# Database Management Systems

Lecture 7

**Evaluating Relational Operators** 

**Query Optimization** 

- queries
  - relational operators building blocks
    - selection ( $\sigma$ )
      - selects a subset of records from a relation
    - projection  $(\pi)$ 
      - eliminates certain columns from a relation
    - join (⊗)
      - combines two relations
    - cross-product (×)
      - returns every record in R1 concatenated with every record in R2
    - set-difference (-)
      - returns records that belong to R1 and don't belong to R2
    - union (U)
      - returns all records in relations R1 and R2

- queries
  - relational operators building blocks
    - intersection (∩)
      - returns records that belong to both R1 and R2
    - grouping and aggregate operators
- every operation returns a relation
- => operations can be composed

- optimizer
  - presented with a query written in SQL
  - takes into account the manner in which data is stored
    - information available in the system catalog
  - produces an efficient execution plan for evaluating the query
    - algorithm selection for each operator
      - factors:
        - sizes of:
          - relations
          - available buffer pool
        - the existence of:
          - indexes
          - sort orders
        - buffer replacement policy
    - application order for operators

- techniques to develop algorithms for operators
  - iteration
    - examine iteratively:
      - all tuples in input relations
      - data entries in an index (provided they contain all the necessary fields)
        - smaller than data records
  - indexing
    - selection condition, join condition
    - use an index to examine only the tuples that satisfy the condition
  - partitioning
    - partition the tuples
    - decompose operation into collection of less expensive operations on partitions

- techniques to develop algorithms for operators
  - partitioning
    - partitioning techniques
      - sorting
      - hashing

- access path
  - way of retrieving tuples from a relation
    - file scan
    - index *I* + matching selection condition *C*
  - C matches I if I can be used to retrieve just the tuples satisfying C
  - example:
    - condition C: attr op value, op ∈ {<, <=, =, <>, >=, >}
    - C matches / if:
    - the search key of *I* is *attr* and:
      - *I* is a tree index or
      - I is a hash index and op is =
  - relation R has an index I that matches selection C
  - => at least 2 access paths

- access path
  - selectivity of an access path
    - number of retrieved pages when using the access path to obtain desired tuples
    - both data and index pages are counted
  - most selective access path
    - retrieves the fewest pages
    - minimizes data retrieval costs

- general selection conditions
  - boolean combination (i.e., expression using  $\Lambda$ , V) of terms of the form:
    - attr op constant
    - attr1 op attr2

```
SELECT *
FROM Exams
WHERE SID = 7 AND EDate = '04-01-2019'
\sigma_{SID=7\;\Lambda\;EDate='04-01-2019'}(Exams)
```

- general selection conditions
  - CNF conjunctive normal form
    - standard form for general selection conditions
    - condition in CNF:
      - collection of conjuncts connected with the ∧ operator
    - a conjunct has one or more terms connected with the V operator
    - term:
      - attr op constant
      - attr1 op attr2
  - example:

```
(EDate < '4-1-2019' \land Grade = 10 ) \lor CID = 5 \lor SID = 3 rewritten as
```

(EDate  $< '4-1-2019' \lor CID = 5 \lor SID = 3) \land (Grade = 10 \lor CID = 5 \lor SID = 3)$ 

- general selection conditions matching an index
  - index I with search key <a, b, c>
  - examples

| Condition                              | B+ tree index | Hash index   |
|--|---------------|--------------|
| a = 10 AND b = 5 AND c = 2             | Yes           | Yes          |
| a = 10 AND b = 5                       | Yes           | No           |
| b = 5                                  | No            | No           |
| b = 5 AND c = 2                        | No            | No           |
| d = 2                                  | No            | No           |
| a = 20 AND b = 10 AND c = 5 AND d > 11 | Yes (partly)  | Yes (partly) |

- general selection conditions matching an index
  - index I1 with search key <a, b>
  - B+ tree index I2 with search key <c>

| Condition                   | Indexes  |
|-----------------------------|--|
| c < 100 AND a = 3 AND b = 5 | <ul> <li>use I1 or I2 to retrieve tuples</li> <li>check terms in the selection condition that do not match the index for each retrieved tuple</li> </ul> |

- general selection conditions matching an index
  - index *I*, general selection condition *C* (CNF)
  - - hash index
  - - $\bigwedge_{i=1}^n T_i$
    - term  $T_i$ : attr = value
  - I matches C if C contains exactly one term for each attribute in the search key of I

- general selection conditions matching an index
  - index I, general selection condition C (CNF)
  - - tree index
  - - $\bigwedge_{i=1}^n T_i$
    - term  $T_i$ : attr op value
  - I matches C if C contains exactly one term for each attribute in a prefix of the search key of I
  - examples of prefixes for search key <a, b, c>: <a>, <a, b>

- running example schema
  - Students (SID: integer, SName: string, Age: integer)
  - Courses (CID: integer, CName: string, Description: string)
  - Exams (SID: integer, CID: integer, EDate: date, Grade: integer, FacultyMember: string)
  - Students
    - every record has 50 bytes
    - there are 80 records / page
    - 500 pages
  - Courses
    - every record has 50 bytes
    - there are 80 records / page
    - 100 pages

- running example schema
  - Students (SID: integer, SName: string, Age: integer)
  - Courses (CID: integer, CName: string, Description: string)
  - Exams (SID: integer, CID: integer, EDate: date, Grade: integer, FacultyMember: string)
  - Exams
    - every record has 40 bytes
    - there are 100 records / page
    - 1000 pages

- joins
- SELECT \*
- FROM Exams E, Students S
- WHERE E.SID = S.SID
- algebra: E ⊗ S
  - to be carefully optimized
  - size of E × S is large, so computing E × S followed by selection is inefficient
- E
  - M pages
  - p<sub>F</sub> records / page
- S
  - N pages
  - p<sub>s</sub> records / page
- evaluation: number of I/O operations

- joins implementation techniques
  - iteration
    - Simple/Page-Oriented Nested Loops Join
    - Block Nested Loops Join
  - indexing
    - Index Nested Loops Join
  - partitioning
    - Sort-Merge Join
    - Hash Join
- equality join, one join column
  - join condition:  $E_i = S_i$

## Simple Nested Loops Join

```
foreach tuple e \in E do
foreach tuple s \in S do
if e_i == s_j then add <e, s> to the result
```

- for each record in the outer relation E, scan the entire inner relation S
- cost
  - $M + p_E^* M * N = 1000 + 100*1000*500 I/Os = 1000 + (5 * 10^7) I/Os$

```
* E - M pages, p<sub>E</sub> records / page * * 1000 pages * * 100 records / page*

* S - N pages, p<sub>S</sub> records / page * * 500 pages * * 80 records / page *
```

## Page-Oriented Nested Loops Join

```
foreach page pe \in E do foreach page ps \in S do if e_i == s_i then add <e, s> to the result
```

- for each page in E read each page in S
- pairs of records <e, s> that meet the join condition are added to the result (where record e is on page pe, and record s – on page ps)
- refinement of Simple Nested Loops Join

## Page-Oriented Nested Loops Join

```
foreach page pe E E do
     foreach page ps E S do
          if e_i == s_i then add \langle e_i, s \rangle to the result
```

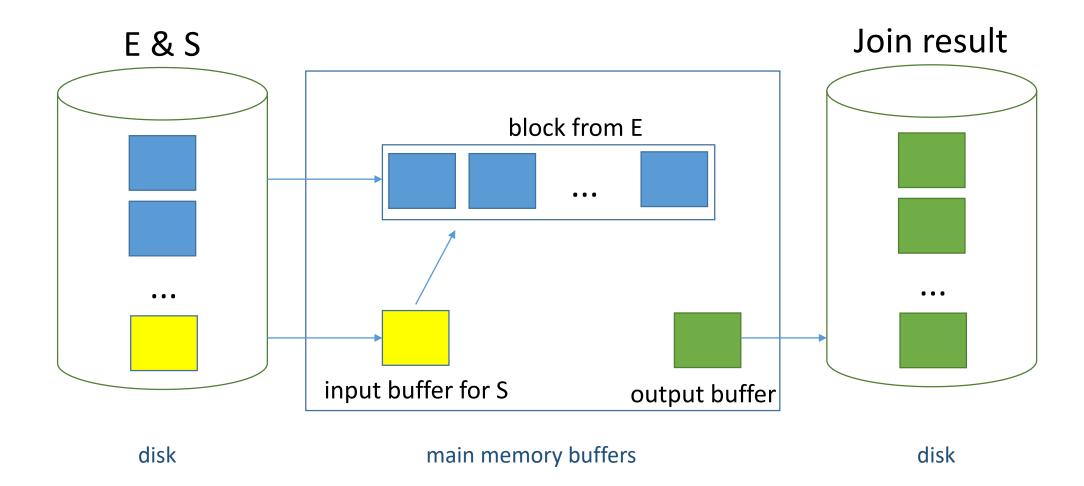
- cost
  - M + M\*N = 1000 + 1000\*500 I/Os = 501.000 I/Os
    - significantly lower than the cost of Simple Nested Loops Join
    - improvement factor of p<sub>F</sub>
  - choose smaller table (S) as outer table

```
=> cost = 500 + 500 * 1000 I/Os = 500.500 I/Os
```

- \* E M pages, p<sub>F</sub> records / page \* \* 1000 pages \* \* 100 records / page\*
- \* 500 pages \* \* 80 records / page \* \* S - N pages, p<sub>s</sub> records / page \*

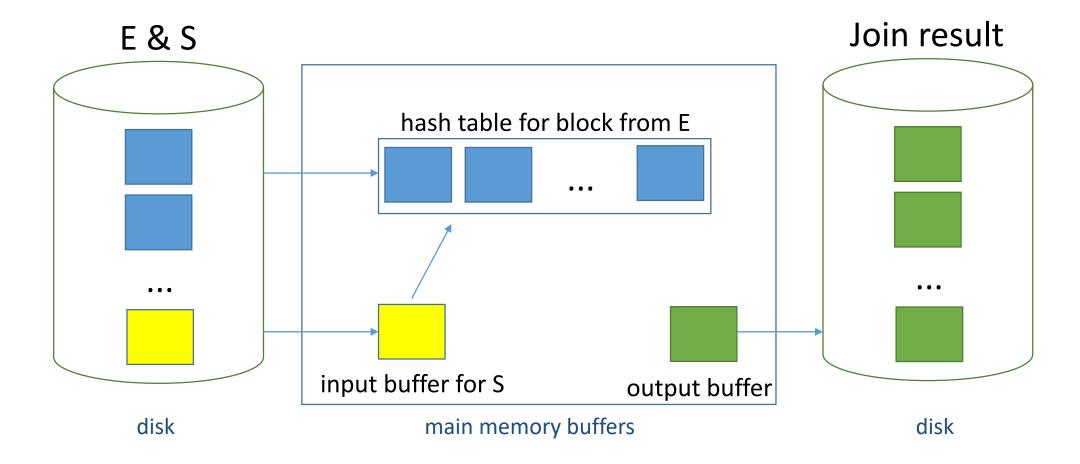
- Simple Nested Loops Join buffer pages are not used effectively
- improvement
  - store smaller relation R1 in memory
  - keep at least 2 extra buffer pages B1 and B2
  - use B1 to read larger relation R2
  - use B2 as output buffer
  - for each tuple in R2, search R1 for matching tuples
  - => optimal cost: num. pages in R1 + num. pages in R2
  - refinement
    - build in-memory hash table for the smaller relation
    - I/O cost unchanged, but CPU cost is usually much lower

- use one buffer page to scan inner table S
- use one page for the result
- use all remaining pages to read a block from outer table E



```
foreach block be \in E do
   foreach page ps ∈ S do
         for all pairs of tuples <e, s> that meet the join
            condition, where e \in be and s \in ps,
                  add <e, s> to the result
                                                        Join result
         E & S
                                  block from E
                      input buffer for S
                                          output buffer
           disk
                              main memory buffers
                                                              disk
```

- refinement to efficiently find matching tuples
  - main-memory hash table for the block of E
  - trade-off: reduce size of E block



- cost
  - scan of outer table + # outer blocks \* scan of inner table

  - outer table: Exams (E), block of 100 pages
    - scan cost for E: 1000 I/Os
    - number of blocks:  $\left[\frac{1000}{100}\right] = 10$
    - foreach block in E, scan Students (S): 10\*500 I/Os
  - => total cost = 1000 + 10 \* 500 = **6000 I/Os**

- \* E M pages, p<sub>F</sub> records / page \*
- \* S N pages, p<sub>S</sub> records / page \*
- \* 1000 pages \* \* 100 records / page\*
- \* 500 pages \* \* 80 records / page \*

- cost
  - scan of outer table + # outer blocks \* scan of inner table

  - outer table: Exams (E)
    - buffer has 90 pages available for E, i.e., block of 90 pages
    - => number of blocks:  $\left[\frac{1000}{90}\right] = 12$
    - => S is scanned 12 times
    - scan cost for E: 1000 I/Os
    - foreach block in E, scan Students (S): 12\*500 I/Os
  - => total cost = 1000 + 12 \* 500 = **7000 I/Os**
- \* E M pages, p<sub>F</sub> records / page \* \* 1000 pages \* \* 100 records / page\*

- cost
  - scan of outer table + # outer blocks \* scan of inner table

  - outer table: Students (S), block of 100 pages
    - scan cost for S: 500 I/Os
    - number of blocks:  $\left[\frac{500}{100}\right] = 5$
    - for each block in S, scan E: 5 \* 1000 I/Os
  - => total cost = 500 + 5 \* 1000 = **5050 I/Os**

#### **Index Nested Loops Join**

```
foreach tuple e in E do foreach tuple s in S where e_i == s_j add \langle e_i, s \rangle to the result
```

- if there is an index on the join column of S, S can be considered as inner table and the index can be used
- cost
  - M + ( (M\*p<sub>F</sub>) \* cost of finding corresponding records in S)

```
* E - M pages, p<sub>E</sub> records / page * * 1000 pages * * 100 records / page*

* S - N pages, p<sub>S</sub> records / page * * 500 pages * * 80 records / page *
```

#### **Index Nested Loops Join**

- for a record e in E:
  - cost of examining the index on S:
    - approx. 1.2 for a hash index (typical cost for hash indexes)
    - 2-4 for a B+-tree index
  - cost of reading corresponding records in S:
    - clustered index
      - plus one I/O for each outer tuple in E (typically)
    - nonclustered index
      - up to one I/O for each corresponding record in S
         (worst case n matching records in S located on n different pages!)

#### Index Nested Loops Join

- hash index on SID in Students
- scan Exams
  - 1000 I/Os, 100\*1000 records
- for each record in Exams
  - (on average) 1.2 I/Os to obtain the page in the index and
  - 1 I/O to retrieve the page in Students that contains the matching tuple (exactly one!)
- => cost to retrieve matching Students tuples: 1000 \* 100 \* (1.2 + 1) = 220.000
- total cost: 1000 + 220.000 = 221.000 I/Os
- \* E M pages, p<sub>F</sub> records / page \* \* 1000 pages \* \* 100 records / page\*

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