# **Leveraging Range Joins for** the Computation of Overlap Joins

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# CHALLENGES

• Overlap predicate consist of inequalities on 4 attributes

 $\Rightarrow$  Specialized algorithms/indices required

• Additional equality predicate needs to be supported

 $\cdot$  WHERE \_ = \_ AND \_ overlaps \_

• Different interval definitions should be supported

# **OVERLAP JOIN**

Given two relations containing periods, find pairs of tuples satisfying an equality predicate and overlap on periods [1].

#### SELECT

e JOIN dept d ON e.DNo = d.DNo AND e.P OVERLAPS d.P; FROM emp

$\operatorname{emp}$							
		I	<b>)</b>			I	<b>)</b>
EName	DNo	<b>[B</b>	<b>E</b> )	DNo	DName	<b>[B</b>	<b>E</b> )
Sam	2	1	6	1	HR	1	11
Ann	1	2	5	2	Test	1	6
Joe	2	4	8	2	QA	6	10
Sue	1	9	11			•	

O	verlap	10	oin	for	equality	on	DNo	and	overlap	on <b>I</b>	2
_	· · · · · · · · · · · · · · · · · · ·	J							- · · · · · <b>I</b>		

		I	<b>)</b>			Р		
EName	DNo	<b>[B</b>	E)	DNo	DName	<b>[B</b>	E)	
Sam	2	1	6	2	Test	1	6	
Ann	1	2	5	1	HR	1	11	
Joe	2	4	8	2	Test	1	6	
Joe	2	4	8	2	QA	6	10	
Sue	1	9	11	1	HR	2	11	





## **EVALUATION USING RANGE JOINS**

**1.** Transformation of the overlap predicate

Equivalence:

r.P overlaps  $s.P \equiv r.B < s.E \land s.B < r.E$ 

 $\equiv r.B < s.B < r.E \lor s.B < r.B < s.E$ 

Properties:

- Two disjunctive range conditions ( $\approx$  BETWEEN AND)
- Two conditions are disjoint (can be evaluated independently)

**Rewrite**:

**SELECT** \* FROM emp e JOIN dept d ON e.DNo = d.DNo AND e.B < d.E AND d.B < e.E;

As union (all) of two range joins:

**SELECT** \* FROM emp e JOIN dept d ON e.DNo = d.DNo AND e.B <= d.B AND d.B < e.E UNION ALL **SELECT** \* FROM emp e JOIN dept d

2a) Index-based evaluation

• Each range join can exploit and index

**CREATE INDEX** e\_idx **ON** emp(dno, b); **CREATE INDEX** d\_idx **ON** dept(dno, b);

• Range join execution using an index-nested loop

• Append of the two range joins

OUERY PLAN

Append

-> Nested Loop

-> Seq Scan on emp e

-> Index Scan using d\_idx on dept d Index Cond: ((dno = e.dno) AND (e.b <= b) AND (b < e.e))

-> Nested Loop -> Seq Scan on dept d\_1 -> Index Scan using e\_idx on emp e\_1 Index Cond:  $((dno = d_1.dno))$ AND  $(d_1.b < b)$  AND  $(b < d_1.e)$  **2b) Stand-alone range-join algorithm** 

• Sort-merge based algorithm for range joins

```
Algorithm 1: RMJ(\mathbf{r}, \mathbf{s}, \mathbf{C}, B, \prec^S, X, \prec^E, E, O)
Input: Relation r sorted by (\mathbf{C}, B), Relation s sorted by (\mathbf{C}, X),
          equality attributes \mathbf{C}, start point B in \mathbf{r}, comparison operator
          \prec^{S} \in \{<, \leq\} for B and X, attribute X in s, comparison
         operator \prec^E \in \{<, \leq\} for X and E, end point E in r, output
          schema O
Output: Result of \mathbf{r} \Join_{\mathbf{r}.\mathbf{C}=\mathbf{s}.\mathbf{C}\wedge\mathbf{r}.B\prec S} \mathbf{s}.X\prec E_{\mathbf{r}.E} \mathbf{s}.
r \leftarrow first(\mathbf{r});
s \leftarrow first(\mathbf{s});
while r \neq \omega \land s \neq \omega do
      if r.C < s.C then
             r \leftarrow next(\mathbf{r});
                                                                // skip outer
      else if r.\mathbf{C} = s.\mathbf{C} \wedge r.B \prec^S s.X then
              marked \leftarrow s;
                                                                              // mark
             while s \neq \omega \wedge r.\mathbf{C} = s.\mathbf{C} \wedge s.X \prec^E r.E \operatorname{do}
                    output r and s according to schema O;
                   s \leftarrow next(\mathbf{s});
             r \leftarrow next(\mathbf{r}); // end of matches for outer
             s \leftarrow marked; // backtrack inner
       else
                                                                   // skip inner
             s \leftarrow next(\mathbf{s});
```

ON d.DNo = e.DNo AND d.B <= e.B AND e.B < d.E

#### Works out of the box in DBMSs supporting B-trees

# **EXPERIMENTAL EVALUATION**

Stand-alone (main memory) algorithm

• Without equality condition



• With equality condition



Index-based solution (in PostgreSQL)

• Without equality condition



• With equality condition



# **SUMMARY OF CONTRIBUTIONS**

- We provide a new and simple rewriting of the overlaps predicate that transforms an overlap join into the union of two independent range joins.
- Our solution supports the combination of the overlaps predicate with non-temporal equality constraints.
- We provide a strict total order for period boundaries over discrete and continuous domains and prove its correctness. This enables support for all common interval definitions for period timestamps as well as relations where tuples might have period timestamps with different interval definitions.
- We show how to evaluate overlap joins in DBMSs by taking advantage of B+-trees.
- We show how the rewriting can be used to devise an efficient yet simple main memory algorithm for overlap joins based on the sort-merge join paradigm.
- An extensive empirical evaluation shows that (a) our main

(a) Runtime

(b) Output

• On par with the state-of-the art [3]

• More general algorithm

(a) Nonclustered

(b) Clustered

• Much faster compared to the state-of-the art (e.g., [4])

• Clustering is very effective

memory algorithm performs on par with the state-of-theart stand-alone competitors and that (b) the evaluation of the overlap join using B+-trees in an existing DBMS outperforms the state-of-the-art systems competitors.

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