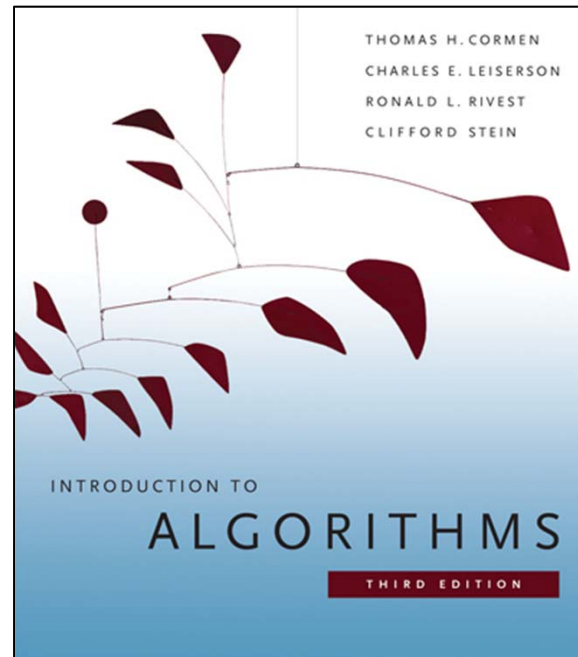


6.006

# *Introduction to Algorithms*



## **Lecture 24: Geometry**

Prof. Erik Demaine

# Today

- Computational geometry
- Line-segment intersection
  - Sweep-line technique
- Closest pair of points
  - Divide & conquer strikes back!

# Motivation: Collision Detection

photo by fotios lindiakos  
[http://www.flickr.com/photos/fotios\\_lindiakos/342596118/](http://www.flickr.com/photos/fotios_lindiakos/342596118/)



# Motivation: Collision Detection

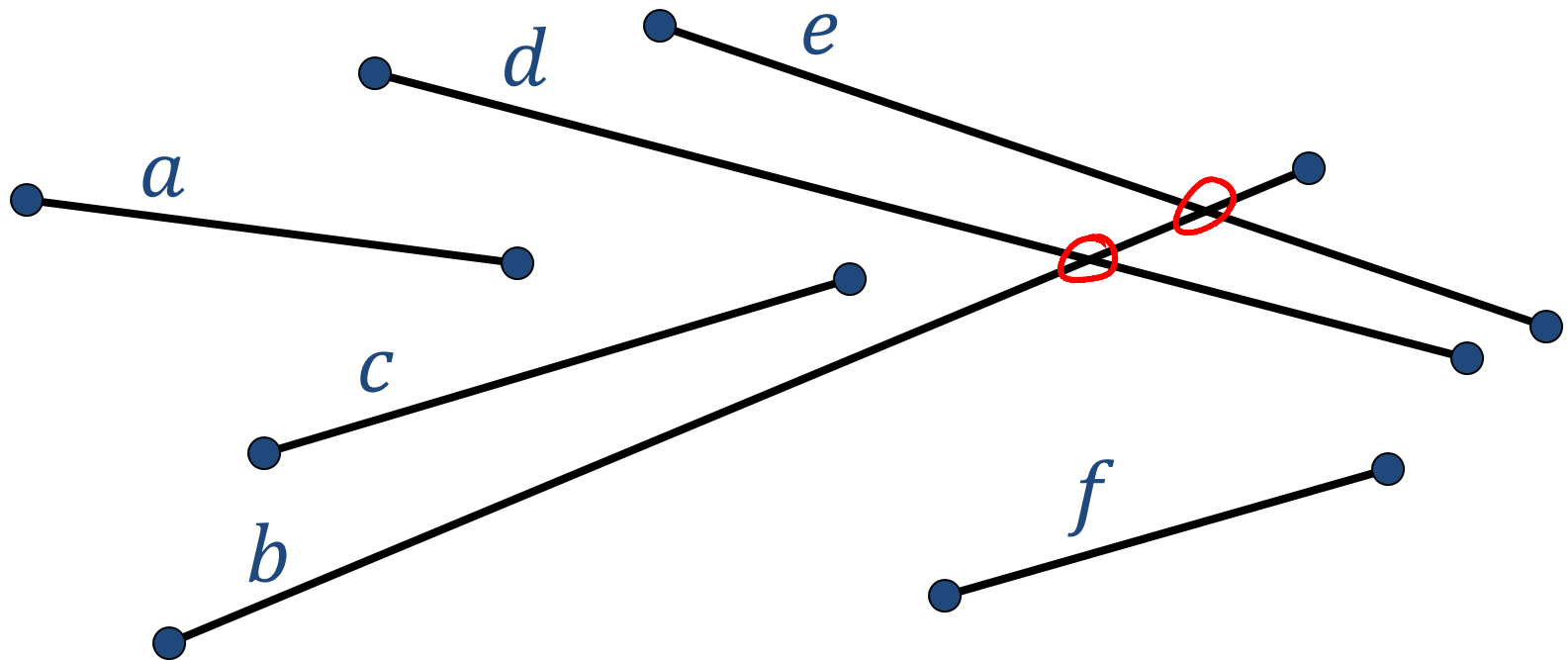


“GTA 4 Carmageddon!” by dot12321

<http://www.youtube.com/watch?v=4-620xx7yTo>

# Line-Segment Intersection

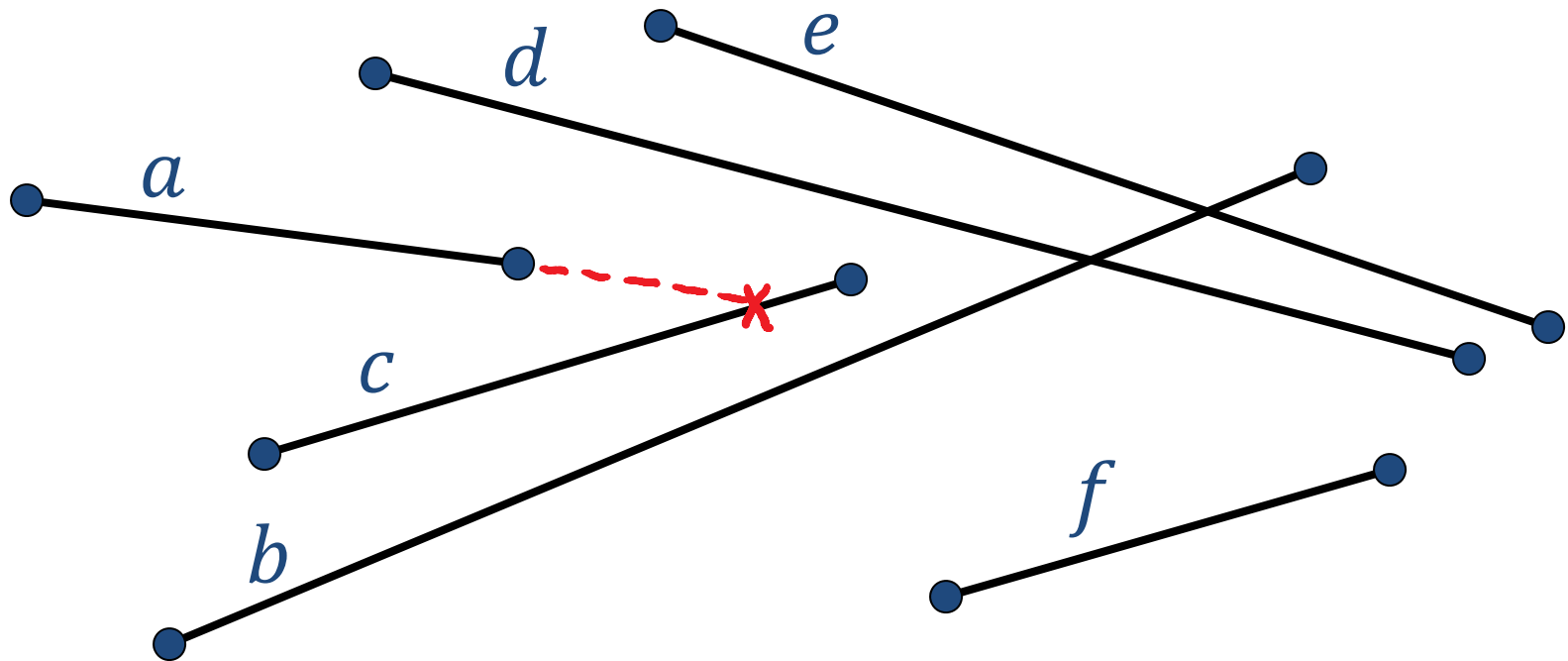
- Input:  $n$  line segments in 2D
- Goal: Find the  $k$  intersections



# Obvious Algorithm

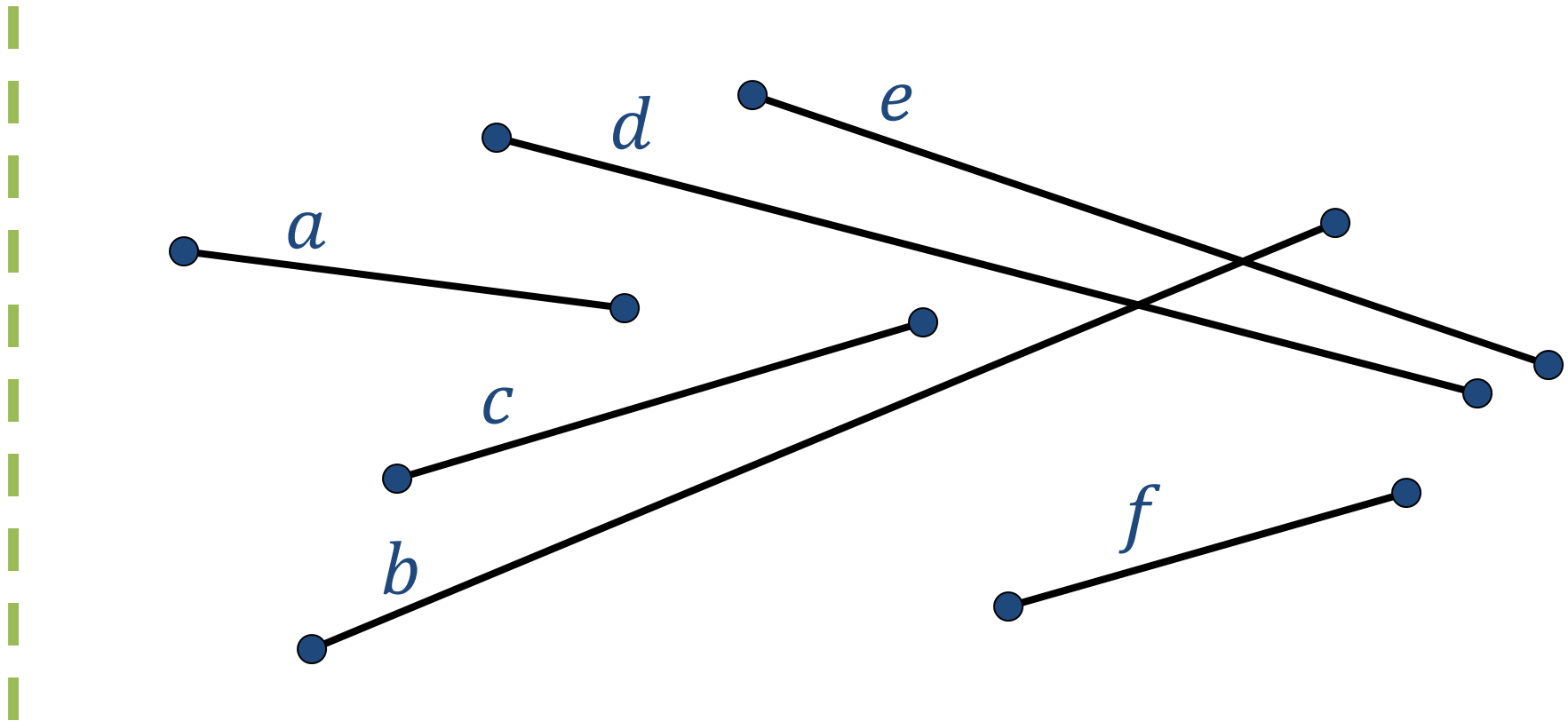
for every pair  $(\ell, \ell')$  of line segments:  
check for intersection

$\} O(n^2)$

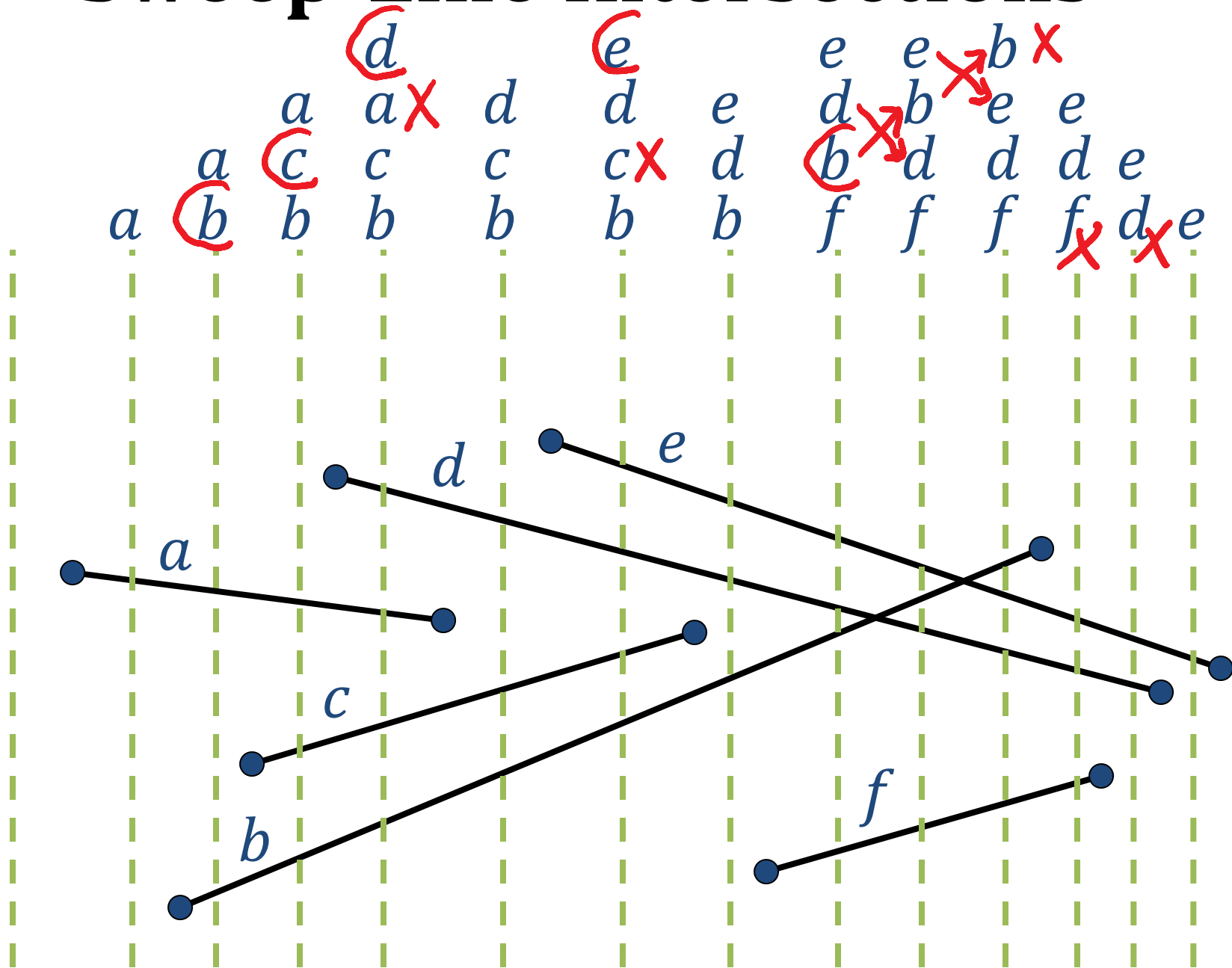


# Sweep-Line Technique

- Idea: Sweep a vertical line from left to right
- Maintain intersection of line with input



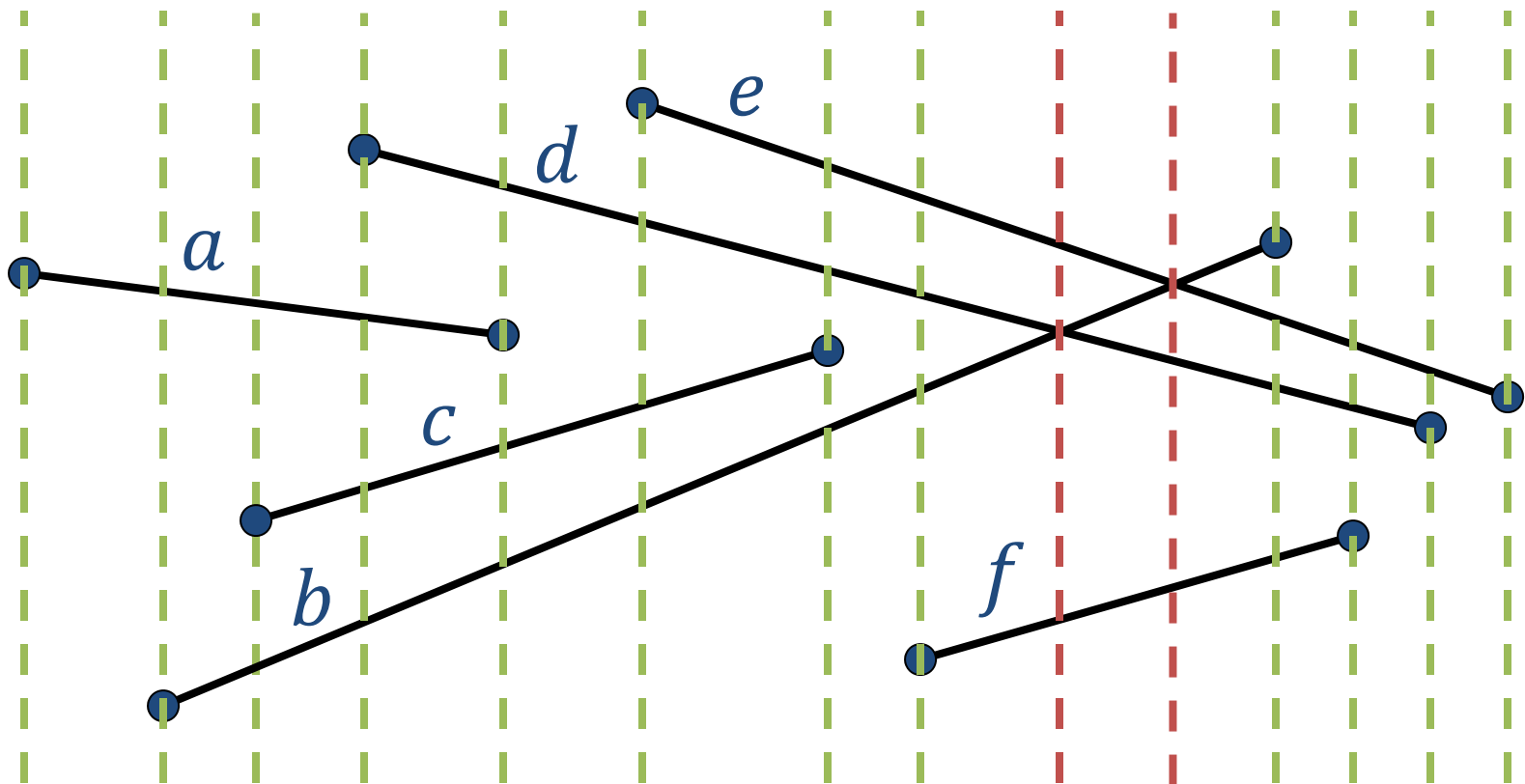
# Sweep-Line Intersections



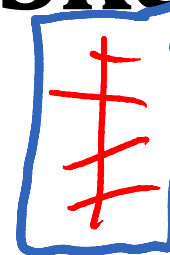


# Sweep-Line Events

- Discretize continuous motion of sweep line
- **Events** when intersection changes
  - Segment endpoints
  - Intersections



# Sweep-Line Algorithm Sketch

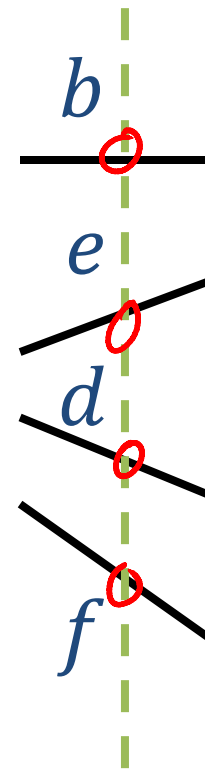
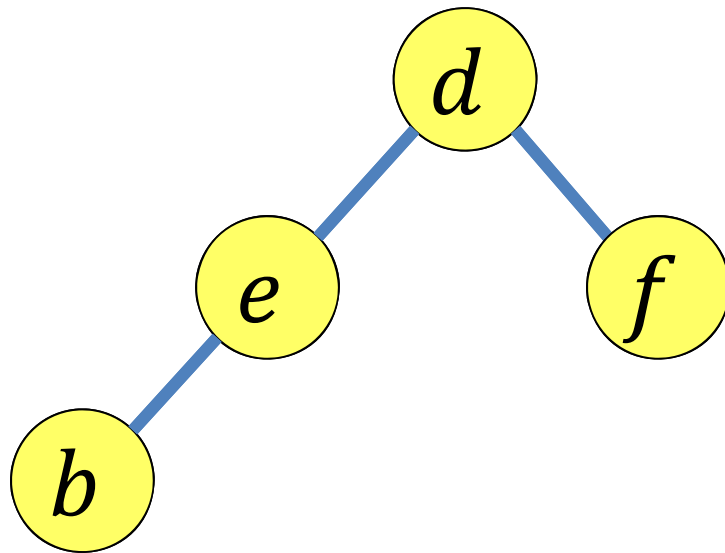


- Maintain sweep-line intersection
- Maintain **priority queue** of (possible) event *times* (=  $x$  coordinates of sweep line)
- Until queue is empty:
  - Delete minimum event time  $t$  from priority queue
  - Update sweep-line intersection from  $< t$  to  $> t$
  - Update possible event times in priority queue

*“Discrete-event simulation”*

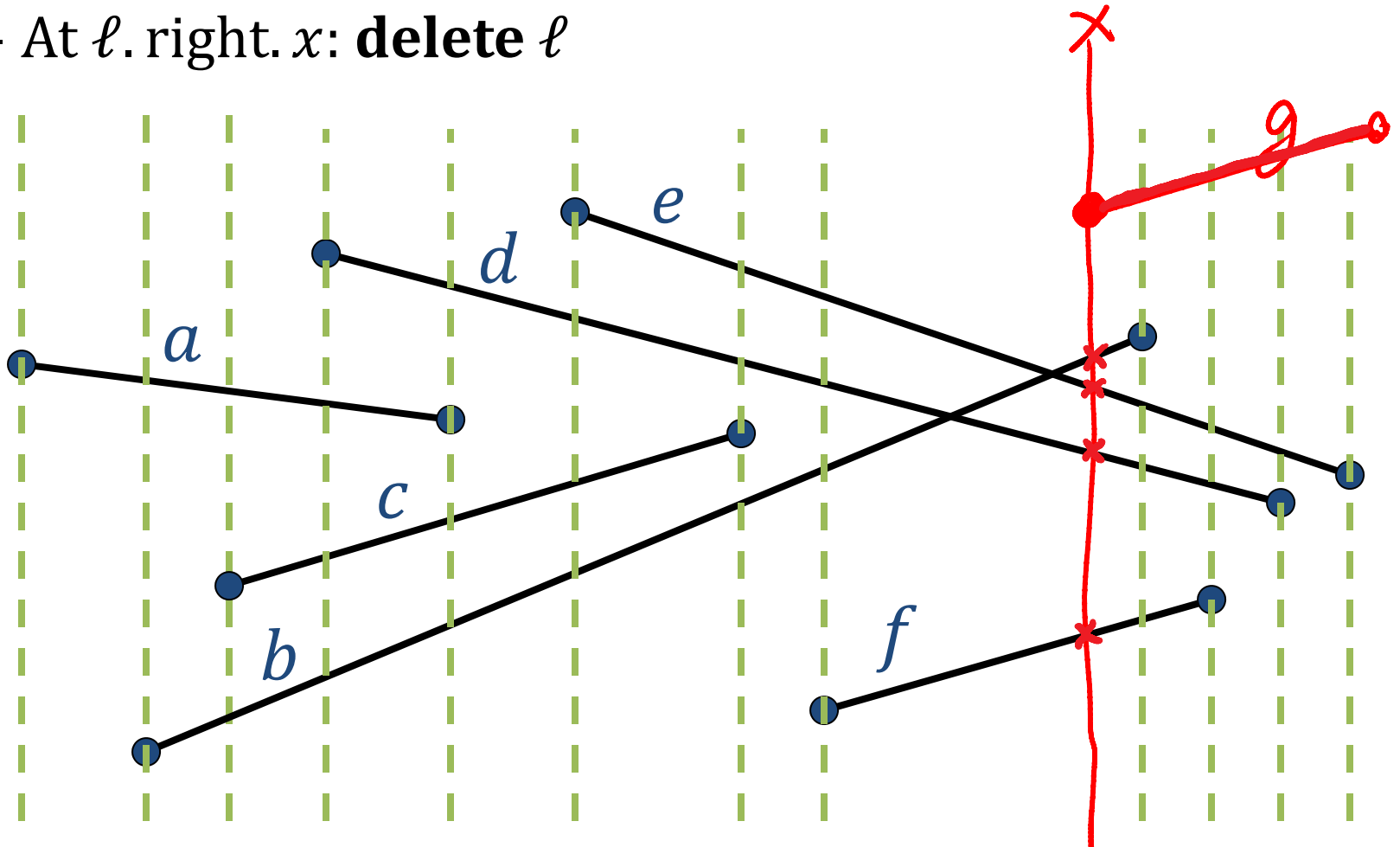
# Intersection Data Structure

- Balanced binary search tree (e.g., AVL tree) to store sorted ( $y$ ) order of intersections



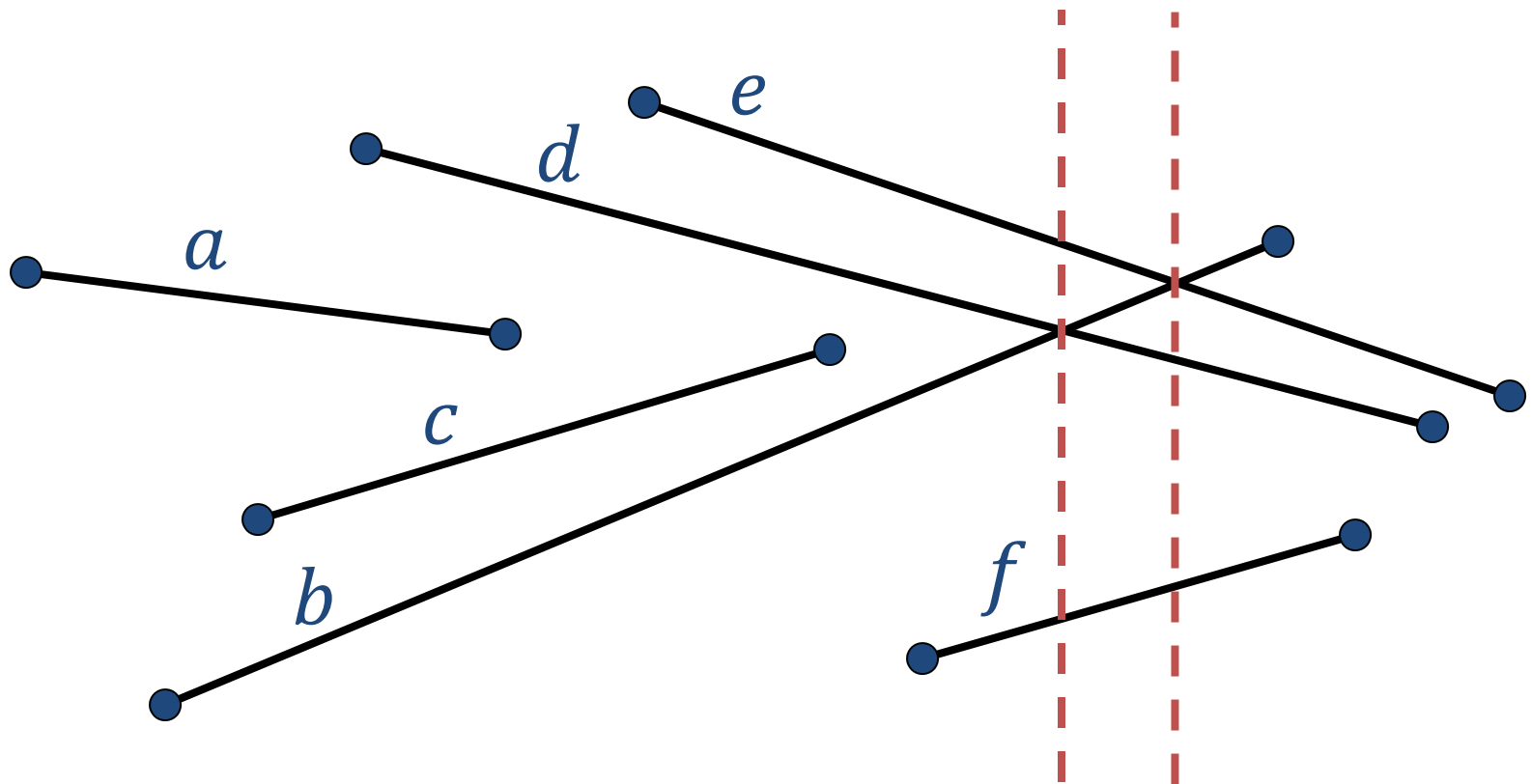
# Endpoint Events

- For each line segment  $\ell = (\ell.\text{left}, \ell.\text{right})$ :
  - At  $\ell.\text{left}.x$ : **insert**  $\ell$  (binary search for neighbors then)
  - At  $\ell.\text{right}.x$ : **delete**  $\ell$



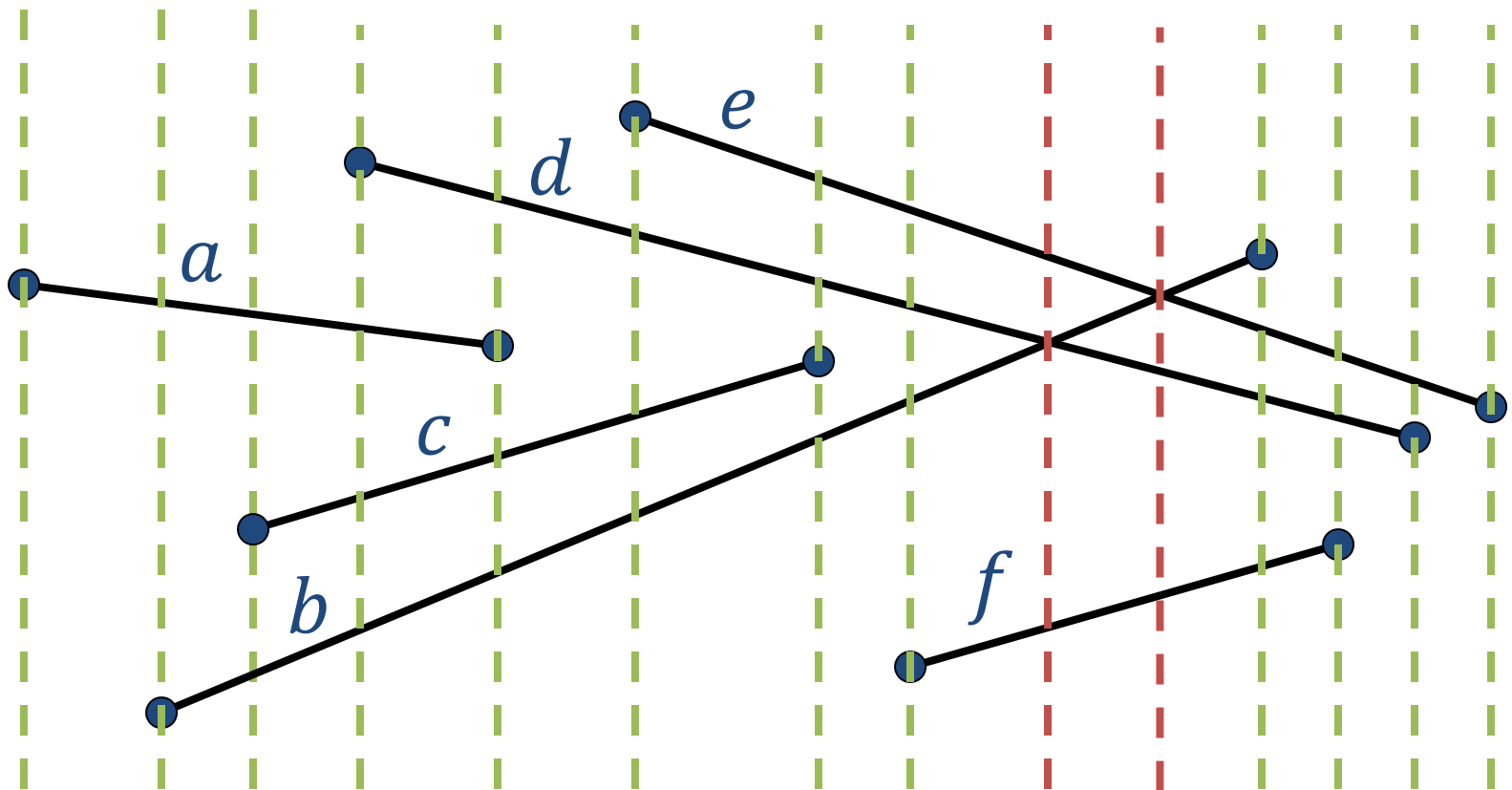
# Intersection Events?

- How to know when have intersection events?
- This is the whole problem!



# Intersection Events

- Compute when neighboring segments would intersect, if nothing changes meanwhile
- If such an event is next, then it really happens



# Sweep-Line Algorithm

$T$  = empty AVL tree

$Q$  = Build-Heap( $\{\ell.\text{left}.x, \ell.\text{right}.x$  for segment  $\ell\}$ )

while  $Q$  is not empty:

    event =  $Q.\text{delete-min}()$

    if event is  $\ell.\text{left}.x$ :

        insert  $\ell$  into  $T$  (binary searching with  $x = \ell.\text{left}.x$ )

    elif event is  $\ell.\text{right}.x$ :

        delete  $\ell$  from  $T$

    elif event is  $\text{meet}(\ell, \ell')$ :

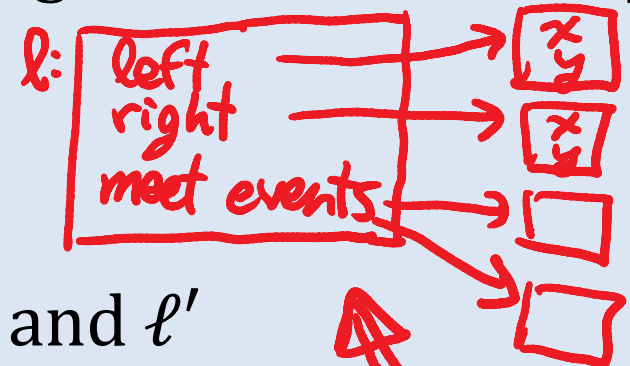
        report intersection between  $\ell$  and  $\ell'$

        swap contents of nodes for  $\ell$  and  $\ell'$  in  $T$

    for each node  $\ell$  changed or neighboring changed in  $T$ :

        delete all meet events involving  $\ell$  from  $Q$

        add  $\text{meet}(\ell, T.\text{pred}(\ell))$  &  $\text{meet}(\ell, T.\text{succ}(\ell))$  to  $Q$



$O(1)$

# Sweep-Line Analysis

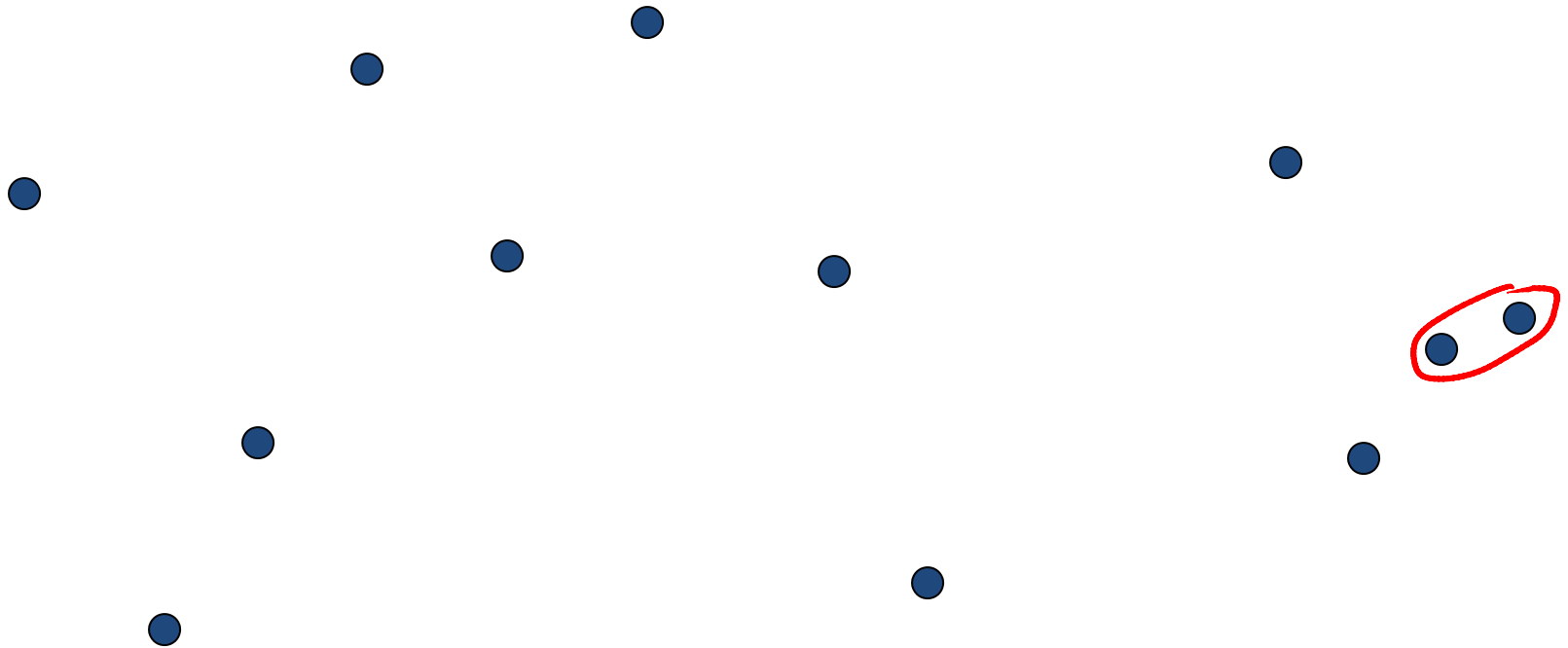
- Running time =  $O(\# \text{ events} \cdot \lg(\# \text{ events}))$
- Number of endpoint events =  $2n$
- Number of meet events =  
number  $k$  of intersections = size of output
- Running time =  $O((n + k) \lg n)$
- ***Output sensitive algorithm:***  
running time depends on size of output
- Best algorithm runs in  $O(n \lg n + k)$  time

$$\begin{aligned} & \lg(n+k) \\ & \leq \lg(n+n^2) \\ & = O(\lg n) \end{aligned}$$



# Closest Pair of Points

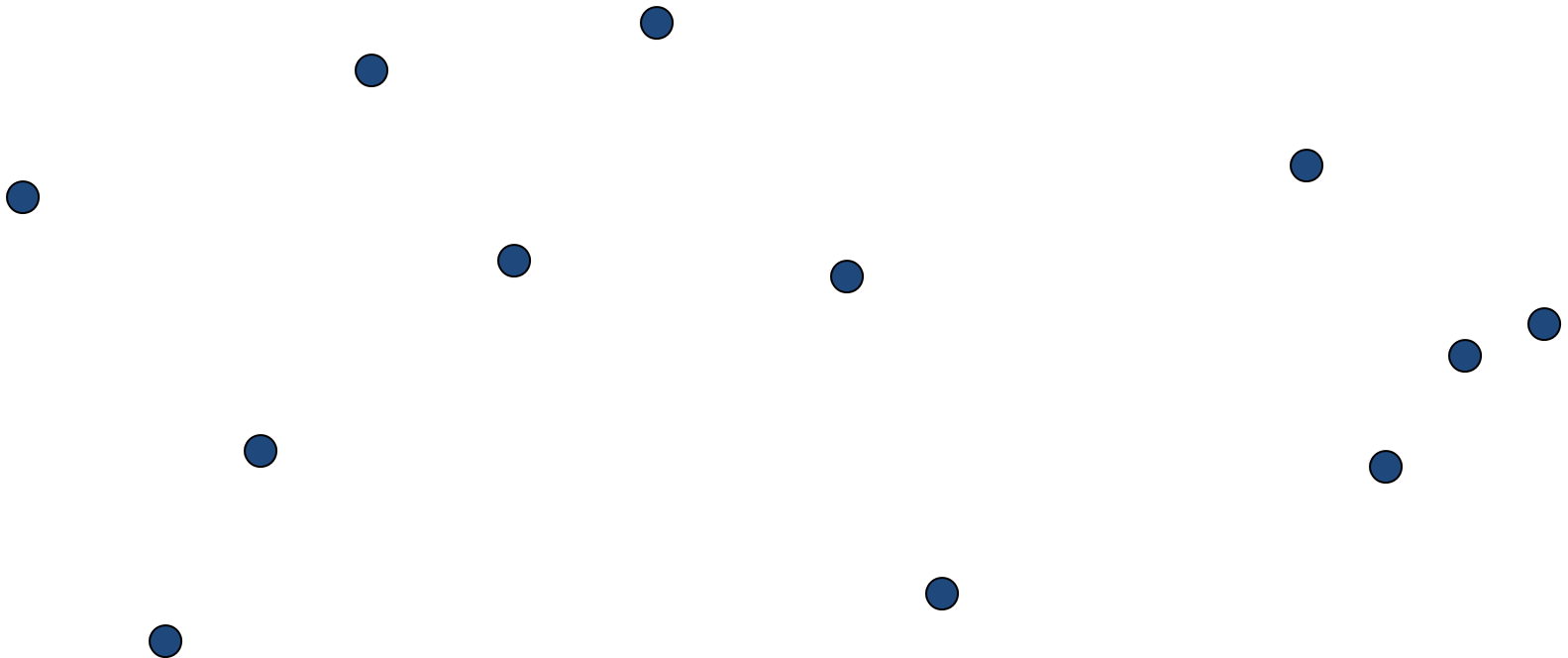
- Input:  $n$  points in 2D
- Goal: find two closest points



# Obvious Algorithm

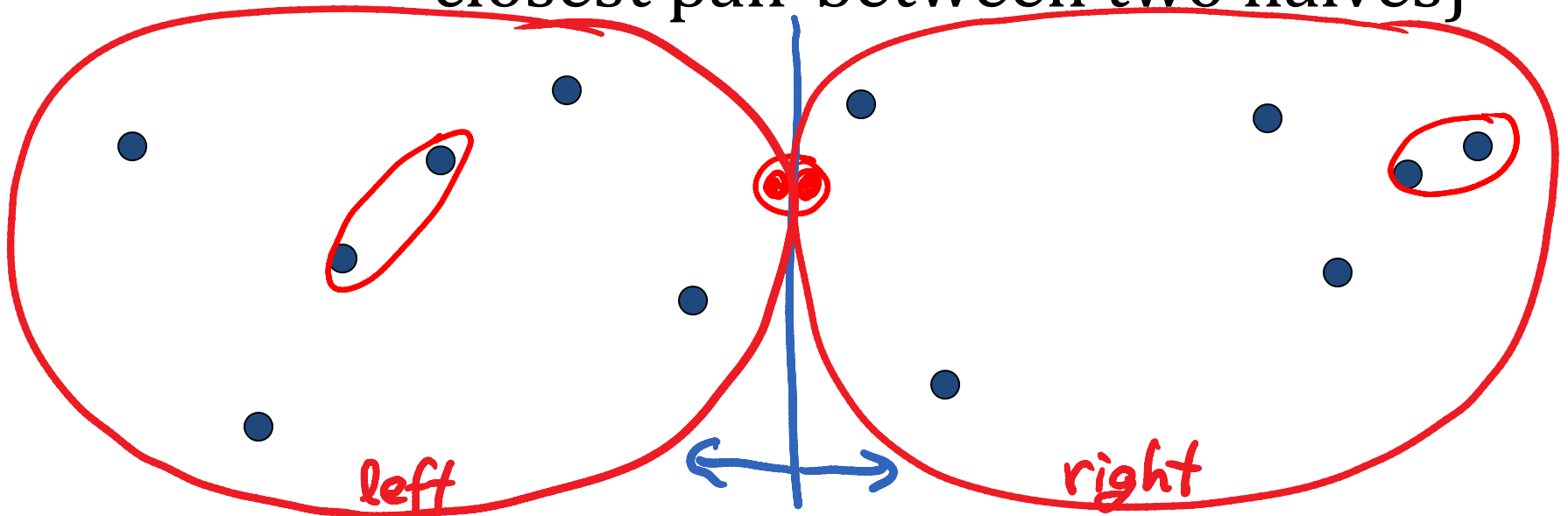
$\min(\text{distance}(p, q)$   
for every pair  $(p, q)$  of points)

$\} O(n^2)$



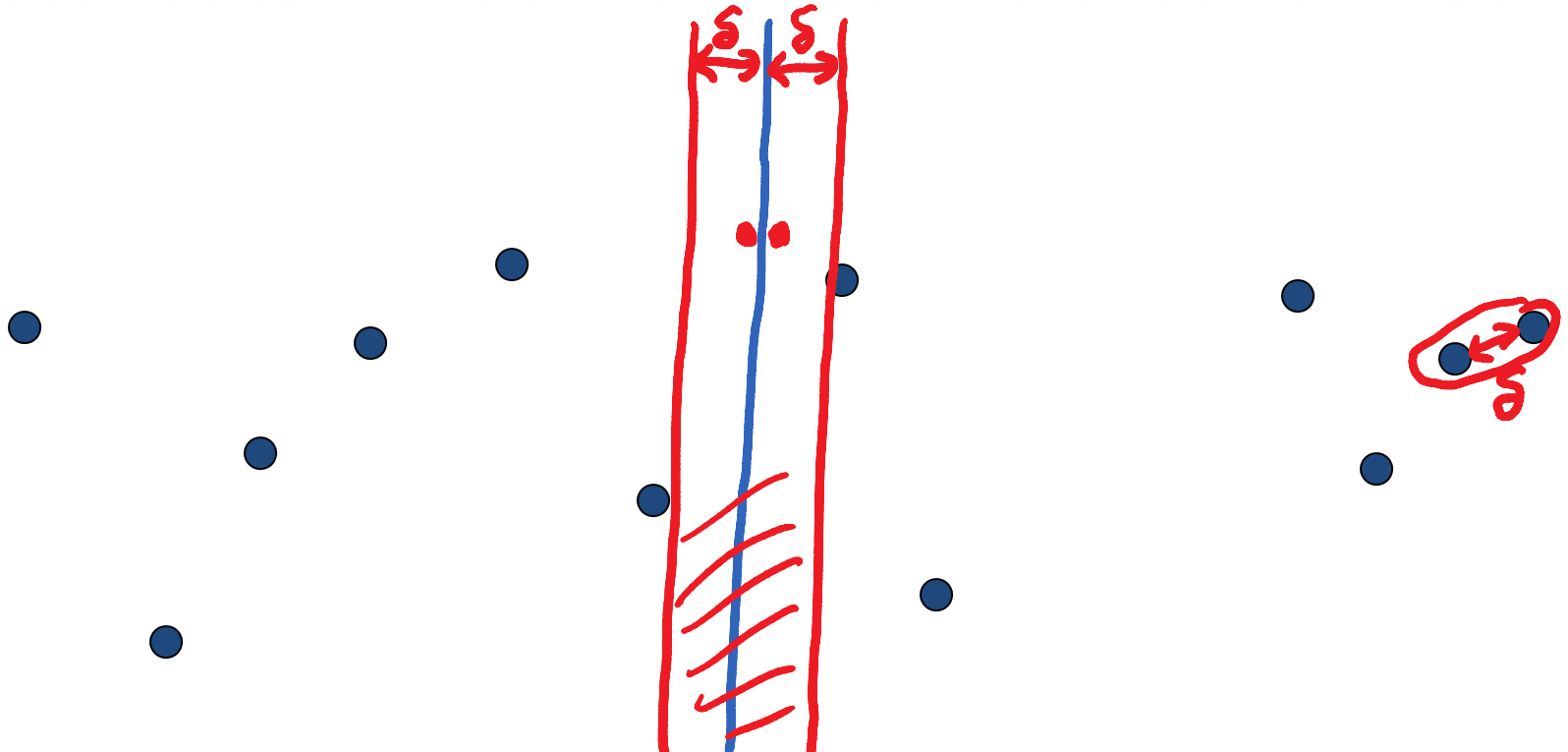
# Divide-and-Conquer Idea

- Initially sort points by  $x$  coordinate
- Split points into left half and right half
- Recurse on each half: find closest pair
- return  $\min\{\text{closest pair in each half, closest pair between two halves}\}$



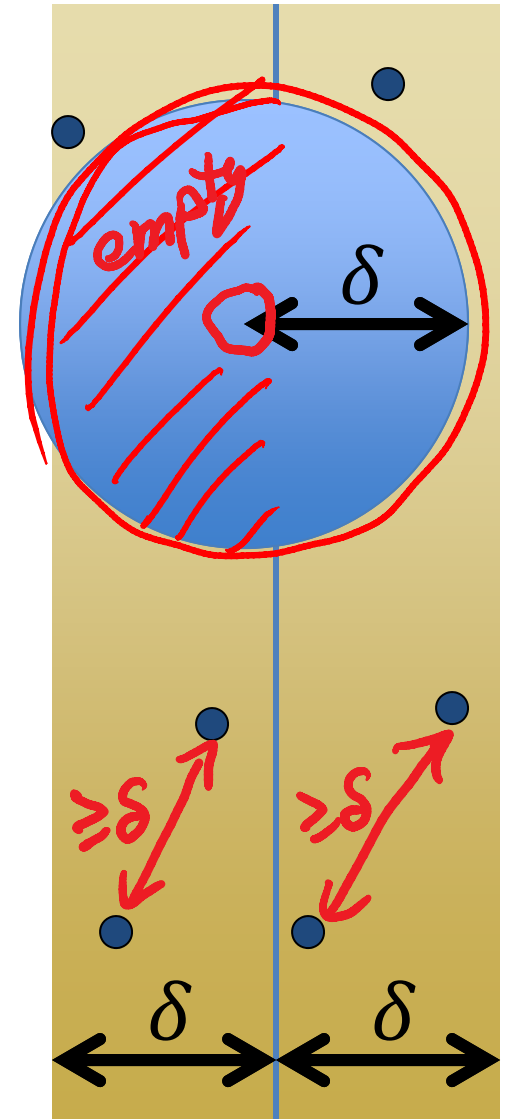
# Closest Pair Between Two Halves?

- Let  $\delta = \min\{\text{closest pair in each half}\}$
- Only interested in pairs with distance  $< \delta$
- Restrict to window of width  $2\delta$  around middle

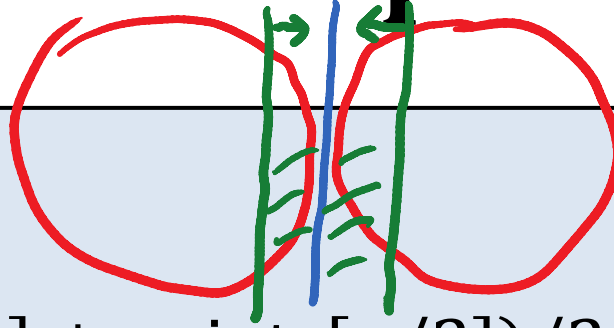


# Closest Pair Between Two Halves

- For each left point, interested in points on right within distance  $\delta$
- Points on right side can't be within  $\delta$  of each other
- So at most three right points to consider for each left point
  - Ditto for each right point
- Can compute in  $O(n)$  time by merging two sorted arrays



# Divide-and-Conquer



presort points by  $x$

def closest-pair(points):

middle = (points[n/2 - 1] + points[n/2])/2

$\delta = \min\{\text{closest-pair}(\text{points}[:n/2]),$

closest-pair(points[n/2: ])\}

sort points[points.succ(middle -  $\delta$ ):n/2] by  $y$

sort points[n/2: points.pred(middle +  $\delta$ )] by  $y$

merge and find closest pair between two lists

return min{ $\delta$ , closest distance from merge}

$O(1)$   
 $2T(\frac{n}{2})$   
 $O(n \lg n)$   
 $O(n)$

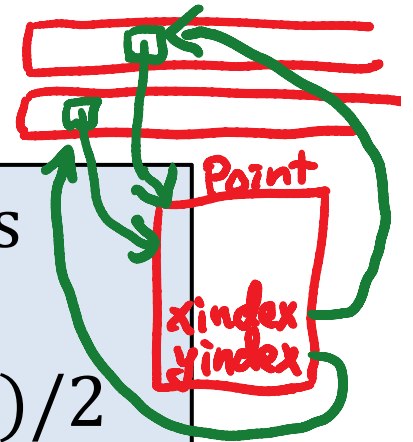
$$\frac{n}{2} \lg \frac{n}{2} + \frac{n}{2} \lg \frac{n}{2} = n \lg \frac{n}{2} = \boxed{n \lg n} - n$$

$$T(n) = 2T(\frac{n}{2}) + O(n \lg n) = O(n \lg^2 n)$$

# Faster Divide-and-Conquer

[Shamos & Hoey 1975]

xpts:  
ypts:



presort points by  $x$  and  $y$ , and cross link points

```
def closest-pair(xpoints, ypoints):
```

```
    middle = (xpoints[n/2 - 1] + xpoints[n/2])/2
```

```
     $\delta = \min\{\text{closest-pair}(xpoints[:n/2], \rightarrow ypoints),$   
              $\text{closest-pair}(xpoints[n/2:], \rightarrow ypoints)\}$ 
```

```
    xpoints[xpoints.succ(middle -  $\delta$ ):n/2]
```

```
    xpoints[n/2:xpoints.pred(middle +  $\delta$ )]
```

```
    map to ypoints & find closest pair between lists
```

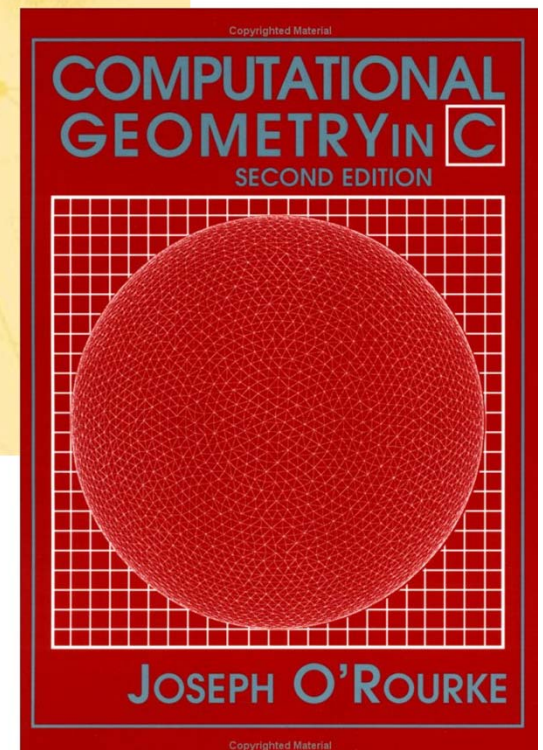
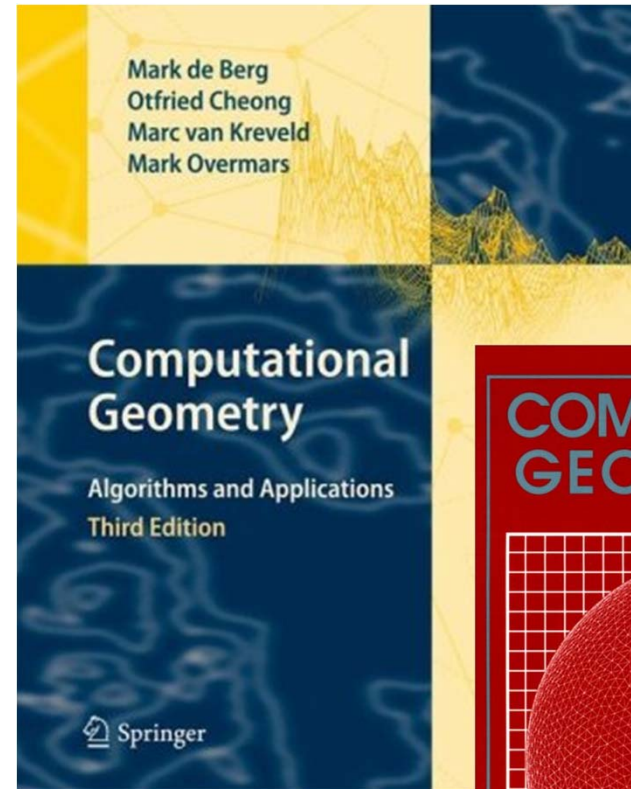
```
    return  $\min\{\delta, \text{closest distance from merge}\}$ 
```

$2T(\frac{n}{2})$   
 $\} O(n)$   
 $\} O(n)$

$$T(n) = 2T(\frac{n}{2}) + O(n)$$
$$= O(n \lg n)$$

# Other Computational Geometry Problems

- Convex hull
- Voronoi diagram
- Triangulation
- Point location
- Range searching
- Motion planning
- ...



**6.850: Geometric Computing**