

static - no insertions/deletions  
dynamic - insertions/deletions

Static Predecessor

- data structure represents set  $S$  of items  $\{x_1, \dots, x_n\}$
- Query  $\text{pred}(z) = \max \{x \in S : x < z\}$
- want low space, fast query

Example soln (O(n) space):

Sorting:  
- get max  
- insert all elt  
- start with max  
- get predecessors

static: store numbers sorted, do binary search  $\leftarrow$  in array  $\Theta(\lg n)$   
dynamic:  $O(\lg n)$  query using balanced BST (rb-tree, AVL),  $O(\lg n)$  for updates.

Comparison model for sorting  $O(n \lg n)$

but this is not how computers work  $\rightarrow$  32-64 bit words

Bitwise operations (XOR)  
Bit shifting etc...  
multiplication

Word RAM model

- items are integers in  $\{0, 1, \dots, 2^w - 1\}$

- $w$  = "word size"
- $U = 2^w - 1$  universe

Word RAM  
model

not just comparisons

- assume that pointers fit in a word

- space  $\geq n$  (n items)

$$w \geq \lg(\text{space}) \geq \lg n$$

distinction between:

$w$  close to  $\lg n$  or much larger than  $\lg n$

Two data structures

## ① Van Emde Boas tree (FOCS '75)

update/query  $\Theta(\lg w)$  time

$\Theta(U)$  space, 64-bit machine  $\rightarrow \Theta(2^{64})$

can be made  $\Theta(n)$  with randomization  $\leftarrow$  my comment hash tables

Y fast tries, same bounds (Willard, JAL '83)

## ② Fusion trees (Fredman, Willard JCSS '93)

Query in time  $\Theta(\lg w n)$  and linear space

$$\lg w n = \frac{\lg n}{\lg w} \leq \frac{\lg n}{\lg \lg n}$$

$\Rightarrow$  knowing  $w$ , achieve min  $\{\lg w, \lg w n\}$

dynamic  $\Rightarrow$  sort in  $O(n \lg n)$  Fusion trees

$$\text{assume } \frac{\lg w n}{\lg w} = \lg w n = \frac{\lg n}{\lg w}$$

$$\lg w^2 = (\lg n)$$



## Faster sorting (same model, Word RAM model)

$O(n \lg \lg n)$  deterministic (Han, STOC '02)

$O(n \sqrt{\lg \lg n})$  randomized, in expectation (Han, FOCS '02)

Open question of linear-time sorting is possible in the word RAM model.

my comment

vEB provides  $O(\lg \lg n)$  updates  $\Rightarrow$   $O(\lg \lg n)$  sort.

Word RAM: assume that given  $x, y$  fitting in a word each,

we can do:  $+$   $/$   $\times$   $-$  ,  $\sim$   $\wedge$   $\vee$   $\&$  ,  $\gg$   $\ll$  } in const. time

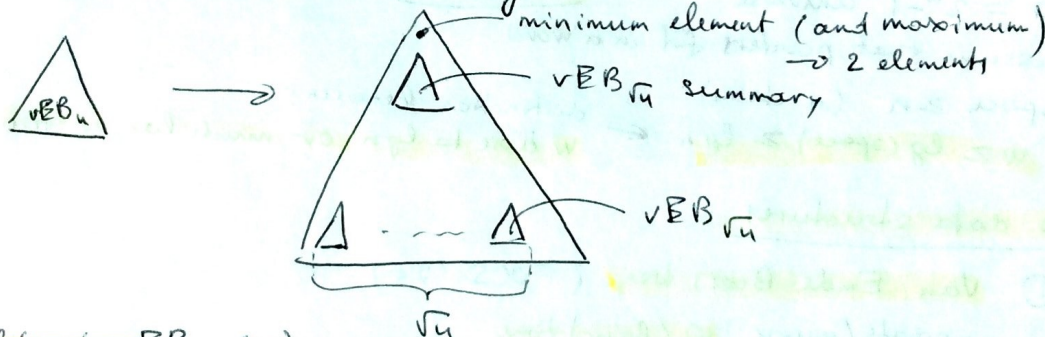
↑  
int division rounds down

↑  
fits in 2 words

integer arithmetic

## Van Emde Boas Tree (vEB tree)

- vEB tree defined recursively



## Fields of $vEB_u(V)$

- $\sqrt{u}$ -size array  $V.\text{cluster}[0], \dots, V.\text{cluster}[\sqrt{u}-1]$   
 $\uparrow$   
 $vEB_{\sqrt{u}}$  data structure
- $V.\text{summary}$  is a  $vEB_{\sqrt{u}}$  instance
- $V.\text{min} / V.\text{max}$  are integers in  $\{0, \dots, u-1\}$

let  $x \in \{0, 1, \dots, u-1\}$

Ex:  $x = \underbrace{1001}_c \underbrace{0011}_i = \langle c, i \rangle$ ,  $c, i \in \{0, \dots, \sqrt{u}-1\}$   
 $x$  in base  $\sqrt{u}$

Pred ( $V, x = \langle c, i \rangle$ )

if  $x > V.max$

return  $V.max$

else if  $V.cluster[c].min < x$ :

return  $Pred(V.cluster[c], i)$

else

$c = Pred(V.summary, c)$

return  $V.cluster[c].max$

my comments  
(bug fixes)

must be i

return

$c \cdot \sqrt{u} + Pred(V.cluster[c], i)$   
u  
of subtree

return

$c \cdot \sqrt{u} + V.cluster[c].max$   
u  
of subtree

Insert ( $V, x = \langle c, i \rangle$ )

if  $V = \emptyset$

$V.min \leftarrow x$ , return

// min not stored in subtrees

if  $x < V.min$

swap ( $x, V.min$ )

// min not stored in subtrees

if  $V.cluster[c].min = \emptyset$

Insert ( $V.summary, c$ )

Insert ( $V.cluster[c], i$ )

also need  
to handle  
max

Pred time:

$$T(u) = T(\sqrt{u}) + O(1) \quad \text{only one recursion}$$

$$\Rightarrow T(u) = O(\lg \lg u) = O(\lg w) \quad u = 2^{\lg u} \Rightarrow 1$$

Insert time:

if  $V.cluster[c].min = \emptyset$  or true

Insert ( $V.cluster[c], i$ ) =  $O(1)$

$$T(u) = T(\sqrt{u}) + O(1) = O(\lg \lg u) = O(\lg w)$$



## Space of vEB:

$$S(u) = (\sqrt{u} + 1) S(\sqrt{u}) + O(1) \quad \leftarrow \text{min \& max}$$

$$\Rightarrow S(u) = \Theta(u)$$

Improve space: in a vEB data structure, have a hash table

my comment

instead of an array of pointers to empty and non-empty clusters

- keys are cluster IDs  $c$
- value is pointer to corresponding non-empty cluster

Claim: vEB with hash table uses  $\Theta(n)$  space

Pf: Charge the cost of storing  $(c, \text{pointer to cluster } c)$  to minimum element of cluster  $c$ .

Each  $x \in S$  is charged exactly once.

Short intro:

Dictionary problem:

- store (key, value) pairs
- query( $k$ ) returns val associated with key  $k$  or null if  $k$  is not associated.
- insert( $k, v$ ) associates val  $v$  with key  $k$

Dynamic dictionary is possible with

$\Theta(n)$  space

$\Theta(1)$  worst case query

$\Theta(1)$  expected insertion

(Dietzfel Binger et al.)

$\Theta(1)$  insertion with high probability is possible

my comment

$n = \Theta(n) \Rightarrow$  must grow in as  $n$  grows,

~~...~~  $d = \Theta(1)$  then

search is  $\Theta(1)$

in expectation!

~~...~~ here  $\Theta(1)$

worst case search!

$\hookrightarrow$  modification

beyond simple chaining and open-addressing



CS 224

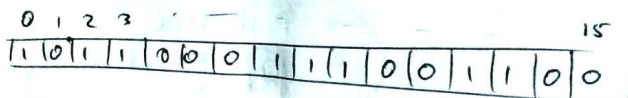
Lecture 1

sketch, because  
same bounds

(3)

# Another solution (x, y-fast trees)

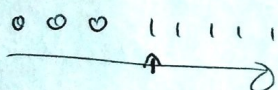
Bit array of length  $n$



- make binary tree where each node stores OR

Time:  $O(\lg n)$  store all the 1's in a doubly linked list

- On any path from leaf to root bits are monotone



to find the first 1, can do binary search

- store tree as an array root is index 0

node  $v$  has left child at  $2v+1$  right child at  $2v+2$

$O(\lg n)$  find time

- could also, for each node, store its  $k$ th ancestor for each  $k=0 \dots \lg \lg n$

$O(n \lg \lg n)$  Space

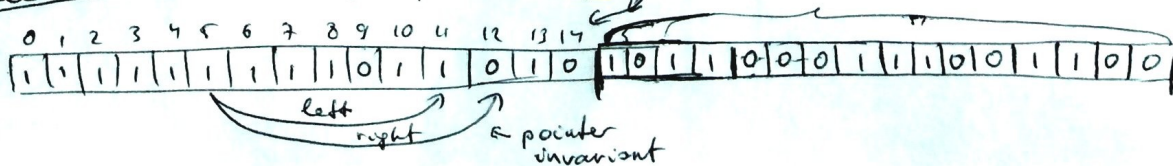
- To save space, only store 1's in a hash table

For each level of tree, hash table stores locations of 1's

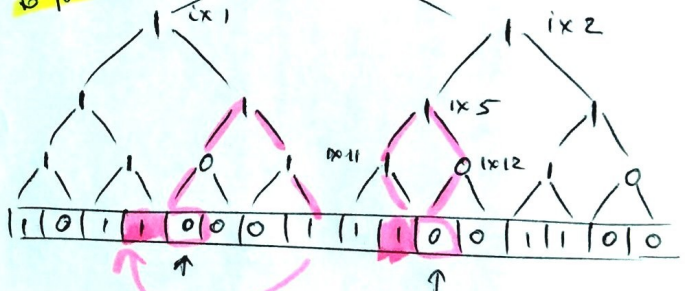
$\Rightarrow$  space  $\Theta(n \lg n)$

tree as array:

(x-fast tree)



go from successor to predecessor in  $O(1)$ , both for 0's and 1's



successor  $\rightarrow$  predecessor on doubly LL

Binary search on following pointers

$2v+1$   
 $2v+2$

can find  $k$ th ancestor in constant time by doing  $\gg k$

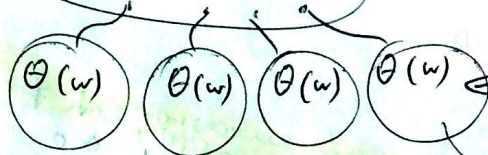
similar

space solution to VEB

from x-fast to y-fast

- use "indirection"

x-fast tree  
on  $\frac{y}{w}$  items



balanced  
BST for each

contains between  
 $\frac{w}{2}$  and  $2w$  items

