## More on Voronoi diagrams

## Computational Geometry

Lecture 13: More on Voronoi diagrams

Motion planning for a disc
Geometry
Plane sweep algorithm

## Motion planning for a disc

Can we move a disc from one location to another amidst obstacles?


## Motion planning for a disc

Since the Voronoi diagram of point sites is locally "furthest away" from those sites, we can move the disc if and only if we can do so on the Voronoi diagram


## Retraction

Global idea for motion planing for a disc:

1. Get center from start to Voronoi diagram
2. Move center along Voronoi diagram
3. Move center from Voronoi diagram to end

This is called retraction

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## Voronoi diagram of points



## Voronoi diagram of line segments

For a Voronoi diagram of other objects than point sites, we must decide to which point on each site we measure the distance

This will be the closest point on the site


## Voronoi diagram of line segments



## Voronoi diagram of line segments



## Voronoi diagram of line segments



- The points of equal distance to two points lie on a line
- The points of equal distance to two lines lie on a line (two lines)
- The points of equal distance to a point and a line lie on a
 parabola



## Bisector of two line segments

Two line segment sites have a bisector with up to 7 arcs


## Bisector of two line segments

If two line segment sites share an endpoint, their bisector can have an area too


## Bisector of two line segments

We assume that the line segment sites are fully disjoint, to avid complications

We could shorten each line segment from a set of non-crossing line segments a tiny amount


Empty circles


## Voronoi vertices

The Voronoi diagram has vertices at the centers of empty circles

- touching three different line segment sites (degree 3 vertex)
- touching two line segment sites, one of which it touches in an endpoint of the line segment, and the segment is also part of the tangent line of the circle at that point (degree 2 vertex)

At a degree 2 Voronoi vertex, one incident arc is a straight edge and the other one is a parabolic arc

## Constructing the Voronoi diagram of line segments

The Voronoi diagram of a set of line segments can be constructed using a plane sweep algorithm


Question: What site defines the leftmost arc on the beach line?

## Breakpoints

Breakpoints trace arcs of equal distance to two different sites, or they trace segments perpendicular to a line segment starting at one of its endpoints, or they trace site interiors


## Breakpoints

The algorithm uses 5 types of breakpoint:

1. If a point $p$ is closest to two site endpoints while being equidistant from them and $\ell$, then $p$ is a breakpoint that traces a line segment (as in the point site case)
2. If a point $p$ is closest to two site interiors while being equidistant from them and $\ell$, then $p$ is a breakpoint that traces a line segment
3. If a point $p$ is closest to a site endpoint and a site interior of different sites while being equidistant from them and $\ell$, then $p$ is a breakpoint that traces a parabolic arc

## Breakpoints

The algorithm uses 5 types of breakpoint (continued):
4. If a point $p$ is closest to a site endpoint, the shortest distance is realized by a segment that is perpendicular to the line segment site, and $p$ has the same distance from $\ell$, then $p$ is a breakpoint that traces a line segment
5. If a site interior intersects the sweep line, then the intersection is a breakpoint that traces a line segment (the site interior)

These two types of breakpoint do not trace Voronoi diagram edges but they do trace breaks in the beach line

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## Events



## Events

There are site events and circle events, but circle events come in different types


## Events

The types of circle events essentially correspond to the types of breakpoints that meet

Not all types of breakpoint can meet

## The sweep algorithm

Each event can still be handled in $O(\log n)$ time
There are still only $O(n)$ events

Theorem: The Voronoi diagram of a set of disjoint line segments can be constructed in $O(n \log n)$ time

## Retraction



## Algorithm Retraction $\left(S, q_{\text {start }}, q_{\text {end }}, r\right)$

1. Compute the Voronoi diagram $\operatorname{Vor}(S)$ of $S$ in a bounding box.
2. Locate the cells of $\operatorname{Vor}(P)$ that contain $q_{\text {start }}$ and $q_{\text {end }}$.
3. Determine the point $p_{\text {start }}$ on $\operatorname{Vor}(S)$ by moving $q_{\text {start }}$ away from the nearest line segment in $S$. Similarly, determine the point $p_{\text {end }}$. Add $p_{\text {start }}$ and $p_{\text {end }}$ as vertices to $\operatorname{Vor}(S)$, splitting the arcs on which they lie into two.
4. Let $\mathcal{G}$ be the graph corresponding to the vertices and edges of the Voronoi diagram. Remove all edges from $\mathcal{G}$ for which the smallest distance to the nearest sites is $\leq r$.
5. Determine with depth-first search whether a path exists from $p_{\text {start }}$ to $p_{\text {end }}$ in $\mathcal{G}$. If so, report the line segment from $q_{\text {start }}$ to $p_{\text {start }}$, the path in $\mathcal{G}$ from $p_{\text {start }}$ to $p_{\text {end }}$, and the line segment from $p_{\text {end }}$ to $q_{\text {end }}$ as the path. Otherwise, report that no path exists.

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## Result

Theorem: Given $n$ disjoint line segment obstacles and a disc-shaped robot, the existence of a collision-free path between two positions of the robot can be determined in $O(n \log n)$ time using $O(n)$ storage.

## Testing the roundness

Suppose we construct a perfectly round object, and now wish to test how round it really is

Measuring an object is done with coordinate measuring machines, it is a scanner that determines many points on the surface of the object


## Roundness

Voronoi diagrams of line segments Farthest-point Voronoi diagrams

Higher-order Voronoi diagrams
Computing the farthest-point Voronoi diagram Roundness

## Coordinate measuring machine



## Roundness

The roundness of a set of points is the width of the smallest annulus that contains the points

An annulus is the region between two co-centric circles

Its width is the difference in radius


## Smallest-width annulus

The smallest-width annulus must have at least one point on $C_{\text {outer }}$, or else we can decrease its size and decrease the width

The smallest-width annulus must have at least one point on $C_{\text {inner }}$, or else we can increase its size and decrease the width

## Smallest-width annulus

- $C_{\text {outer }}$ contains at least three points of $P$, and $C_{\text {inner }}$ contains at least one point of $P$
- $C_{\text {outer }}$ contains at least one point of $P$, and $C_{\text {inner }}$ contains at least three points of $P$
- $C_{\text {outer }}$ and $C_{\text {inner }}$ both contain two points of $P$



## Smallest-width annulus

The smallest-width annulus can not be determined with randomized incremental construction

## Smallest-width annulus

If we know the center of the smallest-width annulus (the center of the two circles), then we can determine the smallest-width annulus itself (and its width) in $O(n)$ additional time

## The cases

Consider case 2: $C_{\text {inner }}$ contains (at least) three points of $P$ and $C_{\text {outer }}$ only one

Then the three points on $C_{\text {inner }}$ define an empty circle, and the center of $C_{\text {inner }}$ is a Voronoi vertex!


## The cases

Consider case 1: $C_{\text {outer }}$ contains (at least) three points of $P$ and $C_{\text {inner }}$ only one

Then the three points on $C_{\text {outer }}$ define a "full" circle ...


## Intermezzo: Higher-order Voronoi diagrams

## More closest points

Suppose we are interested in the two closest points, not only the one closest point, and want a diagram that captures that

Computing the farthest-point Voronoi diagram Roundness

## First order Voronoi diagram



## Second order Voronoi diagram



## Voronoi diagrams of line segments

Farthest-point Voronoi diagrams

## Third order Voronoi diagram



Computing the farthest-point Voronoi diagram
Roundness

## First and second order Voronoi diagram



## Tenth order, or farthest-point Voronoi diagram



## Farthest-point Voronoi diagrams

The farthest-point Voronoi diagram is the partition of the plane into regions where the same point is farthest

It is also the $(n-1)$-th order Voronoi diagram
The region of a site $p_{i}$ is the common intersection of $n-1$ half-planes, so regions are convex, and boundaries are parts of bisectors

## Farthest-point Voronoi diagrams



## Farthest-point Voronoi diagrams

Observe: Only points of the convex hull of $P$ can have cells in the farthest-point Voronoi diagram

Suppose otherwise ...


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## Farthest-point Voronoi diagrams

Also observe: All points of the convex hull have a cell in the farthest-point Voronoi diagram

All cells of the farthest-point Voronoi diagram are unbounded


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All cells of the farthest-point Voronoi diagram are unbounded


$$
. p_{k}
$$

## Farthest-point Voronoi diagrams

If all cells are unbounded, then the edges of the farthest-point Voronoi diagram form a tree of which some edges are unbounded

Question: For the normal Voronoi diagram, there was one case where its edges are not connected. Does such a case occur for the farthest-point Voronoi diagram?

## Farthest-point Voronoi diagrams



## Farthest-point Voronoi diagrams



## Lower bound

$\Omega(n \log n)$ time is a lower bound for computing the farthest-point Voronoi diagram

We could use it for sorting by transforming a set of reals $x_{1}, x_{2}, \ldots$ to a set of points $\left(x_{1}, x_{1}^{2}\right),\left(x_{2}, x_{2}^{2}\right), \ldots$


## Construction

So we may as well start by computing the convex hull of $P$ in $O(n \log n)$ time

Let $p_{1}, \ldots, p_{m}$ be the points on the convex hull, forget the rest


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## Construction

The simplest algorithm to construct the farthest-point Voronoi diagram is randomized incremental construction on the convex hull vertices

Let $p_{1}, \ldots, p_{m}$ be the points in random order
From the convex hull, we also know the convex hull order

## Construction: phase 1

Phase 1: Remove and Remember

For $i \leftarrow m$ downto 4 do
Remove $p_{i}$ from the convex hull; remember its 2 neighbors $c w\left(p_{i}\right)$ and $\operatorname{ccw}\left(p_{i}\right)$ (at removal!)


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Remove $p_{i}$ from the convex hull; remember its 2 neighbors $c w\left(p_{i}\right)$ and $\operatorname{ccw}\left(p_{i}\right)$ (at removal!)

$$
\begin{aligned}
& p_{8}, c w\left(p_{8}\right), c c w\left(p_{8}\right) \\
& p_{7}, c w\left(p_{7}\right), c c w\left(p_{7}\right) \\
& p_{6}, c w\left(p_{6}\right), c c w\left(p_{6}\right) \\
& p_{5}, c w\left(p_{5}\right), c c w\left(p_{5}\right) \\
& p_{4}, c w\left(p_{4}\right), c c w\left(p_{4}\right)
\end{aligned}
$$

$$
p_{3}, p_{2}, p_{1}
$$

## Construction: phase 2

Phase 2: Put back and Construct
Construct the farthest-point Voronoi diagram $F_{3}$ of $p_{3}, p_{2}, p_{1}$
For $i \leftarrow 4$ to $m$ do
Add $p_{i}$ to the farthest-point Voronoi diagram $F_{i-1}$ to make $F_{i}$

We simply determine the cell of $p_{i}$ by traversing $F_{i-1}$ and update $F_{i-1}$

## Construction: phase 2



## Construction: phase 2



## Construction: phase 2



## Construction: phase 2



## Construction: phase 2



## Construction: phase 2



## Construction: phase 2



## Construction: phase 2



## Construction: phase 2

The implementation of phase 2 requires a representation of the farthest-point Voronoi diagram

We use the doubly-connected edge list (ignoring issues due to half-infinite edges)

For any point among $p_{1}, \ldots, p_{i-1}$, we maintain a pointer to the most counterclockwise bounding half-edge of its cell

## Construction: phase 2



## Analysis of randomized incremental construction

Due remembering $\operatorname{ccw}\left(p_{i}\right)$, we have $\operatorname{ccw}\left(p_{i}\right)$ in $O(1)$ time, and get the first bisector that bounds the cell of $p_{i}$

Due to the pointer to the most counterclockwise half-edge of the cell of $\operatorname{ccw}\left(p_{i}\right)$, we can start the traversal in $O(1)$ time

## Analysis of randomized incremental construction

If the cell of $p_{i}$ has $k_{i}$ edges in its boundary, then we visit $O\left(k_{i}\right)$ half-edges and vertices of $F_{i-1}$ to construct the cell of $p_{i}$

Also, we remove $O\left(k_{i}\right)$ vertices and half-edges, change (shorten) $O\left(k_{i}\right)$ half-edges, and create $O\left(k_{i}\right)$ half-edges and vertices
$\Rightarrow$ adding $p_{i}$ takes $O\left(k_{i}\right)$ time, where $k_{i}$ is the complexity of the cell of $p_{i}$ in $F_{i}$

## Analysis



## Backwards analysis

## Backwards analysis:

Assume that $p_{i}$ has already been added and we have $F_{i}$
Each one of the $i$ points had the same probability of having been added last

The expected time for the addition of $p_{i}$ is linear in the average complexity of the cells of $F_{i}$

## Backwards analysis

The farthest-point Voronoi diagram of $i$ points has at most $2 i-3$ edges (fewer in degenerate cases), and each edge bounds exactly 2 cells

So the average complexity of a cell in a farthest-point Voronoi diagram of $i$ points is

$$
k_{i} \leq \frac{2 \cdot(2 i-3)}{i}=\frac{4 i-6}{i}<4
$$

The expected time to construct $F_{i}$ from $F_{i-1}$ is $O(1)$

## Result

Due to the initial convex hull computation, the whole algorithm requires $O(n \log n)$ time, plus $O(m)$ expected time

Theorem: The farthest-site Voronoi diagram of $n$ points in the plane can be constructed in $O(n \log n)$ expected time. If all points lie on the convex hull and are given in sorted order, it takes $O(n)$ expected time

## End of intermezzo; back to smallest-width annulus

## Smallest-width annulus

- $C_{\text {outer }}$ contains at least three points of $P$, and $C_{\text {inner }}$ contains at least one point of $P$
- $C_{\text {outer }}$ contains at least one point of $P$, and $C_{\text {inner }}$ contains at least three points of $P$
- $C_{\text {outer }}$ and $C_{\text {inner }}$ both contain two points of $P$



## Smallest-width annulus

If we know the center of the smallest-width annulus (the center of the two circles), then we can determine the smallest-width annulus itself (and its width) in $O(n)$ additional time

## Case 2

Consider case 2: $C_{\text {inner }}$ contains (at least) three points of $P$ and $C_{\text {outer }}$ only one

Then the three points on $C_{\text {inner }}$ define an empty circle, and the center of $C_{\text {inner }}$ is a Voronoi diagram vertex!


## Case 1

Consider case 1: $C_{\text {outer }}$ contains (at least) three points of $P$ and $C_{\text {inner }}$ only one

Then the three points on $C_{\text {outer }}$ define a "full" circle, and the center of $C_{\text {outer }}$ is a farthest-point Voronoi diagram vertex!


## Case 3

Consider case 3: $C_{\text {outer }}$ and $C_{\text {inner }}$ each contain two points of $P$

Then the two points on $C_{\text {inner }}$ define a set of empty circles and the two points of $C_{\text {outer }}$ define a set of full circles


## Case 3

The two points on $C_{\text {inner }}$ define a set of empty circles whose centers lie on the Voronoi edge defined by these two points

The two points of $C_{\text {outer }}$ define a set of full circles whose centers lie on the farthest-point Voronoi edge defined by these two points

The center lies on an intersection of
 an edge of the Voronoi diagram and an edge of the farthest-point Voronoi diagram!

## Algorithm

To solve case 3:

1. Compute the Voronoi diagram of $P$
2. Compute the farthest-point Voronoi diagram of $P$
3. For each pair of edges, one of each diagram

- defined by $p, p^{\prime}$ of the Voronoi diagram and by $q, q^{\prime}$ of the farthest-point Voronoi diagram
- determine the annulus for $p, p^{\prime}$ and $q, q^{\prime}$ if the edges intersect

4. Keep the smallest-width one of these

This takes $O\left(n^{2}\right)$ time

## Algorithm

To solve case 1 :

1. Compute the farthest-point Voronoi diagram of $P$
2. For each vertex $v$ of the FPVD

- determine the point $p$ of $P$ that is closest to $v$
- determine $C_{\text {outer }}$ from the points defining $v$
- determine the annulus from $p, v$, and $C_{\text {outer }}$

3. Keep the smallest-width one of these

This takes $O\left(n^{2}\right)$ time

## Algorithm

To solve case 2 :

1. Compute the Voronoi diagram of $P$
2. For each vertex $v$ of the Voronoi diagram

- determine the point $p$ of $P$ that is farthest from $v$
- determine $C_{\text {inner }}$ from the points defining $v$
- determine the annulus from $p, v$, and $C_{\text {inner }}$

3. Keep the smallest-width one of these

This takes $O\left(n^{2}\right)$ time

## Result

Theorem: The roundness, or the smallest-width annulus of $n$ points in the plane can be determined in $O\left(n^{2}\right)$ time

