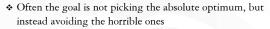
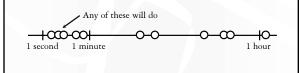
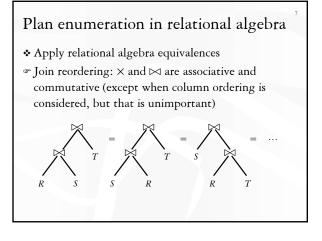


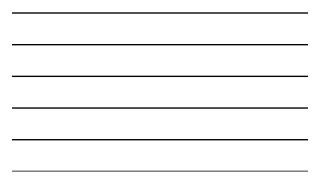
#### ✤ Conceptually

- Consider a space of possible plans (next)
- Estimate costs of plans in the search space (next Tuesday)
- Search through the space for the "best" plan (next Thursday)



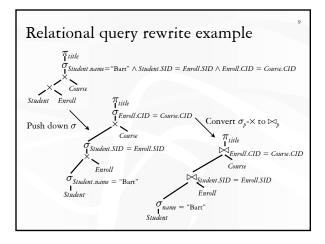






## More relational algebra equivalences

- Convert  $\sigma_p$ -× to/from  $\bowtie_p$ :  $\sigma_p(R \times S) = R \bowtie_p S$
- Merge/split  $\sigma$ 's:  $\sigma_{p1}(\sigma_{p2} R) = \sigma_{p1 \land p2} R$
- ♦ Merge/split  $\pi$ 's:  $\pi_{L1}(\pi_{L2} R) = \pi_{L1} R$ , where  $L1 \subseteq L2$
- \* Push down/pull up  $\sigma$ :
  - $\sigma_{p \wedge pr \wedge ps} (R \times S) = (\sigma_{pr} R) \bowtie_p (\sigma_{ps} S), \text{ where }$
  - pr is a predicate involving only R columns
  - ps is a predicate involving only S columns
  - *p* is a predicate involving both *R* and *S* columns
- Push down  $\pi$ :  $\pi_L(\sigma_p R) = \pi_L(\sigma_p(\pi_{LL}, R))$ , where
- L' is the set of columns referenced by p that are not in L
  Many more (seemingly trivial) equivalences...
- Can be systematically used to transform a plan to new ones





#### Heuristics-based query optimization

- \* Start with a logical plan
- \* Push selections/projections down as much as possible
  - Why?
  - Why not?
- \* Join smaller relations first, and avoid cross product
  - Why?
  - Why not?
- Convert the transformed logical plan to a physical plan (by choosing appropriate physical operators)

## SQL query rewrite

More complicated—subqueries and views divide a query into nested "blocks"

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- Processing each block separately forces particular join methods and join order
- Even if the plan is optimal for each block, it may not be optimal for the entire query
- Unnest query: convert subqueries/views to joins
- Then we just deal with select-project-join queries
  - Where the clean rules of relational algebra apply

## DB2's QGM

Leung et al. "Query Rewrite Optimization Rules in IBM DB2 Universal Database."

- Query Graph Model: DB2's logical plan language
  - More high-level than relational algebra
- A graph of boxes
  - Leaf boxes are tables
  - The standard box is the SELECT box (actually a selectproject-join query block with optional duplicate elimination)
  - Other types include GROUPBY (aggregation), UNION, INTERSECT, EXCEPT
  - Can always add new types (e.g., OUTERJOIN)

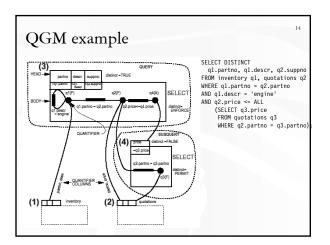
# More on QGM boxes

- ✤ Head: declarative description of the output
  - Schema: list of output columns
  - Property: Are output tuples DISTINCT?
- Body: how to compute the output
  - Quantifiers: tuple variables that range over other boxes
     F: regular tuple variable, e.g., FROM R AS r
    - E: existential quantifier, e.g., IN (*subquery*), or = ANY (*subquery*)

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- A: universal quantifier, e.g., > ALL (subquery)
- S: scalar subquery, e.g., = (subquery)
- Quantifiers are connected a hypergraph
- Hyperedges are predicates
- Enforce DISTINCT, preserve duplicates, or permit duplicates?
   For the output of this box, and for each quantifier



#### Query rewrite in DB2

- Goal: make the logical plan as general as possible, i.e., merge boxes
- \* Rule-based transformations on QGM
  - Merge subqueries in FROM
  - Convert E to F (e.g., IN/ANY subqueries to joins)
  - Convert intersection to join
  - Convert S to F (i.e., scalar subqueries to joins)
  - Convert outerjoin to join
  - Magic (i.e., correlated subqueries to joins)

#### E to F conversion

- \$ SELECT DISTINCT name
  FROM Student
  WHERE SID = ANY (SELECT SID FROM Enroll);
- \$ SELECT DISTINCT name FROM Student, (SELECT SID FROM Enroll) t WHERE Student.SID = t.SID; (EtoF rule)
- \$ SELECT DISTINCT name
  FROM Student, Enroll
  WHERE Student.SID = Enroll.SID;
  (SELMERGE rule)

#### Problem with duplicates

Same query, without DISTINCT

- \$ SELECT name
  FROM Student
  WHERE SID = ANY (SELECT SID FROM Enroll);
  \$ SELECT name
- FROM Student, Enroll
  WHERE Student.SID = Enroll.SID;

## A way of preserving duplicates

```
$ SELECT name
FROM Student
WHERE SID = ANY (SELECT SID FROM Enroll);
```

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Suppose that SID is a key of Student

- \$ SELECT DISTINCT Student.SID, name FROM Student, Enroll WHERE Student.SID = Enroll.SID; (ADDKEYS rule)
- Then simply project out Student.SID

#### Another E to F trick

- Sometimes an ANY subquery can be turned into an aggregate subquery without ANY, to improve performance further
- \$ SELECT \* FROM Student s1
  WHERE GPA > ANY
  (SELECT GPA FROM Student s2
  WHERE s2.name = 'Bart');
- \$ SELECT \* FROM Student s1
  WHERE GPA >
  (SELECT MIN(GPA) FROM Student s2
  WHERE s2.name = 'Bart');

#### Does the same trick apply to ALL?

- \$ SELECT \* FROM Student s1
  WHERE GPA > ALL
  (SELECT GPA FROM Student s2
  WHERE s2.name = 'Bart');
- \$ SELECT \* FROM Student s1
  WHERE GPA >
  (SELECT MAX(GPA) FROM Student s2
  WHERE s2.name = 'Bart');

#### Correlated subqueries

```
$ SELECT CID FROM Course
WHERE title LIKE 'CPS%'
AND min_enroll >
   (SELECT COUNT(*) FROM Enroll
   WHERE Enroll.CID = Course.CID);
```

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Executing correlated subquery is expensive
The subquery is evaluated once for every CPS course

☞ Decorrelate!

## **COUNT** bug

\$ SELECT CID FROM Course
WHERE title LIKE 'CPS%'
AND min\_enroll > (SELECT COUNT(\*) FROM Enroll
WHERE Enroll.CID = Course.CID);

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\$ SELECT CID First compute the enrollment for all(?) courses
FROM Course,
(SELECT CID, COUNT(\*) AS cnt
FROM Enroll GROUP BY CID) t
WHERE t.CID = Course.CID AND min\_enroll > t.cnt
AND title LIKE 'CPS%';

## Magic decorrelation

\* Simple idea

- Process the outer query using other predicates
   To collect bindings for correlated variables in the subquery
- Evaluate the subquery using the bindings collected
  - It is a join
  - Once for the entire set of bindings
    - Compared to once per binding in the naïve approach
- Use the result of the subquery to refine the outer query
   Another join
- Name "magic" comes from a technique in recursive processing of Datalog queries

#### Magic decorrelation example SELECT CID FROM Course WHERE title LIKE 'CPS%' AND min\_enroll > (SELECT COUNT(\*) FROM Enroll WHERE Enroll.CID = Course.CID); ✤ CREATE VIEW Supp Course AS Process the outer query SELECT \* FROM Course WHERE title LIKE 'CPS%'; without the subquery CREATE VIEW Magic AS Collect bindings SELECT DISTINCT CID FROM Supp\_Course; CREATE VIEW DS AS Evaluate the subquery (SELECT Enroll.CID, COUNT(\*) AS cnt with bindings FROM Magic, Enroll WHERE Magic.CID = Enroll.CID GROUP BY Enroll.CID) UNION (SELECT Magic.CID, 0 AS cnt FROM Magic WHERE Magic.CID NOT IN (SELECT CID FROM Enroll); SELECT Supp\_Course.CID FROM Supp\_Course, DS Finally, refine WHERE Supp\_Course.CID = DS.CID AND min\_enroll > DS.cnt; the outer query

# Summary of query rewrite

 Break the artificial boundary between queries and subqueries

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- Combine as many query blocks as possible in a select-project-join block, where the clean rules of relational algebra apply
- Handle with care—extremely tricky with duplicates, NULL's, empty tables, and correlation