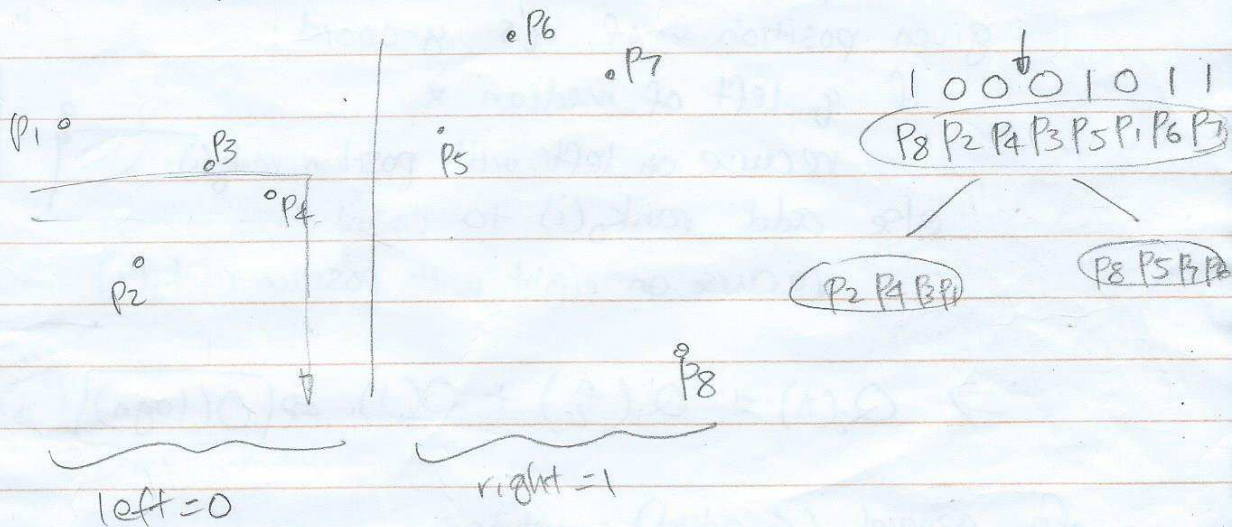


## Improving Space by Bit Packing (Chazelle '88)

for 2D Counting

idea - modify range tree

idea - replace list of y-coords by list of bits



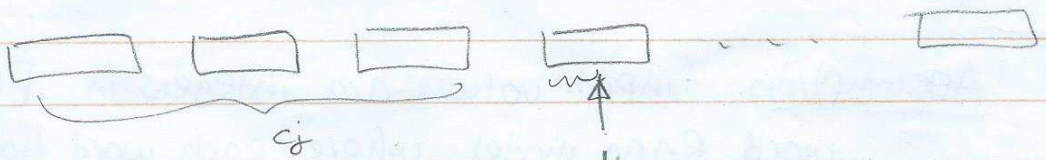
Standard Assumption RAM model with fixed word size  $w$   
where  $w \geq \log n$  bits

Fact can store array  $A$  of  $n$  bits using  $O(n/w)$  space  
(in words)

s.t. can compute  $rank_0(i) = \# \text{ 0's in } A[1..i]$

$rank_1(i) = \# \text{ 1's " " "$

Pf. divide array into  $n/w$  words



Precompute  $c_j = \# \text{ 0's in first } j \text{ words}$

Count  $\# \text{ 0's in a word by a nonstandard word op.}$

(if  $w = \log n$ , can build table with all answers  
in  $O(n)$  space.)

Rank: can further reduce space to  $n/w + o(n/w)$   
by succinct DS

□

Space  $f$ .  $S(n) = 2S(\frac{n}{2}) + O(\frac{n}{w})$   
 $\Rightarrow O(\frac{n}{w} \log n) = \boxed{O(n)}$  by setting  $w = \log n$ .

Query Algm; for dominance (2-sided) counting:

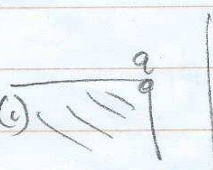
given position  $i$  of  $q$ 's  $y$ -coord:

if  $q$  left of median  $x$

recurse on left with position  $\text{rank}_0(i)$

else add  $\text{rank}_0(i)$  to count

else recurse on right with position  $\text{rank}_1(i)$



$\Rightarrow Q_2(n) = Q_2(\frac{n}{2}) + O(1) \Rightarrow \boxed{O(\log n)}$

for general (4-sided) counting:

reduce to dominance by subtraction/addition

$\Rightarrow \boxed{O(\log n)}$



(Rank - related to wavelet trees

- reporting is costlier  $(O(\log n + k \log n))$ )

Improving query time, by bit tricks?

Assumption: input values are integers in  $[U] = \{1, \dots, U\}$   
word RAM model where each word has fixed size  $w$ .

with  $w \geq \log n$  (index/ptr fits in a word)  
 $w \geq \log U$  (input value " " " )

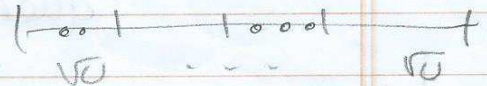
## Warm-Up: 1D Pred/Succ Search

### Method 1: van Emde Boas (vEB) tree

divide  $[U]$  into  $\sqrt{U}$  chunks of size  $\sqrt{U}$

recurse inside each chunk

let  $D = \{ \text{(indices of)} \}$   
all nonempty chunks



recurse in  $D$

store min & max of each nonempty chunk

Query alg'm, given pt  $q$ :

$i =$  index of chunk containing  $q$

$O(1)$  time  
by arithmetic

if  $i \in D$ , recurse inside chunk

if  $i \notin D$ , recurse in  $D$ .

$O(1)$  time by  
hashing

$$Q(U) = Q(\sqrt{U}) + O(1)$$

$$\text{let } U = 2^l$$

$$(\sqrt{U} = 2^{l/2})$$

$$\Rightarrow Q'(l) = Q'(l/2) + O(1)$$

$$\Rightarrow Q'(l) = O(\log l)$$

$$\Rightarrow Q(U) = \boxed{O(\log \log U)}$$

Space: each element stored in  $\leq 2$  recursive substructures

$$s(U) = 2s(\sqrt{U}) + O(1)$$

space per element

$$\text{total space } O(n 2^{\log \log U}) = \boxed{O(n \log U)}$$

Space reduction trick:

select subset containing every  $b^{\text{th}}$  element.

build  $\sqrt{b}$  B for subset

set  $b = \log U$

$\Rightarrow$  space  $O(\frac{n}{b} \log U + n)$

$= O(n)$

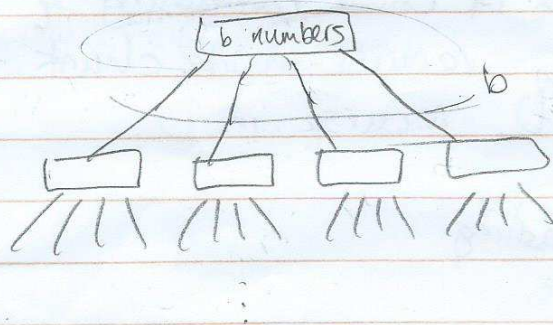
query time  $O(\log \log U + \log b)$   $\neq O(\log \log U)$

finish by  $\nearrow$   
binary search

Method 2: Fusion Tree (Friedman, Willard '90)

$O(n)$  space,  $O(\log_{\sqrt{n}} n)$  time

rough idea -  $b$ -ary search tree with  $b \approx \sqrt{n}$

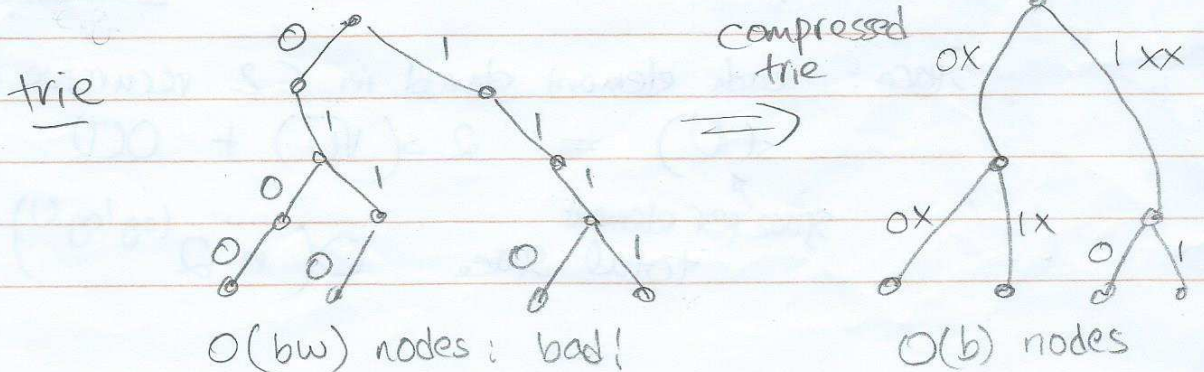


height  
 $\log_b n = O(\log_{\sqrt{n}} n)$

need to search among  $b$  numbers in  $O(1)$  time

how? compress  $b$  numbers into a single word  
then use a <sup>nonstandard</sup> word of

eg.  $\{0100, 0110, 1110, 1111\}$



Compressed trie encodable in  $O(\log w)$  bits  
 $\ll w$

to query  $q$ :

follow path to get element  $z$

e.g.  $q = 0011$

$z = 0110$

may be wrong

find first bit where  $q$  &  $z$  differ

(avoiding nonstandard ops is complicated!)

Method 3: Combine!

$$Q(n) = O(\min\{\log \log U, \log w n\})$$

$$\leq O(\min\{\log w, \frac{\log n}{\log w}\})$$

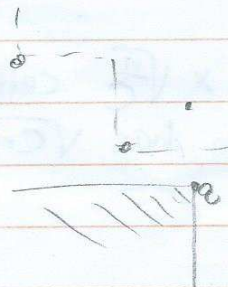
$$\leq \boxed{O(\sqrt{\log n})}$$

beats  $\log n$  for any  $U$ ! (near-optimal)

Back to 2D ...

Advanced Method 1

dominance (2-sided) emptiness



reduce to  
pred search in  $x$

"staircase"

$\Rightarrow O(n)$  space,  $O(\log \log U)$  time