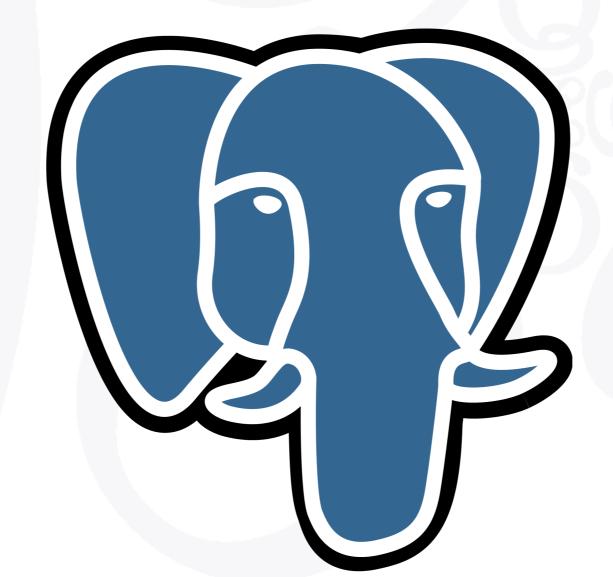
Python and PostgreSQL Let's work together!

Dimitri Fontaine Citus Data USER SINCE 1.5.2

Python



PostgreSQL

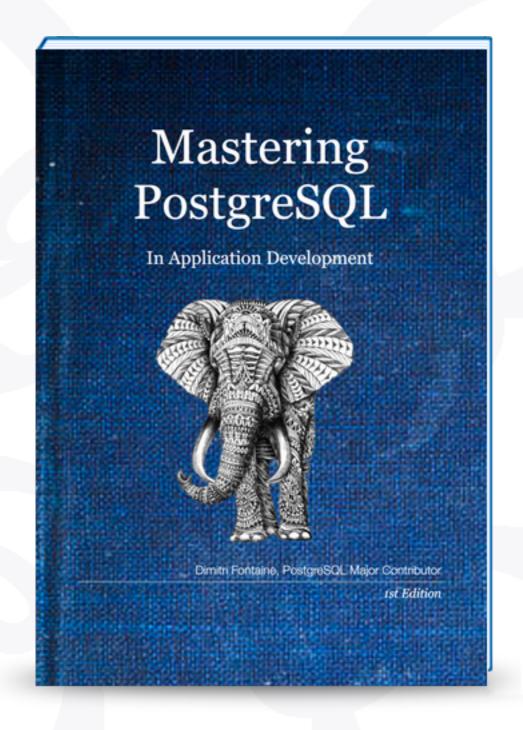


CURRENTLY WORKING AT

Citus Data



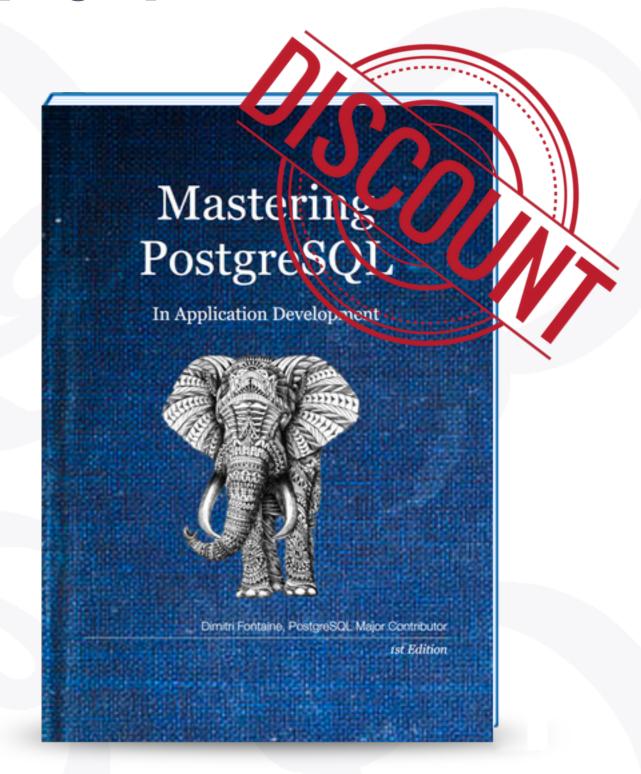
Mastering
PostgreSQL
In Application
Development



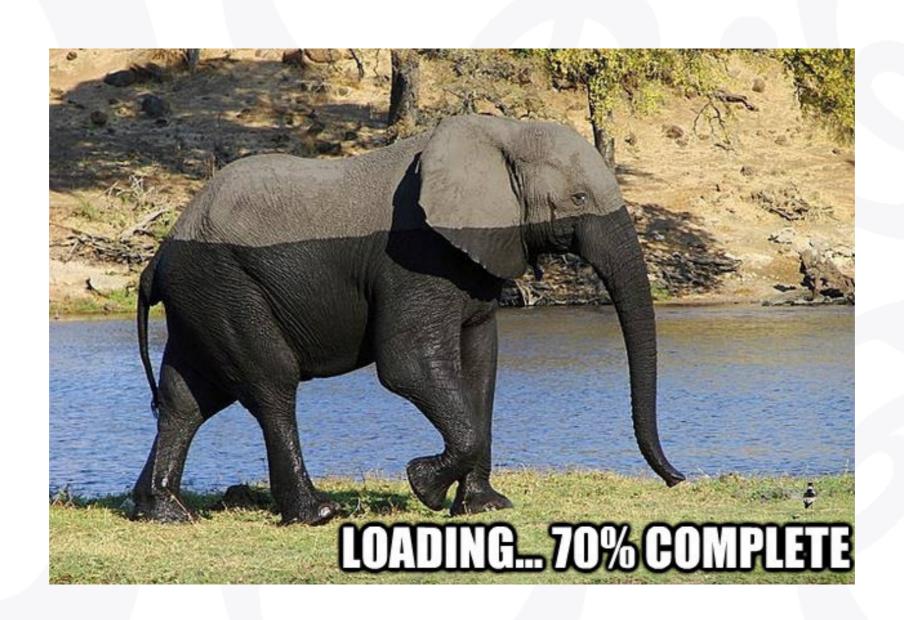
https://masteringpostgresql.com

Mastering
PostgreSQL
In Application
Development

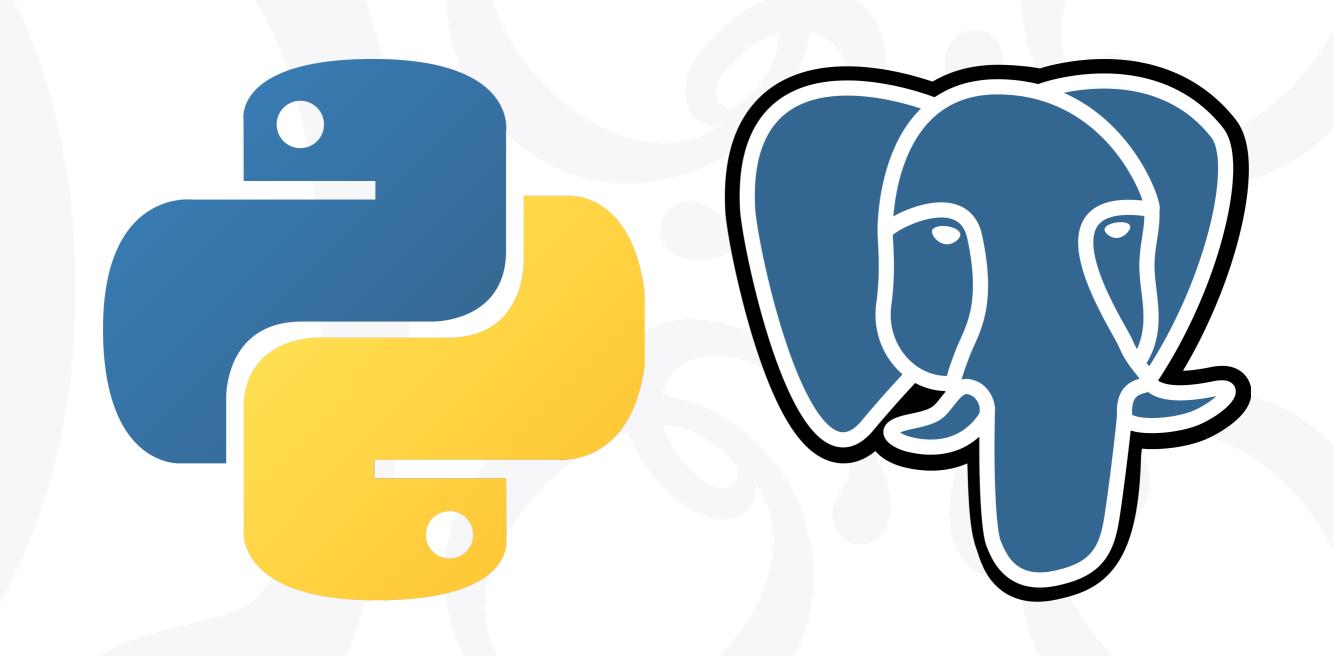
-15%
"pyconfr2018"



pgloader.io



Let's work together!



Why use a RDBMS?

Concurrency & Isolation



ACID

A relational database management system guarantees consistency of a system as a whole while allowing concurrent access (read and write) to a single data set.

- Atomic
- Consistent
- Isolated
- Durable

Atomic

ROLLBACK;

Consistent

Schema

```
create table foo
  (
    id int,
    f1 text
);
```

- Data types
- Constraints

```
check, not null, pkey, fkey
```

- Relations
- SQL

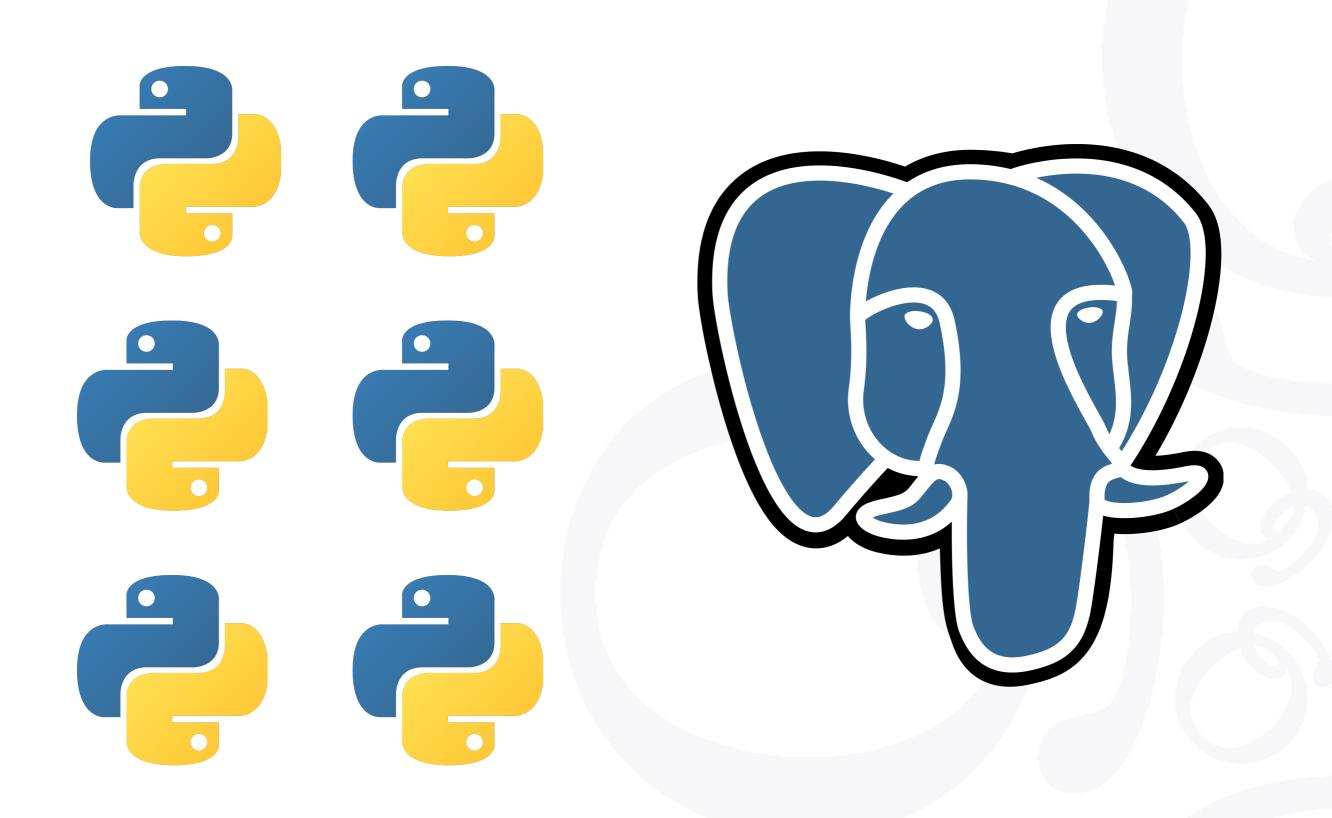
Isolated

Durable



Software Architecture

Application (user workflow) and PostgreSQL (system rules)



Rule 5. Data dominates.

"If you've chosen the right data structures and organized things well, the algorithms will almost always be self-evident. Data structures, not algorithms, are central to programming."

(Brooks p. 102)

New York Stock Exchange

Daily NYSE Group Volume in NYSE Listed, 2017

```
2010 1/4/2010 1,425,504,460 4,628,115 $38,495,460,645

2010 1/5/2010 1,754,011,750 5,394,016 $43,932,043,406

2010 1/6/2010 1,655,507,953 5,494,460 $43,816,749,660

2010 1/7/2010 1,797,810,789 5,674,297 $44,104,237,184
```

```
create table factbook
  (
    year int,
    date date,
    shares text,
    trades text,
    dollars text
);
```

\copy factbook from 'factbook.csv' with delimiter E'\t' null ''

Daily NYSE Group Volume in NYSE Listed, 2017

```
alter table factbook
  alter shares
    type bigint
  using replace(shares, ',', '')::bigint,

alter trades
  type bigint
  using replace(trades, ',', '')::bigint,

alter dollars
  type bigint
  using substring(replace(dollars, ',', '') from 2)::numeric;
```

SQL and Algorithms

Top-N Heapsort, Python

```
#! /usr/bin/env python3
import psycopg2
import heapq
import sys
PGCONNSTRING = "dbname=appdev application name=cont"
def top(n):
    "Fetch data from the factbook table"
    conn = psycopg2.connect(PGCONNSTRING)
    curs = conn.cursor()
    sql = """
  SELECT date, dollars
    FROM factbook
   WHERE date is not null
0.000
    curs.execute(sql)
    topn = [(0, None) for i in range(n)]
    heapq.heapify(topn)
    for date, dollars in curs.fetchall():
        heapq.heappushpop(topn, (dollars, date))
    return topn
if __name__ == '__main__':
    n = int(sys.argv[1])
    topn = top(n)
    for dollars, date in heapq.nlargest(n, topn):
        print("%s: %s" % (date, dollars))
```

2014-12-19: 124663932012 2015-09-18: 118869806099 2014-09-19: 118622863491 2013-12-20: 117924997250 2015-03-20: 115466468635 2016-06-24: 112434567771 2015-06-26: 110931465892 2010-06-25: 110901889417 2015-12-18: 110329938339 2014-03-21: 107923489435

Top-N Heapsort, SQL

select date, dollars from factbook order by dollars desc limit 10;

date	dollars
2014-12-19	124663932012
2015-09-18	118869806099
2014-09-19	118622863491
2013-12-20	117924997250
2015-03-20	115466468635
2016-06-24	112434567771
2015-06-26	110931465892
2010-06-25	110901889417
2015-12-18	110329938339
2014-03-21	107923489435
(10 rows)	

Top-N Heapsort, SQL

explain (analyze, verbose, buffers)

```
Limit (cost=76.73..76.76 rows=10 width=12)
       (actual time=1.356..1.359 rows=10 loops=1)
  Output: date, dollars
  Buffers: shared hit=18
  -> Sort (cost=76.73..81.62 rows=1953 width=12)
             (actual time=1.354..1.354 rows=10 loops=1)
        Output: date, dollars
        Sort Key: factbook.dollars DESC
        Sort Method: top-N heapsort Memory: 25kB
        Buffers: shared hit=18
        -> Seq Scan on public.factbook
                   (cost=0.00..34.53 rows=1953 width=12)
                   (actual time=0.017..0.673 rows=1953 loops=1)
              Output: date, dollars
               Buffers: shared hit=15
Planning time: 0.137 ms
Execution time: 1.395 ms
(13 rows)
```

Monthly Reports

Monthly Report, SQL

Monthly Report, SQL

date	shares	trades	dollars		
2017-02-01 2017-02-02 2017-02-03 2017-02-06 2017-02-07 2017-02-09 2017-02-10 2017-02-13 2017-02-14 2017-02-15 2017-02-15 2017-02-17 2017-02-17 2017-02-21 2017-02-21 2017-02-21 2017-02-22 2017-02-23 2017-02-24 2017-02-27 2017-02-28	1,161,001,502 1,128,144,760 1,084,735,476 954,533,086 1,037,660,897 1,100,076,176 1,081,638,761 1,021,379,481 1,020,482,007 1,041,009,698 1,120,119,333 1,091,339,672 1,160,693,221 1,103,777,644 1,064,236,648 1,192,772,644 1,187,320,171 1,132,693,382 1,455,597,403	5,217,859 4,586,343 4,396,485 3,817,270 4,220,252 4,410,966 4,462,009 4,028,745 3,963,509 4,299,974 4,424,251 4,461,548 4,132,233 4,323,282 4,169,982 4,169,982 4,839,887 4,656,770 4,243,911 4,789,769	\$ 44,660,060,305 \$ 43,276,102,903 \$ 42,801,562,275 \$ 37,300,908,120 \$ 39,754,062,721 \$ 40,491,648,732 \$ 40,169,585,511 \$ 38,347,515,768 \$ 38,745,317,913 \$ 40,737,106,101 \$ 43,802,653,477 \$ 41,956,691,405 \$ 48,862,504,551 \$ 44,416,927,777 \$ 41,137,731,714 \$ 44,254,446,593 \$ 45,229,398,830 \$ 43,613,734,358 \$ 57,874,495,227		
(19 rows)					

Monthly Report, Python

```
def fetch_month_data(year, month):
    "Fetch a month of data from the database"
   date = "%d-%02d-01" % (year, month)
   sal = """
 select date, shares, trades, dollars
   from factbook
   where date >= date %s
     and date < date %s + interval '1 month'
order by date;
11 11 11
   pgconn = psycopg2.connect(CONNSTRING)
   curs = pgconn.cursor()
   curs.execute(sql, (date, date))
   res = {}
   for (date, shares, trades, dollars) in curs.fetchall():
        res[date] = (shares, trades, dollars)
    return res
```

```
def list_book_for_month(year, month):
    """List all days for given month, and for each
   day list fact book entry.
   data = fetch_month_data(year, month)
    cal = Calendar()
   print("%12s | %12s | %12s | %12s" %
          ("day", "shares", "trades", "dollars"))
    print("%12s-+-%12s-+-%12s-+-%12s" %
          ("-" * 12, "-" * 12, "-" * 12, "-" * 12))
    for day in cal.itermonthdates(year, month):
       if day.month != month:
            continue
       if day in data:
            shares, trades, dollars = data[day]
        else:
            shares, trades, dollars = 0, 0, 0
        print("%12s | %12s | %12s | %12s" %
              (day, shares, trades, dollars))
```

Monthly Report, Python

./factbook-month.py 2017 2					
day	shares	trades	dollars		
	+	+	+		
2017-02-01	1161001502	5217859	44660060305		
2017-02-02	1128144760	4586343	43276102903		

2017-02-03

2017-02-04 2017-02-05

2017-02-06

2017-02-07

2017-02-08

2017-02-09

2017-02-10

2017-02-11

2017-02-12 2017-02-13

2017-02-14

2017-02-15

2017-02-16

2017-02-17

2017-02-18

2017-02-19

2017-02-20 2017-02-21

2017-02-22

2017-02-23

2017-02-24

2017-02-25

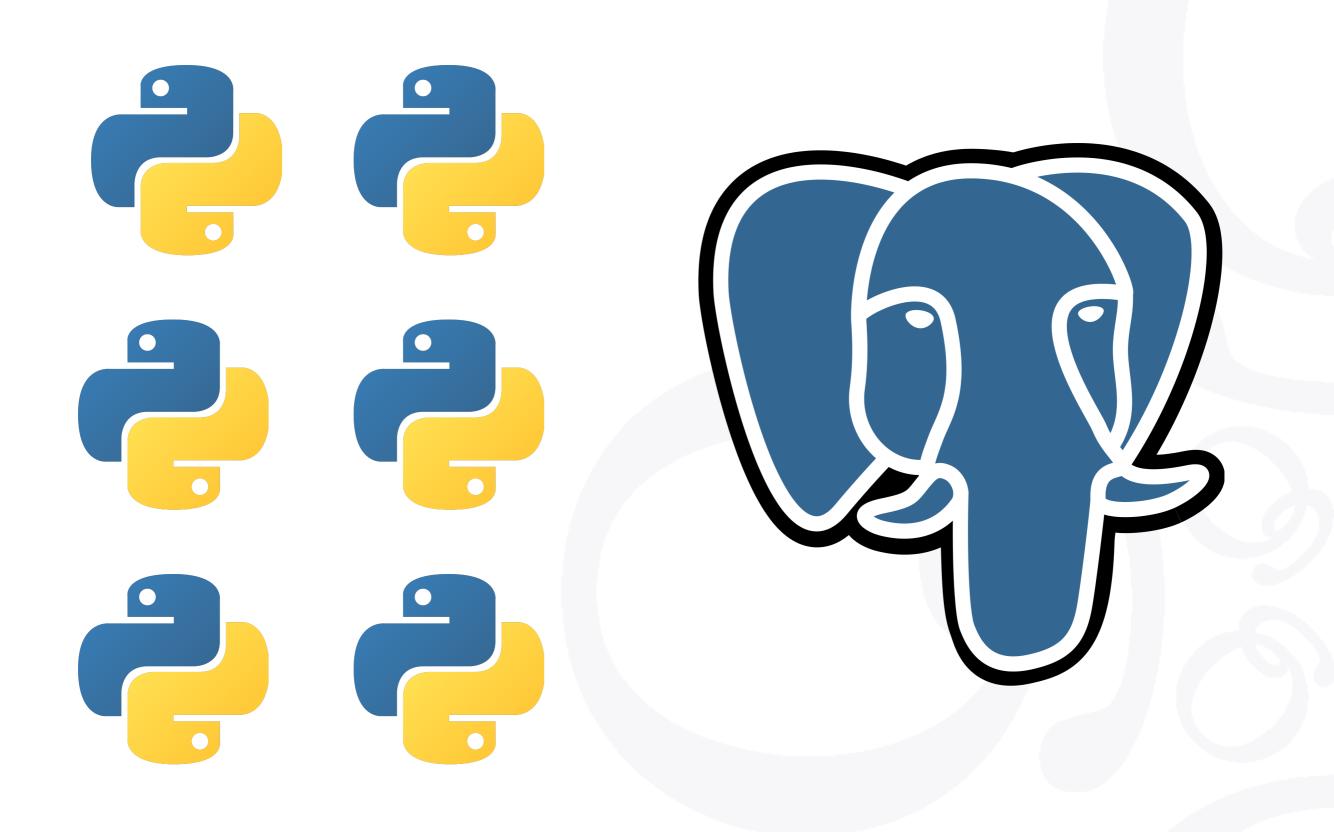
2017-02-26

2017-02-27

2017-02-28

Where is that code used?

Frontend, Back Office, Finance, Accounting, Invoicing, ...



Days with no activity, SQL

Monthly Report, Fixed, SQL

```
select cast(calendar.entry as date) as date,
         coalesce(shares, 0) as shares,
         coalesce(trades, 0) as trades,
         to_char(
             coalesce(dollars, 0),
             'L99G999G999G999'
         ) as dollars
    from /*
          * Generate the target month's calendar then LEFT JOIN
          * each day against the factbook dataset, so as to have
          * every day in the result set, whether or not we have a
          * book entry for the day.
          */
         generate_series(date :'start',
                         date: 'start' + interval '1 month'
                                        - interval '1 day',
                         interval '1 day'
         as calendar(entry)
         left join factbook
                on factbook.date = calendar.entry
order by date;
```

Monthly Report, Fixed, SQL

date	shares	trades	dollars	
2017-02-01	1161001502	5217859	\$ 44,660,060,305	
2017-02-02	1128144760	4586343	\$ 43,276,102,903	
2017-02-03	1084735476	4396485	\$ 42,801,562,275	
2017-02-04	0	0	\$ 0	
2017-02-05	0	0	\$ 0	
2017-02-06	954533086	3817270	\$ 37,300,908,120	
2017-02-07	1037660897	4220252	\$ 39,754,062,721	
2017-02-08	1100076176	4410966	\$ 40,491,648,732	
2017-02-09	1081638761	4462009	\$ 40,169,585,511	
2017-02-10	1021379481	4028745	\$ 38,347,515,768	
2017-02-11	0	0	\$ 0	
2017-02-12	0	0	\$ 0	
2017-02-13	1020482007	3963509	\$ 38,745,317,913	
2017-02-14	1041009698	4299974	\$ 40,737,106,101	
2017-02-15	1120119333	4424251	\$ 43,802,653,477	
2017-02-16	1091339672	4461548	\$ 41,956,691,405	
2017-02-17	1160693221	4132233	\$ 48,862,504,551	
2017-02-18	0	0	\$ 0	
2017-02-19	0	0	\$ 0	
2017-02-20	0	0	\$ 0	
2017-02-21	1103777644	4323282	\$ 44,416,927,777	
2017-02-22	1064236648	4169982	\$ 41,137,731,714	
2017-02-23	1192772644	4839887	\$ 44,254,446,593	
2017-02-24	1187320171	4656770	\$ 45,229,398,830	
2017-02-25	0	0	\$ 0	
2017-02-26	0	0	\$ 0	
2017-02-27	1132693382	4243911	\$ 43,613,734,358	
2017-02-28	1455597403	4789769	\$ 57,874,495,227	
(28 rows)				

Marketing dept wants Week on Week Evolution

date	day	dollars	WoW %
2017-02-01	Wed	\$ 44,660,060,305	-2.21
2017-02-02	Thu	\$ 43,276,102,903	1.71
2017-02-03	Fri	\$ 42,801,562,275	10.86
2017-02-04	Sat	\$ 0	¤
2017-02-05	Sun	\$ 0	¤
2017-02-06	Mon	\$ 37,300,908,120	-9.64
2017-02-07	Tue	\$ 39,754,062,721	-37.41
2017-02-08	Wed	\$ 40,491,648,732	-10.29
2017-02-09	Thu	\$ 40,169,585,511	-7.73
2017-02-10	Fri	\$ 38,347,515,768	-11.61
2017-02-11	Sat	\$ 0	¤
2017-02-12	Sun	\$ 0	¤
2017-02-13	Mon	\$ 38,745,317,913	3.73
2017-02-14	Tue	\$ 40,737,106,101	2.41
2017-02-15	Wed	\$ 43,802,653,477	7.56
2017-02-16	Thu	\$ 41,956,691,405	4.26
2017-02-17	Fri	\$ 48,862,504,551	21.52
2017-02-18	Sat	\$ 0	¤
2017-02-19	Sun	\$ 0	¤
2017-02-20	Mon	\$ 0	¤
2017-02-21	Tue	\$ 44,416,927,777	8.28
2017-02-22	Wed	\$ 41,137,731,714	-6.48
2017-02-23	Thu	\$ 44,254,446,593	5.19
2017-02-24	Fri	\$ 45,229,398,830	-8.03
2017-02-25	Sat	\$ 0	¤
2017-02-26	Sun	\$ 0	¤
2017-02-27	Mon	\$ 43,613,734,358	¤
2017-02-28	Tue	\$ 57,874,495,227	23.25
(28 rows)			

The Art of PostgreSQL

Turn Thousands of Lines of Code into Simple Queries

```
with computed_data as
                                                            select date, day,
                                                                    to_char(
  select cast(date as date) as date,
                                                                        coalesce(dollars, 0),
         to_char(date, 'Dy') as day,
                                                                        'L99G999G999G999'
         coalesce(dollars, 0) as dollars,
                                                                    ) as dollars,
         lag(dollars, 1)
                                                                    case when dollars is not null
           over(
                                                                          and dollars <> 0
             partition by extract('isodow' from date)
                                                                         then round( 100.0
                 order by date
                                                                                    * (dollars - last_week_dollars)
                                                                                    / dollars
         as last_week_dollars
                                                                                  , 2)
    from /*
                                                                     end
          * Generate the month calendar, plus a week
                                                                    as "WoW %"
          * before so that we have values to compare
                                                              from computed_data
          * dollars against even for the first week
                                                             where date >= date :'start'
          * of the month.
                                                          order by date;
         generate_series(date :'start' - interval '1 week',
                         date :'start' + interval '1 month'
                                       - interval '1 day',
                         interval '1 day'
         as calendar(date)
         left join factbook using(date)
```

```
with computed_data as
                                                          select date, day,
                                                                 to_char(
  select cast(date as date)
                             as date,
                                                                     coalesce(dollars, 0),
        to_char(date, 'Dy') as day,
                                                                      'L99G999G999G999'
        coalesce(dollars, 0) as dollars,
                                                                 ) as dollars,
        lag(dollars, 1)
                                                                 case when dollars is not null
          over(
                                                                       and dollars <> 0
            partition by extract('isodow' from date)
                                                                      then round( 100.0
                order by date
                                                                                 * (dollars - last_week_dollars)
                                                                                 / dollars
        as last_week_dollars
                                                                               , 2)
   from /*
                                                                   end
         * Generate the month calendar, plus a week
                                                                  as "WoW %"
         * before so that we have values to compare
                                                            from computed_data
         * dollars against even for the first week
                                                            where date >= date :'start'
         * of the month.
                                                        order by date;
        generate_series(date :'start' - interval \_ week',
                        date :'start' + interval '1 month'
                                      - interval '1 day'
                                                              Window Function, SQL'92
                        interval '1 day'
        as calendar(date)
```

left join factbook using(date)

date	day	dollars	WoW %
2017-02-01	Wed	\$ 44,660,060,305	-2.21
2017-02-02	Thu	\$ 43,276,102,903	1.71
2017-02-03	Fri	\$ 42,801,562,275	10.86
2017-02-04	Sat	\$ 0	¤
2017-02-05	Sun	\$ 0	¤
2017-02-06	Mon	\$ 37,300,908,120	-9.64
2017-02-07	Tue	\$ 39,754,062,721	-37.41
2017-02-08	Wed	\$ 40,491,648,732	-10.29
2017-02-09	Thu	\$ 40,169,585,511	-7.73
2017-02-10	Fri	\$ 38,347,515,768	-11.61
2017-02-11	Sat	\$ 0	¤
2017-02-12	Sun	\$ 0	¤
2017-02-13	Mon	\$ 38,745,317,913	3.73
2017-02-14	Tue	\$ 40,737,106,101	2.41
2017-02-15	Wed	\$ 43,802,653,477	7.56
2017-02-16	Thu	\$ 41,956,691,405	4.26
2017-02-17	Fri	\$ 48,862,504,551	21.52
2017-02-18	Sat	\$ 0	¤
2017-02-19	Sun	\$ 0	¤
2017-02-20	Mon	\$ 0	¤
2017-02-21	Tue	\$ 44,416,927,777	8.28
2017-02-22	Wed	\$ 41,137,731,714	-6.48
2017-02-23	Thu	\$ 44,254,446,593	5.19
2017-02-24	Fri	\$ 45,229,398,830	-8.03
2017-02-25	Sat	\$ 0	¤
2017-02-26	Sun	\$ 0	¤
2017-02-27	Mon	\$ 43,613,734,358	¤
2017-02-28	Tue	\$ 57,874,495,227	23.25
(28 rows)			

The SQL Standard

SQL:2016

Thinking in SQL

- Structured Query Language
- Declarative Programming Language
- Relational Model
 - Unix: everything is a file
 - Java: everything is an object
 - Python: packages, modules, classes, methods
 - SQL: relations

SQL Relations

- SELECT describes the type of the relation
 - Named a projection operator
 - Defines SQL Query Attribute domains
- FROM introduces base relations
- Relational Operators compute new relations
 - INNER JOIN
 - OUTER JOIN
 - LATERAL JOIN
 - set operators: UNION, EXECPT, INTERSECT

SQL Relations

```
with decades as
   select extract('year' from date_trunc('decade', date)) as decade
     from races
 group by decade
select decade,
       rank() over(partition by decade order by wins desc) as rank,
       forename, surname, wins
  from decades
       left join lateral
          select code, forename, surname, count(*) as wins
            from drivers
                 join results
                   on results.driverid = drivers.driverid
                  and results.position = 1
                 join races using(raceid)
                   extract('year' from date_trunc('decade', races.date))
                 = decades.decade
        group by decades.decade, drivers.driverid
        order by wins desc
           limit 3
       as winners on true
order by decade asc, wins desc;
```

Top-3 Pilots by decade

decade	rank	forename	surname	wins
1950	1	Juan	Fangio	24
1950	2	Alberto	Ascari	13
1950	3	Stirling	Moss	12
1960	1	Jim	Clark	25
1960	2	Graham	Hill	14
1960	3	Jack	Brabham	11
1970	1	Niki	Lauda	17
1970	2	Jackie	Stewart	16
1970	3	Emerson	Fittipaldi	14
1980	1	Alain	Prost	39
1980	2	Nelson	Piquet	20
1980	2	Ayrton	Senna	20
1990	1	Michael	Schumacher	35
1990	2	Damon	Hill	22
1990	3	Ayrton	Senna	21
2000	1	Michael	Schumacher	56
2000	2	Fernando	Alonso	21
2000	3	Kimi	Räikkönen	18
2010	1	Lewis	Hamilton	45
2010	2	Sebastian	Vettel	40
2010	3	Nico	Rosberg	23
(21 rows))			

SQL is Code

SQL & Developer Tooling

```
with computed_data as
  select cast(date as date)
                              as date,
         to_char(date, 'Dy') as day,
         coalesce(dollars, 0) as dollars,
         lag(dollars, 1)
           over(
             partition by extract('isodow' from date)
                 order by date
         as last_week_dollars
    from /*
          * Generate the month calendar, plus a week before
          * so that we have values to compare dollars against
          * even for the first week of the month.
         generate_series(date :'start' - interval '1 week',
                         date :'start' + interval '1 month'
                                        interval '1 day',
                         interval '1 day'
         as calendar(date)
         left join factbook using(date)
  select date, day,
         to_char(
             coalesce(dollars, 0),
             'L99G999G999G999'
         ) as dollars,
         case when dollars is not null
               and dollars <> 0
              then round( 100.0
                         * (dollars - last_week_dollars)
                         / dollars
                       , 2)
          end
         as "WoW %"
    from computed_data
   where date >= date :'start'
order by date;
```

- Code Integration
 - SQL Queries in .sql files
 - Parameters
 - Result Set To Objects
 - A Result Set is a Relation
- Testing
 - Unit Testing
 - Regression Testing

Python AnoSQL

```
$ cat queries.sql

-- name: get-all-greetings
-- Get all the greetings in the database
SELECT * FROM greetings;

-- name: $select-users
-- Get all the users from the database,
-- and return it as a dict
SELECT * FROM USERS;
```

Python AnoSQL

```
import anosql
import psycopg2
import sqlite3
# PostgreSQL
conn = psycopg2.connect('...')
queries = anosql.load_queries('postgres', 'queries.sql')
queries = queries.get_all_users(conn)
# [{"id": 1, "name": "Meghan"}, {"id": 2, "name": "Harry"}]
queries = queries.get_all_greetings(conn)
# => [(1, 'Hi')]
```

RegreSQL

```
$ regresql test
Connecting to 'postgres://chinook?sslmode=disable'... /
TAP version 13
ok 1 - src/sql/album-by-artist.1.out
ok 2 - src/sql/album-tracks.1.out
ok 3 - src/sql/artist.1.out
ok 4 - src/sql/genre-topn.top-3.out
ok 5 - src/sql/genre-topn.top-1.out
ok 6 - src/sql/genre-tracks.out
```

RegreSQL

```
$ tree regresql/
regresql/
  - expected
    L src
               - album-by-artist.1.out
               - album-tracks.1.out
               - artist.1.out
               - genre-topn.1.out
               - genre-topn.top-1.out
               - genre-topn.top-3.out
               genre-tracks.out
   out
    \sqsubseteq src
        L— sql
               - album-by-artist.1.out
                album-tracks.1.out
               - artist.1.out
               - genre-topn.1.out
              — genre-topn.top\ 1.out
                genre-topn.top\ 3.out
               - genre-topn.top-1.out
                genre-topn.top-3.out
                genre-tracks.out
    plans
     — src
               - album-by-artist.yaml
               - album-tracks.yaml
               - artist.yaml
               - genre-topn.yaml
   regress.yaml
```

9 directories, 21 files

PostgreSQL Extensions

Geolocation: ip4r



Geolocation & earthdistance

```
with geoloc as
  select location as l
    from location
    join blocks using(locid)
   where iprange
         >>=
         '212.58.251.195'
  select name,
         pos <@> l miles
    from pubnames, geoloc
order by pos <-> l
   limit 10;
```

name	miles	
The Windmill County Hall Arms St Stephen's Tavern The Red Lion Zeitgeist The Rose The Black Dog All Bar One	0.238820308117723 0.343235607674773 0.355548630092567 0.417746499125936 0.395340599421532 0.462805636194762 0.536202634581979 0.489581827372222 0.49081531378207	
Slug and Lettuce Westminster Arms	0.49081531378207	
(10 rows)		

NBA Games Statistics

"An interesting factoid: the team that recorded the fewest defensive rebounds in a win was the 1995-96 Toronto Raptors, who beat the Milwaukee Bucks 93-87 on 12/26/1995 despite recording only 14 defensive rebounds."

NBA Games Statistics

```
with stats(game, team, drb, min) as (
    select ts.game, ts.team, drb, min(drb) over ()
      from team_stats ts
           join winners w on w.id = ts.game
                         and w.winner = ts.team
select game.date::date,
       host.name || ' -- ' || host_score as host,
       guest.name || ' -- ' || guest_score as guest,
       stats.drb as winner_drb
  from stats
       join game on game.id = stats.game
       join team host on host.id = game.host
       join team guest on guest.id = game.guest
 where drb = min;
```

NBA Games Statistics

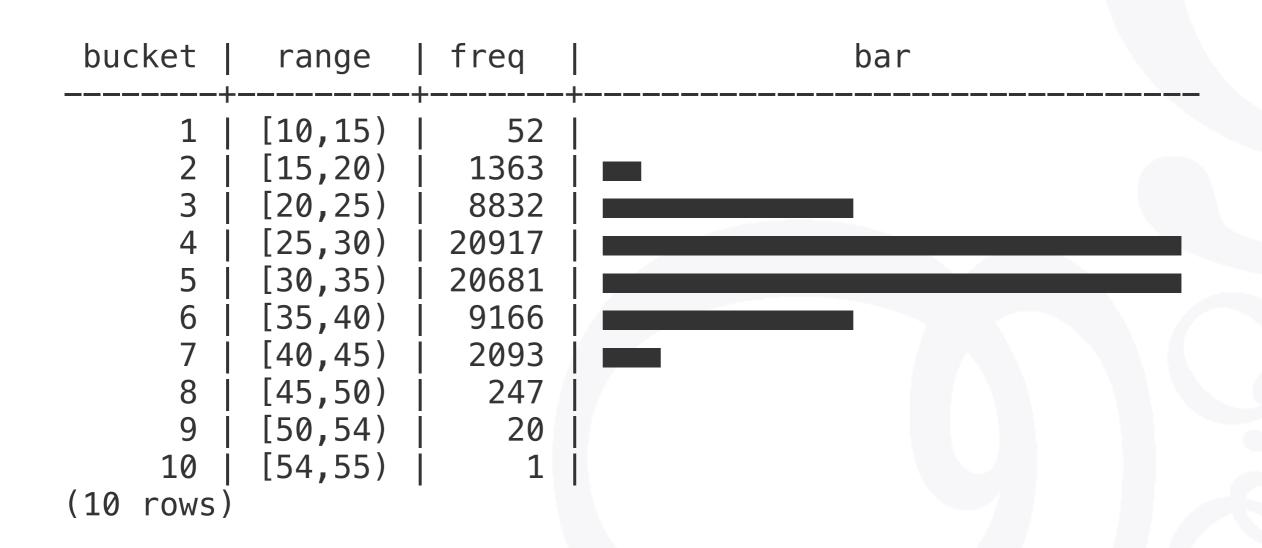
```
-[ RECORD 1 ]-----
date | 1995-12-26
host | Toronto Raptors -- 93
guest | Milwaukee Bucks -- 87
winner_drb | 14
-[ RECORD 2 ]-----
date | 1996-02-02
host | Golden State Warriors -- 114
        | Toronto Raptors -- 111
guest
winner_drb | 14
-[ RECORD 3 ]-----
date | 1998-03-31
host | Vancouver Grizzlies -- 101
guest
        | Dallas Mavericks -- 104
winner_drb | 14
-[ RECORD 4 ]-----
date | 2009-01-14
host | New York Knicks -- 128
        | Washington Wizards -- 122
guest
winner_drb
```

Time: 126.276 ms

Pure SQL Histograms

```
with drb_stats as (
    select min(drb) as min,
           max(drb) as max
      from team_stats
     histogram as (
   select width_bucket(drb, min, max, 9) as bucket,
          int4range(min(drb), max(drb), '[]') as range,
          count(*) as freq
     from team_stats, drb_stats
 group by bucket
 order by bucket
 select bucket, range, freq,
        repeat('■',
                 freq::float
                 / max(freq) over()
                 * 30
               )::int
        ) as bar
   from histogram;
```

Pure SQL Histograms



PYCONFR, LILLE | OCTOBER 7, 2018

Ask Me Two Questions!

Dimitri Fontaine Citus Data

The Art of PostgreSQL

Turn Thousands of Lines of Code into Simple Queries