## Advanced Divide-and-Conquer Algorithms for Computing Two-Hop Covers for Large Collections of XML Documents

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## HOPI

- index for XML document collection, use Two-Hop Cover concept (Cohen et al.) => compressed storage of transitive closure (on element level)

$$
\begin{aligned}
& \rightarrow \mathrm{w} \rightarrow \\
& \mathrm{~L}_{\text {out }}(\mathrm{u})=\{\mathrm{w}, \ldots\} \\
& \mathrm{L}_{\text {in }}(\mathrm{v})=\{\mathrm{w}, \ldots\}
\end{aligned} \quad \mathrm{w} \text { center node } \mathrm{u}(\mathrm{u}) \cap \mathrm{L}_{\mathrm{in}}(\mathrm{v}) \neq \varnothing \Leftrightarrow \text { there is a connection from } u \text { to } \mathrm{v} \text {. }
$$

## Computation of HOPI and goals

- compute HOPI using divide-and-conquer algorithm:
- Compute the partitioning for the document collection
- Compute the single partition covers
- Join the partition covers
- Our goals:
- reduce the size of the computed 2-hop cover
- reduce the time needs


## Partitioning process - example for frontier



So far:
Edge weight: count the number of links in between two documents

## Variation of edge weights

New:

- \#connections induced by two documents: A"*D"
- \#elements connected by two documents: A‘+D‘


Computation of A',, DD: eease \{|kiedquostgrauder)[ICDE2005]

## New connection based partitioner

- old approach counts number of elements in each partition => no uniform distribution of connections over partitions
- new approach creates transitive closure of partition's element graph => limit: size of transitive closure
- Two variants:
- optimistic approach: assume that candidate document fits into the current partition (with possibility to do rollback)
- pessimistic approach: estimate the number of new connections


## Estimation

before candidate document is assigned to current partition:

- compute transitive closure for element graph of candidate document
- consider all links ( $\mathrm{v}, \mathrm{w}$ ) from candidate document
to current partition and vice versa


TC of current partition
TC of candidate document
connect every ancestor of $v$ with every descendant of $w$ : estimation $=3 * 4=12$ is correct.
But: we can also over- and underestimate!

## Optimistic partitioning with rollback


current partition current document

| TC | Log |
| :---: | :---: |
| $(1,1,0)$ | new ( $5,5,0$ ) |
| $(1,2,1)$ | new (1,5,1) |
| $(1,3,2)$ | new ( $5,4,1$ ) |
| $(1,4,8)$ | update (1,4,3) |
| (2,2,0) |  |
| (2,8,0) | Rollback finis |
| (2, $\mathbf{2}, \mathbb{1}$ ) |  |
| ( $3,3,4$ ) |  |
| ( $3, \mathbf{3}, \mathbb{1}$ ) |  |
| $(\mathbf{3}, \mathbf{3}, \mathbb{Q})$ |  |
|  |  |
| (8,5,0) |  |
| (5, ¢, © $)$ |  |
| $(5,5,0)$ |  |

## How do we connect the partition covers?

- for each cross partition link (u,v):
- get known ancestors of u within 2-hop labeling
- get known descendants of $v$ within 2-hop labeling
- choose v as center node for connecting the partition covers



## Connecting the partition covers

Join partition covers along cross-partition links in different orders:
Up to now:

- Order by (linktarget ID, linksource ID) ascending New:
- Order by A**D، descending
- Order by A*D‘ ascending
- Order by $A^{‘}+D^{‘}$ descending
- Order by $A^{〔}+D^{`}$ ascending
- Order by max $\left\{A^{\prime}, D^{\prime}\right\}$ descending
- Order by min $\left\{A^{\prime}, D^{\prime}\right\}$ ascending



## Experimental setup

- DBLP fragment with 6,210 documents
- 168,991 elements, 162,781 edges, 25,368 links
- Transitive closure: 344,992,370 connections
- CPU: Intel Pentium 4, 3 GHz
- RAM: 1 GB
- HDD: 120 GB
- OS: Windows XP Professional
- VM: SUN Java 1.4.2
- DBS: Oracle 9.2


## Comparing the old and new partitioning approach

- old partitioning approach computes much faster (3 min vs. 8 min - 30 min )
- new partitioning approach fills the partitions in a balanced way
=> better scalability when computing partition covers simultaneously

element based partitioning

connection based partitioning


## Variation of cover join order

Base line: element based partitioning approach, edge weight: \#links

| cover join order | cover size | time [sec] |
| :---: | :---: | :---: |
| (oid2, oid1) ascending | $16,750,820$ | 193,390 |

Connection based partitioning approach, edge weight: \#links

| cover join order | cover size | time [sec] |
| :---: | :---: | :---: |
| (oid2, oid1) ascending | 16,649,966 | 250,589 |
| A** ${ }^{\text {d }}$ descending | 13,843,540 | 120,959 |
| A**D ascending | 21,802,078 | 229,417 |
| max\{ $\left.A^{\prime}, D^{\prime}\right\}$ descending | 12,186,321 | 158,224 |
| min\{ $\left.A^{\prime}, D^{\prime}\right\}$ ascending | 16,771,056 | 212,919 |
| $A^{\prime}+D^{`}$ descending | 12,186,889 | 107,121 |
| A‘+D‘ ascending | 22,446,682 | 207,797 |

## Variation of edge weights

Base line: element based partitioning approach, cover join order: (oid2, oid1) asc.

| edge weight | cover size | time [sec] |
| :---: | :---: | :---: |
| \#Links | $16,750,820$ | 193,390 |

Connection based partitioning approach, cover join order: max\{A', $\left.D^{\prime}\right\}$ desc.

| edge weight | cover size | time [sec] |
| :---: | :---: | :---: |
| \#Links | $12,186,321$ | 158,224 |
| A‘'D $^{‘}$ | $10,186,488$ | 91,528 |
| A‘*D $^{‘}$ | $10,410,923$ | 104,534 |

## Variation of transitive closure size

- cover size shrinks with increasing transitive closure size
- required time shrinks with increasing transitive closure size (up to a certain amount of connections)

| \#conns/part. | cover size | time[sec] |
| :---: | :---: | :---: |
| 1 Mio. | $10,186,488$ | 91,528 |
| 5 Mio. | $9,606,602$ | 76,649 |
| 10 Mio. (*) | $9,444,487$ | 77,478 |

(*): computation on server due to large memory needs during partitioning

## Summary experiments

best approach in our experiments:

- connection based partitioning, $\mathrm{TC}_{\max }=10 \mathrm{Mio}$. connections, edge weight: $A^{〔}+D^{`}$, cover join order: max\{A‘, $\left.\mathrm{D}^{〔}\right\}$ descending
with respect to baseline:
- size of 2-hop cover decreased from 16,750,820 to 9,444,487 entries representing 344,992,370 connections
=> savings ~44\%
=> compression ratio of 36.5
- simultaneously time need decreased from 193,390 sec to 77,478 sec
=> savings ~60\%


## Future work

- multithreaded connection based partitioner
- multithreaded computation of partition covers
- local improvement methods for existing valid partitionings
(Kernighan-Lin, Fiduccia-Mattheyses, Simulated Annealing, ...)
$\Rightarrow$ less cross partitioning links
- usage of 2-hop cover algorithm in general graph applications, beyond usage of indexing xml document collections


## Overestimation


evaluate ( $u, w$ ): uithas 32 ancestors, ww hnas 4 descemdlants.
I.e. estimation $=Z^{*} 4=\$ 2$ conneetitions.

Together with previous estimation: 20 connections.
Estimation too high: we only need 12 connections
Document fits into partition but is rejected => too small partitions

## Underestimation



TC of candidate document TC of current partition

I.e. estimation=2* $2=2$ connections.

Together with previous estimation: 6 connections.
Estimation too low: we need 7 connections - ( $u, x$ ) not considered => partition gets too big

## Compakteltitbonograpłand D‘



We want to compute the number of ancestors $\mathrm{A}^{\prime}$ and descendants D‘ in the whole collection
Cost for computation of transitive closure too high!
=> Approximation by skeleton graph

## Approximation of A‘ and D‘ (collectionwide)

- BFS starting with each node on skeleton graph
- Starting node gets descendants D of each visited node
- Visited node gets ancestors A of starting node

$D^{\prime}(1)=D(1)+D(2)+D(3)+D(4)=6$ approximates too big, but always upper bound. Correct value: $D^{\prime}(1)=D(1)+D(2)+D(4)=5$.

