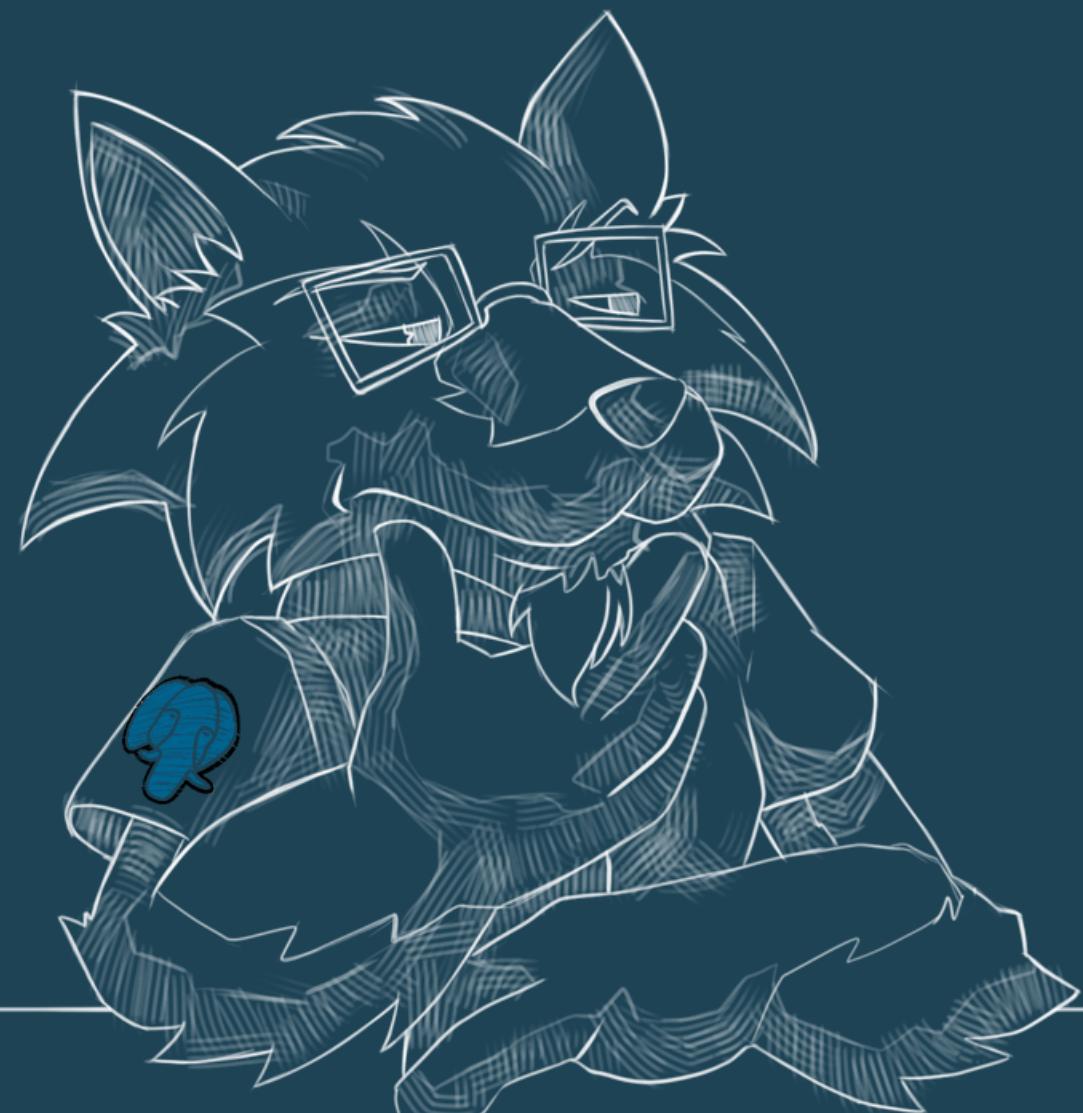
What is EXPLAIN?

- This command displays the execution plan
 - Plan tree
- Table(s) referenced by the statement will be scanned
 - Scan methods
 - Join methods

```
EXPLAIN SELECT * FROM foo;
```

```
QUERY PLAN
```

```
-----  
Seq Scan on foo  (cost=0.00..155.00 rows=10000 width=4)  
(1 row)
```



What is EXPLAIN ANALYZE?

- Executes the query plan too
- Show plan and more
 - Actual time
 - Real rows
 - loops
- It shows how was done because it executes query
- Remember to execute the query (if you run UPDATE, it will update data)



EXPLAIN Output



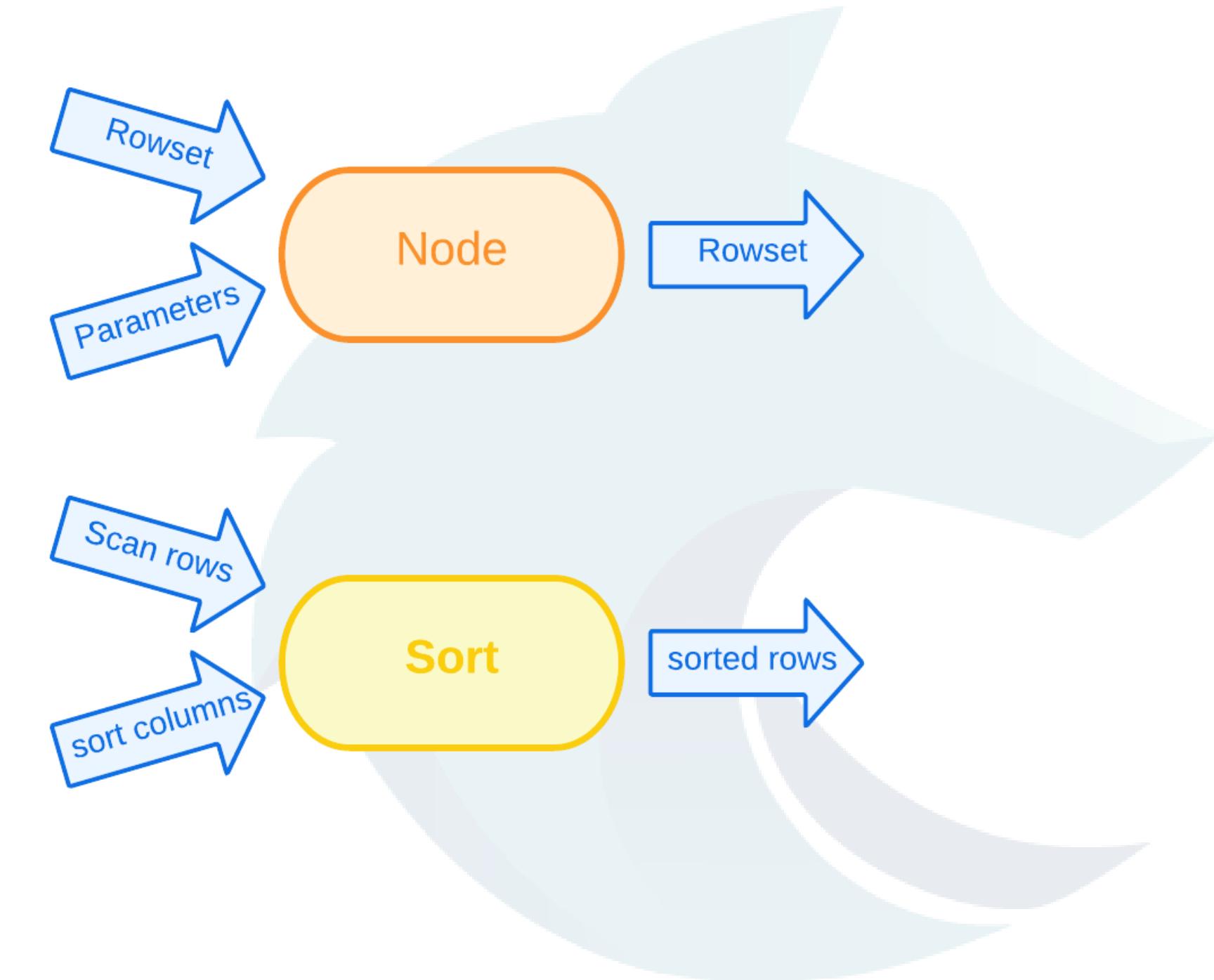
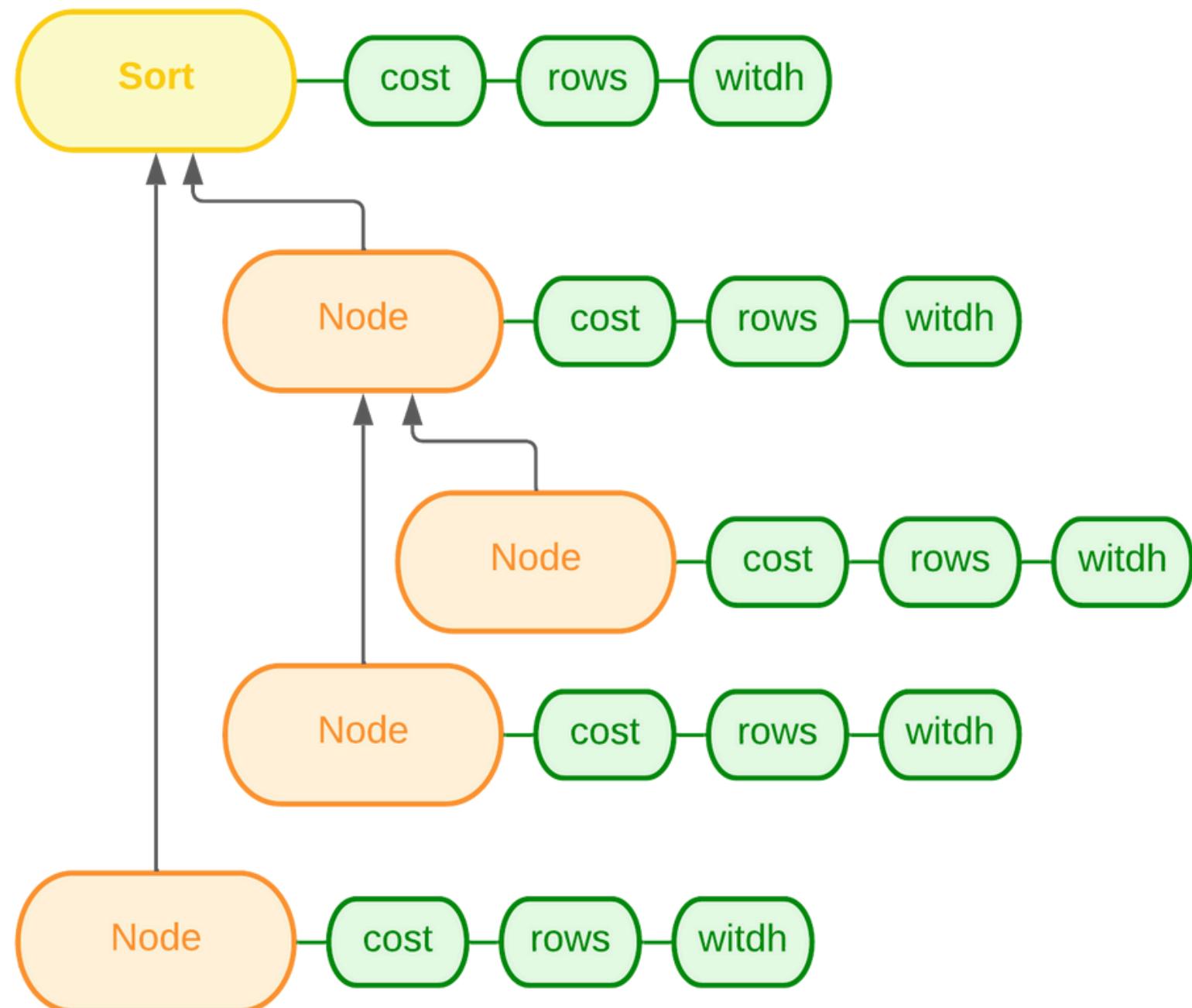
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How to read plan EXPLAIN output?

- Plan break query down in atomic “nodes”
- Inverted tree
- Read inside-out
 - Each node have a Resultset or do something after execute another node

```
wolfgres_db=# EXPLAIN SELECT * FROM customer c ORDER BY c.name;  
          QUERY PLAN  
-----  
Sort  (cost=33.41..34.66 rows=500 width=49)  
  Sort Key: name  
    -> Seq Scan on customer c  (cost=0.00..11.00 rows=500 width=49)
```

How to read plan EXPLAIN output?

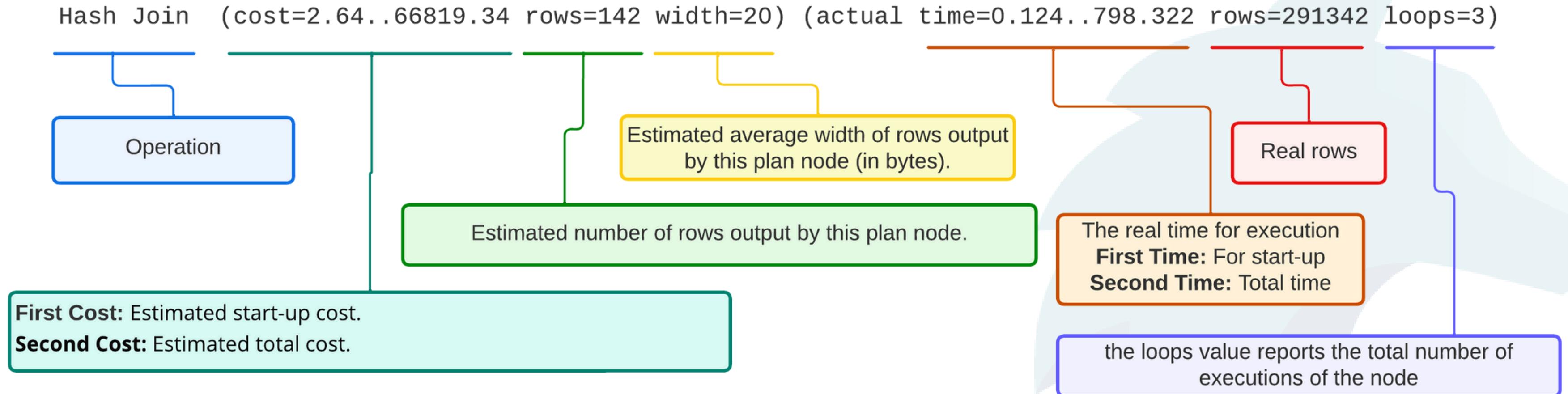


How to read plan EXPLAIN output?

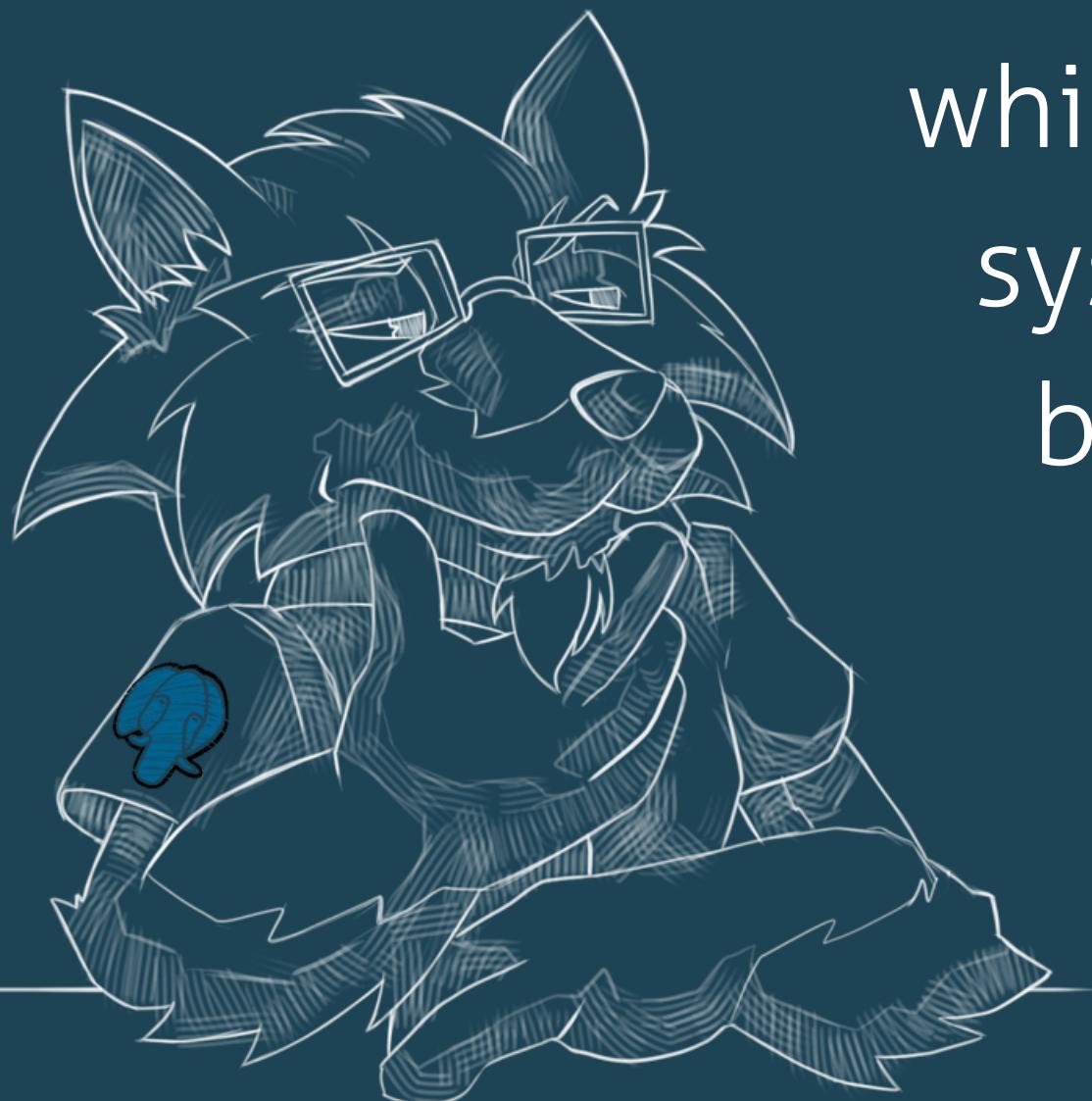


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Information per each node



What does it mean cost?



“A figure in completely arbitrary cost units (float)
which is intended to represent estimated time and
system resources required to execute the query
based on dubious theory and proven practice
(some people adjust seq_page_cost)”

- Josh Berkus

Cost

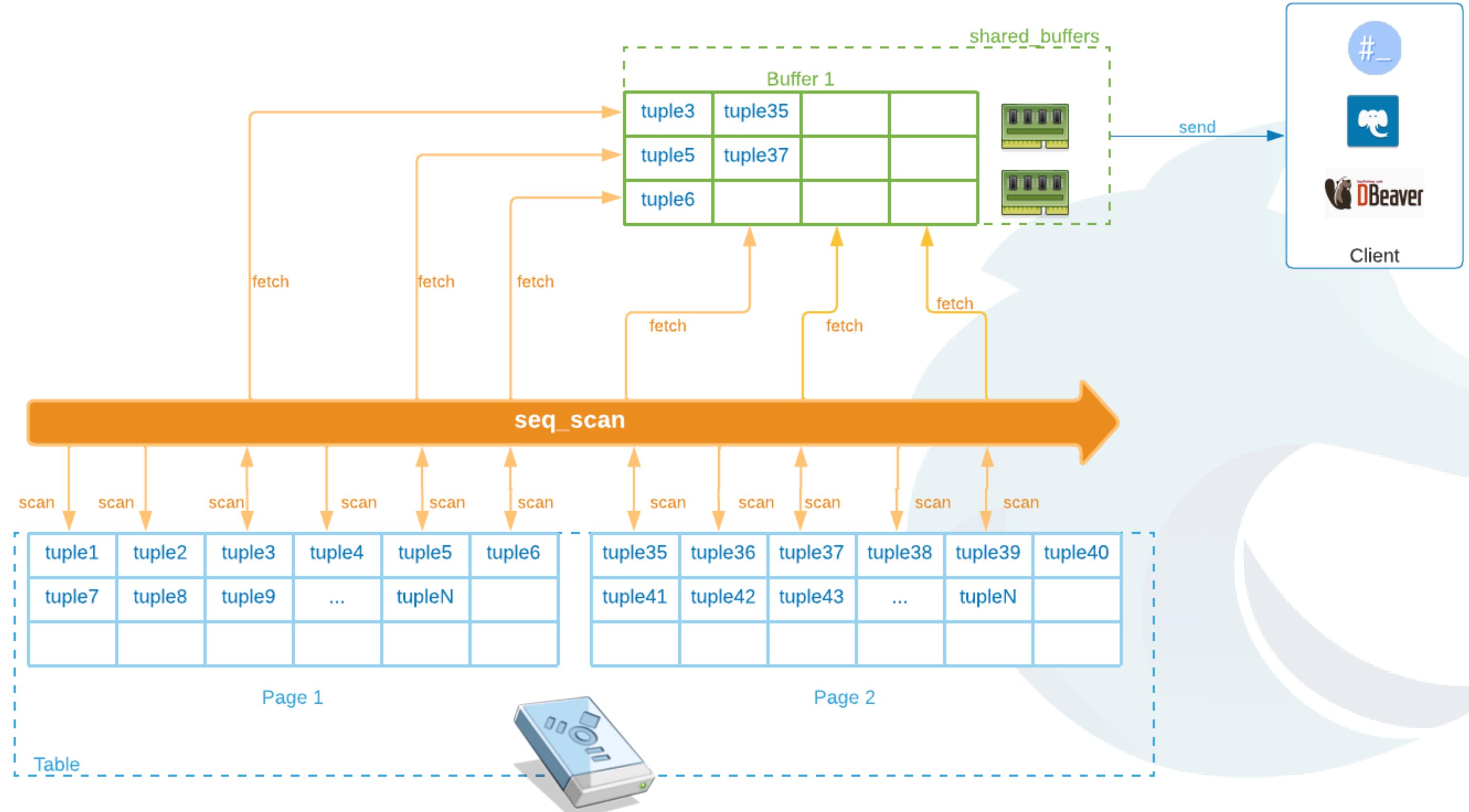
- Remember: “measured in cost units are arbitrary”
- It’s just a reference in your plan query
- Don’t compare cost between different queries, only the cost is a reference in the same one
- Select a plan with the lowest cost (the same query)

Scan Methods



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Seq Scan



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Seq Scan

- If necessary scan almost the complete table
- In some cases, Seq Scan is more cheap than Index

```
wolgres_db=# EXPLAIN SELECT * FROM customer c;
```

QUERY PLAN

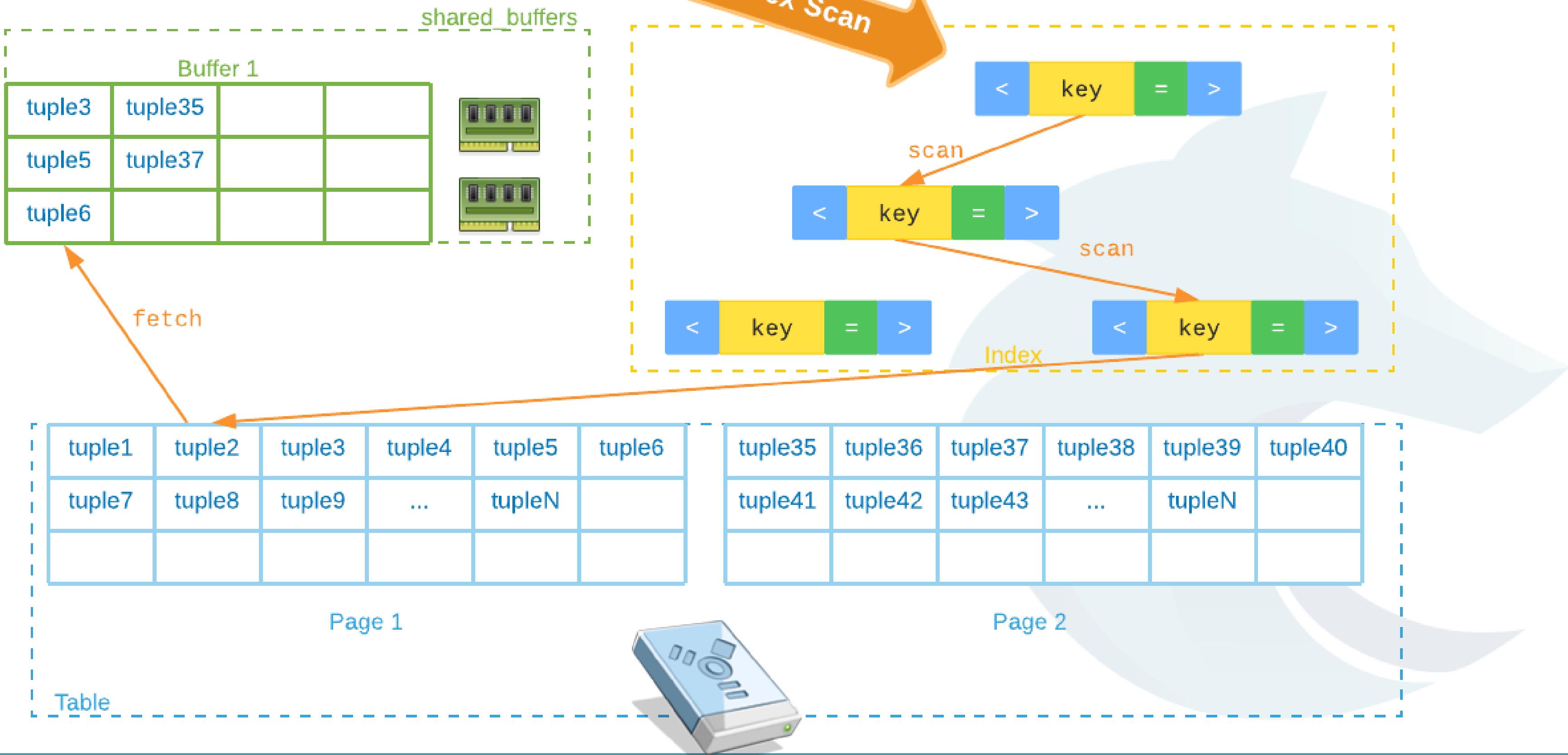
```
-----  
Seq Scan on customer c  (cost=0.00..11.00 rows=500 width=49)  
(1 fila)
```

```
wolgres_db=# EXPLAIN SELECT * FROM customer c WHERE c.customer_id >= 1 AND c.customer_id <= 400;
```

QUERY PLAN

```
-----  
Seq Scan on customer c  (cost=0.00..13.50 rows=400 width=49)  
Filter: ((customer_id >= 1) AND (customer_id <= 400))  
(2 filas)
```

Index Scan



Index Scan

- First scan index to fetch data from page.

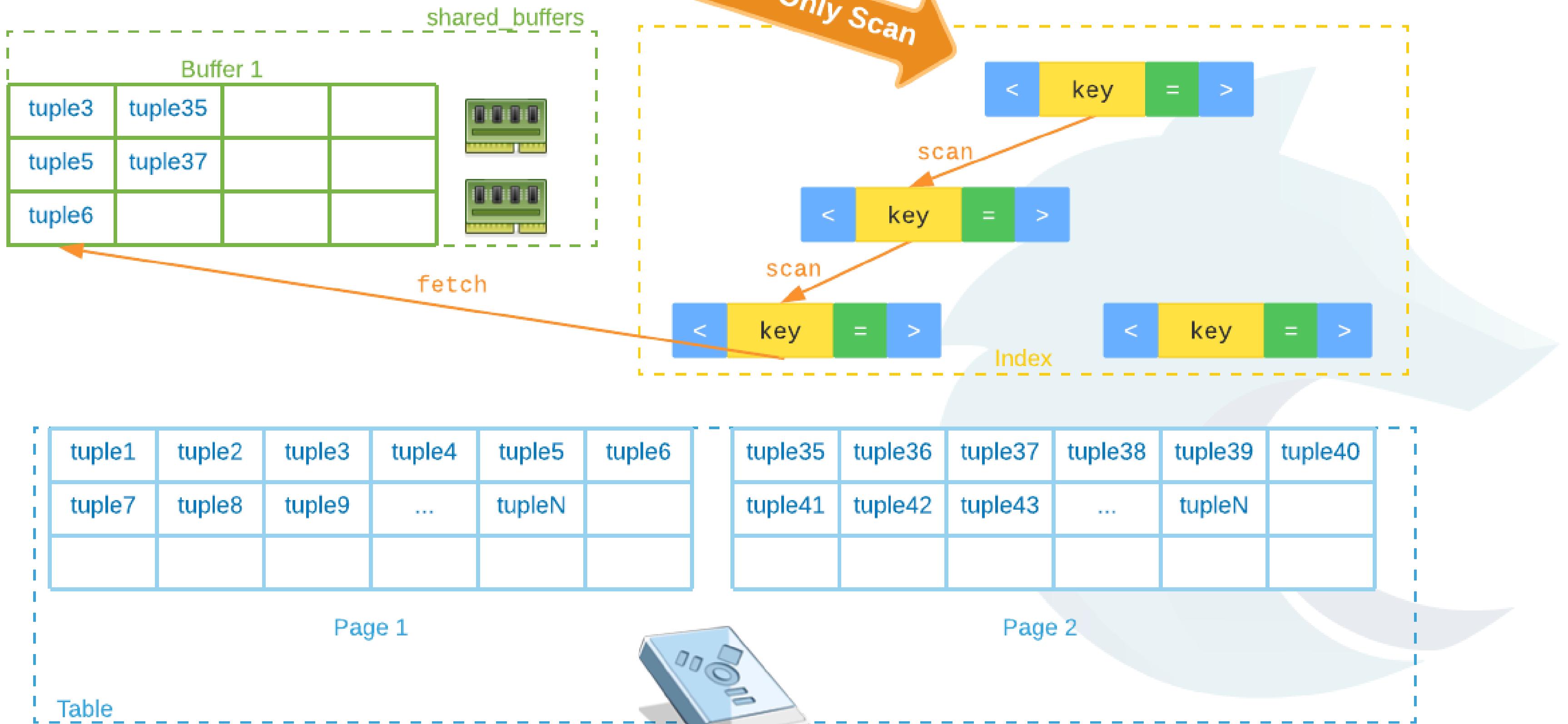
```
wolfgres_db=# EXPLAIN SELECT * FROM customer c WHERE c.customer_id = 35;  
          QUERY PLAN
```

```
-----  
Index Scan using customer_pkey on customer c (cost=0.27..8.29 rows=1 width=49)  
  Index Cond: (customer_id = 35)  
(2 filas)
```

```
wolfgres_db=# EXPLAIN SELECT * FROM customer c WHERE c.customer_id >= 35 AND c.customer_id <= 47;  
          QUERY PLAN
```

```
-----  
Index Scan using customer_pkey on customer c (cost=0.27..8.53 rows=13 width=49)  
  Index Cond: ((customer_id >= 35) AND (customer_id <= 47))  
(2 filas)
```

Index-Only Scan



Index-Only Scan

- The data storage in index and fetch it.

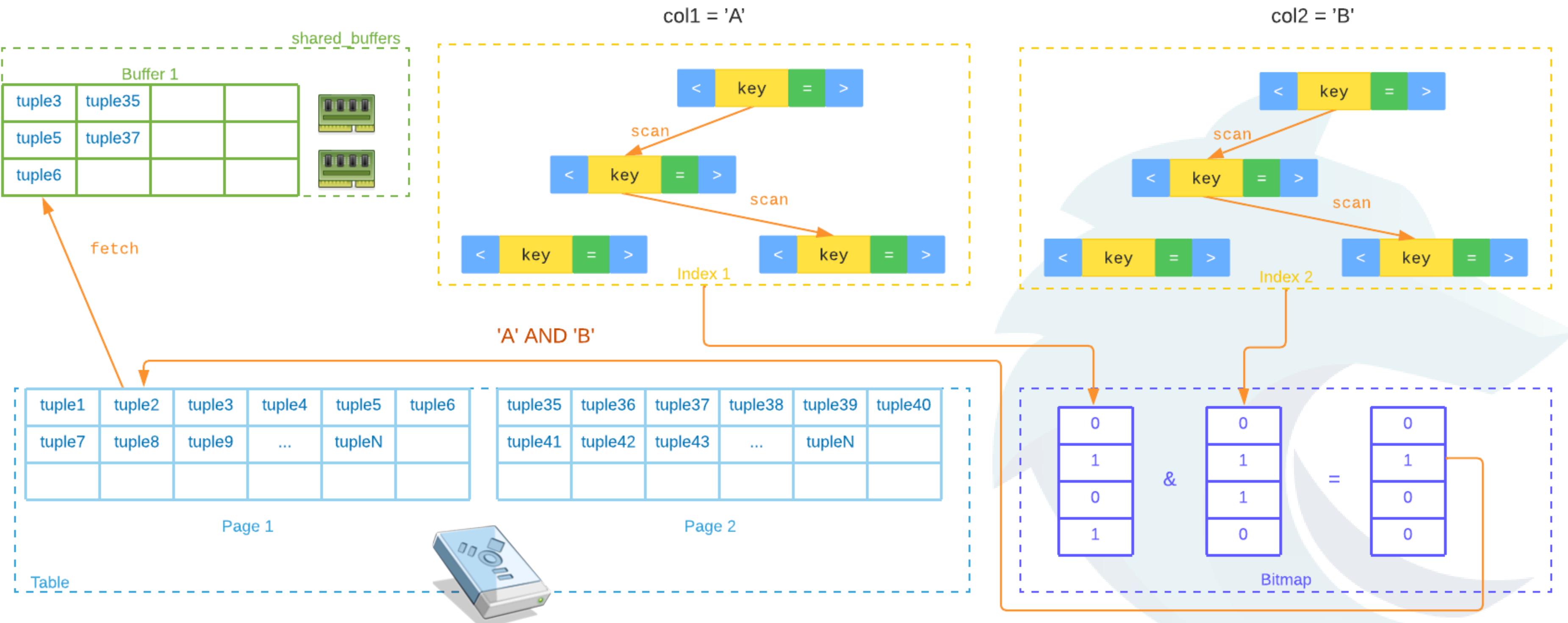
```
wolfgres_db=# EXPLAIN SELECT c.customer_id FROM customer c WHERE c.customer_id = 35;  
          QUERY PLAN
```

```
-----  
Index Only Scan using customer_pkey on customer c (cost=0.27..8.29 rows=1 width=49)  
  Index Cond: (customer_id = 35)  
(2 filas)
```

```
wolfgres_db=# EXPLAIN SELECT c.customer_id FROM customer c WHERE c.customer_id >= 35 AND  
c.customer_id <= 47;  
          QUERY PLAN
```

```
-----  
Index Only Scan using customer_pkey on customer c (cost=0.27..8.53 rows=13 width=49)  
  Index Cond: ((customer_id >= 35) AND (customer_id <= 47))  
(2 filas)
```

Bitmap Index Scan



<https://dba.stackexchange.com/questions/119386/understanding-bitmap-heap-scan-and-bitmap-index-scan>

Bitmap Index Scan

- Generate Bitmap from index to scan data

```
wolgres_db=# EXPLAIN SELECT * FROM employee WHERE employee_id = 1 OR employee_id = 55;
          QUERY PLAN
```

```
-----  
Bitmap Heap Scan on employee (cost=8.57..14.41 rows=2 width=84)  
  Recheck Cond: ((employee_id = 1) OR (employee_id = 55))  
    -> BitmapOr (cost=8.57..8.57 rows=2 width=0)  
      -> Bitmap Index Scan on employee_pkey (cost=0.00..4.28 rows=1 width=0)  
          Index Cond: (employee_id = 1)  
      -> Bitmap Index Scan on employee_pkey (cost=0.00..4.28 rows=1 width=0)  
          Index Cond: (employee_id = 55)
```

```
wolgres_db=# CREATE INDEX first_name_idx ON wfg.employee(first_name);
wolgres_db=# CREATE INDEX last_name_idx ON wfg.employee(last_name);
wolgres_db=# EXPLAIN SELECT * FROM employee e WHERE e.first_name = 'Paul' AND e.last_name = 'Cole';
          QUERY PLAN
```

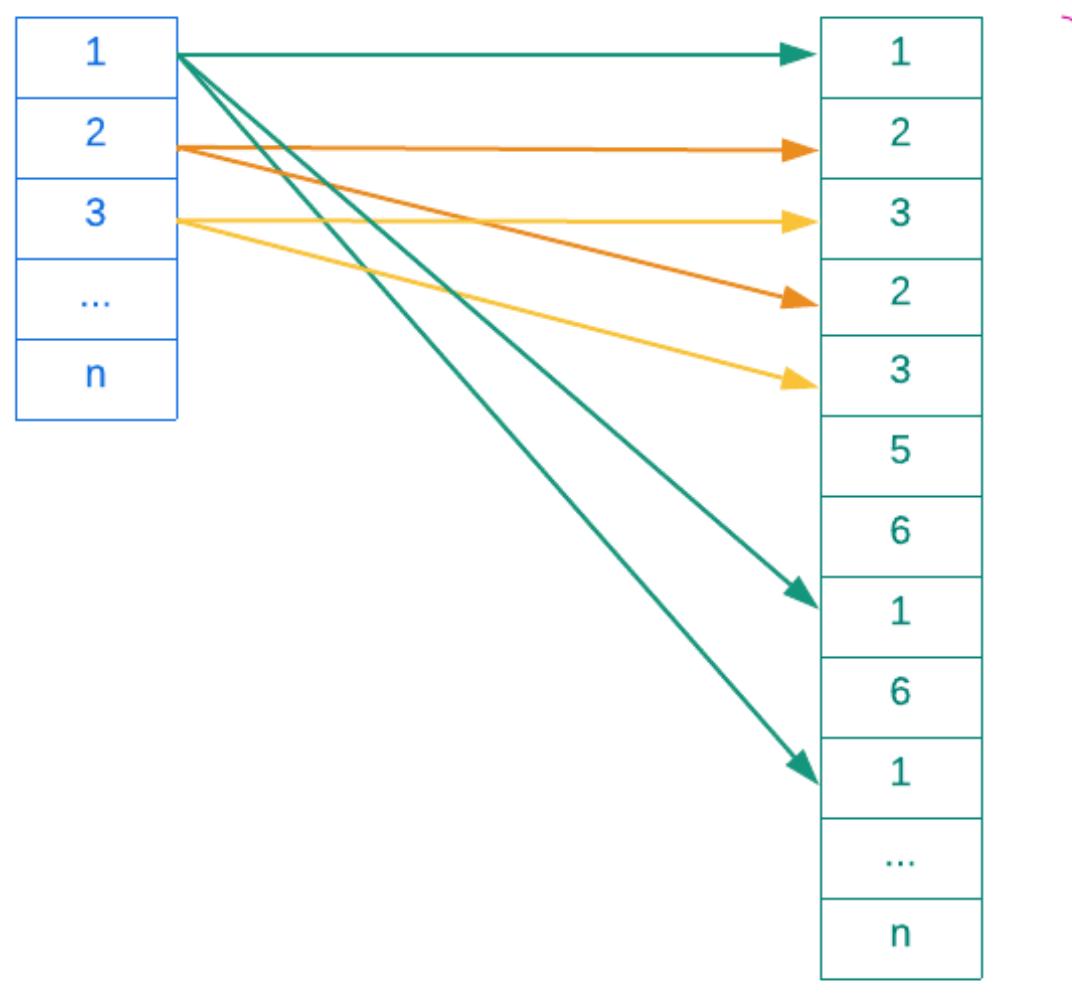
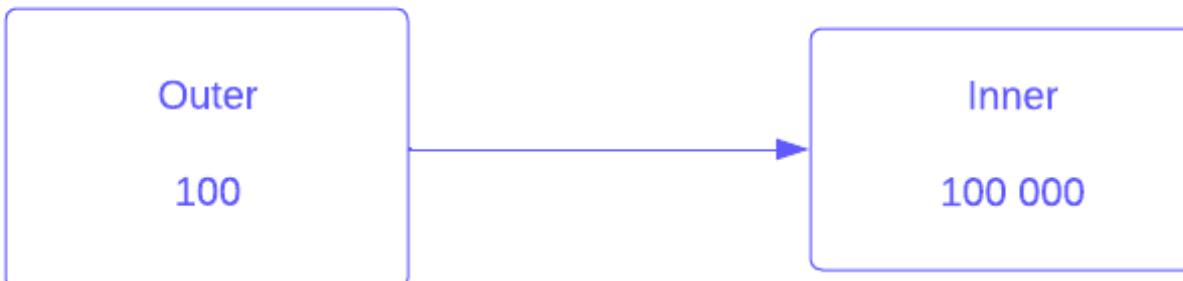
```
-----  
Bitmap Heap Scan on employee e (cost=4.30..12.32 rows=1 width=84)  
  Recheck Cond: ((first_name)::text = 'Paul'::text)  
  Filter: ((last_name)::text = 'Cole'::text)  
    -> Bitmap Index Scan on first_name_idx (cost=0.00..4.30 rows=3 width=0)  
        Index Cond: ((first_name)::text = 'Paul'::text)  
(5 filas)
```

Join Methods



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Nested Loop



EXPLAIN

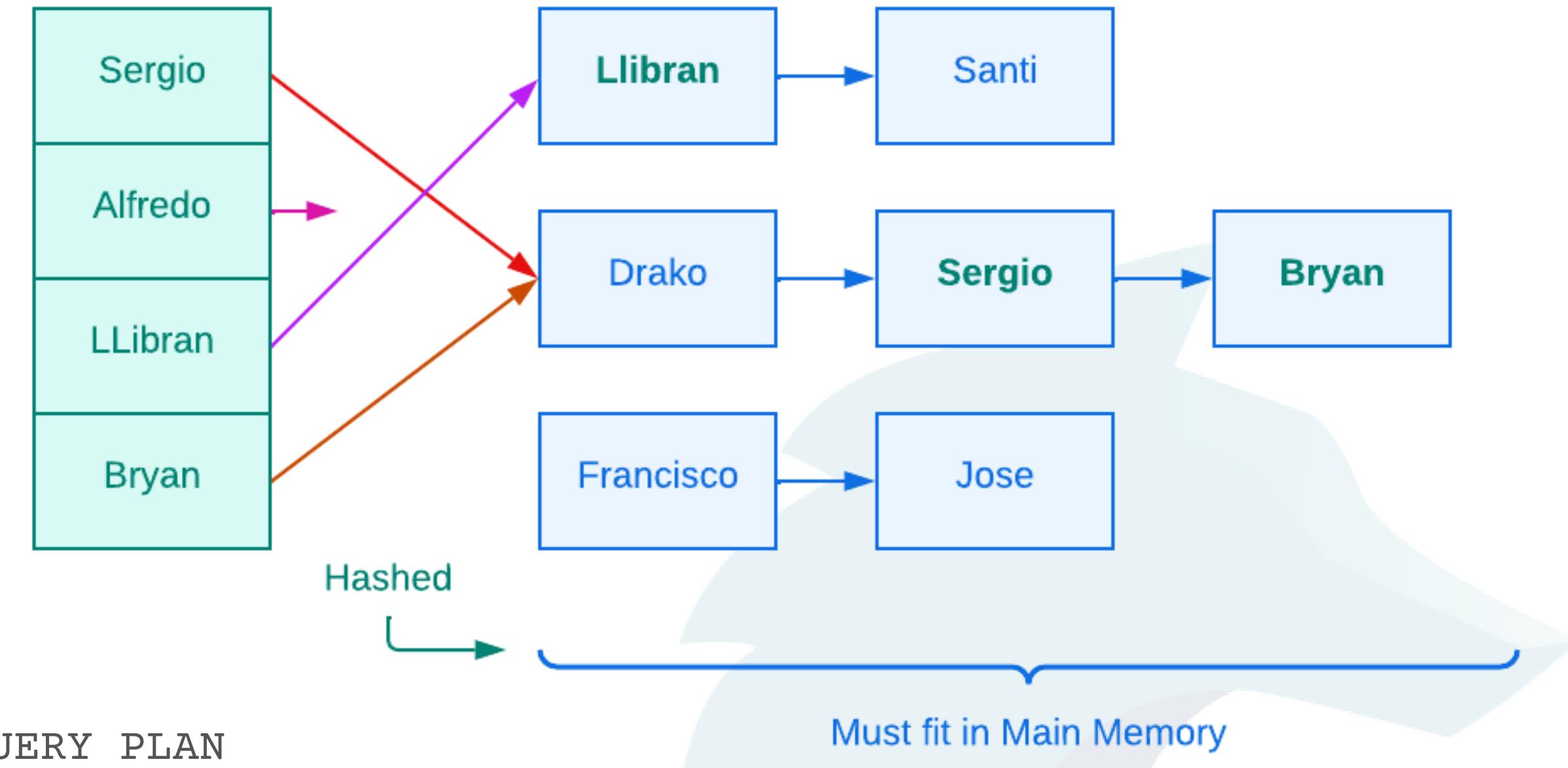
```
SELECT * FROM product inner_table INNER JOIN
category outer_table ON inner_table.category_id =
outer_table.category_id WHERE outer_table.category_id = 1;
```

QUERY PLAN

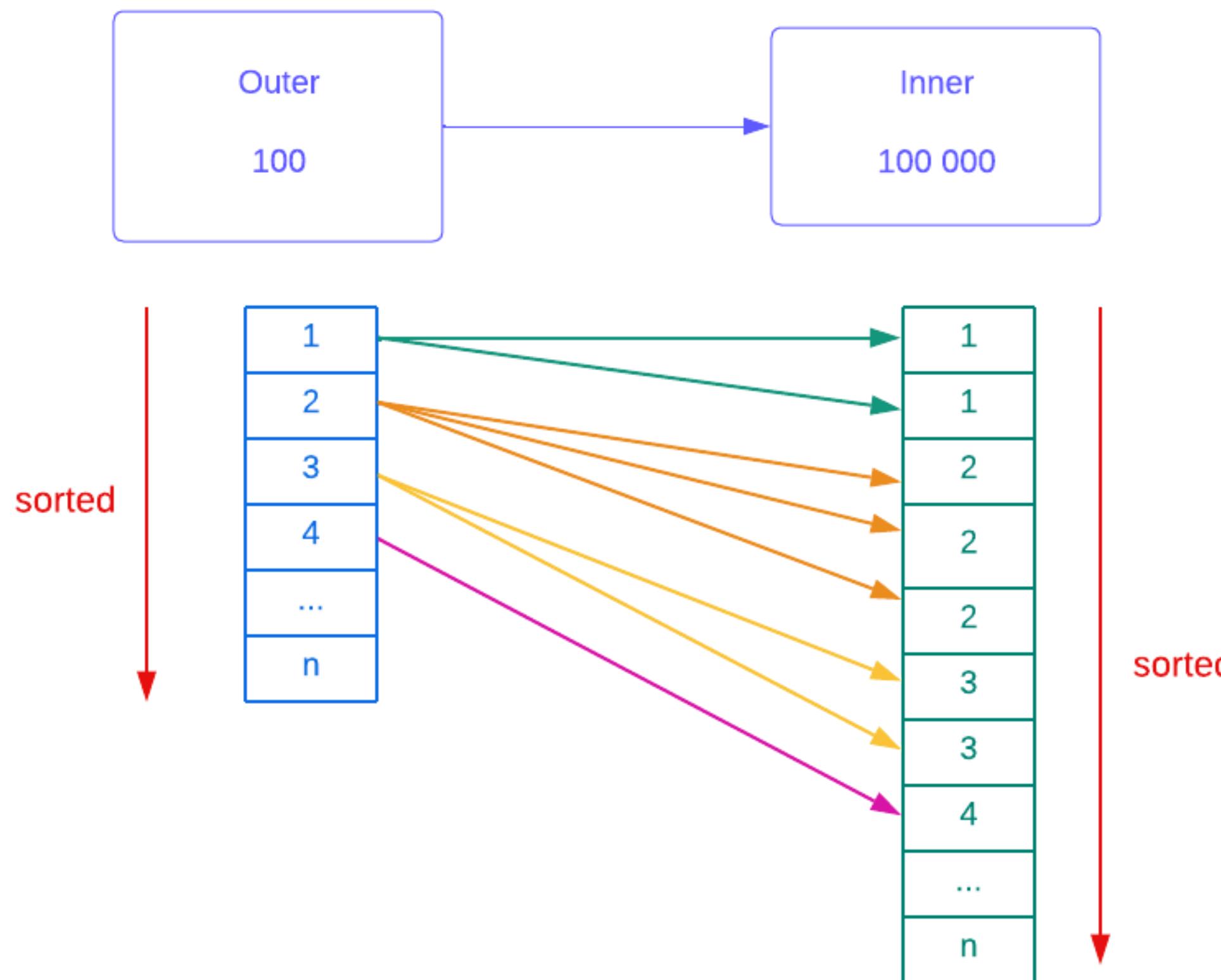
```
-----  
Nested Loop (cost=0.00..590.94 rows=1684 width=406)  
  -> Seq Scan on category outer_table (cost=0.00..1.09 rows=1 width=87)  
        Filter: (category_id = 1)  
  -> Seq Scan on product inner_table (cost=0.00..573.01 rows=1684 width=319)  
        Filter: (category_id = 1)  
(5 filas)
```

Hash join

```
EXPLAIN SELECT * FROM product p
  INNER JOIN category c ON
p.category_id = c.category_id;
-- or
EXPLAIN SELECT * FROM category c
  INNER JOIN product p ON
c.category_id = p.category_id;
-- same plan:::
```



Merge join



- Before comparing, sorted two list

EXPLAIN Tools



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explain.depesz.com → expert-friendly

explain.depesz.com
PostgreSQL's explain analyze made readable

new explain history help about contact login

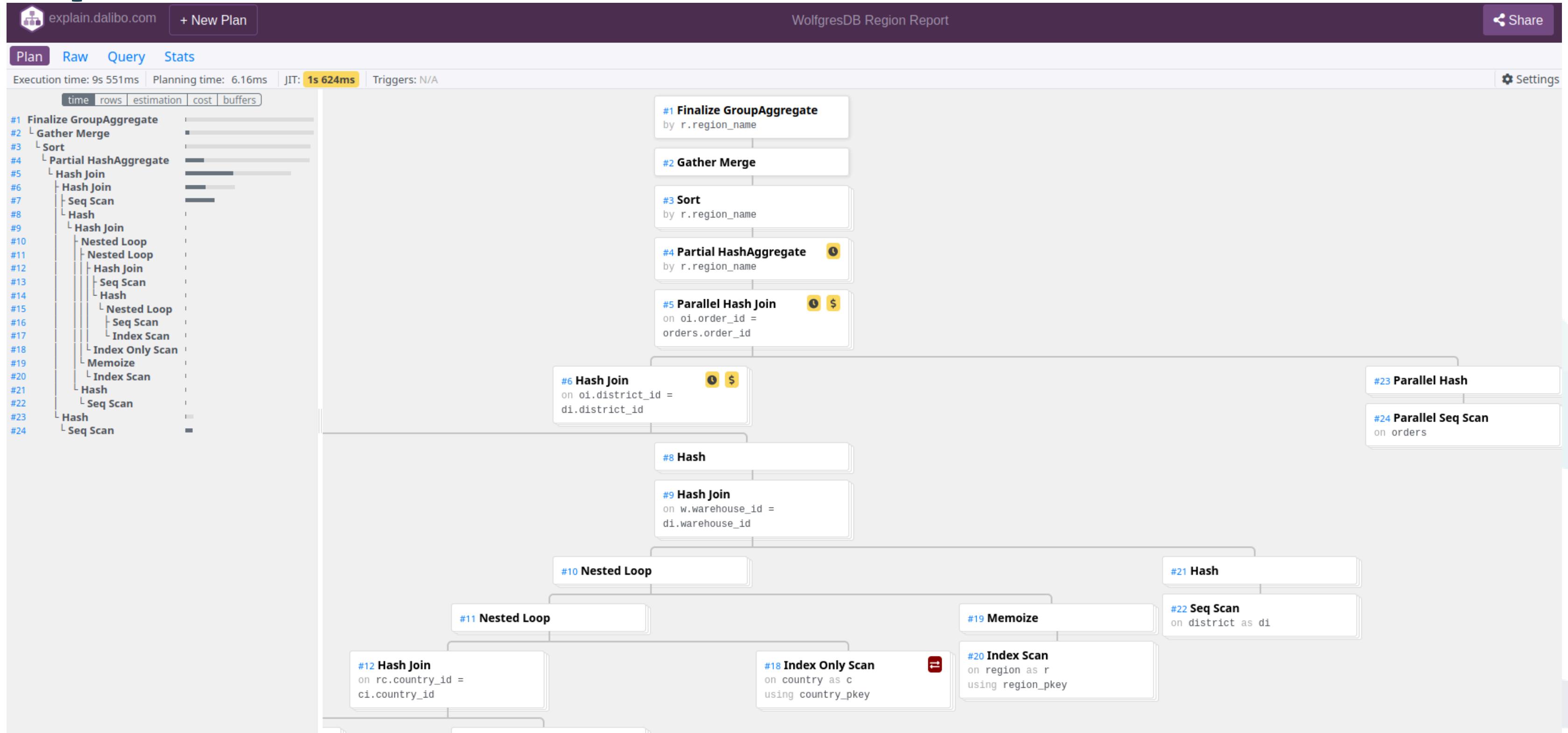
Result: ztCc : Region EXPLAIN report

Settings Add optimization

HTML	SOURCE	QUERY	REFORMATTED QUERY	STATS	#	exclusive	inclusive	rows X	rows	loops	node
					1.	0.013	9,538.239	↑ 1.2	4	1	→ Finalize GroupAggregate (cost=603,451.67..603,452.93 rows=5 width=17) (actual time=9,274.101..9,538.239 rows=4 loops=1) Group Key: r.region_name
					2.	283.041	9,538.226	↓ 1.2	12	1	→ Gather Merge (cost=603,451.67..603,452.83 rows=10 width=17) (actual time=9,274.089..9,538.226 rows=12 loops=1) Workers Planned: 2 Workers Launched: 2
					3.	0.031	9,255.185	↑ 1.2	12	3 / 3	→ Sort (cost=602,451.64..602,451.66 rows=5 width=17) (actual time=9,254.864..9,255.185 rows=4 loops=3) Sort Key: r.region_name Sort Method: quicksort Memory: 25kB Worker 0: Sort Method: quicksort Memory: 25kB Worker 1: Sort Method: quicksort Memory: 25kB
					4.	1,414.583	9,255.154	↑ 1.2	12	3 / 3	→ Partial HashAggregate (cost=602,451.54..602,451.59 rows=5 width=17) (actual time=9,254.833..9,255.154 rows=4 loops=3) Group Key: r.region_name Batches: 1 Memory Usage: 24kB Worker 0: Batches: 1 Memory Usage: 24kB Worker 1: Batches: 1 Memory Usage: 24kB
					5.	3,579.652	7,840.571	↓ 1.3	23,981,853	3 / 3	→ Parallel Hash Join (cost=10,611.37..542,496.76 rows=5,995,478 width=21) (actual time=6,275.229..7,840.571 rows=7,993,951 loops=3) Hash Cond: (oi.order_id = orders.order_id)
					6.	1,495.983	3,669.204	↓ 1.3	23,981,853	3 / 3	→ Hash Join (cost=94.37..421,575.50 rows=5,995,478 width=37) (actual time=2.990..3,669.204 rows=7,993,951 loops=3) Hash Cond: (oi.district_id = di.district_id)
					7.	2,170.628	2,170.628	↑ 1.3	23,981,853	3 / 3	→ Parallel Seq Scan on order_items oi (cost=0.00..324,054.62 rows=9,992,462 width=32) (actual time=0.390..2,170.628 rows=7,993,951 loops=3)
					8.	0.010	2.593	↓ 1.7	150	3 / 3	→ Hash (cost=93.99..93.99 rows=30 width=13) (actual time=2.588..2.593 rows=50 loops=3) Buckets: 1,024 Batches: 1 Memory Usage: 11kB
					9.	0.012	2.583	↓ 1.7	150	3 / 3	→ Hash Join (cost=88.04..93.99 rows=30 width=13) (actual time=2.525..2.583 rows=50 loops=3) Hash Cond: (w.warehouse_id = di.warehouse_id)
					10.	0.003	2.536	↓ 1.7	30	3 / 3	→ Nested Loop (cost=85.91..91.52 rows=6 width=13) (actual time=2.485..2.536 rows=10 loops=3)
					11.	0.005	2.513	↓ 1.7	30	3 / 3	→ Nested Loop (cost=85.77..90.26 rows=6 width=8) (actual time=2.472..2.513 rows=10 loops=3) Join Filter: (rc.country_id = c.country_id)

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explain.dalibo.com → visual, based on PEV



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pgmustard.com → beginner-friendly

Your trial has 4 uses remaining. Get unlimited uses from 95€ per year.

pgMustard New plan History Published plans Docs Issues Changelog Account Sign out

Top tips

5.0 ★ Operation #1: Scope for increased parallelism

1.1 ★ Overall: JIT compilation 18.7%

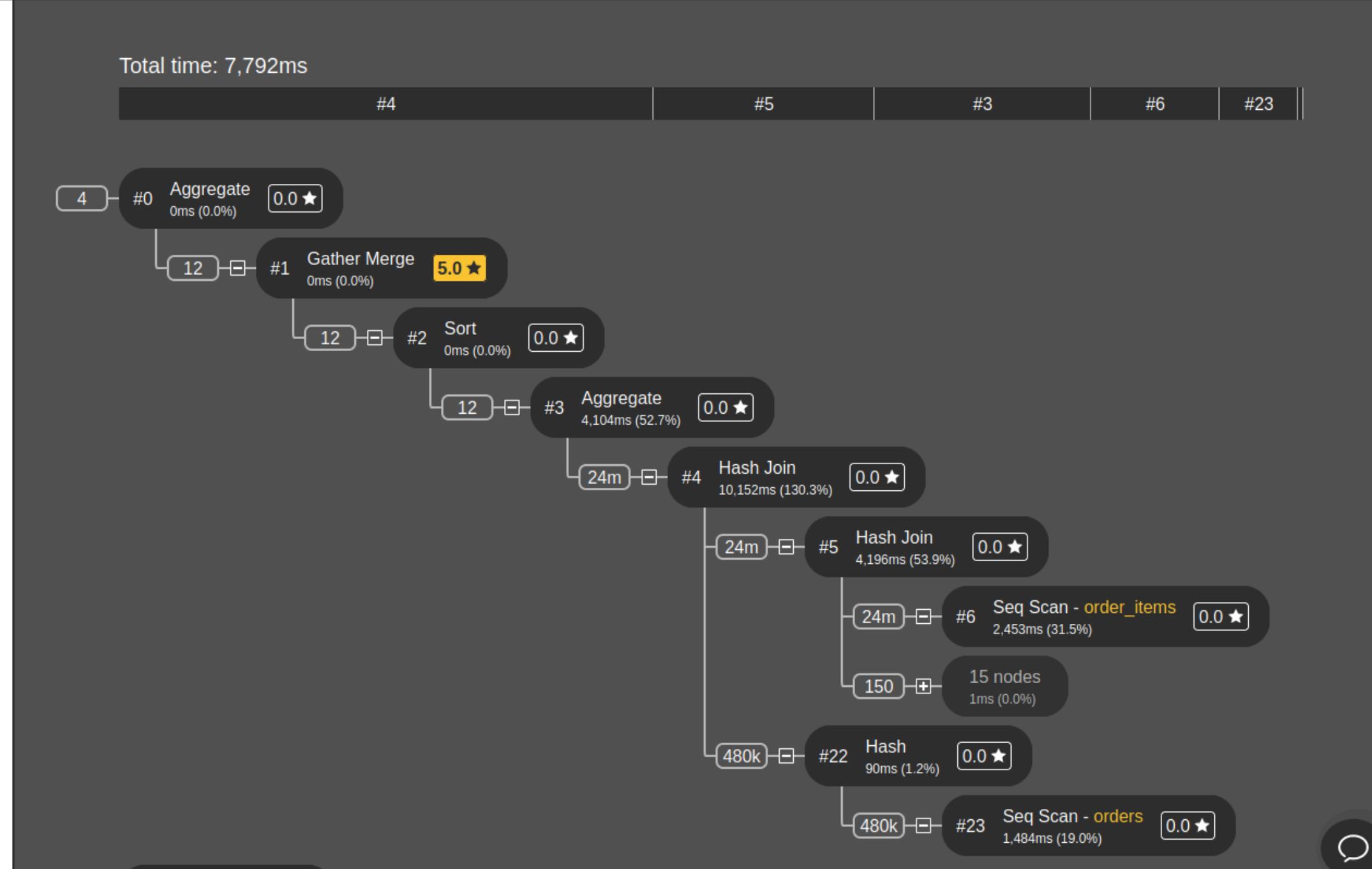
pgMustard rates each tip on a scale of 0-5 stars, based on how likely they are to make a significant improvement to the performance of your query.

The best tips for your query are summarised above. Click on one of the tips to see the performance of the operation in more detail.

➤ ▲ Missing flags

➤ 1.1 ★ JIT compilation: 1,460ms (18.7%)

➤ 🔍 Planner configuration



Total time: 7,792ms

- #0 Aggregate 0ms (0.0%) 0.0 ★
- #1 Gather Merge 0ms (0.0%) 5.0 ★
- #2 Sort 0ms (0.0%) 0.0 ★
- #3 Aggregate 4,104ms (52.7%) 0.0 ★
- #4 Hash Join 10,152ms (130.3%) 0.0 ★
- #5 Hash Join 4,196ms (53.9%) 0.0 ★
- #6 Seq Scan - order_items 2,453ms (31.5%) 0.0 ★
- 15 nodes 1ms (0.0%)
- #22 Hash 90ms (1.2%) 0.0 ★
- #23 Seq Scan - orders 1,484ms (19.0%) 0.0 ★

<https://app.pgmustard.com#/explore/46dcf0f4-264f-4b1f-9115-32521992dc89>

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pgAdmin → I think you need expert

admin@corvusdata.com.mx (internal)

Dashboard Properties SQL Statistics Dependencies Dependents wolfgres_db/admin@Tantor CorvusD*

wolfgres_db/admin@Tantor CorvusD

No limit ▾

Query History

```
1 SELECT r.region_name, SUM(oi.quantity * oi.unit_price)
  2   FROM region r
  3 INNER JOIN region_country rc ON rc.region_id = r.region_id
  4 INNER JOIN country c ON c.country_id = rc.country_id
  5 INNER JOIN city ci ON ci.country_id = rc.country_id
  6 INNER JOIN warehouse w ON w.city_id = ci.city_id
  7 INNER JOIN district di ON di.warehouse_id = w.warehouse_id
  8 INNER JOIN order_items oi ON oi.district_id = di.district_id
  9 INNER JOIN orders ON orders.order_id = oi.order_id
 10 GROUP BY r.region_name;
```

Scratch Pad

Data output Messages Explain Notifications

Graphical Analysis Statistics

The diagram illustrates the query execution plan for the provided SQL query. It starts with seven input tables: order_items, district, city, warehouse, region_country, country, and orders. These tables undergo a series of joins (HashInnerJoin, MergeInnerJoin, Hash, Sort) and intermediate operations (Aggregate, Sort, GatherMerge) to produce the final result. The order of operations is as follows: order_items is joined with district via HashInnerJoin; city is joined with warehouse via HashInnerJoin; region_country is joined with country via Sort and Hash; and finally, the results are aggregated and sorted to produce the final output.

Total rows: 1 of 1 | Query complete 00:00:00.090 | Ln 1, Col 1

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Learn more...

- Explaining EXPLAIN - Josh Berkus
 - <https://www.youtube.com/watch?v=ZOZglRUjfFI>
- A beginners guide to EXPLAIN ANALYZE – Michael Christofide
 - <https://www.youtube.com/watch?v=31EmOKBP1PY>
- Explaining the Postgres Query Optimizer – Bruce Momjian -
 - <https://www.youtube.com/watch?v=wLpcVM9qxV0>
- Just follow to @samokhvalov share a lot great hacks in PostgreSQL
 - <https://x.com/samokhvalov/status/1767642882419368411>



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More links!



- <https://www.pgmustard.com/docs/explain>
- <https://www.cybertec-postgresql.com/en/how-to-interpret-postgresql-explain-analyze-output/>
- https://docs.gitlab.com/ee/development/understanding_explain_plans.html
- <https://www.depesz.com/2013/04/16/explaining-the-unexplainable/>

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Questions

All questions will be answer by email... ;D



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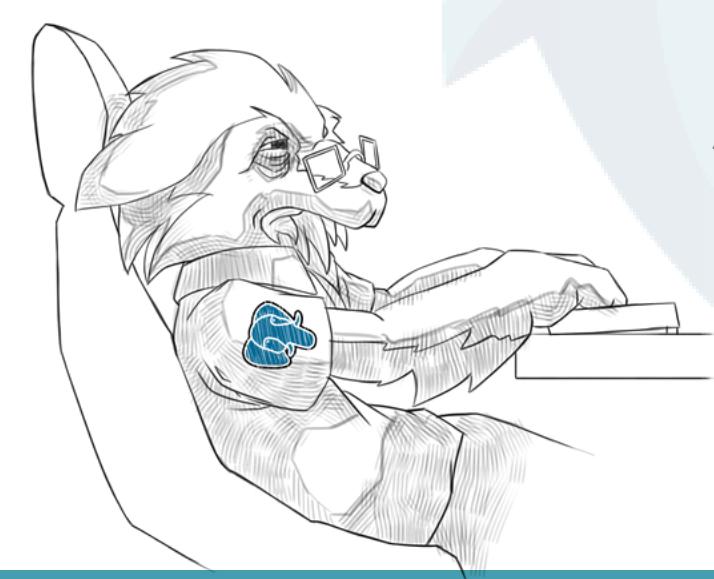
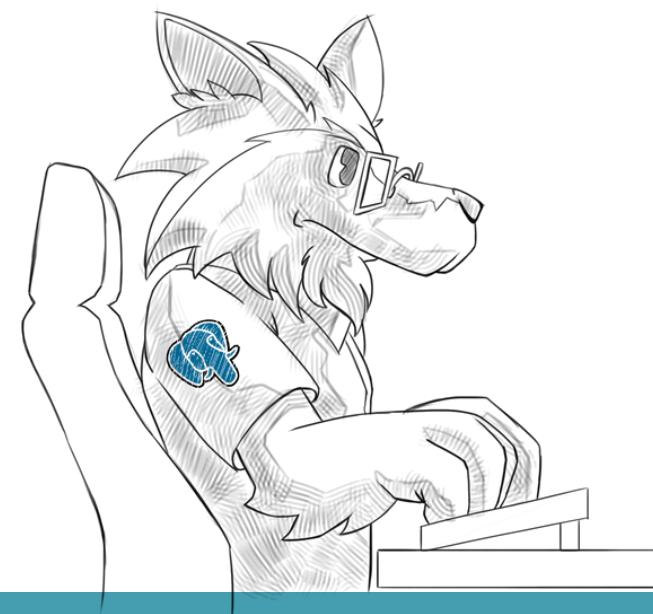


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YOU

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*All the drawings were made
by Uriel Vazquez.
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I



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How to understand **EXPLAIN** without dying in the attempt

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PgDay Chicago
April 26, 2024

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