

TODAY: van Emde Boas [Peter, 1974]

- series of improved data structures ↗
- Insert, Successor [based on personal communication with Michael Bender, 2001]
- Delete
- Space

Goal: maintain n elements among $\{0, 1, \dots, u-1\}$
 Subject to Insert, Delete, Successor
 in $O(\lg \lg u)$ time/op.



- if $u = n^{O(1)}$ or $n^{\lg^{O(1)} u}$ then $O(\lg \lg n)$ time/op.!
- exponentially faster than balanced search trees
- cooler queries than hashing
- application: network routing tables ($u = 2^{32}$ in IPv4)
 $= \{\text{range of IP addresses} \rightarrow \text{port to send}\}$

Where might $O(\lg \lg u)$ bound arise?

- binary search over $\lg u$ elements
- recurrences: $T(\lg u) = T\left(\frac{\lg u}{2}\right) + O(1)$

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

We'll develop van Emde Boas data structure by a series of improvements on a very simple data structure:

① Bit vector: $V[x] = \text{is } x \text{ in the set?}$

0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15
e.g.	0	1	0	0	0	0	0	0	0	1	1	0	0	0	1

$$\curvearrowleft u=16$$

$$n=4$$

- Insert/Delete: $O(1)$ 😊
- Successor/Predecessor: $O(u)$ 😕

② Split universe into clusters: \sqrt{u} of size \sqrt{u}

0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15
e.g.	0	1	0	0	0	0	0	0	0	1	1	0	0	0	1

$\underbrace{}_{V.\text{cluster}[0]}$ $\underbrace{}_{V.\text{cluster}[1]}$... $\underbrace{}_{V.\text{cluster}[\sqrt{u}-1]}$

nonempty: 1 0 1 1

- if $x = i\sqrt{u} + j$ then $V[x] = V.\text{cluster}[i][j]$

$$0 \leq j < \sqrt{u}$$

$$\Rightarrow \text{define} \begin{cases} \text{low}(x) = x \bmod \sqrt{u} = j \\ \text{high}(x) = \lfloor x/\sqrt{u} \rfloor = i \\ \text{index}(i, j) = i\sqrt{u} + j \end{cases}$$

$x: \underbrace{}_{\text{high}(x)} \underbrace{}_{\text{low}(x)} = 9$

= high & low-order halves in binary

- Insert: set $V.\text{cluster}[\text{high}(x)][\text{low}(x)]$ } $O(1)$
 mark cluster $\text{high}(x)$ nonempty } $O(1)$

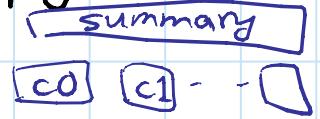
- Successor:

- look within cluster $\text{high}(x)$ } $O(\sqrt{u})$
- else find next nonempty cluster i } $O(\sqrt{u})^*$
- find min j in that cluster } $O(\sqrt{u})$
- return $\text{index}(i, j)$ better! } $O(\sqrt{u})$

- ③ Recurse: 3 ops. in Successor are recursive Successors!
- $V.\text{cluster}[i] = \text{size-}\sqrt{u}$ van Ende Boas $\quad 0 \leq i < \sqrt{u}$
 - $V.\text{summary} = \text{size-}\sqrt{u}$ van Ende Boas
 - $V.\text{summary}[i] = \text{is } V.\text{cluster}[i] \text{ nonempty?}$

Insert(V, x):

$$\begin{aligned} &\text{Insert}(V.\text{cluster}[\text{high}(x)], \text{low}(x)) \\ &\text{Insert}(V.\text{summary}, \text{high}(x)) \\ \Rightarrow T(u) &= 2T(\sqrt{u}) + O(1) \\ T'(\lg u) &= 2T'\left(\frac{\lg u}{2}\right) + O(1) \\ &= O(\lg u) \end{aligned}$$



$$\begin{aligned} &T(\sqrt{u}) \\ &T(\sqrt{u}) \end{aligned}$$

Successor(V, x):

$$\begin{aligned} i &= \text{high}(x) \\ j &= \text{Successor}(V.\text{cluster}[i], \text{low}(x)) \quad T(\sqrt{u}) \\ \text{if } j &= \infty: \\ i &= \text{Successor}(V.\text{summary}, i) \quad T(\sqrt{u}) \\ j &= \text{Successor}(V.\text{cluster}[i], -\infty) \quad T(\sqrt{u}) \\ \text{return } &\text{index}(i, j) \\ \Rightarrow T(u) &= 3T(\sqrt{u}) + O(1) \\ T'(\lg u) &= 3T'\left(\frac{\lg u}{2}\right) + O(1) \\ &= O((\lg u)^{\lg 3}) \\ &= O(\lg^{1.585} u) \end{aligned}$$

∴!

- need to reduce to one recursion!

④ Maintain min & max of every structure:

- $O(1)$ overhead in Insert: if $x < V.\min$: $V.\min = x$
if $x > V.\max$: $V.\max = x$

Successor(V, x):

$i = \text{high}(x)$

if $\text{low}(x) < V.\text{cluster}[i].\max$:

$j = \text{Successor}(V.\text{cluster}[i], \text{low}(x))$

else: $i = \text{Successor}(V.\text{summary}, \text{high}(x))$

$j = V.\text{cluster}[i].\min$

return $\text{index}(i, j)$

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

$$= O(\lg \lg u) \quad \therefore$$

⑤ Don't store min recursively:

- Successor checks for min specially:

if $x < V.\min$: return $V.\min$

Insert(V, x): *empty case*

costs $O(1)$ ↗

if $V.\min = \text{None}$: $V.\min = V.\max = x$: return

if $x < V.\min$: swap $x \leftrightarrow V.\min$

if $x > V.\max$: $V.\max = x$

if $V.\text{cluster}[\text{high}(x)].\min = \text{None}$: *(previously empty)*

Insert($V.\text{summary}, \text{high}(x)$) *

Insert($V.\text{cluster}[\text{high}(x)], \text{low}(x)$)

* if both calls, then second costs $O(1)$ (*empty case*)

$$\Rightarrow T(u) = O(\lg \lg u) \quad \therefore$$

⑥ Delete(V, x):

if $x = V.\min$: (find new min)

$i = V.\text{summary}.\min$

if $i = \text{None}$: $V.\min = V.\max = \text{None}$ } empty now
return } costs $O(1)$

$x = V.\min = \text{index}(i, V.\text{cluster}[i].\min)$ } unstore
new min

Delete($V.\text{cluster}[\text{high}(x)]$, $\text{low}(x)$)

if $V.\text{cluster}[\text{high}(x)].\min = \text{None}$: } empty now

Delete($V.\text{summary}$, $\text{high}(x)$) * second call

if $x = V.\max$:

if $V.\text{summary}.\max = \text{None}$:

$V.\max = V.\min$

else: $i = V.\text{summary}.\max$

$V.\max = \text{index}(i, V.\text{cluster}[i].\max)$

* if make second call, then first call

was cheap (just deleted a min)

$$\Rightarrow T(u) = O(\lg \lg u)$$

Lower bound: [Pătrașcu & Thorup 2007]

$\Omega(\lg \lg u)$ for $u = n^{\lg^{O(1)} n}$

& space = $O(n \text{poly} \lg n)$

- even static (just Successor, no Insert/Delete)

update
 $V.\max$

- ⑦ Space: improve from current $\Theta(u)$ to $O(n \lg \lg u)$
- only create nonempty clusters
 - if $V.\min$ becomes `None`, deallocate V
 - $V.\text{cluster} = \text{hash table of nonempty clusters}$
 (recall from 6.006: and see Lecture 8)
 - insert may create new structure (fill min) $\Theta(\lg \lg u)$ times (each empty insert)
 - can really happen [Vladimir Čunát]
 - charge pointer to structure (and associated hash-table cell) to the structure
 $\Rightarrow O(n \lg \lg u)$ space (but randomized)

CHARGING AMORTIZATION ~
 SEE NEXT LECTURE (5)

- ⑧ Indirection further reduces to $O(n)$ space
- store vEB structure with $n = O(\lg \lg u)$ using BST or even array
 - $\Rightarrow O(\lg \lg n)$ time once in base case
 - $O(n/\lg \lg u)$ such structures (disjoint)
 - $\Rightarrow O\left(\frac{n}{\lg \lg u} \cdot \lg \lg u\right) = O(n)$ space for small
 - larger structures "store" pointers to them
 - $\Rightarrow O\left(\frac{n}{\lg \lg u} \cdot \lg \lg u\right) = O(n)$ space for large
 - details: split/merge small structures

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