



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





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Database Indexes:

- help to decrease the query response time;
- sorted column of data with references to the original records;
- precalculated before the first query arrives (offline indexing);
- used to be stored on disk in the form of B-Trees.





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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:





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- Present: Current approaches for adaptive indexing.





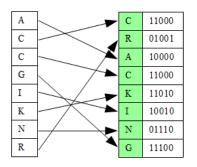
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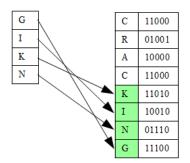
- Past: Origin of adaptive indexing.
- **Present:** Current approaches for adaptive indexing.
- Future: Unresolved questions regarding adaptive indexing.





Background. Partial Index









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





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Workflow:

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





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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.









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 - index maintenance is a byproduct of query processing;
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- 2. Adaptive Merging:
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 - better query response time and quicker adaption.





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





Database Cracking

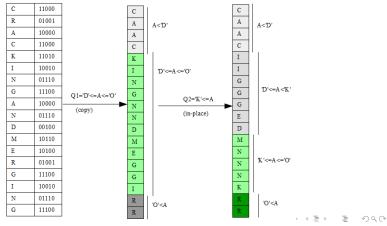
Main Idea: incrementally perform quicksort on a copy of a column using crack-in-three or crack-in-two.





Database Cracking

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Adaptive Merging

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



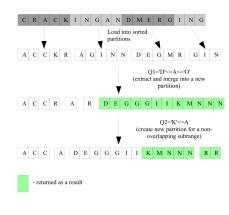




Adaptive Merging

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Database Cracking vs. Adaptive Merging

Initial Run

Response

Time

Convergence





Database Cracking vs. Adaptive Merging

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





Database Cracking vs. Adaptive Merging

	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









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



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- **2.** How to make components *strong*?
 - Crack;
 - Sort;
 - · Radix.

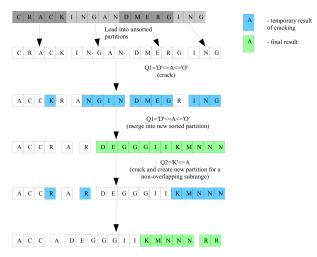


- **1.** Find the general structure:
 - load data into partitions;
 - extract relevant data from each partition (crack);
 - load data into final partitions.
- **2.** How to make components *strong*?
 - Crack;
 - · Sort;
 - · Radix.
- **3.** Combine *strong* components
 - Sort-*;
 - Crack-*;
 - Radix-*.





Crack-Sort Algorithm







Lessons Learned

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





Future Work

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





Thank you for your attention!





Questions? Recommendations? Remarks?





Literature

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