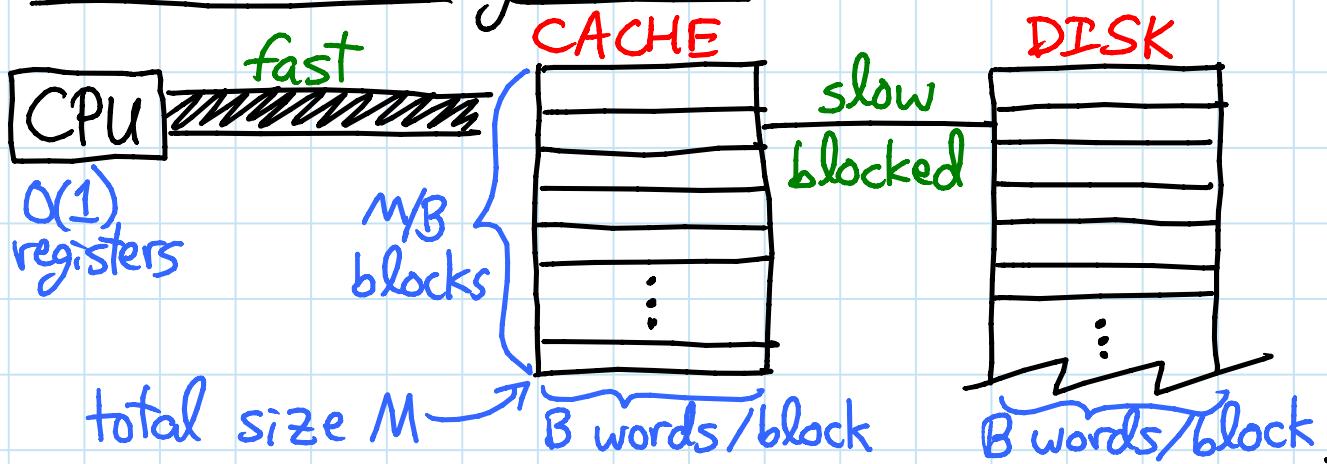


## TODAY: Cache-oblivious algorithms II

- search: binary  
B-ary  
cache-oblivious
- sorting: mergesorts  
cache-oblivious
- follow-on classes

### Recall:

- external-memory model:



- count # (block) memory transfers  $MT(N)$

- Cache-oblivious model:

- algorithm doesn't know  $B$  or  $M$
- automatic block loads & eviction of Least Recently Used (LRU) block

# Why LRU block replacement strategy?

$$LRU_M \leq 2 \cdot OPT_{M/2}$$

[Sleator & Tarjan 1985]

RESOURCE AUGMENTATION  
(changing M)

## Proof:

- partition block access sequence into maximal phases of  $M/B$  distinct blocks
- LRU spends  $\leq M/B$  memory transfers / phase
- OPT must spend  $\geq \frac{M}{2}/B$  memory transfers per phase: at best, starts phase with entire  $M/2$  cache with needed items, but there are  $M/B$  blocks during phase, so  $\leq$  half free

## ONLINE ALGORITHMS

- comparing regular "online" algorithm (can't see the future) against offline/prescient optimal algorithm
- changing M by factor of 2 doesn't affect bounds like  $O\left(\frac{N^2}{B\sqrt{M}}\right)$

Search: preprocess  $n$  elements in comparison model  
to support predecessor search for  $x$

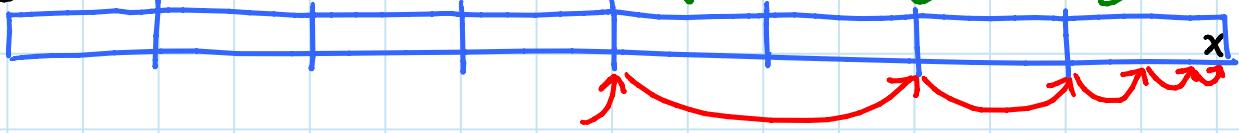
① B-trees support predecessor (& insert & delete)  
in  $O(\log_{B+1} N)$  memory transfers

$\overbrace{w_{\text{ant}} > 1}$  even if  $B=1$  ~but will ignore

- each node occupies  $\Theta(1)$  blocks
- height =  $\Theta(\log_B N)$
- need to know  $B$

Cache oblivious?

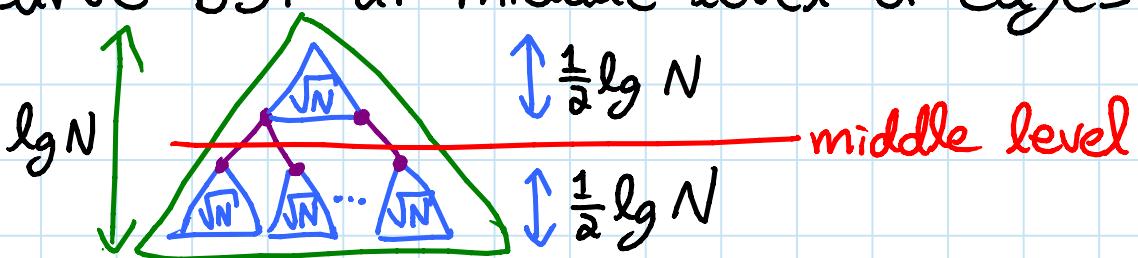
## ② Binary Search: divide & conquer is good, right?



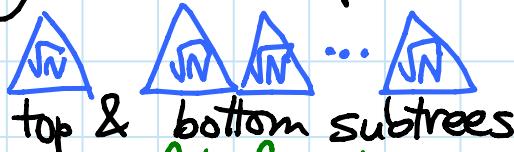
- different block  $\approx$  until in  $x$ 's block
- $$\Rightarrow \text{MT}(N) = \Theta(\lg N - \lg B) = \Theta(\lg \frac{N}{B}) \quad \text{SLOW}$$

## ③ van Emde Boas layout: [Prokop 1999]

- store  $N$  elements in complete BST
- carve BST at middle level of edges:

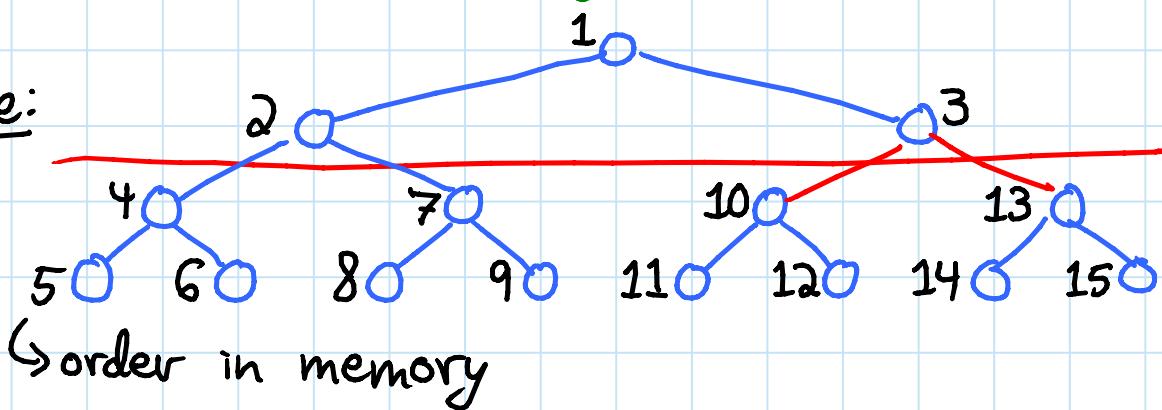


- recursively lay out the pieces & concatenate:



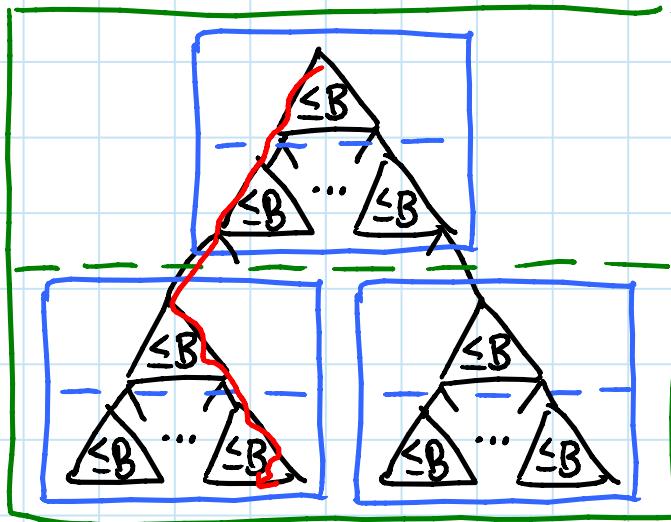
- like block matrix multiplication, order of pieces doesn't matter; just need each piece to be stored **consecutively**

### Example:



## Analysis of BST search in vEB layout:

- consider recursive level of refinement at which  $\Delta$  has  $\leq B$  nodes:



- height is between  $\frac{1}{2} \lg B$  &  $\lg B$   
*(binary searching on height)*  
 $\Rightarrow$  size is between  $\sqrt{B}$  &  $B$ )  
 $\Rightarrow$  any root-to-node path (search path)  
visits  $\leq \frac{\lg N}{\frac{1}{2} \lg B} = 2 \log_B N$   $\Delta^{'S}$
- each  $\Delta^{'}S$  occupies  $\leq 2$  memory blocks  
 $\Rightarrow \leq 4 \log_B N = O(\log_B N)$  memory transfers
- generalizes to height not a power of 2.  
B-trees of constant branching factor, &  
dynamic B-trees:  $O(\log_B N)$  insert/del.  
[Bender, Demaine, Farach-Colton 2000]  
(see 6.851: Advanced DSs)

## Sorting:

- ①  $N$  inserts into (cache-oblivious) B-tree  
 $\Rightarrow MT(N) = \Theta(N \log_B N)$  — NOT OPTIMAL  
 — by contrast, BST sort is optimal  $O(N \lg N)$

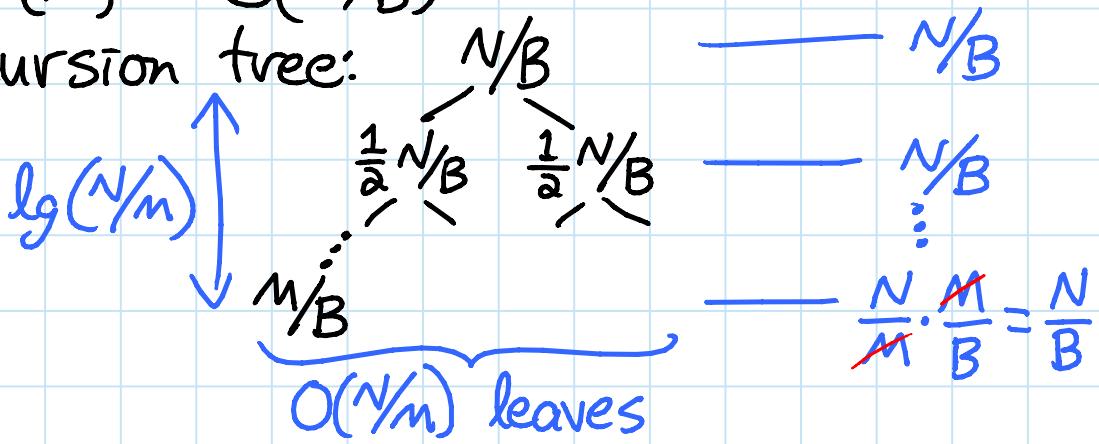
- ② (binary) mergesort is cache-oblivious

— merge is 3 parallel scans

$$\Rightarrow MT(N) = 2 \cdot MT\left(\frac{N}{2}\right) + O\left(\frac{N}{B} + 1\right)$$

$$MT(M) = O\left(\frac{M}{B}\right)$$

— recursion tree:



$$\Rightarrow MT(N) = \frac{N}{B} \lg \frac{N}{M} \leftarrow \frac{B}{\lg B} \text{ faster than ①!}$$

- ③  $M/B$ -way mergesort: (vs. binary mergesort)

- split array into  $M/B$  equal subarrays
- recursively sort each (contiguous)
- merge via  $M/B$  parallel scans  
(keeping one "current" block per list)

$$\Rightarrow MT(N) = \frac{M}{B} \cdot MT\left(\frac{N}{M/B}\right) + O(N/B + 1)$$

$$MT(M) = O(M/B)$$

$$\begin{aligned} \Rightarrow \text{height becomes } & \log_{M/B} \frac{N/M}{B} + 1 \\ &= \log_{M/B} \frac{N}{B} \frac{B}{M} + 1 \\ &= \log_{M/B} \frac{N}{B} - \cancel{\log_{M/B} \frac{M}{B}} + 1 \\ &= \log_{M/B} \frac{N}{B} \end{aligned}$$

$$\Rightarrow MT(N) = O\left(\frac{N}{B} \log_{M/B} \frac{N}{B}\right) \leftarrow \text{asymptotically optimal}$$

(in comparison model)

④ cache-oblivious sorting requires  
tall-cache assumption:

$$M = \Omega(B^{1+\varepsilon}) \text{ for some fixed } \varepsilon > 0$$

e.g.  $M = \Omega(B^2)$  i.e.  $\underbrace{M/B}_{\# \text{blocks}} = \underbrace{\Omega(B)}_{\text{size of block}}$

- then  $\approx N^\varepsilon$ -way mergesort with recursive ("funnel") merge works

⑤ priority queues:  $O\left(\frac{1}{B} \log_{M/B} \frac{N}{B}\right)$   
per insert or delete-min

$\Rightarrow$  generalizes sorting

- external memory & cache oblivious!

- see 6.851

# Algorithms classes at MIT: (post-6.046)

- 6.047: Computational Biology  
(genomes, phylogeny, etc.)
- 6.854: Advanced Algorithms  
(intense survey of whole field)
- 6.850: Geometric Computing  
(working with points, lines, polygons, meshes, ...)
- 6.849: Geometric Folding Algorithms  
(origami, robot arms, protein folding, ...) ↗ Demaine
- 6.851: Advanced Data Structures  
(sublogarithmic performance) ↙
- 6.852: Distributed Algorithms  
(reaching consensus in a network with faults) ↙ Lynch
- 6.853: Algorithmic Game Theory  
(Nash equilibria, auction mechanism design, ...)
- 6.855: Network Optimization  
(optimization in graph: beyond shortest paths)
- 6.856: Randomized Algorithms  
(how randomness makes algs. simpler & faster)
- 6.857: Network and Computer Security  
(applied cryptography)
- 6.875: Cryptography and Cryptanalysis  
(theoretical cryptography)
- 6.816: Multicore Programming

## Other theory classes:

- 6.045: Automata, Computability, & Complexity
- 6.840: Theory of Computing
- 6.841: Advanced Complexity Theory
- 6.842: Randomness & Computation
- 6.845: Quantum Complexity Theory
- 6.440: Essential Coding Theory
- 6.441: Information Theory

— Frisbee Competition —

MIT OpenCourseWare  
<http://ocw.mit.edu>

6.046J / 18.410J Design and Analysis of Algorithms  
Spring 2015

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