

Un Éléphant de Première Classe



# A Relational Model of Data for Large Shared Data Banks

E. F. CODD

1970

IBM Research Laboratory, San Jose, California

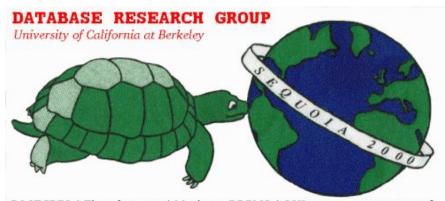
1970 - 1979 System R



1973 - 1985 Ingres & Quel

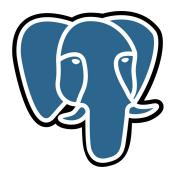


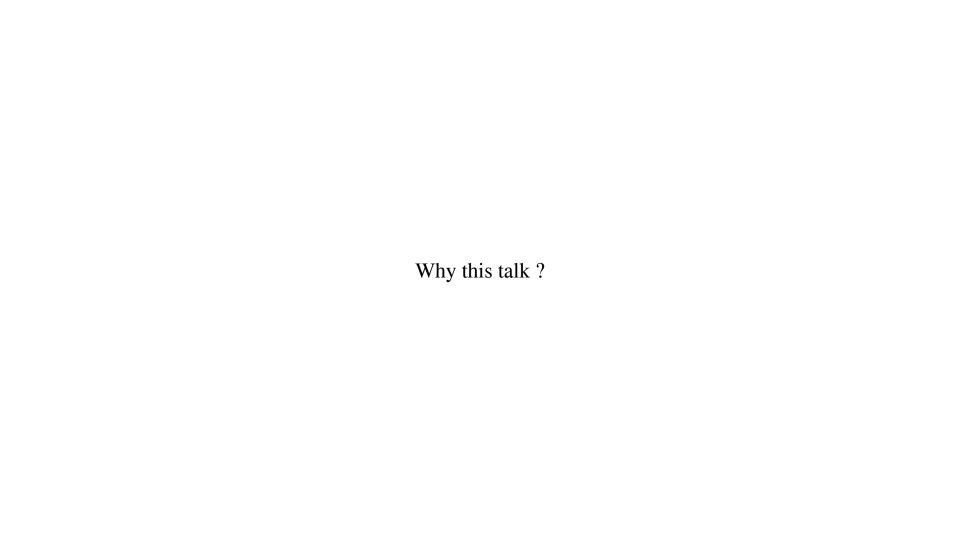
1989 Postgres & PostQuel



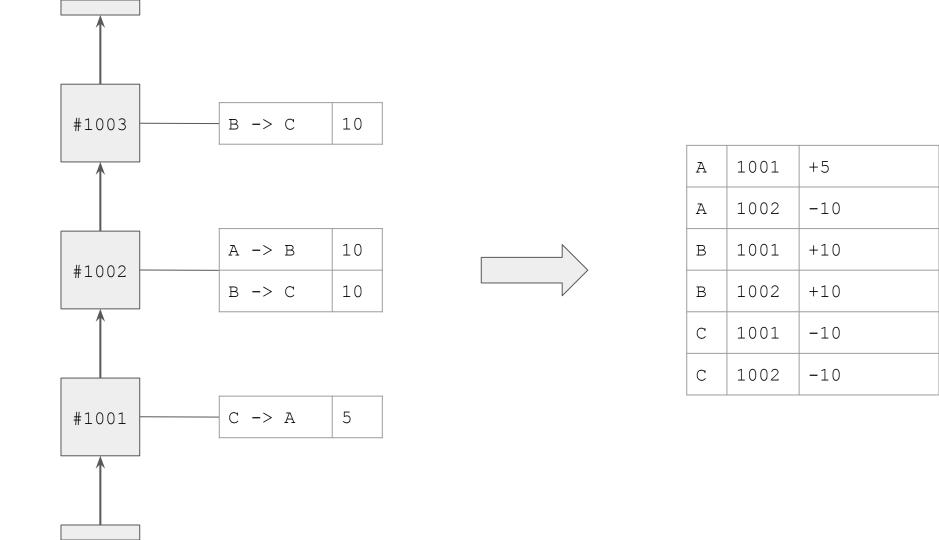
POSTGRES \* Tioga browser \* Mariposa DDBMS \* S2K storage system research

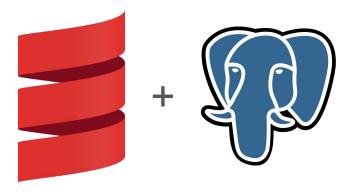
1996 PostgreSQL





LEDGER



















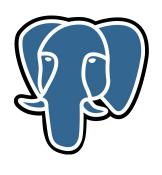


X Joins must be performed on the application side



```
class OrderService:
  val orderRepository: OrderRepository
  val customerRepository: CustomerRepository = ???
  def findLatestOrdersWithCustomer(): Seq[OrderWithCustomer] =
   val latests = orderRepository.findLatestOrders()
   val result = ListBuffer.empty[OrderWithCustomer]
    latests.foreach: order =>
     val customer = customerRepository.findById(order.curstomerID)
     result.addOne(OrderWithCustomer(order, customer))
```

result.toList







Joins can just be joins!

## What is first class Postgres?

- Database is at the center of the system
- The schema is the source of truth
- Treat SQL as a real programming language
- Commit to Postgres features

Setup your development loop

Tools for composition

Step up your indexing game

Data types shenanigans

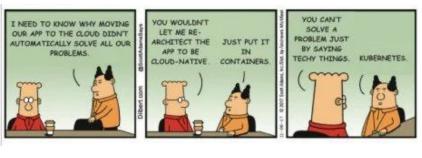
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- Modern hardware is worth it
  - Scaling vertically is a viable strategy
- On-prem kube (rancher) + bare metal PG

Dual Intel Xeon Gold 5515+ - 16c/32t - 3.2GHz/3.6GHz	
256GB DDR5 ECC 4800MHz	
2x SSD NVMe 960GB Datacenter Class Soft RAID	

6×3.84TB SSD NVMe Soft RAID

Modern hardware is worth it

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• On-prem kube (rancher) + bare metal PG

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Use a migration tool (we use flyway)

Prefer idempotent migrations

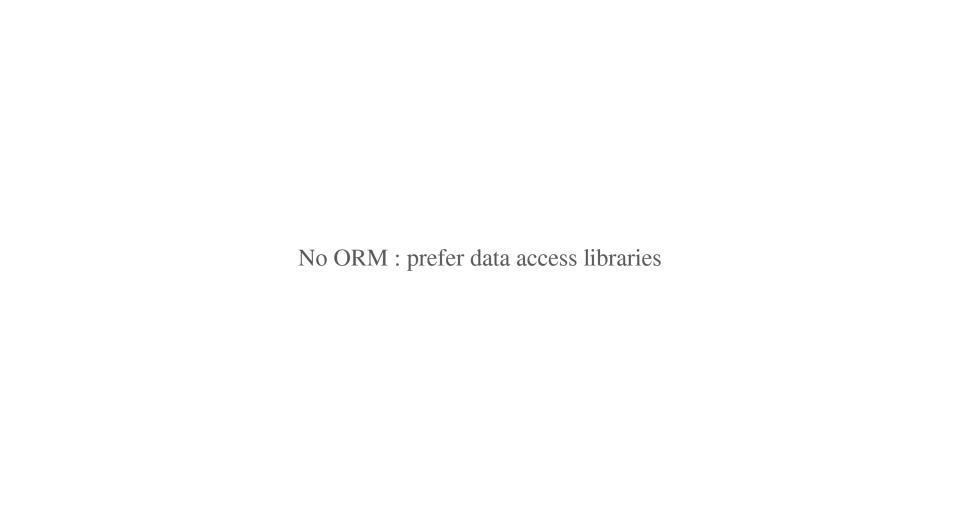
Think about scheduling baselines

Abuse comments on everything!



#### Abuse comments on everything!

```
create table v2.chain tx block
  unique (tx id),
  primary key (block hash, tx id),
  foreign key (tx id) references v2.chain tx (tx id),
);
typically transaction hash)';
```



```
Postgres ERROR 42804 raised in transformAssignedExpr (parse_target.c:595)
  Problem: Column "success" is of type boolean but expression is of type bigint.
    Hint: You will need to rewrite or cast the expression.
The statement under consideration was defined
  INSERT INTO extrinsics
             SELECT height
                                                           AS height,
                   index
                                                           AS index.
                   data -->> 'hash'
                                                           AS hash,
                   data → 'method' → 'pallet'
                                                          AS pallet,
                   data → 'method' → 'method'
                                                          AS method.
                   (data →>> 'nonce') :: bigint
                                                          AS nonce,
                   data → 'signature' → 'signer' → 'id' AS signer,
                   data → 'args'
                                                          AS args.
                   (data →>> 'tip') ::bigint
                                                AS tip,
                   (data → 'info' → 'weight') :: bigint AS weight,
                                                          AS class,
                   (data → 'info' → 'partialFee') :: bigint AS partial_fee,
                   data → 'era'
                                                           AS era,
                   (data → 'success') :: bigint
                                                          AS success,
                    Column "success" is of type boolean but expression is of type bigint.
```

(data → 'paysFee') :: boolean AS pays\_fee

FROM raw extrinsics

WHERE height ≥ \$1 AND height ≤ \$2

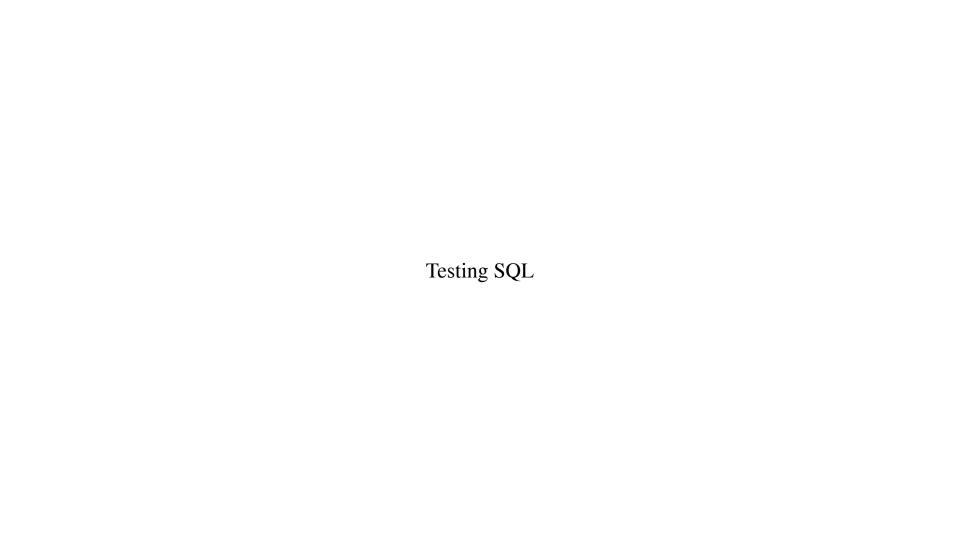
If this is an error you wish to trap and handle in your application, you can do

doSomething.recoverWith { case SqlState.DatatypeMismatch(ex)  $\Rightarrow$  ...}

Use a proper SQL editor (DataGrip, DBeaver)
psql can be a very powerful tool

#### psql tips:

- \e Open the EDITOR with the latest query you typed. Closing run the buffer.
- \e myfile.sql Open the EDITOR with the file in it.
- \x For extended display
- \watch 1 Repeat the query every 1 second



## Testing with a real DB

- Testcontainers + fixtures to add migration
- Cache DB instances!
- Never use sqlite / h2 / derby anymore



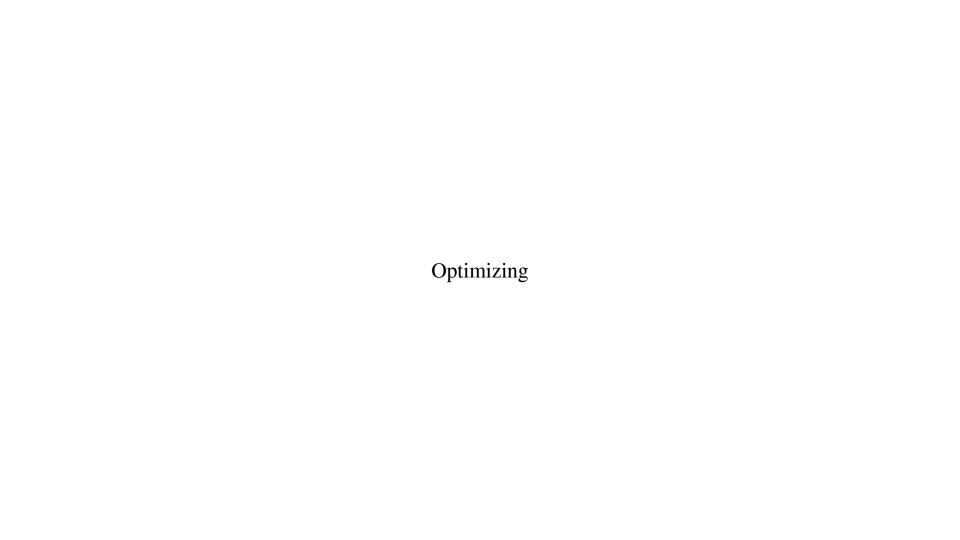
### Crafting SQL Tests

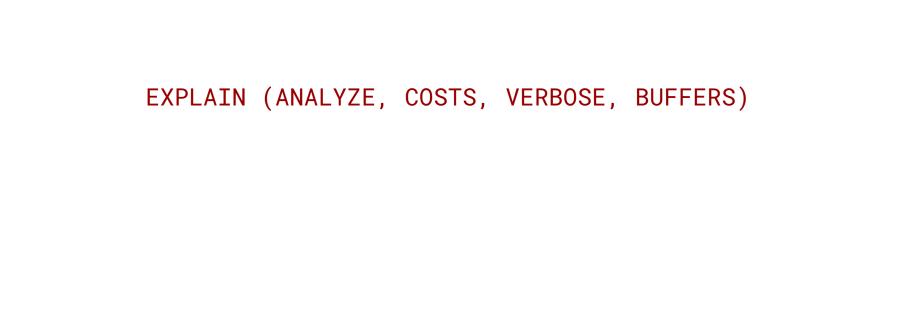
- Test on the boundaries.
  - Typed language -> Input / Output models then translate into domain
  - Dynamic languages -> check aggressively
  - Defense in depth strategies
- Test functions and procedures
- Make tooling around sql files (syntax highlighting)

#### Testing on real data

Use transactions to benchmark your migrations before running them with migrations

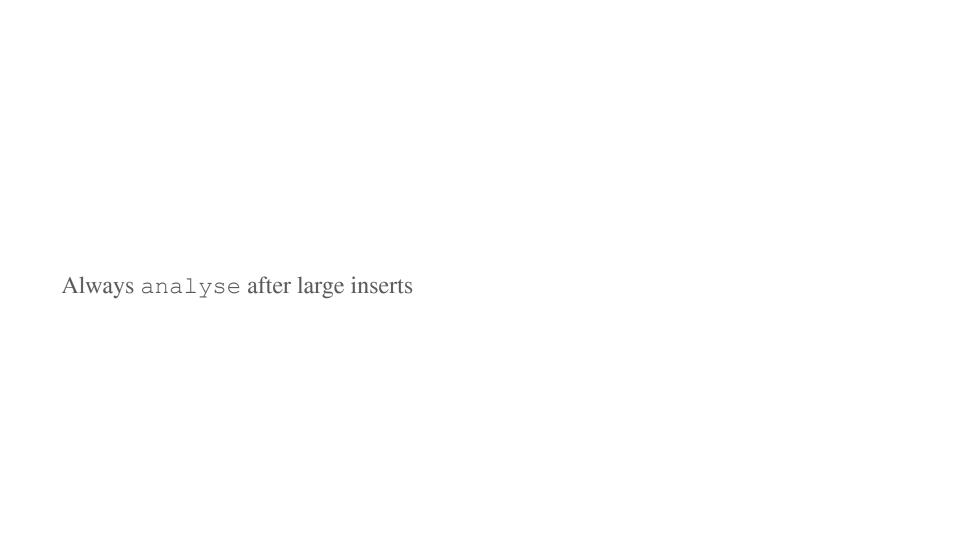
```
begin isolation level read committed -- Queries sees data before it starts
begin isolation level repeatable read -- Queries sees data before the tx started
begin isolation level serializable
                                     -- repeatable read + error if write conflict
-- Migrate, migrate, migrate
savepoint before risky thing;
-- Migrate, migrate, migrate
-- Oh no ! I deleted the prod table :/
rollback to before risky thing; -- Rollback to savepoint, restoring the state
-- Migrate, migrate, migrate
commit; -- or abort if you want your migrations to pick it up
```





```
explain (analyse, verbose, costs, buffers)
select header id, tx index, address
from log
    join address on contract id = address id
where (header id, tx index) = (2278166300, 290);
                                               OUERY PLAN
Nested Loop (cost=[...] rows=10 width=33) (actual time=0[...] rows=5 loops=1)
   Output: log.header id, log.tx index, address.address
  Inner Unique: true
   Buffers: shared hit=30
   -> Index Scan using log pkey on v2.log (cost=[...]) (actual time=[...] rows=5 loops=1)
     Output: [columns]
     Index Cond: ((log.header id = '2278166300'::bigint) AND (log.tx index = 290))
      Buffers: shared hit=5
   -> Index Scan using address pkey on v2.address (cost=[...]) (actual time=[...] rows=1 loops=5)
      Output: address.address id, address.address
      Index Cond: (address.address id = log.contract id)
      Buffers: shared hit=25
 Query Identifier: -8177880399755634493
 Planning:
  Buffers: shared hit=10
Planning Time: 0.467 ms
Execution Time: 0.094 ms
```

(17 rows)



### Scans are the name of the game

•	Seq Scan	Traverse in order: maybe an index is missing?
---	----------	---

- Index Scan
   Index Only Scan
   Only touches the index pages
- Bitmap Index Scan Build a bitmap from an index
- Bitmap Heap Scan Build a bitmap from the heap
- TID Scan Directly access physical data

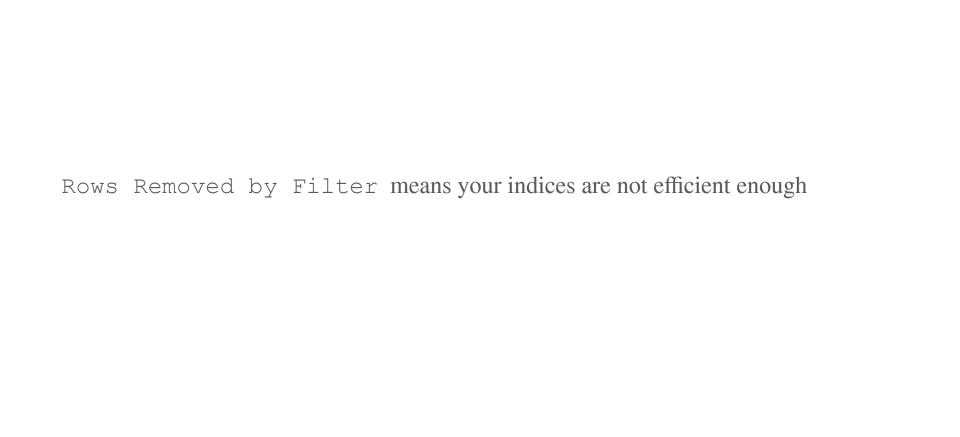
## Sort is a very costly operation

- union, distinct introduce a sort
- Cover the order with the indices (and preserve order through the query)
- Sorting large set can spill on disk: set work mem can help

Shared Hit data is coming from cached pages

data is coming from disk

Read





# Setup your development loop

# **Tools for composition**

Step up your indexing game

Data types shenanigans

```
select first_name
     , last name
      performance_rating
     , project_count
from (select employee_id
           , first_name
           , last name
           , performance rating
      from employees
      where performance_rating ≥ 4.5) as employee_performance
     join (select employee id
                , count(project id) as project count
           from employee projects
           group by employee_id) as project allocations
       using (employee_id)
where pa.project_count > 1
order by performance rating desc
       , project_count desc
```

### Oh no! Subselects everywhere

- Each clause that require a *set of record* 
  - o can be replaced by a subselect
- Each clause that require a *value* 
  - o can be replaced by a subselect that yields only ONE element

### Common Table Expression

```
with employee performance as
       (select employee id, first name, last name, performance rating
        from employees
        where performance_rating ≥ 4.5 )
   , project_allocations as
       (select employee_id, count(project_id) as project_count
        from employee projects
        group by employee id )
   , high_performers_multiple_projects as
       (select first name, last name, performance rating, project count
        from employee performance ep
        join project_allocations pa using (employee_id)
        where project_count > 1)
select *
from high performers multiple projects
order by performance_rating desc, project_count desc;
```

### Common Table Expression

- Extract logical subqueries from the main one
- Can even be recursive (but out of the scope of this talk)
- Warning: They can introduce memoization
  - o materialized/not materialized prefixes

#### Views

```
create view employee_performance as
     select employee id, first name, last name, performance rating
     from employees
    where performance rating ≥ 4.5;
create view project_allocations as
     select employee_id, count(project_id) as project_count
     from employee projects
    group by employee id;
select first_name
     , last name
     , performance rating
     , project count
from employee_performance
    join project_allocations using (employee_id)
where project counts > 1
order by (performance rating, project count) desc
```

### Views

- Extract logical subqueries into reusable piece of code
- Allow neat tricks for schema upgrade!
- Warning : Documentation

#### Remember?

```
select first_name
     , last name
      performance rating
     , project_count
from (select employee id
           , first_name
           , last name
           , performance rating
      from employees
      where performance_rating ≥ 4.5) as employee_performance
     join (select employee id
                , count(project id) as project count
           from employee projects
           group by employee_id) as project allocations
       using (employee_id)
where pa.project_count > 1
order by performance rating desc
       , project_count desc
```

#### Remember?

```
select first_name
     , last_name
     , performance_rating
     , (select count(project_id)
        from employee_projects ep
        where employee_id = ep.employee_id) as project_count
from employees
where performance_rating ≥ 4.5
  and project_count > 1
order by performance_rating desc
       , project_count desc
```

#### **Functions**

```
create function get_project_count( employee_id int )
returns bigint as $$
begin return
    select count(project_id)
    from employee_projects ep
    where employee_id = ep.employee_id;
end;
$$ language plpgsql;
```

#### **Functions**

```
select first_name
   , last_name
   , performance_rating
   , get_project_count(employee_id) as project_count

from employees

where performance_rating > 4.5
   and project_count > 1

order by ( performance_rating, project_count ) desc
;
```

### **Functions**

- In a functional language, using functions is a good idea
- As testable as any SQL query
- Composes way better than fragments

### Set returning functions

```
create function project stats( employee id int )
returns table ( rd project count
                                 bigint
            , mean project duration interval) as $$
begin return query
    select count(project id) filter (where type = 'R&D') as rd project count
         , count(project_id) filter (where type = 'IT') as it_project_count
         , count(project_id) filter (where type = 'PI') as pi project count
         , avg(age(start_at, end_at)) as mean_project duration
    from employee projects ep
    where employee id = ep.employee id;
end;
$$ language plpgsql;
```

#### SRF + Lateral

```
select first_name
     , last name
     , performance_rating
     , rd_project_count
     , it_project_count
     , pi_project_count
     , mean_project_duration
from employees
     join lateral project_allocations(employee_id) on true
where performance_rating ≥ 4.5
  and project count > 1
order by ( performance_rating, project_count ) desc
```

#### SRF + Lateral

```
select first_name
     , last_name
     , performance_rating
     , rd_project_count
     , it_project_count
     , pi_project_count
     , mean_project_duration
from employees
   , lateral project_allocations(employee_id)
where performance_rating ≥ 4.5
  and project count > 1
order by ( performance_rating, project_count ) desc
```

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Data types shenanigans

#### Indices 101

Persistent data structure to speed up data access:

- btree default index type.
  - Allows range lookup and sorting
- gin inverted index.
  - Allows multi-key lookup but no sorting.
- gist framework to create complex datatype indices.
  - Allows distance based lookup and sorting

Indices 101

Stored in pages like tables: hence tablespace

create index ...
tablespace nvme\_drive;

Indices 101

Only one index can be used to scan in order

### Multicolumns indices

```
create index on action (user_id, ts desc)
```

### Order of the columns is important!

- <u>v</u> user\_id = ???
- user\_id = ??? and ts <= ???
- X ts between ??? and ???

### Multicolumns indices

```
create index on action (user id, ts desc)
```

### Order of the columns is important!

- V order by user id
- V order by user\_id, ts desc
- order by tsorder by ts desc, user\_id

### Included fields in index

```
create index on action (user_id, ts desc)
include (asset)
```

- Can make a query skip heap storage
- IndexOnlyScan vs IndexScan
- Useful when joining partial data

### Partial Index

```
create index on action (user_id, ts desc)
include (asset)
where status = 'canceled'
```

- Reduce index size (and potentially increase performance)
- Can be combined with unique to enforce uniqueness on a subsets of rows

### Clustered Tables

cluster table name using idx action user id ts;

- Physically **reorders table rows** based on an **index**.
- Faster index-based scans (esp. range queries).

### Clustered Tables

cluster table name using idx action user id ts;

- **Table locked** during clustering (exclusive access).
- Needs manual re-cluster
- Can increase **write overhead** if frequently updated.

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Data types shenanigans

### Using domains

```
create domain invoice_total_amount as numeric(20,2)
check (
   value > 0 and value <= 1000000
)
constraint invoice_total_amount_range_check;</pre>
```

## Using domains

- ranges are continuous intervals (e.g. dates, numbers)
- multiranges are sets of non-overlapping ranges
- Lots of operator / functions that handle all the tricky use cases
  - overlap
  - o open / closed bounds
- Indexing support using gist and btree\_gist

create index on subscription using gist (active period);

```
select * from subscription
where active_period @> date '2025-06-01';
select * from subscription
where active period -|- daterange('2025-06-01', '2025-07-01');
```

Using complex data types: exclude constraints

```
create table room booking (
   id bigserial primary key,
  room id bigint not null,
  booked period tsrange not null,
  exclude using gist (
     room id with = ,
     booked period with &&
```

Using complex data types: arrays

- collection of elements
- overhead for small collection is huge (24 bytes)
- Indexable using GIN (warning: no sorting!)
  - o @> (inclusion)
  - && (overlap)
- For key-value, use hstore

Using complex data types: arrays and aggregations

Using complex data types: ltree

- ltree stores hierarchical labels (path in a tree)
- lquery: pattern-matching syntax for querying ltrees
- indexable (GiST) on ltree and ltree[]

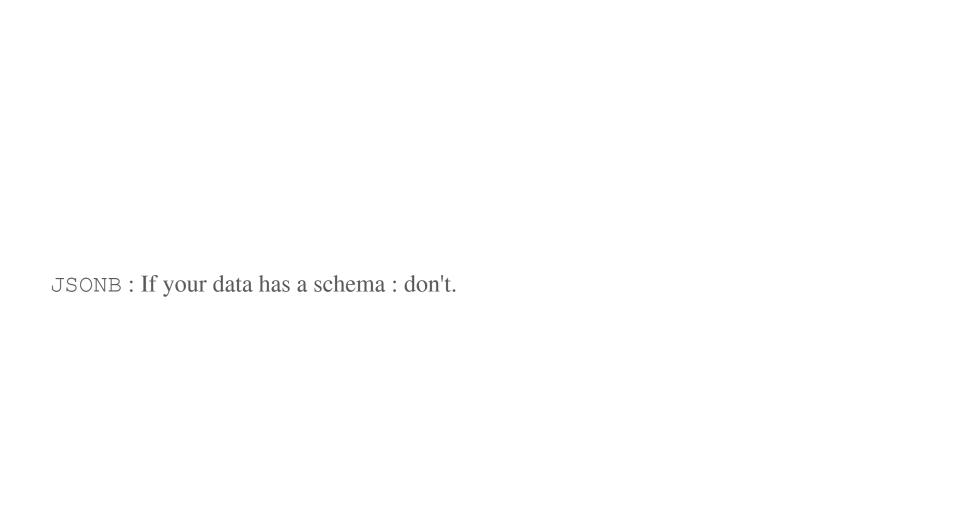
Using complex data types: ltree

```
create extension if not exists ltree;
create table product category (
   id serial primary key,
   name text not null,
   path ltree not null
create index idx product path gist
   on product category
   using gist (path);
```

### Using complex data types: ltree

```
-- 1. in Electronics
-- 2. Exactly 2-3 levels are left free
-- 3. Last label must be LED, OLED, or Speakers
-- 4. Exclude any category whose path contains Refurbished anywhere

select id, name, path
from product_category
where path ~ 'electronics.*{2,3}.{led|oled|speakers} & !*.refurbished';
```



Using complex data types: jsonb

- Joins are fast.
- TOAST (The Oversized-Attribute Storage Technique)
  - Compressing and storing large field values (like long text or bytea)
     out-of-line in a separate pages to preserve row byte length
  - Reads are slower

# Using complex data types: jsonb

- base GIN
  - o data @> '{"status": "active"}' -- contains
  - o data ? 'email' -- exsits
- path GIN (data jsonb\_path\_ops)only for @>
- btree on extracted values
  - o create index idx\_data\_price on my\_table ((data ->> 'price'))

JSONB : Great for aggregations

Using complex data types: jsonb aggregations

```
create table transactions (
    transaction id
                    uuid
                               primary key default gen random uuid(),
    account id
               uuid
                               not null references accounts(account id),
    transaction date timestamptz not null
);
create table transaction assets (
                           primary key default gen_random_uuid(),
    detail id
                    uuid
    transaction_id
                    uuid    not null references transactions(transaction id),
    asset_name
                    text
                           not null,
               numeric not null
    amount
```

Using complex data types: jsonb

Using complex data types: jsonb

```
select transaction_id
   , transaction_date
   , get_transaction_transfers(transaction_id) as transfers
from transactions
where account_id = '<account_id>';
```

Using complex data types : cube

Builtin extension to manipulate *hyper-rectangles* and *points* 

- spatial indexing
- Effectively multivariate order-independant index
- range-based searching.

```
create table customer_profile (
    customer_id serial primary key,
    logins integer not null,
    session_duration numeric(5,2) not null,
    purchases integer not null
);
```

```
create index customer_behavior_idx
on customer_profile
using gist (
    cube(array[
        logins::float8,
        session_duration::float8,
        purchases::float8
])
```

```
select *
from customer_profile
where
      cube(array[ logins::float8, session_duration::float8,
purchases::float8])
    <@ cube(array[10,20,1],array[50,40,10]);</pre>
```

#### QUERY PLAN

Bitmap Heap Scan on customer\_profile (cost=1.26..3.42 rows=2 width=24)

Recheck Cond: (cube(ARRAY[...]) <@ '(10, 20, 1), (50, 40, 10)'::cube)

-> Bitmap Index Scan on customer\_behavior\_idx (cost=0.00..1.26 rows=2 width=0)

Index Cond: (cube(ARRAY[...]) <@ '(10, 20, 1), (50, 40, 10)'::cube)

# What is first class Postgres?

- Database is at the center of the system
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This meeting could have been an email.

This meeting could have been an email. This service could have been a table.