University of Wrocław: Algorithms for Big Data (Fall'19) 27/01/2020

Lecture 14: Caching

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1 Cache-aware algorithms [KW02]

DAM model:

• CPU

- cache (with fast access) of size M, M/B blocks of size B
- memory/disk (with slow access) of size ∞

Cost is associated with number of memory accesses. Assume CPU cost is negligible, and actual cost comes from moving things to i from cache.

Example 1: scanning N consecutive memory cells takes N/B memory transfers.

Example 2: Accessing random N memory cells takes N memory transfers.

Example 3: Binary search: $\log(N/B)$ (not really any significant gain)

- 1. B-trees, with branching factor $\Theta(B)$. Tree depth is $\log_B N$.
- 2. B^{ε} -trees: each node is a buffer of size B, with B^{ε} pivots. Insert amortizes and costs $\frac{\log_B N}{\varepsilon B^{1-\varepsilon}}$, queries cost $\frac{\log_B N}{\varepsilon}$. Deletes by tombstones.
- 3. Sorting $\mathcal{O}(\frac{N}{B}\log_{M/B}\frac{N}{B})$ by M/B-way mergesort.

2 Cache-oblivious algorithms [BFF⁺07]

Desing of cache-aware algorithms requires fine-tuning to parameters of the model. In modern systems we have many levels of caching...

The cache-oblivious model: do the algorithm that works well for (almost) any setting of parameters, as algorithm does not know B or M.

- Automatic block transfers triggered by word access with offline optimal block replacement.
- FIFO or LRU is 2-competetive given cache of $2 \times$ size.
- In fact it is OK to show that ANY caching strategy kind-of works.

Adapts to multi-level hierarchy.

Search trees: $\mathcal{O}(\log_B N)$. Static search tree - simulate B-tree on classic binary tree via memory placement. Take full binary tree on N nodes, cut it in half (height), so top is \sqrt{N} nodes (call it T) and bottom is \sqrt{N} trees $(T_1, \ldots, T_{\sqrt{N}})$. Place in memory: place T, then $T_1, \ldots, T_{\sqrt{N}}$, call recursively (van Emde Boas layout).

Analysis: cut in half until height piece size $\leq B$. So its also $\geq \sqrt{B}$. Height of a piece is between $\log B$ and $\frac{1}{2}\log B$. Number of pieces along path to root is $\leq \frac{\log N}{\frac{1}{2}\log B}$, and each piece is on at most 2 blocks.

COLA (Cache-Oblivious Lookahead Array)[BCR02]:

- $\log N$ levels
- i-th level contains 2^i elements, either completely full or completely empty
- each level is sorted

Insert: $\frac{\log N}{B}$ amortized. Naive searches: bin-search in each level, so $\log^2 N$. Refine by adding lookahead pointers: each fourth element from level i is preserved in level i+1, with pointer. Then searching incurs $\log N$ cost.

References

- [BCR02] Michael A. Bender, Richard Cole, and Rajeev Raman. Exponential structures for efficient cache-oblivious algorithms. In Peter Widmayer, Francisco Triguero Ruiz, Rafael Morales Bueno, Matthew Hennessy, Stephan J. Eidenbenz, and Ricardo Conejo, editors, Automata, Languages and Programming, 29th International Colloquium, ICALP 2002, Malaga, Spain, July 8-13, 2002, Proceedings, volume 2380 of Lecture Notes in Computer Science, pages 195—207. Springer, 2002.
- [BFF⁺07] Michael A. Bender, Martin Farach-Colton, Jeremy T. Fineman, Yonatan R. Fogel, Bradley C. Kuszmaul, and Jelani Nelson. Cache-oblivious streaming b-trees. In Phillip B. Gibbons and Christian Scheideler, editors, SPAA 2007: Proceedings of the 19th Annual ACM Symposium on Parallelism in Algorithms and Architectures, San Diego, California, USA, June 9-11, 2007, pages 81–92. ACM, 2007.
- [KW02] Markus Kowarschik and Christian Weiß. An overview of cache optimization techniques and cache-aware numerical algorithms. In Ulrich Meyer, Peter Sanders, and Jop F. Sibeyn, editors, Algorithms for Memory Hierarchies, Advanced Lectures [Dagstuhl Research Seminar, March 10-14, 2002], volume 2625 of Lecture Notes in Computer Science, pages 213–232. Springer, 2002.