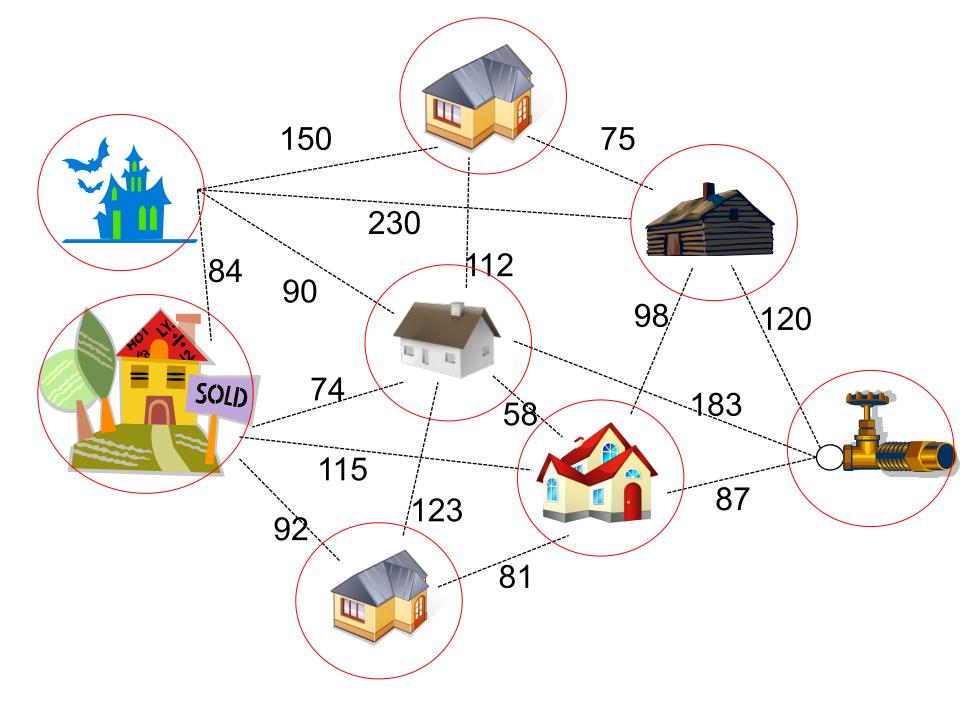
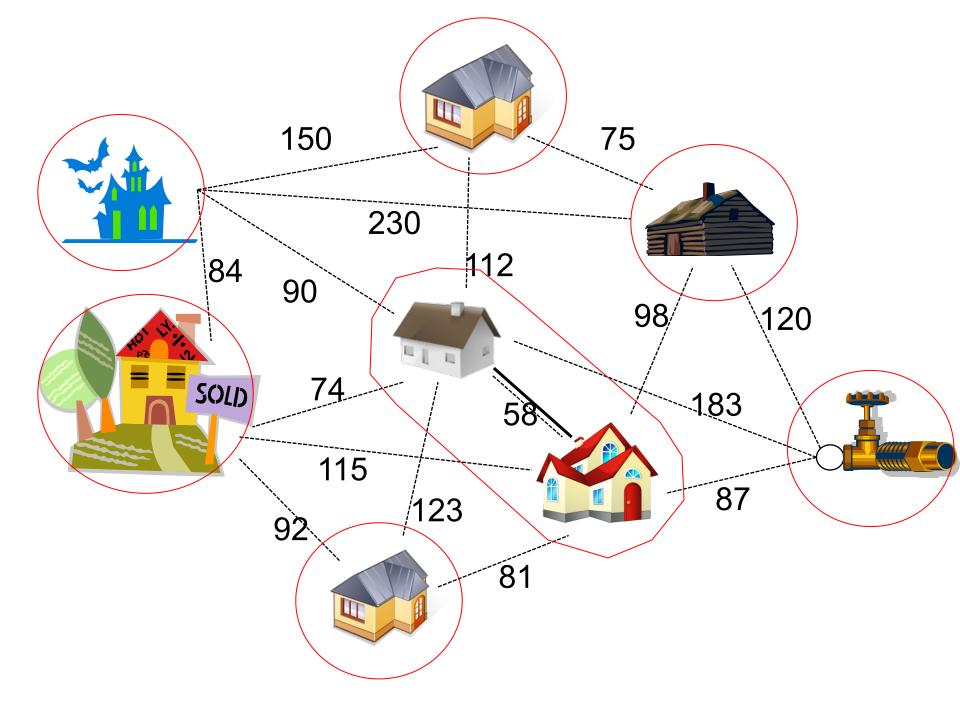
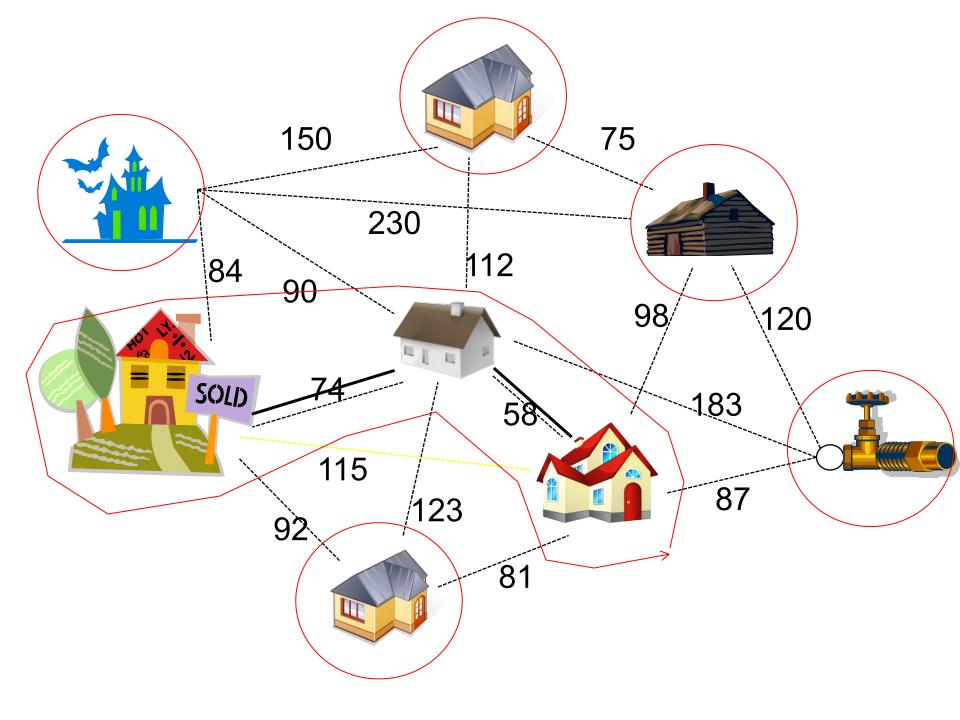


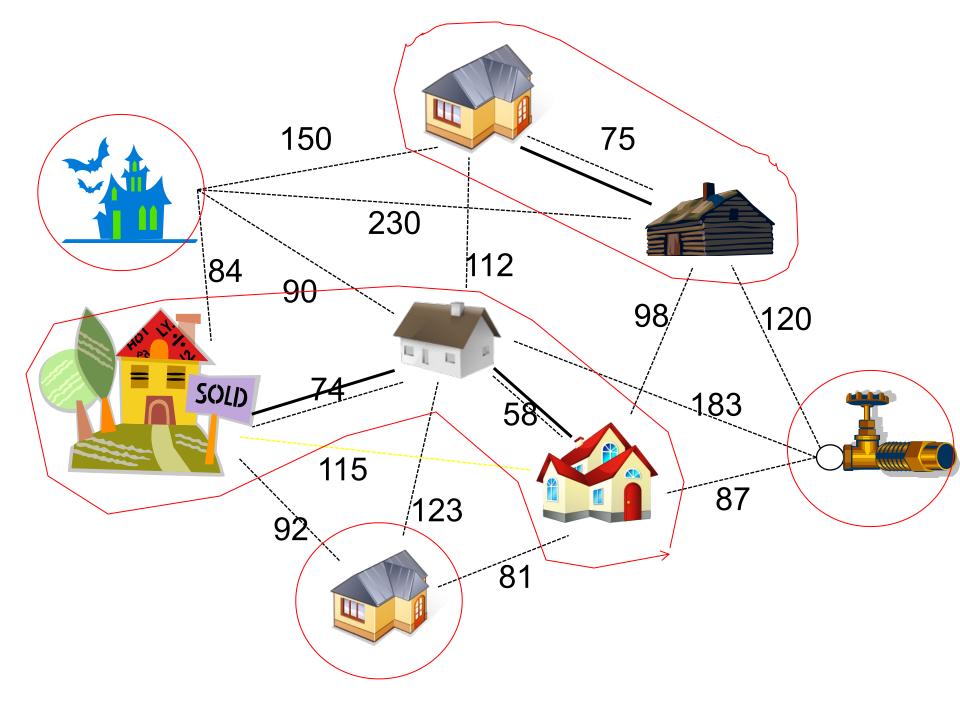
Prim's algorithm worked by gradually building a single tree one edge at a time until all vertices in the graph are in the tree.

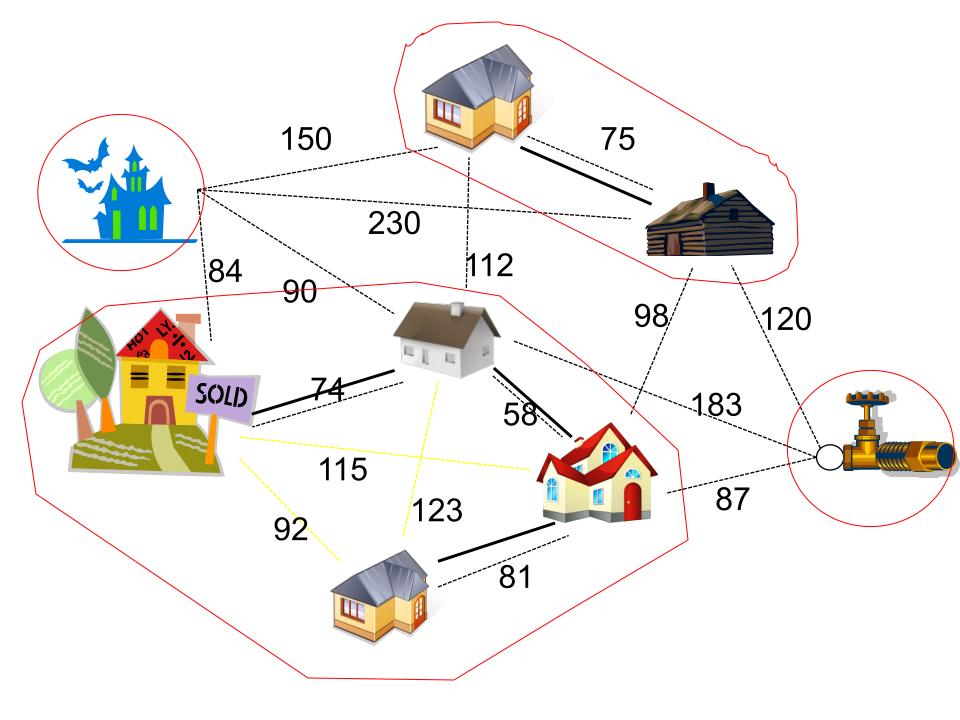
There is another approach, Kruskal's algorithm, which works by joining trees together until all vertices from the graph are in a single tree.

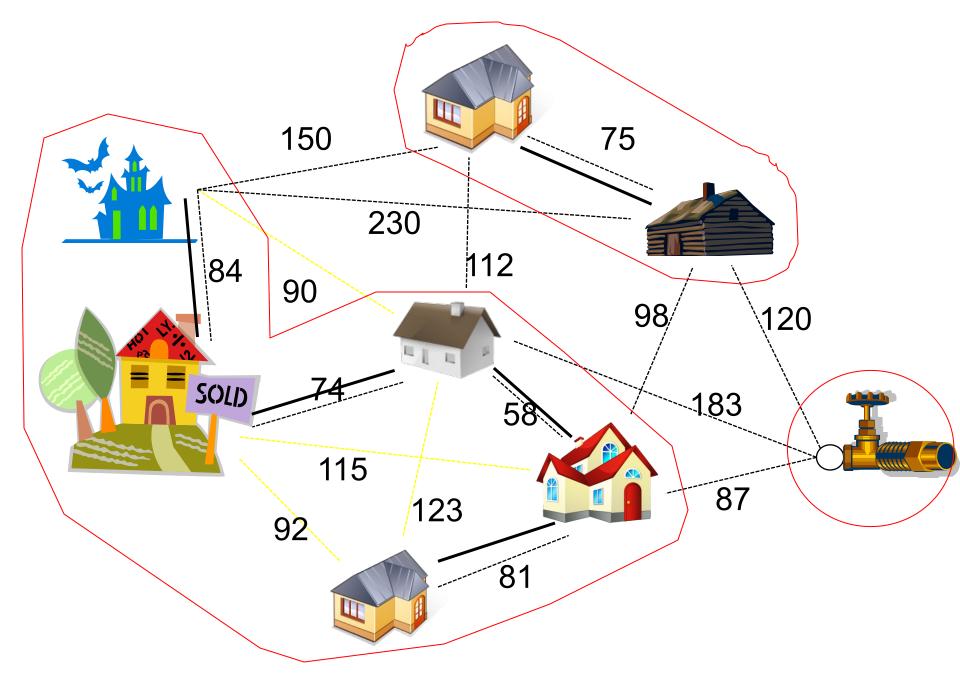


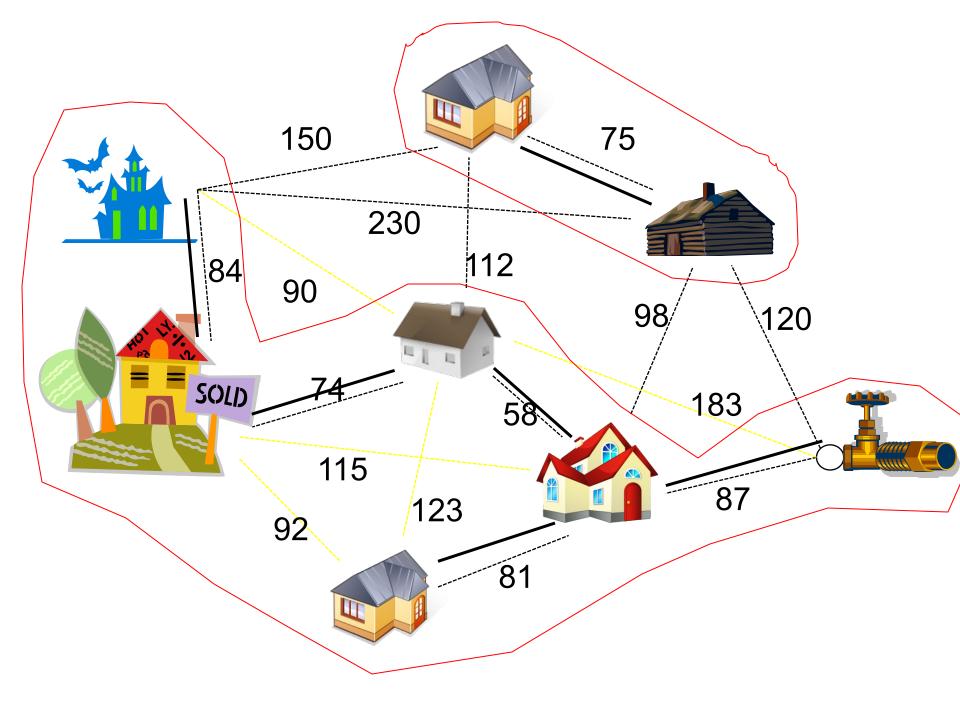


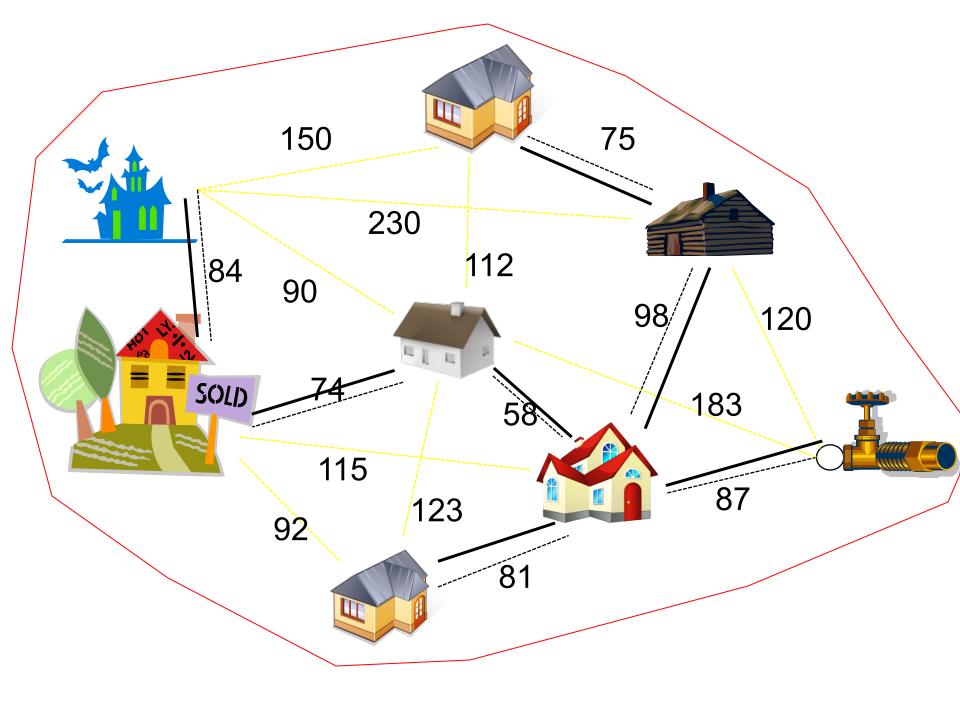








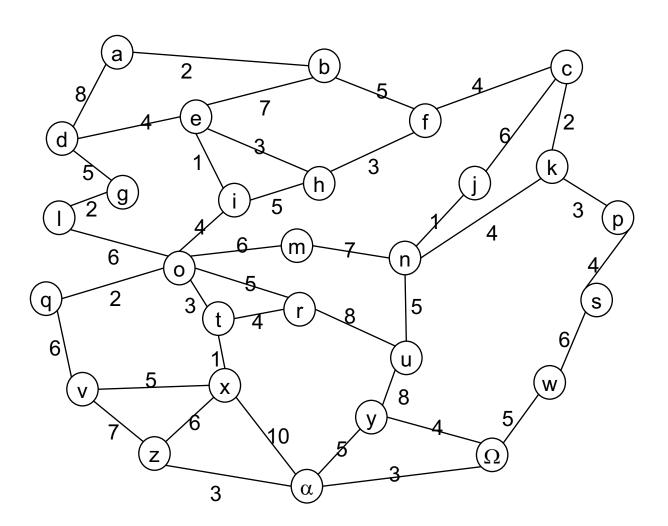


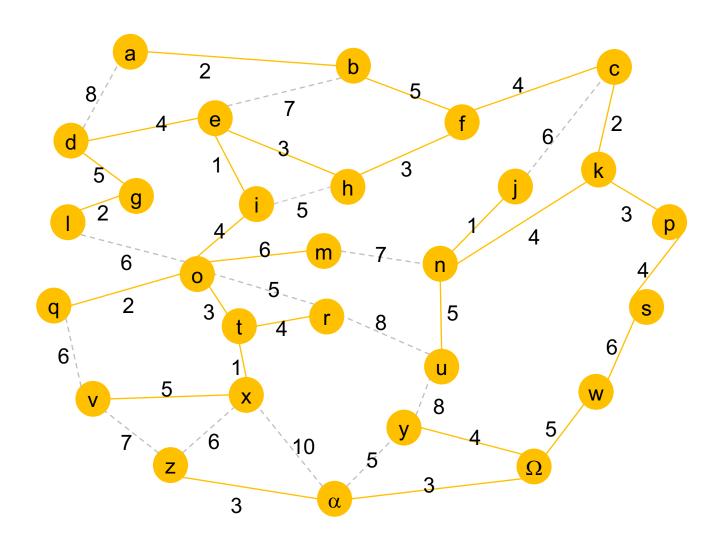


```
kruskal(): #pseudocode version 1
create an empty mst //a list of edges
for each vertex in the graph
create a separate tree
for each edge in the graph in increasing order of cost
if edge joins two separate trees
add edge to the mst
merge the two trees into one tree
return mst
```

## Sketch of proof of correctness

- if the graph is connected, 'mst' contains every vertex, so spans the graph
- 'mst' is a tree (never adds an edge that creates a cycle)
- proof that it has minimum cost is similar to that for Prim's algorithm





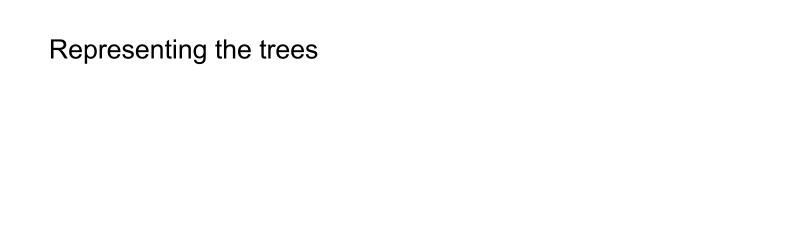
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for each vertex in the graph
create a separate tree
for each edge in the graph in increasing order of cost
if edge joins two separate trees
add edge to the mst
merge the two trees into one tree
return mst
```

How do we implement this efficiently?

```
kruskal(): #pseudocode version 2
create an empty list mst // to contain edges in final MST
create an empty dictionary // for each vertex, state its current tree
create a PriorityQueue pq //to order graph edges by cost
for each edge e in G
  add (w(e), e) into pq
for each vertex v in G
  create a(tree t) for v and add (v:t) to dictionary
while length(mst) < |V|-1 and pq is not empty
  remove e, the minimum cost edge from pq
  get the trees t_1, t_2 for e's vertices from dictionary
  if t_1 and t_2 are different
     add e into mst
     join t_1 and t_2 into a single tree t and update dictionary
```

return *mst* 

How do we implement this efficiently?



Implement each tree as a stack (or any sequence with O(1) updates).

To join two trees, find the smaller one, then until that stack is empty: pop a vertex update its dictionary entry to point to the bigger tree push onto the bigger tree.

```
def _jointrees(self, xtree, ytree, whichtree):
def kruskal(self):
  mst = []
                                          if xtree.length() < ytree.length():
  n = self.num vertices()
                                            target = ytree
  whichtree = {}
                                            deltree = xtree
                                         else:
  for v in self.vertices():
                                            target = xtree
     vtree = Stack()
                                            deltree = ytree
     vtree.push(v)
                                         while deltree.length() > 0:
                                            v = deltree.pop()
     whichtree[v] = vtree
  pq = PQHeap()
                                            whichtree[v] = target
                                            target.push(v)
  for e in self.edges():
                                         del deltree
     pq.add(e.element(), e)
  while len(mst) < n and pq.length() > 0:
     key, e = pq.remove min()
     (x,y) = e.vertices()
     xtree = whichtree[x]
     ytree = whichtree[y]
     if xtree != ytree:
       mst.append(e)
       self. jointrees(xtree, ytree, whichtree)
  return mst
```

## Complexity:

creating the dictionary: O(n)
creating the PQ: O(m log m) - the number of edges
at most m times round the loop
for each time around the loop, O(log m) to remove the min-cost edge,
O(1) to get the trees for the two vertices and test if they are different, and
then the cost of merging the trees.

So O(m log m) overall to handle the PQ, ignoring the tree merge cost.

Each time two trees get merged, the vertices in the smaller tree move. Each individual vertex move is O(1) - pop(), dictionary update, push(). Since we only move vertices from the smaller tree, each vertex that is moved moves to a tree that becomes at least double the size. There are n vertices, so each vertex can change trees at most  $O(\log n)$  times (since 1\*2\*2\*...\*2 for  $\log n$  times is n). So amortised cost of tree merging is  $O(n \log n)$ .

```
So in total O(n log n + m log m)
But m is O(n^2), so O(log m) = O(log n^2) = O(2 log n) = O(log n)
So algorithm is O((n+m)\log n)
```

doesn't matter if it is sparse or dense ...

## **Next lecture**

Further graph algorithms