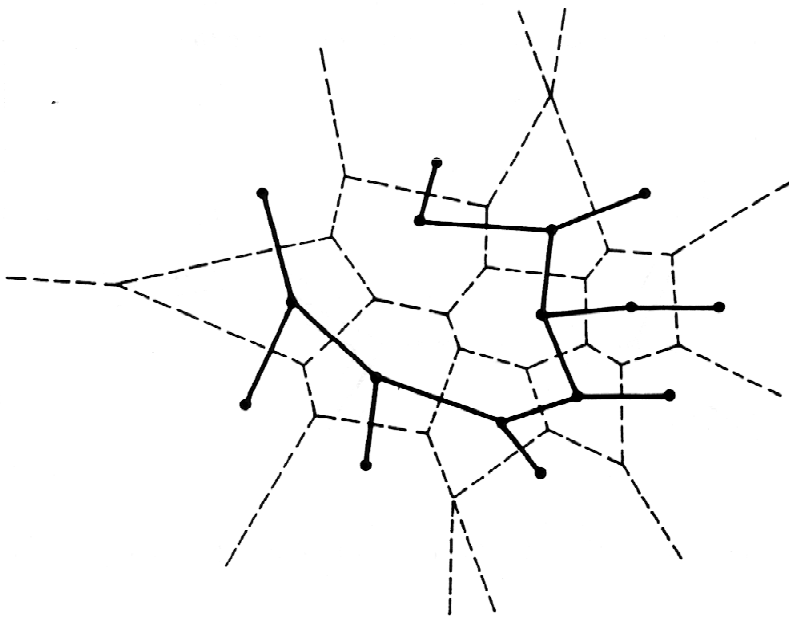
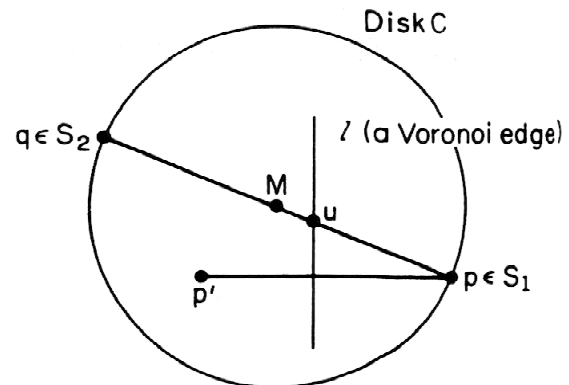


# Euclidean Minimum Spanning Trees

- We need to examine only the edges of the Delaunay triangulation.
- We must compute the minimum spanning tree of a planar graph.
- MST in planar graphs can be computed in  $O(n)$  time [Cheriton & Tarjan '76]



A set of points, its Voronoi diagram, and its EMST.

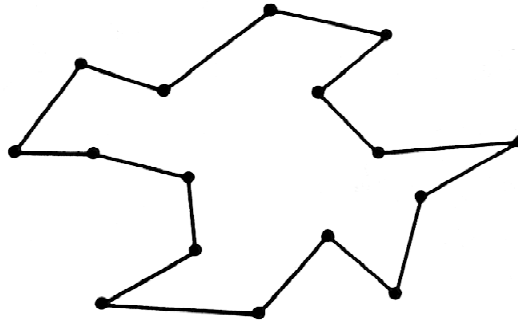
**Theorem 6.1.** An EMST of a set  $S$  of  $N$  points in the plane can be computed from the Delaunay Triangulation of  $S$  in optimal time  $\theta(N)$ .

Combining this result with the fact that the Delaunay triangulation is computable in time  $\theta(N \log N)$  we have

**Corollary 6.1.** An EMST of a set  $S$  of  $N$  points in the plane can be computed in optimal time  $\theta(N \log N)$ .

## Euclidean traveling salesman

**PROBLEM P.9 (EUCLIDEAN TRAVELING SALESMAN).** Find a shortest closed path through  $N$  given points in the plane.



A traveling salesman tour.

- NP-hard
  - in graphs
  - in  $L_2$
  - in  $L_1$
  - in  $L_m$
  - in  $L_\infty$

**Theorem 6.2** [Rosenkrantz–Stearns–Lewis (1974)]. A minimum spanning tree can be used to obtain an approximate TSP tour whose length is less than twice the length of a shortest tour.

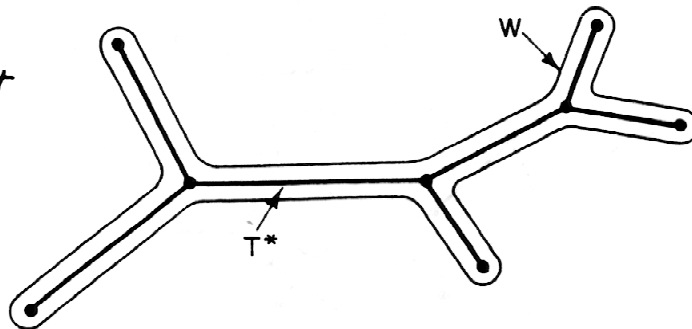
- Let  $T^*$  be optimal EMST
- $\Phi$  be optimal ETST tour
- $W$  be an Euler tour

$$\ell(W) = 2\ell(T^*)$$

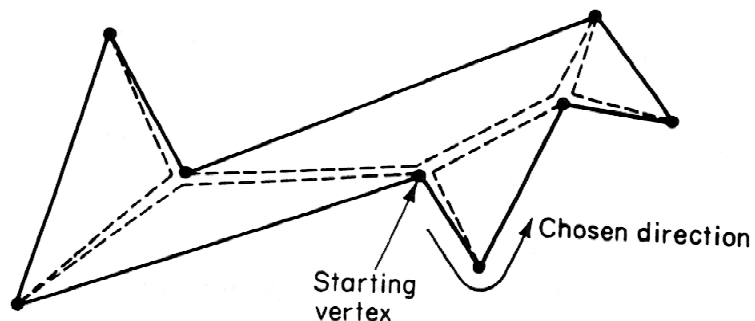
$$\ell(T^*) \leq \ell(\Phi_{\text{path}}),$$

where  $\Phi_{\text{path}}$  is  $\Phi$  - edge

$$\ell(W) \leq 2\ell(\Phi_{\text{path}}) < 2\ell(\Phi).$$



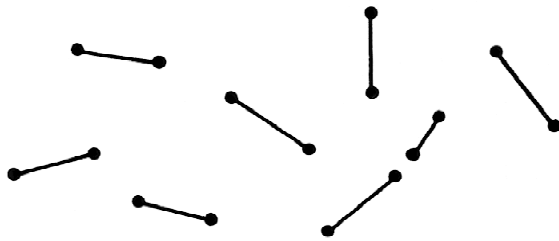
Doubling the EMST results in an Euler tour of all vertices of the set



"Short-cuts" on the Euler tour ensure that each vertex is visited exactly once.

PROBLEM P.10 (MINIMUM EUCLIDEAN MATCHING). Given  $2N$  points in the plane, join them in pairs by line segments whose total length is a minimum.

- minimum weighted matching in an arbitrary graph can be found in  $O(n^3)$  time  
[Edmonds'65, Gabow'72]



A minimum Euclidean matching.

- Can you get a faster algo?

2-appr. in $O(n \log n)$	OPEN
$\frac{3}{2}$ -appr. in $O(n^3)$	
Can you do better?	

**Theorem 6.3.** An approximation to the traveling salesman problem whose length is within  $3/2$  of optimal can be obtained in  $O(N^3)$  time if the interpoint distances obey the triangle inequality. [Christofides'76]

PROOF. The following algorithm achieves the desired result on the given set  $S$ :

1. Find a minimum spanning tree  $T^*$  of  $S$ .
2. Find a minimum Euclidean matching  $M^*$  on the set  $X \subseteq S$  of vertices of odd degree in  $T^*$ . ( $X$  has always even cardinality in any graph.)
3. The graph  $T^* \cup M^*$  is an Eulerian graph, since all of its vertices have even degree. Let  $\Phi_e$  be an Eulerian circuit of it.
4. Traverse  $\Phi_e$  edge by edge and bypass each previously visited vertex.  $\Phi_{\text{appr}}$  is the resulting tour.

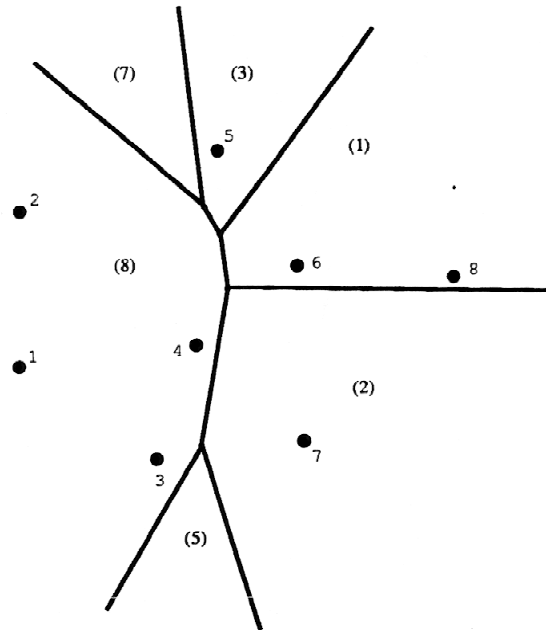
- $\ell(T^*) < \ell(\Phi)$  (like before)
- $\ell(M^*) \leq \frac{1}{2} \ell(\Phi)$  (take every second edge in  $\Phi$ )
- $\ell(\Phi_{\text{appr}}) \leq \ell(\Phi_e)$  (from  $\Delta$  inequality)
- Hence  $\text{length}(\Phi_{\text{appr}}) \leq \text{length}(\Phi_e)$   
 $= \text{length}(T^*) + \text{length}(M^*)$   
 $< \text{length}(\Phi) + \frac{1}{2} \text{length}(\Phi)$   
 $= \frac{3}{2} \text{length}(\Phi).$

## Smallest Circle

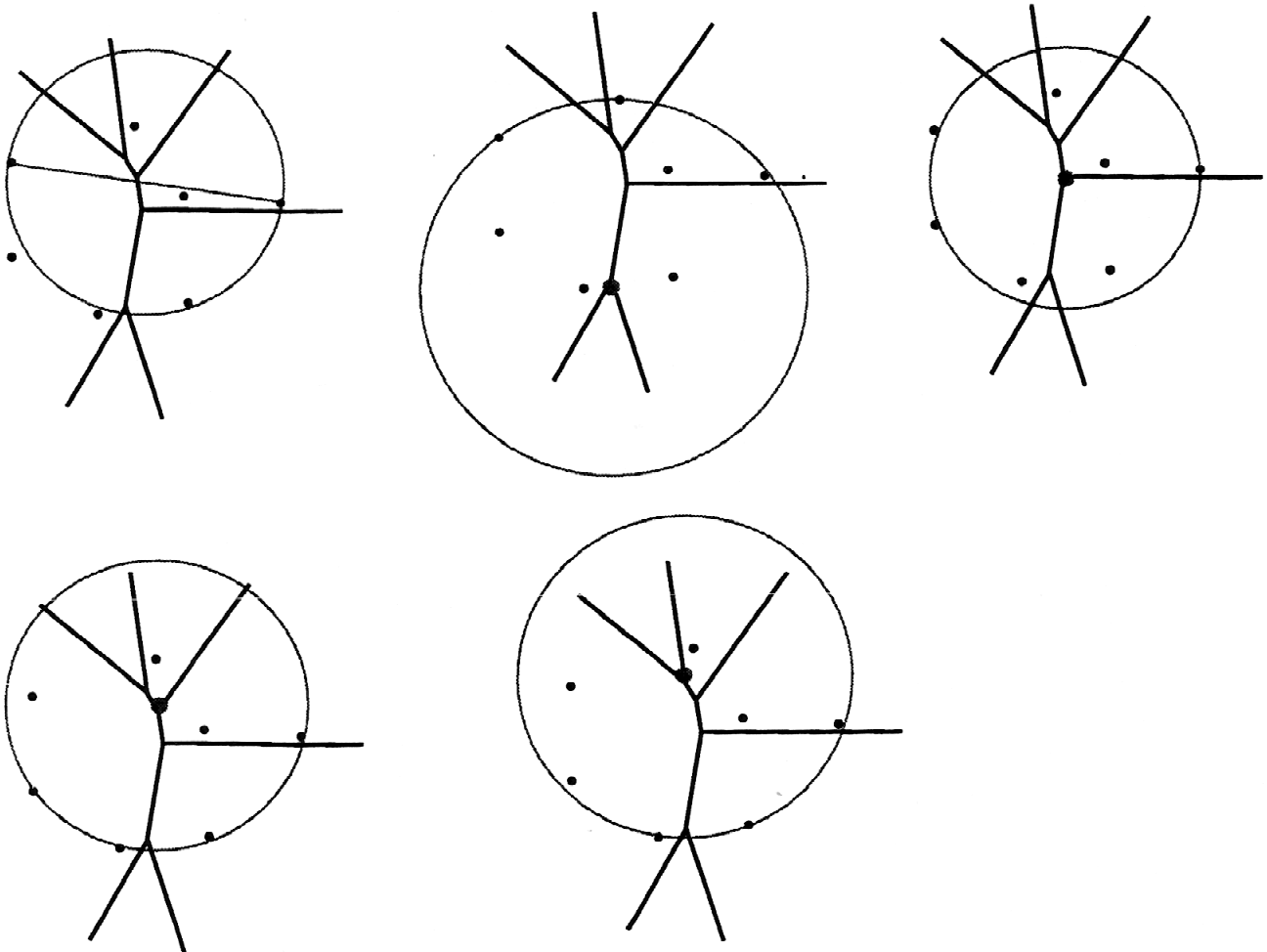
- **Given:**  $n$  points in the plane
- **Find:** Smallest circle containing all points.  $\min_{p_0} \max_i \left( (x_i - x_0)^2 + (y_i - y_0)^2 \right)$
- There is a unique solution. It goes through three points or has two diameter defining points.
- Trivial algorithm  $O(n^4)$ .
- Determine the diameter of the point set. STOP if the circle with this diameter contains all points. Requires  $O(n \log n)$ .
- Determine  $VD_{n-1}(S)$ . Find circle with Voronoi point as origo and through three most remote points. Requires  $O(n \log n)$ .

- $O(n^4)$  [Rademacher, Toeplitz '57]
- $O(n^2)$  [Elzinga, Hearn '72]
- $O(n \log n)$  [Shamos '78]
- $\Theta(n)$  [Megiddo '83]

Voronoi Diagrams of  $(n-1)$ -st Order



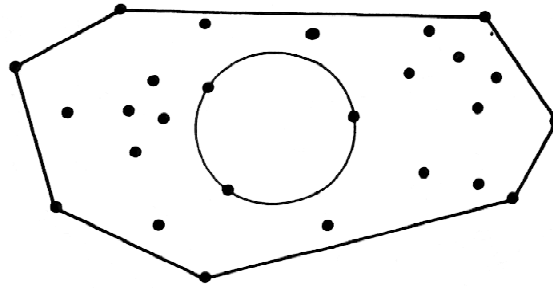
## Smallest Circle



Can be solved in  $\Theta(n)$  time using Megiddo's prune and search technique for linear programming with 3 variables (PS 297-299).

**Largest Empty Circle**

- **Given:**  $n$  points in the plane
- **Find:** Largest empty circle with center in the convex hull of the point-set.

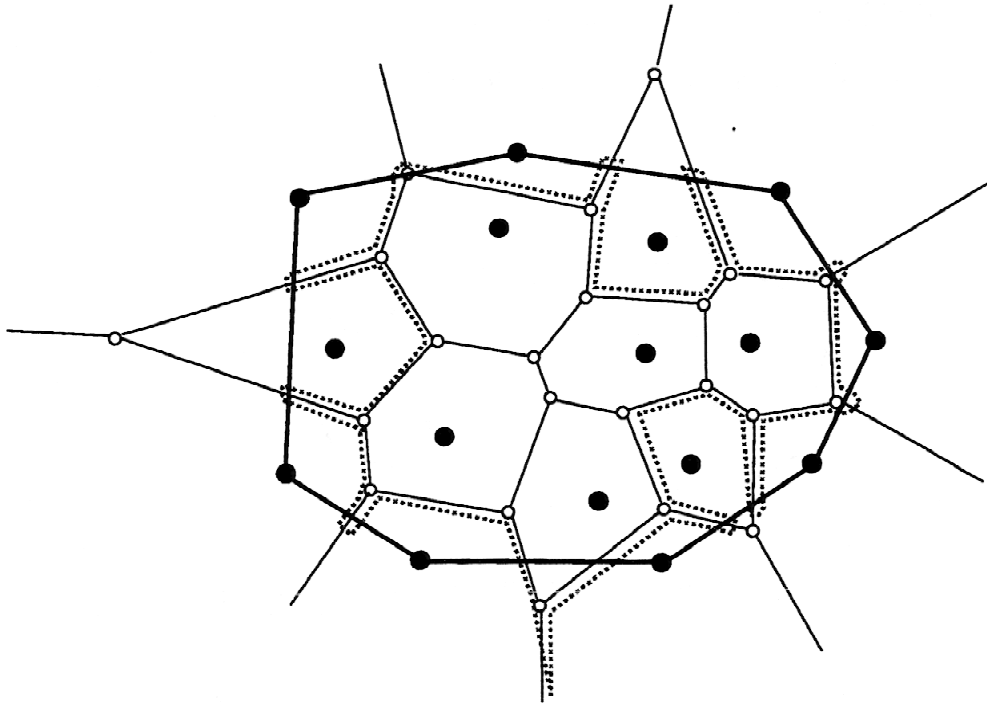


A largest empty circle whose center is internal to the hull.

$$\max_{p_o \in CH(S)} \min_i (x_i - x_o)^2 + (y_i - y_o)^2$$

- Francis, White (1974) in  $O(n^3)$  time
- Shamos (1978) in  $O(n \log n)$  time

## Largest Empty Circle



- The center is either a Voronoi point or occurs at an intersection of a Voronoi edge with the boundary of the convex hull.
- How to find the intersection?
- Voronoi edges intersect at most 2 boundary edges of the convex hull.
- Each side of the convex hull intersects at least one Voronoi edge.
- $f(x,y)$  is the distance of point  $p=(x,y)$  from the nearest point in  $S$ .
- $f(x,y)$  is a downward-convex function of both  $x$  and  $y$  within a Voronoi polygon
- Hence,  $f(x,y)$  gets its maximum at a vertex of one such polygon



**Corollary 6.2.** *In the algebraic computation tree model, any algorithm for the MAXIMUM GAP problem on a set of  $N$  real numbers requires  $\Omega(N \log N)$  time.*

In a modified computation model, however, Gonzalez (1975) has obtained the most surprising result that the problem can be actually solved in linear time. The modification consists of adding the (nonanalytic) *floor function* " $\lfloor \ ]$ " to the usual repertoire. Here is Gonzalez's remarkable algorithm:

**procedure MAX GAP**

Input:  $N$  real numbers  $X[1:N]$  (unsorted)

Output: MAXGAP, the length of the largest gap between consecutive numbers in sorted order.

```

begin MIN := min  $X[i]$ ;
      MAX := max  $X[i]$ ;
      (*create  $N - 1$  buckets by dividing the interval from MIN to MAX
      with  $N - 2$  equally-spaced points. In each bucket we will retain
      HIGH[i] and LOW[i], the largest and smallest values in bucket  $i$ *)
      for  $i := 1$  until  $N - 1$  do
        begin COUNT[i] := 0;
              LOW[i] := HIGH[i] :=  $\Lambda$ 
        end; (*the buckets are set up*)
      (*hash into buckets*)
      for  $i := 1$  until  $N - 1$  do
        begin BUCKET :=  $1 + \lfloor (N - 1) \times (X[i] - \text{MIN}) /$ 
              (MAX - MIN)  $\rfloor$ ;
              COUNT[BUCKET] := COUNT[BUCKET] + 1;
              LOW[BUCKET] := min ( $X[i]$ , LOW[BUCKET]);11
              HIGH[BUCKET] := max ( $X[i]$ , HIGH[BUCKET])11
        end;
      (*Note that  $N - 2$  points have been placed in  $N - 1$  buckets, so by
      the pigeonhole principle some bucket must be empty. This means that
      the largest gap cannot occur between two points in the same bucket.
      Now we make a single pass through the buckets*)
      MAXGAP := 0;
      LEFT := HIGH[1];
      for  $i := 2$  until  $N - 1$  do
        if (COUNT[i]  $\neq 0$ ) then
          begin THISGAP := LOW[i] - LEFT;
                MAXGAP := max(THISGAP, MAXGAP);
                LEFT := HIGH[i]
          end
        end
      end.

```

This algorithm sheds some light on the computational power of the "floor"

<sup>11</sup> Here, by convention,  $\min(x, \Lambda) = \max(x, \Lambda) = x$ .