

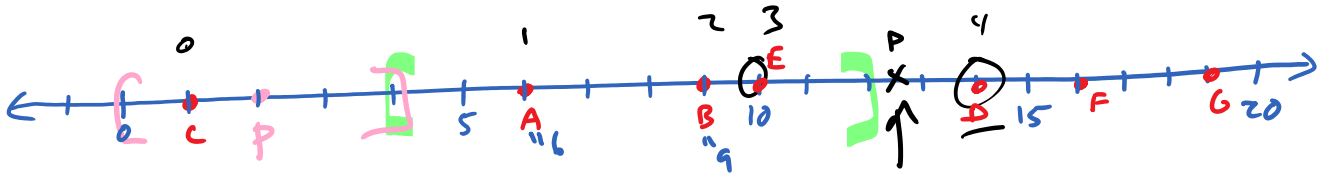
### Spatial Data

info about objects that includes location

queries: find all objects with locations in a given region

within radius  $r$  of pt  $P$

find the object closest to a location



find in range  $[a, b]$  A, B, E

find within  $d$  of  $p$

$\rightarrow [p-d, p+d]$   
 $[0, 4] \rightarrow C$

strict with upper/lower bound

find closest to  $p \rightarrow D$

search for  $p$   
 return closer of

- 1) inorder predecessor
- 2) inorder successor

find-range( $n, r, [a, b]$ ) bounds on things in  $n$ 's subtree

if  $n = \text{NULL}$  or no intersection between  $r, [a, b]$   
 return

else if  $n \rightarrow \text{data}$  in  $r$ , process

find-range( $n \rightarrow \text{left}, r, a, n \rightarrow \text{data}$ )

find-range( $n \rightarrow \text{right}, r, n \rightarrow \text{data}, b$ )

next highest value in tree

(leftmost in right subtree if there is a right subtree

otherwise, most recent ancestor you went left from

$O(\log n)$



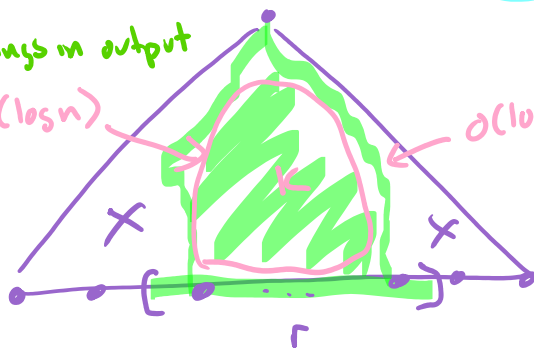
output-sensitive running time

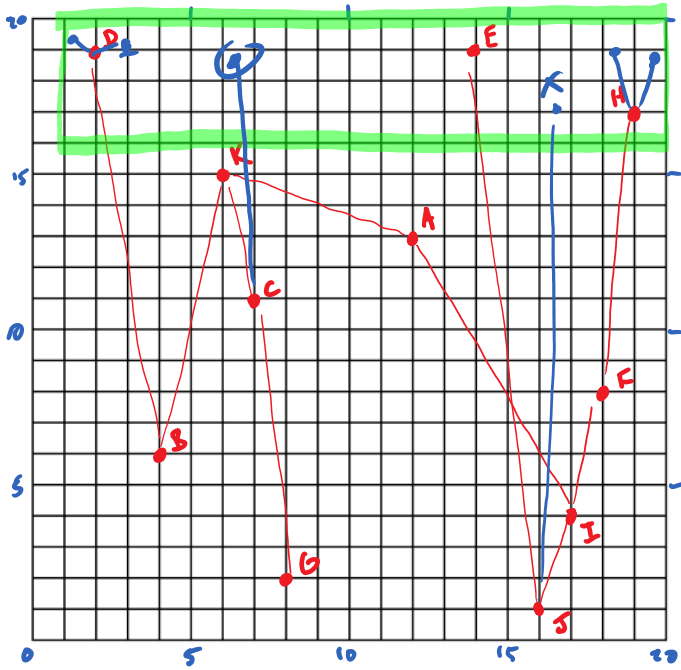
$O(\log n + k)$

# of things in output

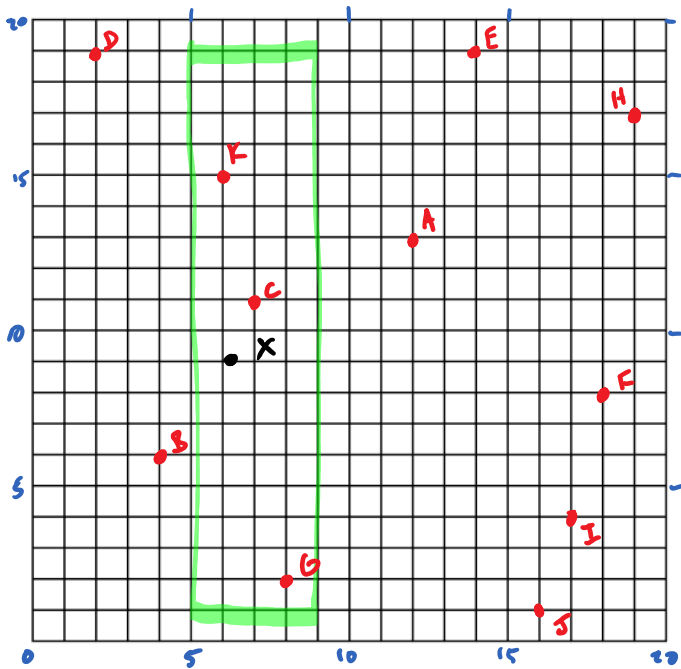
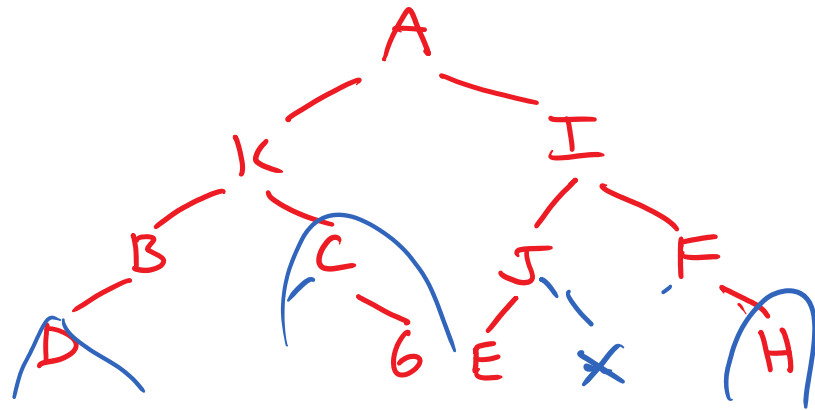
$O(\log n)$

$O(\log n)$

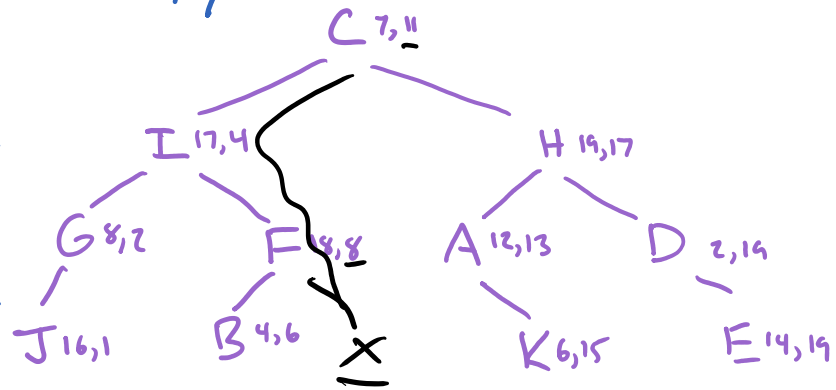




Idea: BST ordered by x-coord?



Order by y?



kd-Tree

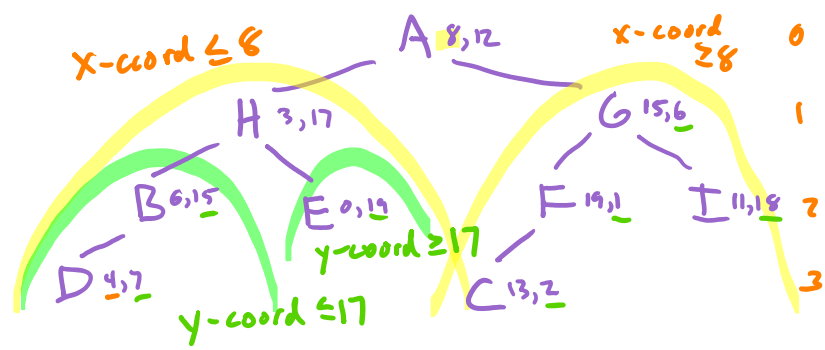
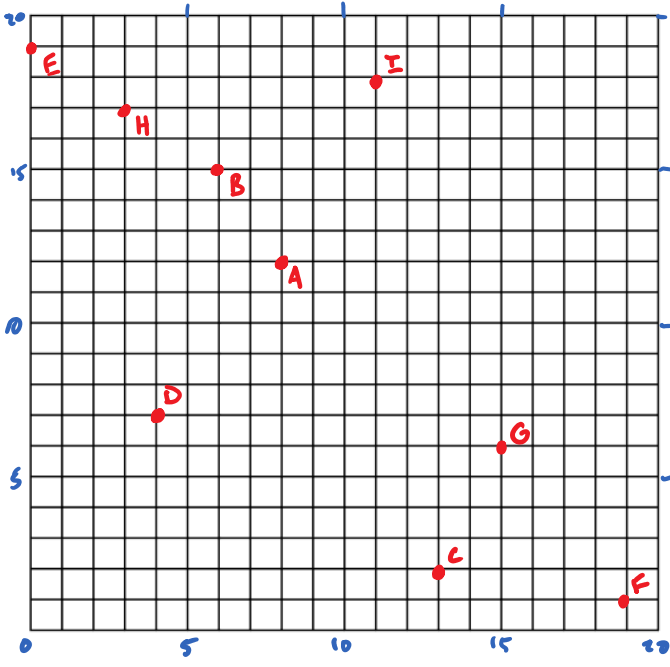
$k=2$  for  $(x,y)$  coords

kd tree: nodes at level  $l$

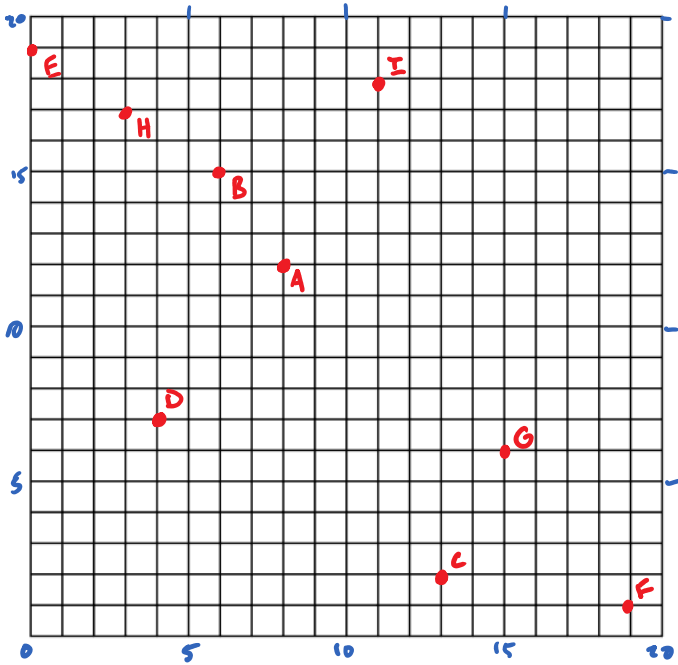
obey BST order property for

- dimension 0 if  $l$  is a multiple of  $k$
- dimension 1 if  $l$  is one more than mult of  $k$
- dimension 2 if  $l$  is 2 more than ...

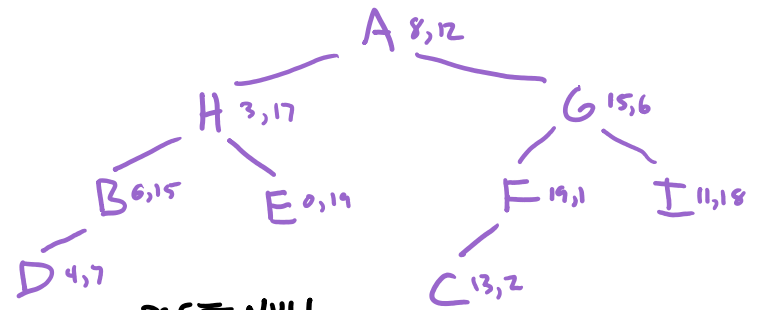
x at even levels  
y at odd levels



Adding to kd-Tree



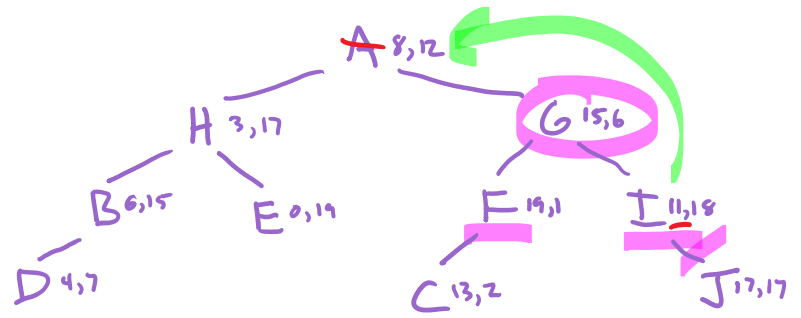
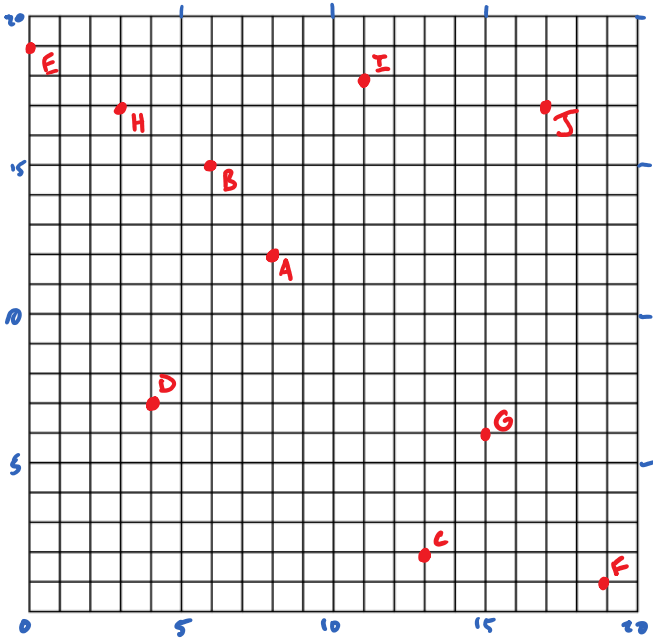
$O(\log n)$  if  $\frac{1}{2}$  balanced



```

par = NULL
curr = root
dim = 0
# iterations
≤ h → while curr ≠ NULL and curr → data ≠ p
      par = curr
      if p[dim] < curr → data[dim]
          curr = curr → left
      else if p[dim] > curr → data[dim]
          curr = curr → right
      dim = (dim + 1) % k
if curr = NULL
    add new node as appropriate
    child of parent
    
```

Removing From kd-Tree



Find node  $n$  containing  $P$ , and its parent, cut dim  $d$   
 $\text{delete}(n, \text{parent}, d)$

if  $n$  is a leaf, remove

if  $n \rightarrow \text{right} \neq \text{NULL}$ ,

Find node  $n'$  w/ lowest value in dim  $d$  in  $n$ 's right subtree and find its parent  $p'$ , cut  $d'$

$n \rightarrow \text{data} = n' \rightarrow \text{data}$   
 $\text{delete}(n', p', d')$

else

find node  $n'$  w/ highest value in dim  $d$  in  $n$ 's left subtree (and its parent  $p'$ , cut dim  $d'$ )

$n \rightarrow \text{data} = n' \rightarrow \text{data}$   
 $\text{delete}(n', p', d')$

$\text{find\_min}(n, d)$

if  $n == \text{NULL}$  return  $\text{NULL}$

if  $n$ 's cut is dim  $d$

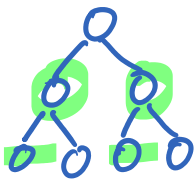
if  $n \rightarrow \text{left} \neq \text{NULL}$

return  $\text{find\_min}(n \rightarrow \text{left}, d)$

else return  $n$

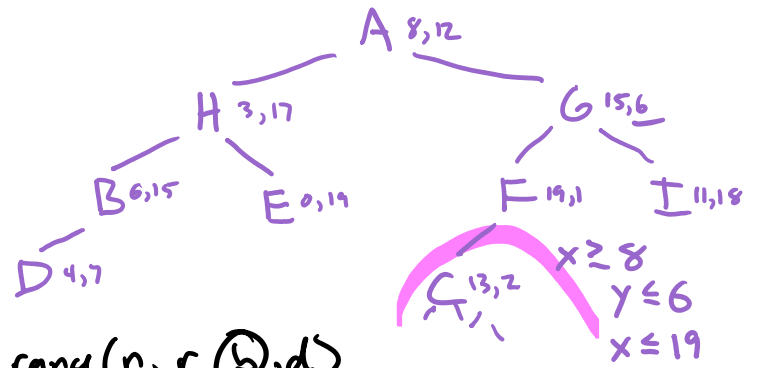
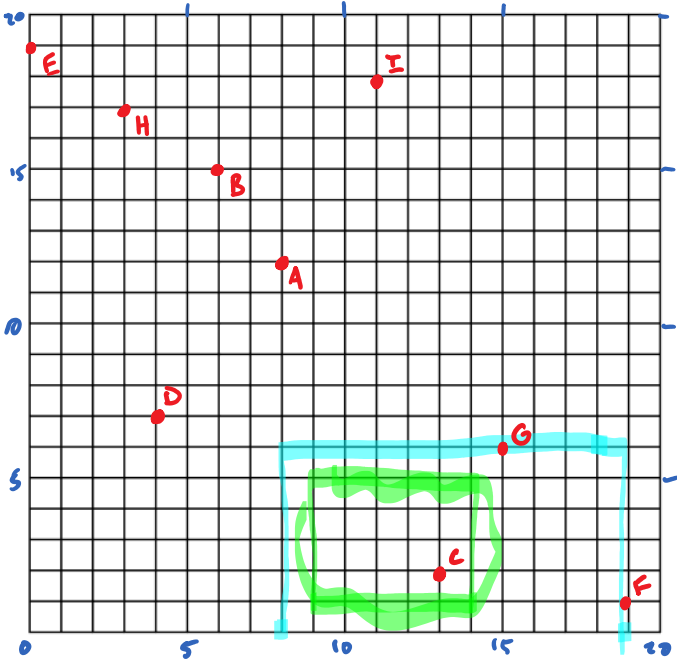
else

return  $\min(n, \text{find\_min}(n \rightarrow \text{left}, d), \text{find\_min}(n \rightarrow \text{right}))$



$O(\sqrt{n})$

Range Query in kd-Tree



$range(n, r, (b), d)$   
 if  $n == NULL$  or  $r \cap b = \emptyset$   
     return  
 if  $n \rightarrow data$  in  $r$ , process  $n \rightarrow data[dim]$   
 $range(n \rightarrow left, r, b \cap dim \leq \dots, (d+1) \% k)$   
 $range(n \rightarrow right, r, b \cap dim \geq n \rightarrow data[dim], (d+1) \% k)$

$O(\sqrt{n} + k)$  if balanced