

(1)

Range Query

Given  $n$  points in  $\mathbb{R}^d$  create a search structure to report the points within a given Range

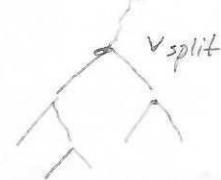
1D



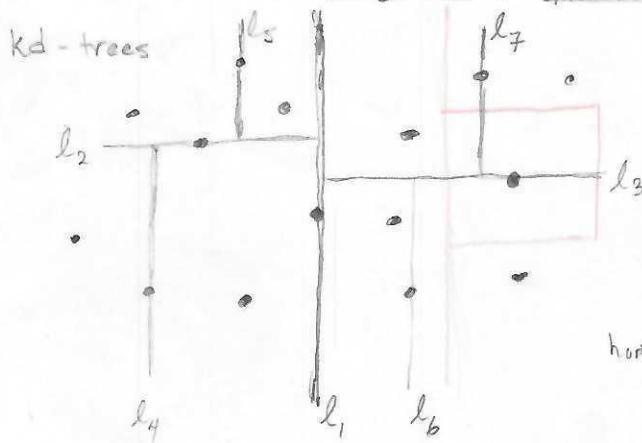
Orthogonal range = rectangle

Query time :  $O(\log n + k)$   $k = \text{output size}$

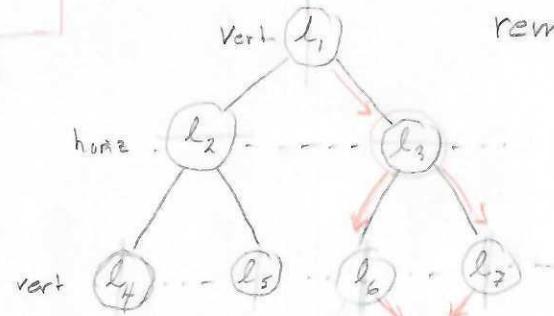
Preprocess :  $O(n \log n)$   
Space :  $O(n)$   
Update :  $O(\log n)$



2D kd-trees, range trees, quad trees



Alternately split points in half vertically then horizontally until one point remains



Pre process  $O(n \log n)$  (find median +  $2T(n/2)$ )  
Space  $O(n)$

Query  $O(\sqrt{n} + k)$   $k = \text{output size}$

$k$  pays for all nodes visited whose region lies in query range

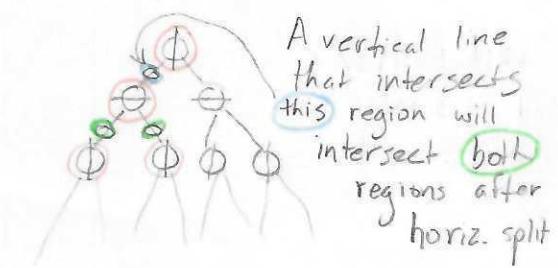
$q(n) = \# \text{regions in kd tree intersected by a vertical line on } n \text{ points}$

$$q(n) = \begin{cases} 1 & \text{if } n=1 \\ 2+2q(n/4) & n>1 \end{cases}$$

$$q(n) = O(\sqrt{n})$$

Total query time  $q(n)+k$

Only search subtree rooted at  $v$   
if query rectangle intersects  $v$ 's region  
(if rectangle contains  $v$ 's region, report all points in subtree rooted at  $v$ )



## Range Trees

- ① Balanced binary search tree on x-coord (points at leaves sorted by x-coord)
  - ② At every node  $v$ , store points in slab( $v$ )  
Sorted by y-coord in array  $A(v)$

↑  
 i.e.      X-range of points  
 in subtree @  $v$



Preprocess  $\mathcal{O}(n \log n)$

Space  $O(n \log n)$  — each point is in  $A(v)$  for at most one vertex  $v$  per level of tree

Query  $y_2$  

- ② We want points in leaves between  $l(x_1)$  and  $l(x_2)$  that have y-coord in  $[y_1, y_2]$

- ③ Perform binary search in  $A(v)$

for all right children on path to  $l(x_1)$  from w } all green vertices  
 left " " " " "  $l(x_2)$  from w }

$O(\log n + \text{output})$  per green vertex to report points in rectangle

$O(\log n)$  green vertices

$$\Rightarrow O(\log^2 n + k) \text{ total}$$

(since outputs for each vertical slab are disjoint)

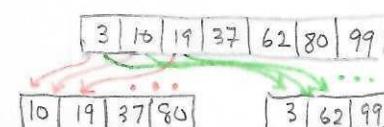
## Fractional Cascading

$K$  = total output size

$A(w)$  contains  $A(w.\text{left})$  and  $A(w.\text{right})$

Search in parent gives location of

Same search in children @  $O(1)$  cost



$\Rightarrow O(\log n + k)$  query

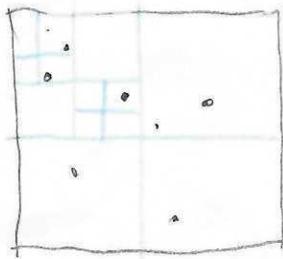
Quad trees

Lemma  $\text{depth} \leq \log(\frac{s}{c}) + \frac{1}{2}$  where  $c = \text{smallest distance btwn points}$

proof

Square side length at depth  $i$  is  $s/2^i$

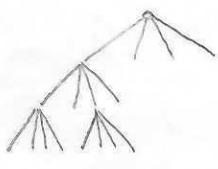
$s = \text{size of initial square}$



max distance between points in such a square is  $\sqrt{2}s/2^i$

$\Rightarrow \sqrt{2}s/2^i \geq c$  for all internal nodes at depth  $i$

$$\Rightarrow i \leq \log \frac{s\sqrt{2}}{c} = \log(\frac{s}{c}) + \frac{1}{2}$$

Balanced Quad trees

See slides for RTINs