#### CSCI 4560/6560 Computational Geometry

https://www.cs.rpi.edu/~cutler/classes/computationalgeometry/F23/

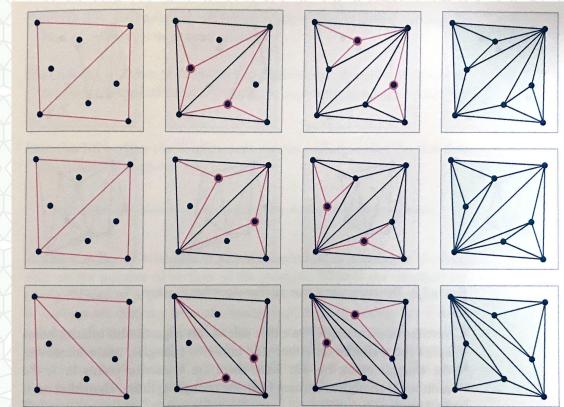
# Lecture 16: Windowing, Interval & Segment Trees

- Review from Last Time: Delaunay Triangulations
- Motivation: Cartography Windowing & Data Selection
- Lecture 8 Review: Points in k-D trees and Range Trees
- 1D Interval Tree
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"Discrete and Computational Geometry", Devadoss & O'Rourke, Princeton University Press 2011, Chapter 3

# **Construction by Point Insertion**

- Start with convex hull
  - Triangulate it
  - k-2 triangles
- For some ordering of the other points
  - Determine which triangle the point lies inside of
  - Replace that triangle with 3 triangles
  - (n k) \* 2 additional triangles
- 2\*n k 2 total triangles!

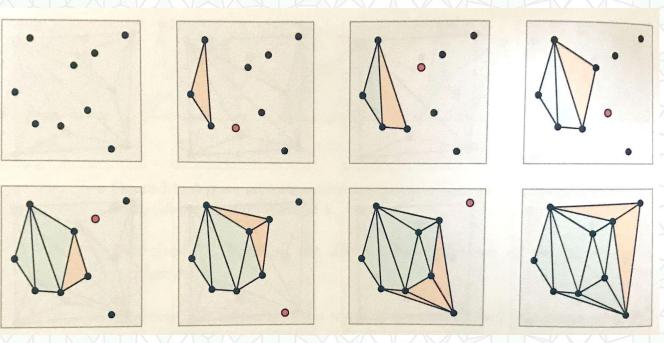


"Discrete and Computational Geometry", Devadoss & O'Rourke, Princeton University Press 2011, Chapter 3

# **Construction by Line Sweep**

- Sort the input points by x
- Form a triangle with the 3 leftmost points

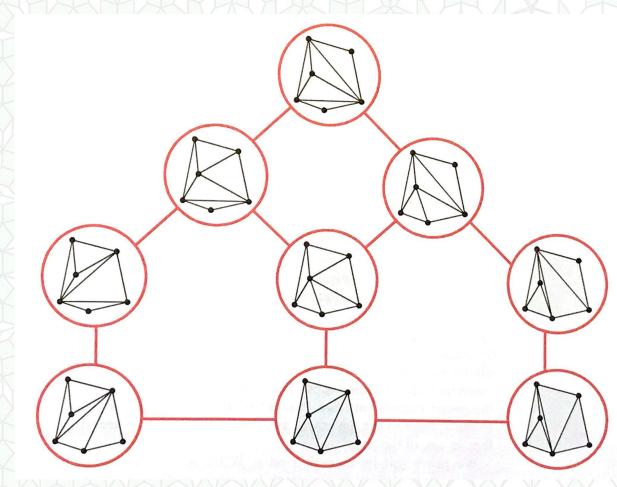
 Add every other point from left to right



- Determine which points on the current hull are visible from the new point
- Add a fan of triangles connecting the new point to the visible hull points

# The Flip Graph

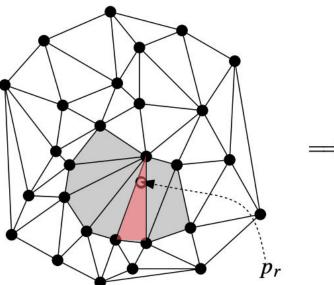
- If we did generate every triangulation...
- Let's organize the triangulations as nodes in a graph
- We'll put an edge between two nodes if flipping a single edge converts one triangulation into the other triangulation

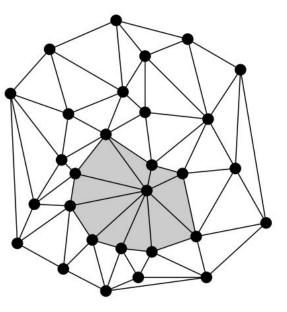


"Discrete and Computational Geometry", Devadoss & O'Rourke, Princeton University Press 2011, Chapter 3

# Randomized Incremental Construction of Delaunay Triangulation

- Randomize order of points and insert one at a time
- Identify which triangle contains p<sub>r</sub>
- Split into
  3 smaller
  triangles
- Flip neighboring edges as necessary





Hopefully the footprint of impact is small!

#### **Delaunay Construction Analysis Summary**

• Brute force (enumerate all triangles, construct circles, reject...)

 $\rightarrow O(n^3 * n) = O(n^4)$ 

Construct any triangulation & Flip until all edges are legal

 $\rightarrow O(n^2)$ 

Randomized Incremental Construction

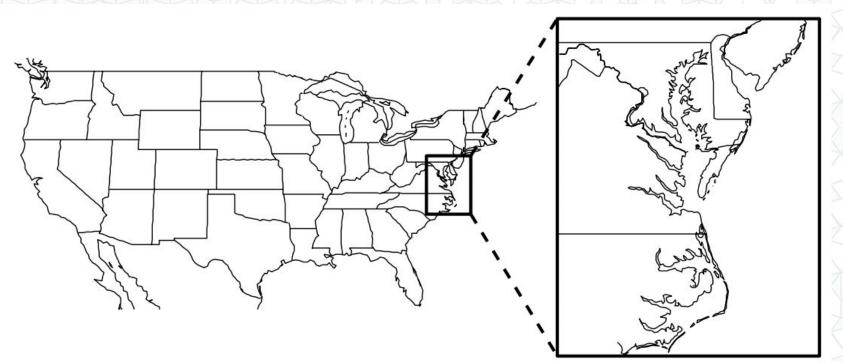
 $\rightarrow O(n \log n)$ 

• By duality, reduce to problem of Constructing the Voronoi Diagram  $\rightarrow O(n \log n)$ 

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## Motivation: Cartography (Map-Making)

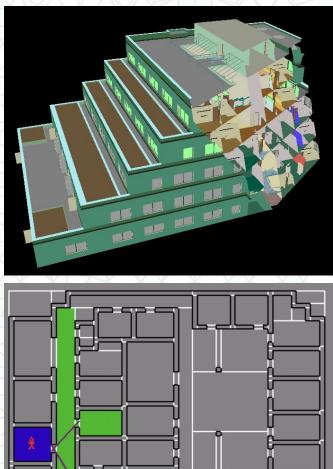
Select a small rectangular region to display in a window at larger scale



# Motivation: Visibility

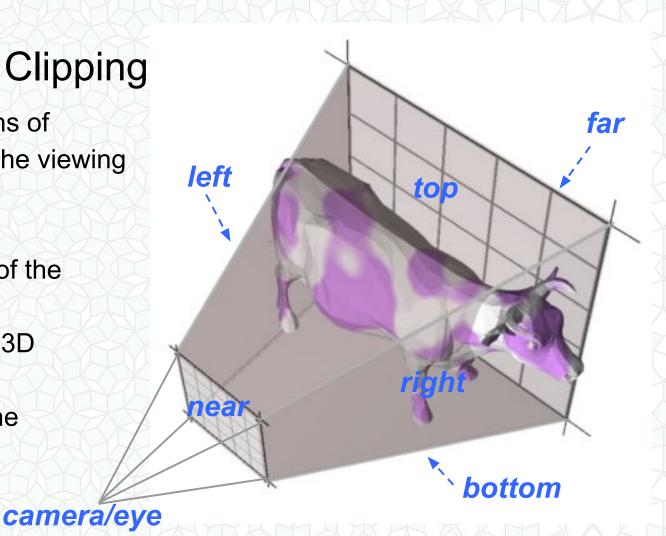


Seth Teller, PhD thesis, 1992, Berkeley Soda Hall walkthrough



# Graphics: 3D Clipping

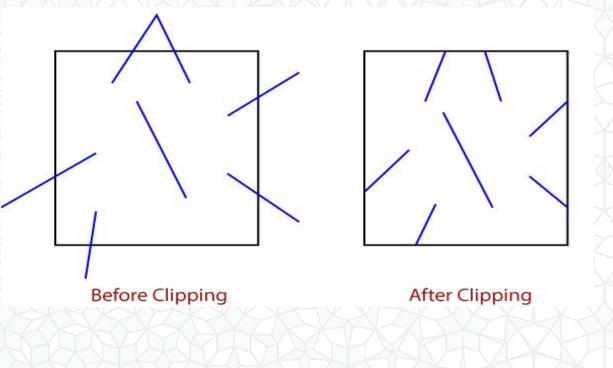
- Eliminate portions of objects outside the viewing frustum
- View Frustum
  - boundaries of the image plane projected in 3D
  - a near & far clipping plane



# Graphics: 2D Clipping

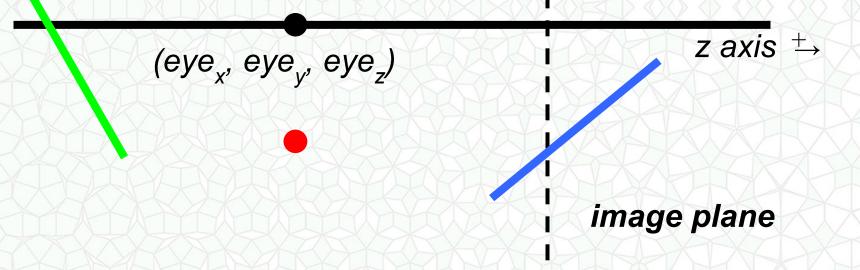
Why do it?

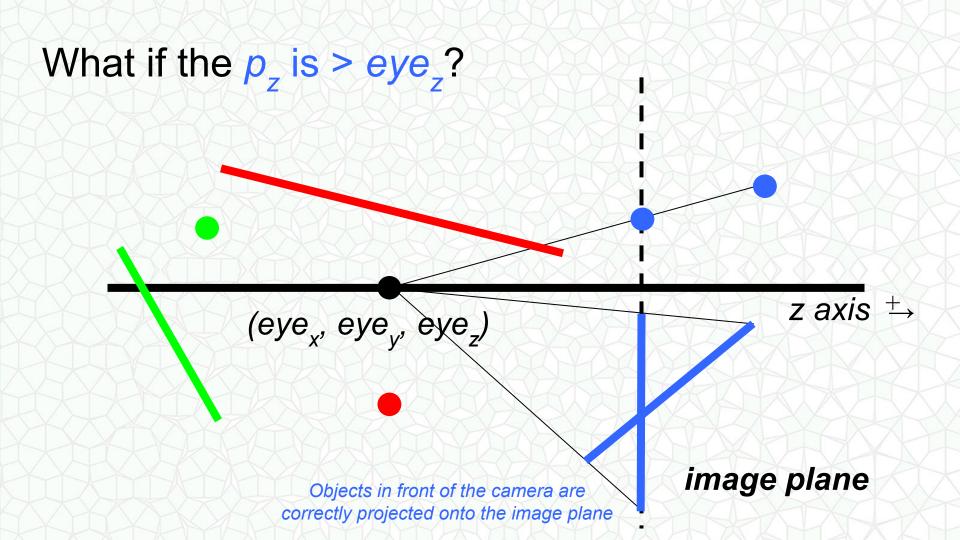
- Reduce amount of geometry going through graphics pipeline
- Prevent rendering bugs from overflow, wraparound, things behind the camera, etc.

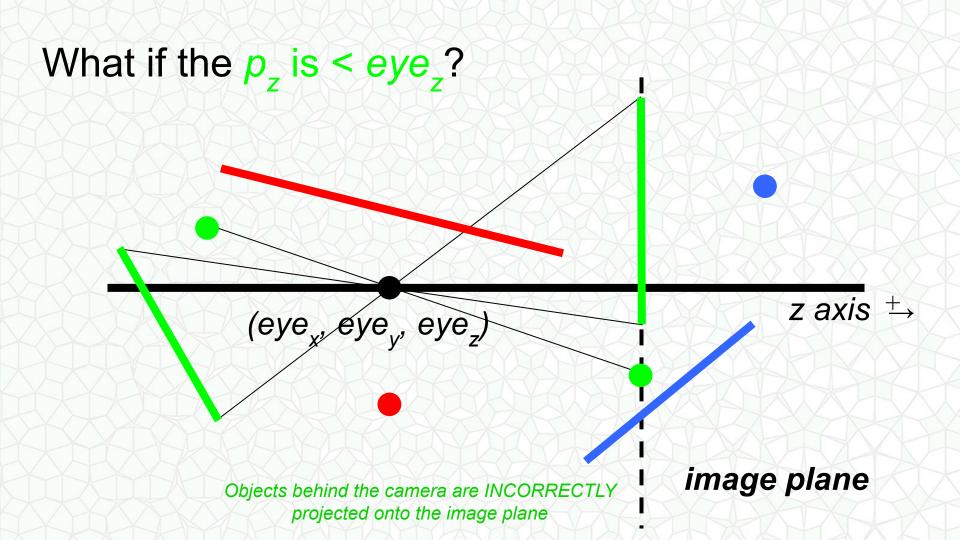


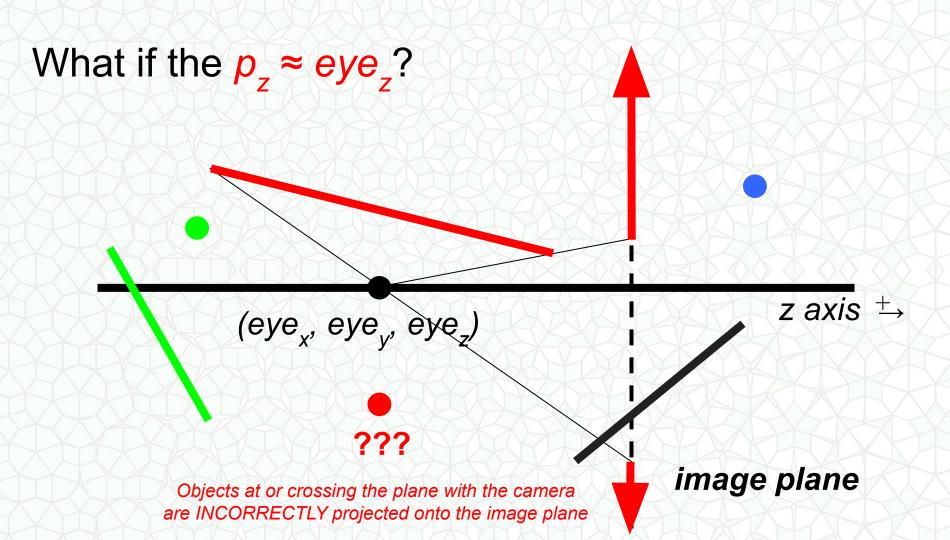
https://www.tutorialandexample.com/clipping-in-computer-graphics

#### **Perspective Projection onto Image Plane**

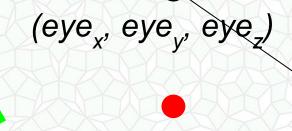








# What if the $p_z \approx eye_z$ ?



Objects at or crossing the plane with the camera are INCORRECTLY projected onto the image plane

???

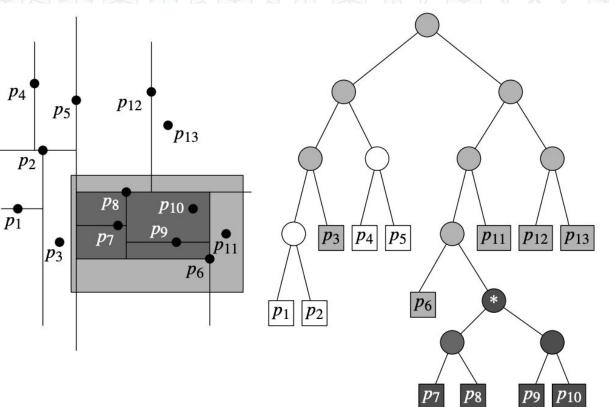
image plane

z axis  $\xrightarrow{+}$ 

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# Review from Lecture 8: 2D k-d Tree

- Used to store points
- Alternate splitting horizontally & vertically
- If data is available for preprocess, the structure is easy to balance
- Point data is only stored at the leaves



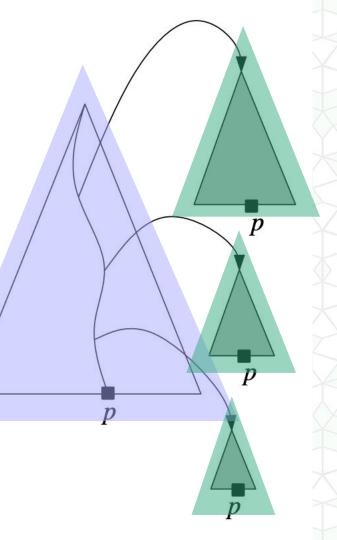
# Review from Lecture 8: How to Query 2D Range Tree

• Search through level 1 (blue) tree for all intermediate nodes that fit completely inside the query's *x* range

For each matched intermediate blue node

 Search through the corresponding level 2 (green) trees for all nodes and leaves that fit completely inside the query's y range

Return all matching data!



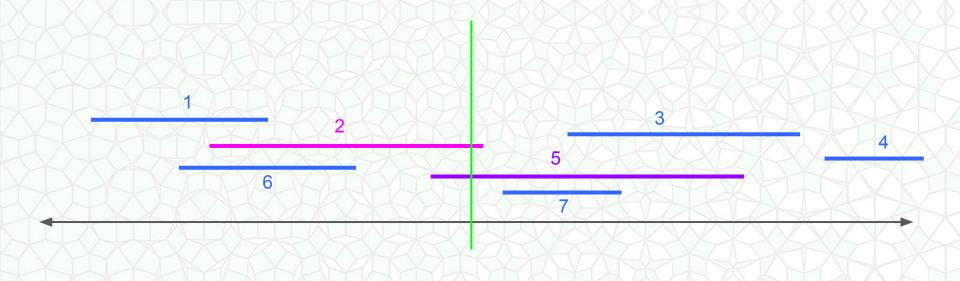
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#### What about Segments? Let's Tackle 1D First...

- Input: A collection of *n* line segments on the x-axis
- For a query interval, return all line segments that overlap the query interval

#### **Traditional Binary Search Tree**

- Select split point near middle of data
- What about segments that overlap the split?



#### **Traditional Binary Search Tree**

- Select split point near middle of data
- What about segments that overlap the split?
- Should we store them on both sides?
  - Uses extra memory
  - Have to remove duplicates

6

We may lose our O(log n) performance!

 $\frac{2}{1.6}$ 

5

3

16

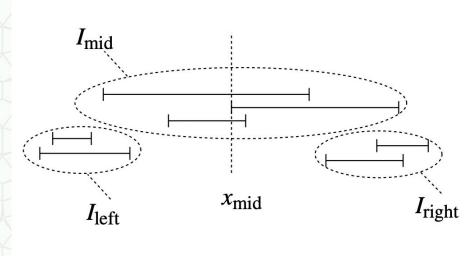
5

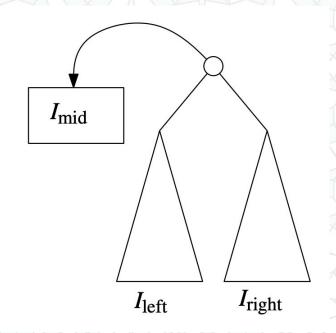
3 5

Computational Geometry Algorithms and Applications, de Berg, Cheong, van Kreveld and Overmars, Chapter 10

#### Interval Tree

- Chose a split point and make 3 groups:
  - $I_{mid}$  = Segments that overlap the split
  - I<sub>left</sub> = Segments completely to the left
  - I<sub>right</sub> = Segments completely to the right

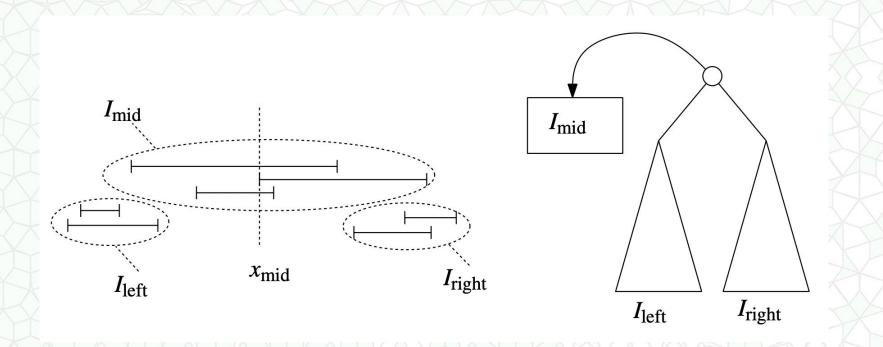




*Computational Geometry Algorithms and Applications*, de Berg, Cheong, van Kreveld and Overmars, Chapter 10

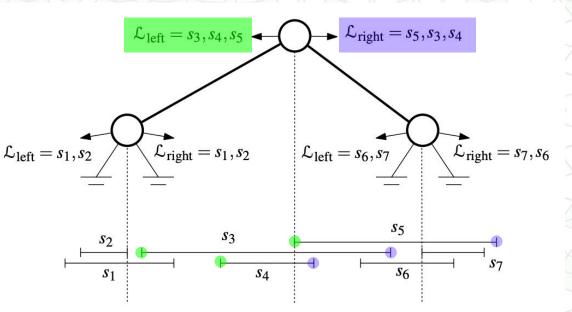
#### Interval Tree

Recurse down the tree only with items that DO NOT overlap the split point.



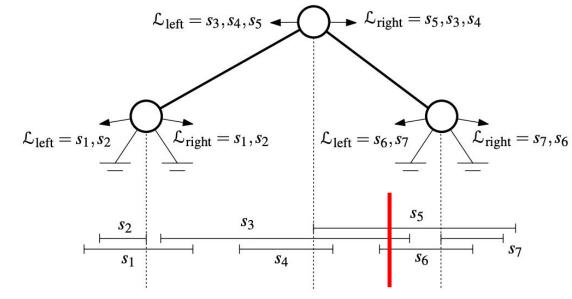
#### Interval Tree

- Items in I<sub>mid</sub> group will stay at the current node
- Each node stores two two sorted lists:
  - L<sub>left</sub> = I<sub>mid</sub> sorted by
    left endpoint
    (increasing)
    - L<sub>right</sub> = I<sub>mid</sub> sorted by right endpoint (decreasing)



#### **Interval Tree**

For a specific *query* 

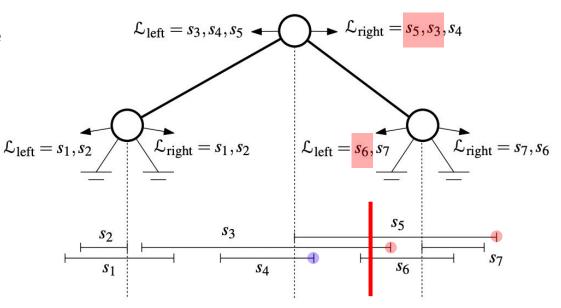


query

#### **Interval Tree**

#### For a specific *query*

- Determine if the query is to the right (or left) of the current node
- Walk through the L<sub>right</sub> list (or L<sub>left</sub> list) which is sorted by right (or left) endpoint
  - Return segments with endpoint further away from the query
  - Stop when you find a segment that doesn't match the query
- And recurse down the right (or left)



query

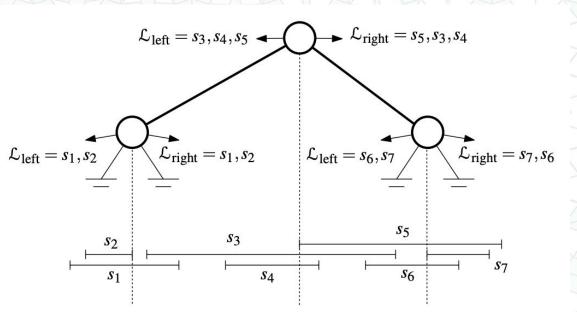
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## 1D Interval Tree Analysis

- For *n* input segments and a query that will return *k* items
- Memory Usage:

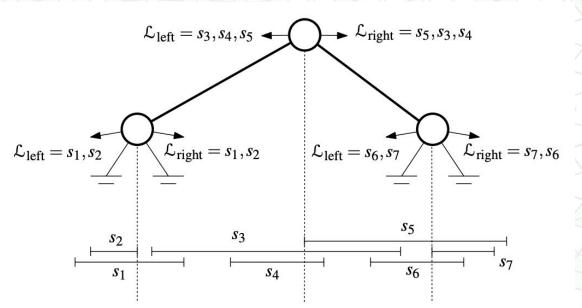
Construction Time:

• Query Time:



## 1D Interval Tree Analysis

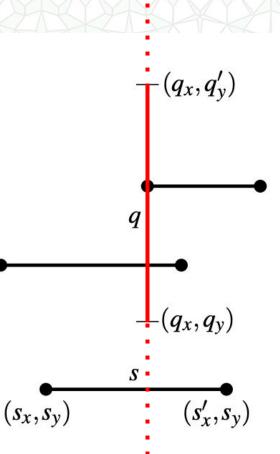
- For *n* input segments and a query that will return *k* items
- Memory Usage:
  → O(n)
- Construction Time:
  → O(n log n)
- Query Time:
  - $\rightarrow O(\log n + k)$



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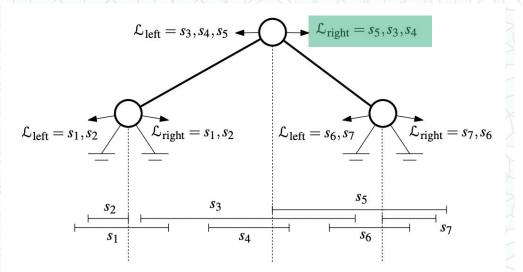
#### How do we Extend to 2D?

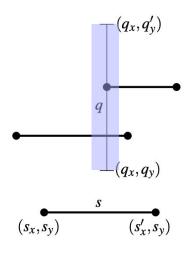
- First consider only horizontal input line segments
- And instead of a query line, we'll have a *query line segment*

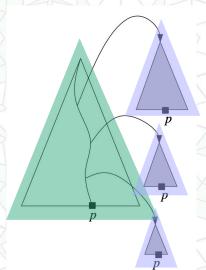


#### How do we Extend to 2D?

- We'll replace the sorted lists of the interval tree with a 2D range query
  ( first by x then by y ) of the 2D endpoints (Lecture 8)
  This will now require additional memory
- This will now require additional memory...





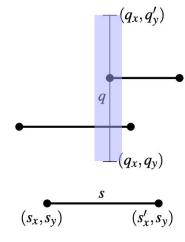


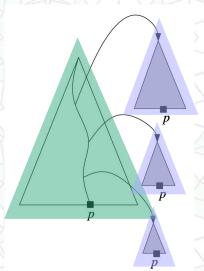
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## 2D Interval Tree + Range Tree Analysis

- For *n* horizontal input segments and a query segment that will return *k* items
- Memory Usage:

Construction Time:

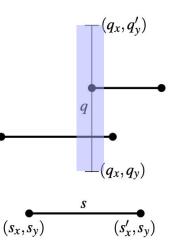


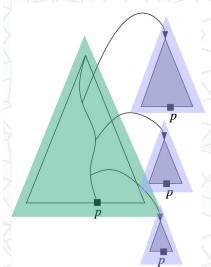


• Query Time:

## 2D Interval Tree + Range Tree Analysis

- For *n* horizontal input segments and a query segment that will return *k* items
- Memory Usage:
  → O(n log n)
- Construction Time:
  → O(n log n)
- Query Time:
  - $\rightarrow O(\log n + k)$

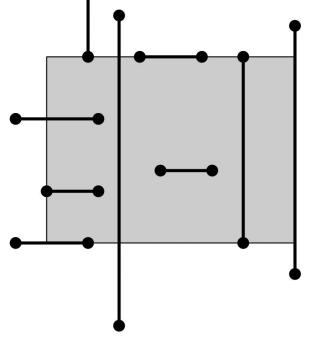




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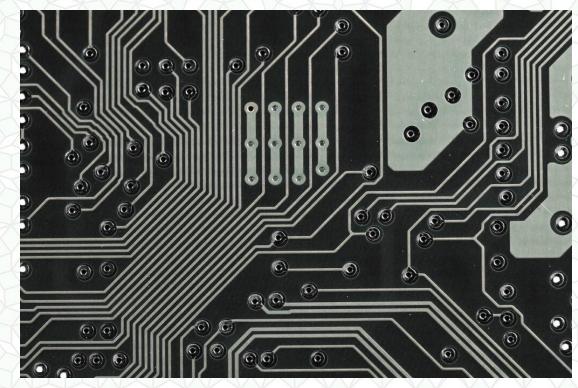
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 Initially, let's restrict to horizontal & vertical segments



- Why is Axis-Aligned Interesting?
- A bit later we will also restrict ourselves to non-overlapping segments...
   Why is that interesting?

Motivation: Circuit board layouts  $\rightarrow$ 

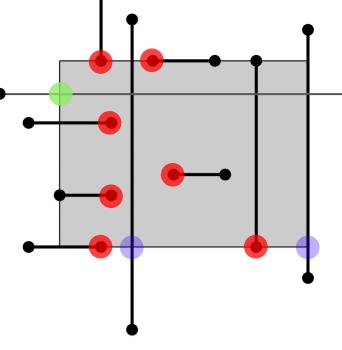


https://www.findlight.net/blog/evolution-of-laser-marking-and-engraving-technologies/

- Initially, let's restrict to horizontal & vertical segments
- Case Analysis:

Segments that touch the query box will:

- Have one endpoint inside the box, OR
- Will have both endpoints outside the box AND
  - Will be a horizontal segment that overlaps the left edge of the box OR
  - Will be a vertical segment that overlaps the bottom edge of the box



- Initially, let's restrict to horizontal & vertical segments
- Case Analysis:

Segments that touch the query box will:

- Have one endpoint inside the box, OR
- Will have both endpoints outside the box AND
  - Will be a horizontal segment that overlaps the left edge of the box OR
  - Will be a vertical segment that overlaps the bottom edge of the box

Handled with an Interval Tree + 2D Range Query

Handled with a

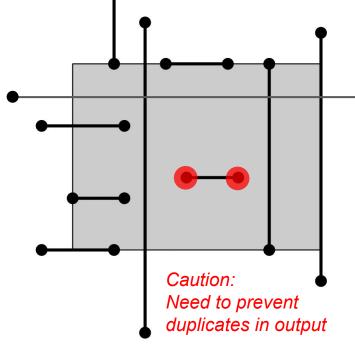
Lecture 8 2D

Range Query

- Initially, let's restrict to horizontal & vertical segments
- Case Analysis:

Segments that touch the query box will:

- Have one endpoint inside the box, OR
- Will have both endpoints outside the box AND
  - Will be a horizontal segment that overlaps the left edge of the box OR
  - Will be a vertical segment that overlaps the bottom edge of the box

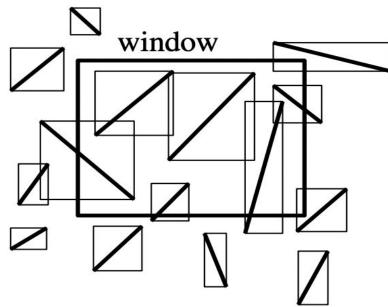


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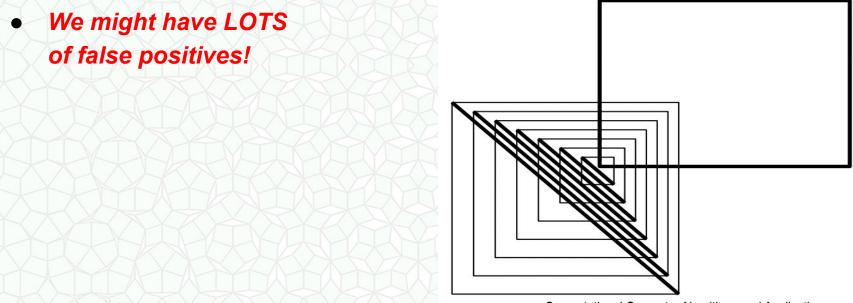
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- Not restricted to horizontal & vertical segments!
- (Note: We will later insist that the segments do not cross...)

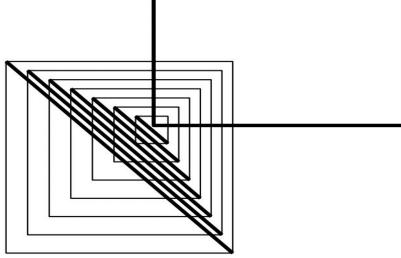
- Do the (sloppy?) Computer Graphics thing...
  - Output the segment if its bounding overlaps the axis-aligned query box



• Do the (sloppy?) Computer Graphics thing... Output the segment if its bounding overlaps the axis-aligned query box



- Do the (sloppy?) Computer Graphics thing... Output the segment if its bounding overlaps the axis-aligned query box
- We might have LOTS of false positives!
- Can we do better?
  - Ensure good (output sensitive)
    Performance
    AND
  - Avoid false positives?



## Segment Tree - First Dimension (x)

S1

- First, sort the *x* coordinates of the start and end points of every segment.
- Construct a balanced binary search tree with these x values.
- Insert every segment into the structure
  - If a segment  $s_1$ overlaps both the left and right subranges of the node store it at the node (do not recurse)

Computational Geometry Algorithms and Applications, de Berg, Cheong, van Kreveld and Overmars, Chapter 10

\$5

53

53

53

SA.

S4

\$3,54

\$2,55

· S1

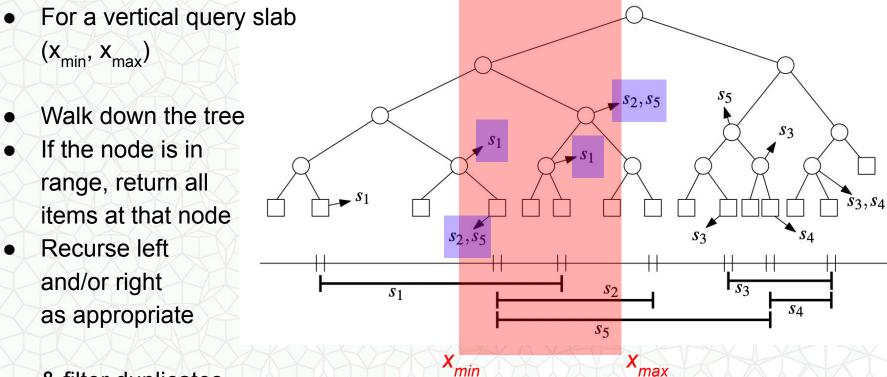
\$2

55

S1

\$2,55

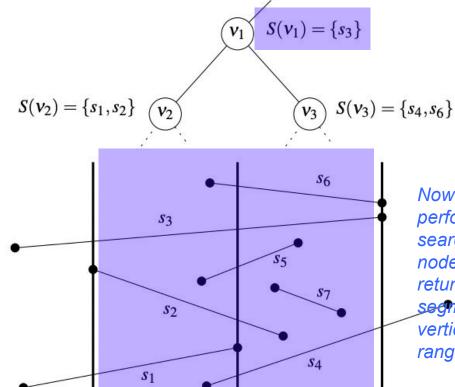
# Segment Tree - First Dimension (x)



• & filter duplicates...

## Segment Tree - Second Dimension (y)

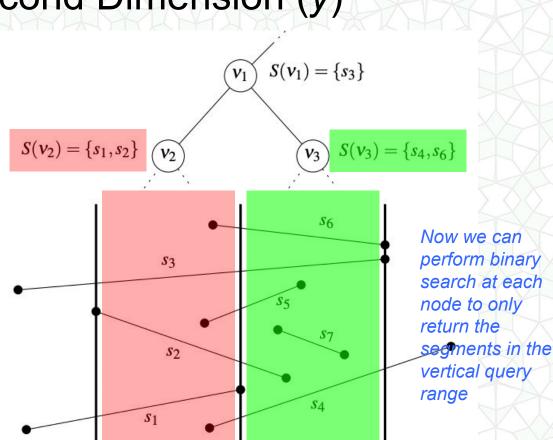
- To efficiently query a vertical range in addition to the horizontal range:
- Sort the segments stored at each node by y
- Remember: this is only the segments that completely overlaps the node's range
- Note: this is why we require no crossings in the input segments



Now we can perform binary search at each node to only return the segments in the vertical query range

## Segment Tree - Second Dimension (y)

- To efficiently query a vertical range in addition to the horizontal range:
- Sort the segments stored at each node by y
- Remember: this is only the segments that completely overlaps the node's range
- Note: this is why we require no crossings in the input segments

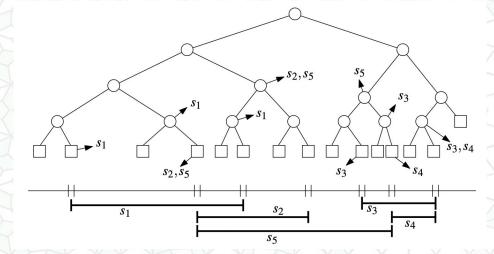


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#### **Segment Tree - Analysis**

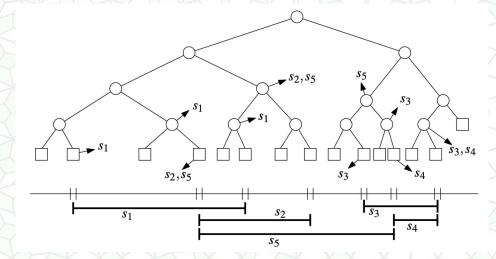
- For *n* input segments, for a query that will return *k* segments
- Memory: Each segment is stored in at most 2 nodes per level
- Construction Time: Presort all endpoints by x & y O(n log n)



• Query Time:

#### Segment Tree - Analysis

- For *n* input segments, for a query that will return *k* segments
- Memory: Each segment is stored in at most 2 nodes per level
   → O(n log n)
- Construction Time: Presort all endpoints by x & y O(n log n) → O(n log n)
- Query Time:
  - $\rightarrow O(\log n * \log n + k)$
  - $\rightarrow O(\log^2 n + k)$



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