# FluiDB: Adaptive storage layout using reversible relational operators

<Subtitle>

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January 1, 1980

### FluiDB at a glance

- FluiDB is an intermediate result (IR) recycling, in-memory RDBMS
- FluiDB materializes all intermediate results and garbage collects when she runs out of space, unifying query planning and IR recycling
- Radical approach to IR recycling: **adapt** data layout to the workload:
  - enable efficient plans
  - constrained (quality) budget
- The main novelty relates to the introduction of reversible relational operations which affords a new perspective on query planning and view selection.

### Example 1: Workload based on template query

\${min\_date}is instantiated for each query in the workload.

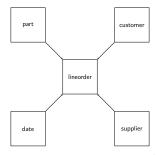
select n\_name, avg(l\_discount)

from lineitem, customer, nation, order

where l\_orderkey = o\_orderkey

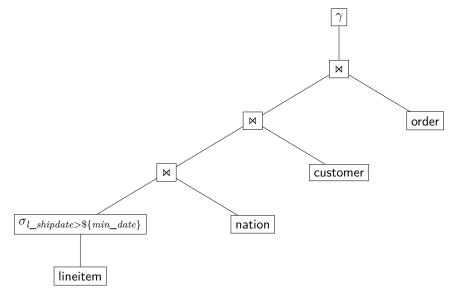
and l\_shipdate > \${min\_date}

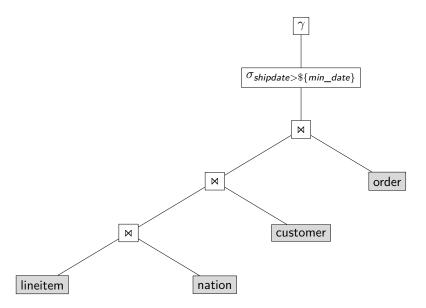
**group by** n\_name

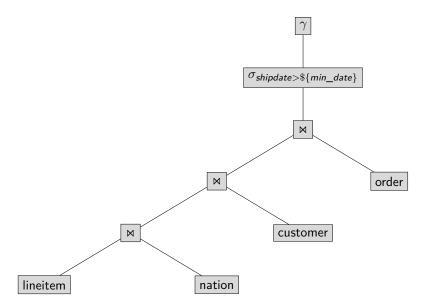


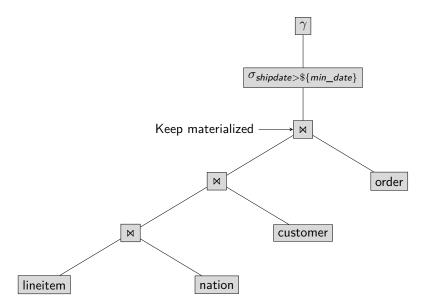
# Example 1: Traditional single-query plan

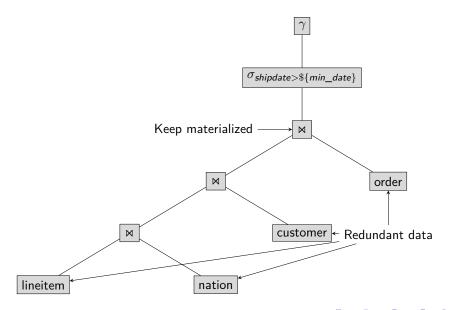
Selection push down

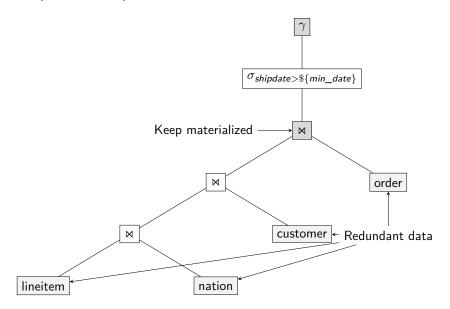


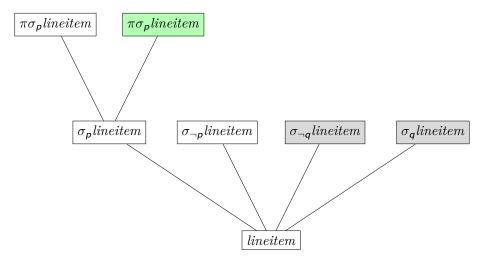


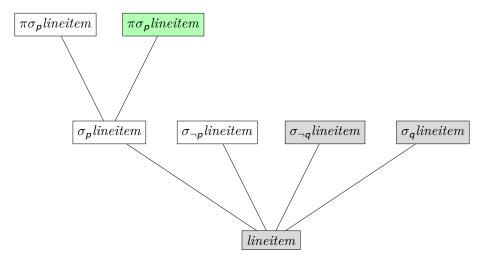


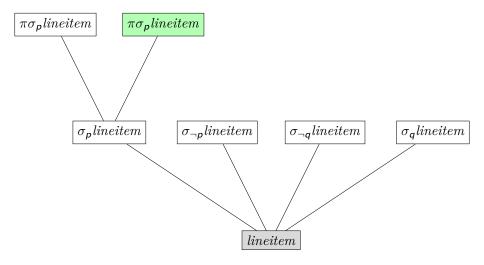


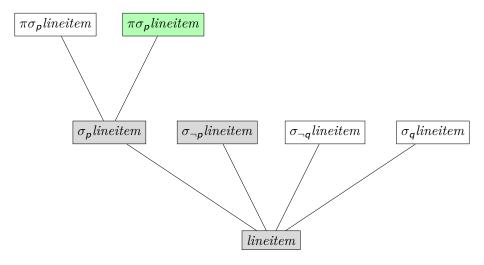


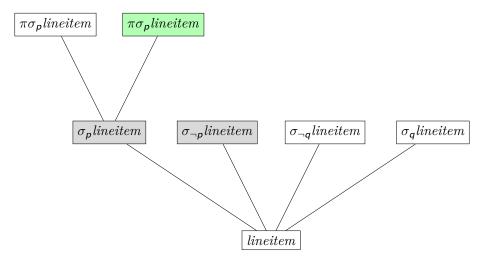


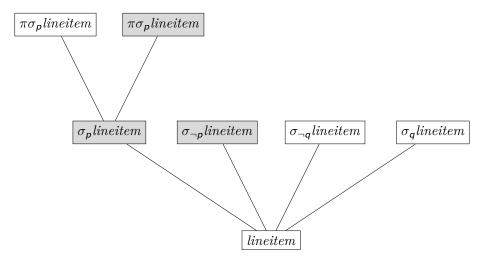








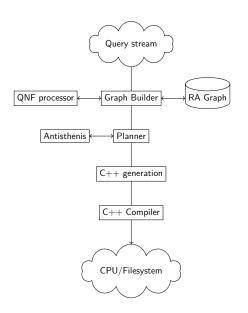




### The interesting components

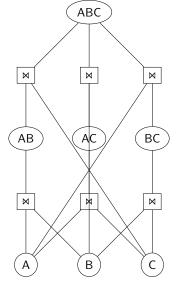
- Graph management and query normal form representation
- Logical planning infrastructure
- Antisthenis: An incremental numeric evaluation system for cost estimation.
- Logical planning algorithm and garbage collector
- Code generation system.

### Architecture



# Logical planning

- Bipartite query graph RA operations/relations unified for all queries
- Join ordering enumeration
- QNF  $\pi\sigma(Q_1 \times Q_2 \times ...)$  or  $\gamma\sigma(Q_1 \times Q_2 \times ...)$



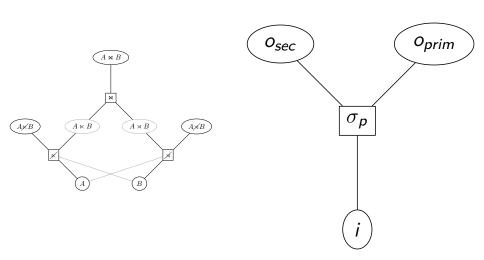
# AND/OR DAG (join ordering enumeration)

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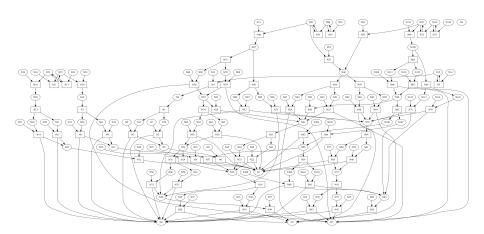
# Unified AND/OR DAG

todo

### Reversible operators



### Reversible operations



# Planning algorithm [TODO shapes]

- A network with reverse nodes
- Check depsets for materializable
- Chose an output set
- Garbage collect to create the output set
- Halt by combining
  - History cost
  - Current tirgger
  - Input cost
- Recurse on chosen inputs
- Mark outputs as materialized

#### **Antisthenis**

#### Dynamically scheduled incremental computation

Materializablility and cost inference are numerical operations:

- Input is mostly the same between runs: incremental.
- Order of computation highly affects the performance (eg absorbig elements, min).
- Self referrential computations may appear earlier than the absorbing element.

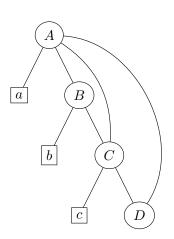
# Antisthenis: Expression graphs

$$A = a + B + C + D$$

$$B = C \times b$$

$$C = D + c$$

$$D = 0$$



# Antisthenis: Absorbing element

$$A = B \times C \times D$$

$$B = \sum_{i} i$$

$$C = 10 - 10$$

$$D = \sum_{i} i$$

### Antisthenis: Early stopping – recursive expressions

While expressions may be self-referential, we can sometimes still evaluate them.

$$A = min(B, C, D)$$

$$B = b_1 + b_2 \cdot D$$

$$C = c_1 + c_2 \cdot A$$

$$D = d_1 + d_2 \cdot B$$

$$b_1 = b_2 = d_1 = d_2 = 1$$
  
 $c_1 = 3$   
 $c_2 = 0$ 

# Kinds of operations: Materializability

$$\mathit{matable}(\mathit{n}) := \bigvee_{\mathit{depset} \in \mathit{depsets}(\mathit{n})} \bigwedge_{\mathit{dep} \in \mathit{depset}} \mathit{mat}(\mathit{dep}) \lor \mathit{matable}(\mathit{dep})$$

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$$\mathit{matable}(\mathit{n}) := \bigvee_{\mathit{depset} \in \mathit{depsets}(\mathit{n})} \bigwedge_{\mathit{dep} \in \mathit{depset}} \mathit{mat}(\mathit{dep}) \lor \mathit{matable}(\mathit{dep})$$

- Recursive normally we would maintain a visited set.
- Incremental evaluation is inhibited.
- Bot  $\wedge$  and  $\vee$  have absorbing elements.

### Kinds of operations: Estimated cost

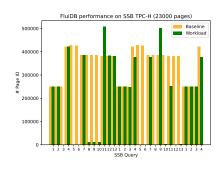
$$\textit{cost}(\textit{n}) := \min_{\textit{depset} \in \textit{depsets}(\textit{n})} \left[ \textit{cost}_\textit{op}(\textit{operator}(\textit{depset})) + \sum_{\textit{dep} \in \textit{depset}} \neg \textit{mat}(\textit{n}) \cdot \textit{cost}(\textit{dep}) \right]$$

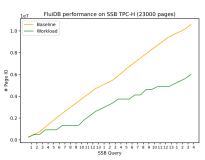
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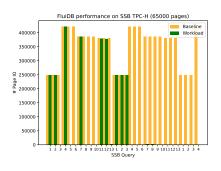
- Recursive Incremental evaluation is inhibited.
- min can be exploited for early stopping

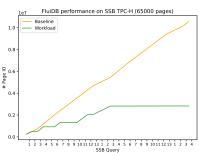
### Evaluation: 23K pages budget





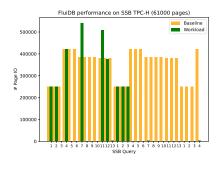
# Evaluation: 65K pages budget

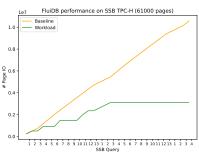




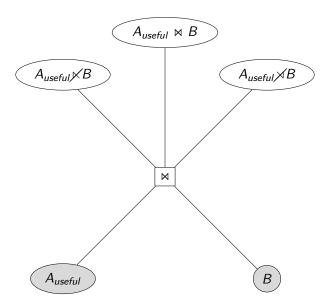
# Evaluation: But ... 61K pages budget

lineorder is deleted at 6 because all join outputs were materialized

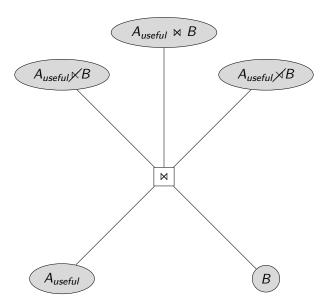




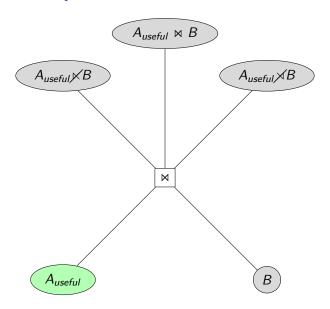
# Plenty of memory



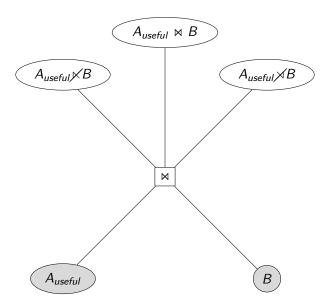
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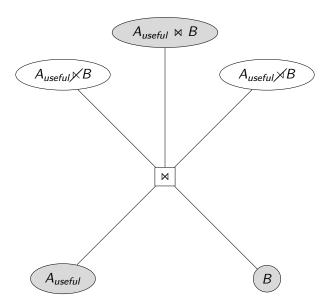
### Plenty of memory



### Being on a budget



# Being on a budget



# Being on a budget

