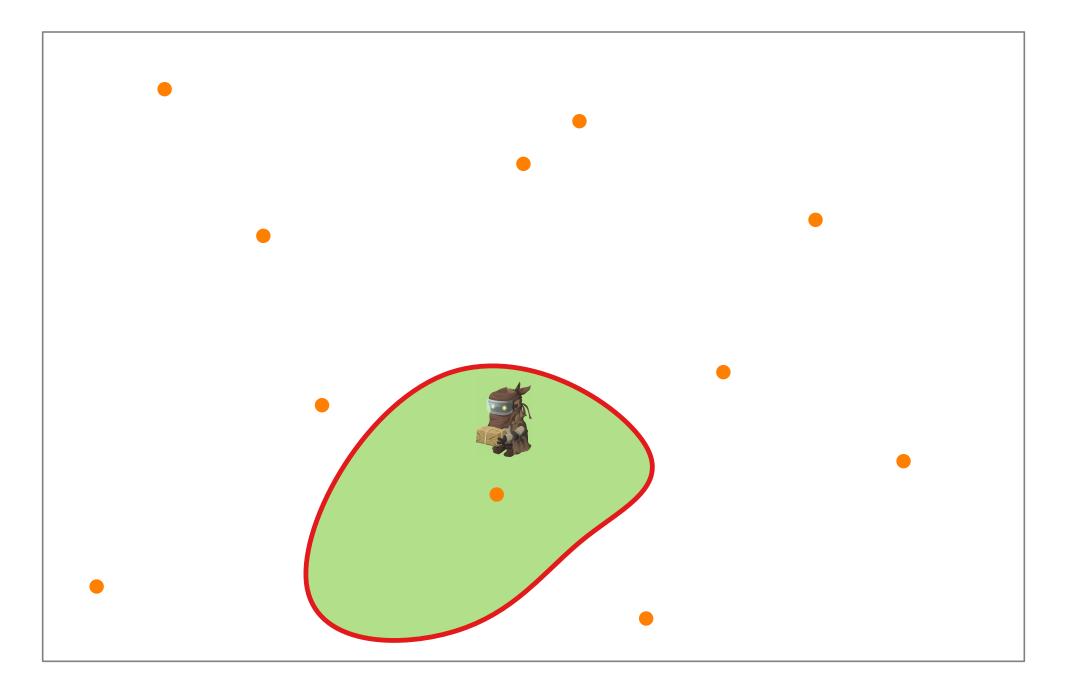
Lecture 7: Voronoi Diagrams or The Post-Office Problem

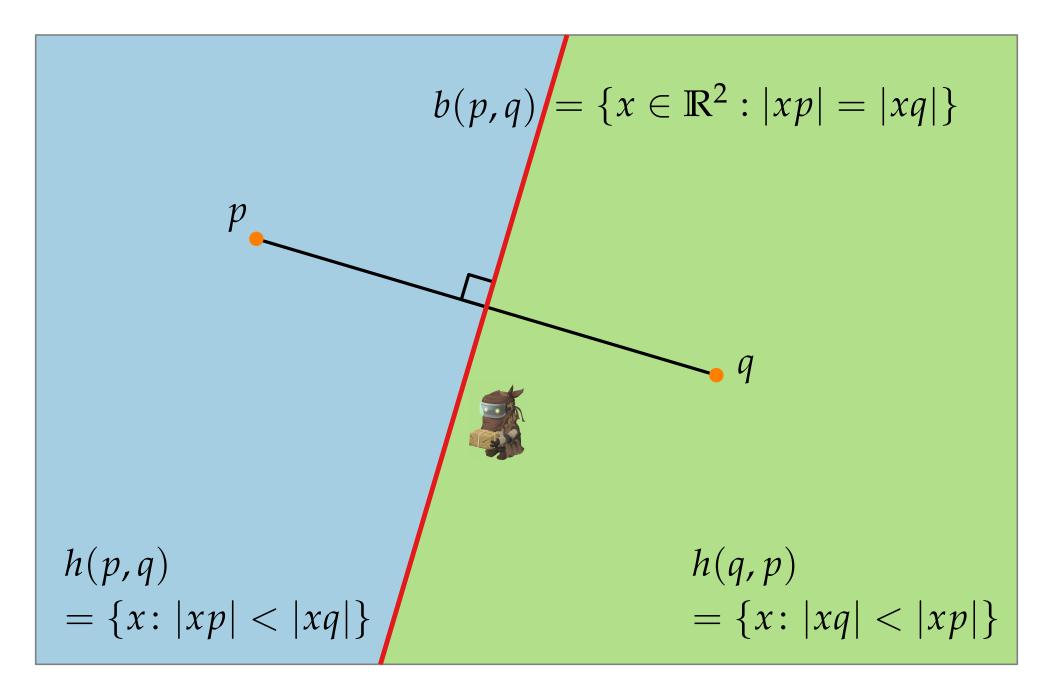
#### Part I: The Post-Office Problem

Philipp Kindermann

#### The Post-Office Problem



#### The Post-Office Problem



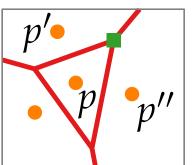
Lecture 7: Voronoi Diagrams or The Post-Office Problem

#### Part II: The Voronoi Diagram

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## The Voronoi Diagram

Let *P* be a set of points in the plane and let  $p, p', p'' \in P$ .



[*Voronoi diagram*] | p - p'' - p'' |  $| Vor(P) - subdivision of <math>\mathbb{R}^2$ geometric graph

[Voronoi cell]  $\mathcal{V}(\{p\}) = \mathcal{V}(p) = \{x \in \mathbb{R}^2 : |xp| < |xq| \text{ for all } q \in P \setminus \{p\}\}$  $= \bigcap_{q \neq p} h(p,q)$ 

[Voronoi edge]  $= \{x: |xp| = |xp'| \text{ and } |xp| < |xq| \quad \forall q \neq p, p'\}$  $\mathcal{V}(\{p,p'\})$ = rel-int $(\partial \mathcal{V}(p) \cap \partial \mathcal{V}(p'))$  (w/o the endpts)

[Voronoi vertex]  $\mathcal{V}(\{p, p', p''\}) = \partial \mathcal{V}(p) \cap \partial \mathcal{V}(p') \cap \partial \mathcal{V}(p'')$  $= \{x: |xp| = |xp'| = |xp''| \text{ and } |xp| \leq |xq| \quad \forall q\}$ 

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> Part III: Shape and Complexity

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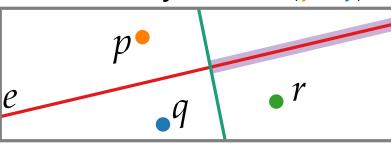
## Overall Shape of Vor(P)

**Theorem.** Let  $P \subset \mathbb{R}^2$  be a set of *n* pts (called *sites*). If all sites are collinear, Vor(P) consists of n - 1 parallel lines. Otherwise, Vor(P) is connected and its edges are line segments or half-lines.

**Proof.** 

Assume that *P* is not collinear.

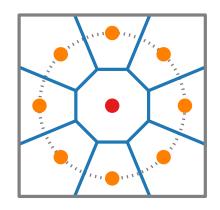
- Assume that Vor(P) contains an edge *e* that is a full line, say, e = b(p, q).



Let  $r \in P$  be not collinear with p and q. Then e' = b(q, r) is not parallel to e.  $\Rightarrow e \cap h(r, q)$  is closer to r than to p and q.  $\Rightarrow e$  is bounded on at least one side.

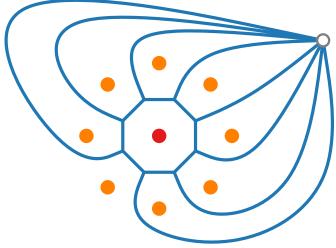
## Complexity

Task:Construct a set P of sitessuch that Vor(P) has a cell oflinear complexity!



**Theorem.** Given a set  $P \subset \mathbb{R}^2$  of *n* sites, Vor(P) consists of at most 2n - 5 vertices and 3n - 6 edges.

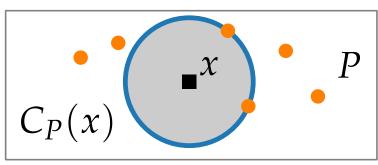
**Proof.***Problem:* unbounded edges! $\Rightarrow$  can't apply Euler directly, but...



 $|F| = n \Rightarrow (|V| + 1) - |E| + n = 2$ min. degree  $3 \Rightarrow 2|E| \ge 3(|V| + 1)$  $\Rightarrow (|V| + 1) - \frac{3}{2}(|V| + 1) + n \le 2$  $\Rightarrow \frac{1}{2}(|V| + 1) \le n - 2$ 

#### Characterization of Voronoi vtc and edges

 $C_P(x) :=$  largest circle centered at x w/o sites in its interior



**Theorem:** (i) *x* Voronoi vtx  $\Leftrightarrow |C_P(x) \cap P| \ge 3$ (ii) b(p, p') contains a Voronoi edge  $\Leftrightarrow \exists x \in b(p, p') : C_P(x) \cap P = \{p, p'\}$ 

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> Part IV: The Beachline

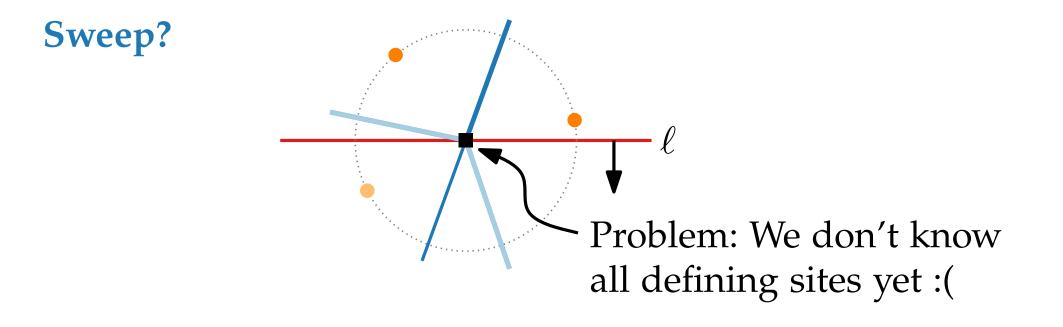
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## Computation

**Brute force:** For each  $p \in P$ , compute  $\mathcal{V}(p) = \bigcap_{p' \neq p} \underline{h(p, p')}$ .

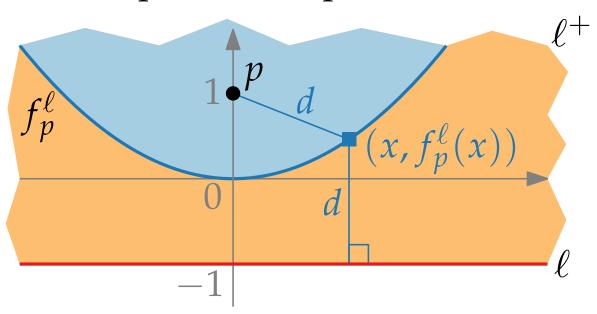
[Lect. 2, map-overlay / line-segment alg]  $O(n \log^2 n)$  time [Lect. 4, half-plane intersection]  $O(n \log n)$  time

in total:  $O(n^2 \log n)$  time – but the complexity of Vor(P) is *linear!* 





Which part of the plane above  $\ell$  is fixed by what we've seen?



#### **Solution:**

 $f_p^{\ell}$  is the parabola with focus *p* and directrix  $\ell$ .

**Task:** Compute  $f_p^{\ell}$  for p = (0, 1) and  $\ell : y = -1!$ 

**Definition.** *beachline*  $\beta \equiv$  lower envelope of  $(f_p^{\ell})_{p \in P \cap \ell^+}$ **Observation.**  $\beta$  is *x*-monotone.

#### The Beachline $\beta$

**Question:** What does  $\beta$  have to do with Vor(*P*)?

**Answer:** "Breakpoints" of  $\beta$  trace out the Voronoi edges!

**Lemma.** New arcs on  $\beta$  only appear through *site events,* that is, whenever  $\ell$  hits a new site.

**Corollary.**  $\beta$  consists of at most 2n - 1 arcs.

**Definition.** *Circle event:*  $\ell$  reaches lowest pt of a circle through three sites above  $\ell$  whose arcs are consecutive on  $\beta$ .

**Lemma.** Arcs disappear from  $\beta$  only at circle events.

**Lemma.** The Voronoi vtc correspond 1:1 to circle events.

Lecture 7: Voronoi Diagrams or The Post-Office Problem

#### Part V: Fortune's Sweep

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## Fortune's Sweep

```
VoronoiDiagram(P \subset \mathbb{R}^2)
\mathcal{Q} \leftarrow new PriorityQueue(P) // site events sorted by y-coord.
\mathcal{T} \leftarrow new BalancedBinarySearchTree() // sweep status (\beta)
\mathcal{D} \leftarrow \text{new DCEL}() // to-be Vor(P)
while not Q.empty() do
    p \leftarrow Q.ExtractMax()
    if p site event then
        HandleSiteEvent(p)
    else
         \alpha \leftarrow \text{arc on } \beta that will disappear
         HandleCircleEvent(\alpha)
treat remaining int. nodes of \mathcal{T} (\equiv unbnd. edges of Vor(P))
return \mathcal{D}
```

# Handling Events

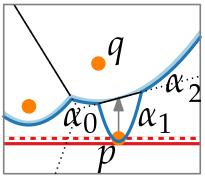
HandleSiteEvent(point p)

Search in  $\mathcal{T}$  for the arc  $\alpha$  vertically above p. If  $\alpha$  has pointer to circle event in  $\mathcal{Q}$ , delete this event. **break**-

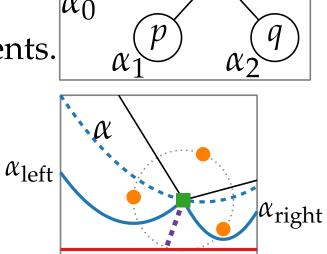
- Split  $\alpha$  into  $\alpha_0$  and  $\alpha_2$ . In  $\mathcal{T}$ : Let  $\alpha_1$  be the new arc of p.
  - Add Vor-edges  $\langle q, p \rangle$  and  $\langle p, q \rangle$  to DCEL.
- Check  $\langle \cdot, \alpha_0, \alpha_1 \rangle$  and  $\langle \alpha_1, \alpha_2, \cdot \rangle$  for circle events.

#### HandleCircleEvent(arc $\alpha$ )

- **\mathcal{T}**.delete( $\alpha$ ); update breakpts
- Delete all circle events involving  $\alpha$  from Q.
- Add Vor-vtx  $\alpha_{\text{left}} \cap \alpha_{\text{right}}$  and Vor-edge  $\langle \alpha_{\text{left}}, \alpha_{\text{right}} \rangle$  to DCEL. Check  $\langle \cdot, \alpha_{\text{left}}, \alpha_{\text{right}} \rangle$  and  $\langle \alpha_{\text{left}}, \alpha_{\text{right}}, \cdot \rangle$  for circle events. **Running time?**  $O(\log n)$  per event...

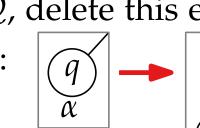


(q, p



points

p,q



## Running Time?

VoronoiDiagram( $P \subset \mathbb{R}^2$ )  $\mathcal{Q} \leftarrow$  new PriorityQueue(P) // site events sorted by y-coord.  $\mathcal{T} \leftarrow$  new BalancedBinarySearchTree() // sweep status ( $\beta$ )  $\mathcal{D} \leftarrow \text{new DCEL}()$  // to-be Vor(P) while not Q.empty() do  $p \leftarrow Q$ .ExtractMax() if *p* site event then HandleSiteEvent(*p*) exactly *n* such events else  $\alpha \leftarrow \text{arc on } \beta$  that will disappear HandleCircleEvent( $\alpha$ ) at most 2n - 5 such events treat remaining int. nodes of  $\mathcal{T}$  ( $\equiv$  unbnd. edges of Vor(P)) return  $\mathcal{D}$ 

#### Summary

# **Theorem.** Given a set *P* of *n* pts in the plane, Fortune's sweep computes Vor(P) in $O(n \log n)$ time and O(n) space.



Steven Fortune Bell Labs

Steven Fortune. A sweepline algorithm for Voronoi diagrams. *Proc.* 2nd Annual ACM Symposium on Computational Geometry. Yorktown Heights, NY, pp. 313–322. 1986.