

# @julianhyde

SQL
Query planning
Query federation
BI & OLAP
Streaming
Hadoop

ASF member
Original author of Apache Calcite
PMC Apache Arrow, Calcite, Drill, Eagle, Kylin
Architect at Looker









### Apache Calcite



Apache top-level project

Query planning framework used in many projects and products

Also works standalone: embedded federated query engine with SQL / JDBC front end

Apache community development model

https://calcite.apache.org https://github.com/apache/calcite



# Project goals

Make it easier to write a simple DBMS

Advance the state of the art for complex DBMS by pooling resources

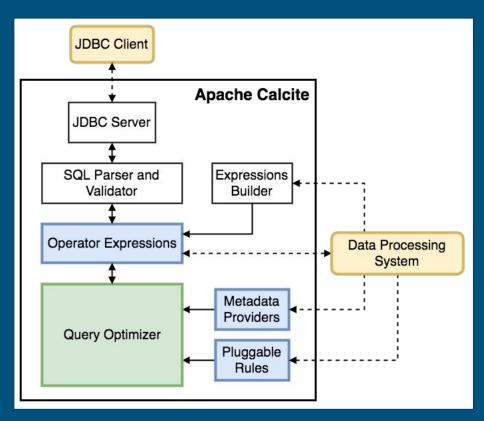
Bring database approaches to new areas (e.g. streaming)

Allow create a DBMS by composing pieces (federation, etc.)

Customize by plugging into framework, evolving framework when necessary

Apache license & governance

### Architecture



**Core** – Operator expressions (relational algebra) and planner (based on Volcano/Cascades[2])

**External** – Data storage, algorithms and catalog

**Optional** – SQL parser, JDBC & ODBC drivers

**Extensible** – Planner rewrite rules, statistics, cost model, algebra, UDFs

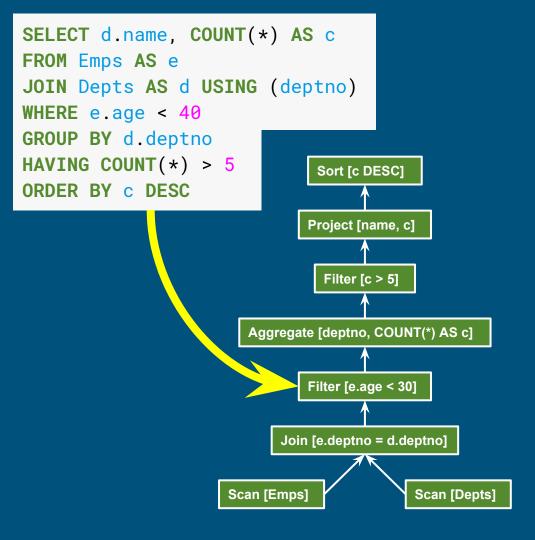
## Relational algebra

Based on set theory, plus operators: Project, Filter, Aggregate, Union, Join, Sort

Requires: declarative language (SQL), query planner

Original goal: data independence

Enables: query optimization, new algorithms and data structures



# Algebraic rewrite

Optimize by applying rewrite rules that preserve semantics

Hopefully the result is less expensive; but it's OK if it's not (planner keeps "before" and "after")

Planner uses dynamic programming, seeking the lowest total cost

```
SELECT d.name, COUNT(*) AS c
FROM (SELECT * FROM Emps
       WHERE e.age < 40) AS e
JOIN Depts AS d USING (deptno)
GROUP BY d.deptno
HAVING COUNT(*) > 5
                                  Sort [c DESC]
ORDER BY C DESC
                                 Project [name, c]
                                  Filter [c > 5]
                          Aggregate [deptno, COUNT(*) AS c]
                             Join [e.deptno = d.deptno]
                      Filter [e.age < 30]
                       Scan [Emps]
                                             Scan [Depts]
```

### Calcite framework

### Relational algebra

RelNode (operator)

- TableScan
- Filter
- Project
- Union
- Aggregate
- ...

RelDataType (type)

RexNode (expression)

RelTrait (physical property)

- RelConvention (calling-convention)
- RelCollation (sortedness)
- RelDistribution (partitioning)

RelBuilder

### **SQL** parser

SqlNode

SqlParser

SqlValidator

### Metadata

Schema

Table

Function

- TableFunction
- TableMacro

Lattice

### JDBC driver

### Transformation rules

### RelOptRule

- FilterMergeRule
- AggregateUnionTransposeRule
- 100+ more

Global transformations

- Unification (materialized view)
- Column trimming
- De-correlation

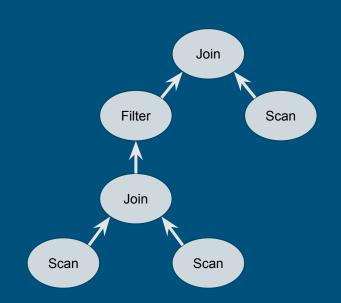
### Cost, statistics

RelOptCost

RelOptCostFactory

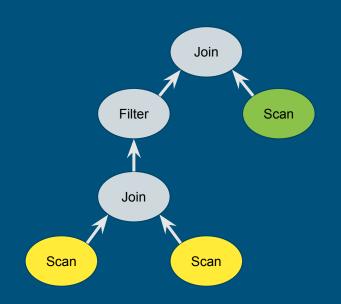
RelMetadataProvider

- RelMdColumnUniquensss
- RelMdDistinctRowCount
- RelMdSelectivity



Initially all nodes belong to "logical" calling convention

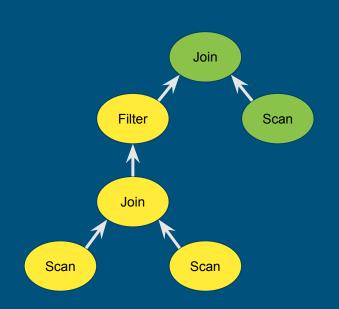
Logical calling convention cannot be implemented, so has infinite cost



Tables can't be moved so there is only one choice of calling convention for each table

### **Examples:**

- Enumerable
- Druid
- Drill
- HBase
- JDBC

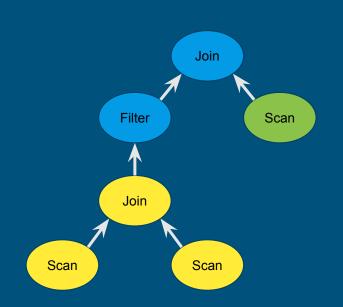


Rules fire to convert nodes to particular calling conventions

The calling convention propagates through the tree

LogicalFilter(YellowJoin) → YellowFilter(YellowJoin)

Because this is Volcano, each node can have multiple conventions



We also consider "engines" -- calling conventions that do not have a storage format.

Examples are Drill, Spark, Presto.

To implement, we generate program that calls out to query1 and query2.

# Adapter

Implement SchemaFactory interface

Connect to a data source using parameters

Extract schema - return a list of tables

Push down processing to the data source:

- A set of planner rules
- Calling convention (optional)
- Query model & query generator (optional)

```
"schemas": [
  "name": "HR";
  "type": "custom",
  "factory":
"org.apache.calcite.adapter.file.FileSchemaFactory",
  "operand": {
   "directory": "hr-csv"
$ Is -I hr-csv
-rw-r--r-- 1 jhyde staff 62 Mar 29 12:57 DEPTS.csv
-rw-r--r-- 1 jhyde staff 262 Mar 29 12:57 EMPS.csv.gz
$ ./sqlline -u jdbc:calcite:model=hr.json -n scott -p tiger
sqlline> select count(*) as c from emp;
'5'
1 row selected (0.135 seconds)
```

# Algebra builder

```
SELECT deptno,

COUNT(*) AS c,

SUM(sal) AS s

FROM Emps

HAVING COUNT(*) > 10
```

```
LogicalFilter(condition=[>($1, 10)])
LogicalAggregate(group=[{7}], C=[COUNT()], S=[SUM($5)])
LogicalTableScan(table=[[scott, EMP]])
```

### Views

```
SELECT deptno, MIN(salary)
FROM Managers
WHERE age > 50
GROUP BY deptno
```

```
Aggregate [deptno, MIN(salary)]

Filter [age > 50]

Scan [Managers]
```

```
CREATE VIEW Managers AS

SELECT *

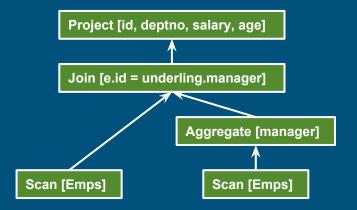
FROM Emps AS e

WHERE EXISTS (

SELECT *

FROM Emps AS underling

WHERE underling.manager = e.id)
```



# View query (after expansion)

```
SELECT deptno, MIN(salary)
FROM Managers
WHERE age > 50
GROUP BY deptno
```

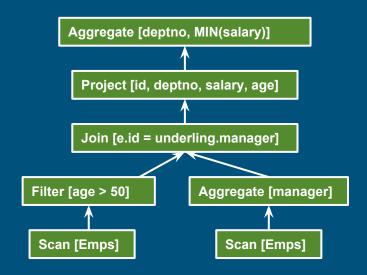
```
CREATE VIEW Managers AS
SELECT *
FROM Emps AS e
WHERE EXISTS (
   SELECT *
   FROM Emps AS underling
   WHERE underling.manager = e.id)
```



# View query (after pushing down filter)

```
SELECT deptno, MIN(salary)
FROM Managers
WHERE age > 50
GROUP BY deptno
```

```
CREATE VIEW Managers AS
SELECT *
FROM Emps AS e
WHERE EXISTS (
    SELECT *
    FROM Emps AS underling
    WHERE underling.manager = e.id)
```



### Materialized view

```
CREATE MATERIALIZED VIEW

EmpSummary AS

SELECT deptno, gender,

COUNT(*) AS c, SUM(sal) AS s

FROM Emps

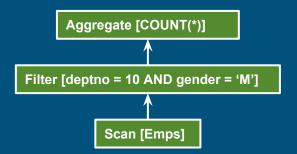
GROUP BY deptno, gender
```

```
Scan
[EmpsSummary]

Aggregate [deptno, gender, COUNT(*), SUM(salary)]

Scan [Emps]
```

SELECT COUNT(\*) AS c FROM Emps WHERE deptno = 10 AND gender = 'M'



# Materialized view: rewrite query to match

```
CREATE MATERIALIZED VIEW

EmpSummary AS

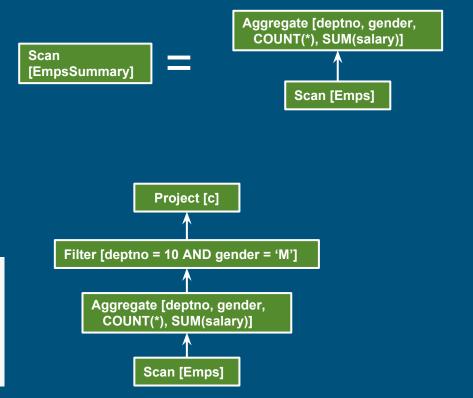
SELECT deptno, gender,

COUNT(*) AS c, SUM(sal) AS s

FROM Emps

GROUP BY deptno, gender
```

```
SELECT COUNT(*) AS c
FROM Emps
WHERE deptno = 10
AND gender = 'M'
```



# Materialized view: rewrite query to match

```
CREATE MATERIALIZED VIEW

EmpSummary AS

SELECT deptno, gender,

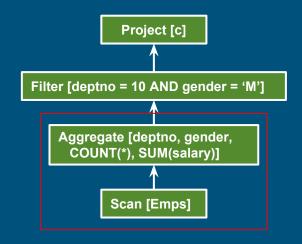
COUNT(*) AS c, SUM(sal) AS s

FROM Emps

GROUP BY deptno, gender
```

```
SELECT COUNT(*) AS c
FROM Emps
WHERE deptno = 10
AND gender = 'M'
```





### Materialized view: substitute table scan

```
CREATE MATERIALIZED VIEW

EmpSummary AS

SELECT deptno, gender,

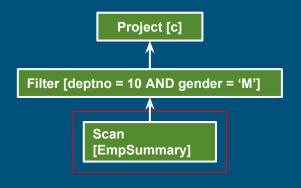
COUNT(*) AS c, SUM(sal) AS s

FROM Emps

GROUP BY deptno, gender
```

```
SELECT COUNT(*) AS c
FROM Emps
WHERE deptno = 10
AND gender = 'M'
```





### Materialized view: substitute table scan

```
CREATE MATERIALIZED VIEW

EmpSummary AS

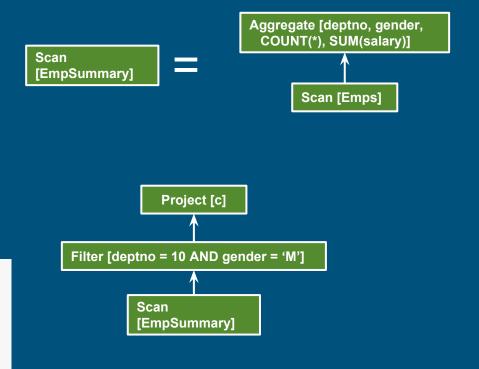
SELECT deptno, gender,

COUNT(*) AS c, SUM(sal) AS s

FROM Emps

GROUP BY deptno, gender
```

SELECT c FROM EmpSummary WHERE deptno = 10 AND gender = 'M'



### Summary

Apache Calcite is a toolkit for constructing your own DBMS

Core is **Relational Algebra** 

Optimize queries by applying **transformation rules** and choosing the best based upon **statistics** 

Calling conventions allow you to represent hybrid queries

**Materialized views** allow you optimize your data by providing sorted, aggregate copies

