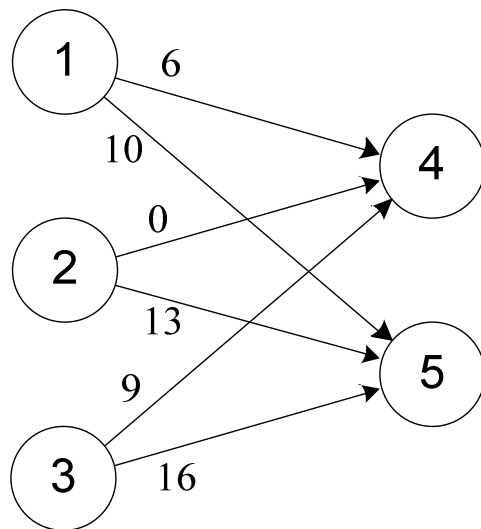


## **Networks 2: Shortest Paths and Road Networks**

- Great circle distances are not accurate
  - Over shorter (< 50 mi) distances
  - In areas with waterways that restrict road travel
- Actual distance using road network more accurate
- Usually want to find the shortest travel time path
  - Not the shortest distance path

# Graph Representations

- Complete bipartite directed (or digraph):
  - Suppliers to multiple DCs, single mode of transport



C:	1	2
---	---	---
1:	6	10
2:	0	13
3:	9	16

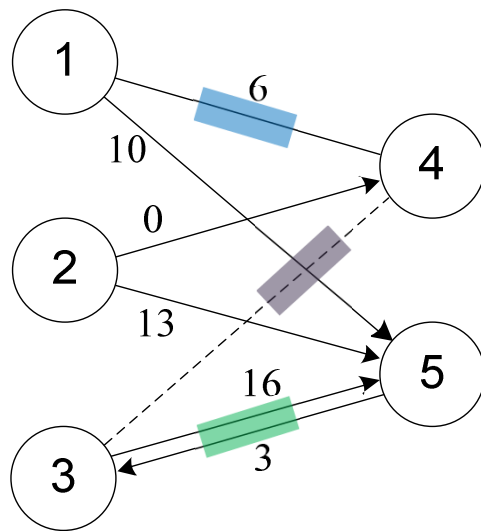
Interlevel matrix

W =	0	0	0	6	10
	0	0	0	0	13
	0	0	0	9	16
	0	0	0	0	0
	0	0	0	0	0

Weighted adjacency matrix

# Graph Representations

- Bipartite:
  - One- or two-way connections between nodes in two groups



$$W = \begin{matrix} & \begin{matrix} 4 & 5 \end{matrix} \\ \begin{matrix} 1 \\ 2 \\ 3 \end{matrix} & \begin{bmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix} \end{matrix}$$

Annotations: Node 1 is circled in blue, node 2 in purple, node 3 in green. The top-right 2x2 submatrix is enclosed in a red dashed box. Inside this box, the value 6 is circled in blue, 0 is circled in purple, and 16 is circled in green. A  $\sqrt{\epsilon}$  symbol is placed near the 0 in the middle row of the red box.

$$IJC = \begin{bmatrix} 4 & 1 & 6 \\ 5 & 3 & 3 \\ 1 & 4 & 6 \\ 2 & 4 & 0 \\ 1 & 5 & 10 \\ 2 & 5 & 13 \\ 3 & 5 & 16 \end{bmatrix}$$

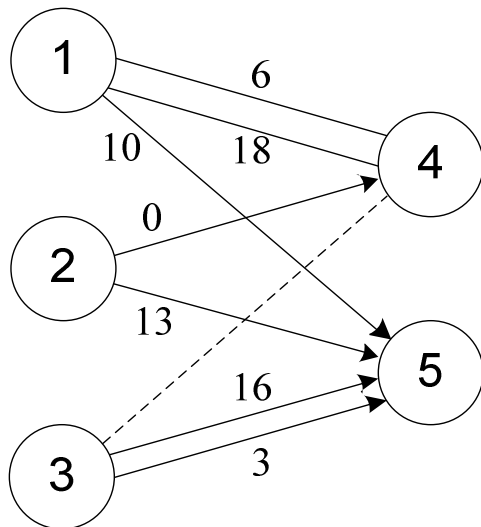
Annotations: The first three rows are grouped by a blue dashed box. The last three rows are grouped by a green dashed box. A large blue bracket on the right side of the matrix is labeled "Arc list matrix".

Arc list matrix



# Graph Representations

- Multigraph:
  - Multiple connections, multiple modes of transport
  - **Simple graph** does not have multiple connections



IJC =

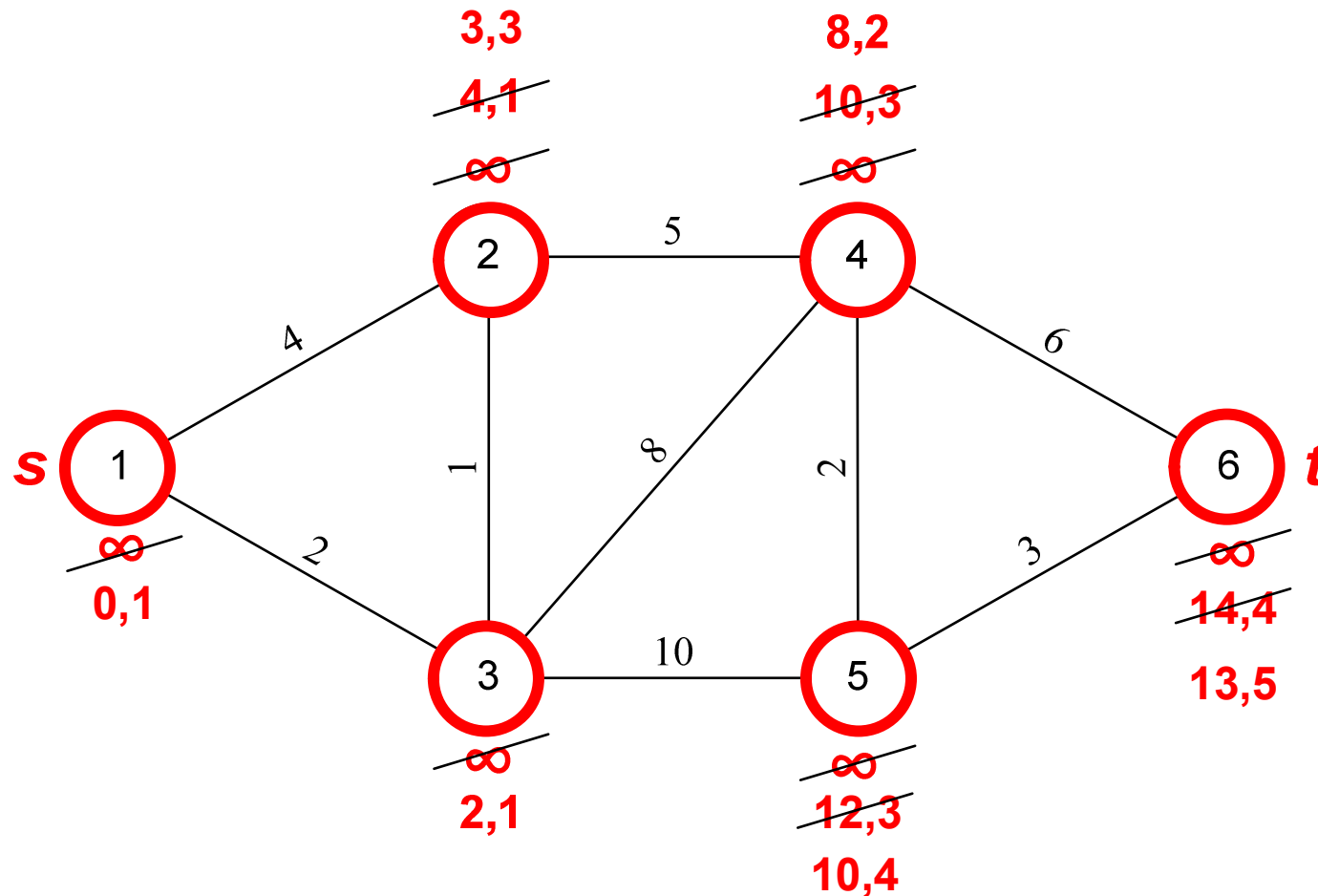
1	-4	6
1	-4	18
1	5	10
2	4	0
2	5	13
3	5	16
3	5	3

no\_W =

0	0	0	24	10
0	0	0	NaN	13
0	0	0	0	19
24	0	0	0	0
0	0	0	0	0

Can't represent using adjacency matrix

# Dijkstra Shortest Path Procedure



Path:  $1 \leftarrow 3 \leftarrow 2 \leftarrow 4 \leftarrow 5 \leftarrow 6$ : 13

# Dijkstra Shortest Path Procedure

```

procedure dijkstra(W, n, s)
   $S \leftarrow \{ \}$ ,  $\bar{S} \leftarrow \{1, \dots, n\}$ 
  for  $i \in \bar{S}$ ,  $d(i) \leftarrow \infty$ , endfor
   $d(s) \leftarrow 0$ ,  $pred(s) \leftarrow 0$ 
  while  $|\bar{S}| < n$ 
     $i \leftarrow \arg \min_j \{d(j) : j \in \bar{S}\}$ 
     $S \leftarrow S \cup i$ ,  $\bar{S} \leftarrow \bar{S} \setminus i$ 
    for  $j \in \arg \{W_{i(j)} : W_{ij} \neq 0\}$ 
      if  $d(j) > d(i) + W_{ij}$ 
         $d(j) \leftarrow d(i) + W_{ij}$ 
         $pred(j) \leftarrow i$ 
      endif
    endfor
  endwhile
  return d, pred
  
```

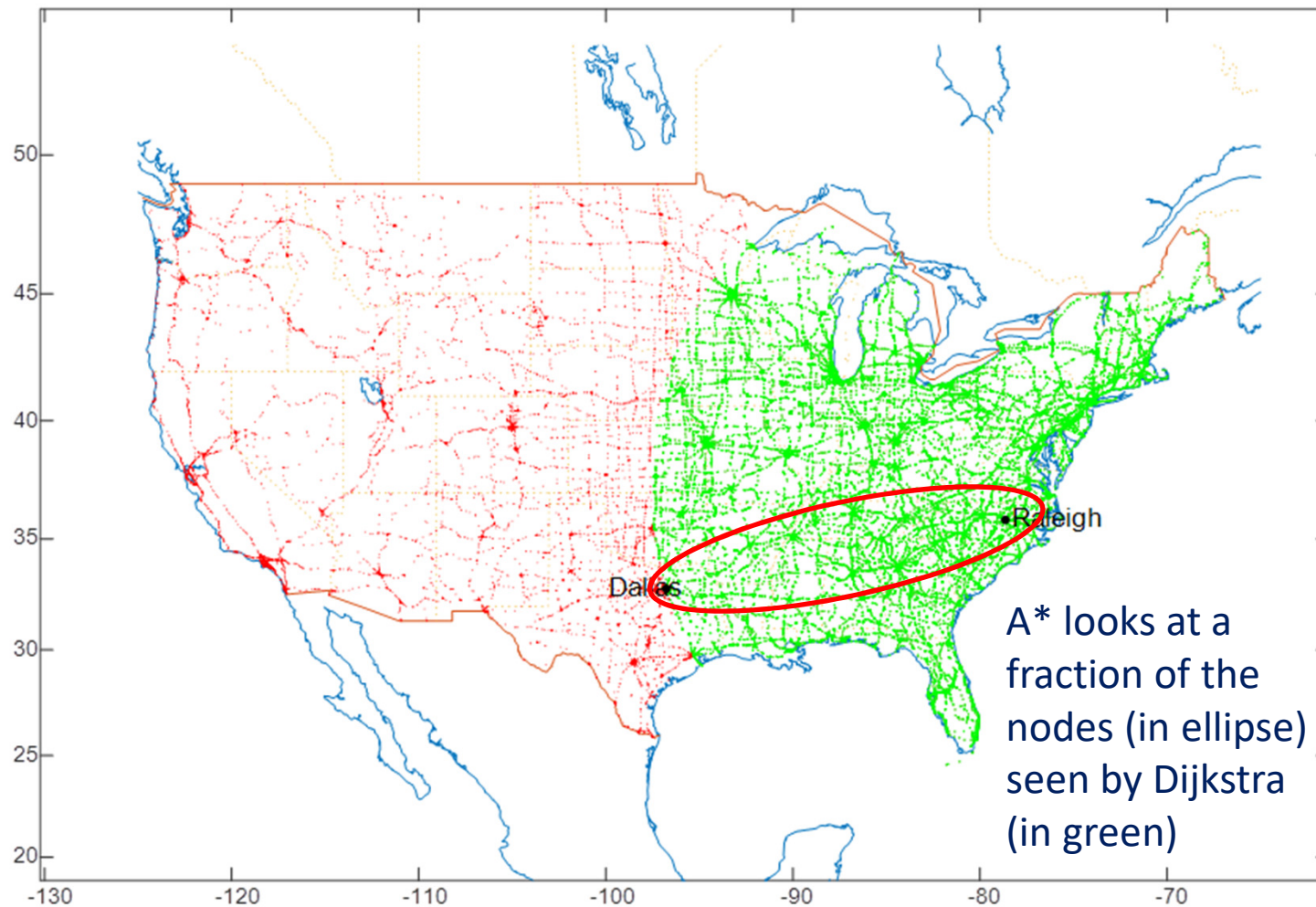
Procedure	Problem	Time Complexity
Simplex	LP	$O(2^m)$
Ellipsoid	LP	$O(m^4)$
Hungarian	Transportation	$O(m^3)$
Floyd-Warshall	Shortest Path with Cycles	$O(m^3)$
Dijkstra (linear min)	Shortest Path without Cycles	$O(m^2)$
Dijkstra (Fibonacci heap)	Shortest Path without Cycles	$O(n \log m)$
Number of nodes		$m$
Number of arcs		$n$

# Other Shortest Path Procedures

- Dijkstra requires that all arcs have positive or negative lengths
  - It is a “label setting” algorithm since step to final solution made as each node labeled
  - Can find longest path (used, e.g., in CPM) by negating *all* arc lengths
- Networks with only *some* negative arcs require slower “label correcting” procedures that repeatedly check for optimality at all nodes or detect a negative cycle
  - Requires  $O(n^3)$  via Floyd-Warshall algorithm (cf.,  $O(n^2)$  Dijkstra)
  - Negative arcs used in project scheduling to represent maximum lags between activities
- A\* algorithm adds to Dijkstra an heuristic LB estimate of each node’s remaining distance to destination
  - Used in AI search for all types of applications (tic-tac-toe, chess)
  - In path planning applications, great circle distance from each node to destination could be used as LB estimate of remaining distance

# A\* Path Planning Example 1

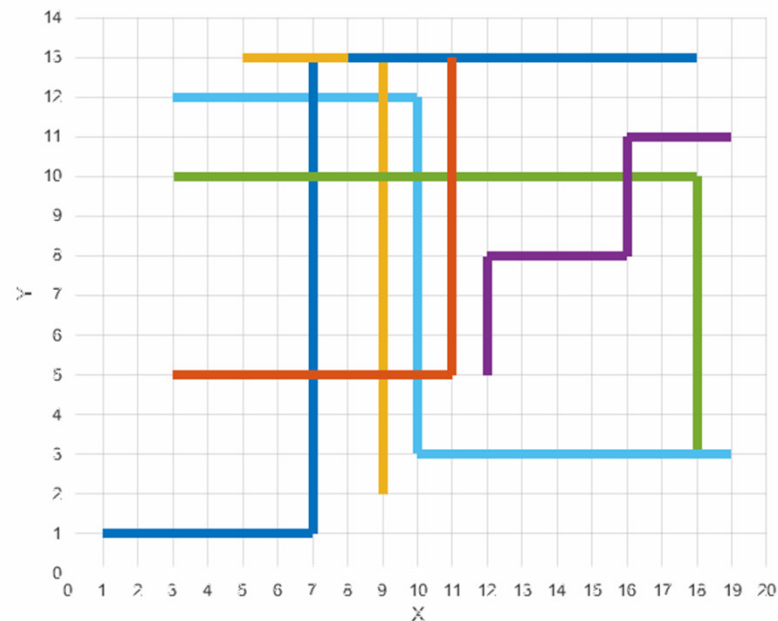
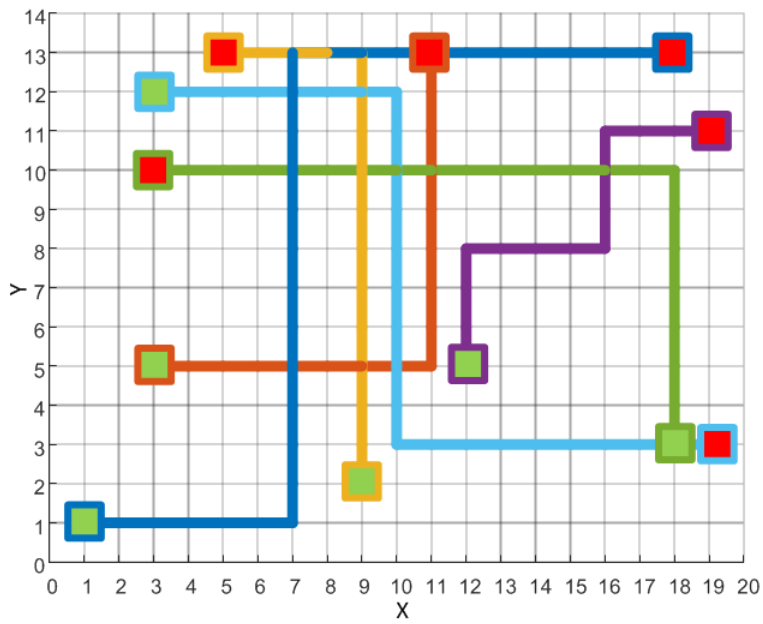
$$d_{A^*}(\text{Raleigh}, \text{Dallas}) = d_{dijk}(\text{Raleigh}, i) + d_{GC}(i, \text{Dallas}), \quad \text{for each node } i$$



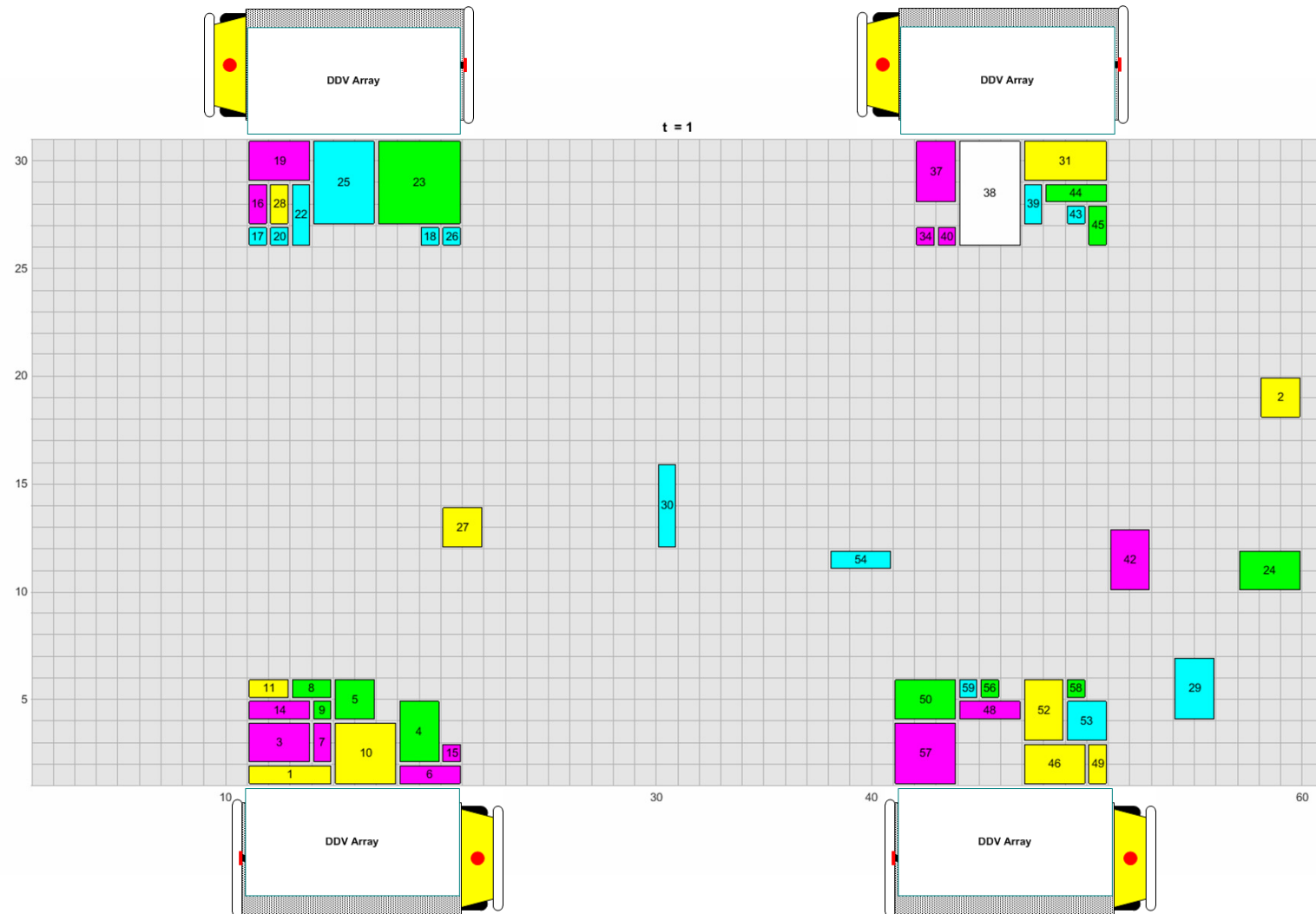


# A\* Path Planning Example 2

- 3-D  $(x,y,t)$  A\* used for planning path of each container in a DC
- Each container assigned unique priority that determines planning sequence
  - Paths of higher-priority containers become obstacles for subsequent containers



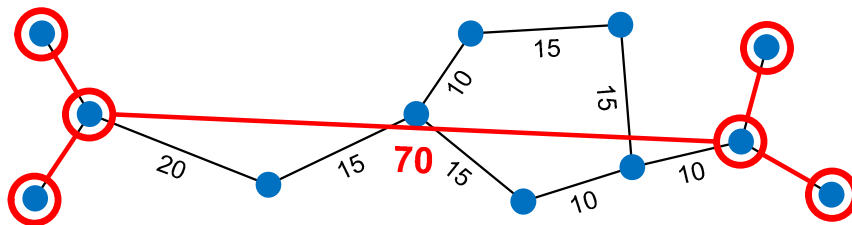
# A\* Path Planning Example 2



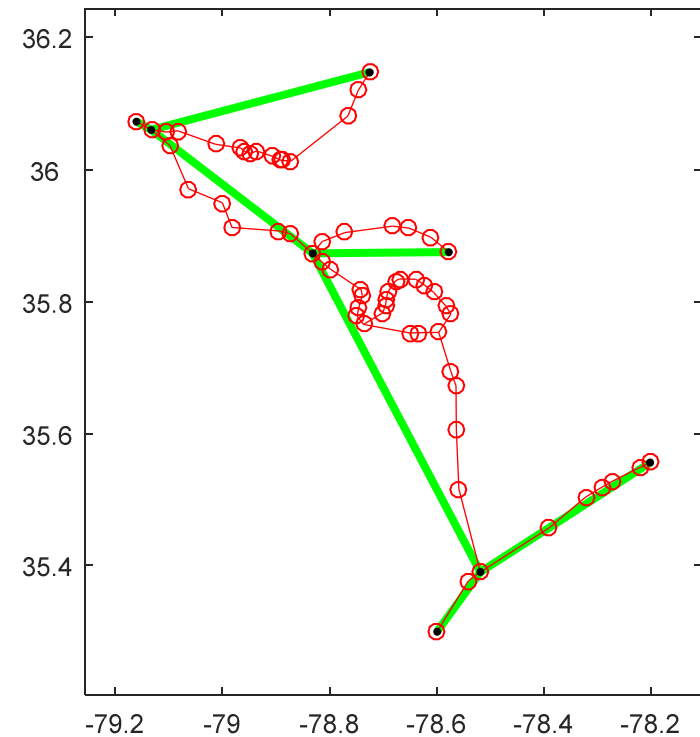
# Road Network Modifications

## 1. Thin

- Remove all degree-2 nodes from network
- Add cost of both arcs incident to each degree-2 node
- If results in multiple arcs between pair of nodes, keep minimum cost



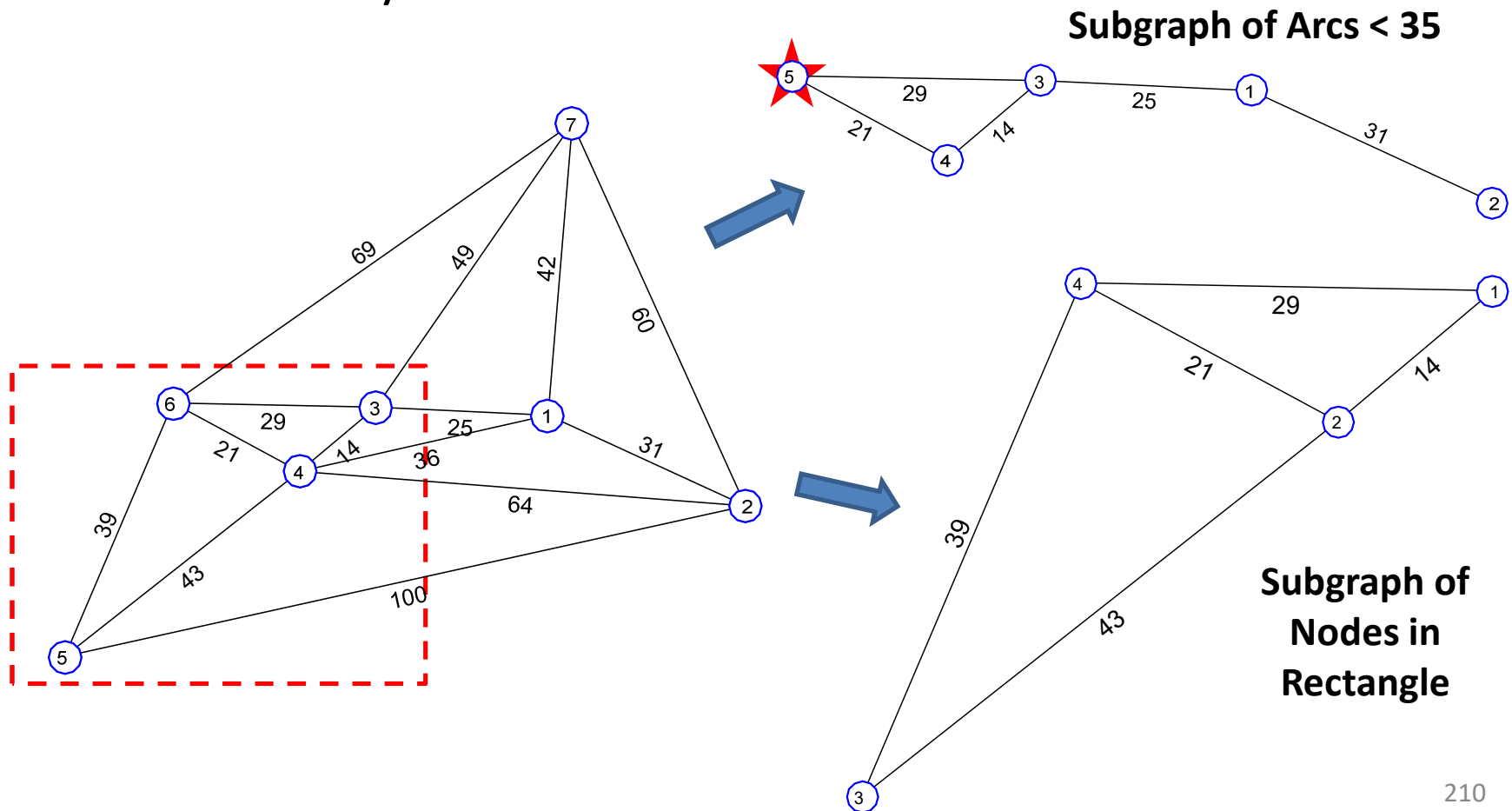
Thinned I-40 Around Raleigh



# Road Network Modifications

## 2. Prune and Reindex

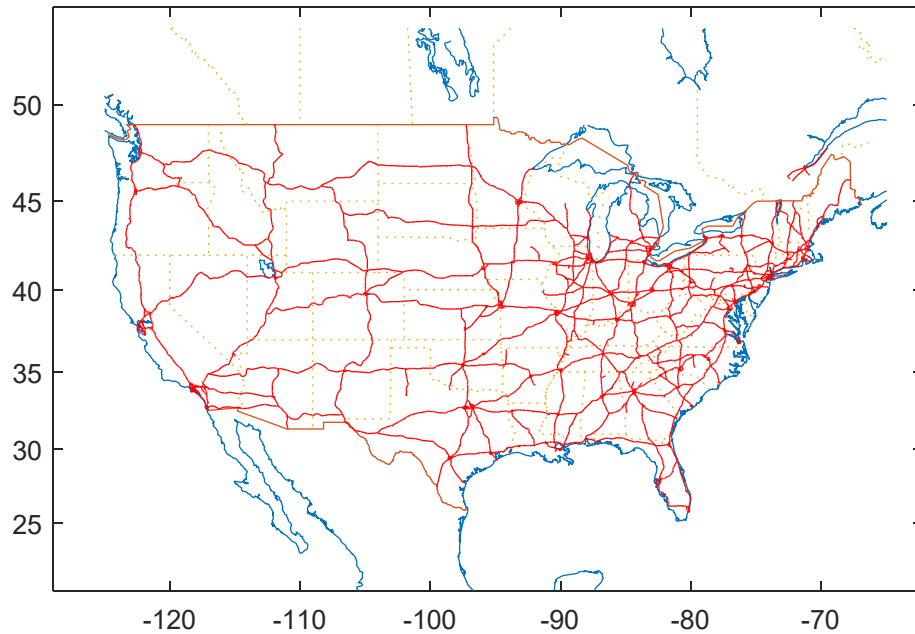
- Extract portion of graph with only those nodes and/or arcs that satisfy some condition



# Road Network Modifications

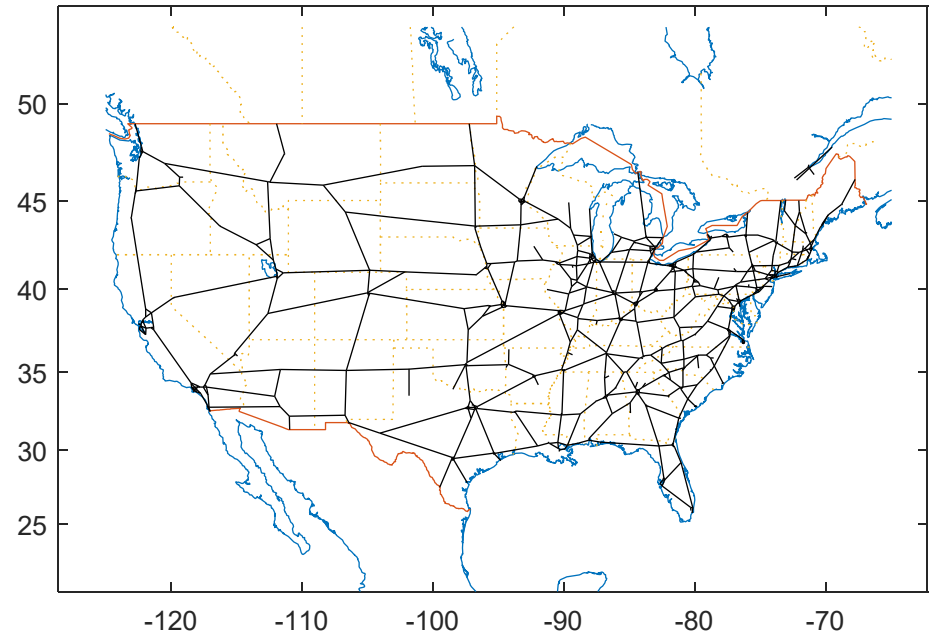
11,124 Arcs

**Interstate - Not Thinned**



1,223 Arcs

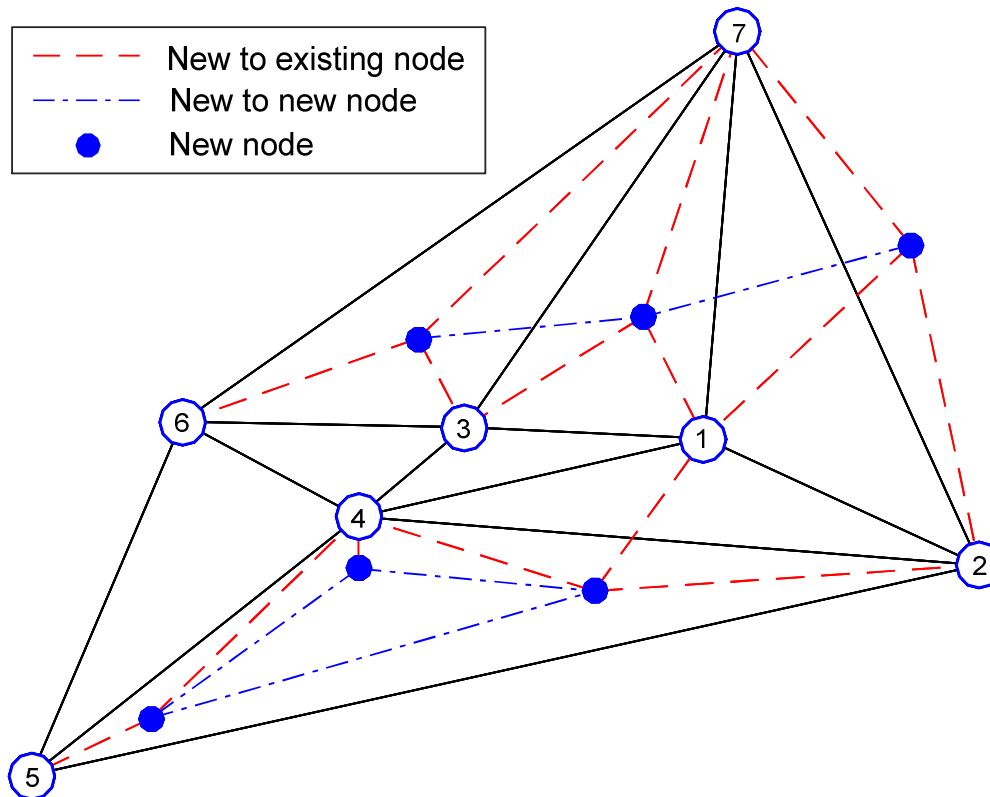
**Interstate - Thinned**



# Road Network Modifications

## 3. Add connector

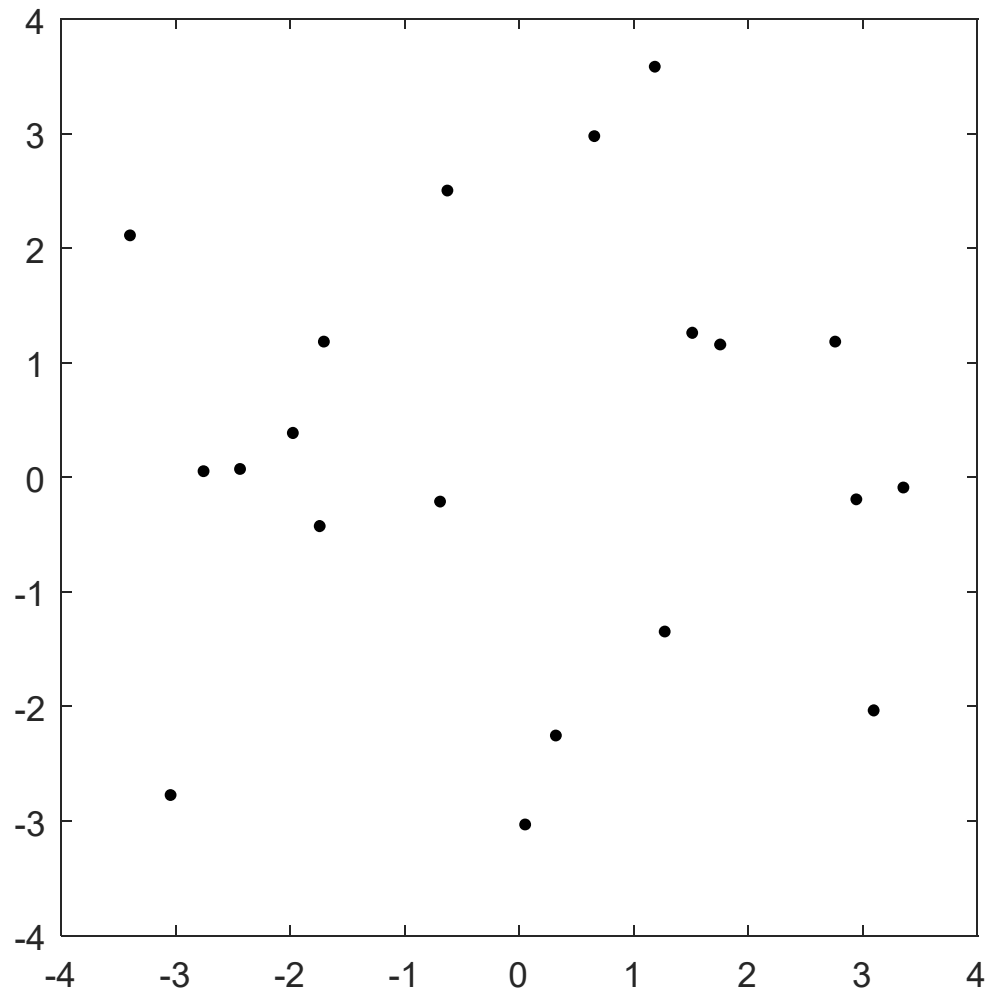
- Given new nodes, add arcs that connect the new nodes to the existing nodes in a graph and to each other



- Distance of connector arcs = GC distance x circuitry factor (1.3)
- New node connected to 3 closest existing nodes, except if
  - Ratio of closest to 2<sup>nd</sup> and 3<sup>rd</sup> closest < threshold (0.1)
  - Distance shorter using other connector and graph

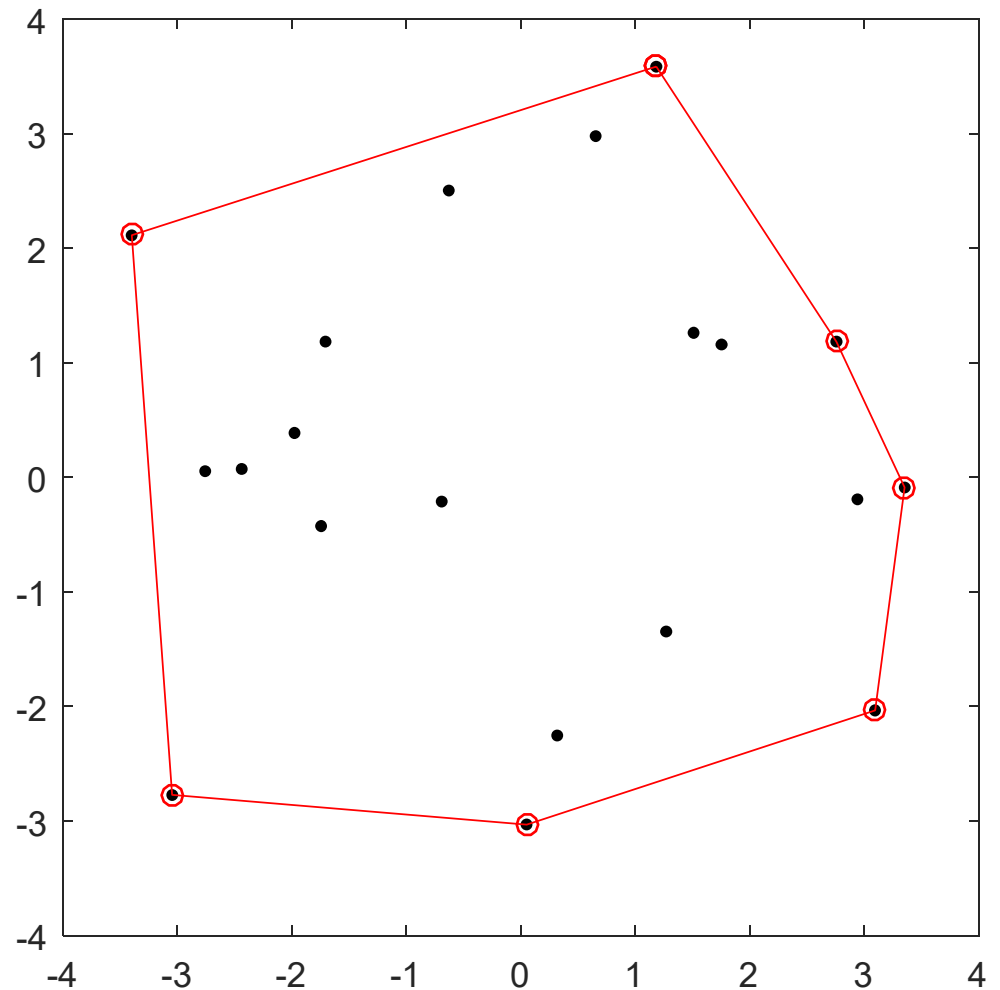
# Computational Geometry

- Design and analysis of algorithms for solving geometric problems
  - Modern study started with Michael Shamos in 1975
- Facility location:
  - geometric data structures used to “simplify” solution procedures



# Convex Hull

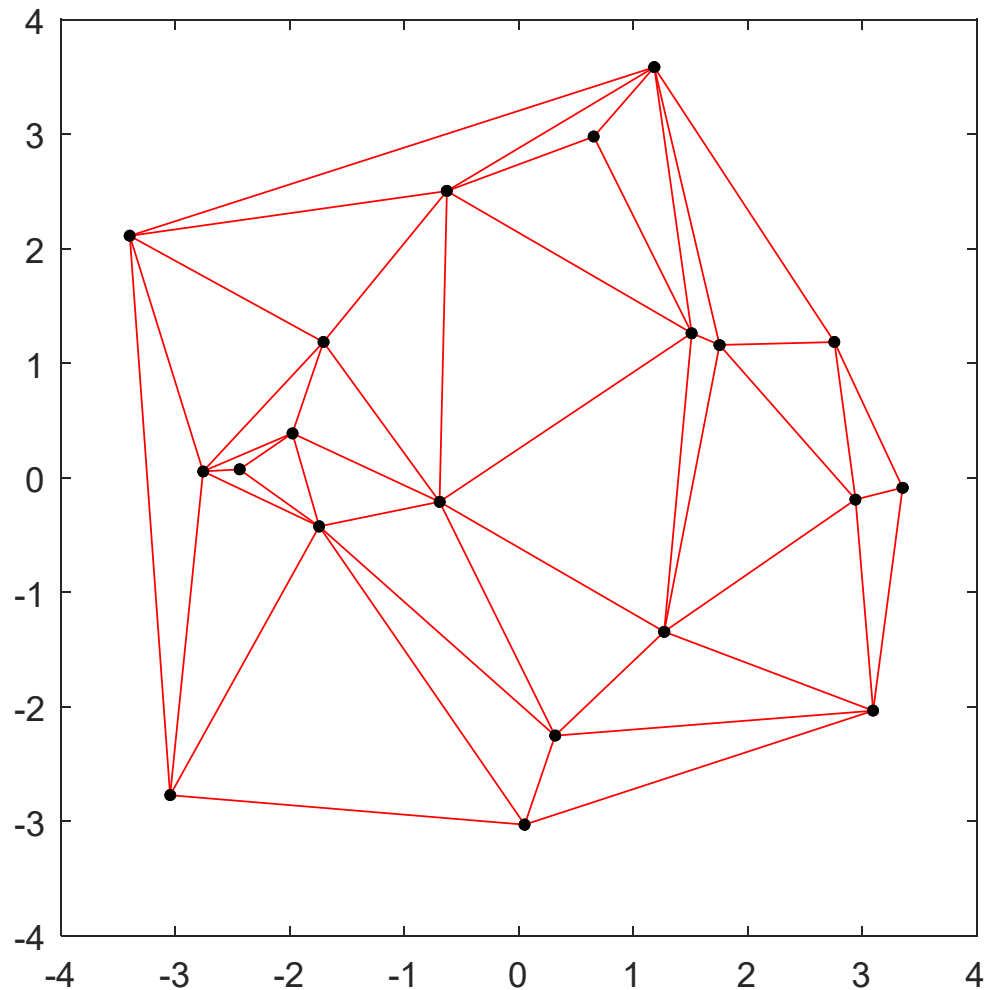
- Find the points that enclose all points
  - Most important data structure
  - Calculated, via Graham's scan in  $O(n \log n)$ ,  $n$  points





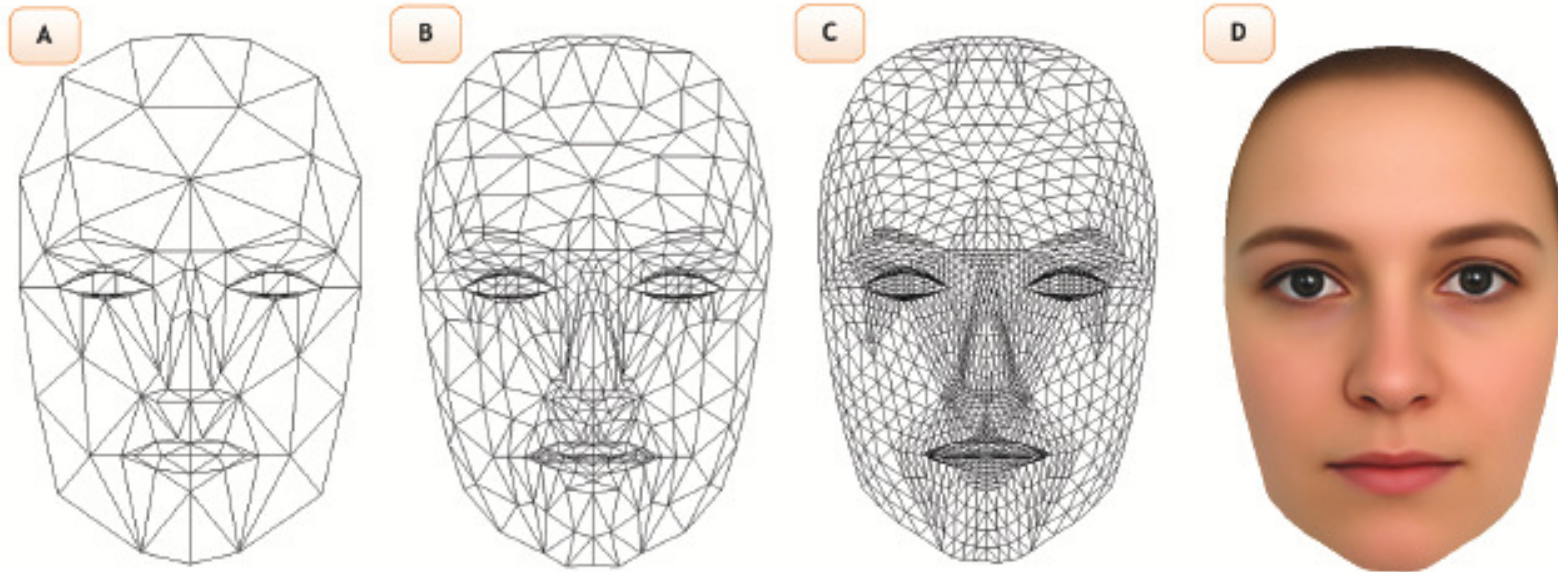
# Delaunay Triangulation

- Find the triangulation of points that maximizes the minimum angle of any triangle
  - Captures proximity relationships
  - Used in 3-D animation
  - Calculated, via divide and conquer, in  $O(n \log n)$ ,  $n$  points



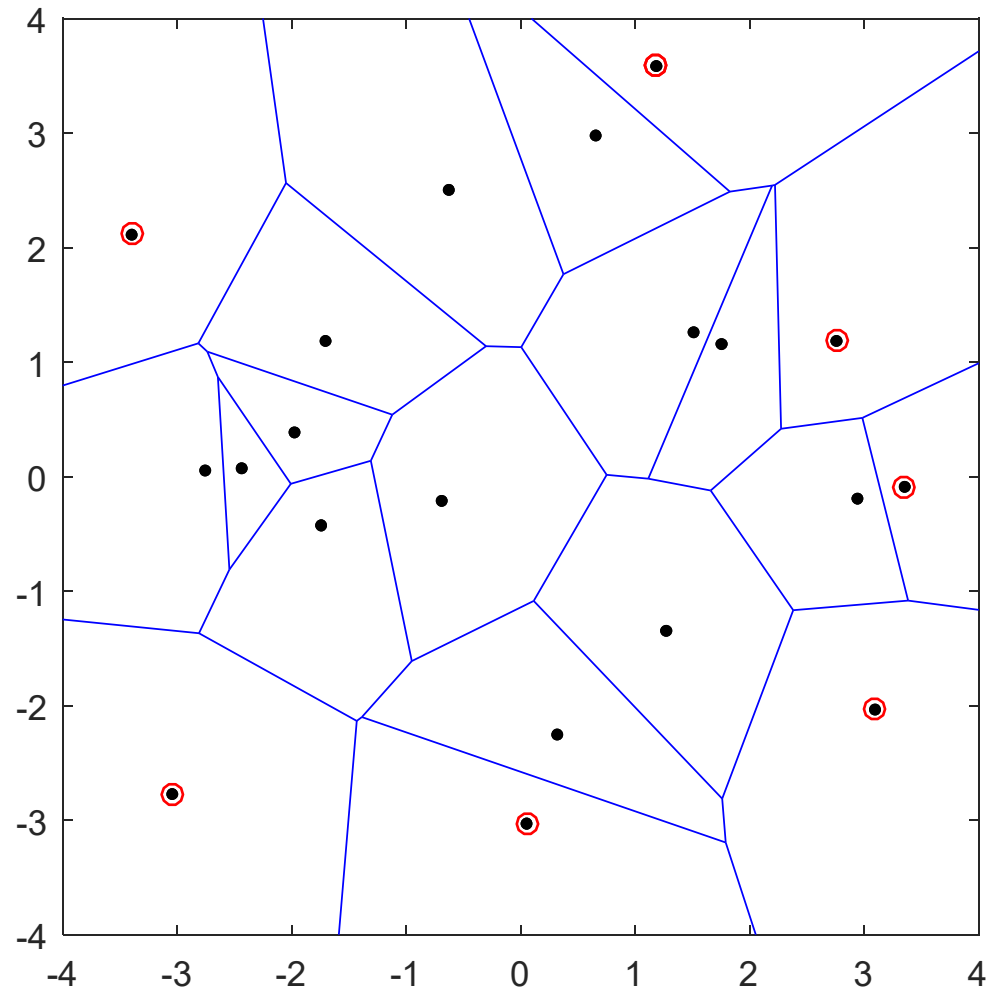
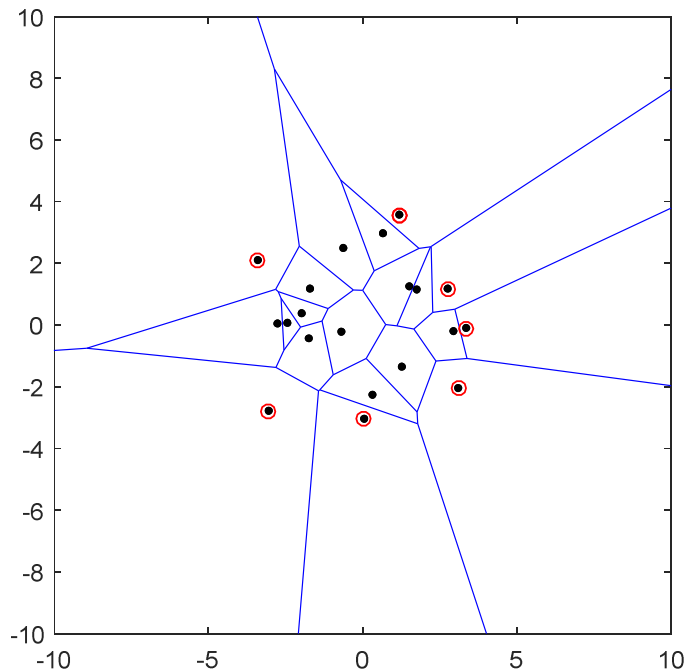
# 3-D Delaunay Triangulation

- Used in computer graphics to render synthetic images
  - Orientation of each triangle face used to determine reflection and shading relative to light sources and other objects



# Voronoi Diagram

- Each region defines area closest to a point
  - Open face regions indicate points in convex hull



# Delaunay-Voronoi

- Delaunay triangulation is straight-line dual of Voronoi diagram
  - Can easily convert from one to another

