



Adaptive Indexing: between Lazy but Lightweight Cracking and Eager but Expensive Merging

Pavlo Shevchenko Seminar on Modern Software Engineering and Database Concepts July 13, 2017





Table of Contents

Overview of Indexing

Definition of Adaptive Indexing

Goal

Background

Adaptive Indexing

Database Cracking Adaptive Merging Hybrid Approaches

Lessons Learned

Future Work





Database Indexes:

- help to decrease the query response time;
- structure optimized for search with references to original entries;
- precalculated before the first query arrives (offline indexing);
- used to be stored on disk in the form of B-Trees.





Database Indexes:

- help to decrease the query response time;
- structure optimized for search with references to original entries;
- precalculated before the first query arrives (offline indexing);
- used to be stored on disk in the form of B-Trees.

Issues:

in-memory databases ⇒ more lightweight structures;





Database Indexes:

- help to decrease the query response time;
- structure optimized for search with references to original entries;
- precalculated before the first query arrives (offline indexing);
- used to be stored on disk in the form of B-Trees.

Issues:

- in-memory databases ⇒ more lightweight structures;
- growing amounts of data ⇒ larger indexes;





Database Indexes:

- help to decrease the query response time;
- structure optimized for search with references to original entries;
- precalculated before the first query arrives (offline indexing);
- used to be stored on disk in the form of B-Trees.

Issues:

- in-memory databases ⇒ more lightweight structures;
- growing amounts of data ⇒ larger indexes;
- sophisticated queries ⇒ many indexes;





Database Indexes:

- help to decrease the query response time;
- structure optimized for search with references to original entries;
- precalculated before the first query arrives (offline indexing);
- used to be stored on disk in the form of B-Trees.

Issues:

- in-memory databases ⇒ more lightweight structures;
- growing amounts of data ⇒ larger indexes;
- sophisticated queries ⇒ many indexes;
- unpredictable behavior of users ⇒ hard to predicate an attribute.





Definition of Adaptive Indexing

Core Idea:

- automated maintenance and tuning of indexes by DBMS;
- continuous reorganization of the physical design during incremental online indexing.









Study the *evolution* of adaptive indexing:





Study the evolution of adaptive indexing:

• Past: Origin of adaptive indexing.





Study the *evolution* of adaptive indexing:

- Past: Origin of adaptive indexing.
- Present: Current approaches for adaptive indexing.





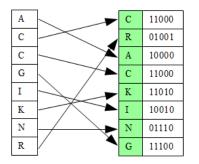
Study the *evolution* of adaptive indexing:

- Past: Origin of adaptive indexing.
- **Present:** Current approaches for adaptive indexing.
- Future: Unresolved questions regarding adaptive indexing.





Background. Partial Index



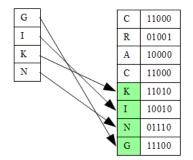


Figure: Full Index and Partial Index [1]





In contrast to *hard indexes*, which are created and managed by DBA, *soft indexes* are created, modified and dropped by a DBMS [2].





In contrast to *hard indexes*, which are created and managed by DBA, *soft indexes* are created, modified and dropped by a DBMS [2].

Workflow:





In contrast to *hard indexes*, which are created and managed by DBA, *soft indexes* are created, modified and dropped by a DBMS [2].

Workflow:

1. Collect information about the current state of a system.





In contrast to *hard indexes*, which are created and managed by DBA, *soft indexes* are created, modified and dropped by a DBMS [2].

Workflow:

- 1. Collect information about the current state of a system.
- **2.** Analyze this information and choose index candidates for materialization.





In contrast to *hard indexes*, which are created and managed by DBA, *soft indexes* are created, modified and dropped by a DBMS [2].

Workflow:

- 1. Collect information about the current state of a system.
- **2.** Analyze this information and choose index candidates for materialization.
- **3.** Create or drop some indexes based on this analysis.









- 1. Database Cracking [3]:
 - index maintenance is a byproduct of query processing;
 - continuous physical reorganization (cracking database into manageable pieces).





- 1. Database Cracking [3]:
 - index maintenance is a byproduct of query processing;
 - continuous physical reorganization (cracking database into manageable pieces).
- 2. Adaptive Merging [4]:
 - · adaptive nature of cracking;
 - better query response time and quicker adaption.





- 1. Database Cracking [3]:
 - index maintenance is a byproduct of query processing;
 - continuous physical reorganization (cracking database into manageable pieces).
- 2. Adaptive Merging [4]:
 - adaptive nature of cracking;
 - better query response time and quicker adaption.
- **3.** Hybrid Approaches [5]:
 - combine strength of database cracking and adaptive merging.





Database Cracking

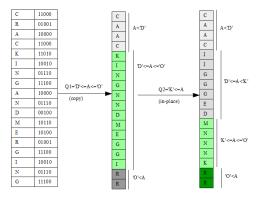
Main Idea: incrementally perform quicksort on a copy of a column using crack-in-three or crack-in-two.





Database Cracking

Main Idea: incrementally perform quicksort on a copy of a column using crack-in-three or crack-in-two.







Adaptive Merging

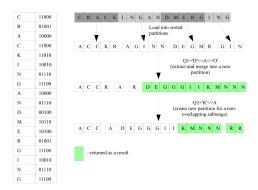
Main Idea: incrementally merge sort the relevant key ranges till a single sorted partition is created.





Adaptive Merging

Main Idea: incrementally merge sort the relevant key ranges till a single sorted partition is created.







Database Cracking vs. Adaptive Merging

Initial Run

Response

Time

Convergence





Database Cracking vs. Adaptive Merging

	Database Cracking	
Initial Run	slightly slower than	
IIIILIAI IXUII	scan	
Response	faster than scan after	
Time	1 st query	
Convergence	after 1k queries, 40%	
Convergence	slower than full index	





Database Cracking vs. Adaptive Merging ¹

	Database Cracking	Adaptive Merging
Initial Run	slightly slower than	approx. 5 times slower
	scan	than scan
Response	faster than scan after	first queries are slower
Time	1 st query	than scan
Convergence	after 1k queries, 40%	$10M \text{ records} \Rightarrow \text{approx}.$
	slower than full index	40 queries

¹experimental data taken from [5]









- **1.** Find the general structure:
 - load data into partitions;
 - extract relevant data from each partition (crack);
 - load data into final partitions.



- 1. Find the general structure:
 - load data into partitions;
 - extract relevant data from each partition (crack);
 - load data into final partitions.
- **2.** How to make components better?
 - Crack;
 - Sort;
 - · Radix.

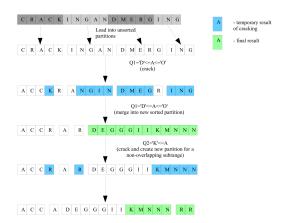


- **1.** Find the general structure:
 - load data into partitions;
 - extract relevant data from each partition (crack);
 - load data into final partitions.
- 2. How to make components better?
 - Crack;
 - · Sort;
 - · Radix.
- **3.** Combine the best components
 - Sort-*;
 - Crack-*;
 - Radix-*.





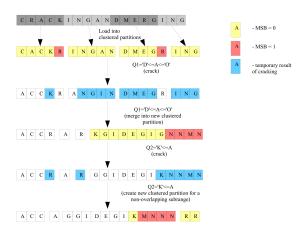
Crack-Sort Algorithm







Radix-Radix Algorithm







Lessons Learned

- Adaptive Indexing Is a Promising Concept;
- Database Cracking and Adaptive Merging Have Similar Nature;
- Crack-Sort and Crack-Radix Are Promising Alternatives;
- Hybrid Algorithms Can Be Further Combined.





Future Work

- Further Research on Adaptive Merging and Hybrid Approaches Needed;
- New Strategies for Hybrid Algorithms;
- Influence of Underlying Data Structure;
- Integration of Adaptive Indexing into Other Models;
- Extensions to the Methods.





Thank you for your attention!





Questions? Recommendations? Remarks?





Literature

- Seshadri, Praveen, and Arun Swami. Generalized partial indexes. Data Engineering, 1995. Proceedings of the Eleventh International Conference on. IEEE, 1995.
- **2.** Lühring, Martin, et al. Autonomous management of soft indexes. Data Engineering
- **3.** Idreos, Stratos, Martin L. Kersten, and Stefan Manegold. Database Cracking. CIDR. Vol. 7. 2007.
- Graefe, Goetz, and Harumi Kuno. Self-selecting, self-tuning, incrementally optimized indexes. Proceedings of the 13th International Conference on Extending Database Technology. ACM. 2010.
- **5.** Idreos, Stratos, et al. Merging whats cracked, cracking whats merged: adaptive indexing in main-memory column-stores. Proceedings of the VLDB Endowment 4.9, 2011.