### Fast On-Line Index Construction by Geometric Partitioning

Nicholas Lester, Alistair Moffat, and Justin Zobel

Proceedings of the 14th ACM International Conference on Information and Knowledge Management. ACM, 2005.

#### Hybrid Index Maintenance for Growing Text Collections

Stefan Büttcher, Charles LA Clarke, and Brad Lushman

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Presented by Matt Chaney CS 834 - Presentation 2

#### Inverted Indexes

- Similar to index in book
- Composed of two main parts
  - Vocabulary
  - Set of inverted lists, some with extra info
    - Frequencies
    - Position
- Normally stored on disk as a single, contiguous partition

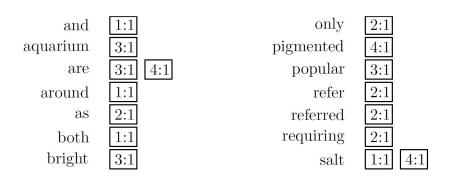


Fig. 5.5. Inverted Index with Counts. Yang, Christopher C. "Search engines information retrieval in practice." (2010).

#### Problem

- Adding new documents challenging
- Two basic strategies
  - o Off-Line
    - Index creation simple process
    - Lag between document discovery and indexing
  - On-Line
    - When delay cannot be tolerated
    - Index always queryable and up to date
    - Adds complexity to system
- On-Line Merge Process
  - In-Memory for new documents
  - On-Disk for existing index

## Index Maintenance Algorithms

#### Rebuild

- Simplest
- Reprocess entire index on disk and switch once complete
- $\circ$  10<sup>10</sup> total items with 10<sup>8</sup> in-memory requires 17.1 trillion operations

#### Remerge

- Avoids reprocessing already sorted lists
- Uses bufferloads to append new items to each on-disk inverted list
- Read sequentially and written to new location while inserting in-memory postings
- o 10<sup>10</sup> total items with 10<sup>8</sup> in-memory require 0.8 trillion operations

## Index Maintenance Algorithms

#### In-place Update

- Write in-memory postings to end of existing lists
- When on-disk full move to new location
- Can employ disk over-allocation to avoid excessive file moves
- $\circ$  10<sup>10</sup> total items with 10<sup>8</sup> in-memory require 0.3 trillion operations, but...
- Metric is misleading
  - Memory overhead 60% allocated and not used
  - Only counts data movement Each term generates disc op → +1 trillion more ops

#### Multiple Partitions

- Create discontiguous fragments as inverted lists grow
- Similar to In-Place without reprocessing old lists

## Geometric Partitioning

- Controlled number of partitions
- Two approaches
  - Fixed partition size, r
  - Fixed number of partitions, p
- Blends the Remerge and Multiple Partitions approach
  - o Better construction time than Remerge
  - Better query processing time than Multiple Partitions
- New documents in smaller partitions
- Old documents in larger partitions

## Geometric Partitioning

- Controlled size, static *r* 
  - Ex. partition 3 is 2x size of partition 2, which is
     2x size of partition 1
  - Most recent documents go into smallest partition
- Leads to a hierarchical merging scheme

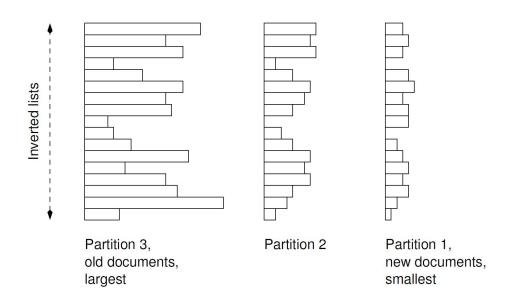


Fig. 1. Geometric Partitioning example.
Lester, Nicholas, Alistair Moffat, and Justin Zobel. "Fast on-line index construction by geometric partitioning." Proceedings of the 14th ACM international conference on Information and knowledge management. ACM, 2005.

Partition 3	Partition 2	Partition 1	Partition 0
0	0	0	 

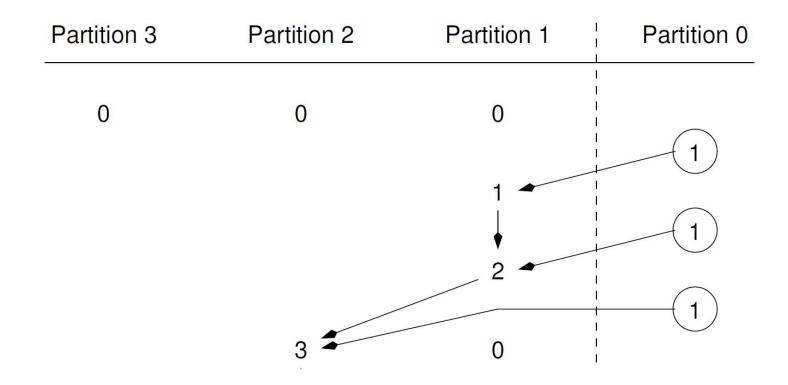
Partition 3	Partition 2	Partition 1	Partition 0
0	0	0	1

Partition 3	Partition 2	Partition 1	Partition 0
0	0	0	
		1	

Partition 3	Partition 2	Partition 1	Partition 0
0	0	0	
		1	
		   	1

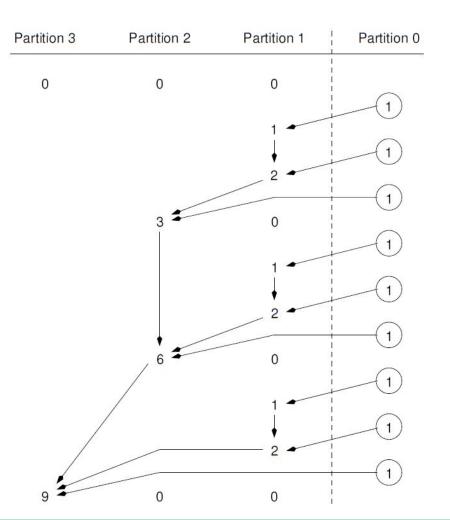
Partition 3	Partition 2	Partition 1	Partition 0
0	0	0	
		1 4	1

Partition 3	Partition 2	Partition 1	Partition 0
0	0	0	
		1	$\begin{array}{c} (1) \\ (1) \end{array}$
		2	
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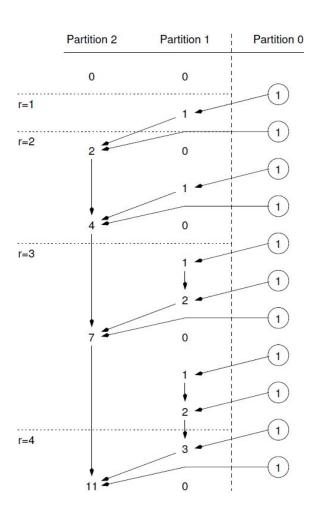
## Merge with fixed *r*

Figure 2. Merge with fixed r = 3. Lester, Nicholas, Alistair Moffat, and Justin Zobel. "Fast on-line index construction by geometric partitioning." Proceedings of the 14th ACM international conference on Information and knowledge management. ACM, 2005.



## Merge with fixed *p*

Figure 3. Merge with fixed p = 3. Lester, Nicholas, Alistair Moffat, and Justin Zobel. "Fast on-line index construction by geometric partitioning." Proceedings of the 14th ACM international conference on Information and knowledge management. ACM, 2005.



## Analysis - Construction vs Access

$\overline{r}$	Build cost	Access cost
2	0.29	3.6
3	0.31	3.1
4	0.32	2.9
6	0.34	2.6
8	0.35	2.4
12	0.39	2.2
16	0.42	2.0

Table 1. Construction cost versus access cost. Lester, Nicholas, Alistair Moffat, and Justin Zobel. "Fast on-line index construction by geometric partitioning." Proceedings of the 14th ACM international conference on

Information and knowledge management. ACM, 2005.

## **Analysis - Index Construction Time**

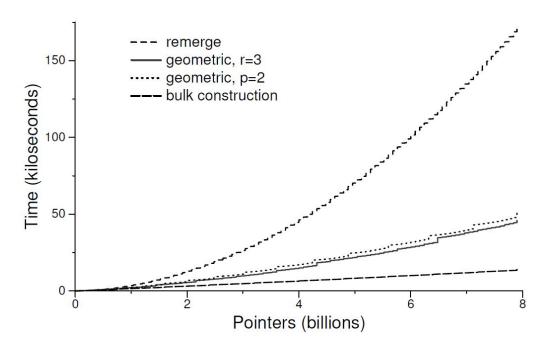
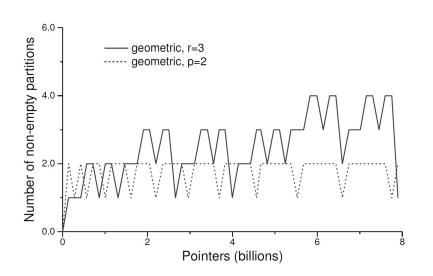


Figure 4. Build time vs number of pointers.

Lester, Nicholas, Alistair Moffat, and Justin Zobel. "Fast on-line index construction by geometric partitioning."

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## Analysis - Fixed r vs Fixed p



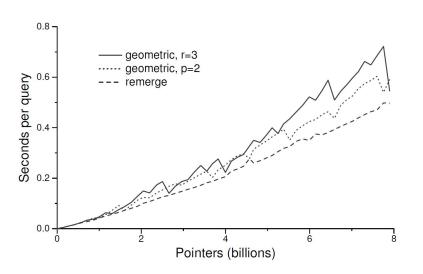


Figure 5. Query time versus number of pointers.

Lester, Nicholas, Alistair Moffat, and Justin Zobel. "Fast on-line index construction by geometric partitioning."

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#### Conclusions

- Index construction cost significantly reduced versus standard contiguous inverted indexes
- 100GB collection index construction 4x faster than Remerge
- As index grows, speed gain increases
  - Adding last Gig of collection takes
    - 1 hour with Remerge
    - 9 minutes with Geometric Partitioning
- Query time only 20% slower than Remerge

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#### In-Place Index Maintenance

- In-memory data appended to on-disk lists without merging
- Generally requires relocating on-disk lists
  - Can be costly with large collections
- Over-allocating can reduce cost

### Merge-Based Index Maintenance

#### Immediate Merge - Rebuild/Remerge

- Maintains one in-memory and one on-disk index
- When in-memory full → merge with on-disk
- Re-processes entire on-disk image
- Still performs better than In-Place

#### Sqrt Merge

 $\circ$  Geometric Partitioning with fixed p = 2

#### Logarithmic Merge

Geometric Partitioning with fixed r

#### Motivation

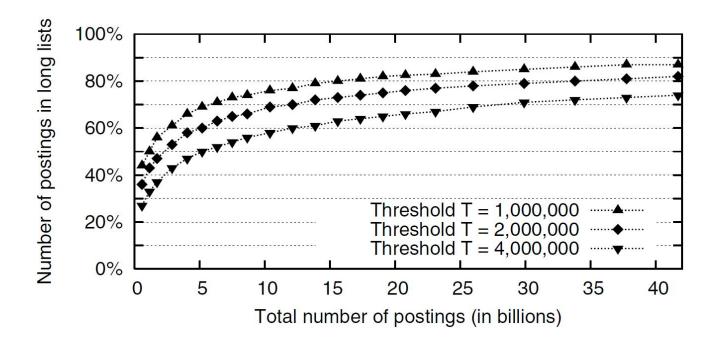


Figure 2. Total number of postings in the index vs. number of postings in long lists.

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## First Hybrid Strategy

- Combines Merging and In-Place approaches
- Quantity T designates short or long term list length
  - Short lists managed with merge strategy
  - Long lists managed with in-place using filesystem, stored contiguously
- Avoids costly on-disk relocations of long posting lists
- Combined hybrid versions ("C" indicates contiguous lists)
  - Hybrid Immediate Merge → HIM<sub>C</sub>
  - Hybrid Sqrt Merge → HSM<sub>C</sub>
  - Hybrid Logarithmic Merge → HLM<sub>C</sub>

## First Hybrid Strategy Flaws

- File system in-place update hard to analyze
  - File system operation differs system to system
  - Cannot be sure if posting lists are actually contiguous

- Static per-term T value inflexible for ever growing index
  - Highly sensitive to the amount of main memory available

## New Hybrid Strategy

- Terms lists split into short and long, non-contiguous portions
  - Query time suffers, but disk reads can be amortized over longer read op
  - Relative query time increases only 5% over old hybrid

- New Hybrid ("NC" indicates non-contiguous lists)
  - Hybrid Immediate Merge → HIM<sub>NC</sub>
  - Hybrid Sqrt Merge → HSM<sub>NC</sub>
  - Hybrid Logarithmic Merge → HLM<sub>NC</sub>

## New Hybrid Strategy Illustrated

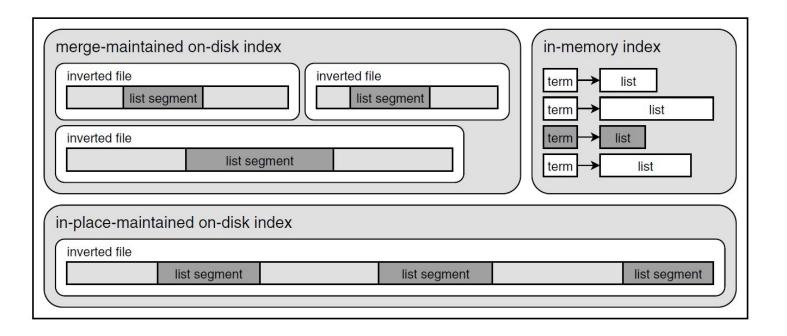
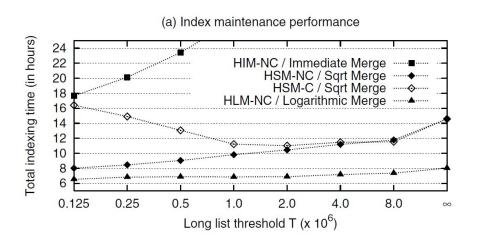


Figure 3. Index layout for a hybrid maintenance strategy with non-contiguous posting lists.

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## Indexing Time and Query Processing Performance



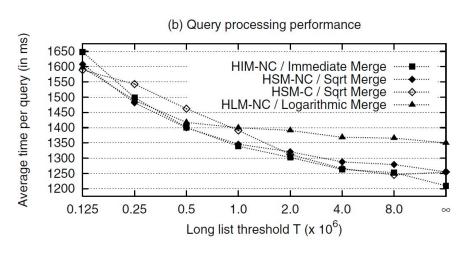


Figure 5. Index maintenance and query processing performance for different strategies with various parameter settings.

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## Memory Size versus Maintenance Speed

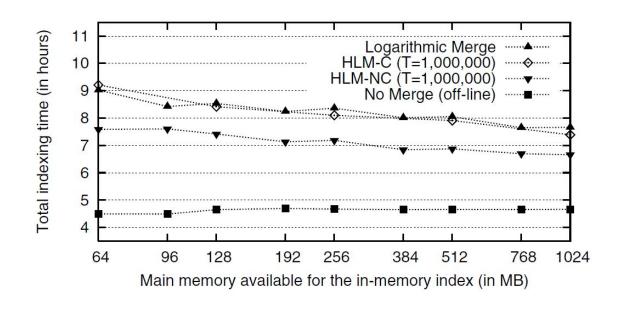


Figure 6. Impact of memory size on index maintenance performance.

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#### Conclusions

- New Hybrid approach outperforms previous index maintenance strategies including previous hybrid approach
- $HLM_{NC}$  require only  $\Theta(N)$  disk operations for text collection of size N
- Main shortfall is increased query times due to multiple partition fragments,
   future work could improve this metric with over-allocating disk space