# Speeding up Query Execution

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http://anarazel.de/talks/pgconf-us-2017-03-29/jit.pdf



### Motivation



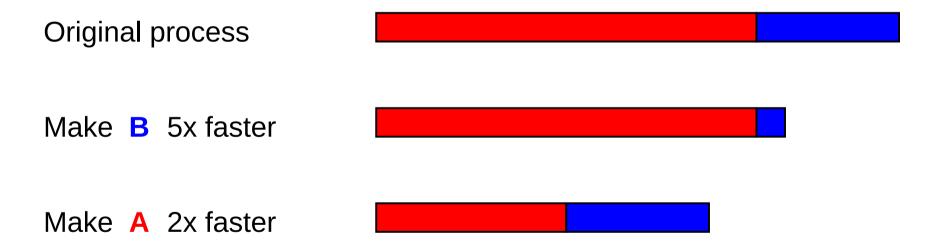
Scalability
Efficiency
Concurrency

OLTP
VS
OLAP
VS
HTAP

Online Transactional Processing
vs
Online Analytical Processing
vs
Hybrid Transactional / Analytical Processing

### Amdahl's Law

Two independent parts A B



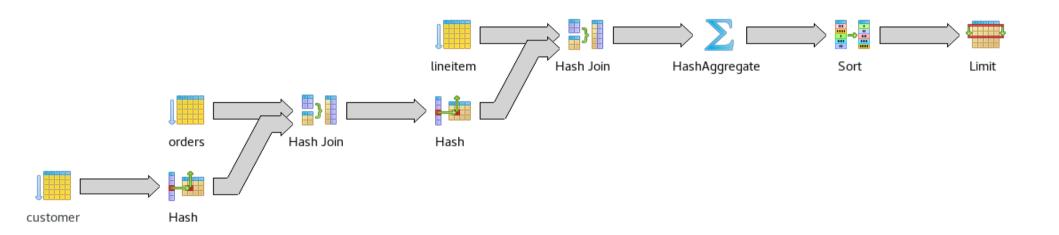
https://commons.wikimedia.org/wiki/File:Optimizing-different-parts.svg



A B C D E F G H I



# **Batch Tuple Processing**



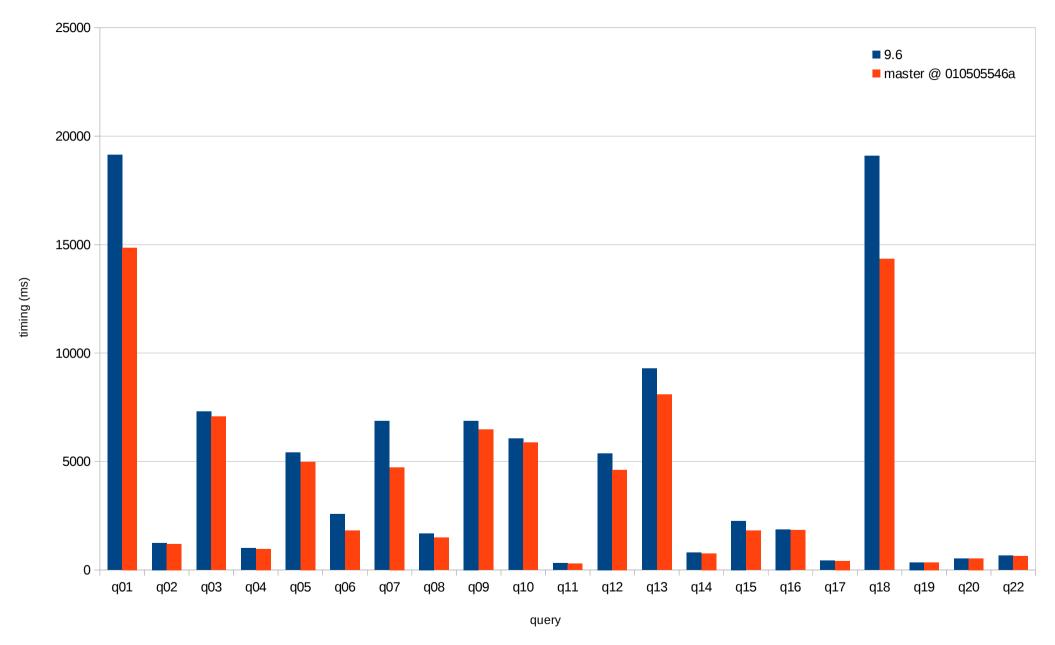


```
SFI FCT
   I returnflag,
   I linestatus,
   sum(I quantity) as sum_qty,
   sum(l extendedprice) as sum base price,
   sum(I extendedprice * (1 - I discount)) as sum disc price,
   sum(I extendedprice * (1 - I discount) * (1 + I tax)) as sum charge,
   avg(I quantity) as avg_qty,
   avg(I extendedprice) as avg price,
   avg(I discount) as avg disc,
   count(*) as count order
FROM
   lineitem
WHFRF
   I shipdate <= date '1998-12-01' - interval '74 days'
GROUP BY
   I returnflag,
   I linestatus
ORDER BY
   I returnflag,
   I linestatus;
```

```
Sort (cost=2153027.37..2153027.39 rows=6 width=68)
      (actual time=19742.591..19742.591 rows=4 loops=1)
Sort Key: l_returnflag, l_linestatus
Sort Method: quicksort Memory: 25kB
    HashAggregate (cost=2153027.19..2153027.29 rows=6 width=68)
                    (actual time=19742.557..19742.559 rows=4 loops=1)
       Group Key: l_returnflag, l_linestatus
       -> Seg Scan on lineitem (cost= rows=29727516 width=36)
                                 (actual time=0.012..4514.186 rows=29713242 loops=1)
             Filter: (l_shipdate \le '1998-09-18 \ 00:00:00'::timestamp without time zone)
             Rows Removed by Filter: 286553
Planning time: 0.326 ms
Execution time: 19742.705 ms
```

**TPCH Timing** 

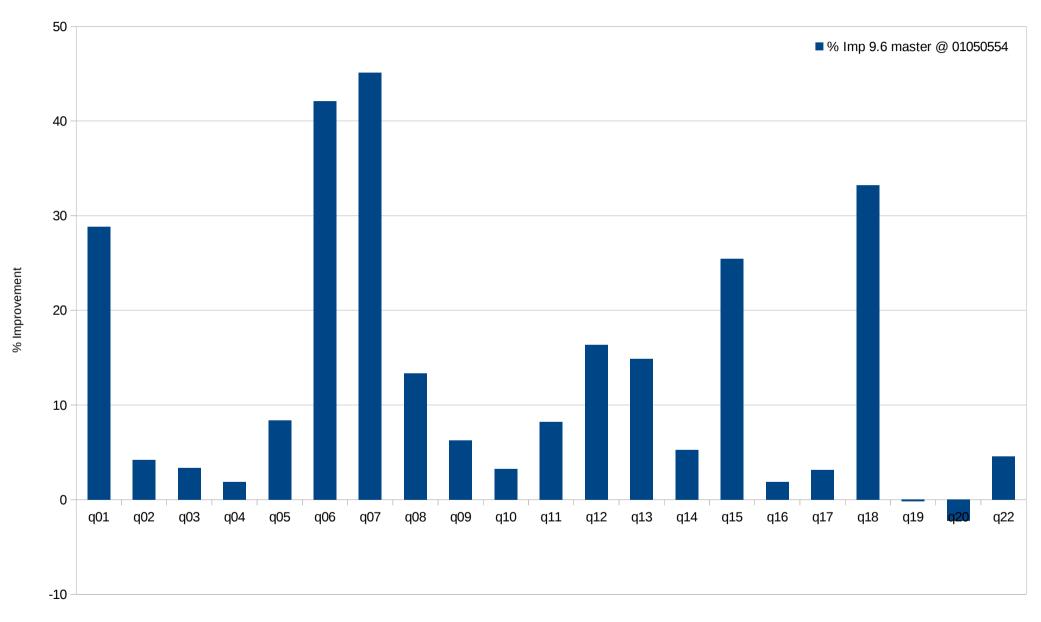
#### Non-Parallized, Scale 5





#### **TPCH Improvements**

#### Non-Parallelized, Scale 5



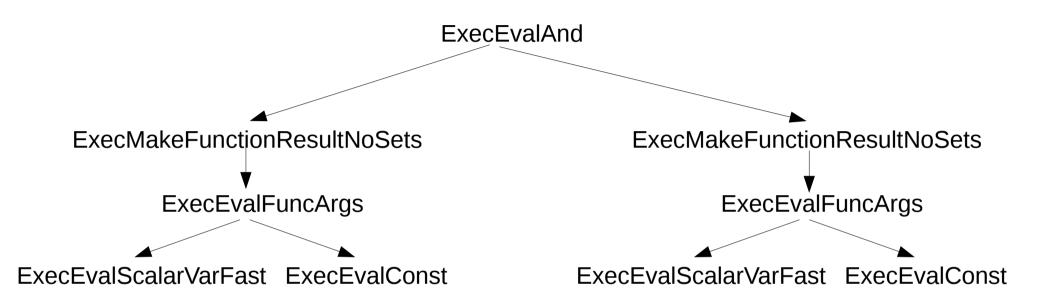
query



### **Expression Evaluation**

- SELECT list, of, columns, a + b as expr
- WHERE clauses
- GROUP BY clauses

• ...



# Expression Evaluation Methodology

### Old:

- Tree Walk
- Callback Based
- Recursive

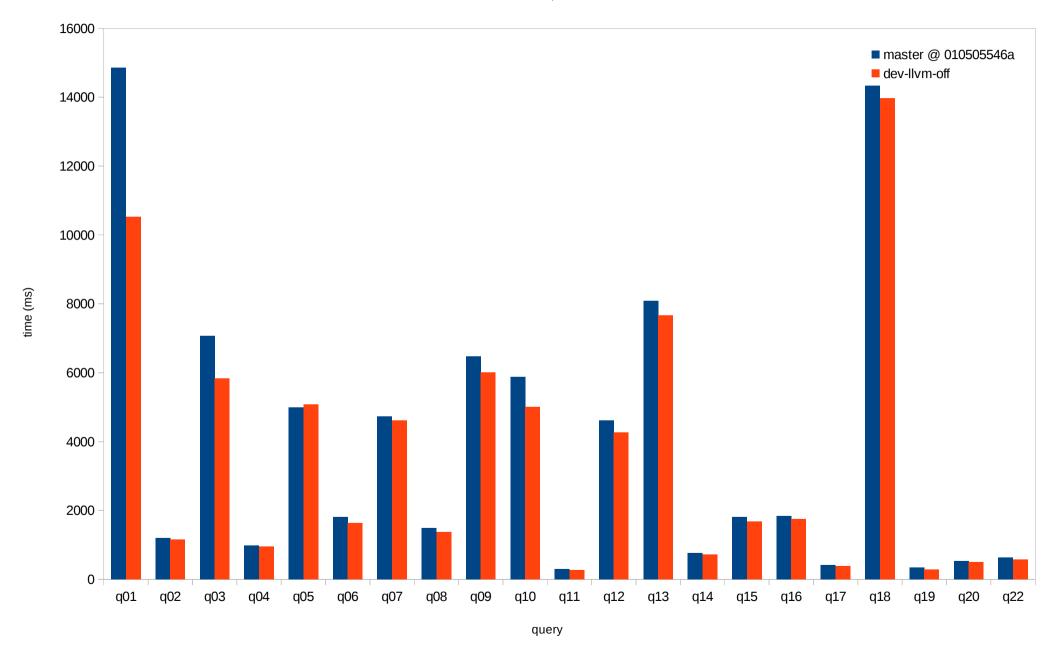
### New

- "Byte code" generated internally
- No / Fewer Callbacks
- "Direct Threaded"
- Non-Recursive



**TPCH Timings** 

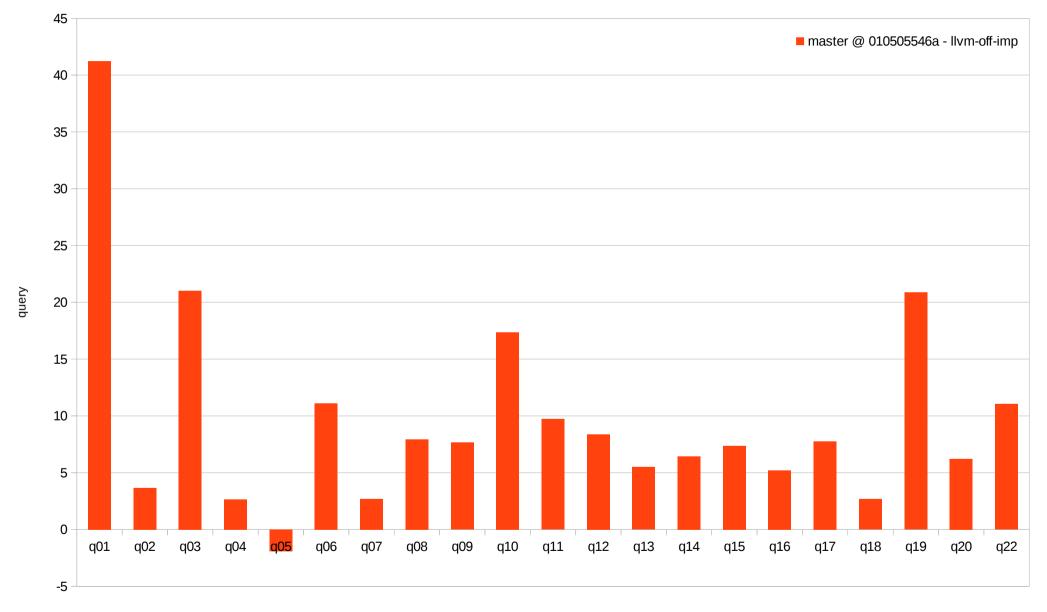
#### Not Parallelized, Scale 5





#### **TPCH Improvement**

#### Not Parallelized, Scale 5



% Improvement



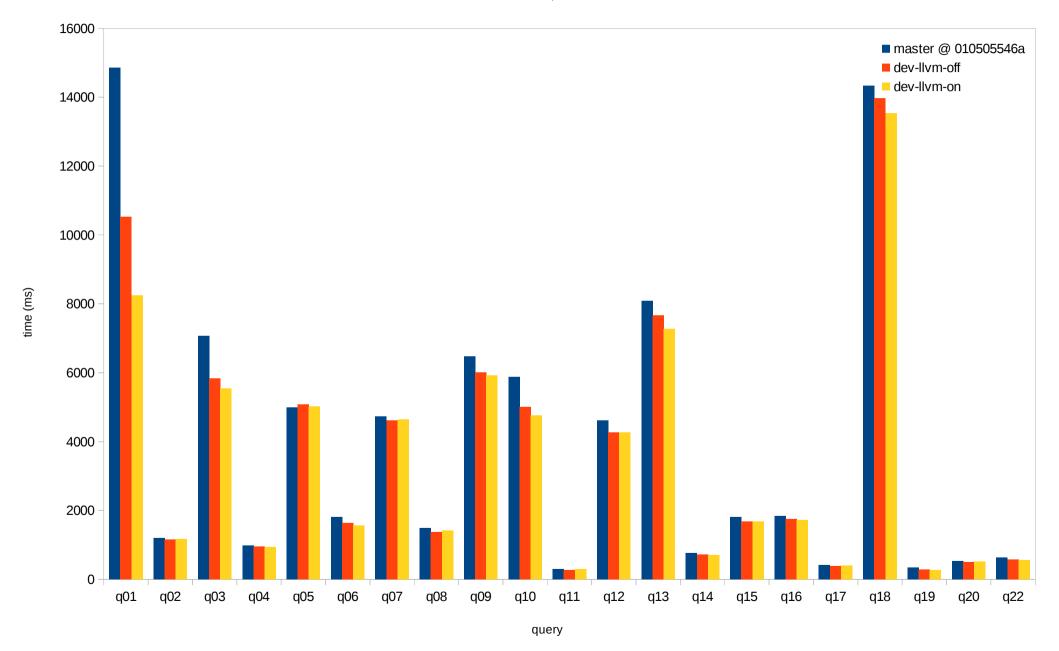
## Just In Time Compilation

- Interpretation has a lot of "jumps"
- Interpretation calls a lot of "unknown functions"
- Native Code doesn't have those Issues
- Only do so when beneficial
  - Generating a native function is expensive (~0.5-5ms)
- Can be used in a lot of places



**TPCH Timings** 

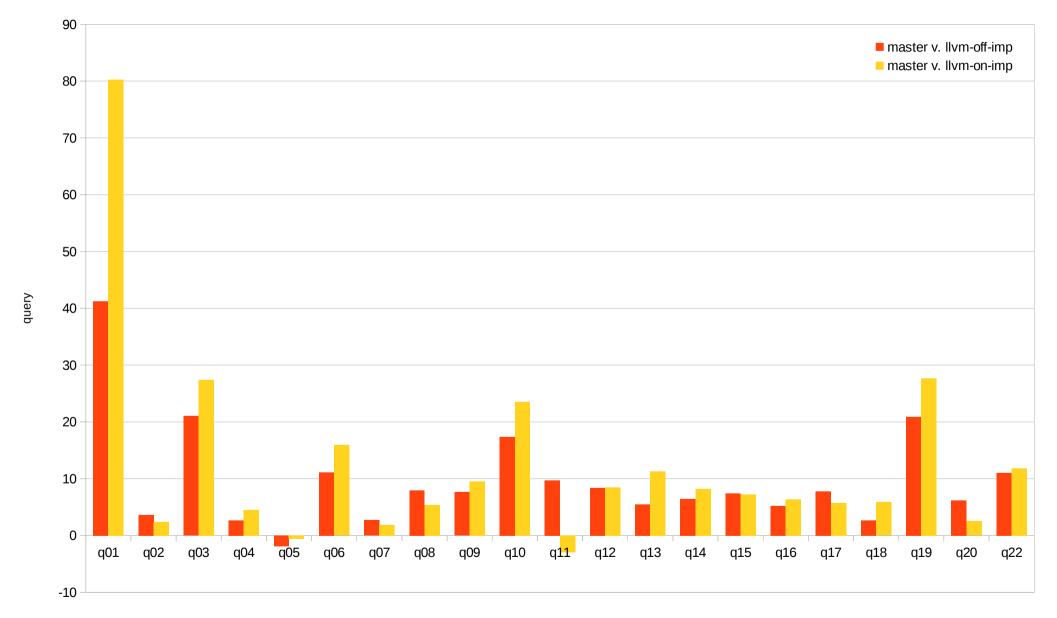
#### Not Parallelized, Scale 5





#### **TPCH Improvement**

#### Not Parallelized, Scale 5

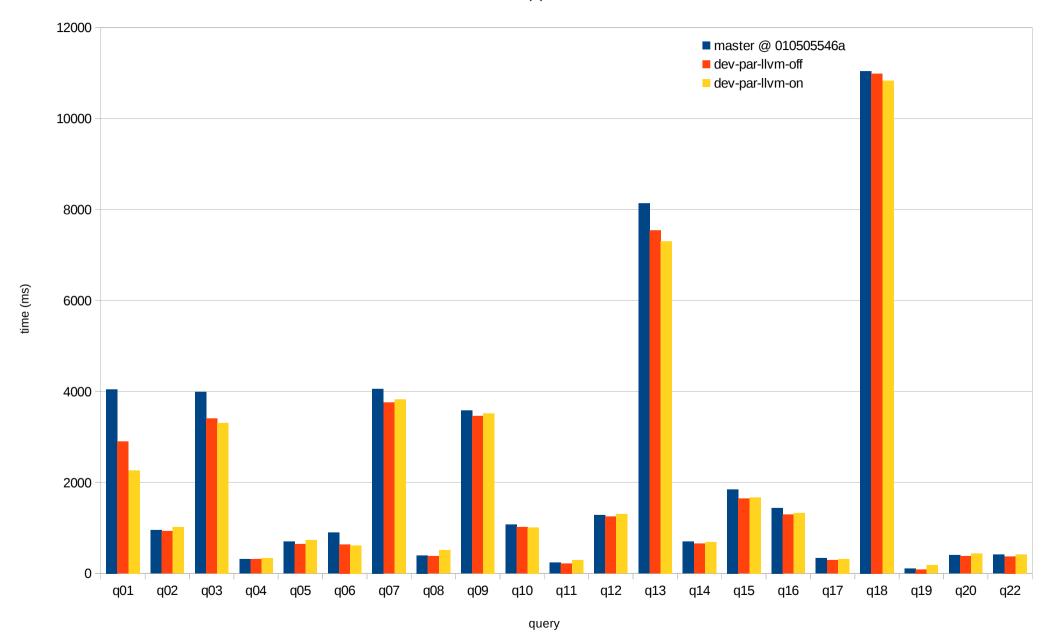


% Improvement



**TPCH Timings** 

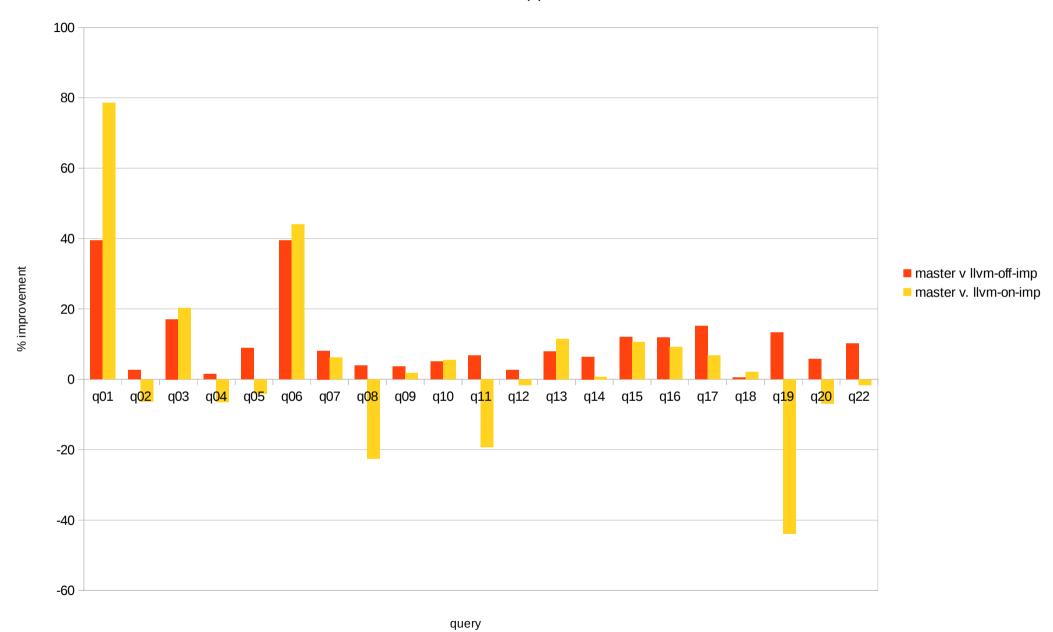
#### Parallelized (6), Scale 5





#### **TPCH Timings**

#### Parallelized (6), Scale 5



### **Tuple Deforming**

- On-Disk → Memory Representation
- Expensive, don't know columns ahead
- Improving Code: 1 Month, up to 3%
- JIT: ~1 Month, up to 80 %



### **Better JIT**

- Inline functions
  - WHERE (a + b) < c
    - float8pl / int4pl / \*pl
    - float8lt / int4lt / \*lt
  - AVG(a + b)
    - int8pl
    - int8\_avg\_accum
    - numeric\_poly\_avg
  - Function calls are expensive, content cheap to execute
- Better Code

## Batch Tuple Processing #2

- Other Bottlenecks Are Gone
- Experiments show 0 40% in TPC-H queries



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