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

Lecture 14: Caching

Lecturer: Przemysław Uznański Scribe: -

## 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  $\infty$

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.  $B^{\varepsilon}$ -trees: each node is a buffer of size B, with  $B^{\varepsilon}$  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<sup>+</sup>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-competitive 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

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- [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.