

Minimum Spanning Trees

CSE 373
Data Structures & Algorithms
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Spring 2013

Today's Outline

- **Announcements:**
 - › HW 5 due Friday, May 31.
- **Today's Topics:**
 - › Weiss 9.5, 9.6

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Minimum Spanning Trees

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Recall Spanning Tree

- Given (connected) graph $G(V,E)$, a **spanning tree** $T(V',E')$:
 - › Spans the graph ($V' = V$)
 - › Forms a **tree** (no cycle);
 - › E' has $|V| - 1$ edges

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Minimum Spanning Tree

- Edges are weighted: find minimum cost spanning tree
- Applications
 - › Find cheapest way to wire your house
 - › Find minimum cost to send a message on the Internet

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Strategy for Minimum Spanning Tree

- For any spanning tree T , inserting an edge e_{new} not in T creates a cycle
- **But**
 - › Removing any edge e_{old} from the cycle gives back a spanning tree
 - › If e_{new} has a lower cost than e_{old} we have progressed!

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Strategy

- Strategy for construction:
 - › Add an edge of minimum cost that does not create a cycle (greedy algorithm)
 - › Repeat $|V| - 1$ times
 - › Correct since if we could replace an edge with one of lower cost, the algorithm would have picked it up

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Two Algorithms

- Prim: (build tree incrementally)
 - › Pick lower cost edge connected to known (incomplete) spanning tree that does not create a cycle and expand to include it in the tree
- Kruskal: (build forest that will finish as a tree)
 - › Pick lower cost edge not yet in a tree that does not create a cycle and expand to include it somewhere in the forest

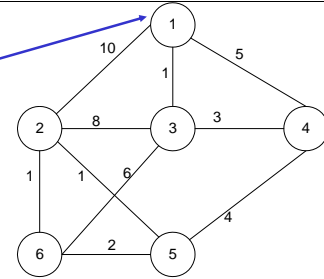
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Prim's algorithm

Starting from empty T, choose a vertex at random and initialize $V = \{1\}, E' = \{\}$



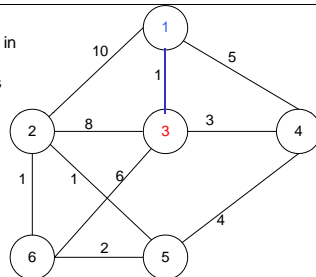
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Prim's algorithm

Choose the vertex u not in V such that edge weight from u to a vertex in V is minimal (greedy!)
 $V = \{1,3\}$ $E' = \{(1,3)\}$



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Prim's algorithm

Repeat until all vertices have been chosen

Choose the vertex u not in V such that edge weight from v to a vertex in V is minimal (greedy!)

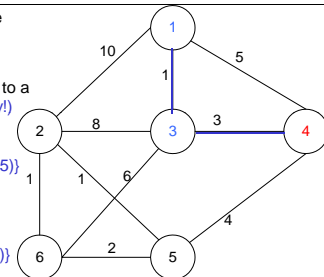
$V = \{1,3,4\}$ $E' = \{(1,3), (3,4)\}$

$V = \{1,3,4,5\}$ $E' = \{(1,3), (3,4), (4,5)\}$

....

$V = \{1,3,4,5,2,6\}$

$E' = \{(1,3), (3,4), (4,5), (5,2), (2,6)\}$



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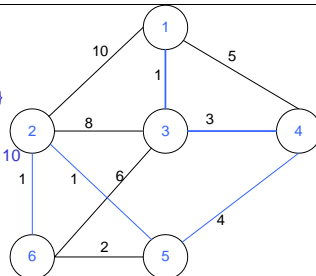
Prim's algorithm

Repeat until all vertices have been chosen

$V = \{1,3,4,5,2,6\}$

$E' = \{(1,3), (3,4), (4,5), (5,2), (2,6)\}$

Final Cost: $1 + 3 + 4 + 1 + 1 = 10$



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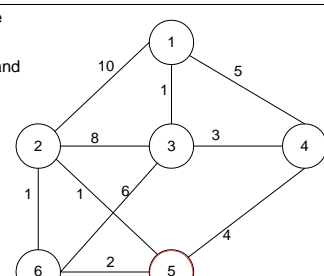
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Prim's algorithm

Repeat until all vertices have been chosen.

1. Choose an initial vertex and put in tree.



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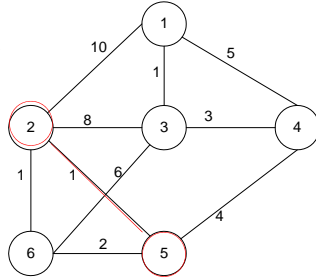
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Prim's algorithm

Repeat until all vertices have been chosen.

- Choose a vertex not in tree with minimal cost edge to add.



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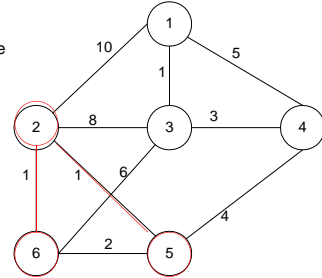
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Prim's algorithm

Repeat until all vertices have been chosen.

- Choose a vertex not in tree with minimal cost edge to add.



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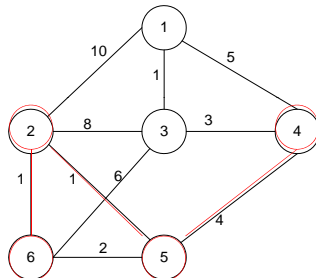
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Prim's algorithm

Repeat until all vertices have been chosen.

- Choose a vertex not in tree with minimal cost edge to add.



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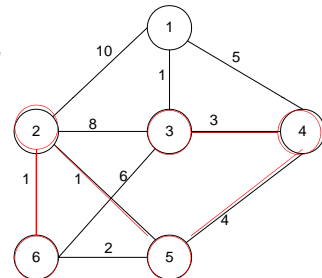
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Prim's algorithm

Repeat until all vertices have been chosen.

- Choose a vertex not in tree with minimal cost edge to add.



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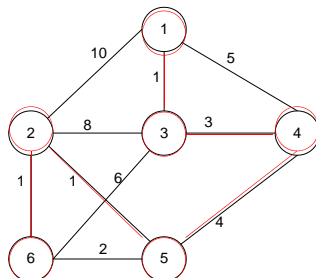
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Prim's algorithm

Repeat until all vertices have been chosen.

- Choose a vertex not in tree with minimal cost edge to add.



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Prim's Algorithm Implementation

- Assume adjacency list representation

Initialize connection cost of each node to "inf" and "unmark" them

Choose one node, say v and set $cost[v] = 0$ and $prev[v] = 0$

While there are unmarked nodes

Select the unmarked node u with minimum cost; mark it

For each unmarked node w adjacent to u

if $cost(u,w) < cost(w)$ then {

$cost(w) := cost(u,w)$

$prev[w] = u$ }

- Looks a lot like Dijkstra's algorithm!

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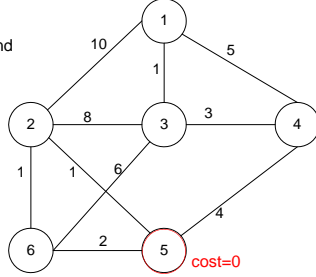
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Prim's algorithm

Repeat until all vertices have been chosen.

1. Choose an initial vertex and put in tree.



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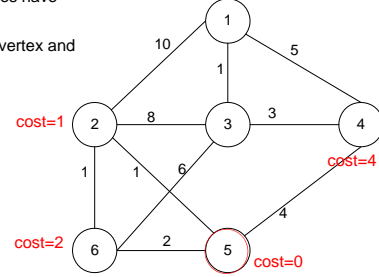
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Prim's algorithm

Repeat until all vertices have been chosen.

1. Choose an initial vertex and put in tree.

Update the costs of its neighbors.



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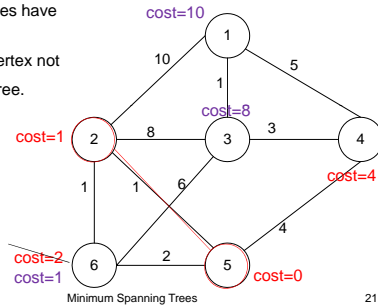
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Prim's algorithm

Repeat until all vertices have been chosen.

2. Choose min cost vertex not in tree and put in tree.

Update the costs of its neighbors.



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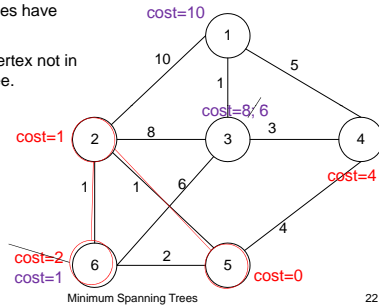
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Prim's algorithm

Repeat until all vertices have been chosen.

3. Choose min cost vertex not in tree and put in tree.

Update the costs of its neighbors.



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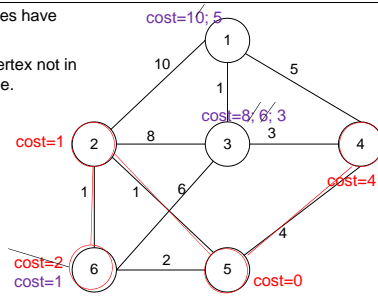
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Prim's algorithm

Repeat until all vertices have been chosen.

4. Choose min cost vertex not in tree and put in tree.

Update the costs of its neighbors.



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Prim's algorithm Analysis

- Like Dijkstra's algorithm
- If the "Select the unmarked node u with minimum cost" is done with binary heap then $O((n+m)\log n)$

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Kruskal's Algorithm

- Select edges in order of increasing cost
- Accept an edge to expand tree or forest only if it does not cause a cycle
- Implementation using adjacency list, priority queues and disjoint sets

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Kruskal's Algorithm

Initialize a forest of trees, each tree being a single node
Build a priority queue of edges with priority being lowest cost

```
Repeat until  $|V| - 1$  edges have been accepted {  
  Deletemin edge from priority queue  
  If it forms a cycle then discard it  
  else accept the edge – It will join 2 existing trees yielding a  
  larger tree and reducing the forest by one tree  
}
```

The accepted edges form the minimum spanning tree

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Detecting Cycles

- If the edge to be added (u,v) is such that vertices u and v belong to the same tree, then by adding (u,v) you would form a cycle
 - › Therefore to check, $\text{Find}(u)$ and $\text{Find}(v)$. If they are the same discard (u,v)
 - › If they are different $\text{Union}(\text{Find}(u), \text{Find}(v))$

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Properties of trees in K's algorithm

- Vertices in different trees are disjoint
 - › True at initialization and Union won't modify the fact for remaining trees
- Trees form equivalent classes under the relation "is connected to"
 - › u connected to u (reflexivity)
 - › u connected to v implies v connected to u (symmetry)
 - › u connected to v and v connected to w implies a path from u to w so u connected to w (transitivity)

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K's Algorithm Data Structures

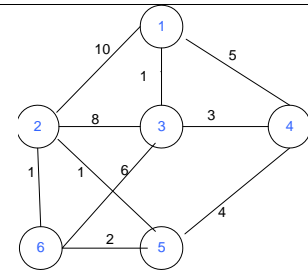
- Adjacency list for the graph
 - › To perform the initialization of the data structures below
- Disjoint Set ADT's for the trees (recall Up tree implementation of Union-Find)
- Binary heap for edges

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Example



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Initialization

Initially, Forest of 6 trees
 $F = \{\{1\}, \{2\}, \{3\}, \{4\}, \{5\}, \{6\}\}$

Edges in a heap (not shown)

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Step 1

Select edge with lowest cost (2,5)
 $\text{Find}(2) = 2, \text{Find}(5) = 5$
 $\text{Union}(2,5)$
 $F = \{\{1\}, \{2,5\}, \{3\}, \{4\}, \{6\}\}$
 1 edge accepted

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Step 2

Select edge with lowest cost (2,6)
 $\text{Find}(2) = 2, \text{Find}(6) = 6$
 $\text{Union}(2,6)$
 $F = \{\{1\}, \{2,5,6\}, \{3\}, \{4\}\}$
 2 edges accepted

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Step 3

Select edge with lowest cost (1,3)
 $\text{Find}(1) = 1, \text{Find}(3) = 3$
 $\text{Union}(1,3)$
 $F = \{\{1,3\}, \{2,5,6\}, \{4\}\}$
 3 edges accepted

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Step 4

Select edge with lowest cost (5,6)
 $\text{Find}(5) = 2, \text{Find}(6) = 2$
 Do nothing
 $F = \{\{1,3\}, \{2,5,6\}, \{4\}\}$
 3 edges accepted

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Step 5

Select edge with lowest cost (3,4)
 $\text{Find}(3) = 1, \text{Find}(4) = 4$
 $\text{Union}(1,4)$
 $F = \{\{1,3,4\}, \{2,5,6\}\}$
 4 edges accepted

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Step 6

Select edge with lowest cost (4,5)

Find(4) = 1, Find(5) = 2

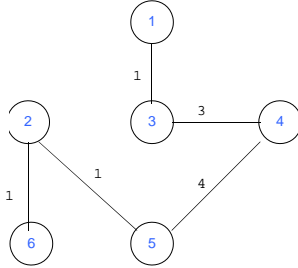
Union(1,2)

F = {{1,3,4,2,5,6}}

5 edges accepted : end

Total cost = 10

Although there is a unique spanning tree in this example, this is not generally the case



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Kruskal's Algorithm Analysis

- Initialize forest $O(n)$
- Initialize heap $O(m)$, $m = |E|$
- Loop performed m times
 - › In the loop one Deletemin $O(\log m)$
 - › Two Find, each $O(\log n)$
 - › One Union (at most) $O(1)$
- So worst case $O(m \log m) = O(m \log n)$

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Time Complexity Summary

- Recall that $m = |E| = O(V^2) = O(n^2)$
- Prim's runs in $O((n+m) \log n)$
- Kruskal's runs in $O(m \log m)$
- In practice, Kruskal has a tendency to run faster since graphs might not be dense and not all edges need to be looked at in the Deletemin operations

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