

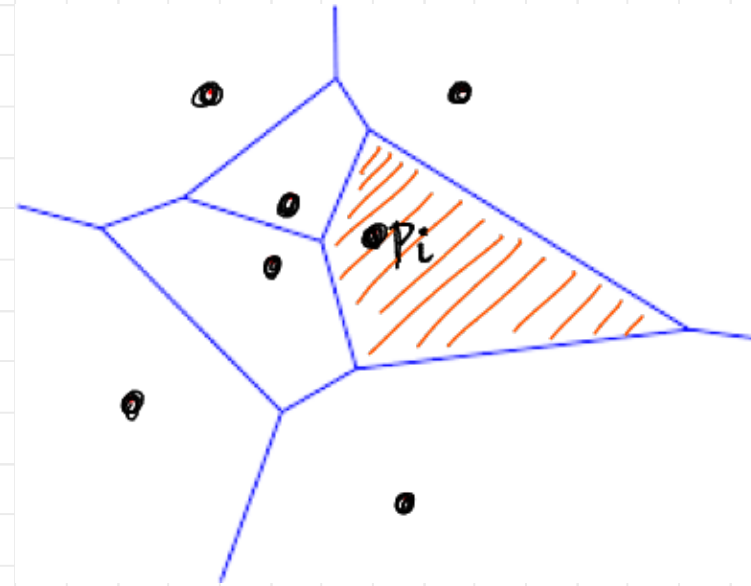
Voronoi diagram

Given points $P = \{p_1, \dots, p_n\}$ in the plane, the **Voronoi region** of p_i is

$$V(p_i) = \{x \in \mathbb{R}^2 : d(x, p_i) \leq d(x, p_j) \forall j \neq i\}$$

p_i is called a **site**.

The **Voronoi diagram** $\mathcal{V}(P)$ consists of all the Voronoi regions

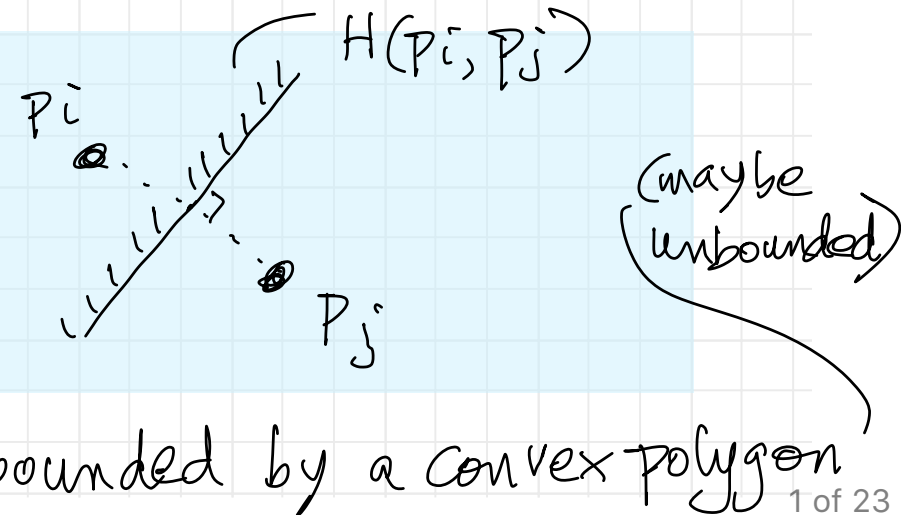


To see that the Voronoi diagram consists of straight line segments:

$H(p_i, p_j) =$ points
closer to p_i than p_j
— a half-plane.

$$V(p_i) = \bigcap_{j \neq i} H(p_i, p_j)$$

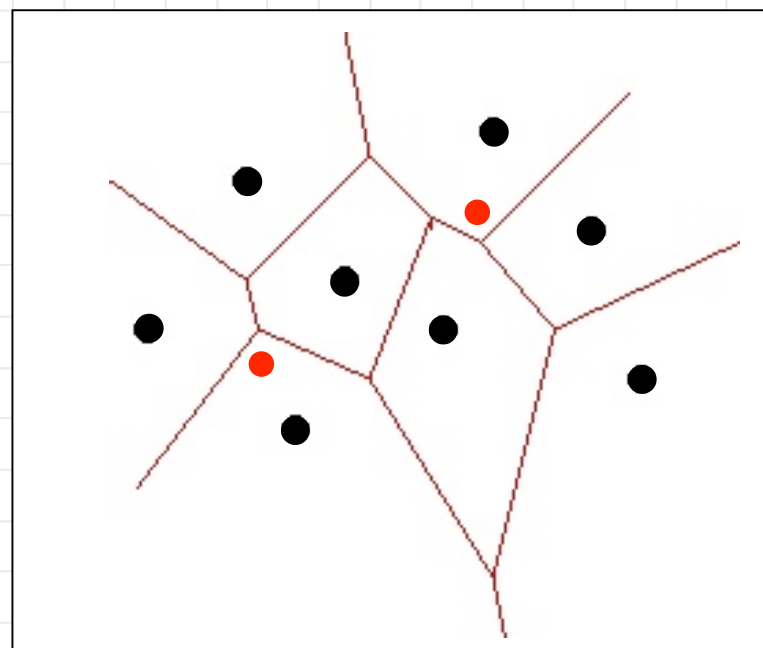
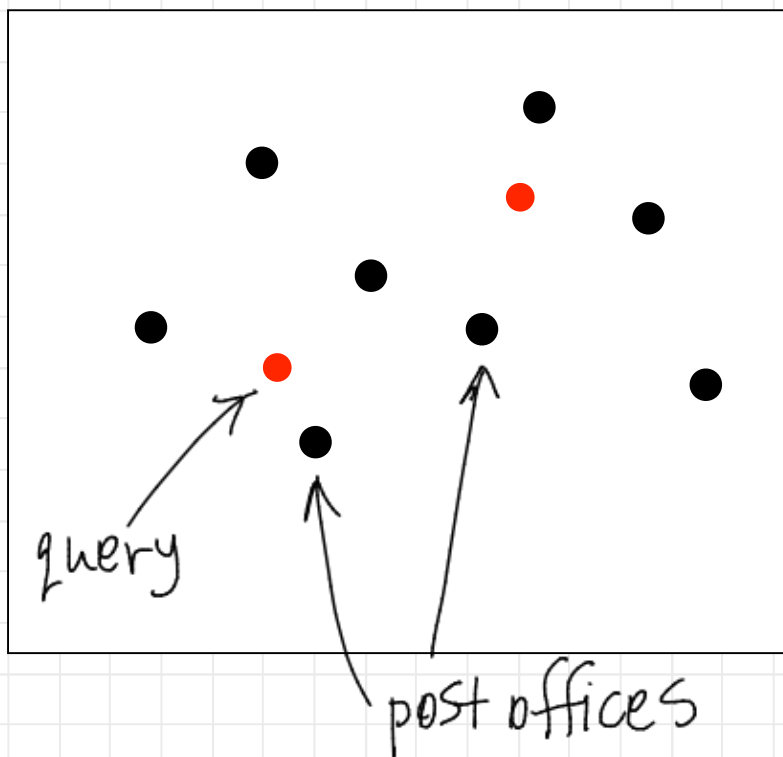
$\therefore V(p_i)$ is bounded by a convex polygon



Recall

Application: Post Office Problem — also closest airfield for airplane in flight.

Given n points in the plane (post offices) preprocess to handle query:
which post office is closest to query point p



Compute the Voronoi diagram.
Query becomes: which region contains p ?
This is **Planar Point Location**.

History

https://en.wikipedia.org/wiki/Voronoi_diagram

Georgy Voronoy, 1908, Russian/Ukrainian mathematician

but Voronoi diagrams were used before that:

- Descartes 1644
- Dirichlet 1850, “Dirichlet tessellation” - used to prove unique reducibility of quadratic forms

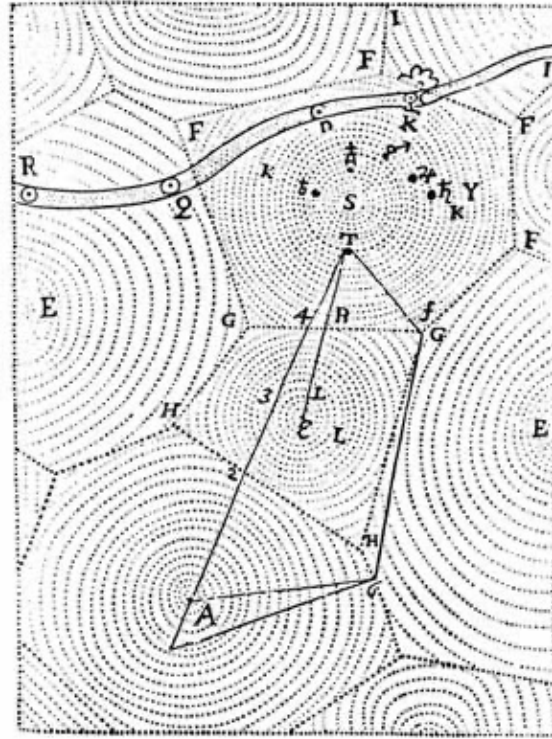
also used in

- crystallography - crystals growing outward from “seeds” form Voronoi regions
- epidemiology, 1854, mapping cholera by proximity to infected water pump in London
- geography and meteorology - “Thiessen polygons” 1911
- condensed matter physics - “Wigner–Seitz cells”
- natural sciences - “Blum’s transform” = medial axis of polygon, used to describe shapes
- aviation, to identify nearest airfield

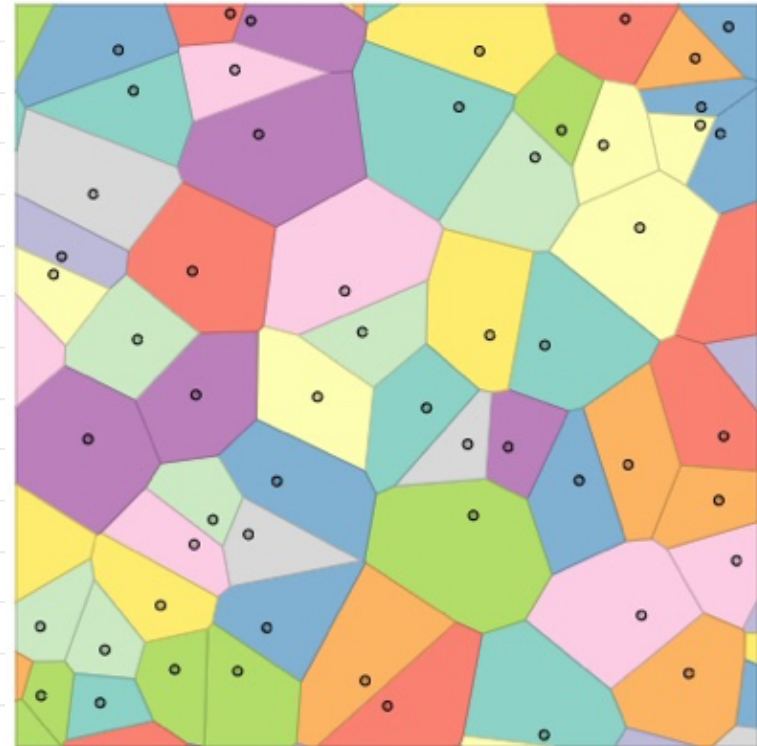
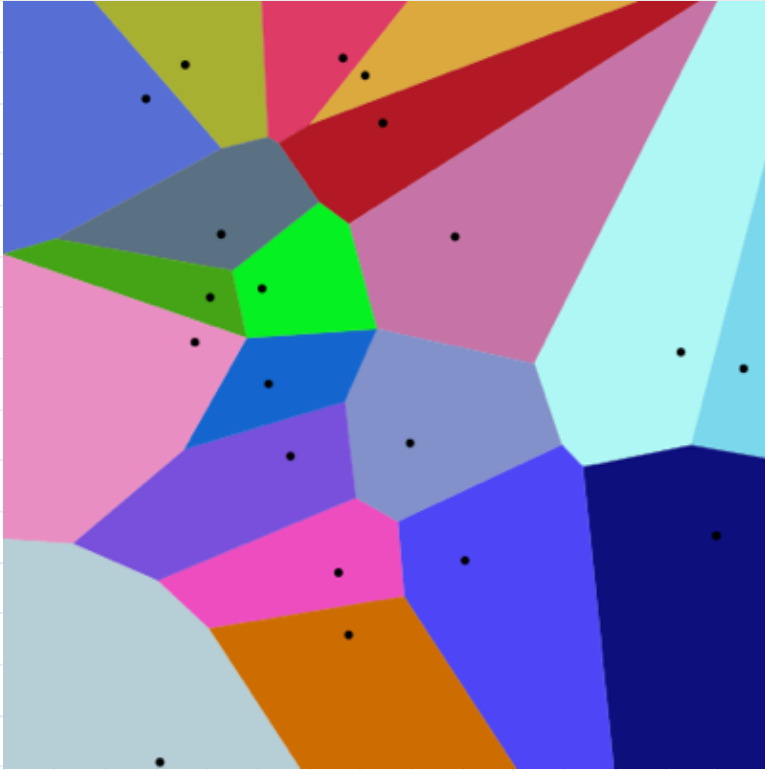
dual structure: ***Delaunay triangulation***

Boris Delone (but used French transliteration “Delaunay”), 1934





Descartes 1644



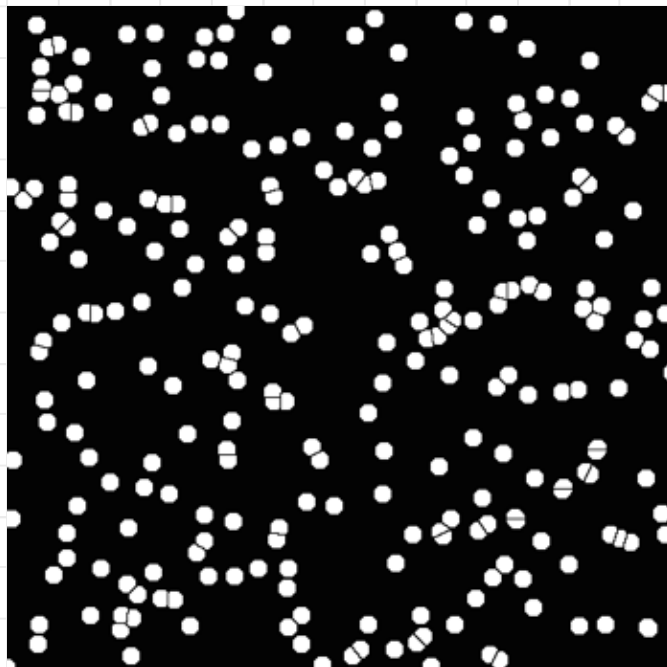
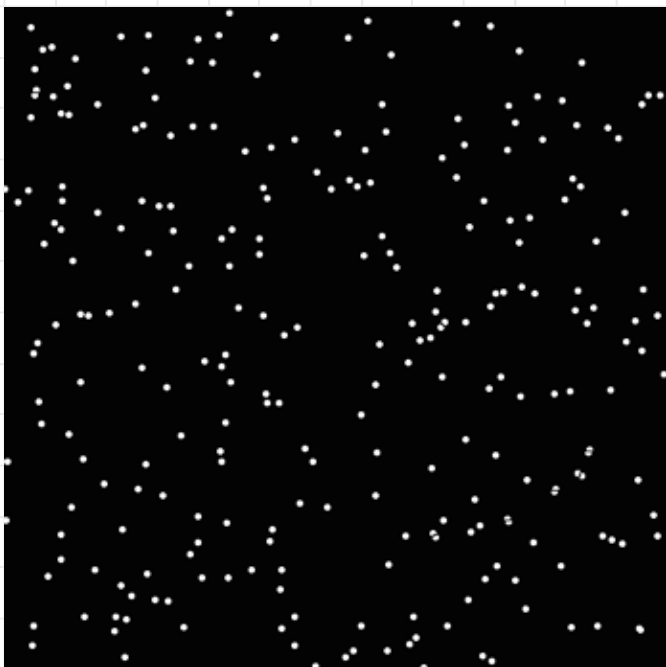
Some nice illustrations, including Voronoi diagram of moving points

<http://datagenetics.com/blog/may12017/index.html>

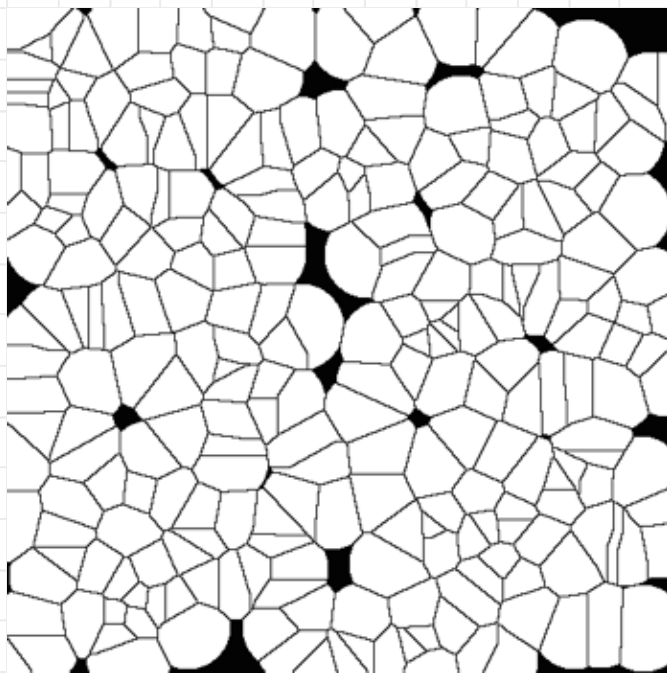
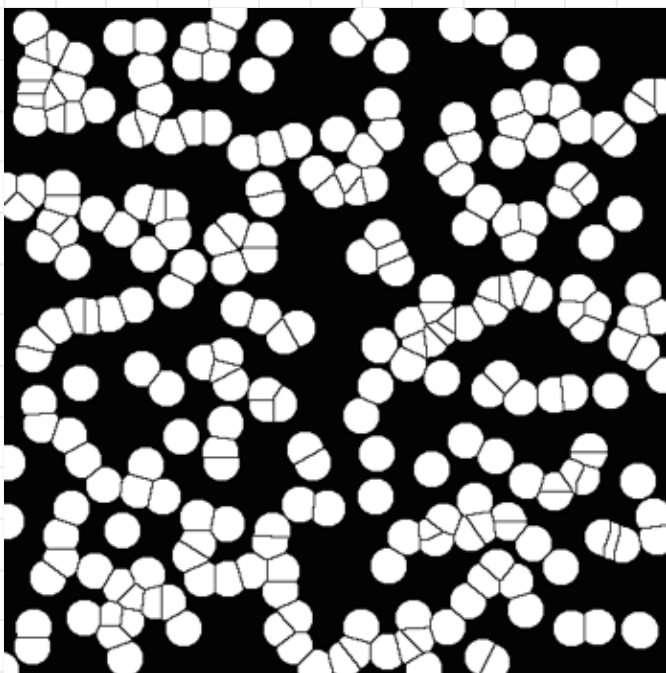
<http://datagenetics.com/blog/may12017/anim2.gif>

<https://www.youtube.com/watch?v=z3yy5aBv0ug>

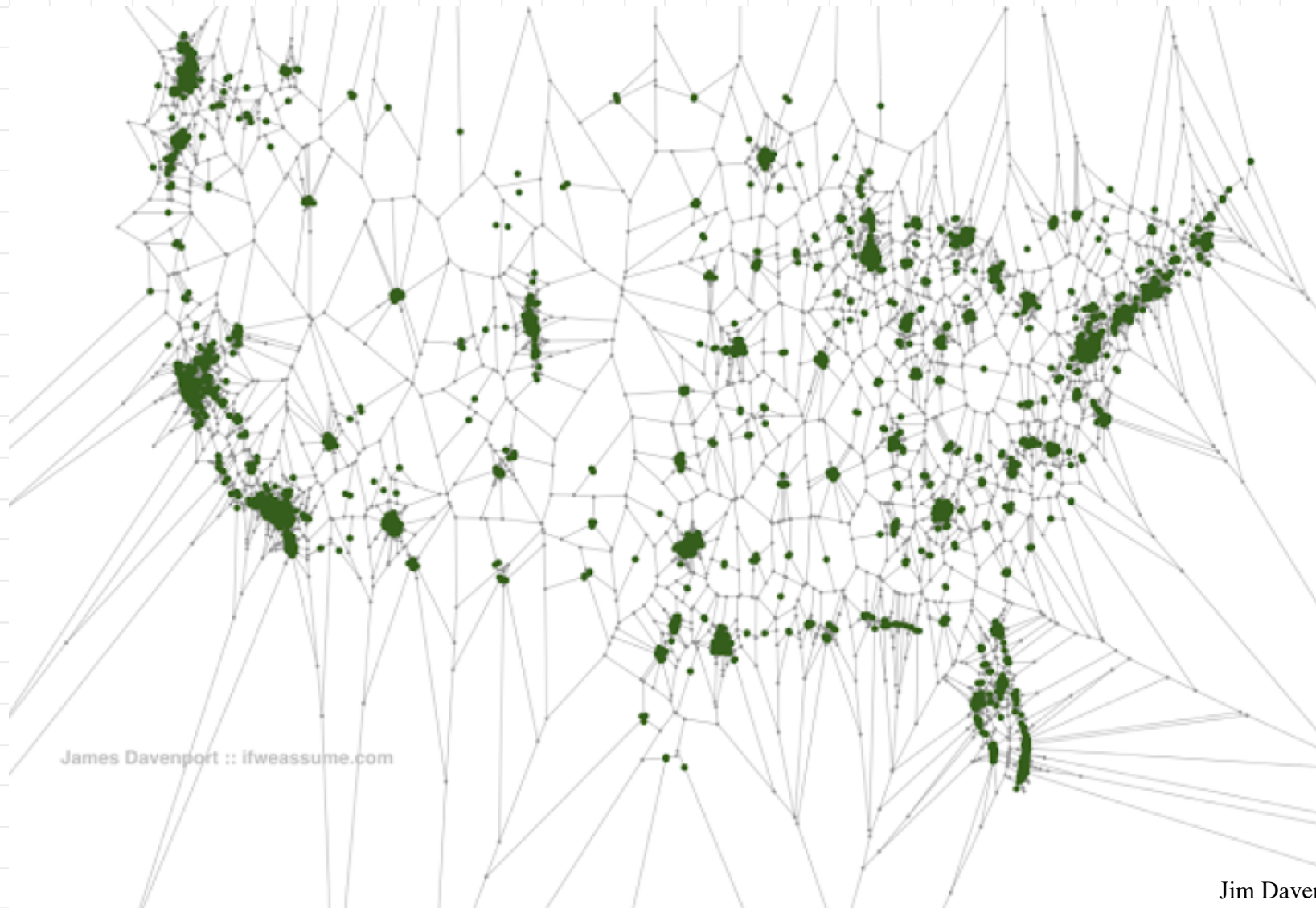
— many pts moving
— one pt moving



<http://i.stack.imgur.com/gcajM.gif>



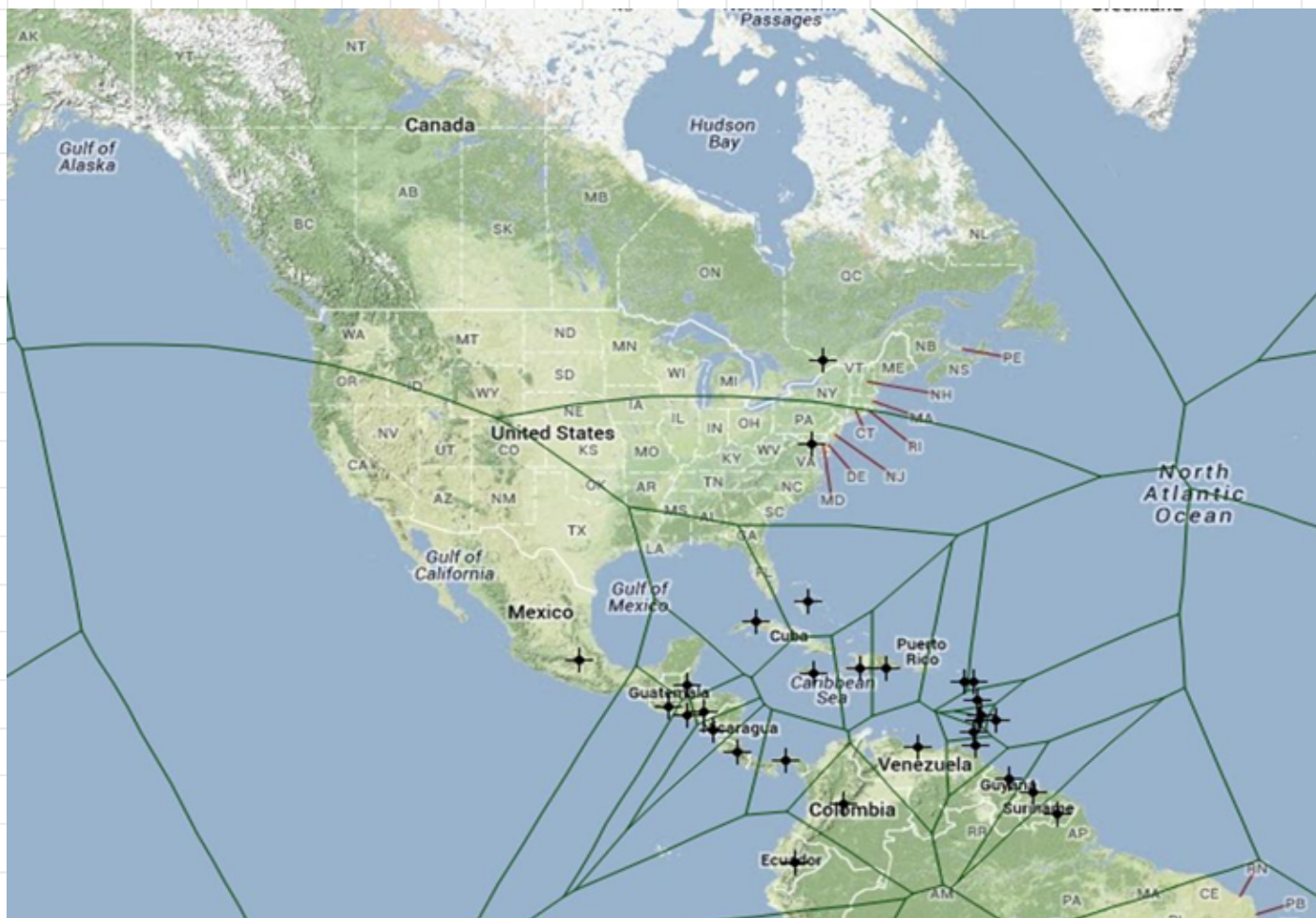
Voronoi diagram of US Starbucks



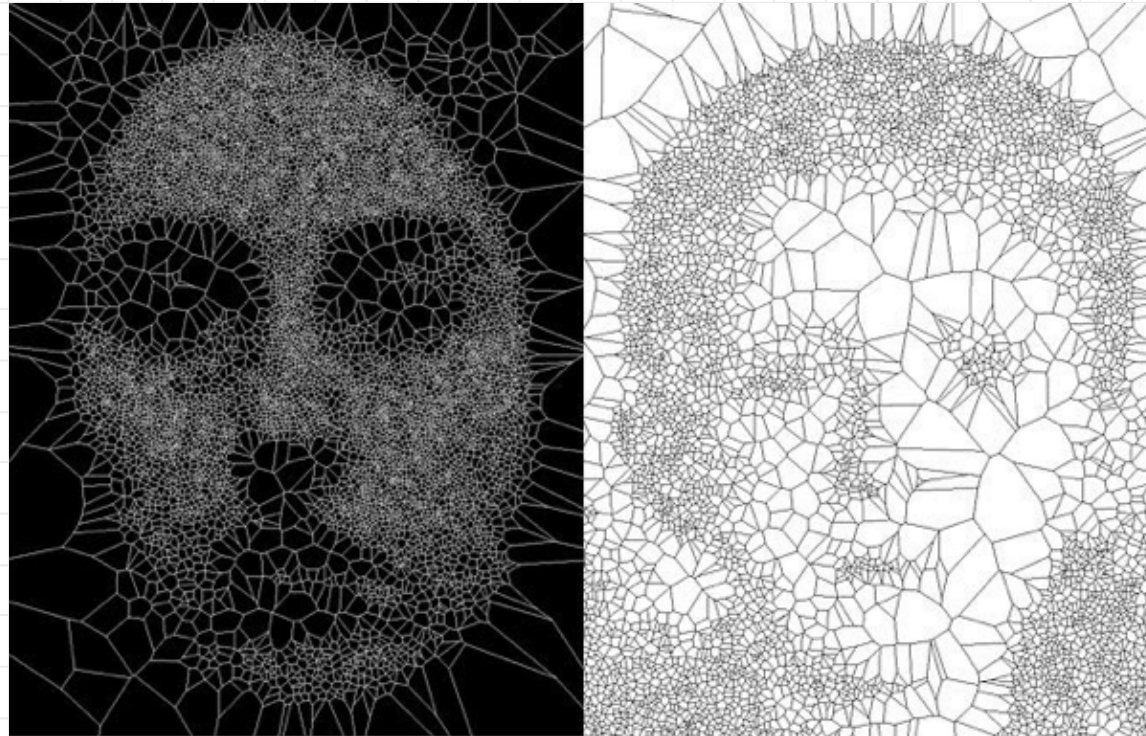
James Davenport :: ifweassume.com

Jim Davenport

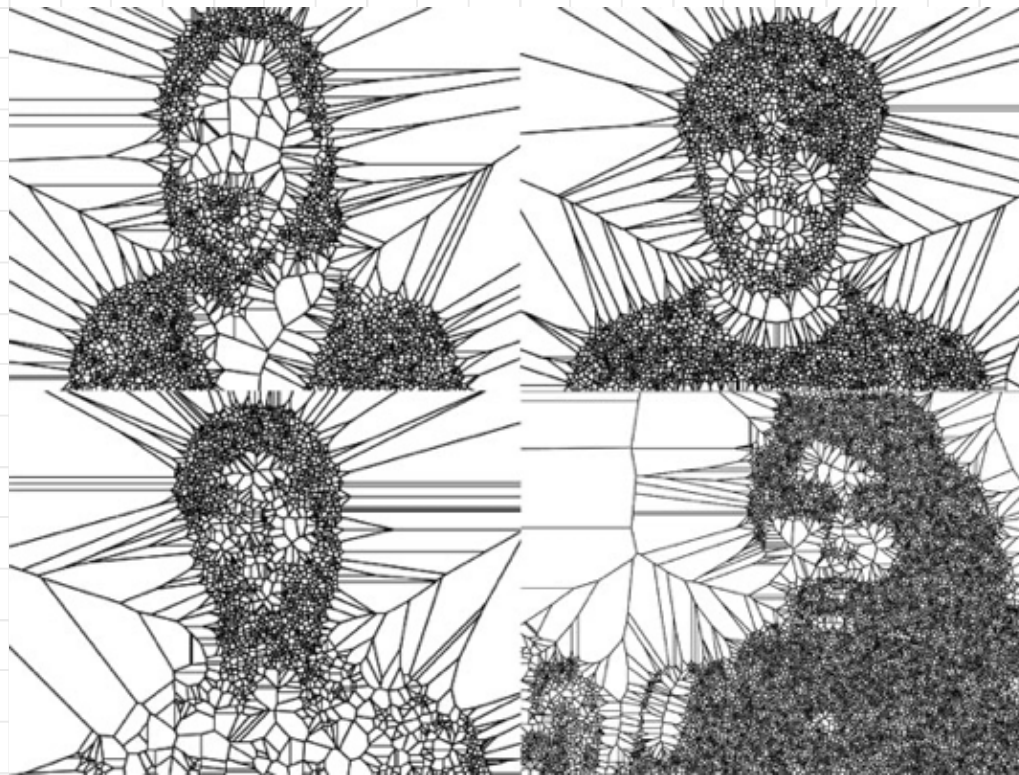
Voronoi diagram of capital cities



or of airports

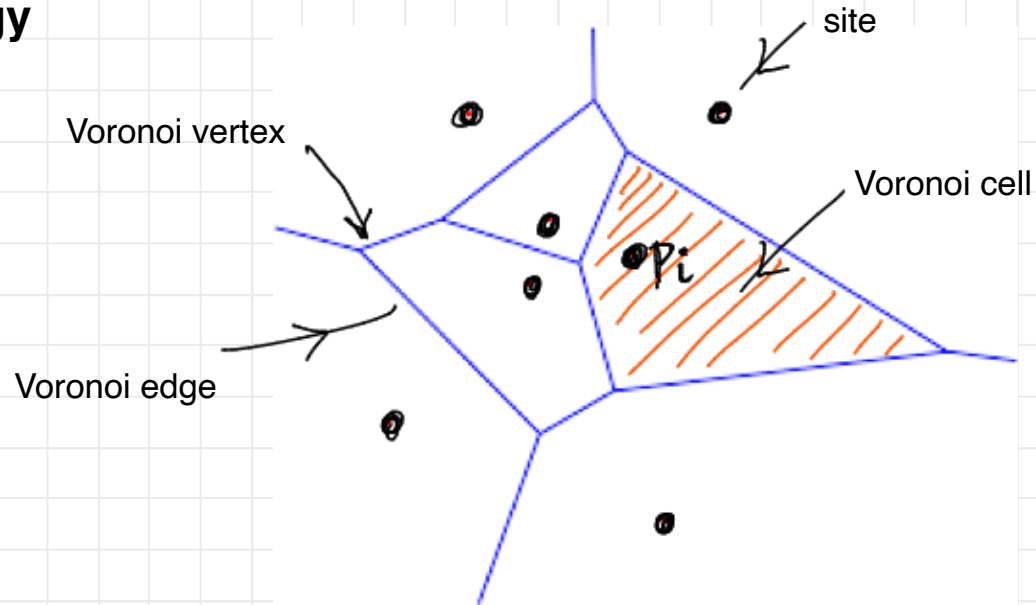


<http://www.flong.com/projects/zoo/>



<http://blog.kleebtronics.com/voronoi/>

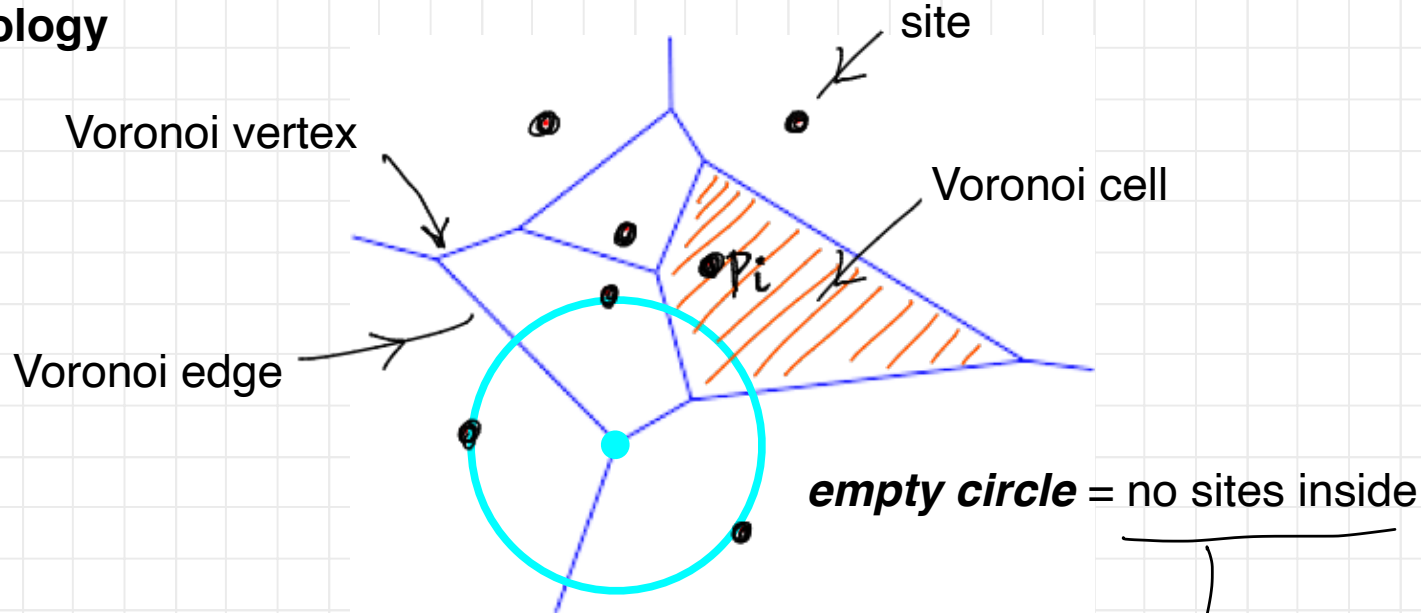
Terminology



Properties

- **empty circle** property
- degrees of Voronoi vertices?
- shape of Voronoi cells?
- when is a cell unbounded?
- number of vertices/edges/cells

Terminology



Properties

- **empty circle** property

- degrees of Voronoi vertices?

- shape of Voronoi cells?

- when is a cell unbounded?

- number of vertices/edges/cells

there is an empty circle centered at each Voronoi vertex, going through 3 or more sites (#sites = degree of vertex)

we will assume no 3 points on line, no 4 points on circle

then Voronoi vertices have degree 3

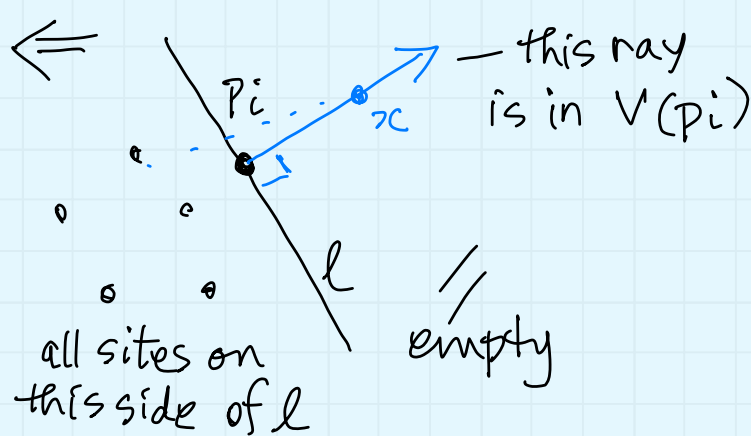
convex regions bounded by straight lines iff site on convex hull — proof next

see next

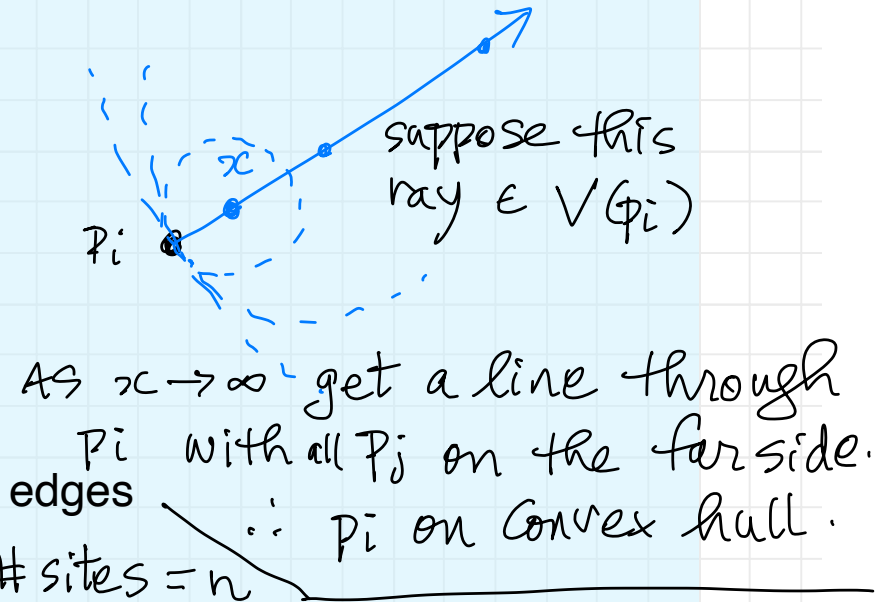
n

Properties of Voronoi diagram

$V(p_i)$ is unbounded iff p_i is on the convex hull of the sites



⇒



There are $\leq 2n$ Voronoi vertices and $\leq 3n$ Voronoi edges

Euler $2 = v - e + f$ $f = \# \text{ sites} = n$

but some edges are rays — imagine they all meet at a point at infinity

every vertex has degree ≥ 3

$$2e = \sum_v \text{degree} \geq 3v$$

$$v \leq 2(n-2)$$

$$2 = v - e + f \leq v - \frac{3}{2}v + n$$

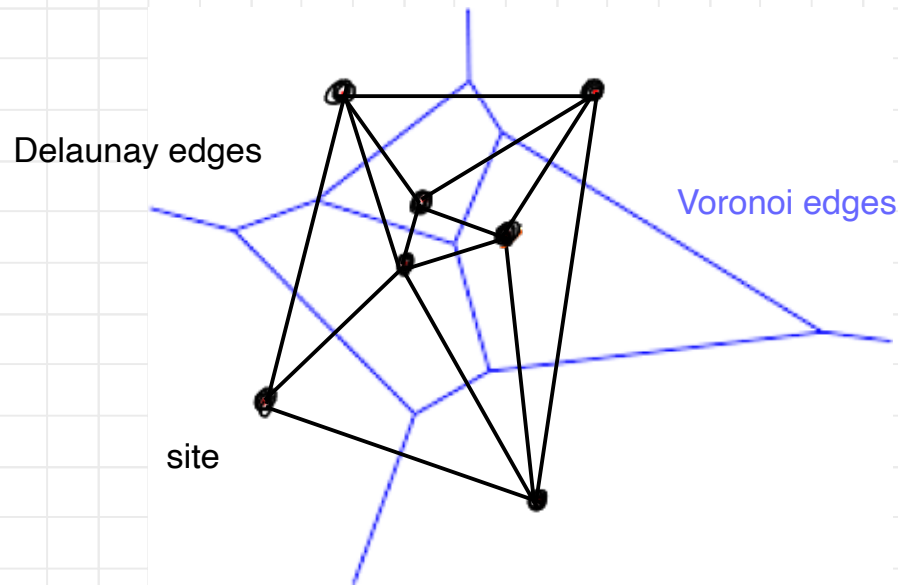
$$e \leq 3(n-2)$$

Delaunay triangulation

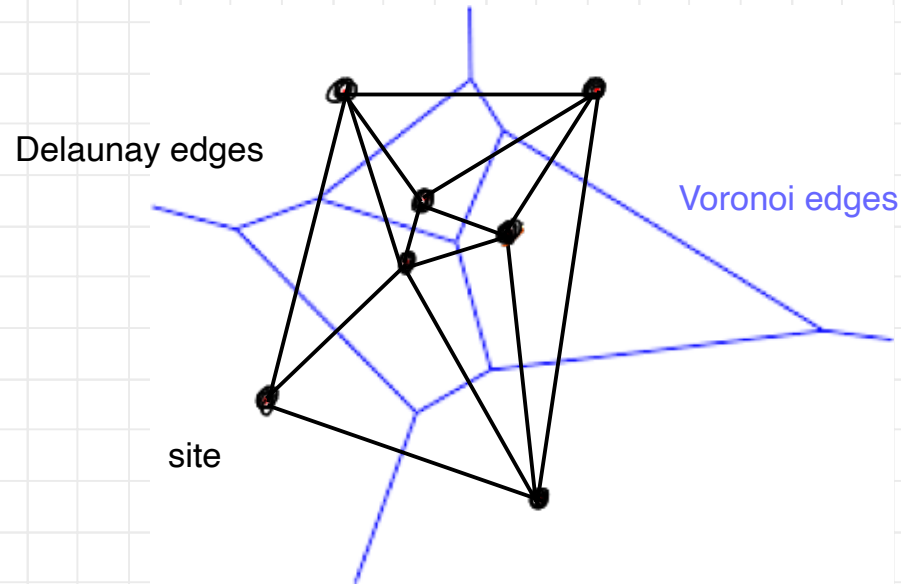
The Voronoi diagram can be captured by a purely combinatorial structure (versus computing coordinates of Voronoi vertices)

Given points $P = \{p_1, \dots, p_n\}$ in the plane, the **Delaunay triangulation** $\mathcal{D}(P)$ is a graph with vertices p_1, \dots, p_n and edge (p_i, p_j) iff $V(p_i)$ and $V(p_j)$ share an edge.

$\mathcal{D}(P)$ is the **planar dual** of $\mathcal{V}(P)$

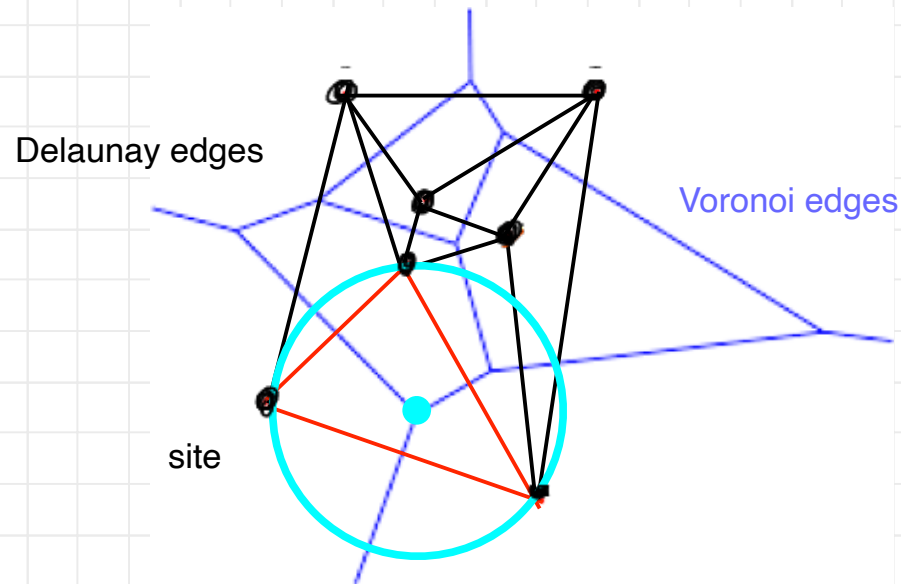


Note: a Voronoi edge and its corresponding Delaunay edge do not always cross.

Delaunay triangulation $\mathcal{D}(P)$ **Properties**

- it is a triangulation
- edge/face iff empty circle through those sites
- what is the boundary ?

Delaunay triangulation $\mathcal{D}(P)$



Properties

- it is a triangulation
- edge/face iff empty circle through those sites
- what is the boundary ?

see next slides

— the convex hull (to be proved)

Properties of Delaunay triangulations

(p_i, p_j) is an edge iff there is an empty circle through p_i, p_j
no sites inside

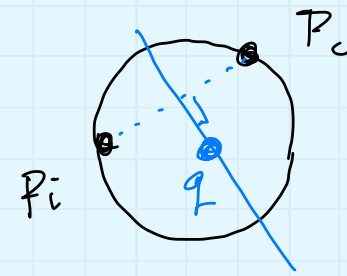
Proof

(p_i, p_j) is an edge of $\mathcal{D}(P)$

iff $V(p_i)$ and $V(p_j)$ share

a boundary edge with point q on it

iff circle centered at q
is empty circle through p_i and p_j



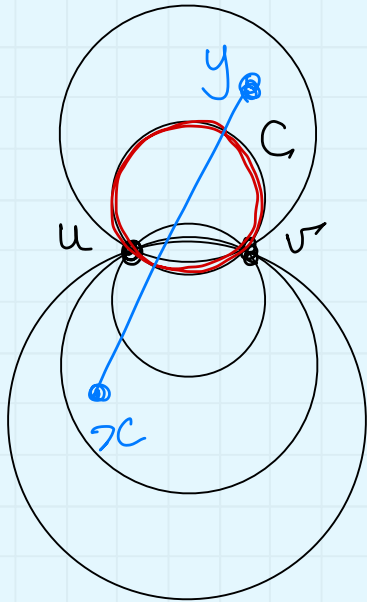
Properties of Delaunay triangulations

No two Delaunay edges cross

Note that this must be proved — it is not true for general planar maps



Proof



Suppose two Delaunay edges (u, v)
and (x, y) cross
by previous, \exists empty circle C
through u, v

Edge xy crosses uv
and x and y are outside C

Then \nexists empty circle through x and y
(if x and y are on C then 4 pts on circle — NO.
else ^{any} circle through xy contains u or v)

Properties of Delaunay triangulations

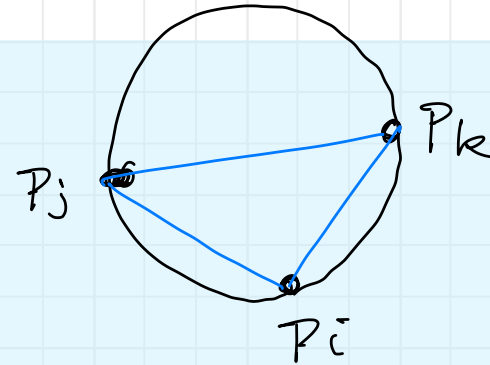
Sites form a face iff there is an empty circle through them

i.e., (since we assumed no 4 sites on a circle)

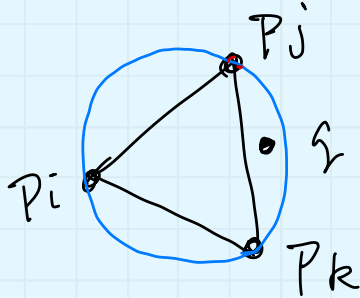
$p_i p_j p_k$ form a face iff there is an empty circle through them

Proof

\Leftarrow suppose empty circle
 by previous, get 3 edges
 and nothing inside since
 no edges cross.



\Rightarrow



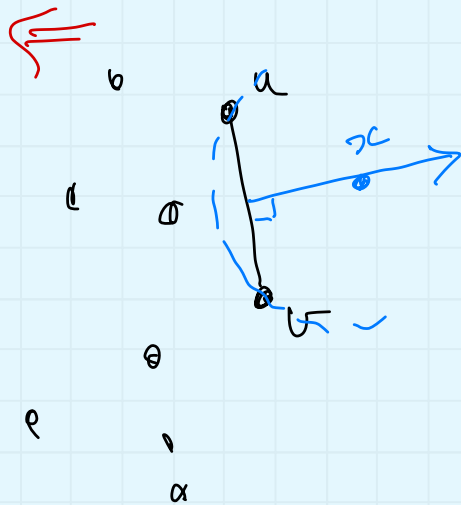
take circle C through $p_i p_j p_k$
 Can there be a site q in C ?
 then \exists empty circle through
 $p_j p_k$ (for this q)

Properties of Delaunay triangulations

The boundary of the Delaunay triangulation is the convex hull of the sites

Proof

i.e. a Delaunay edge has no triangle on one side
iff the edge is on CH of sites.



uv on CH

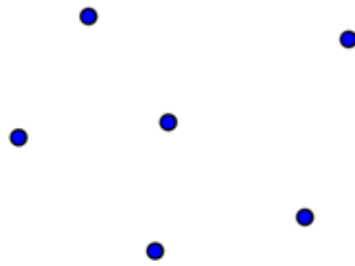
\Rightarrow inf. ray and any pt x on ray
is center of empty circle
through uv

\Rightarrow no triangle on that side
(~~it~~ ^{it's empty circle} would have to go through
another site)

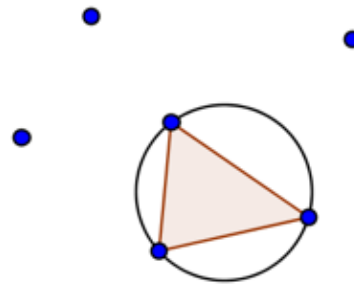
\Rightarrow follow same proof backwards.

An alternative definition of Delaunay triangulation:

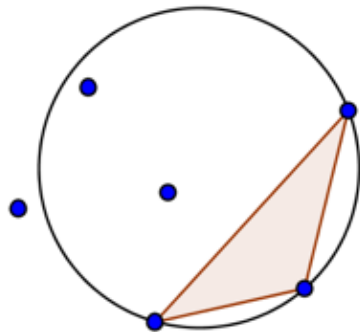
for each empty circle through 3 points, add a triangle



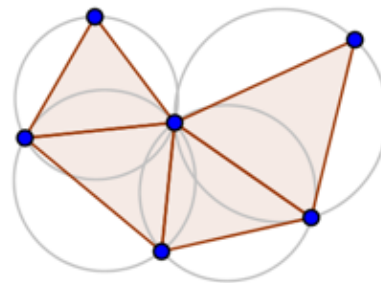
A collection of points



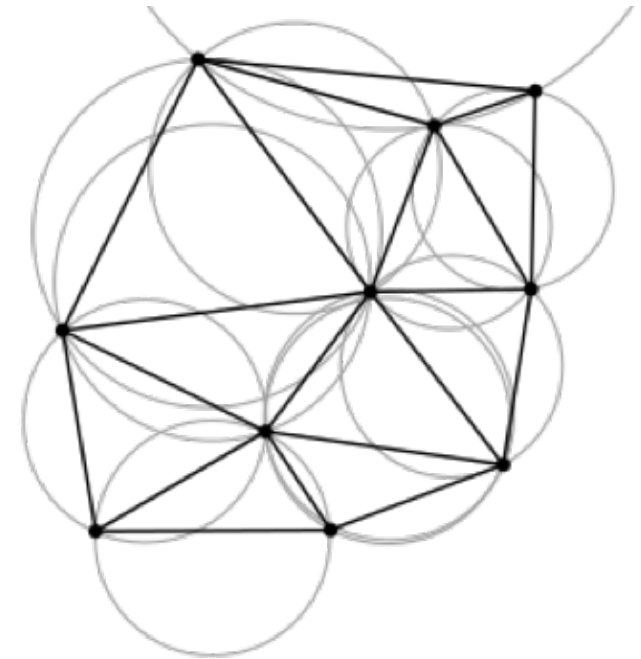
A Delaunay triangle



A non-Delaunay triangle



(part of)
A Delaunay triangulation

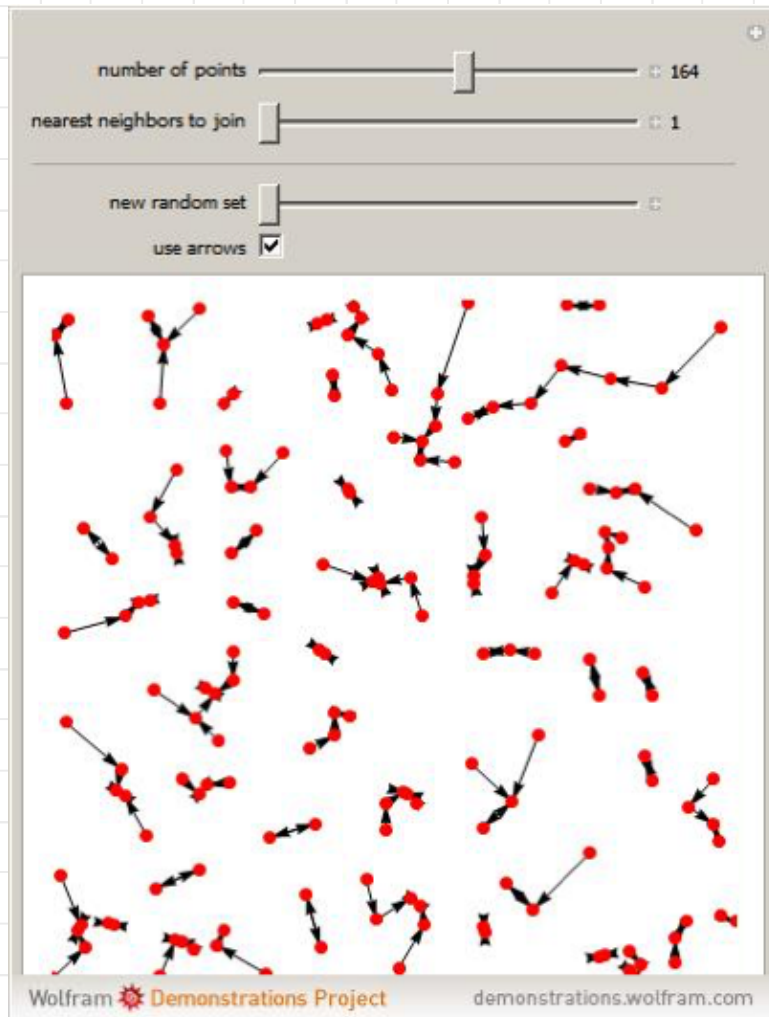


Delaunay triangulation

and from the
Delaunay triangulation
we can construct Voronoi
diagram.

Application of Delaunay triangulations: finding all nearest neighbours

Given n points in the plane find, for each point, its nearest neighbour — gives **nearest neighbour graph**, a directed graph of out-degree 1.



Many applications, e.g.

in statistical analysis:
find hierarchical clusters using
nearest neighbour chain algorithm

More on this in the next lecture.

<https://demonstrations.wolfram.com/NearestNeighborNetworks/>

Summary

- Voronoi diagram and Delaunay triangulation definitions, relationships, properties

References

- [CGAA] Chapters 7, 9
- [Zurich notes] Chapters 5, 7 (they start with Delaunay)
- [O'Rourke] Chapter 5
- [Devadoss-O'Rourke] Chapter 4.