

# COT 6936: Topics in Algorithms

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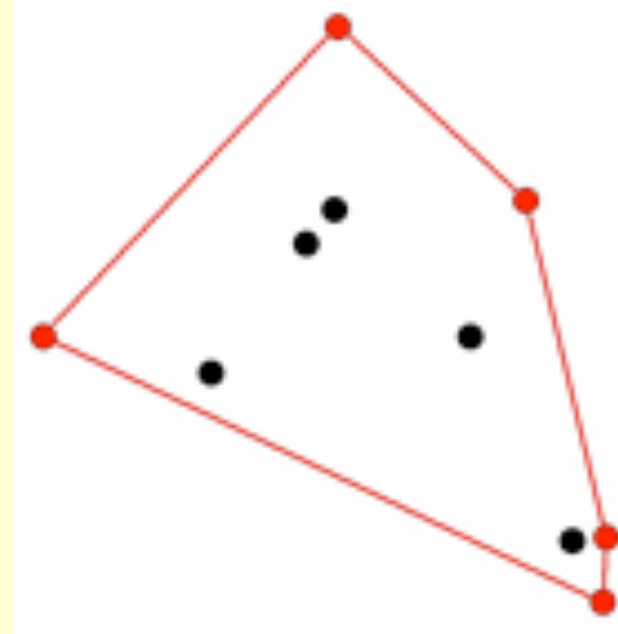
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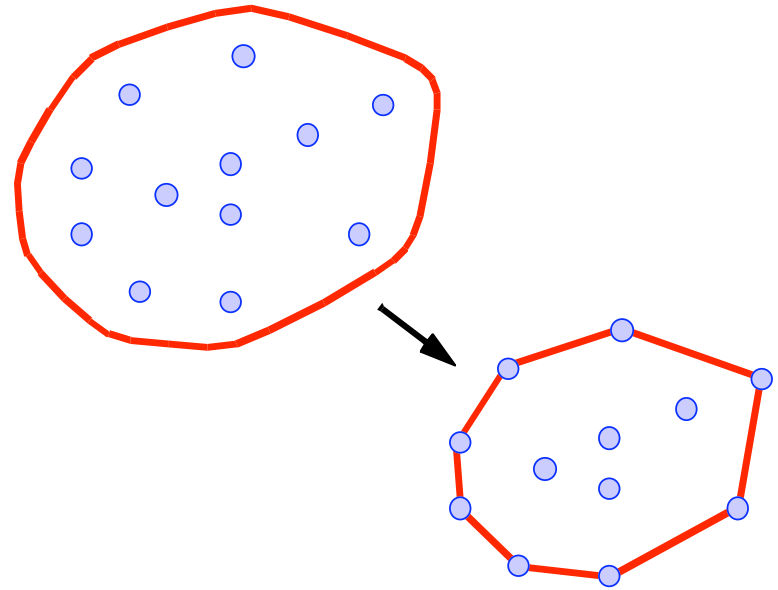
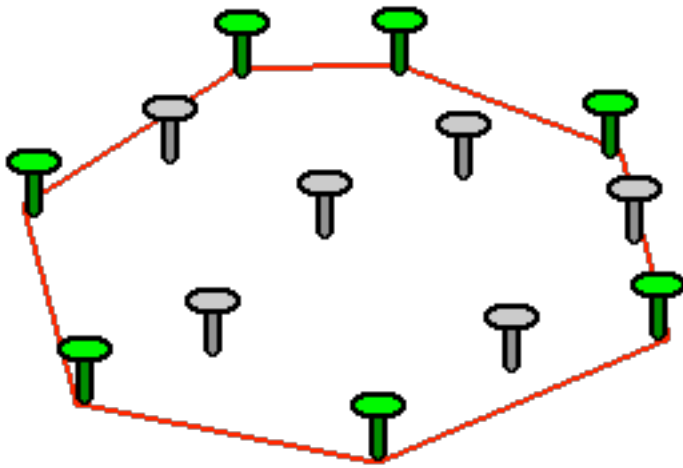
[http://www.cs.fiu.edu/~giri/teach/COT6936\\_S12.html](http://www.cs.fiu.edu/~giri/teach/COT6936_S12.html)

# Convex Polygons

- **Convex region**: A region in space is called convex if line joining any two points in the region is completely contained in the region.
- **Convex hull** of a set of points,  $S$ , is the smallest convex region containing  $S$ .

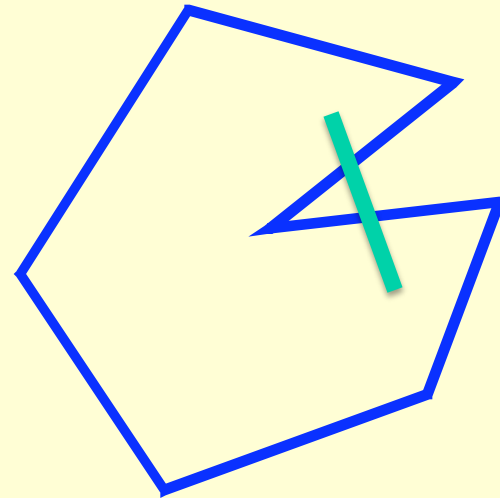
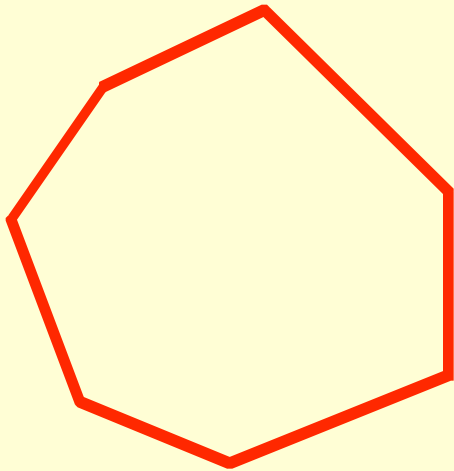


# Rubber Band Analogy

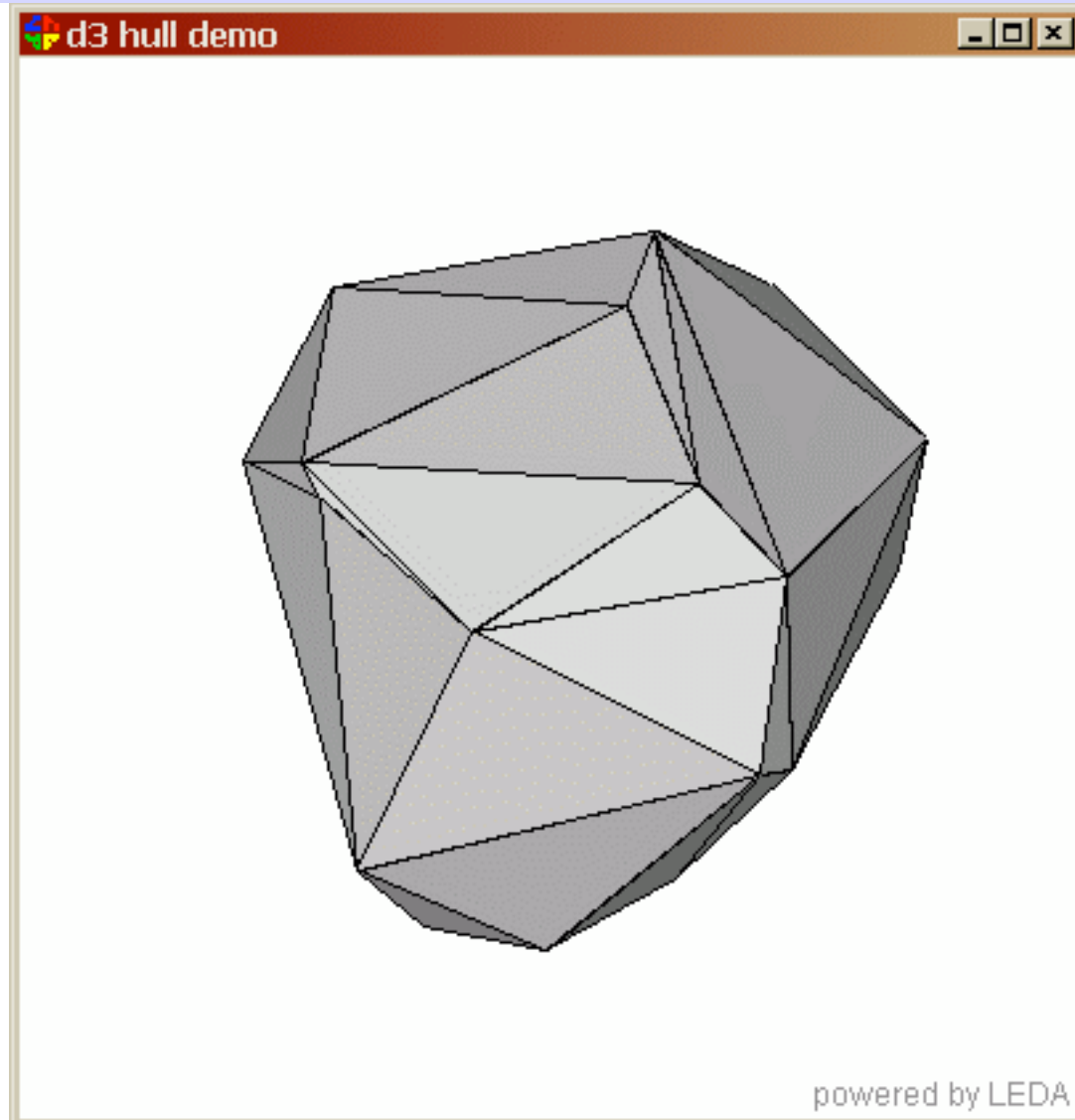


# Non-convex polygons

- Convex vs Non-convex



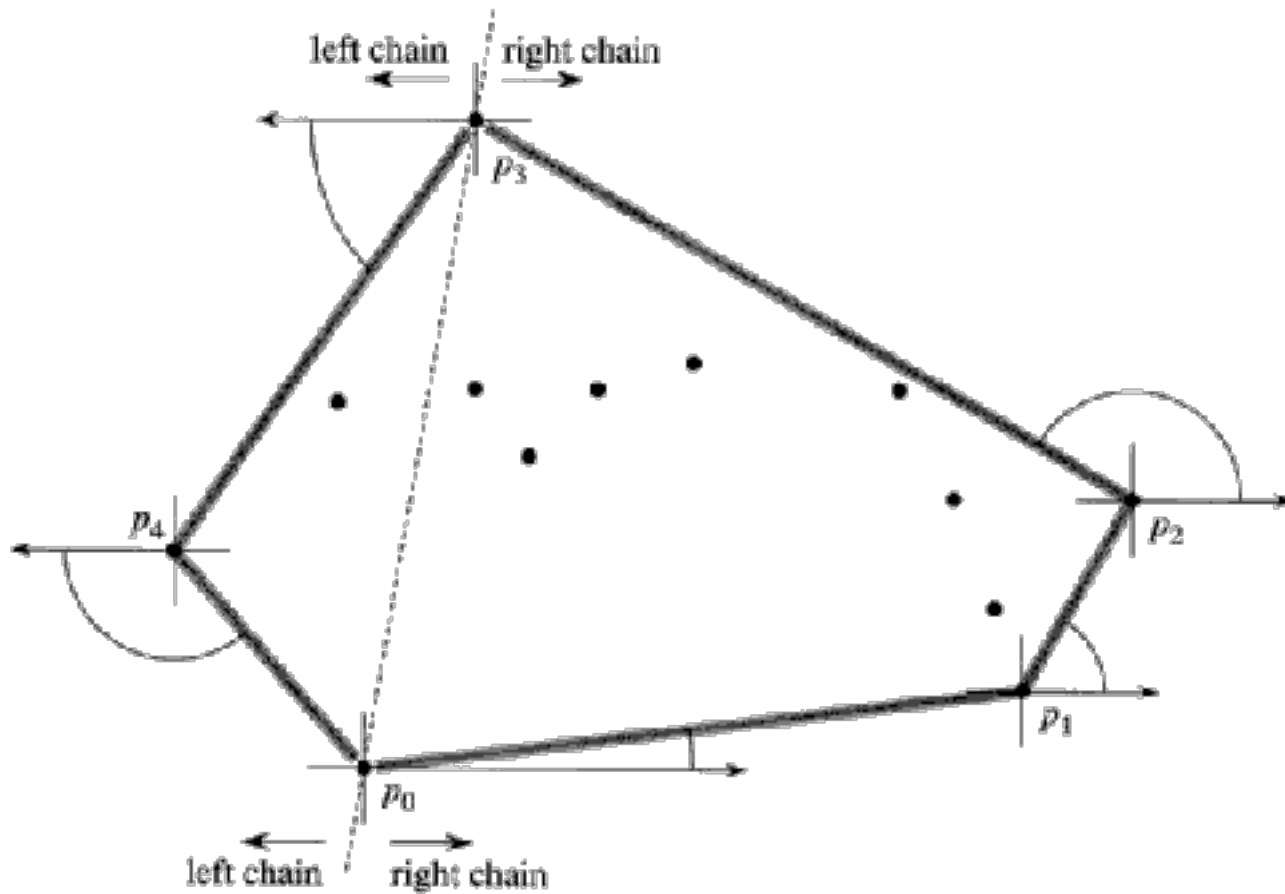
# 3D convex hulls



# Convex Hull: Graham Scan applet

- <http://www.personal.kent.edu/~rmuhamma/Compgeometry/MyCG/ConvexHull/GrahamScan/grahamScan.htm>
  - Main cost: sorting
    - $O(n \log n)$

# Package Wrapping: Jarvis March



# Package Wrapping: Jarvis March

- Time complexity
  - (Cost of iteration)  $\times$  (# iterations)
- Each iteration:  $O(n)$
- Number of iterations =  $O(n)$
- Cost =  $O(nh)$ 
  - $h$  = # of points on convex hull



# Complexity of Convex Hull

- Graham Scan:  $O(n \log n)$
- Jarvis March:  $O(nh)$  [output sensitive]
- Lower Bound =  $\Omega(n \log h)$

# Chan's Algorithm

- Combines the benefits of both algorithms
- Partition points into  $n/m$  groups of size  $m$
- Use Graham scan on each one
  - $O((m \log m) (n/m)) = O(n \log m)$
- Merge the  $n/m$  convex hulls using a Jarvis march algorithm by treating each group as a "big point"
  - Tangent between a point and a convex polygon with  $m$  points can be computed in  $O(\log m)$  time
  - $O((n/m)(\log m)(h)) = O((n/m)h \log m)$

# Chan's Algorithm

- Time Complexity =  $O(n \log m + (n/m) h \log m)$
- If  $m = h$ , then time =  $O(n \log h)$
- How to guess  $h$ ?
  - Linear Search
    - Time complexity =  $O(nh \log h)$
  - Binary Search
    - Time complexity =  $O(n \log^2 h)$
  - Doubling Search ( $m = 1, 2, 4, 8, \dots$ )
    - Time Complexity =  $O(n \log^2 h)$
  - ???

# Chan's Algorithm: More tricks

- What if  $m = h^2$ ?
  - Then  $O(n \log m) = O(n \log h)$
- So try:  $m = 2, 4, 16, 256, \dots$ 
  - Analysis

$$\sum_{t=1}^{\lg \lg h} n2^t = n \sum_{t=1}^{\lg \lg h} 2^t \leq n2^{1+\lg \lg h} = 2n \lg h = O(n \log h),$$

# Closest Pair Problem

- **Input:** Set of points  $S$  in the plane
- **Output:** The closest pair of points in  $S$
- **Naïve Solution:**  $O(n^2)$  time
- **Divide-&-Conquer:**
  - $T(n) = 2T(n/2) + M(n)$
  - $M(n)$  = time to merge solutions to the two subproblems
  - Only need to merge 2 strips on 2 sides of vertical split
  - Naïve Solutions:  $M(n) = O(n^2)$
  - Sort the points by  $y$ -coordinate:  $M(n) = O(n \log n)$
  - Global sorting at the start:  $M(n) = O(n)$
- **Lower Bound:**  $O(n \log n)$  time
- **Randomized Algorithm:**  $O(n)$  time [Rabin]

# Post Office Problem

- **Preprocess:** Given set  $S$  of points in the plane representing post offices.
- **Input:** Query point  $p$ .
- **Output:** Report the closest post office to  $p$ .

# 1-d Post Office Problem

- **Preprocessing:** Build balanced BST on  $S$ .
  - $O(n \log n)$
  - Alternatively, build a sorted array on  $S$ .
- **Query Algorithm:** Given a value  $p$ , identify the smallest value larger than  $p$  and the largest value smaller than  $p$  and among the two pick the one that is closest to  $p$ .
  - $O(\log n)$

## 2-d $L_\infty$ Post Office Problem

- $L_p = ((|a_x - b_x|)^p + (|a_y - b_y|)^p)^{1/p}$
- $L_2 =$  Euclidean distance
- $L_\infty = \max \{|a_x - b_x|, |a_y - b_y|\}$
- **Preprocessing:** Build **Range Tree** on **S**.
  - $O(n \log n)$
- **Query Algorithm:** Given a value **p**, identify the closest point to the right of **p** and the closest point to the left of **p** and among the two pick the one that is closest to **p**.
  - $O(\log n)$



# 2-D Range Tree

- Build the **X-Tree**, a balanced binary search tree on set  $S$  using the  $x$ -coordinates of the points.
- For each node in the **X-Tree**, build a **Y-Tree**, a balanced binary search tree on the set of points in the subtree of that node using the  $y$ -coordinates of the points.
- **Application:** Output all points with  $x$ -coordinates in range  $[A,B]$  and  $y$ -coordinates in range  $[C,D]$ .
- **Application:** Post office problem

# Definitions

- A **Geometric Network  $N$**  has vertices  **$S$**  that correspond to points in  $\mathbb{R}^d$  and edges  **$E$**  whose weights equal the distance between the endpoints.

Examples:



# Good Network Design

- Small size
- Small weight
- Small degree
- Small diameter
- Highly connected, highly fault-tolerant
- Planar, low genus
- Small load factor
- **SMALL DILATION**

# MST on 13,509 cities of US



# Definitions

- **Dilation or Stretch Factor ( $t(N)$ )** of a network  $N$  is the maximum amount by which the distance between some pair of vertices in the network is increased.

$$t(N) = \max_{a,b \in N} \left\{ \frac{d_N(a, b)}{|ab|} \right\}$$

- **$t$ -Spanner** is a network with dilation at most  $t$ .

# t-Spanner Networks: Examples



$t = 10$



$t = 5$



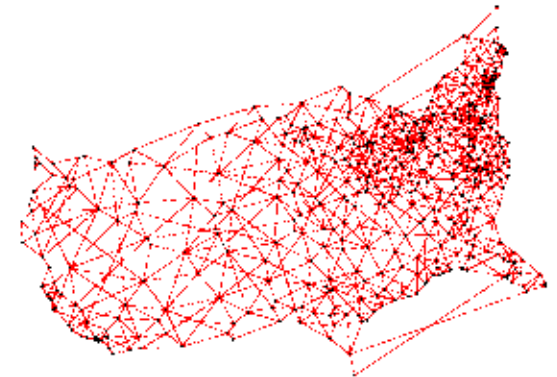
$t = 3$



$t = 2$



$t = 1.5$



$t = 1.25$

# Application of Geometric Spanners

- Network Design - Transportation, Communication
- Distributed Algorithms - Synchronizers
- Graphics - Model Simplification
- Pattern Recognition - Approx. Nearest Neighbors
- Robotics - Approximate Shortest Path Problems
- Approximation Algorithm design [Rao and Smith]

# Design of t-Spanners

- **Theta graphs**

[Clarkson 87, Keil 88, Althofer et al. 93]

- **Greedy algorithms**

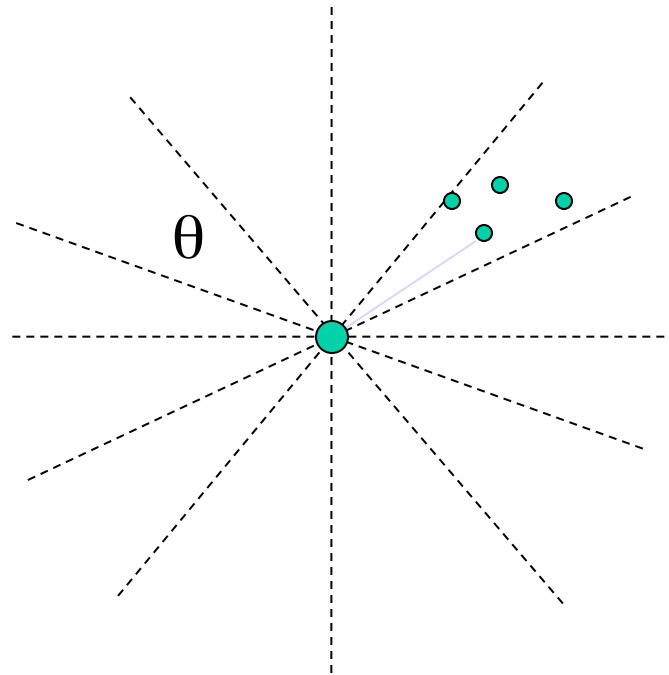
[Bern 89, Althofer et al. 93]

- **Well-separated pair decomposition**

[Callahan & Kosaraju 95]



# Theta Graphs



$$t = 1/(\cos\theta - \sin\theta)$$

# Algorithm GREEDY( $G=(V, E), t$ )

Sort  $E$  by non-decreasing weights

Initialize  $G'(V, E')$  to be empty

**for** each edge  $e = (u, v) \in E$  **do**

**if** ( $d_{G'}(u, v) > t * wt(e)$ ) **then**

        Add edge  $e$  to  $E'$

**output**  $G'$

# Well-Separated Pair Decomposition

**Definition:** [Callahan and Kosaraju, 95]

Given a set,  $S$ , of  $n$  points in  $\mathbb{R}^d$ , and  $s > 0$ , a WSPD is sequence of pairs of subsets of  $S$ ,

$$\{A_1, B_1\}, \dots, \{A_m, B_m\}, \text{ s.t.}$$

1. Every pair of vertices  $\{p, q\}$  is in exactly one pair of the decomposition.
2.  $A_i$  and  $B_i$  are well-separated for each  $i = 1, \dots, m$
3.  $m = O(n)$
4. The decomposition can be computed in  $O(n \log n)$  time.

# t-Spanner Construction Using WSPD

[Arya, Das, Mount, Salowe, Smid, 95]

1. Compute a WSPD with  $s = (4t + 4)/(t-1)$
2. For each well-separated pair  $(A_i, B_i)$   
add an arbitrary edge between  $A_i$  and  $B_i$ .
3. Pruning Step: Remove unnecessary edges.

## Analysis

- Stretch factor =  $t$
- Max degree =  $O(1)$
- Total weight =  $O(1) \text{ wt(MST)}$

# Theorem

Given a set  $S$  of  $n$  sites in  $\mathbb{R}^d$ , and a real number  $t > 1$ , there exists an efficient algorithm to construct a network  $G$  such that:

- $t(G) \leq t$ ,
- $\text{wt}(G) = O(1) \cdot \text{wt}(\text{MST})$ , and
- maximum degree of  $G$  is  $O(1)$

[Gudmundsson, Levcopoulos, Narasimhan 00]

# Comparison of Spanner Construction Methods

- **Theta Graphs:**  $O(n \log n)$  time,  $O(n)$  space  
[Arya, Das, Mount, Salowe, Smid 95]
- **WSPD Spanners:**  $O(n \log n)$  time,  $O(n)$  space  
[Callahan & Kosaraju 95]
- **Greedy Algorithms:** *Low weight guarantees*  
 $O(n \log n)$  time,  $O(n)$  space,  $O(1)$  wt(MST) weight  
[Das, Heffernan, Narasimhan, Salowe 93, 94, 95,  
Gudmundsson, Levcopoulos, Narasimhan '00]

# Algorithm NewGREEDY( $G=(V, E), t$ )

Sort  $E$  by non-decreasing weights

Initialize  $G'(V, E')$  to be empty

**for** each edge  $e = (u, v) \in E$  **do**

**if** ( $d_{G'}(u, v) > t(1+\epsilon) * wt(e)$ ) **then**

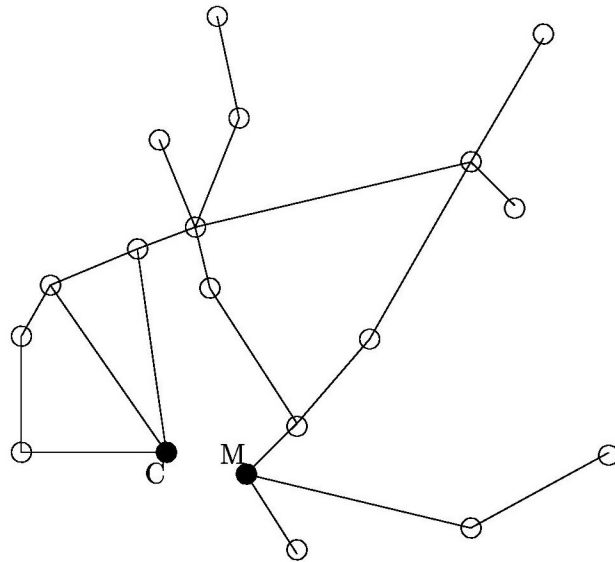
        Add edge  $e$  to  $E'$

**output**  $G'$

# Computing Stretch Factors

Input: A geometric graph  $N$  on a set  $S$  of  $n$  sites

Output: Compute the stretch factor of  $N$ .

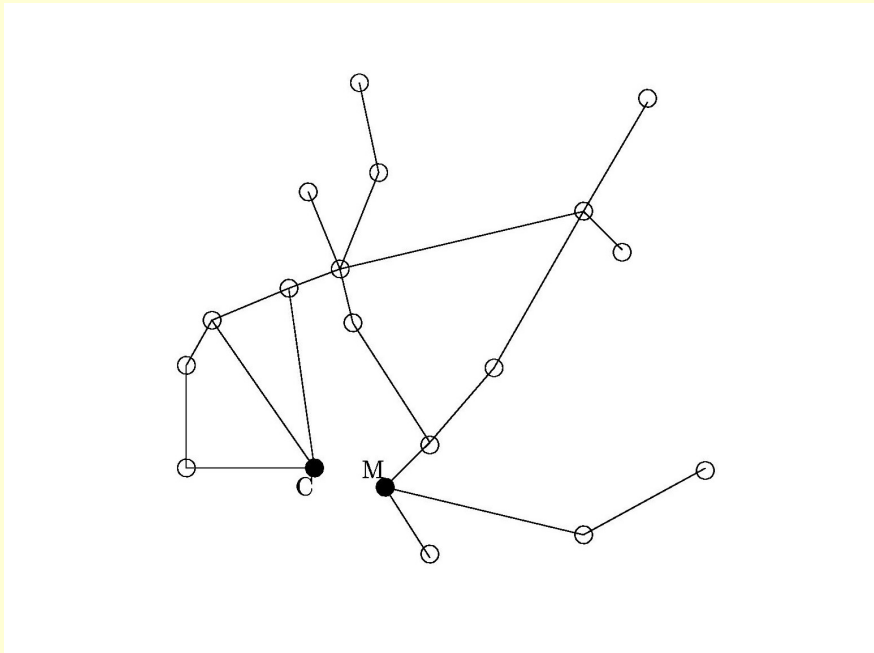




# Approximate Stretch Factors

Input: A geometric graph  $N$  on a set  $S$  of  $n$  sites

Output: Compute (approx) stretch factor of  $N$ .



Reduction to  $O(n)$   
shortest path queries.  
[Narasimhan, Smid '01]

# $\varepsilon$ -APPROXIMATION ALGORITHM

**Step 1:** Using separation constant  $s = 4(2+\varepsilon)/\varepsilon$

Compute a WSPD:  $(A_1, B_1), \dots, (A_m, B_m)$

**Step 2:** For every well-separated pair  $(A_i, B_i)$  pick an **arbitrary** pair of vertices  $(a_i, b_i)$  such that

$a_i \in A_i, b_i \in B_i$ .

**Step 3:** Return

$$\max_i \{d_N(a_i, b_i) / |a_i b_i|\}$$

[Narasimhan & Smid '00]

[Trivial Exact Algorithm using APSP]

# Approximate Stretch Factors

- **PATH NETWORKS**  
 $O(n \log n)$
- **CYCLE NETWORKS**  
 $O(n \log n)$
- **TREE NETWORK**  
 $O(n \log n)$
- **PLANAR NETWORKS**  
 $O(n \log n)$
- **ARBITRARY NETWORKS**  
 $O(m + n \log n)$        $[(1+\epsilon)\text{-approx}]$

# GEOMETRIC ANALYSIS

Input: Set  $S$  of  $n$  sites; Set  $E$  of edges joining sites;

Property  $P$  Satisfied by  $E$

Output:  $wt(E) \leq ??$

- Theta Graph Property [Clarkson, Keil]
- Diamond Property [Das]
- Gap Property [Das, Narasimhan]
- Leapfrog Property [Das, Narasimhan]
- Isolation Property [Das, Narasimhan]

# Spanner Networks with other Properties

- Fault-Tolerance [Narasimhan, Smid]
- Small Degree  
[Soares, Salowe, Das, Heffernan, Arya et al.]
- Small Diameter [Arya et al.]
- Bottleneck Spanners [Narasimhan, Smid]
- Steiner Spanners - "Banyans" [Rao, Smith]
- Tree Spanners & Planar Spanners [Arikati et al.]
- Probabilistic Embeddings [Bartal]

# Experiments with Spanners

- WSPD-based spanners followed by (approximate) greedy algorithm performs well.  
[Narasimhan & Zachariasen '00]

# Problem

Preprocess a geometric spanner network so that **approximate** shortest path lengths between two query vertices can be reported efficiently (using subquadratic space).

# Applications

- Shortest path queries in polygonal domains with obstacles.
- Approximate closest pair.
- Computing approximate stretch factors of geometric graphs.