

**ADT 2009**

# **MonetDB/XQuery:**

## **High-Performance, Purely Relational**

## **XQuery Processing**

**<http://pathfinder-xquery.org/>**

**<http://monetdb-xquery.org/>**

**Stefan Manegold**

**Stefan.Manegold@cwi.nl**

**<http://www.cwi.nl/~manegold/>**

# XPath evaluation (SQL)

Example query:

```
/descendant::open_auction[./bidder]/annotation
```

```

SELECT DISTINCT a.pre
  FROM doc r, doc oa, doc b, doc a
 WHERE r.pre=0
   → AND oa.pre > r.pre AND oa.post < r.post      <- descendant
   → AND oa.name = "open_auction" AND oa.kind = "elem"
   → AND b.pre > oa.pre AND b.post < oa.post
   → AND b.level = oa.level + 1
   → AND b.name = "bidder" AND b.kind < "elem"
   → AND a.pre > oa.pre AND a.post < oa.post
   → AND a.level = oa.level + 1
   → AND a.name = "annotation" AND a.kind = "elem"
 ORDER BY a.pre
  }
```

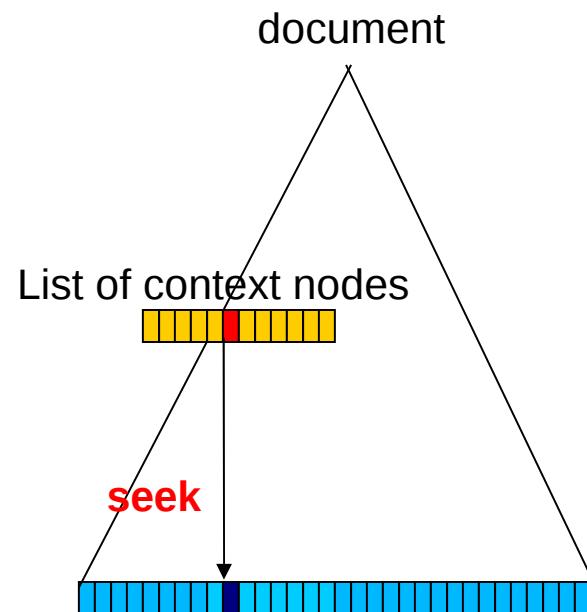
} child

} child

- (potentially?) expensive joins due to range predicates
- (potentially?) expensive duplicate elimination

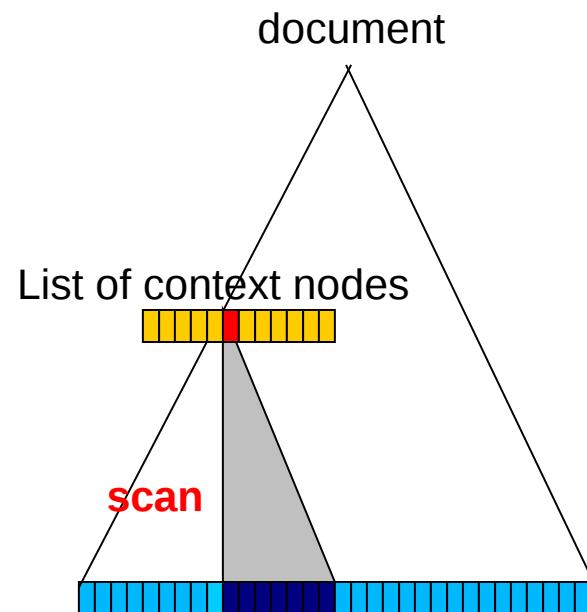
# Staircase Join [VLDB03]

pre | post are not random numbers:  
=> exploit the tree properties encoded in them



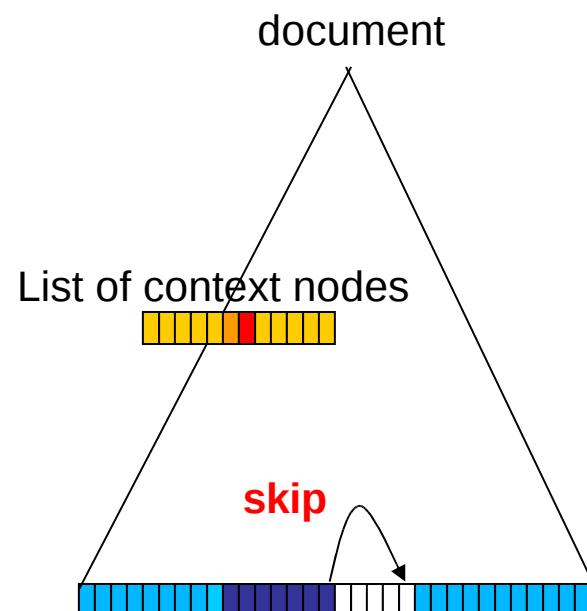
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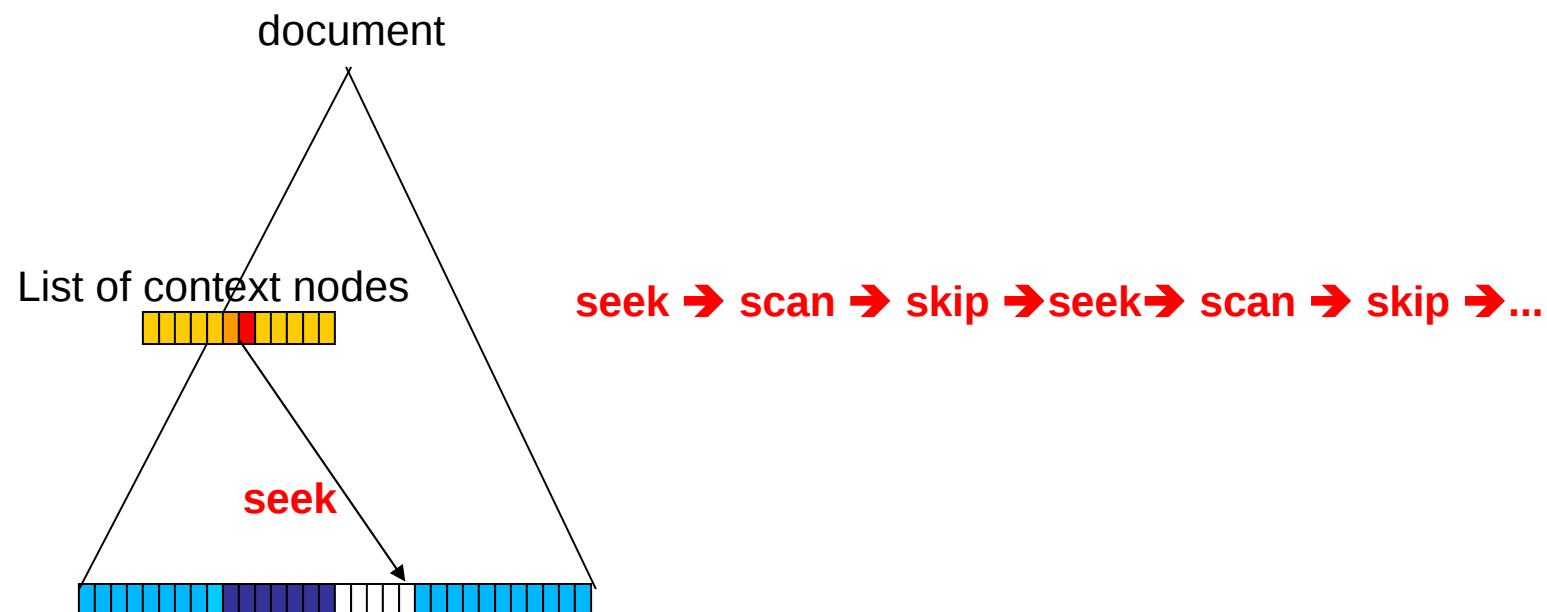
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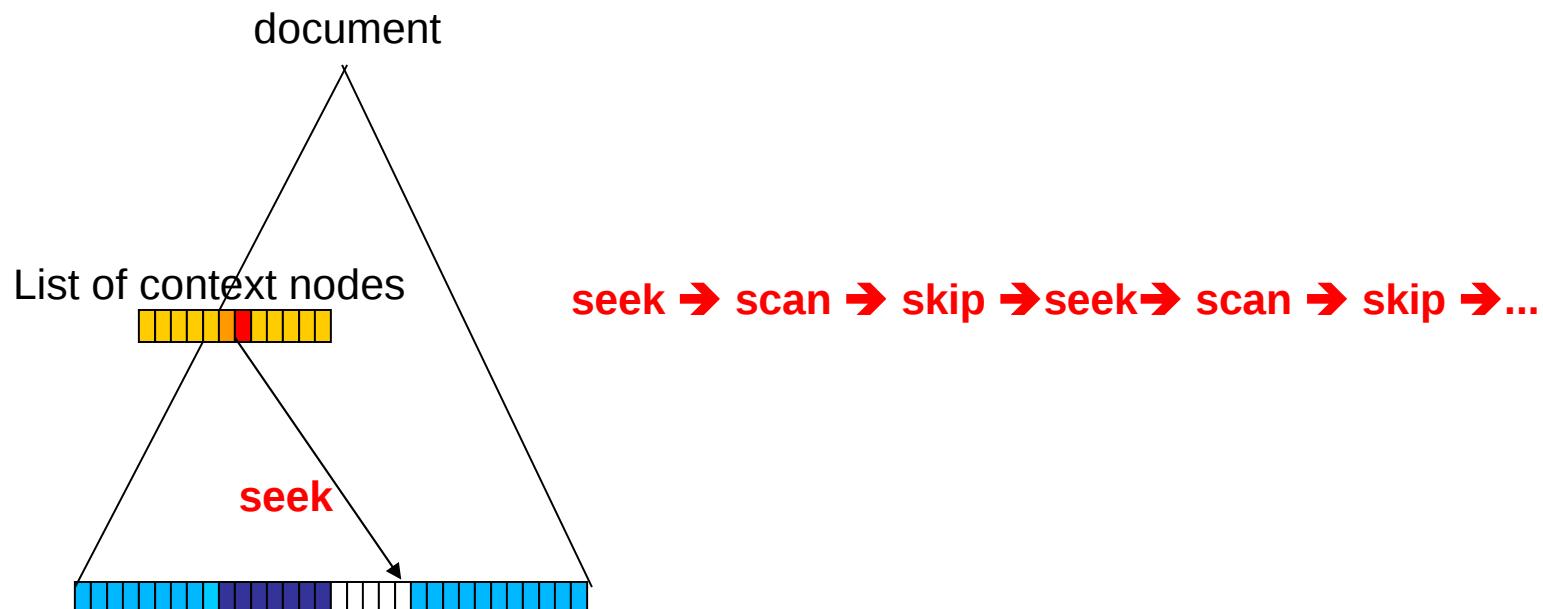


# Staircase Join [VLDB03]

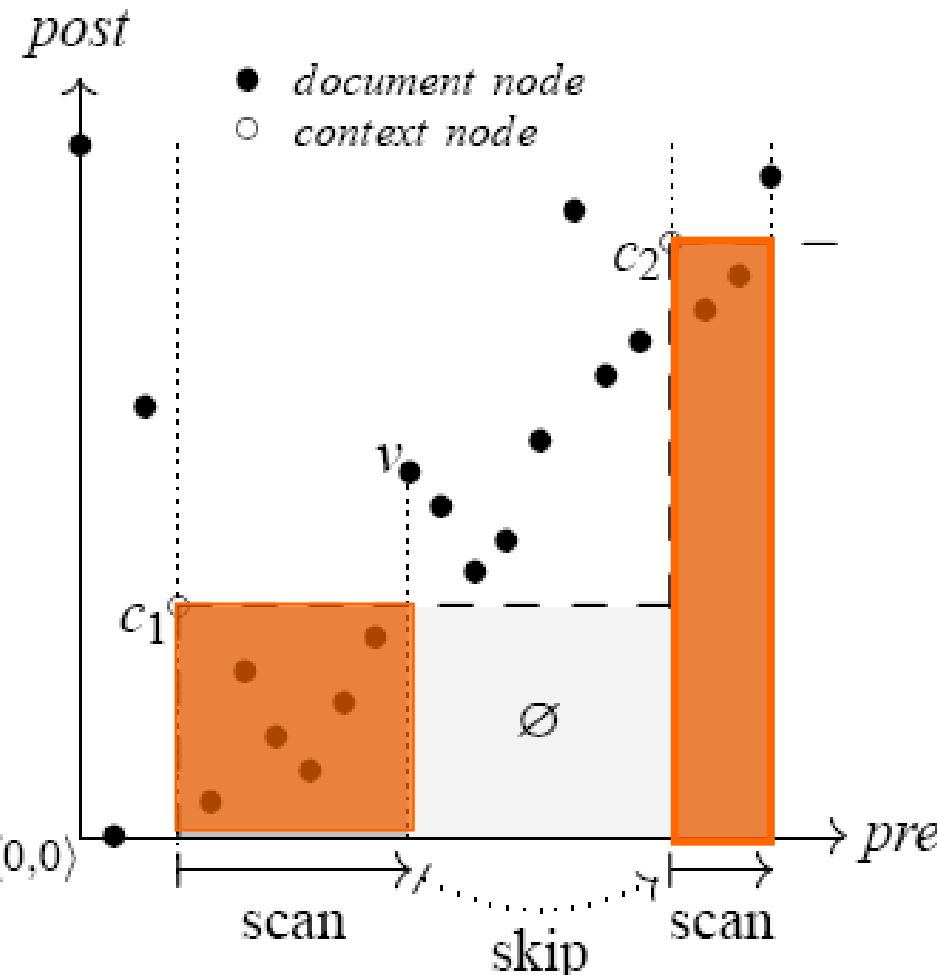
- **skipping**: avoid touching node ranges that cannot contain results

Generate a duplicate-free result in document order

- **pruning**: reduce the context set a-priori
- **partitioning**: single sequential pass over the document



# Staircase Join: Skipping



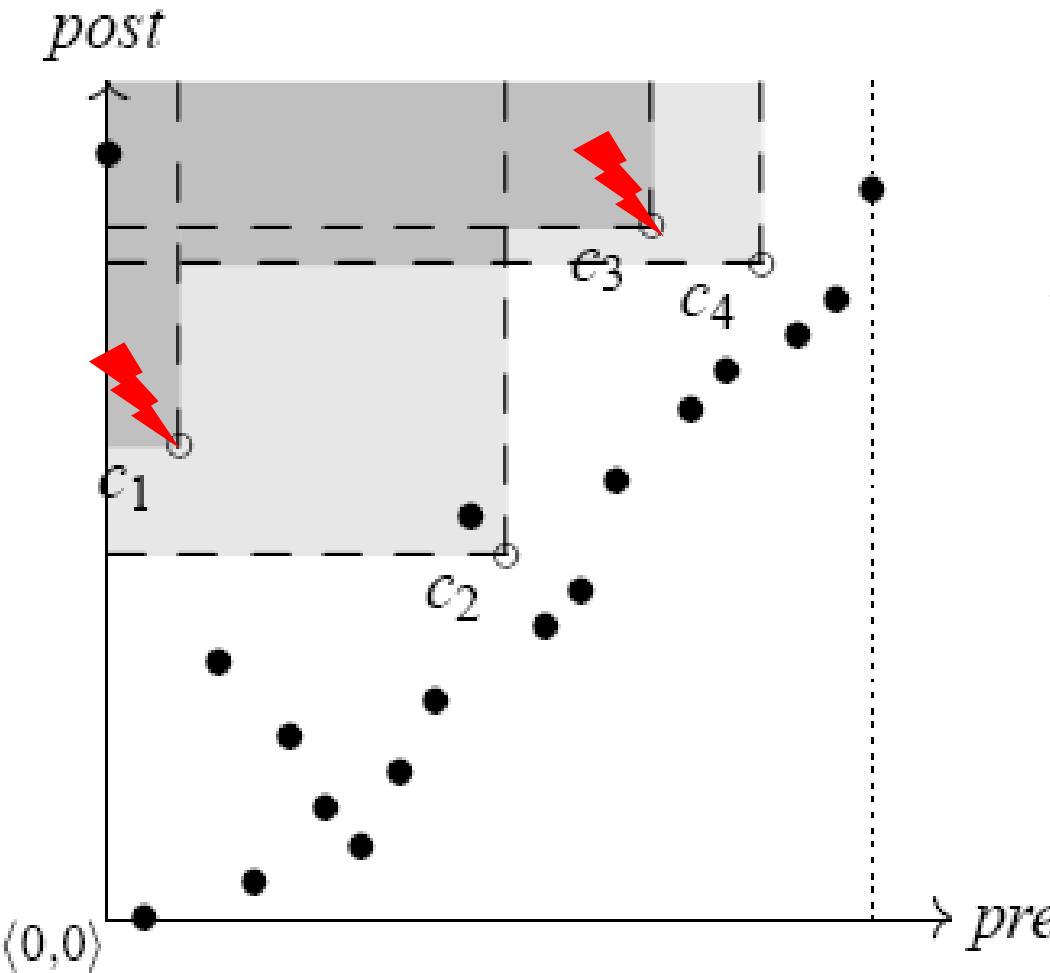
Example:

$(c_1, c_2)/\text{descendant} : *$

```
SELECT DISTINCT doc.pre
  FROM  c, doc
 WHERE doc.pre > c.pre
   AND doc.post > c.post
```

Avoid comparing large chunks  
of the document table.

# Staircase Join: Pruning



Example:

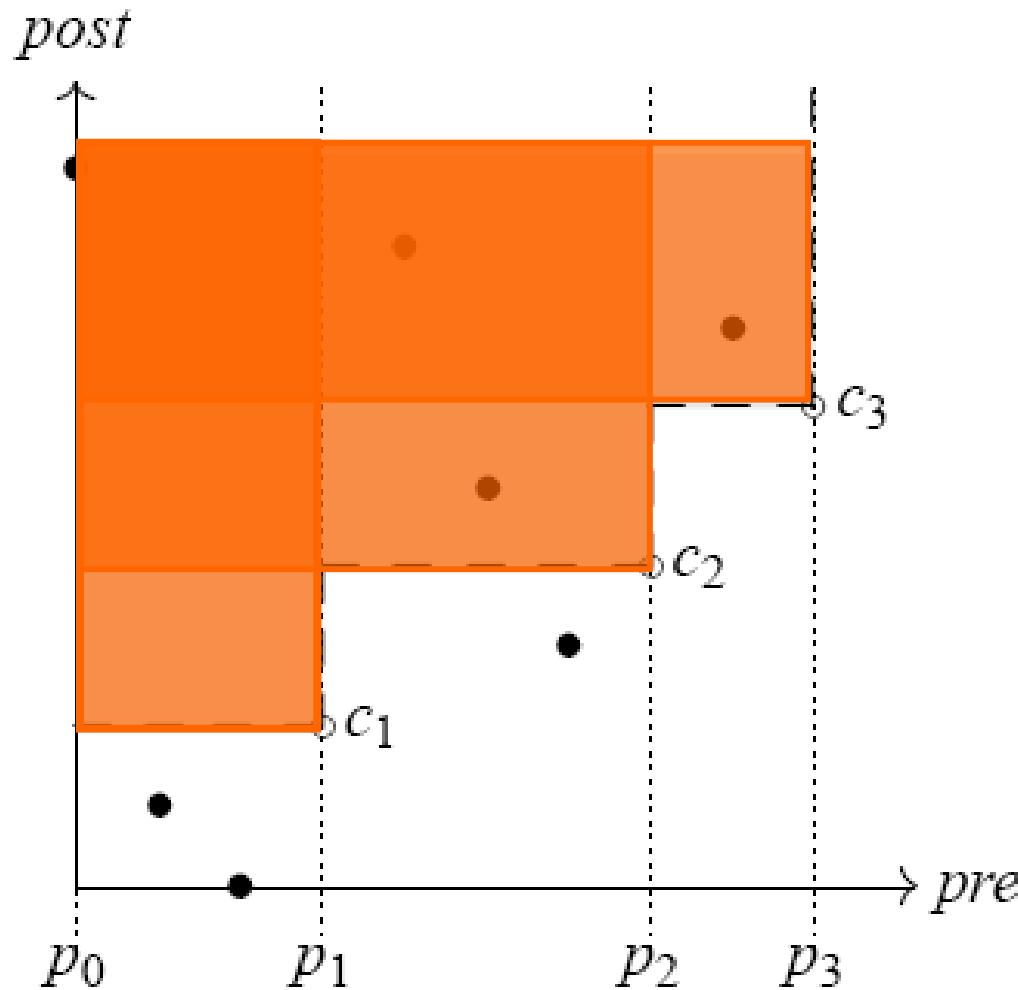
$(c_1, c_2, c_3, c_4)/\text{ancestor} : *$

```
SELECT DISTINCT doc.pre
  FROM c, doc
 WHERE doc.pre < c.pre
   AND doc.post < c.post
```

Eliminate:  $c_1, c_3$

Keep:  $c_2, c_4$

# Staircase Join: Partitioning



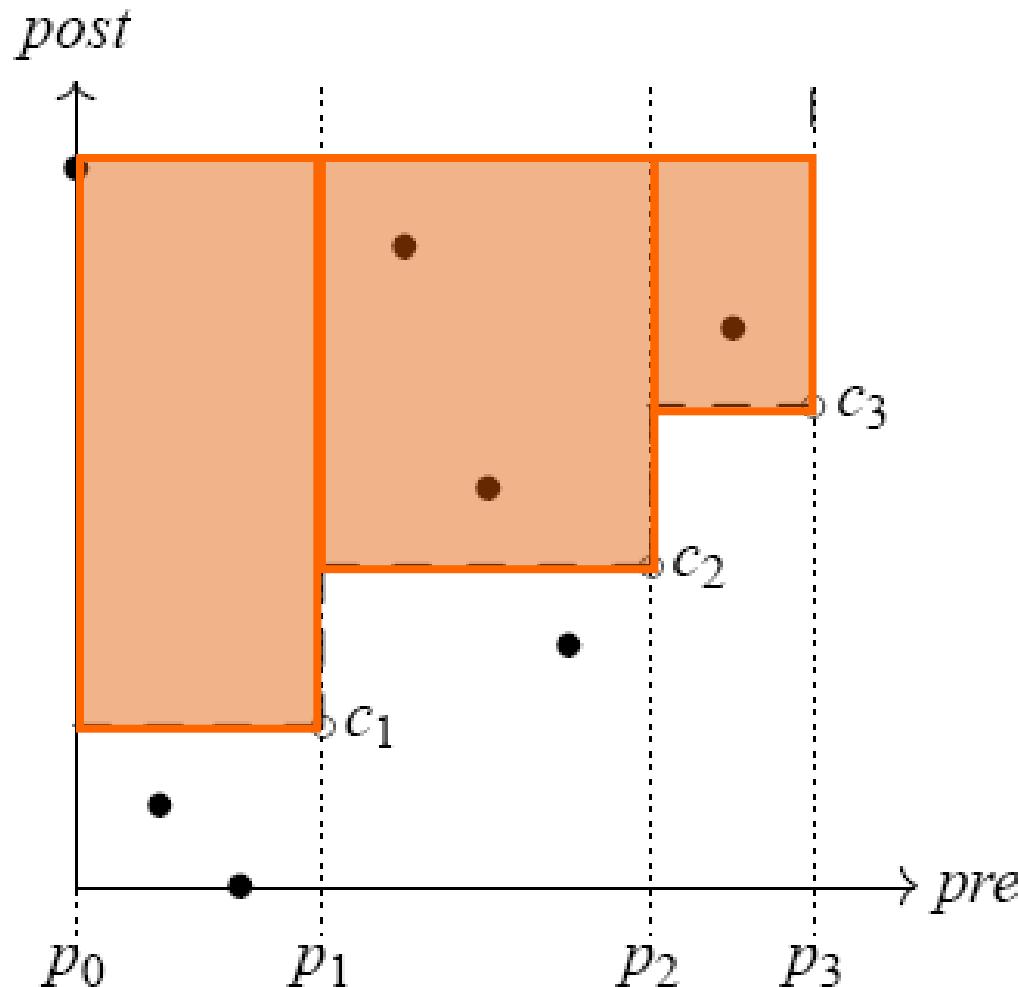
Example:

$(c_1, c_2, c_3) / \text{ancestor} : *$

```
SELECT DISTINCT doc.pre
FROM c, doc
WHERE doc.pre < c.pre
AND doc.post < c.post
```

Single-pass algorithm that avoids generating duplicates

# Staircase Join: Partitioning



Example:

$(c_1, c_2, c_3) / \text{ancestor} : *$

```
SELECT DISTINCT doc.pre
FROM c, doc
WHERE doc.pre < c.pre
AND doc.post < c.post
```

Single-pass algorithm that avoids generating duplicates

# Schedule

- So far:
  - RDBMS back-end support for XML/XQuery (1/2):
    - Document Representation (*XPath Accelerator, Pre/Post plane*)
    - XPath navigation (*Staircase Join*)

# Schedule

- So far
  - RDBMS back-end support for XML/XQuery (1/2):
    - Document Representation (*XPath Accelerator, Pre/Post plane*)
    - XPath navigation (*Staircase Join*)
- Now:
  - XQuery to Relational Algebra Compiler:
    - Item- & Sequence- Representation
    - Efficient FLWoR Evaluation (*Loop-Lifting*)
    - Optimization
  - RDBMS back-end support for XML/XQuery (2/2):
    - Updateable Document Representation

# Source Language: XQuery Core

XQuery is a lot more than just XPath.

literals	42, "foo", (), ...
arithmetics	$e_1 + e_2, e_1 - e_2, \dots$
builtin functions	<code>fn:sum(e), fn:count(e), fn:doc(uri)</code>
variable bindings	<code>let \$v := e<sub>1</sub> return e<sub>2</sub></code>
iteration	<code>for \$v at \$p in e<sub>1</sub> return e<sub>2</sub></code>
conditionals	<code>if p then e<sub>1</sub> else e<sub>2</sub></code>
sequence construction	$e_1, e_2$
function calls	$f(e_1, e_2, \dots, e_n)$
element construction	<code>element e<sub>1</sub> { e<sub>2</sub> }</code>
XPath steps	$e/\alpha::\nu$
⋮	⋮

# Target Language: Relational Algebra

## Operators

$\sigma_a$	row selection
$\pi_{a,b:c}$	projection/renaming
$\varrho_{a:(b,\dots,c)/d}$	<b>row numbering</b>
$\_ \times \_ \_$	Cartesian product
$\_ \bowtie_p \_ \_$	join
$\dot{\cup}$	disjoint union
$\_ \setminus \_ \_$	difference
$\delta$	duplicate elimination
$\circledcirc_{a:(b,\dots,c)}$	apply $\circ \in \{*, =, <, \dots\}$

a	b
8	'e'
5	'f'
2	'o'
6	's'
3	't'
9	'n'

$\varrho_{c:(a)} \rightarrow$

a	b	c
8	'e'	5
5	'f'	3
2	'o'	1
6	's'	4
3	't'	2
9	'n'	6

- RDBMS kernels implement  $\varrho$  in terms of SQL's DENSE\_RANK.
- Most conceivable implementations of  $\varrho$  require a sorted input.

# Sequence Representation

$(i_1, i_2, \dots, i_n)$

pos	item
1	$i_1$
2	$i_2$
.	.
.	.
$n$	$i_n$

$i$

pos	item
1	$i$

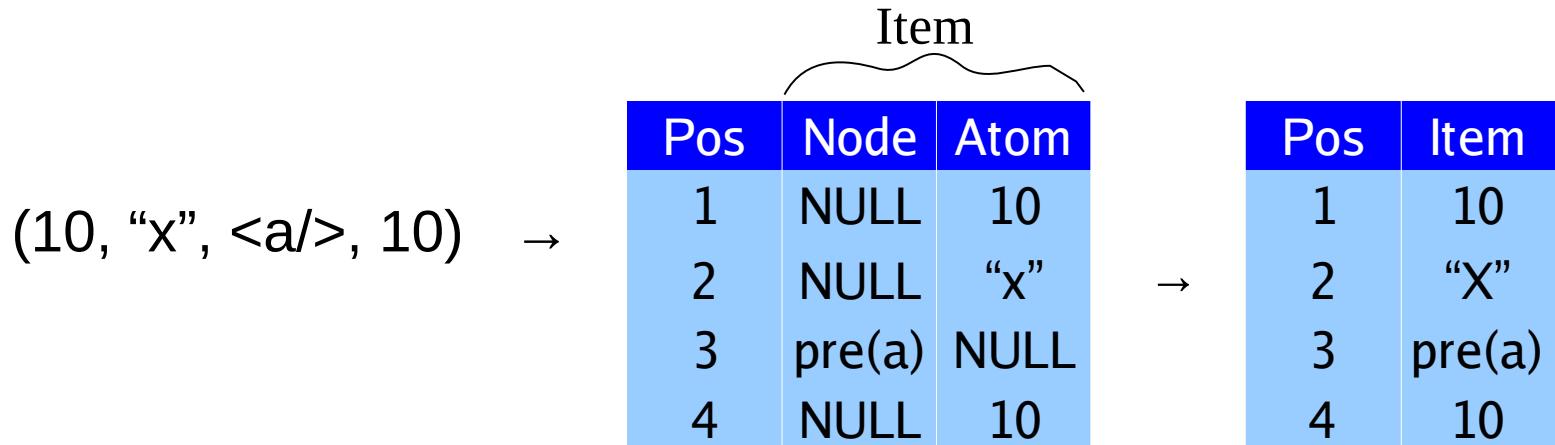
$()$

pos	item

- *sequence = table of items*
- *add pos column for maintaining order*

# Sequence Representation

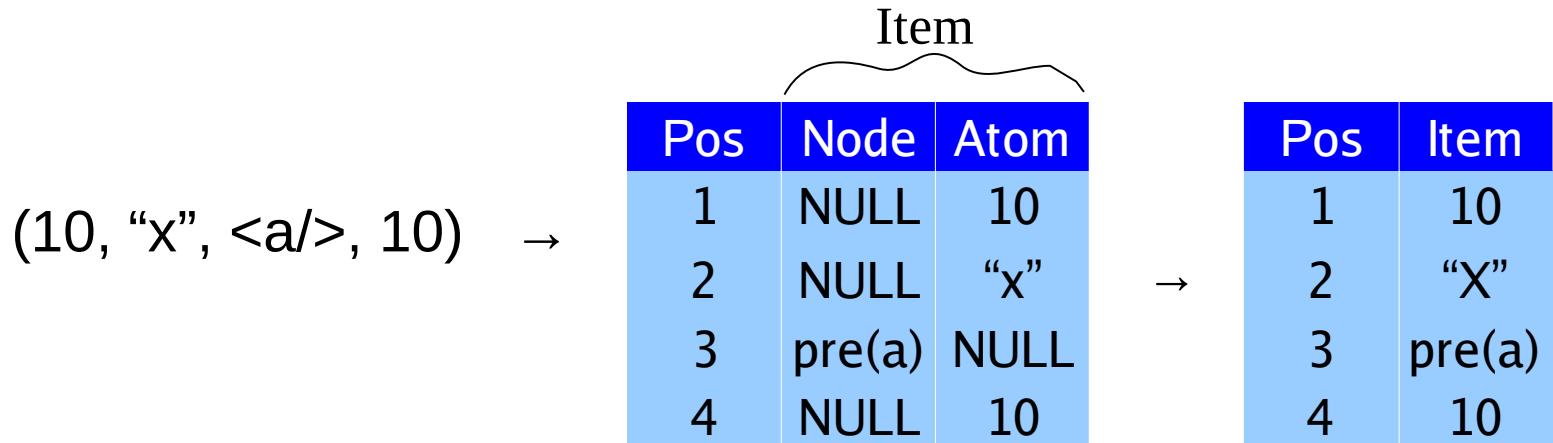
- Item sequences, sequence order



- Problems:
  - Polymorphic columns
  - Redundant storage
  - Copy overhead (especially with strings)

# Item Representation

- Item sequences, sequence order



The diagram shows the decomposition of the item sequence into string and integer values. The original sequence is:

Pos	Item
1	10
2	"X"
3	pre(a)
4	10

An arrow points to the decomposition:

Pos	Item	Kind
1	1@0	Int
2	1@0	Str
3	0@0	Node
4	1@0	Int

Two additional tables are shown on the right:

str_values	
1@0	"X"

int_values	
1@0	10

# Iterations

- XQuery Core has been designed around the **for iteration** primitive:

## XQuery iteration

$$\begin{aligned} \text{for } \$v \text{ in } (x_1, x_2, \dots, x_n) \text{ return } e \\ \equiv \\ (e[x_1/\$v], e[x_2/\$v], \dots, e[x_n/\$v]) \end{aligned}$$

- Representation of  $(x_1, x_2, \dots, x_n)$ :
- Derive  $\$v$  as follows:

pos	item
1	$x_1$
2	$x_2$
:	:
$n$	$x_n$

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```
for $v in (x1, x2, ..., xn) return e
      ≡
(e[x1/$v], e[x2/$v], ..., e[xn/$v])
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- Derive  $\$v$  as follows:

pos	item
1	$x_1$
2	$x_2$
:	:
$n$	$x_n$

iter	pos	item
1	1	$x_1$
2	2	$x_2$
:	:	:
$n$	$n$	$x_n$

# Iterations

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## XQuery iteration

```
for $v in (x1, x2, ..., xn) return e
      =
(e[x1/$v], e[x2/$v], ..., e[xn/$v])
```

- Representation of  $(x_1, x_2, \dots, x_n)$ :
- Derive  $\$v$  as follows:

pos	item
1	x <sub>1</sub>
2	x <sub>2</sub>
:	:
⋮	⋮
n	x <sub>n</sub>

iter	pos	item
1	1	x <sub>1</sub>
2	1	x <sub>2</sub>
⋮	⋮	⋮
n	1	x <sub>n</sub>

# Loop-Lifting

- Subexpressions are compiled in dependence of **iteration scope**  $s$  in which they appear—represented as unary relation  $\text{loop}(s)$

XQuery iteration

```

 $s_0$  [ for $v in ( $x_1, x_2, \dots, x_n$ )
       $s_1$  [ return e
    ]
  ]

```

$\text{loop}(s_0)$

iter
1

$\text{loop}(s_1)$

iter
1
:
$n$

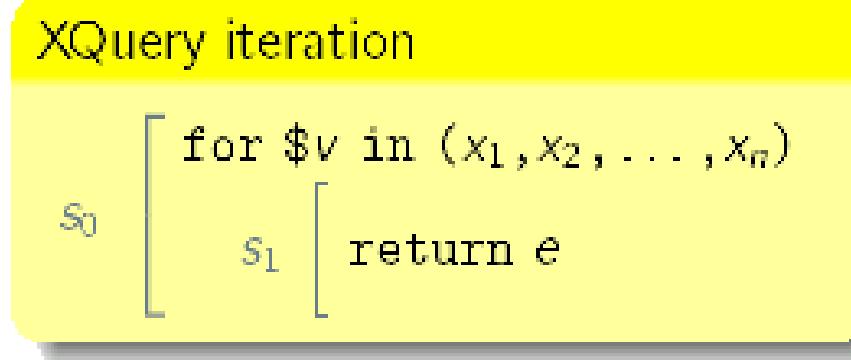
- Single item "a" in scope  $s_1$ :

$\text{loop}(s_1) \times$

pos	item
1	"a"

# Loop-Lifting

- Subexpressions are compiled in dependence of **iteration scope**  $s$  in which they appear—represented as unary relation  $\text{loop}(s)$

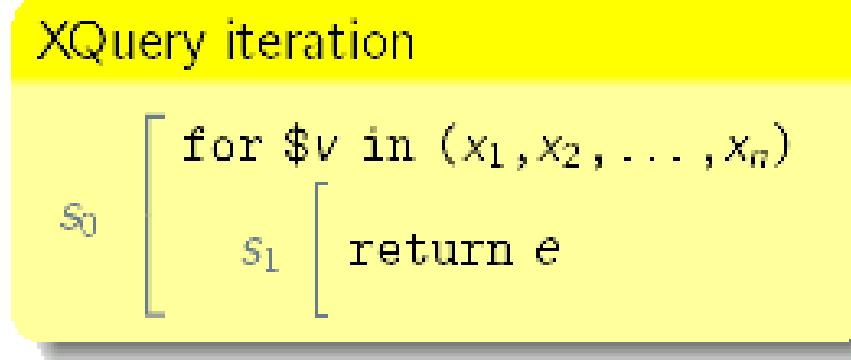


▷ Single item "a" in scope  $s_1$ :

iter	pos	item
1	1	"a"
:	:	:
$n$	1	"a"

# Loop-Lifting

- Subexpressions are compiled in dependence of **iteration scope**  $s$  in which they appear—represented as unary relation  $\text{loop}(s)$



▷ Single item "a" in scope  $s_1$ :      ▷ Sequence ("a", "b") in scope  $s_1$ :

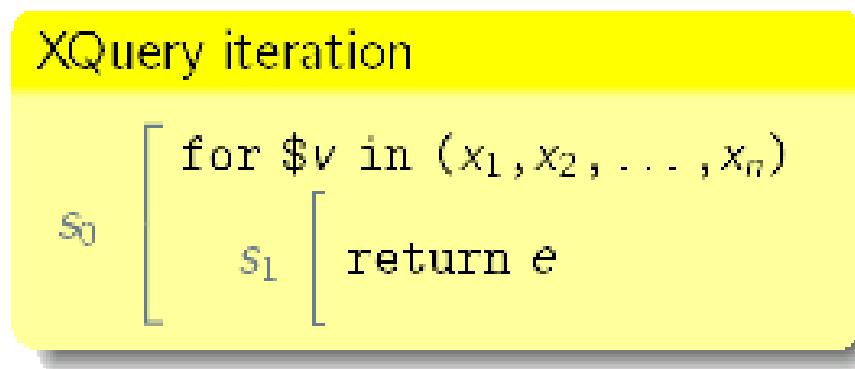
iter	pos	item
1	1	"a"
:	:	:
$n$	1	"a"

$\text{loop}(s_1) \times$

pos	item
1	"a"
2	"b"

# Loop-Lifting

- Subexpressions are compiled in dependence of **iteration scope  $s$**  in which they appear—represented as unary relation  $loop(s)$



$loop(s_0)$	$loop(s_1)$
iter	iter
1	1
:	:
$n$	$n$

▷ Single item "a" in scope  $s_1$ :

iter	pos	item
1	1	"a"
:	:	:
$n$	1	"a"

▷ Sequence ("a", "b") in scope  $s_1$ :

iter	pos	item
1	1	"a"
1	2	"b"
:	:	:
$n$	1	"a"
$n$	2	"b"

# Deriving *loop*

XQuery FLWOR **expressions define a new *loop* relation.**

```
for $v in (x1, x2, ..., xn) return e
```

- ▶ How can we derive *loop* given this XQuery expression?
- ▶ (x<sub>1</sub>, x<sub>2</sub>, ..., x<sub>n</sub>)      ▶ Derive \$v:      ▶ *loop*(s<sub>1</sub>)

<i>pos</i>	<i>item</i>
1	x <sub>1</sub>
2	x <sub>2</sub>
:	:
<i>n</i>	x <sub><i>n</i></sub>

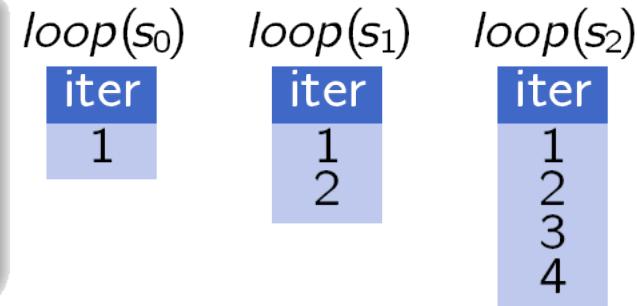
<i>iter</i>	<i>pos</i>	<i>item</i>
1	1	x <sub>1</sub>
2	1	x <sub>2</sub>
:	:	:
<i>n</i>	1	x <sub><i>n</i></sub>

<i>iter</i>
1
2
:
<i>n</i>

# Nested Scopes

Nested for blocks

```
s0 [ for $v0 in (10,20)
      s1 [ for $v1 in (100,200)
            s2 [ return $v0 + $v1
```



- Derive  $\$v_0, \$v_1$

$\$v_0$ in $s_1$ :	iter	pos	item
	1	1	10
	2	1	20

# Nested Scopes

Nested for blocks

```

 $s_0 \left[ \begin{array}{l} \text{for } \$v_0 \text{ in (10,20)} \\ \quad s_1 \left[ \begin{array}{l} \text{for } \$v_1 \text{ in (100,200)} \\ \quad s_2 \left[ \begin{array}{l} \text{return } \$v_0 + \$v_1 \end{array} \right. \end{array} \right. \end{array} \right. \end{array}$ 

```

$loop(s_0)$	$loop(s_1)$	$loop(s_2)$
iter	iter	iter
1	1	1
	2	2
		3
		4

- Derive  $\$v_0, \$v_1$

$\$v_0$ in $s_1$ :	iter	pos	item
	1	1	10
	2	1	20

$\$v_1$ in $s_2$ :	iter	pos	item
	1	1	100
	2	1	200
	3	1	100
	4	1	200

# Loop-lifting

Nested for blocks

```


$$s_0 \left[ \begin{array}{l} \text{for } \$v_0 \text{ in } (10, 20) \\ s_1 \left[ \begin{array}{l} \text{for } \$v_1 \text{ in } (100, 200) \\ s_2 \left[ \begin{array}{l} \text{return } \$v_0 + \$v_1 \end{array} \right. \end{array} \right. \end{array} \right. \end{array}$$


```

- Relation *map* captures the semantics of nested iteration:

<i>map</i> :	inner	outer
	1	1
	2	1
	3	2
	4	2

- Representation of  $\$v_0$  in  $s_2$ :

$$\pi_{iter:inner, pos, item}(\$v_0 \bowtie_{iter=outer} map)$$

iter	pos	item
1	1	10
2	1	10
3	1	20
4	1	20

# Full Example

```

for $v0 in (10,20)
  for $v1 in (100,200)
    $2 [ return $v0 + $v1

```

$\$v_0$

iter <sub>0</sub>	pos <sub>0</sub>	item <sub>0</sub>
1	1	10
2	1	10
3	1	20
4	1	20

$\$v_1$

iter <sub>1</sub>	pos <sub>1</sub>	item <sub>1</sub>
1	1	100
2	1	200
3	1	100
4	1	200

join  $\bowtie_{iter_0=iter_1}$  calc  $\oplus_{item_0, item_1}$  project  $\pi$

iter	pos	item
1	1	110
2	1	210
3	1	120
4	1	220

# XQuery On SQL Hosts [VLDB04]

## XQuery Construct

sequence construction

if-then-else

for-loops

calculations

list functions, e.g. fn:first()

element construction

XPath steps

## Relational Mapping

A union B

select(A=true,B) union select(A=false,C)

cartesian product

project(A,x=expr(Y1..Yn))

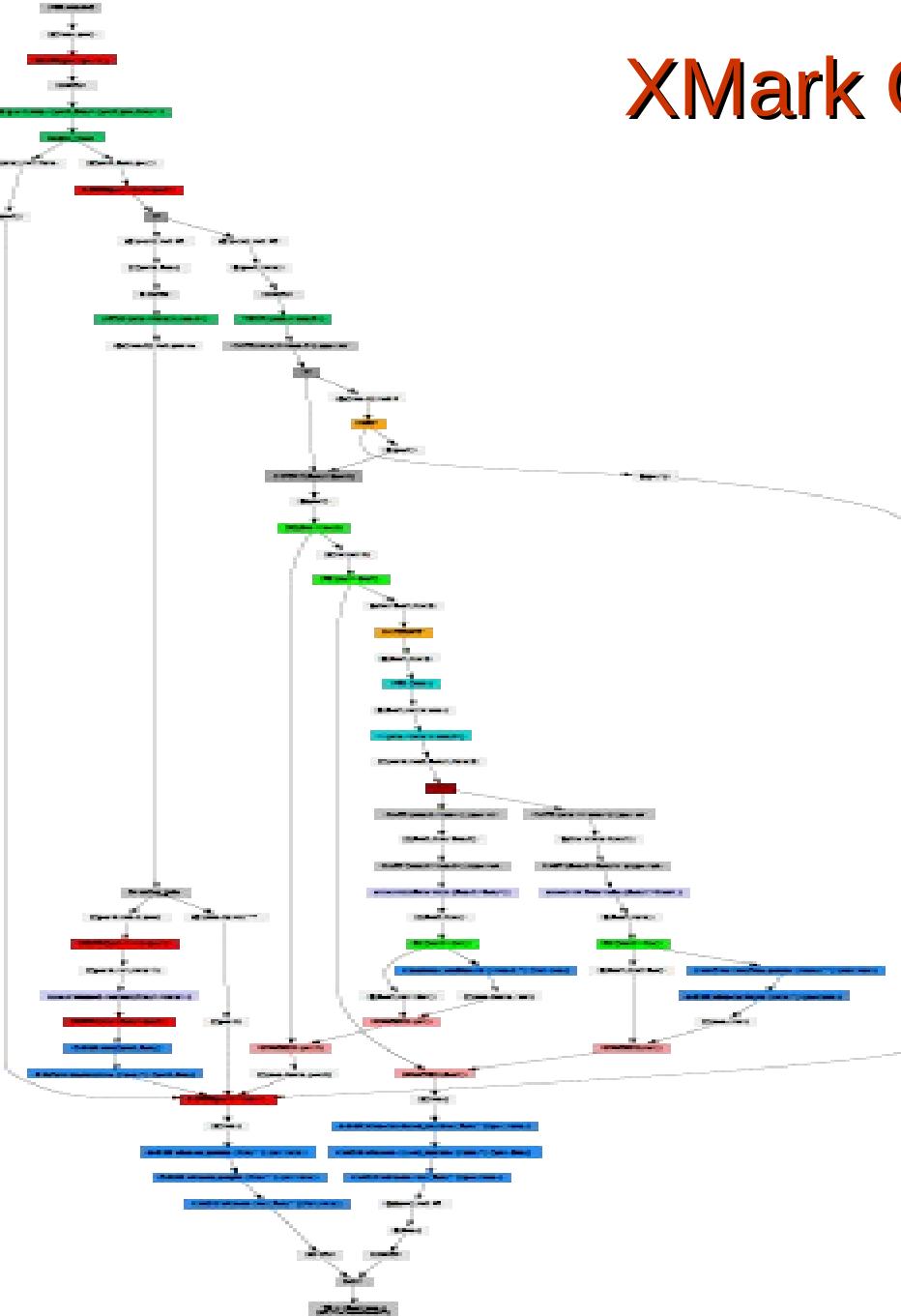
select(A,pos=1)

updates in temporary tables

staircase-join

# XMark Query 8

```
let $auction := doc("auctions.xml")
return
  for $p in
    $auction/site/people/person
  let $a :=
    for $t in $auction/site/
      closed_auctions/closed_auction
    where $t/buyer/@person = $p/@id
    return $t
  return
    <item person="{$p/name/text()}">
      {count($a)}
    </item>
```



# Peephole Optimization

[Grust, XIME-P 2005]

Input: XQuery

```
for $x in (k, ..., 2, 1)
  return $x * 5
```

Output: Relational Algebra

iter	pos	item
1	1	$k * 5$
:	:	:
:	:	:
$k-1$	1	10
$k$	1	5

$$\begin{array}{c} \pi_{\text{iter}, \text{pos}, \text{item}: \text{res}} \\ \bowtie_{\text{res}: (\text{item}, \text{item1})} \\ \bowtie \end{array}$$

iter=iter1

iter	pos	item
1	1	$k$
:	:	:
:	:	:
$k-1$	1	2
$k$	1	1

iter	pos	item
1	1	5
:	:	:
:	:	:
$k-1$	1	5
$k$	1	5

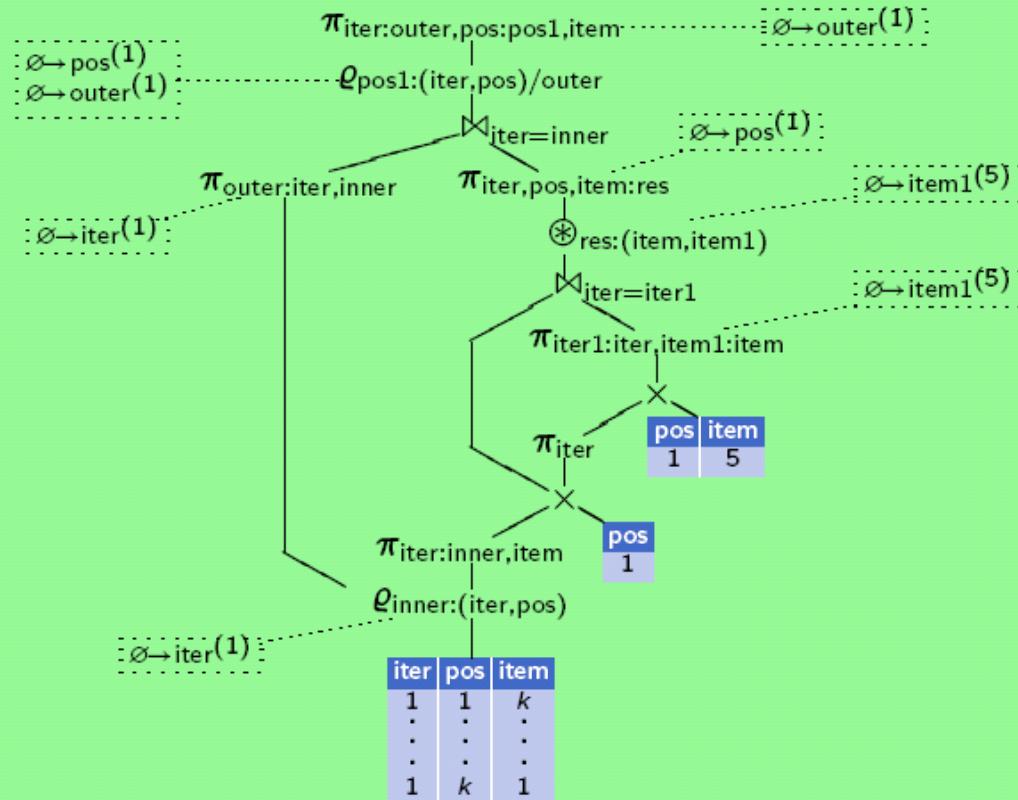
# Peephole Optimization

## [Grust, XIME-P 2005]

## Input: XQuery

```
for $x in (k, ..., 2, 1)
    return $x * 5
```

## Plan Property: Constant Columns



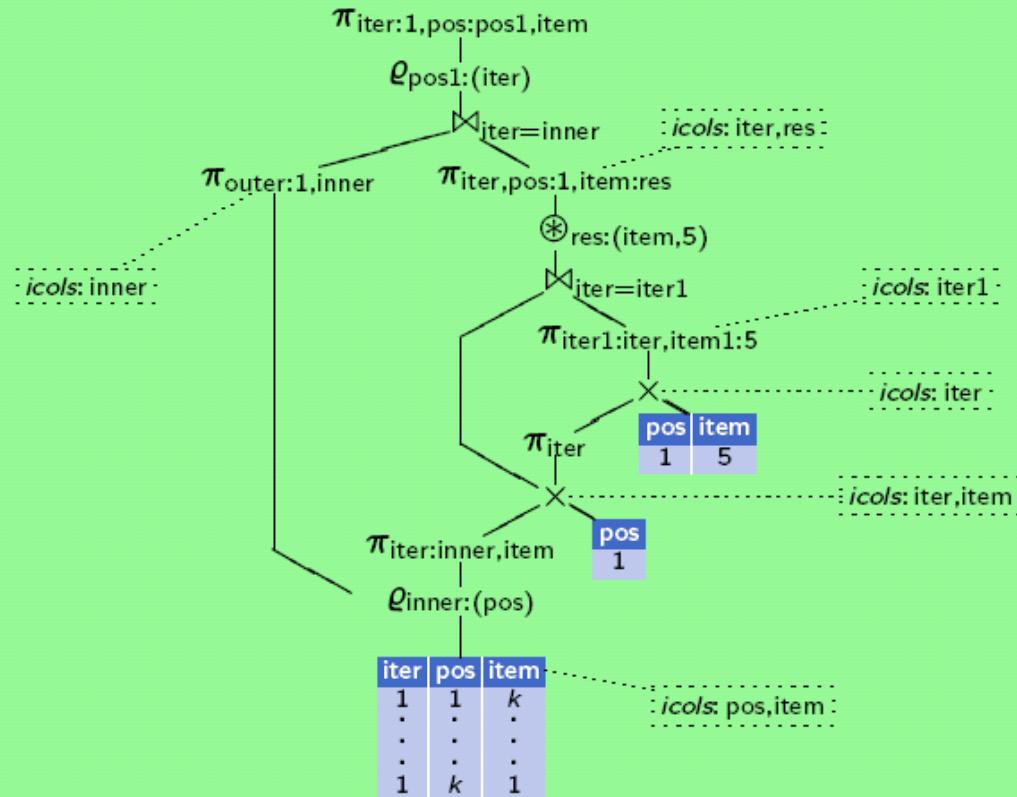
# Peephole Optimization

[Grust, XIME-P 2005]

Input: XQuery

```
for $x in (k, ..., 2, 1)
    return $x * 5
```

Plan Property: Strictly Required Columns



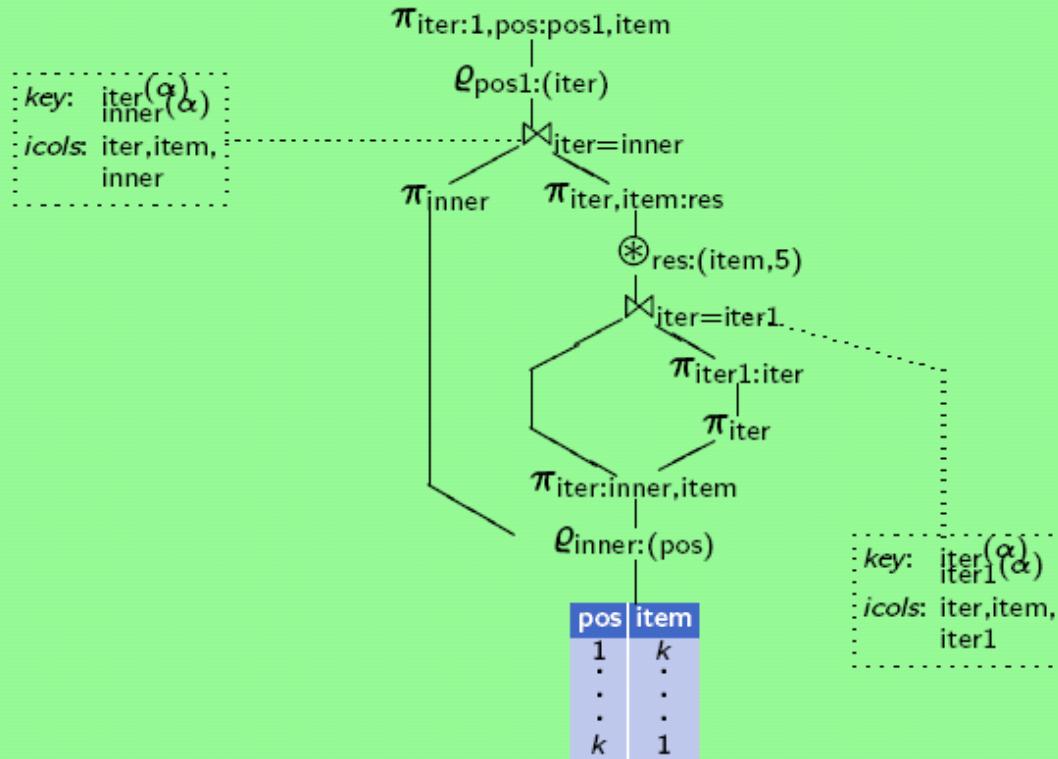
# Peephole Optimization

[Grust, XIME-P 2005]

Input: XQuery

```
for $x in (k, ..., 2, 1)
  return $x * 5
```

## Plan Property: Key Candidate Columns



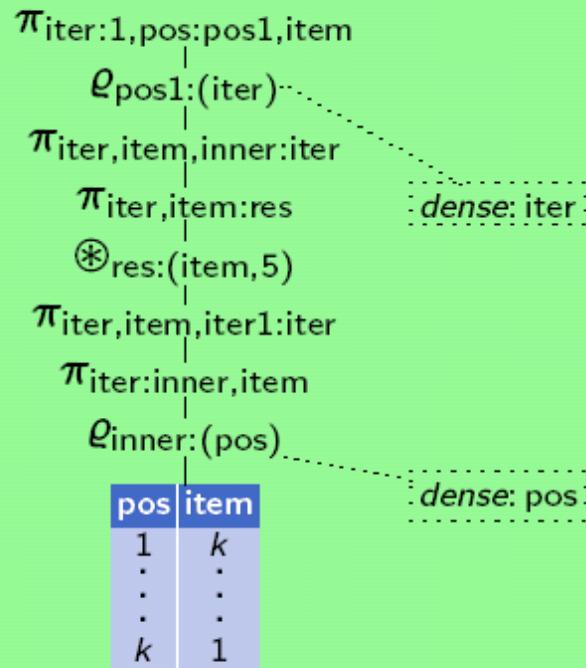
# Peephole Optimization

[Grust, XIME-P 2005]

Input: XQuery

```
for $x in (k, ..., 2, 1)
  return $x * 5
```

## Plan Property: Dense Columns



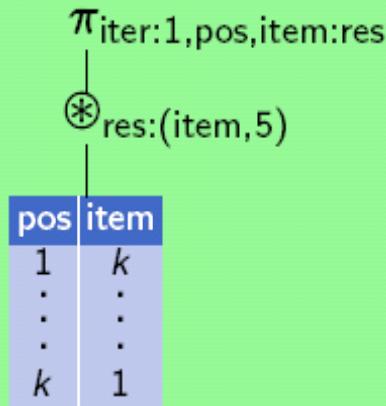
# Peephole Optimization

[Grust, XIME-P 2005]

Input: XQuery

```
for $x in (k, ..., 2, 1)
    return $x * 5
```

## Final Plan



# Peephole Optimization

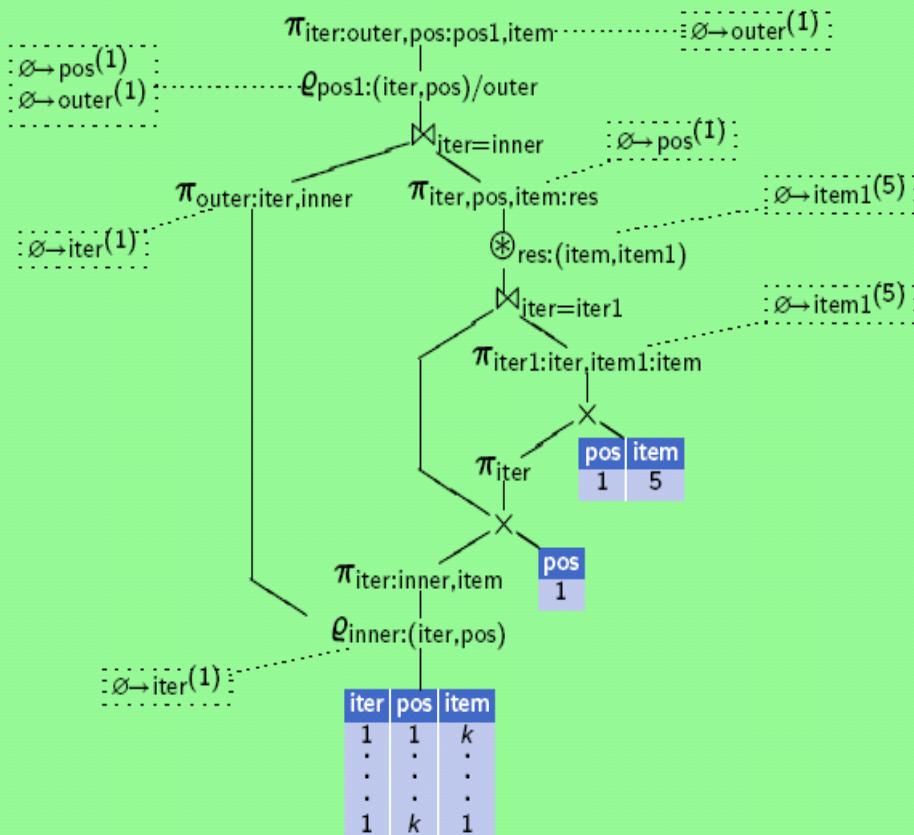
## [Grust, XIME-P 2005]

## Input: XQuery

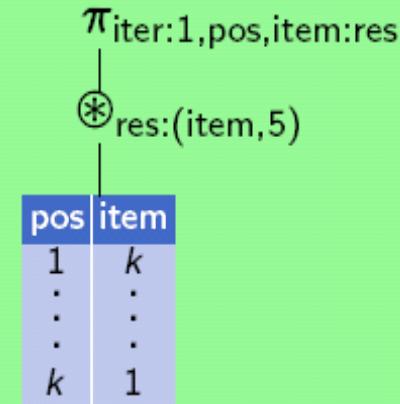
```
for $x in (k, ..., 2, 1)
    return $x * 5
```

- Plan simplification

## Plan Property: Constant Columns



## Final Plan



# Peephole Optimization

[Boncz et al., SIGMOD 2006]

- **Sort Avoidance**

generated by DENSE RANK **pos** ORDER BY **pos** PARTITION BY **iter**

by tracking secondary ordering properties [**pos|iter**], [Wang&Cherniack, VLDB'03]

iter	pos	item
1	4	X
1	5	Y
2	10	Z
3	1	A
3	2	B
3	4	C



**[iter, pos]**

# Peephole Optimization

[Boncz et al., SIGMOD 2006]

- **Sort Avoidance**

generated by DENSE RANK **pos** ORDER BY **pos** PARTITION BY **iter**

by tracking secondary ordering properties [**pos|iter**], [Wang&Cherniack, VLDB'03]

<b>iter</b>	<b>pos</b>	<b>item</b>
1	4	X
1	5	Y
2	10	Z
3	1	A
3	2	B
3	4	C



<b>iter</b>	<b>pos</b>	<b>item</b>
1	1	X
1	2	Y
2	1	Z
3	1	A
3	2	B
3	3	C

**[iter, pos]**

# Peephole Optimization

[Boncz et al., SIGMOD 2006]

- **Sort Avoidance**

generated by DENSE RANK **pos** ORDER BY **pos** PARTITION BY **iter**

by tracking secondary ordering properties **[pos|iter]**, [Wang&Cherniack, VLDB'03]

→ hash-based (streaming) DENSE\_RANK

<b>iter</b>	<b>pos</b>	<b>item</b>
1	4	X
2	10	Z
3	1	A
1	5	Y
3	2	B
3	4	C



<b>iter</b>	<b>pos</b>	<b>item</b>
1	1	X
2	1	Z
3	1	A
1	2	Y
3	2	B
3	3	C

**[pos|iter]**

# Peephole Optimization

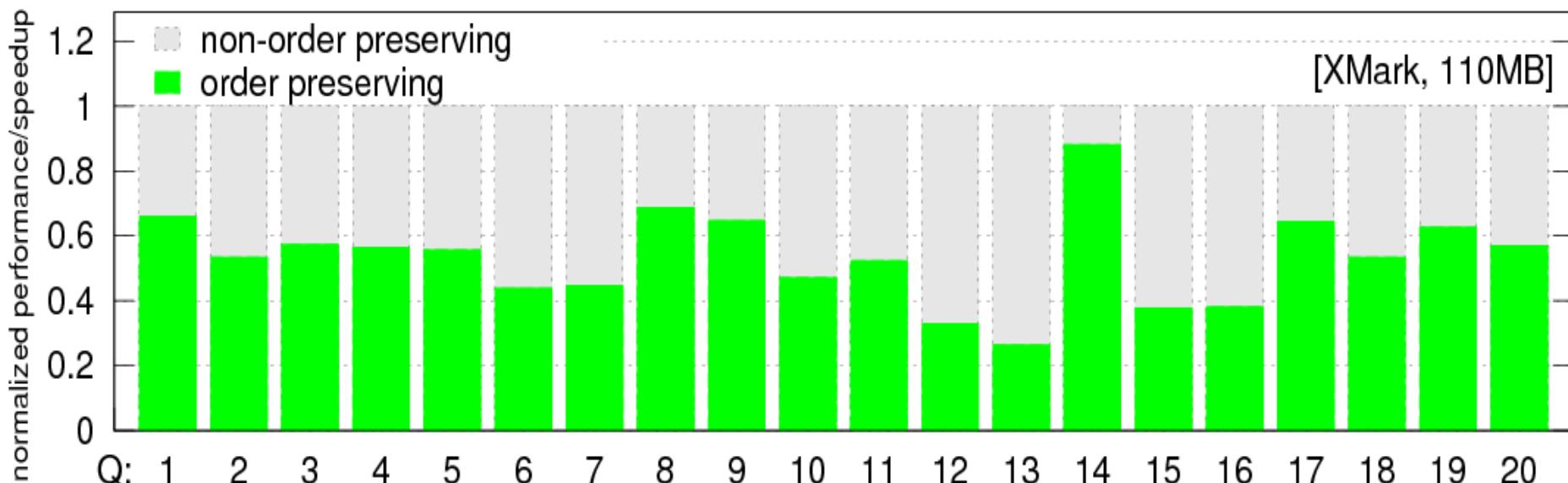
[Boncz et al., SIGMOD 2006]

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- **Sort Reduction**

if [iter,item] order is required, and [iter] only is present

use a **refine-sort** rather than a full sort.

→ pipelinable sort

# Peephole Optimization

[Boncz et al., SIGMOD 2006]

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→ hash-based (streaming) DENSE\_RANK

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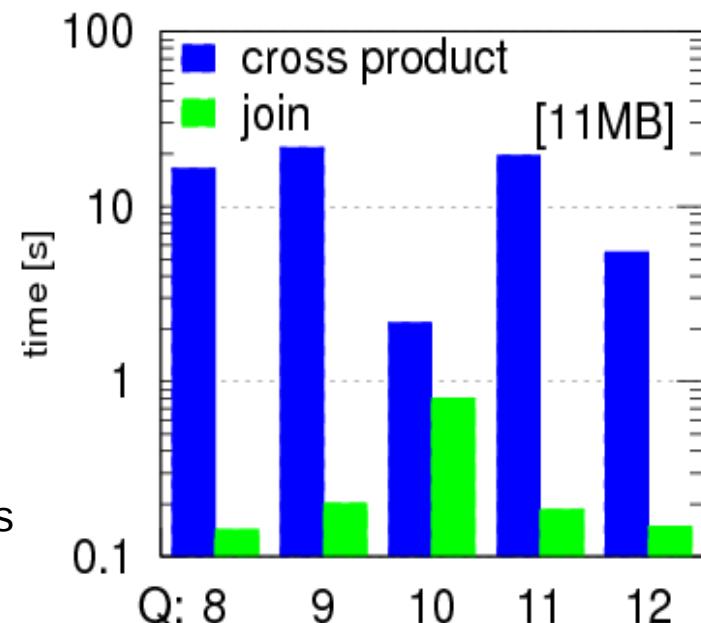
use a **refine-sort** rather than a full sort.

→ pipelinable sort

- **Join Detection**

detect cartesian products as multi-valued dependencies

in the presence of a theta-selection → theta-join



# Loop-lifted XPath Steps

Many algorithms have been proposed & studied for XPath evaluation:

- Dataguide based,
- Structural Join,
- Staircase Join,
- Holistic Twig Join

IN: sequence of context nodes in (doc order)

OUT: sequence of document nodes (unique, in doc order)

# Loop-lifted XPath Steps

In XQuery, expressions generally occur inside FLWR blocks, i.e. inside a for-loop

```
for $x in doc()//employee  
    $x/ancestor::department
```

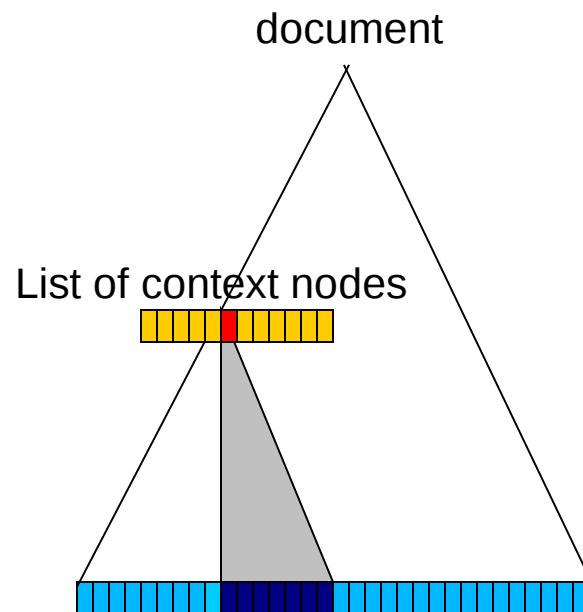
## Choice:

- call XPath algorithm N times, accessing document and index structures N times.
- use a **loop-lifted** algorithm:

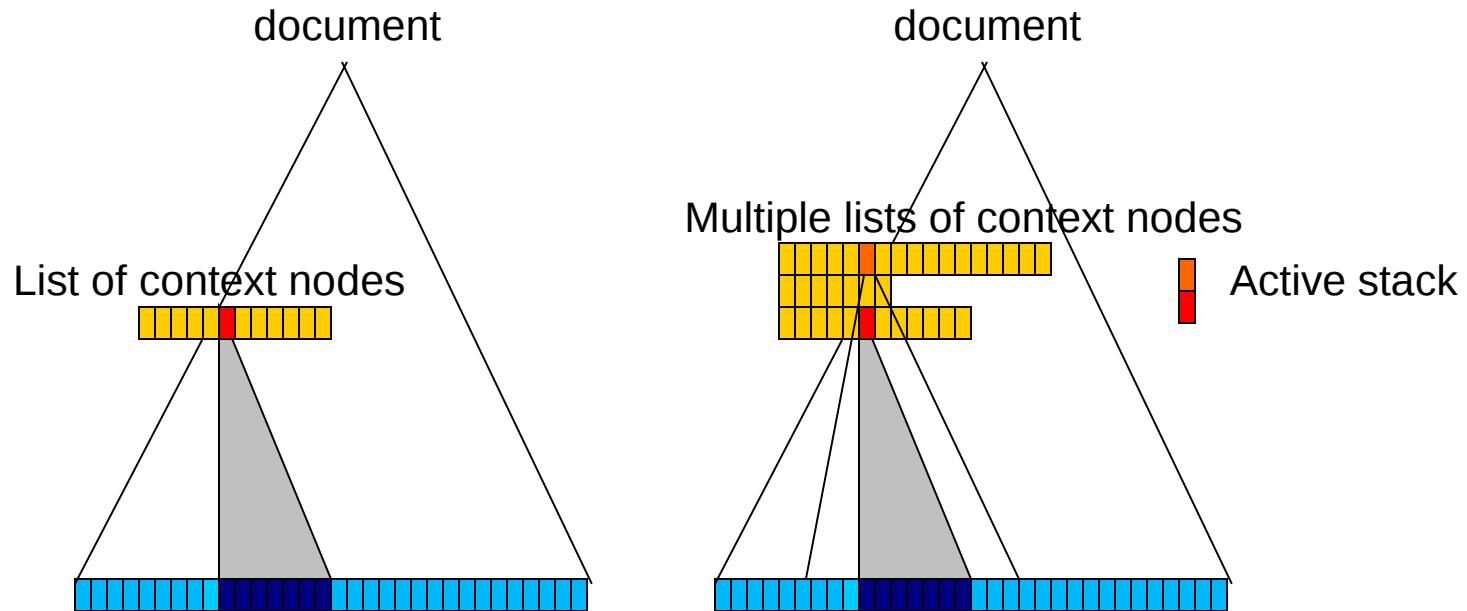
IN: for each iteration, a sequence of context nodes

OUT: for each iteration, a sequence of document nodes  
(per iteration unique, in doc order)

# Staircase join



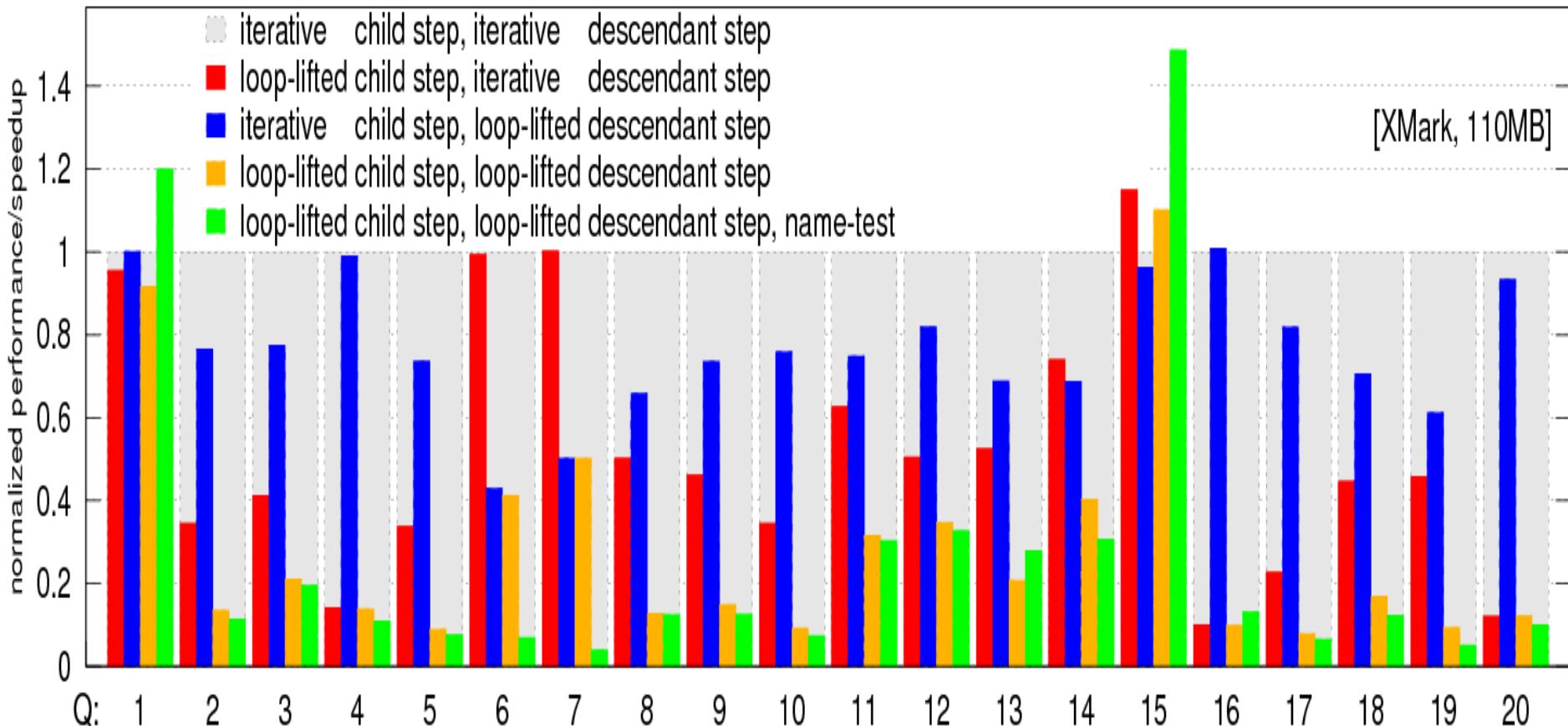
# Loop-lifted staircase join



Adapt:  
**pruning, partitioning and skipping** rules  
to correctly deal with multiple context sets

# Loop-lifted staircase join

Results on the 20 XMark queries:



# Performance Evaluation

Extensive performance Evaluation on XMark

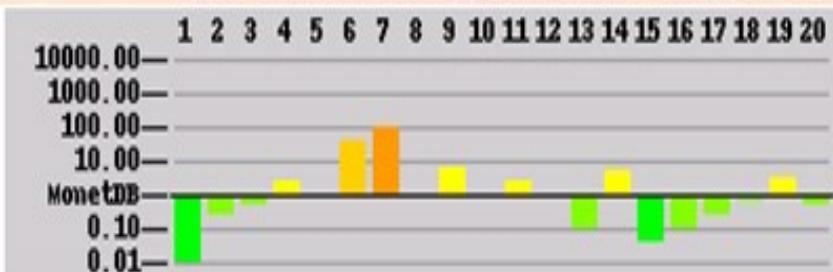
- data sizes 110KB, 1MB, 11MB, 110MB, 1.1GB, 11GB
- MonetDB/XQuery, Galax0.6, X-Hive 6.0, Berkeley DB XML 2.0, eXist
- 8GB RAM

Extensive XMark performance Literature Overview

- IPSI-XQ v1.1.1b , Dynamic Interval Encoding , Kweelt , QuiP, FluX , TurboXPath, Timber, Qizx/Open (Version 0.4/p1), Saxon (Version 8.0), BEA/XQRL, VX
- Crude comparison (normalized by CPU SPECint)

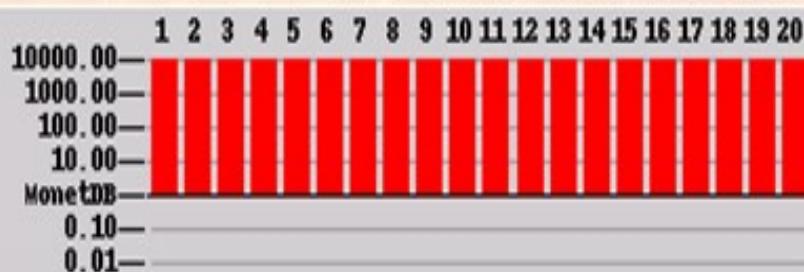
# XMark Benchmark

**1MB XML**

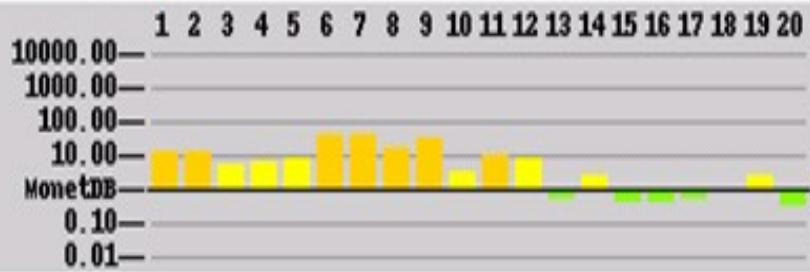


Galaxy

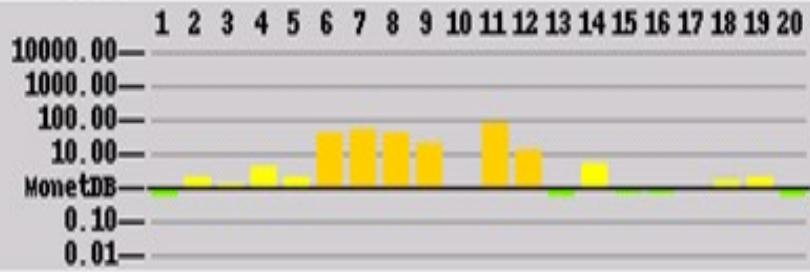
**1GB XML**



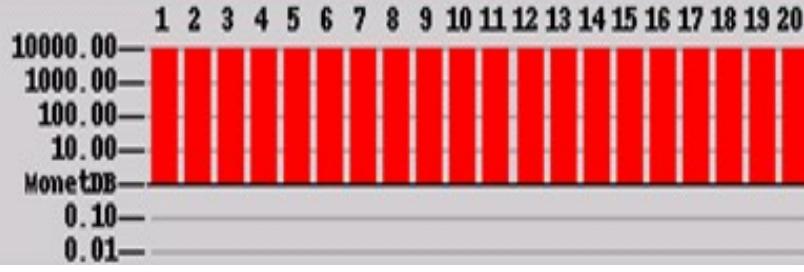
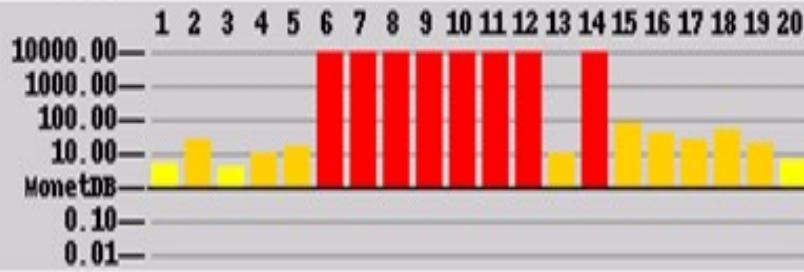
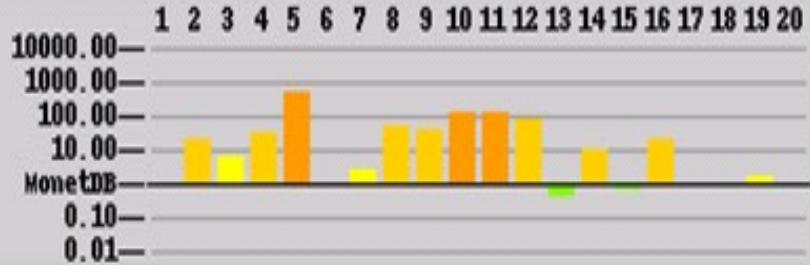
X-Hive



Berkeley  
DB XML



eXIST



# More Benchmarks & Performance Results?

- <http://monetdb.cwi.nl/XQuery/Benchmark/>
- S. Manegold: “An Empirical Evaluation of XQuery Processors”,  
*Information Systems*, 33:203-220, April 2008.  
<http://www.cwi.nl/htbin/ins1/publications?request=abstract&key=Ma:IS:08>