Query Optimization Exercise Session 5

Bernhard Radke

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Example: Bushy with cross product



DPsub

- Iterate over subsets in the integer order
- Before a join tree for S is generated, all the relevant subsets of S must be available

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DPsub

DPsub(R)**Input:** a set of relations $R = \{R_1, \ldots, R_n\}$ to be joined Output: an optimal bushy join tree B = an empty DP table $2^R \rightarrow$ join tree for each $R_i \in R$ $B[\{R_i\}] = R_i$ for each $1 < i < 2^n - 1$ ascending { $S = \{R_i \in R | (|i/2^{j-1}| \mod 2) = 1\}$ for each $S_1 \subset S$, $S_2 = S \setminus S_1$ { if \neg cross products $\land \neg S_1$ connected to S_2 continue $p_1 = B[S_1], p_2 = B[S_2]$ if $p_1 = \epsilon \lor p_2 = \epsilon$ continue $P = \text{CreateJoinTree}(p_1, p_2);$ if $B[S] = \epsilon \lor C(B[S]) > C(P) B[S] = P$ return $B[\{R_1,\ldots,R_n\}]$

Implementation: DPsize

- dbTable the vector of lists of Problems, each Problem is either a relation or a join of Problems
- lookup (hashtable) mapping the set of the relations to the best solution and its cost

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- initialize dpTable[0] with the list of R1, ..., Rn
- set the size of dpTable to n

Implementation: DPsize

```
for (i = 1; i < dpTable.size(); i++)
for (j=0; j < i; j++)
for (leftRel in dpTable[j])
for (rightRel in dpTable[i-j-1])
can we join leftRel and rightRel?
check lookup for solution and cost
if the current is cheaper:
    dpTable[i].add(leftRel join rightRel)
    update lookup</pre>
```

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DPccp

- Enumerate over all connected subgraphs
- For each subgraph enumerate all other connected subgraphs that are disjoint but connected to it

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- Nodes in the query graph are ordered according to a BFS
- Start with the last node, all the nodes with smaller ID are forbidden
- ► At every step: compute neighborhood, get forbidden nodes, enumerate subsets of non-forbidden nodes *N*

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Recursive calls for subsets of N

```
EnumerateCsg(G)
for all i \in [n - 1, ..., 0] descending {
emit \{v_i\};
EnumerateCsgRec(G, \{v_i\}, B_i);
}
```

```
EnumerateCsgRec(G, S, X)

N = \mathcal{N}(S) \setminus X;

for all S' \subseteq N, S' \neq \emptyset, enumerate subsets first {

emit (S \cup S');

}

for all S' \subseteq N, S' \neq \emptyset, enumerate subsets first {

EnumerateCsgRec(G, (S \cup S'), (X \cup N));

}
```



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Enumerating Complementary Subgraphs

```
EnumerateCmp(G, S_1)

X = \mathcal{B}_{\min(S_1)} \cup S_1;

N = \mathcal{N}(S_1) \setminus X;

for all (v_i \in N \text{ by descending } i) \{

emit \{v_i\};

EnumerateCsgRec(G, \{v_i\}, X \cup (\mathcal{B}_i \cap N));

\}
```

- EnumerateCsg+EnumerateCmp produce all ccp
- resulting algorithm DPccp considers exactly #ccp pairs
- which is the lower bound for all DP enumeration algorithms

Sometimes the graph is too big, let's simplify it.

- GOO: choose the joins greedily (very hard, depends on all other joins)
- Simplification: choose the joins that must be avoided (we can start with 'obvious' decisions)

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Graph simplification: Example



- $benefit(X \bowtie R_1, X \bowtie R_2) = \frac{C((X \bowtie R_1) \bowtie R_2)}{C((X \bowtie R_2) \bowtie R_1)}$
- $\triangleright R_3 \bowtie R_2 \text{ before } R_3 \bowtie R_4.$ Remove $R_4 - R_3$
- $R_4 \bowtie (R_2 \bowtie R_3) \text{ before} \\ R_4 \bowtie R_1. \text{ Remove } R_1 R_4$

no more choices

 $|R_1 \bowtie R_4| = 5000, |R_1 \bowtie R_2| = 500, |R_2 \bowtie R_3| = 50, |R_3 \bowtie R_4| = 1000$

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More insights

- Guido Moerkotte, Thomas Neumann. Analysis of Two Existing and One New Dynamic Programming Algorithm. In VLDB'06
- Guido Moerkotte, Thomas Neumann. Dynamic Programming Strikes Back. In SIGMOD'08

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 Thomas Neumann. Query Simplification: Graceful Degradation for Join-Order Optimization. In SIGMOD'09 Create the DP table (manually) for the relations *A*, *B*, *C* with cardinalities |A| = 10, |B| = 20, |C| = 100 and selectivities $f_{AB} = 0.5$, $f_{BC} = 0.1$ (cost function C_{out}). Mark the final table entries. Enumerate subsets in the integer order. Consider cross products.

Homework: Task 2 & 3 (20 points)

- ▶ Using the program from the last exercise as basis, implement Greedy Operator Ordering. Print the partial steps together with their costs (e.g., $P = R_1 \bowtie R_2 200, Q = P \bowtie R_3 400$), as well as the final join tree.
- Load the TPC H data set. (You can use our snapshot of the data set, the loadtpch-* script loads the data). Then, execute the following SQL query using the program implemented above:

```
select *
```

```
from lineitem l, orders o, customers c
where l.l_orderkey=o.o_orderkey
and o.o_custkey=c.c_custkey
and c.c_name='Customer#000014993'.
```

Exercises due: 9 AM, December 12, 2016

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