# COL 362 & COL 632

Pipelining, Optimization 28 Mar 2023

#### **Evaluation of Expressions**

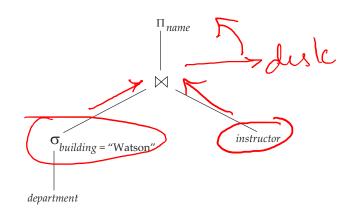
- So far: we have seen algorithms for individual operations
- Alternatives for evaluating an entire expression tree
  - Materialization: generate results of an expression whose inputs are relations or are already computed, materialize (store) it on disk.
    Repeat.
  - Pipelining: pass on tuples to parent operations even as an operation is being executed

#### **Materialization**

- Materialized evaluation: evaluate one operation at a time, starting at the lowest-level. Use intermediate results materialized into temporary relations to evaluate next-level operations.
- E.g., in figure below, compute and store

$$\sigma_{building="Watson"}(department)$$

then compute the store its join with *instructor*, and finally compute the projection on *name*.



#### Materialization (Cont.)

- Materialized evaluation is always applicable
- Cost of writing results to disk and reading them back can be quite high
  - Our cost formulas for operations ignore cost of writing results to disk,
    - Overall cost = Sum of costs of individual operations + cost of writing intermediate results to disk
- Double buffering: use two output buffers for each operation, when one is full write it to disk while the other is getting filled
  - Allows overlap of disk writes with computation and reduces execution time

#### **Pipelining**

- Pipelined evaluation: evaluate several operations simultaneously, passing the results of one operation on to the next.
- E.g., in previous expression tree, don't store result of

$$\sigma_{building = "Watson"}(department)$$

- instead, pass tuples directly to the join. Similarly, don't store result of join, pass tuples directly to projection.
- Much cheaper than materialization: no need to store a temporary relation to disk.
- Pipelining may not always be possible e.g., sort, hash-join.
- For pipelining to be effective, use evaluation algorithms that generate output tuples even as tuples are received for inputs to the operation.
- Pipelines can be executed in two ways: demand driven and producer driven

## Pipelining (Cont.)

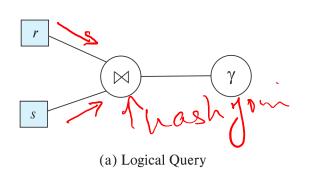
- In demand driven or lazy evaluation
  - system repeatedly requests next tuple from top level operation
  - Each operation requests next tuple from children operations as required, in order to output its next tuple
  - In between calls, operation has to maintain "state" so it knows what to return next
- In producer-driven or eager pipelining
  - Operators produce tuples eagerly and pass them up to their parents
    - Buffer maintained between operators, child puts tuples in buffer, parent removes tuples from buffer
    - if buffer is full, child waits till there is space in the buffer, and then generates more tuples
  - System schedules operations that have space in output buffer and can process more input tuples
- Alternative name: pull and push models of pipelining

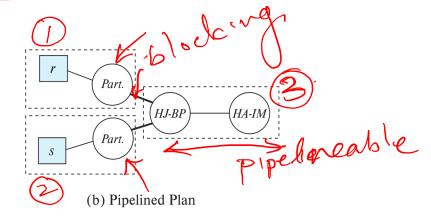
### Pipelining (Cont.)

- Implementation of demand-driven pipelining
  - Each operation is implemented as an iterator implementing the following operations
    - open()
      - E.g., file scan: initialize file scan
        - state: pointer to beginning of file
      - E.g., merge join: sort relations;
        - state: pointers to beginning of sorted relations
    - next()
      - E.g., for file scan: Output next tuple, and advance and store file pointer
      - E.g., for merge join: continue with merge from earlier state till next output tuple is found. Save pointers as iterator state.
    - close()

#### **Blocking Operations**

- Blocking operations: cannot generate any output until all input is consumed
  - E.g., sorting aggregation, ...
- But can often consume inputs from a pipeline, or produce outputs to a pipeline
- Key idea: blocking operations often have two suboperations
  - E.g., for sort: run generation and merge
  - For hash join: partitioning and build-probe
- Treat them as separate operations

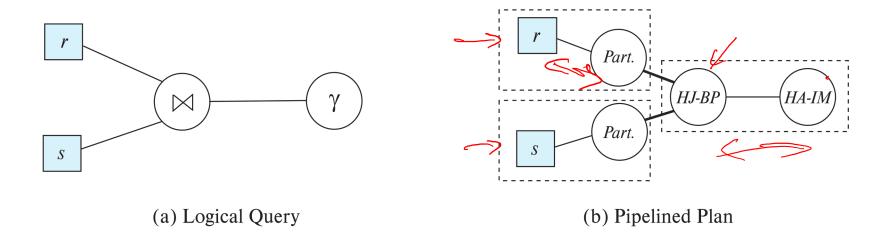




#### **Pipeline Stages**

#### Pipeline stages:

- All operations in a stage run concurrently
- A stage can start only after preceding stages have completed execution



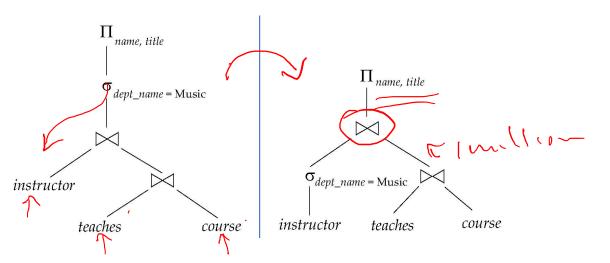
#### **Evaluation Algorithms for Pipelining**

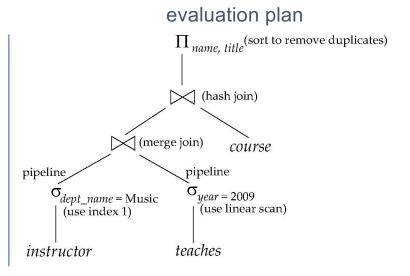
- Some algorithms are not able to output results even as they get input tuples
  - E.g., merge join, or hash join
  - intermediate results written to disk and then read back
- Algorithm variants to generate (at least some) results on the fly, as input tuples are read in
  - E.g., hybrid hash join generates output tuples even as probe relation tuples in the inmemory partition (partition 0) are read in
  - **Double-pipelined join technique**: Hybrid hash join, modified to buffer partition 0 tuples of both relations in-memory, reading them as they become available, and output results of any matches between partition 0 tuples
    - When a new r<sub>0</sub> tuple is found, match it with existing s<sub>0</sub> tuples, output matches, and save it in r<sub>0</sub>
    - Symmetrically for s<sub>0</sub> tuples

# **Query Optimization**

#### Introduction

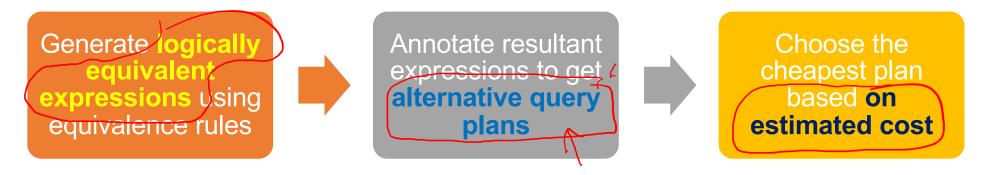
- Alternative ways of evaluating a given query
  - Equivalent expressions
  - Different algorithms for each operation





Cost difference between evaluation plans for a query can be enormous E.g. seconds vs. days in some cases

#### **Cost Based Query Optimization**



- Estimation of plan cost based on
  - Statistical information about relations
  - Statistics estimation for intermediate results
  - Cost formulae for algorithms, computed using statistics