

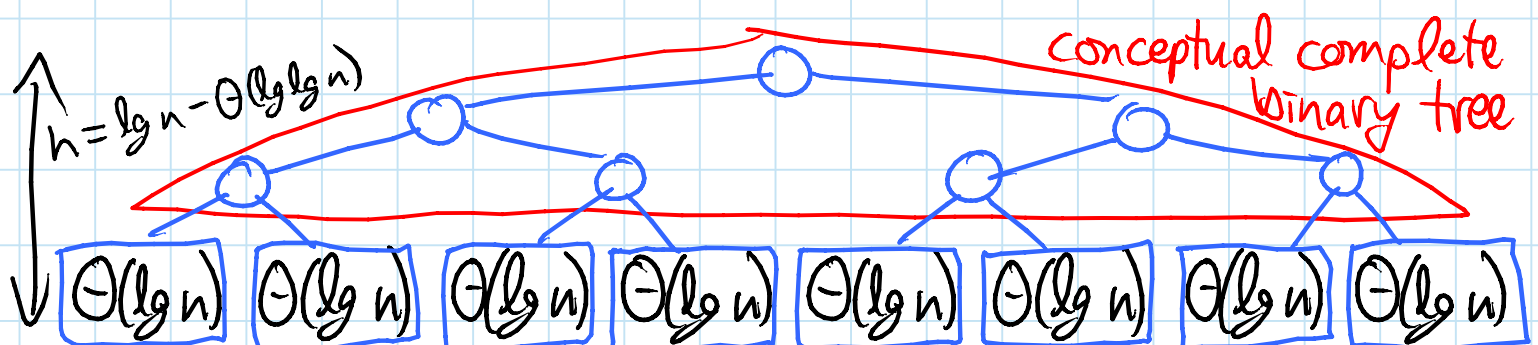
TODAY: Memory Hierarchies II (of 3)

- ordered file maintenance (for B-tree in L7)
- list labeling (for persistence in L1)
- cache-oblivious priority queue

Ordered file maintenance: [Itai, Konheim, Roteh - ICALP 1981;  
Bender, Demaine, Farach-Colton - FOCS 2000]

Goal: store  $N$  elements in specified order in an array of size  $O(N)$  with gaps of size  $O(1)$   
 $\Rightarrow$  scanning  $K$  consecutive elts. costs  $O(\lceil \frac{K}{B} \rceil)$  mem.trans.  
 subject to elt. deletion & insertion between 2 elts.  
 by re-arranging elts. in array interval of  $O(\lg^2 N)$  amortized elts., via  $O(1)$  interleaved scans  
 $\Rightarrow$  costs  $O(\frac{\lg^2 N}{B})$  amortized memory transfers

Idea: upon updating elements, ensure locally not too dense/sparse by redistributing elements in surrounding interval  
 - intervals defined by nodes in complete binary tree on  $O(\lg n)$ -size chunks of array:



## Update:

- ① update leaf by rewriting  $\Theta(\lg n)$ -size chunk
- ② walk up tree until reach ancestor whose  $\text{density}(\text{node}) = \frac{\# \text{elts. stored below node}}{\# \text{array slots in interval}}$  is within threshold at its depth  $d$ :
  - $\text{density} \geq \frac{1}{2} - \frac{1}{4} \frac{d}{h} \in [\frac{1}{4}, \frac{1}{2}]$  (not too sparse)
  - $\text{density} \leq \frac{3}{4} + \frac{1}{4} \frac{d}{h} \in [\frac{3}{4}, 1]$  (not too dense)
- ③ evenly rebalance elements below node

## Analysis:

- thresholds get tighter as we go up
- $\Rightarrow$  rebalancing node puts children FAR within threshold:  
 $|\text{density} - \text{threshold}| \approx \frac{1}{4} \frac{1}{h} = \Theta\left(\frac{1}{\lg N}\right)$
- this node won't be rebalanced again until  $\geq 1$  child out of threshold
- $\Rightarrow \underbrace{\Omega\left(\frac{\text{capacity}}{\lg N}\right)}_{\Omega(1)}$  updates to charge to because leaf = chunk has size  $\Theta(\lg N)$
- $\Rightarrow O(\lg N)$  amortized rebuild cost to update element below a node
- each leaf is below  $h = \Theta(\lg N)$  ancestors
- $\Rightarrow O(\lg^2 N)$  amortized cost per update

Worst-case bounds possible [Willard - I&C 1992;

Bender, Cole, Demaine, Farach-Colton, Zito - ESA 2002]

Conjecture:  $\Omega(\lg^2 N)$  necessary

## List labeling: closely related problem

maintain explicit integer label in each node in a linked list, subject to insert/delete node here, such that labels are monotone at all times

(label = index in array)

label space

best known time/update

$(1+\epsilon)n \dots n \lg n$   
 $n^{1+\epsilon} \dots n^{O(1)}$   
 $2^n$

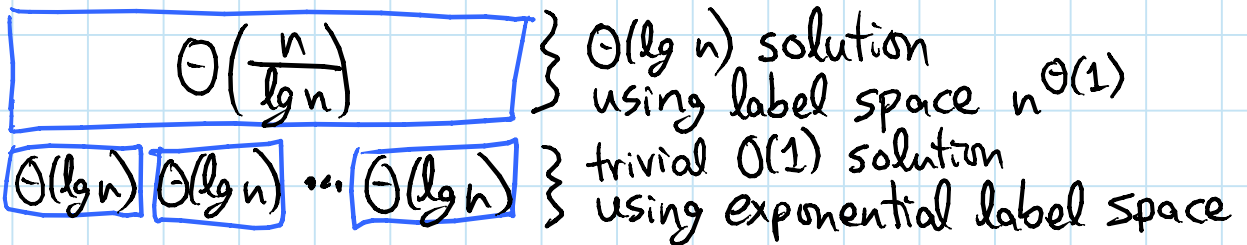
$O(\lg^2 n)$   
 $O(\lg n)$   
 $O(1)$

- ordered file maintenance  
→  $O$  via modified threshold: density  $\leq \frac{1}{\alpha^2}$ ,  $1 < \alpha \leq 2$   
→  $\Omega$  [Dietz, Seiferas, Zhang - SODA 2005]  
- trivial

## List order maintenance: easier problem, from L1

maintain linked list subject to insert/delete node here & order query: is node  $x$  before node  $y$ ?

- $O(1)$  solution via indirection: [Dietz & Sleator - STOC 1987; Bender, Cole, Demaine, Farach-Colton, Zito - ESA 2002]



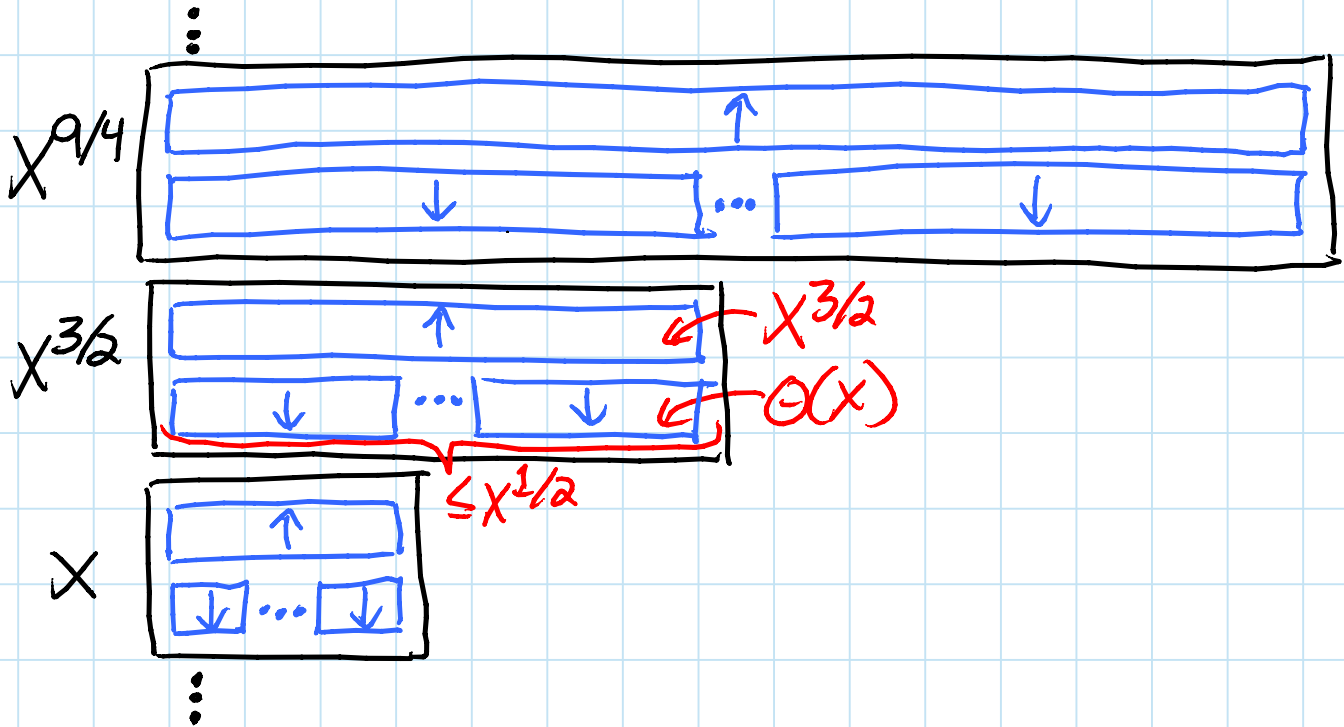
- implicit node label = (top label, bottom label)  
 $O(\lg n)$  bits

- ⇒ can compare two labels in  $O(1)$  time
- top updates change many implicit labels at once
- bottom chunks slow top updates by  $\Theta(\lg n)$  factor
- ⇒  $O(1)$  amortized cost
- worst-case bounds possible [same refs.]

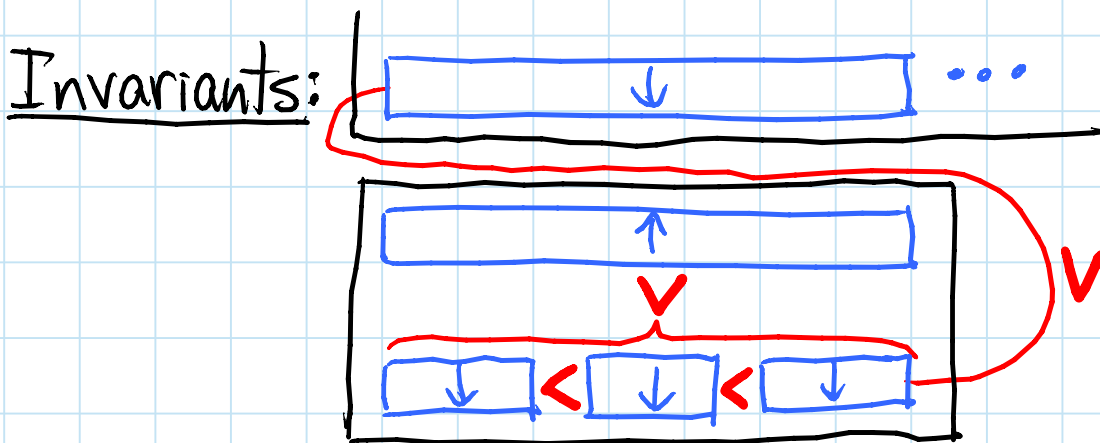
(impossible in list labeling)

# Cache-oblivious priority queue: (as in Arge et al. 2007)

- $\lg \lg n$  levels of size  $N, N^{2/3}, N^{4/9}, \dots, c=O(1)$
- level  $X^{3/2}$  has 1 up buffer of size  $X^{3/2}$  &  $\leq X^{1/2}$  down buffers each of size  $\Theta(X)$  where all but first is const. frac. full



Layout: store levels in order, small to large



- down buffers ordered in a level (but unsorted)
- down buffers  $\Theta(X^{3/2}) <$  down buffers  $\Theta(X^{9/4})$
- down buffers  $<$  up buffer in same level

Find-min: smallest element in smallest down buffer

Delete-min: delete from down buffer; if empty, pull

Insert:

- ① append to bottom up buffer
- ② swap into bottom down buffers if necessary
- ③ if up buffer overflows: push

Push  $X$  elements into level  $X^{3/2}$   
all  $>$  down buffers at level  $X$  & below

- ① sort elements
- ② distribute among down & up buffers:
  - scan elements, visiting down bufs. in order
  - when down buf. overflows, split in half & link
  - when #down bufs. overflows, move last to up buf.
  - when up buf. overflows, push it up to  $X^{9/4}$

Pull  $X$  smallest elts. from level  $X^{3/2}$  (& above)

- ① sort first two down bufs. & extract leading elts.
- ② if  $< X$ : pull  $X^{3/2}$  smallest elts. from  $X^{9/4}$  (& above)  
sort these elements & up buffer  
refill up buffer to previous size  
with largest elements  
extract needed smallest elts. till  $X$  total  
split rest up into down buffers

Analysis: push/pull at level  $X^{3/2}$  sans recursion costs  $O(\frac{X}{B} \log_{M/B} \frac{X}{B})$  memory transfers

- assume all levels of size  $\leq M$  stay in cache
- tall cache assumption:  $M \geq B^2$  (say)
- push at level  $X^{3/2} \geq B^2 \Rightarrow X > B^{4/3} \Rightarrow \frac{X}{B} > 1$ 
  - sort costs  $O(\frac{X}{B} \log_{M/B} \frac{X}{B})$  memory transfers
  - distribute costs  $O(X^{1/2} + \frac{X}{B})$  mem. transf.

startup per down buf.  $\nearrow$   $\rightarrow$  scan

- if  $X \geq B^2$  then cost =  $O(\frac{X}{B})$
- else: only one such level:  $B^{4/3} \leq X \leq B^2$   
can keep 1 block per down buf. in cache:  
 $X \leq B^2 \Rightarrow X^{1/2} \leq B \leq \frac{M}{B}$  by tall cache  
so just pay  $O(\frac{X}{B})$  at this level too
- pull at level  $X^{3/2} \geq B^2$ :
  - sort costs  $O(\frac{X}{B} \log_{M/B} \frac{X}{B})$  memory transfers
  - another sort of  $X^{3/2}$  elts. only when recursing  $\Rightarrow$  charge to recursive pull

Total: each element goes up & then down

(roughly - real proof harder)

& costs  $O(\frac{1}{B} \log_{M/B} \frac{X}{B})$  per push & pull @  $X$

$\Rightarrow O(\frac{1}{B} \sum \log_{M/B} \frac{X}{B})$  amortized cost per element

exp. geometric  $\leftarrow$   $\rightarrow$  geometric

$= O(\frac{1}{B} \log_{M/B} \frac{N}{B})$ .

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6.851 Advanced Data Structures  
Spring 2012

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