# CS633 Lecture 08 Point Location 

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Based on Chapter 6 of the textbook and Ming Lin's lecture note at UNC and Robert Bless 's lecture note at WUSTL

## Point Location

- Reading: Chapter 6 of the Textbook
- Driving Applications
- Knowing Where You Are in GIS
- Seismic ray tracing
- Related Applications
- Triangulation using Trapezoidal Maps
- Motion Planning: Cell decomposition


## Knowing Where You Are

- Which county is the star located in?



## Knowing Where You Are

- Simulating seismic ray tracing
- 3D point location is needed
- Many rays are propagated in side the earth



## Knowing Where You Are

- Given a map and a query point $q$ specified by its coordinates, find the region of the map containing $q$
- A map can be treated as a subdivision of the plane into regions, or planar subdivision


## Planar Point Location

- Let $S$ be a planar subdivision with $n$ edges. The planar point location problem is to store $S$ in such a way that we can answer: given a query point $q$, report the face $f$ of $S$ that contains $q$. If $q$ lies on an edge or a vertex, report so

- bottom line: brute force algorithm takes $O(n)$ time for each query


## Planar Point Location

- Divide the subdivision into a finer subdivision (slabs) using vertical lines passing through each vertex

- Using binary search to find which slab the point is in $O(\log n)$
- Point location in a slab in $\mathbf{O}(\log n)$


## Total time $\mathbf{O}(\log n)$

## A Possible Solution

- But the storage requirement is high: $O\left(n^{2}\right)!!!$

$\Rightarrow$ We need a better solution: trapezoidal maps!


## Trapezoidal Maps

- A.k.a vertical decomposition
- A.k.a trapezoidal decomposition


Drawing two vertical extensions from every endpoint

- one going upwards
- one going downwards


## Assumption

- We add an outer boundary $R$
- No points with same $\times$ coordinates


## Adjacent trapezoids

- Two trapezoids $\Delta$ and $\Delta^{\prime}$ are adjacent if they meet along a vertical edge


Not true for this case

## Adjacent trapezoids

- We keep pointers to neighboring trapezoids
- How do we know which one is which one???
- Left upper
- Left lower
- Right lower
- Right upper



## Trapezoidal Maps

- A face is a trapezoid-like shape (trapezoid, triangle)
- In each trapezoid $\Delta$ we store:
- leftp( $\Delta$ )
- 4 pointers to its neighbors
$-\operatorname{rightp}(\Delta)$
- top( $\Delta$ )
- bottom( $\Delta$ )


O not stored

## Building Trapezoidal Map

- Use randomized incremental algorithm to construct the trapezoidal map $T(S)$
- Maintain a point location data structure $D$



## Building Trapezoidal Map

- The search structure $D$ is a directed acyclic graph (DAG) with
- a single root
- exactly one leaf for every trapezoid of $T(S)$.
- There are 2 types of inner nodes (of out-degree 2):
- $x$-nodes, labeled with an endpoint of some segment in $S$
- $y$-nodes, labeled with a segment itself
- A query with $q$ starts at the root and proceeds along a directed path to a leaf
- At an $x$-node, the test is "Does $q$ lie to the left or right of the vertical line through endpoint stored at this node?"
- At a $y$-node, the test is "Does $q$ lie above or below the segment $s$ stored here?"


## TrapezoidalMap(S)

Input: A set $S$ of $n$ non-crossing line segments
Output: The trapezoidal map $T(S)$ and a search data structure $D$ for $T(S)$ in a bounding box

1. Determine a bounding box $R$ that contains all segments of $S$, and initialize trapezoidal map structure $T \&$ search structure $D$ for it
2. Compute a random permutation $s_{1}, s_{2}, \ldots, s_{n}$ of the elements of $S$.
3. for $i \leftarrow 1$ to $n$ do

- Find set $\Delta_{0}, \Delta_{l}, \ldots, \Delta_{k}$ of trapezoids in $T$ properly intersected by $s_{i}$
- Remove $\Delta_{0}, \Delta_{l}, \ldots, \Delta_{k}$ from $T$ and replace them by new trapezoids that appear because of the insertion of $s_{i}$


## Find Intersecting $\Delta \mathrm{s}$



- $\Delta_{I}$ can be found using the data structure $D$


## FollowSegment $\left(T, s_{i}\right)$

Input: A trapezoidal map $T$ and a new segment $s_{i}$
Output: The sequence $\Delta_{0}, \Delta_{l}, \ldots, \Delta_{k}$ of trapezoids intersected by $s_{i}$

1. Let $p$ and $q$ be the left and right endpoint of $s_{i}$
2. Search with $p$ in the search structure to find $\Delta_{0}$
3. $j \leftarrow 0$
4. while $q$ lies to the right of rightp $\left(\Delta_{i}\right)$
5. do if $\operatorname{rightp}\left(\Delta_{i}\right)$ lies above $s_{i}$
6. then Let $\Delta_{j+1}$ be the lower right neighbor of $\Delta_{j}$
7. else Let $\Delta_{j+1}$ be the upper right neighbor of $\Delta_{j}$
8. $j \leftarrow j+1$
9. return $\Delta_{0}, \Delta_{l}, \ldots, \Delta_{j}$

## Case 1: New segment completely contained in trapezoid



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## Case 2: New segment partially contained in trapezoid



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## Case 3: New segment completely outside trapezoid



## Short Example



## Another Example



## Another Example



## Another Example



## Another Example



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## Another Example



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## Another Example



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## Another Example



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## Another Example



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## Another Example



## Size of Trapezoidal Map

- What's the size of such a decomposition?
- Idea: relate size of the trapezoidal map to the size of the segments
- Each face in a trapezoidal map of a set $S$ of line segments in general position has 1 or 2 vertical sides and exactly two non-vertical sides


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## Size of Trapezoidal Map

- Left edge of a trapezoid in a trapezoidal map


For every trapezoid $\Delta$, except the left most one, the left edge is defined by an end point of a segment leftp( $\Delta$ )

Idea: There are as many "left edges of trapezoids" as trapezoids

## Size of Trapezoidal Map

- There are only five cases (for left edge of a trapezoid)

Case 1


## Size of Trapezoidal Map

- There are only five cases (for left edge of a trapezoid)

Case 2


## Size of Trapezoidal Map

- There are only five cases (for left edge of a trapezoid)

Case 3


## Size of Trapezoidal Map

- There are only five cases (for left edge of a trapezoid)

Case 4


## Size of Trapezoidal Map

- There are only five cases (for left edge of a trapezoid)



## Size of Trapezoidal Map

- Theorem: The trapezoidal map $T(S)$ of a set of $n$ line segments $S$ in general position contains at most $6 \mathrm{n}+4$ vertices
- Proof:
- Bounding box R has 4 vertices
- End points $2 n$ vertices
- Vertical line end points $4 n$
- Total $6 n+4$


## Size of Trapezoidal Map

- Theorem: The trapezoidal map $T(S)$ of a set of $n$ line segments $S$ in general position contains at most $3 n+1$ trapezoids (i.e., left points of trapezoids)
- Proof:
- R has 1 left point
- Left point of a segment $2 n$
- Each such a point can be leftp( $\Delta$ ) of 2 trapezoids
- Right point of a segment $1 n$
- Each such a point can be leftp( $\Delta$ ) of 1 trapezoids
- Total $3 n+1$


## Randomized

## Incremental Algorithm

- Construction of the search structure is incremental:
- It adds one segment at a time
- After each addition, it updates $D$ and $T(S)$
- The order in which the segments are added affects the construction of search structure $D$
- In worst case, construction time is $\mathrm{O}\left(\mathrm{n}^{2}\right)$
- Each new segment intersects all existing trapezoids
- In worst case, query time is $\mathrm{O}(\mathrm{n})$
- Therefore we randomly order of the input and hope for good "expected" time complexity


## Algorithm Analysis

- The expected running time is the average running time taken over all $n!$ permutations
- The expected size of $D$ is the average sizes of all $n!$ resulting search structures
- The expected query time for $q$ is the average query time for point $q$ over all runs


## Theorem:

Algorithm TrapezoidalMap computes the trapezoidal map $T(S)$ of a set $S$ of $n$ line segments in general position and a search structure $D$ for $T(S)$ in $O(n \log n)$ expected time. The expected size of the search structure $D$ is $O(n)$ and for any query point $q$ the expected query time is $O(\log n)$.

## Average Query Time Analysis

- The query time for $q$ is linear in the length of the path in $D$ that is traversed when querying with $q$
- It is increased by at most 3 in every iteration based on case analysis
- So, $3 n$ is the best possible worst-case bound over all possible insertion order for $S$
- But, we're interested in average query time w.r.t. all $n$ ! possible insertion orders
- Let $X_{i}$, for $1 \leq i \leq n$, for denote the number of nodes on the path created in $i^{\prime}$ th iteration. We can express the expected path length as:


## Average Query Time Analysis

$$
X_{i} \leq 3 \Rightarrow \mathrm{E}\left[X_{i}\right] \leq 0 *\left(1-P_{i}\right)+3 * P_{i} \Rightarrow \mathrm{E}\left[X_{i}\right] \leq 3 P_{i}
$$

- What is $P_{i}$ ?
- The probability that $\Delta_{q}\left(S_{i}\right)$ is created (i.e, $\left.\Delta_{q}\left(S_{i}\right) \neq \Delta_{q}\left(S_{i-1}\right)\right)$ because of the segment $s_{i}$
- $\quad$ Since $s_{i}$ is selected at random, it has the same probability that $\Delta_{q}\left(S_{i}\right)$ is destroyed by randomly pick a segment from $S_{i}$ (backward

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    analysis!!)
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$-\quad P_{i}=\operatorname{Pr}\left[\Delta_{q}\left(S_{i}\right) \neq \Delta_{q}\left(S_{i-1}\right)\right]=\operatorname{top}(\Delta) \operatorname{Pr}\left[\Delta_{q}\left(S_{i}\right) \notin T\left(S_{i-1}\right)\right] \leq 4 / i$


## Average Query Time Analysis

$$
\begin{gathered}
\mathrm{E}\left[\sum_{1 \leq i \leq n} X_{i}\right] \leq \sum_{1 \leq i \leq n} 3 P_{i} \leq \sum_{1 \leq i \leq n} 12 / i=12 \sum_{1 \leq i} \\
\leq n 1 / i=12 H_{n} \\
H_{n}=1 / 1+1 / 2+1 / 3+\ldots+1 / \mathrm{n} \\
\ln \mathrm{n}<H_{n}<(\ln \mathrm{n}+1) \\
\Rightarrow \text { Therefore, the query time takes } O(\log n)
\end{gathered}
$$

## Expected Size of the Structure

- To bound the size, it suffices to bound the number of nodes in $D$.
- The leaves in $D$ are in one-to-one correspondence with the trapezoids in $T(S)$, of which there are $O(n)$.
- Let $k_{i}$ be no. of new trapezoids created in iteration $i$, due to insertion of segment $s_{i}$ :

$$
\begin{gathered}
O(n)+\mathrm{E}\left[\sum_{1 \leq i \leq n}(\text { number of inner nodes created in iteration } i)\right] \\
O(n)+\mathrm{E}\left[\sum_{1 \leq i \leq n} k_{i}\right]=O(n)+\sum_{1 \leq i \leq n} \mathrm{E}\left[k_{i}\right]
\end{gathered}
$$

## Expected Size of the Structure

- Backward analysis
- $\sum_{1 \leq i \leq n} \mathrm{E}\left[k_{i}\right]$ is the \# of the "segment" nodes
- $\mathrm{E}\left[k_{i}\right]$ is the expected number of new trapezoids created by the $i$-th segment
- Each $s_{i}$ has the same probability of being the $i$-th segment
- $\mathrm{E}\left[k_{i}\right]=\left(\#\right.$ of trapezoids destroyed by removing $s_{0}+$
\# of trapezoids destroyed by removing $s_{l^{+}}$
\# of trapezoids destroyed by removing $s_{2}{ }^{+}$
\# of trapezoids destroyed by removing $s_{i}$ / $i$
- $\mathrm{E}\left[k_{i}\right]=(1 / i) \sum_{s \in S i} \sum_{\Delta \in T(S i)} \delta\left(\Delta, s_{i}\right)$
- $\delta\left(\Delta, s_{i}\right)=1$ if $\Delta$ is bounded by $S_{i}$
- $\delta\left(\Delta, s_{i}\right)=0$ otherwise
$-\sum_{s \in S i} \sum_{\Delta \in T(S i)} \delta(\Delta, \mathrm{s}) \leq 4\left|T\left(S_{i}\right)\right|=O(i)$
- $\mathrm{E}\left[k_{i}\right]=(1 / \mathrm{i}) \sum_{s \in S i} \sum_{\Delta \in T(S i)} \delta(\Delta, \mathrm{s}) \leq O(i) / i=O(1)$


## Expected Construction Time

- The time to insert segment $s_{i}$ is $O\left(k_{i}\right)$ plus the time needed to locate the left endpoint of $s_{i}$ in $T\left(S_{i-1}\right)$. Use the earlier bound on $k_{i}$, we get the expected running time for the construction:

$$
O(1)+\sum_{1 \leq i \leq n}\left\{O(\log i)+O\left(\mathrm{E}\left[k_{i}\right]\right)\right\}=O(n \log n)
$$

## Naïve Assumptions

- General position statement assumes no two distinct points have the same $x$-coordinate.
- Assume that a query point never lies on the vertical line of an $x$-node on its search path, nor on the segment of a $y$-node.


## Dealing with Degeneracies

- Use symbolic perturbation. In effects, use an affine mapping called "shear transform" along the $x$-axis.
- $(x, y)$ becomes $(x+\varepsilon y, y)$
- The algorithm does not compute any geometric objects; it never actually computes coordinates of the endpoints.
- All it does is to apply 2 elementary operations to the input points:
- Take 2 distinct points $p \& q$ and decides whether $q$ lies to the left, right or on the vertical line through $p$.
- Take 1 of the input segments, specified by $p_{1} \& p_{2^{\prime}}$ and tests whether a third point $q$ lies above, below, or on this segment. It is only applied when a vertical line through $q$ intersects with this segment.


## Application: Triangulation

- 1. Decompose the Polygon into Trapezoids.
- Seidel proves that if each permutation of $\mathbf{s 1}$.. $\mathbf{s N}$ is equally likely then trapezoid formation takes $O\left(n \log { }^{*} n\right)$ expected time
- 2. Decompose the Trapezoids into Monotone Polygons.
- A monotone polygon is a polygon whose boundary consists of two ymonotone chains. These polygons are computed from the trapezoidal decomposition by checking whether the two vertices of the original polygon lie on the same side. This is a linear $O(n)$ time operation
- 3. Triangulate the Monotone Polygons.
- all the monotone polygons can be triangulated in $O(n)$ time


## Application: Triangulation



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## Application: Motion Planning

- Exact cell decomposition - from Latombe 2000



## Application: Motion Planning

- Convert trapezoid map to connectivity graph



## Conclusion

- Point location
- Brute force has $\mathrm{O}(n)$ time complexity
- Slab approach has $\mathrm{O}(\log n)$ time but $\mathrm{O}\left(n^{2}\right)$ space complexity
- Trapezoid decomposition allows $\mathrm{O}(\log n)$ expected time but $\mathrm{O}(n)$ space complexity
- Trapezoid decomposition
- randomized incremental algorithm
- Sweep line algorithm (does not provide the point location data structure D)


## Homework Assignment

- $6.5,6.6,6.7$

