

CS186 Discussion 3

(Join Algorithms)

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Join Algorithms

Cost Notation

- $[R]$ = number of pages in Table R
- p_R = number of records per page of R
- $|R|$ = number of records in R

$$|R| = p_R * [R]$$

Simple Nested Loop Join

for record r in R :

for record s in S :

if $\theta(r, s)$:

add $\text{join}(r, s)$ to result

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Page Nested Loop Join

for page p_r in R :

for page p_s in S :

for record r in p_r :

for record s in p_s :

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Chunk Nested Loop Join

for chunk c_r in R :

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for record r in c_r :

for record s in p_s :

if $\theta(r, s)$:

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$[R]$ = number of pages in Table R

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$$[R] + [R] / (B - 2) * [S]$$

$B-2$ pages in each chunk

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Sort Merge Join

1. External Sort R
2. External Sort S
3. Merge R and S

$[R]$ = number of pages in Table R

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$$\begin{aligned} & 4 * ([R] + [S]) + [R] + [S] \\ & = 5 * ([R] + [S]) \end{aligned}$$

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(pass 0 only)

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3. Build Hash Table for R
4. Stream and Probe S

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Worksheet #1

Join Algorithms Exercises

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Chunk Nested Loop Join:

- Cartesian Product
- Non-equality Predicate

Sort Merge Join:

- Sorting
- Skewed Data
- Limited Memory

Hash Join:

- Hashing
- Uneven Relations
- Hybrid Hashing

Join Algorithms

Worksheet #2

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Join Algorithms Exercises

2. We have 15 pages of memory, and we want to join two tables [R] and [S] where [R] is 100 pages and [S] is 50 pages. [R] holds 100 tuples per page and [S] holds 50 tuples per page.

How many disk reads are needed to perform a Simple Nested Loops join?

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How many disk reads are needed to perform a Simple Nested Loops join?

Using S as the outer relation yields the lowest I/O count.

$$p_S * [R] * [S] + [S] = 50 * 100 * 50 + 50 = 250050 \text{ I/O's}$$

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How about a Sort Merge Join? (Utilize the optimized version)

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$$3([R] + [S]) = 3 \cdot 150 = 450 \text{ I/O's}$$

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How about a Hash Join? (Assume no recursive partitioning and ignore output costs)

Partitioning Phase: $2([R] + [S])$

Matching Phase: $[R] + [S]$

Total = $3([R] + [S]) = 3 * 150 = 450$ I/O's