## Data Structures and Algorithms

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## Announcements

* Homework 5 is out:
* You can use adjacency lists if you prefer


## Review

* Extensions of Dijkstra's Algorithm
* Critical Path Analysis
* All Pairs Shortest Path (Floyd-Warshall)
* Maximum Flow
* Floyd-Fulkerson Algorithm


## Today's Plan

* Minimum Spanning Tree
* Prim's Algorithm
* Kruskal's Algorithm
* Depth first search
* Euler Paths


# Minimum Spanning Tree Problem definition 

* Given connected graph G, find the connected, acyclic subgraph $\mathbf{T}$ with minimum edge weight
* A tree that includes every node is called a spanning tree
* The method to find the MST is another example of a greedy algorithm


## Motivation for Greed

* Consider any spanning tree

* Adding another edge to the tree creates exactly one cycle


* Removing an edge from that cycle restores the tree structure



## Prim's Algorithm

* Grow the tree like Dijkstra's Algorithm
* Dijkstra's: grow the set of vertices to which we know the shortest path
* Prim's: grow the set of vertices we have added to the minimum tree
* Store shortest edge $\mathrm{D}[$ ] from each node to tree


## Prim's Algorithm

* Start with a single node tree, set distance of adjacent nodes to edge weights, infinite elsewhere
* Repeat until all nodes are in tree:
* Add the node $\mathbf{v}$ with shortest known distance
* Update distances of adjacent nodes w:
$D[w]=\min (D[w]$, weight $(\mathbf{v}, \mathbf{w}))$


## Prim's Example



## Prim's Example



## Prim's Example



## Prim's Example



## Prim's Example



## Prim's Example



## Prim's Example



## Prim's Example



## Prim's Example



## Prim's Example



## Prim's Example



## Prim's Example



## Implementation Details

* Store "previous node" like Dijkstra's Algorithm; backtrack to construct tree after completion
* Of course, use a priority queue to keep track of edge weights. Either
* weep track of nodes inside heap \& decreaseKey
* or just add a new copy of the node when key decreases, and call deleteMin until you see a node not in the tree


## Prim's Algorithm Justification

** At any point, we can consider the set of nodes in the tree $\mathbf{T}$ and the set outside the tree $\mathbf{Q}$

* Whatever the MST structure of the nodes in $\mathbf{Q}$, at least one edge must connect the MSTs of $\mathbf{T}$ and $\mathbf{Q}$
* The greedy edge is just as good structurally as any other edge, and has minimum weight


## Prim's Running Time

* Each stage requires one deleteMin $\mathrm{O}(\log |\mathrm{V}|)$, and there are exactly $|\mathrm{V}|$ stages
* We update keys for each edge, updating the key costs $\mathrm{O}(\log |\mathrm{V}|)$ (either an insert or a decreaseKey)
* Total time: $\mathrm{O}(|\mathrm{V}| \log |\mathrm{V}|+|E| \log |\mathrm{V}|)=\mathrm{O}(|\mathrm{E}| \log |\mathrm{V}|)$


## Kruskal's Algorithm

* Somewhat simpler conceptually, but more challenging to implement
* Algorithm: repeatedly add the shortest edge that does not cause a cycle until no such edges exist
* Each added edge performs a union on two trees; perform unions until there is only one tree
* Need special ADT for unions
(Disjoint Set... we'll cover it later)


## Kruskal's Example



## Kruskal's Example



## Kruskal's Example



## Kruskal's Example



## Kruskal's Example



## Kruskal's Example



## Kruskal's Example



## Kruskal's Example



## Kruskal's Justification

* At each stage, the greedy edge e connects two nodes $\mathbf{v}$ and $\mathbf{w}$
* Eventually those two nodes must be connected;
* we must add an edge to connect trees including v and w
* We can always use e to connect $\mathbf{v}$ and $\mathbf{w}$, which must have less weight since it's the greedy choice


## Kruskal's Running Time

* First, buildHeap costs $\mathrm{O}(|\mathrm{E}|)$
* Each edge, need to check if it creates a cycle (costs O(log V))

类 In the worst case, we have to call |E| deleteMins

* Total running time $\mathrm{O}(|E| \log |E|)$; but $|E| \leq|V|^{2}$

$$
O\left(|E| \log |V|^{2}\right)=O(2|E| \log |V|)=O(|E| \log |V|)
$$

## MST Wrapup

* Connect all nodes in graph using minimum weight tree
* Two greedy algorithms:
* Prim's: similar to Dijkstra's. Easier to code
* Kruskal's: easy on paper


## Depth First Search

* Level-order <-> Breadth-first Search Preorder <-> Depth-first Search
* Visit vertex v, then recursively visit v's neighbors
* To avoid visiting nodes more than once in a cyclic graph, mark visited nodes,
* and only recurse on unmarked nodes

http://math.dartmouth.edu/~euler/docs/originals/E053.pdf
* Königsburg Bridge Problem: can one walk across the seven bridges and never cross the same bridge twice?

$$
\begin{aligned}
& \text { The Seven Bridges of } \\
& \text { Königsberg }
\end{aligned}
$$

* Königsburg Bridge Problem: can one walk across the seven bridges and never cross the same bridge twice?
* Euler solved the problem by inventing graph theory


## Euler Paths and Circuits



* Euler path - a (possibly cyclic) path that crosses each edge exactly once
* Euler circuit - an Euler path that starts and ends on the same node


## Euler's Proof

* Does an Euler path exist? No

* Nodes with an odd degree must either be the start or end of the path
* Only one node in the Königsberg graph has odd degree; the path cannot exist
* What about an Euler circuit?


## Finding an Euler Circuit

* Run a partial DFS; search down a path until you need to backtrack (mark edges instead of nodes)
* At this point, you will have found a circuit
* Find first node along the circuit that has unvisited edges; run a DFS starting with that edge
* Splice the new circuit into the main circuit, repeat until all edges are visited


## Euler Circuit Example

## Euler Circuit Example

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## Euler Circuit Example



## Euler Circuit Example

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## Euler Circuit Running Time

* All our DFS's will visit each edge once, so at least O(|E|)
* Must use a linked list for efficient splicing of path, so searching for a vertex with unused edge can be expensive
* but cleverly saving the last scanned edge in each adjacency list can prevent having to check edges more than once, so also $\mathrm{O}(|\mathrm{E}|)$


## Hamiltonian Cycle

* Now that we know how to find Euler circuits efficiently, can we find Hamiltonian Cycles?
* Hamiltonian cycle - path that visits each node once, starts and ends on same node


## Reading

* Weiss 9.5 (MST - today's material)
* Weiss 9.6 (DFS - today's material)
* Weiss 9.7 (P vs. NP - Monday)

