

# THE MINIMAL SPANNING TREE (MST) AND ITS VARIANTS

- Consider a connected undirected graph  $G$  with costs  $c_{ij}$  associated with its links  $(x_i, x_j)$ . Of the many spanning trees of  $G$  that may be possible, we want to find the one for which the sum of the costs is minimum.
- This problem arises where the vertices are terminals of an electric network that have to be connected together and one wants to use as short a length of wire as possible.
- If the vertices represent towns to be joined with a pipeline network, the shortest length of pipe that can be used is also given by the minimal spanning tree of the corresponding graph.
- Numerous other applications.
- Algorithms by Kruskal and Prim.

# KRUSKAL'S ALGORITHM

- Step 1. Start with a completely disconnected graph  $T$  of  $n$  vertices.
- Step 2. Order the links of  $G$  in ascending order of cost.
- Step 3. Starting from the top of this list, add links into  $T$  provided that this addition does not create a cycle in  $T$ .
- Step 4. Repeat Step 3 until  $(n - 1)$  links have been added.  $T$  is then the MST of  $G$ .

- This is an example of a “greedy” algorithm. Most greedy algorithms are suboptimal, but this is the rare exception.

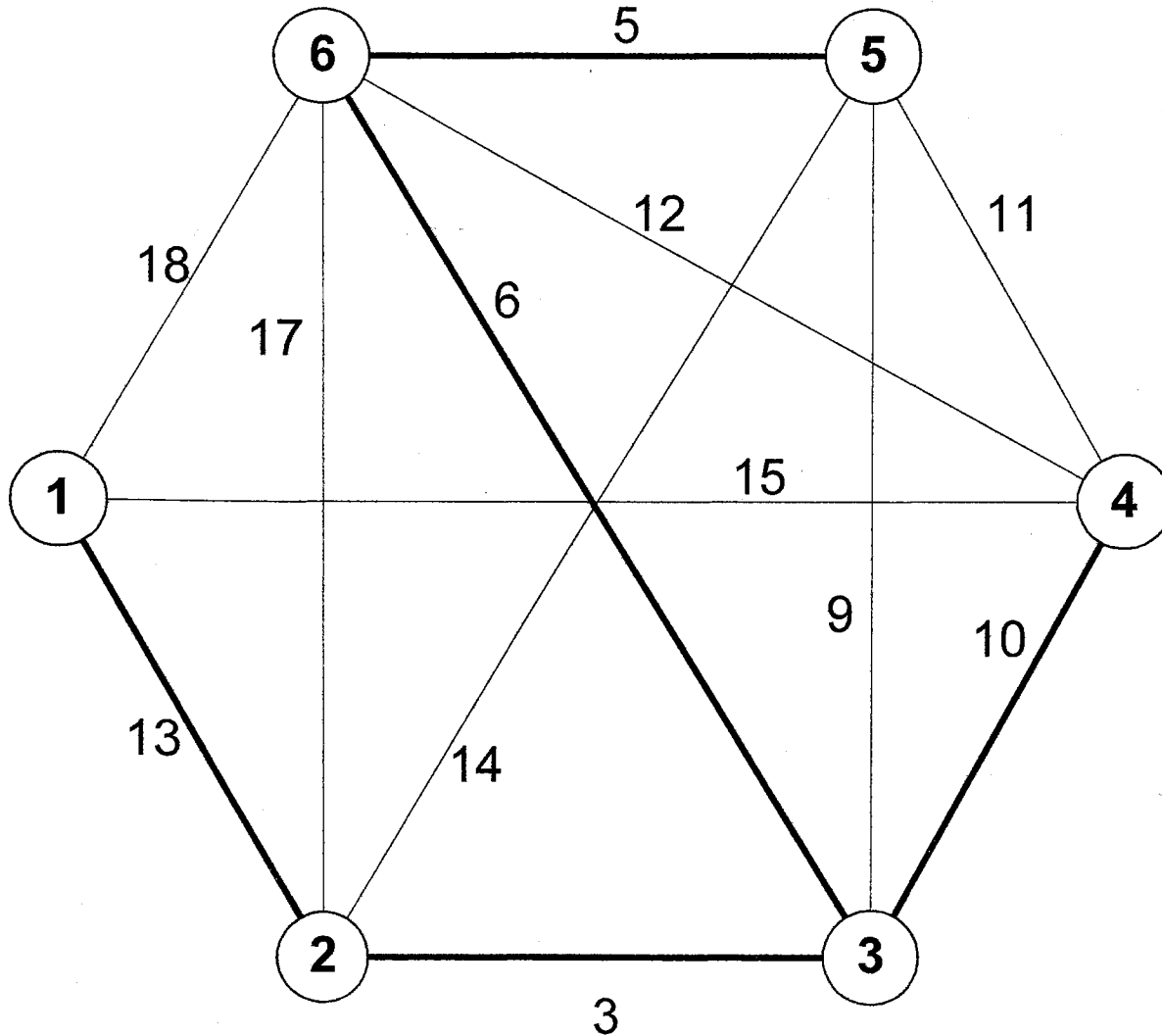
# WORST CASE COMPLEXITY

- The computationally most expensive step is Step 2. For a graph with  $m$  links, Step 2 would require  $m \log_2 m$  operations to produce a complete list of links in ascending order of cost.
- Note, one might not want or need the complete list since it is quite likely that the  $n - 1$  feasible links forming the MST may be found after examining only the top  $r < m$  of the links in the list. This suggests that the sorting procedure used at Step 2 should be a multipass routine in which at the end of the  $p^{\text{th}}$  pass the top  $p$  links are correctly placed.
- Since Step 2 represents most of the work, in the worst case, the number of operations required is on the order of  $n^2 \log_2 n$  since  $m = n(n - 1)/2$  for a complete graph.

# PRIM'S ALGORITHM

- Let  $T_0$  denote the tree which consists of the single vertex  $\{1\}$ .  
For  $j = 1, 2, \dots, n-1$ , let  $T_j$  be obtained by adjoining to  $T_{j-1}$  an edge  $a_j$  whose length is minimal in the class of all edges with one end in  $T_{j-1}$  and one end not in  $T_{j-1}$ . Then  $T_{n-1}$  is a tree of minimal length.
- If distances are first sorted into ascending order, the procedure requires  $O(n^2 \log_2 n)$  operations.
- Nijenhuis and Wilf present an improved algorithm which costs  $O(n^2)$  operations in the worst case.

# AN EXAMPLE



Kruskal's Algorithm:

- add arc from 2 to 3;
- add arc from 5 to 6;
- add arc from 3 to 6;
- add arc from 3 to 4;
- add arc from 1 to 2;

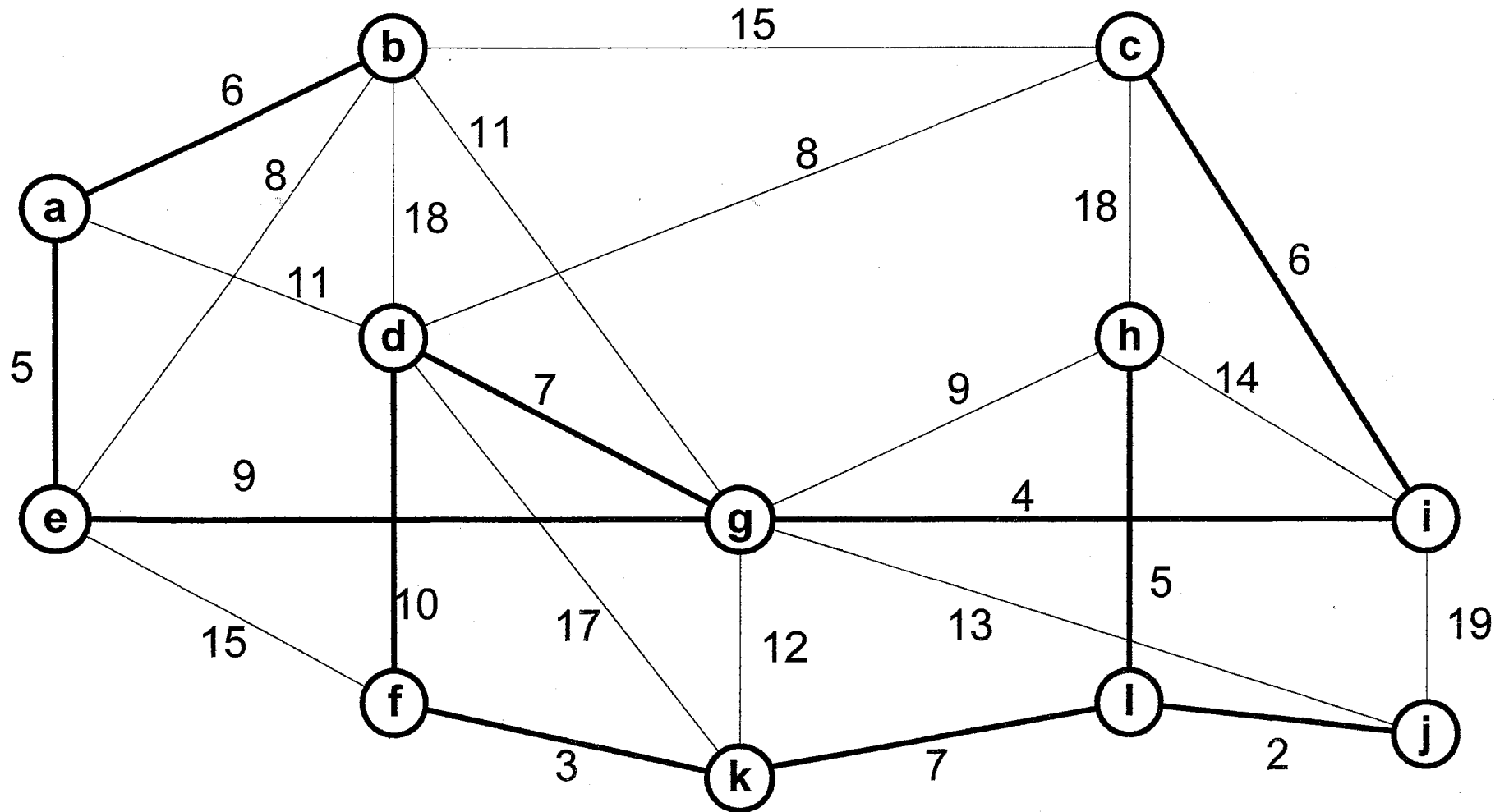
Prim's Algorithm

- add arc from 1 to 2;
- add arc from 2 to 3;
- add arc from 3 to 6;
- add arc from 6 to 5;
- add arc from 3 to 4;

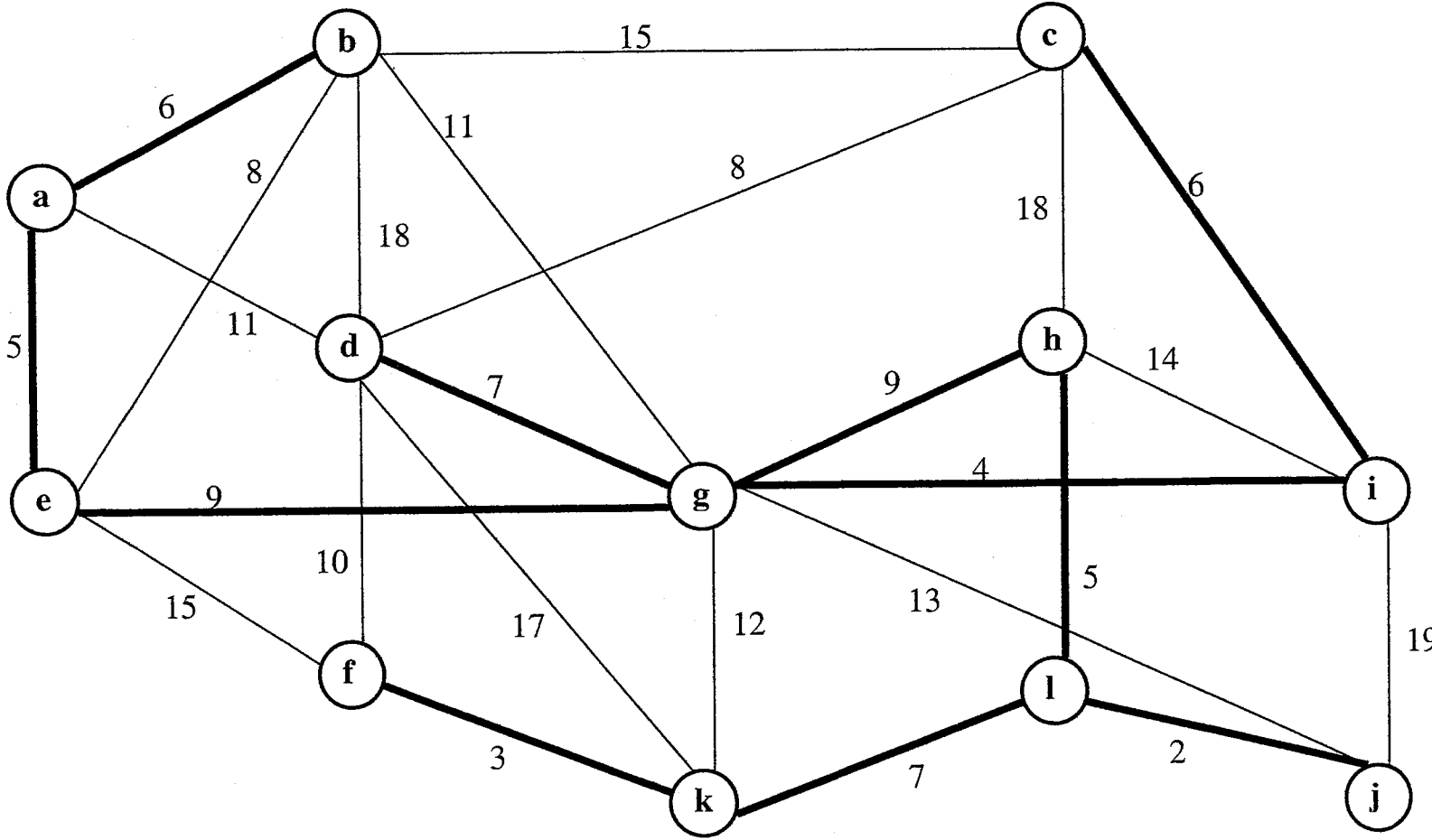
## A RELATED PROBLEM

- There is an interesting relation between the MST problem and another, which sounds on the surface to be very different.
- Think of a network as being a highway map, where the number recorded beside each link is the maximum elevation encountered in traversing the link.
- Suppose someone who plans to drive from  $i$  to  $j$  dislikes high altitudes and hence wants to find a path connecting  $i$  and  $j$  that minimizes the maximum altitude.
- It is a fact that, in the undirected case, the minimal spanning tree solves the problem, and for all pairs of cities. That is, the unique path in the minimal spanning tree joining a pair of cities minimizes the path height (maximum number on the path).

# AN EXAMPLE

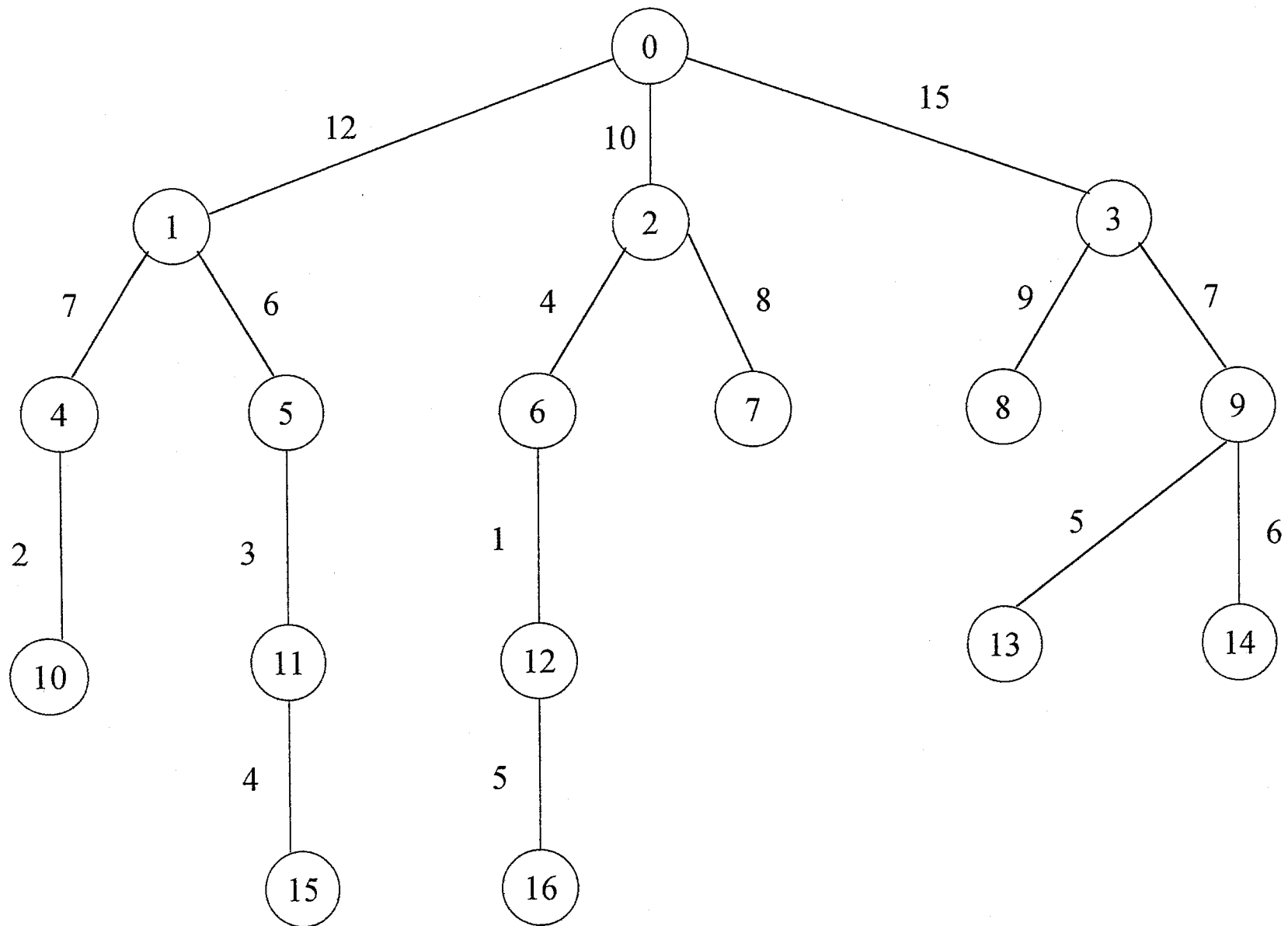


# AN EXAMPLE



# CAPACITATED MINIMAL SPANNING TREES

- The problem of finding a MST subject to the restriction that the number of nodes in any subtree rooted at a distinguished node not exceed a given maximum has received much attention.
- This is due to the fact that an algorithm capable of generating a MST subject to the above restriction can be used to design centralized telecommunications and data communications networks.
- A straightforward extension of this technique, where nodes are weighted by their total traffic, can be used to design such networks subject to a constraint on the total traffic on any multidrop line.
- The capacitated minimal spanning tree (CMST) problem cannot be solved optimally using a “greedy” algorithm, and no algorithm with a polynomial upper bound is currently known that solves this problem optimally.



# CMST HEURISTICS

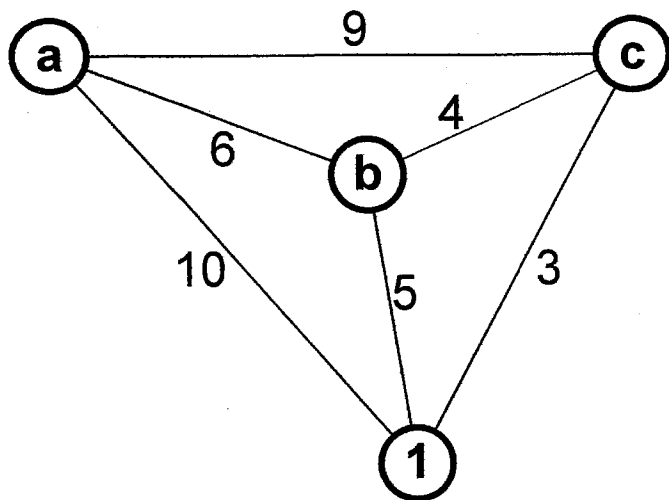
- We must apply heuristic procedures here. Running times are on the order of seconds for problems with several hundred nodes and the quality of solution is within about 5% of the optimum.
- By making two modifications to the Kruskal procedure, one can adapt the technique to find constrained minimal spanning trees.
- First, when an arc is considered for admission to the spanning tree, the constraints (capacity restrictions) are checked and if any is violated the arc is rejected.

# CMST HEURISTICS — CONTINUED

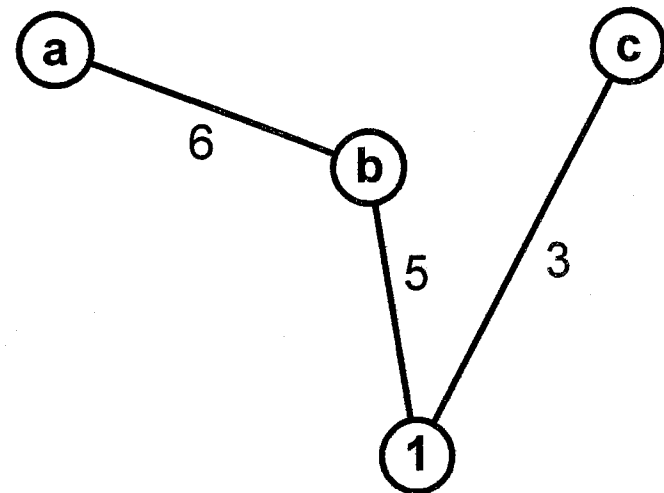
- Second, instead of considering  $c_{ij}$ , the length of arc  $(i, j)$ , in ordering the arcs, one considers  $t_{ij} = c_{ij} - w_i - w_j$  (there are, of course, other possibilities).
- The first modification ensures that the generated spanning tree satisfies the constraints.
- The second modification causes the algorithm to generate spanning trees of high quality (low cost) if the node weights are chosen properly.

# CMST HEURISTICS — CONTINUED

- How would you assign the node weights?
- Consider the CMST problem below as a test case. Suppose that no more than two nodes are allowed on any path to the center (node 1).
- How does your algorithm do?
- One possibility: Let  $w_i = c_{1i}$ .



CMST Problem

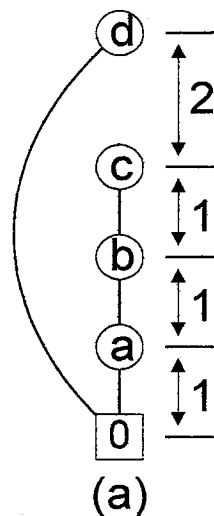


Best you can do.

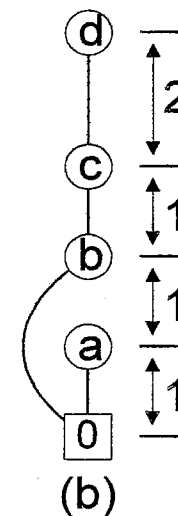
# CMST HEURISTICS — CONTINUED

- Let's study the performance of 3 CMST heuristics.
  - ◆ Modified Kruskal's — ensure no subtree contains  $> k$  nodes.
  - ◆ Esau-Williams — modified Kruskal's plus tradeoff function.
  - ◆ Sharma — exploits the radial nature of the geometry.
- We consider three examples, each with a subtree capacity of 3.

Example 1.



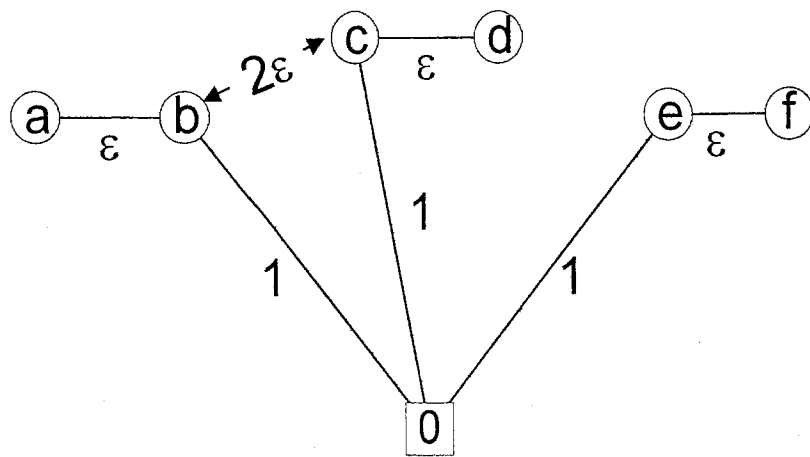
Modified Kruskal  
Cost = 8



Esau-Williams (optimal)  
Cost = 6

# CMST HEURISTICS — CONTINUED

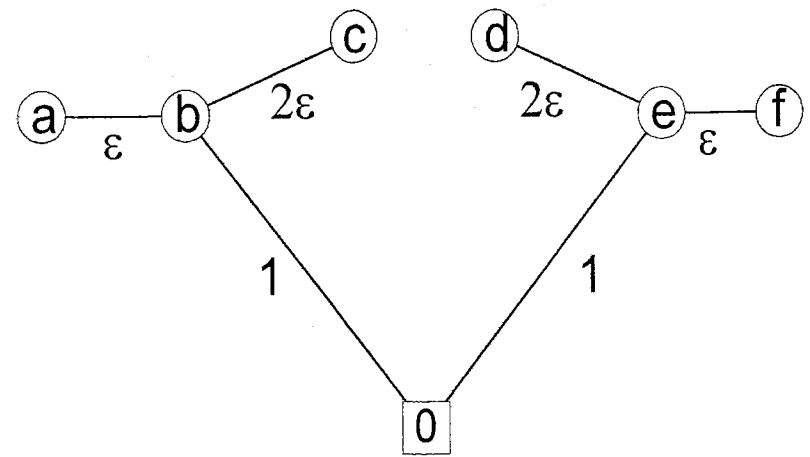
Example 2.



(a)

Esau-Williams

$$\text{Cost} = 3 + \epsilon$$



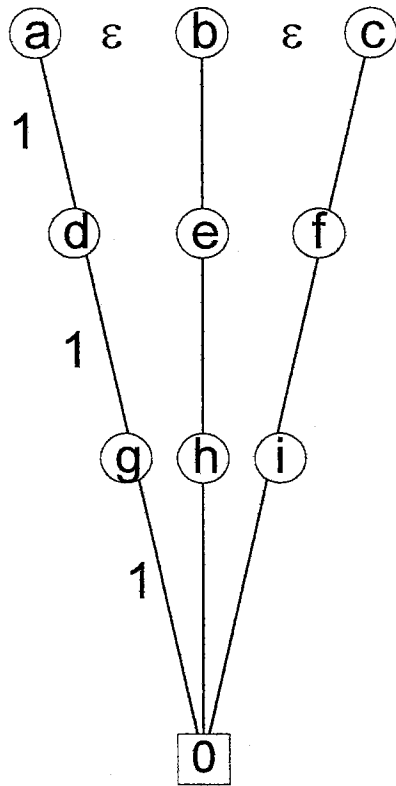
(b)

Sharma (optimal)

$$\text{Cost} = 2 + \epsilon$$

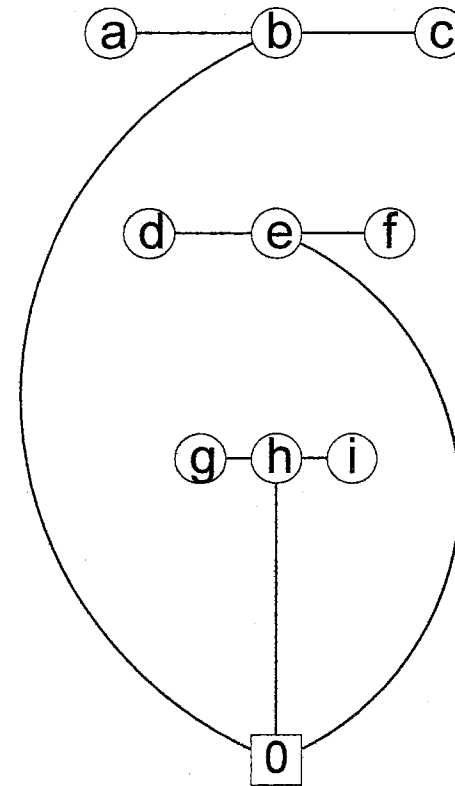
# CMST HEURISTICS — CONTINUED

Example 3.



(a)

Sharma  
Cost = 9

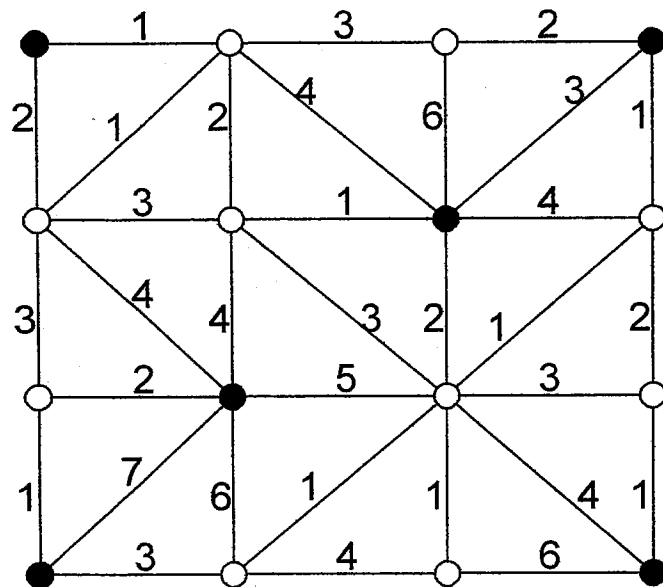


(b)

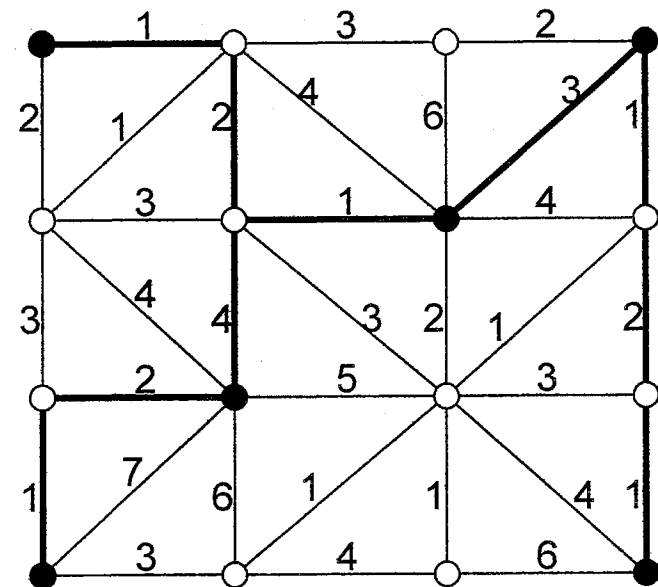
Esau-Williams  
Cost =  $6 + \epsilon$

# THE STEINER PROBLEM IN NETWORKS

- A problem closely related to the MST, but much more difficult, is known as the Steiner Problem in Networks.
- In this problem, the shortest tree  $T$  is required which spans a specified subset  $p \subset N$  of the vertices of  $G$ . Some of the other vertices may be spanned in order to minimize the length of  $T$ .



Original network

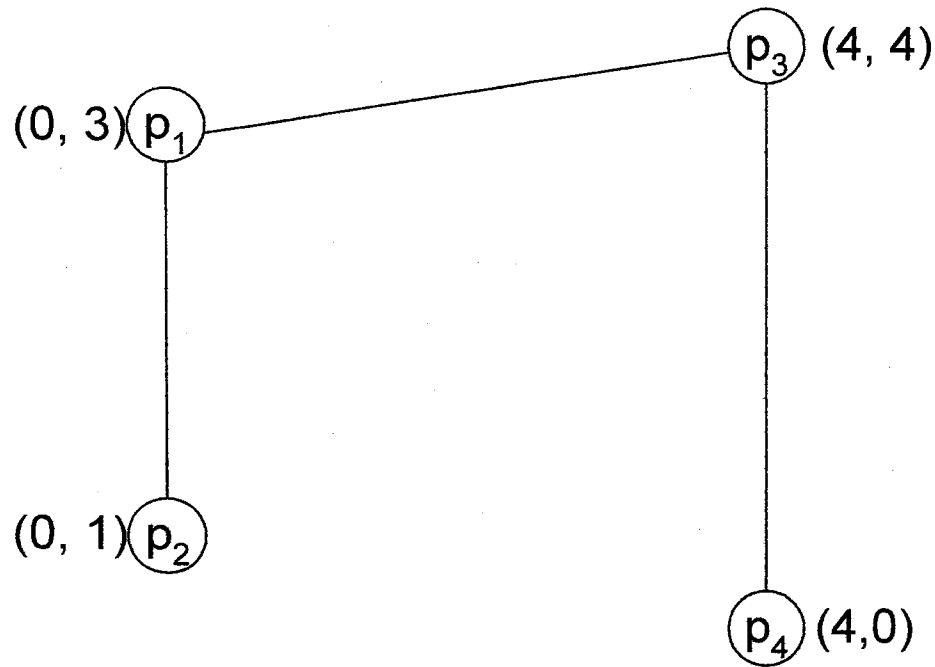


Possible solution

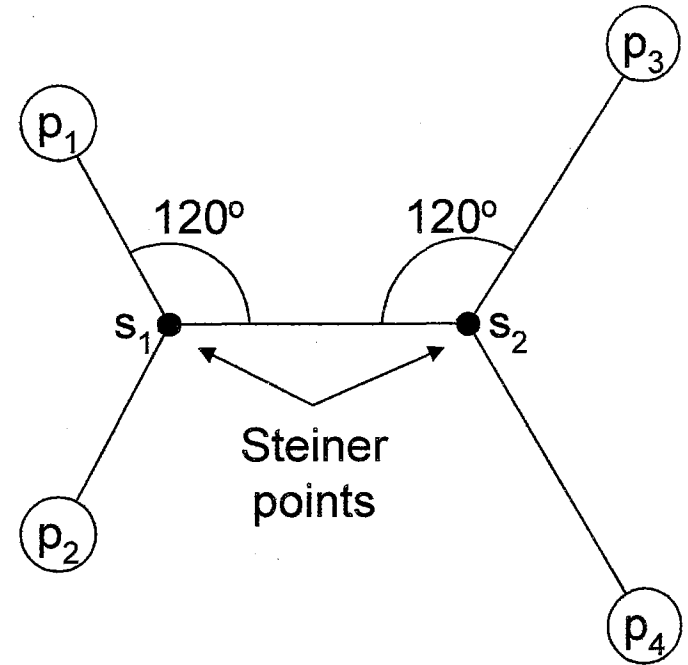
# THE EUCLIDEAN STEINER PROBLEM

- The Euclidean Steiner Problem is a difficult geometric problem where a set  $p$  of points on a Euclidean plane are to be connected by lines so that the total length of lines drawn is a minimum.
- When points other than the set  $p$  of points can be introduced on the plane (Steiner points), then the total length may be less than the length of the MST.
- As many Steiner points as necessary could be added anywhere in the plane, in order to produce the shortest tree spanning the specified set  $p$  of points.
- The resulting shortest tree is then called a shortest Steiner tree.

# THE EUCLIDEAN STEINER PROBLEM – CONTINUED



(a) Minimal spanning tree  
Length = 10.123

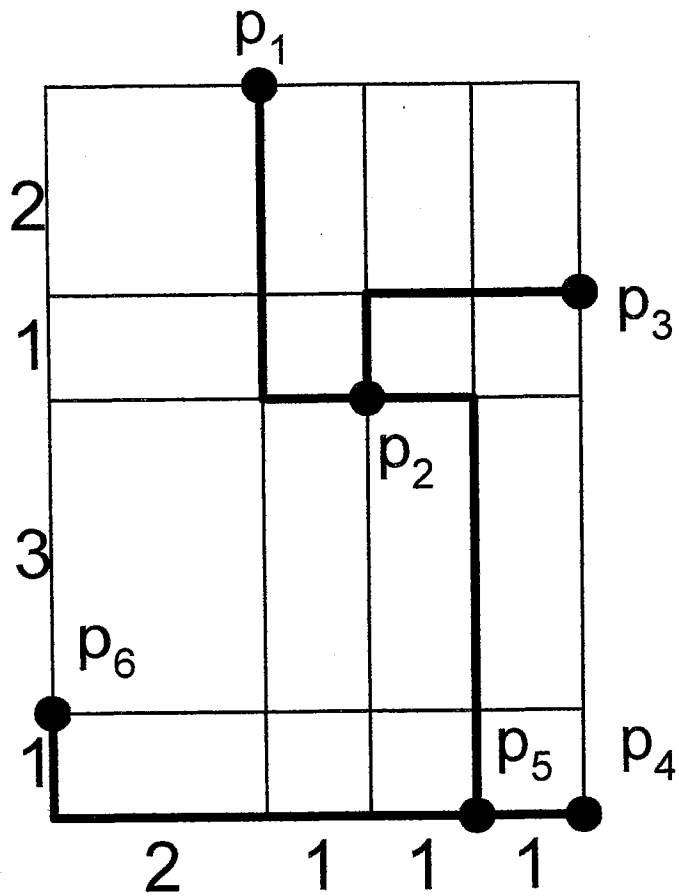


(b) Shortest Steiner tree  
Length = 9.196

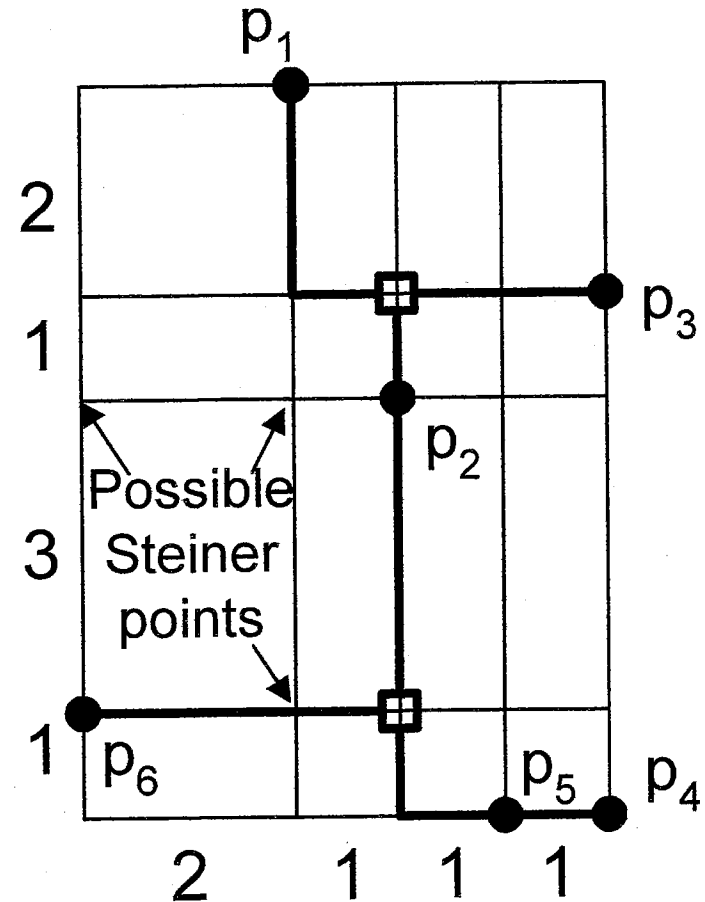
# THE RECTILINEAR (TAXICAB) STEINER PROBLEM

- This problem is very similar to the Steiner Problem in Networks. The distance between two points, however, is given by the taxicab distance.
- From the complete graph, a MST can be computed easily.
- If the intersections of N-S and E-W grid lines are considered as possible Steiner point locations, then Steiner trees can be constructed.
- The Shortest Steiner tree is, again, hard to find.

# THE RECTILINEAR (TAXICAB) STEINER PROBLEM – CONTINUED



(a) Minimal spanning tree  
Length = 18



(b) Shortest Steiner tree  
Length = 15

= Steiner points 5-19

