

## Query Execution: Part 9

### Review

#### The Measures:

- **I/O cost:** the number of disk accesses needed for the algorithm. This number *does not include* any disk accesses required to produce/store final output of the algorithm. It does include any disk write operations necessary to store intermediate information on disk.
- **Memory:** the largest number of memory buffers that can be occupied by the data during the execution of the algorithm.
- **Constraint:** the restriction (typically on the sizes of input relations) which guarantees that the algorithm is feasible/applicable.

#### The Parameters:

- $M$ : size of the main memory buffer space.
- $B(R)$ : number of disk blocks used to store relation  $R$  on disk.
- $T(R)$ : number of tuples in relation  $R$ .
- $V(R, A_1, \dots, A_k)$ : number of unique value combinations for attributes  $A_1, \dots, A_k$  of relation  $R$ .

### Selection

| Category                  | Algorithm        | I/O cost                     | Memory | Constraint  | Note   |
|---------------------------|------------------|------------------------------|--------|-------------|--|
| One-pass, tuple-at-a-time | OnePassSelection | $B(R)$                       | $O(1)$ | <b>none</b> |  |
| Index-based               |                  | $B(I) + \frac{B(R)}{V(R,A)}$ | $O(1)$ | <b>none</b> | clustered relation, index on selection attribute   |
|                           |                  | $B(I) + \frac{T(R)}{V(R,A)}$ | $O(1)$ | <b>none</b> | unclustered relation, index on selection attribute |

## Projection

| Category                  | Algorithm         | I/O cost | Memory | Constraint  | Note |
|---------------------------|-------------------|----------|--------|-------------|------|
| One-pass, tuple-at-a-time | OnePassProjection | $B(R)$   | $O(1)$ | <b>none</b> |      |

## Duplicate Elimination

| Category                | Algorithm                   | I/O cost     | Memory | Constraint            | Note |
|-------------------------|-----------------------------|--------------|--------|-----------------------|------|
| One-pass, full-relation | OnePassDuplicateElimination | $B(R)$       | $O(M)$ | $B(\delta(R)) \leq M$ |      |
| two-pass, sort-based    |                             | $3B(R)$      | $O(M)$ | $B(R) \leq M^2$       |      |
| two-pass, hash-based    |                             | $3B(R)$      | $O(M)$ | $B(R) \leq M^2$       |      |
| multipass, sort-based   |                             | $(2k-1)B(R)$ | $O(M)$ | $B(R) \leq M^k$       |      |
| multipass, hash-based   |                             | $(2k-1)B(R)$ | $O(M)$ | $B(R) \leq M^k$       |      |

## Grouping and Aggregation

| Category                | Algorithm       | I/O cost     | Memory | Constraint              | Note |
|-------------------------|-----------------|--------------|--------|-------------------------|------|
| One-pass, full-relation | OnePassGrouping | $B(R)$       | $O(M)$ | $B(\gamma_L(R)) \leq M$ |      |
| two-pass, sort-based    |                 | $3B(R)$      | $O(M)$ | $B(R) \leq M^2$         |      |
| two-pass, hash-based    |                 | $3B(R)$      | $O(M)$ | $B(R) \leq M^2$         |      |
| multipass, sort-based   |                 | $(2k-1)B(R)$ | $O(M)$ | $B(R) \leq M^k$         |      |
| multipass, hash-based   |                 | $(2k-1)B(R)$ | $O(M)$ | $B(R) \leq M^k$         |      |

## Bag Union

| Category                | Algorithm       | I/O cost      | Memory | Constraint  | Note |
|-------------------------|-----------------|---------------|--------|-------------|------|
| One-pass, full-relation | OnePassBagUnion | $B(R) + B(S)$ | $O(1)$ | <b>none</b> |      |

## Set Union

| Category                | Algorithm       | I/O cost              | Memory | Constraint                  | Note |
|-------------------------|-----------------|-----------------------|--------|-----------------------------|------|
| One-pass, full-relation | OnePassSetUnion | $B(R) + B(S)$         | $O(M)$ | $B(S) \leq M$               |      |
| two-pass, sort-based    |                 | $3(B(R) + B(S))$      | $O(M)$ | $B(S) + B(R) \leq M^2$      |      |
| two-pass, hash-based    |                 | $3(B(R) + B(S))$      | $O(M)$ | $\min(B(S), B(R)) \leq M^2$ |      |
| multipass, sort-based   |                 | $(2k-1)(B(R) + B(S))$ | $O(M)$ | $B(R) + B(S) \leq M^k$      |      |
| multipass, hash-based   |                 | $(2k-1)(B(R) + B(S))$ | $O(M)$ | $\min(B(R), B(S)) \leq M^k$ |      |

## Bag Intersection

| Category                | Algorithm       | I/O cost              | Memory | Constraint                  | Note |
|-------------------------|-----------------|-----------------------|--------|-----------------------------|------|
| One-pass, full-relation | BagIntersection | $B(R) + B(S)$         | $O(M)$ | $B(S) \leq M$               |      |
| two-pass, sort-based    |                 | $3(B(R) + B(S))$      | $O(M)$ | $B(S) + B(R) \leq M^2$      |      |
| two-pass, hash-based    |                 | $3(B(R) + B(S))$      | $O(M)$ | $\min(B(S), B(R)) \leq M^2$ |      |
| multipass, sort-based   |                 | $(2k-1)(B(R) + B(S))$ | $O(M)$ | $B(R) + B(S) \leq M^k$      |      |
| multipass, hash-based   |                 | $(2k-1)(B(R) + B(S))$ | $O(M)$ | $\min(B(R), B(S)) \leq M^k$ |      |

## Set Intersection

| Category                | Algorithm       | I/O cost                | Memory | Constraint                  | Note |
|-------------------------|-----------------|-------------------------|--------|-----------------------------|------|
| One-pass, full-relation | SetIntersection | $B(R) + B(S)$           | $O(M)$ | $B(S) \leq M$               |      |
| two-pass, sort-based    |                 | $3(B(R) + B(S))$        | $O(M)$ | $B(S) + B(R) \leq M^2$      |      |
| two-pass, hash-based    |                 | $3(B(R) + B(S))$        | $O(M)$ | $\min(B(S), B(R)) \leq M^2$ |      |
| multipass, sort-based   |                 | $(2k - 1)(B(R) + B(S))$ | $O(M)$ | $B(R) + B(S) \leq M^k$      |      |
| multipass, hash-based   |                 | $(2k - 1)(B(R) + B(S))$ | $O(M)$ | $\min(B(R), B(S)) \leq M^k$ |      |

## Bag Difference

| Category                | Algorithm     | I/O cost                | Memory | Constraint                  | Note |
|-------------------------|---------------|-------------------------|--------|-----------------------------|------|
| One-pass, full-relation | BagDifference | $B(R) + B(S)$           | $O(M)$ | $B(S) \leq M$               |      |
| two-pass, sort-based    |               | $3(B(R) + B(S))$        | $O(M)$ | $B(S) + B(R) \leq M^2$      |      |
| two-pass, hash-based    |               | $3(B(R) + B(S))$        | $O(M)$ | $\min(B(S), B(R)) \leq M^2$ |      |
| multipass, sort-based   |               | $(2k - 1)(B(R) + B(S))$ | $O(M)$ | $B(R) + B(S) \leq M^k$      |      |
| multipass, hash-based   |               | $(2k - 1)(B(R) + B(S))$ | $O(M)$ | $\min(B(R), B(S)) \leq M^k$ |      |

## Set Difference

| Category                | Algorithm     | I/O cost                | Memory | Constraint                  | Note |
|-------------------------|---------------|-------------------------|--------|-----------------------------|------|
| One-pass, full-relation | SetDifference | $B(R) + B(S)$           | $O(M)$ | $B(S) \leq M$               |      |
| two-pass, sort-based    |               | $3(B(R) + B(S))$        | $O(M)$ | $B(S) + B(R) \leq M^2$      |      |
| two-pass, hash-based    |               | $3(B(R) + B(S))$        | $O(M)$ | $\min(B(S), B(R)) \leq M^2$ |      |
| multipass, sort-based   |               | $(2k - 1)(B(R) + B(S))$ | $O(M)$ | $B(R) + B(S) \leq M^k$      |      |
| multipass, hash-based   |               | $(2k - 1)(B(R) + B(S))$ | $O(M)$ | $\min(B(R), B(S)) \leq M^k$ |      |

## Product

| Category                | Algorithm         | I/O cost                    | Memory | Constraint    | Note |
|-------------------------|-------------------|-----------------------------|--------|---------------|------|
| One-pass, full-relation | OnePassBagProduct | $B(R) + B(S)$               | $O(1)$ | $B(S) \leq M$ |      |
| Nested loop             |                   | $\frac{B(R) \cdot B(S)}{M}$ | $M$    | <b>none</b>   |      |

## Join

| Category                | Algorithm                         | I/O cost   | Memory        | Constraint                  | Note               |
|-------------------------|-----------------------------------|--|---------------|-----------------------------|--------------------|
| One-pass, full-relation | OnePassJoin<br>NaiveOnePassJoin   | $B(R) + B(S)$  | $O(M)$        | $B(S) \leq M$               |                    |
| Nested loop             | TupleJoin<br>BlockNestedLoopsJoin | $T(R) \cdot T(S)$<br>$O\left(\frac{B(R) \cdot B(S)}{M}\right)$ | $O(1)$<br>$M$ | <b>none</b><br><b>none</b>  |                    |
| two-pass, sort-based    |                                   | $3(B(R) + B(S))$   | $O(M)$        | $B(S) + B(R) \leq M^2$      |                    |
| two-pass, hash-based    |                                   | $3(B(R) + B(S))$   | $O(M)$        | $\min(B(S), B(R)) \leq M^2$ |                    |
| multipass, sort-based   |                                   | $(2k - 1)(B(R) + B(S))$  | $O(M)$        | $B(R) + B(S) \leq M^k$      |                    |
| multipass, hash-based   |                                   | $(2k - 1)(B(R) + B(S))$  | $O(M)$        | $\min(B(R), B(S)) \leq M^k$ |                    |
| index-based             | zigzagJoin                        | $O\left(\frac{T(R) \cdot T(S)}{V(S, Y)}\right)$                | $M$           | index                       | <b>unclustered</b> |
|                         |                                   | $O\left(\frac{B(R) \cdot B(S)}{V(S, Y)}\right)$                | $M$           | index                       | <b>clustered</b>   |