

# CSE 562

## Database Systems

### Query Processing: Physical Plan Enumeration & Selection

Some slides are based or modified from originals by  
*Database Systems: The Complete Book,*  
Pearson Prentice Hall 2nd Edition  
©2008 Garcia-Molina, Ullman, and Widom

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## Generate & Compare Plans

Given a logical plan:

1. Enumerate physical alternatives (straightforward)
2. Estimate costs
3. Pick best one



**Problem:** takes too long!

Observation:

plans share pieces ("sub-plans")...

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## Outline – Query Optimization

- Overview
- Relational algebra level
  - Algebraic Transformations
- **Detailed query plan level**
  - Estimate Costs
    - Estimating size of results
    - Estimating # of IOs
  - **Generate and compare plans**

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## Generate & Compare Plans: Improved

### Combine Enumeration and Selection

1. Enumerate small sub-plans & estimate costs
2. Prune (remove) "sub-optimal" alternatives
3. Enumerate ways to assemble sub-plans into larger sub-plans & estimate costs
4. Prune again (keep only "optimal" sub-plans)

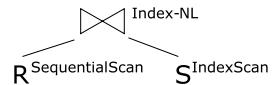
... Keep building larger "optimal" sub-plans  
... Eventually generate "optimal" overall plan

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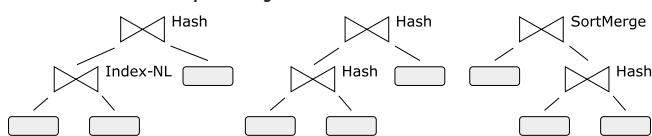
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## Dynamic Programming Approach

- Level 1 sub-plan: join of 2 relations (plus access methods)



- Level 2 sub-plan: join of 3 relations



...

- Level n sub-plan: join of n+1 relations

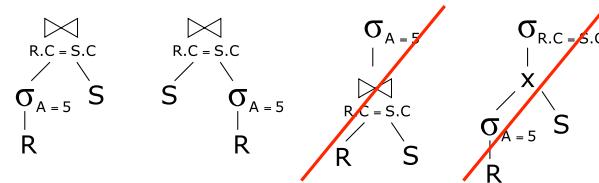
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## Generate Logical Sub-Plans

- Only generate logical sub-plans that conform to heuristic rules

### Example:



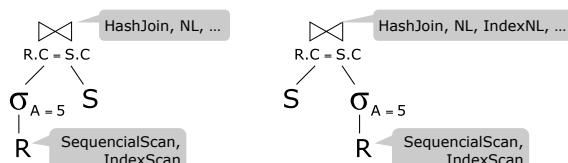
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## Generate Physical Sub-Plans

- For each heuristically-chosen logical sub-plan, try all combinations of physical alternatives

### Example:



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## Pruning

- Estimate cost of each physical sub-plan
- For each sub-plan with identical input and output, keep only:
  - Optimal plan overall
  - Optimal plan for each "interesting order"
    - Ordered on some field
- Discard the rest

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## Example

```
SELECT      *
FROM        R, S, T
WHERE       R.A = S.A AND S.B = T.B
```

- $T(R) = 30,000 \quad B(R) = 300$
- $T(S) = 100,000 \quad B(S) = 1000$
- $T(T) = 20,000 \quad B(T) = 200$
- $V(S,B) = 25,000$
- $V(T,B) = 10,000$

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## Example (cont.)

```
SELECT      *
FROM        R, S, T
WHERE       R.A = S.A AND S.B = T.B
```

- Memory Size:  $M = 102$
- Index on  $R.A$  (all non-leaves fit in memory)
- $S.A$  foreign key onto  $R.A$

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## Example (cont.)

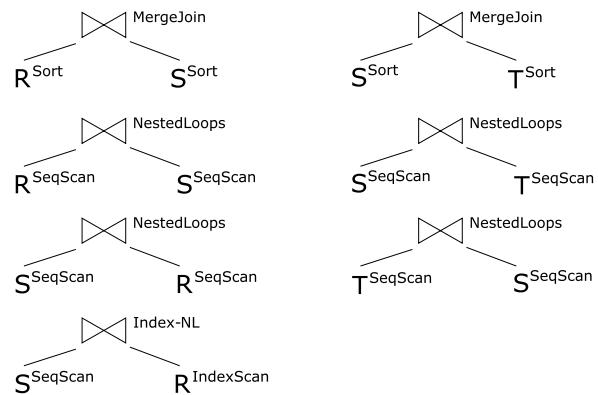
### For simplicity:

- Assume: join tuple size is sum of sizes of component tuples
- Assume: always write out intermediate results
- Consider the following strategies:
  - Nested-loops
  - Index nested loops
  - Sort-Merge join

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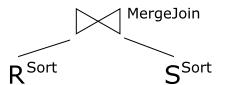
## Level-1 Sub-Plans (No X-Products)



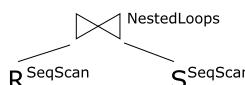
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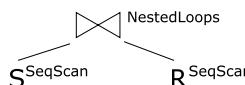
## Cost of Level-1 Sub-Plans



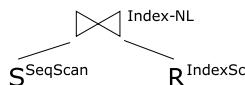
$$\text{Cost} = 3 \cdot (B(R) + B(S)) = 3900$$



$$\text{Cost} = B(R) + \left\lceil \frac{B(R)}{M-2} \right\rceil \cdot B(S) = 3300$$



$$\text{Cost} = B(S) + \left\lceil \frac{B(S)}{M-2} \right\rceil \cdot B(R) = 4000$$

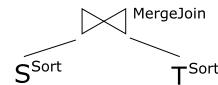


$$\text{Cost} = B(S) + T(S) + T(S) = 201000$$

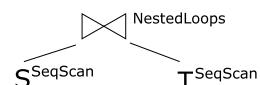
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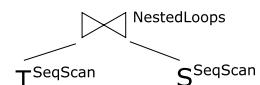
## Cost of Level-1 Sub-Plans (cont.)



$$\text{Cost} = 3 \cdot (B(S) + B(T)) = 3600$$



$$\text{Cost} = B(S) + \left\lceil \frac{B(S)}{M-2} \right\rceil \cdot B(T) = 3000$$

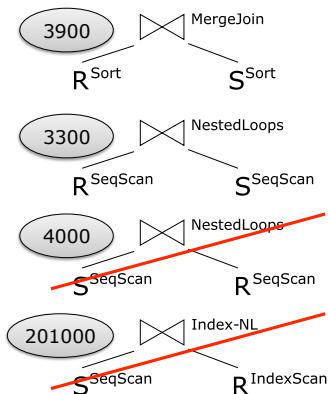


$$\text{Cost} = B(T) + \left\lceil \frac{B(T)}{M-2} \right\rceil \cdot B(S) = 2200$$

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## Pruning Level-1 Sub-Plans



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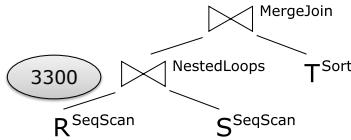
## Level-2 Sub-Plans

- What is the size of  $R \bowtie S$ ?
- Recall: S.A foreign key onto R.A
- $T(R \bowtie S) = T(S) = 100,000$
- $B(R \bowtie S) = 2 \times B(S) = 2,000$

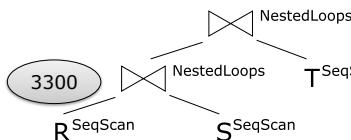
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## Cost of Level-2 Sub-Plans



$$\begin{aligned} \text{Cost} &= 3300 + B(R \bowtie S) \\ &\quad + 3 \cdot (B(R \bowtie S) + B(T)) \\ &= 11900 \end{aligned}$$



$$\begin{aligned} \text{Cost} &= 3300 + B(R \bowtie S) \\ &\quad + B(R \bowtie S) + \left\lceil \frac{B(R \bowtie S)}{M-2} \right\rceil \cdot B(T) \\ &= 11300 \end{aligned}$$

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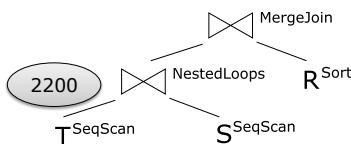
## Level-2 Sub-Plans

- What is the size of  $S \bowtie T$ ?
- $T(S \bowtie T) = \frac{T(S)T(T)}{\max\{V(S,B), V(T,B)\}} = 80,000$
- $B(S \bowtie T) = 80,000/50 = 1,600$

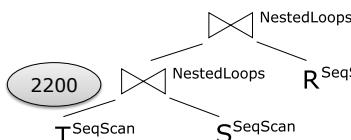
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## Cost of Level-2 Sub-Plans



$$\begin{aligned} \text{Cost} &= 2200 + B(S \bowtie T) \\ &\quad + 3 \cdot (B(S \bowtie T) + B(R)) \\ &= 9500 \end{aligned}$$

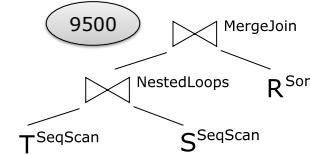


$$\begin{aligned} \text{Cost} &= 2200 + B(S \bowtie T) \\ &\quad + B(S \bowtie T) + \left\lceil \frac{B(S \bowtie T)}{M-2} \right\rceil \cdot B(R) \\ &= 10200 \end{aligned}$$

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## Winner



- Selected plan: Cost = 9500
- Worst plan: Cost > 201000
- Benefit from optimizer: 20x speedup!

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