## Weighted Graphs

Computing 2 COMP1927 16x1

Sedgewick Part 5: Chapter 20.1 -20.4 21.1 - 21.3

#### WEIGHTED GRAPHS

- Some applications require us to consider a cost or weight
  - costs/weights are assigned to edges
- Often use a geometric interpretation of weights
  - low weight short edge
  - high weight long edge
- Weights are not always geometric
  - Some weights can be negative
    - this can make some problems more difficult!
    - Assume in our graphs we have non-negative weights

#### Example: Weighted Graphs

- Example: "map" of airline flight routes
  - vertices = airports
  - edge = flights
  - weights = distance/time/price



#### WEIGHTED GRAPH IMPLEMENTATION

Adjacency Matrix Representation

- change 0 and 1 to float/double
- Need a special float constant to indicate NO\_EDGE
- Can't use 0. It may be a valid weight
- Adjacency Lists Representation
  - add float weight to each node

• This will work for directed or undirected graphs

#### ADJACENCY MATRIX WITH WEIGHTS



Weighted Digraph

Adjacency Matrix

4

\*

\*

\*

0.9

\*

# ADJACENCY LIST REPRESENTATION WITH WEIGHTS



#### WEIGHTED GRAPH PROBLEMS

#### o Minimum spanning tree

- find the minimal weight set of edges that connect all vertices in a weighted graph
  - might be more than one minimal solution
- we will assume undirected graph
- we will assume non-negative weights

#### o Shortest Path Problem

- Find minimum cost path to from one vertex to another
- Edges may be directed or undirected
- We will assume non-negative weights

#### MINIMAL SPANNING TREE PROBLEM

Origins

- Otakar Boruvka, electrical engineer in 1926
- most economical construction of electric power network
- Some modern applications of MST:
  - network layout: telephone, electric, computer, road, cable
- Has been studied intensely, still looking for faster algorithms

#### MINIMUM SPANNING TREES (MST)

• Reminder: *Spanning tree ST* of graph *G(V,E)* 

- *ST* is a subgraph of *G* 
  - $\circ$  (G'(V,E') where E' is a subset of E)
- ST is connected and acyclic
- Minimum spanning tree MST of graph G
  - *MST* is a spanning tree of *G*

 sum of edge weights is no larger than any other ST

• Problem: how to (efficiently) find MST for graph G?

#### KRUSKAL'S MST ALGORITHM

#### One approach to computing MST for graph G(V,E):

- start with empty MST
- consider edges in increasing weight order
- add edge if it does not form a cycle in MST
- repeat until V-1 edges are added
- Critical operations:
  - iterating over edges in weight order
  - checking for cycles in a graph

#### EXECUTION TRACE OF KRUSKAL'S MST



Initially



After step 1



After step 2







After step 3

After step 4a

After step 4b

## EXERCISE: TRACE KRUSKAL'S ALGORITHM



#### Kruskal's Algorithm: Minimal Spanning Tree

o Implementation 1: Two main parts:

- sorting edges according to their length (E \* log E)
- check if adding an edge would create a cycle
  Could check for cycles using DFS ... but too expensive
  use Union-Find data structure from Sedgewick ch.1
  If we use this the cost of sorting dominates so over all
  E log E
- Implementation 2: Using a pq instead of full sort
  - Create a priority queue using weights as priority
  - Allows us to remove edges from pq in weighted order
  - O(E + X \*log V), with X = number of edges shorter than the longest edge in the MST

#### PRIM'S ALGORITHM: MINIMAL SPANNING TREE

- Another approach to computing MST for graph G(V,E):
  - o start from any vertex s and empty MST
    - choose edge not already in MST to add to MST
       must not contain a self-loop
       must connect to a vertex already on MST
       must have minimal weight of all such edges
      - check to see whether adding the new edge brought any of the non-tree vertices closer to the tree
      - repeat until MST covers all vertices
- Critical operations:
  - checking for vertex being connected in a graph
  - finding min weight edge in a set of edges
  - updating min weights in a set of edges

o Idea:

 Starting from a subgraph containing only one vertex, we successively add the shortest vertex connecting the subgraph with the rest of the nodes to the tree



- 0 1 (32)• 0 - 2 (29)
- 0 5 (60)
  0 6 (51)
- 0 7 (31)
- 1 7 (21)
- 3 4 (34)
- 3 5 (18)
- 4 5 (40)
- 4 6 (51)
- 4 7 (46)
- 6 7 (25)

- Starting from a sub-graph containing only one vertex, we successively add the shortest vertex connecting the sub-graph with the rest of the nodes to the tree
- Edges in pink are in the fringe



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## WEIGHTED GRAPH: MINIMAL SPANNING TREE II

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#### PRIM'S ALGORITHM

• Prim's algorithm is just a graph search –

 instead of depth first (using a stack) or breadth first (using a queue),

we choose a shortest first` strategy using a priority queue

- It can be implemented to run in
  - O(E \* log V) steps

 if the steps listed above are implemented efficiently (using adjacency lists and heap),

•  $O(V^2)$  for adjacency matrix

See lecture code for an implementation

#### EXERCISE: TRACE PRIM'S ALGORITHM



#### SHORTEST PATHS

• Weight of a path p in graph G

- sum of weights on edges along path (weight(p))
- Shortest path between vertices s and t
  - a simple path p where s = first(p), t = last(p)
  - no other simple path q has weight(q) < weight(p)</li>
- Problem: how to (efficiently) find shortestPath(G,s,t)?
  - Assumptions: weighted graph, no negative weights.

#### EXERCISE:

- What is the minimum spanning tree?
- What is the shortest path from 0 to 3?
- What is the least hops path (shortest unweighted path) from 0 to 2?



#### SHORTEST PATH ALGORITHMS

- Shortest-path is useful in a wide range of applications
  - robot navigation
  - finding routes in maps
  - routing in data/computer networks
- Flavours of shortest-path
  - source-target (shortest path from s to t)
  - single-source (shortest paths from s to all other V)
  - all-pairs (shortest paths for all (*s*,*t*) pairs)

#### DIJKSTRA'S ALGORITHM SINGLE SOURCE SHORTEST PATHS



V	0	1	2	3	4
dist	0	0.3	0.7	1.1	inf
st	_	0	0	2	_

Weighted Digraph

*Shortest paths from s=0* 

## DIJKSTRA'S ALGORITHM: SINGLE SOURCE SHORTEST PATH

o Given:

• weighted digraph/graph G, source vertex s

o Result:

- shortest paths from s to all other vertices
- dist[] : V-indexed array of distances from s
- st[] : V-indexed array of predecessors in shortest path
- Note: shortest paths can be viewed as tree rooted at s

#### EDGE RELAXATION

• Relaxation along edge e from v to w

- dist[v] is length of some path from s to v
- dist[w] is length of some path from s to w
- if e gives shorter path s to w via v, then update dist[w] and st[w]

• Relaxation updates data on w if we find a shorter path to s.



if (dist[v] + e.weight < dist[w]) {
 dist[w] = dist[v] + e.weight;
 st[w] = v;</pre>

#### DIJKSTRA'S ALGORITHM

o Data:

 G, s, dist[], st[], and a pq containing the set of vertices whose shortest path from s is not yet known

• Algorithm:

- initialise dist[] to all ∞, except dist[s]=0
- Initialise pq with all V, with dist[v] as priority
- v = deleteMin from pq
  - o Get e's that connect v to w in pq
  - o relax along e if new dist is better

• repeat until pq is empty

# EXECUTION TRACE OF DIJKSTRA'S ALGORITHM



#### ... EXECUTION TRACE OF DIJKSTRA'S **ALGORITHN**



After 2 visited

## ... EXECUTION TRACE OF DIJKSTRA'S ALGORITHM



#### DIJKSTRA'S RESULTS

• After the algorithm has completed:

- Shortest Path distances are in dist array
- Actual path can be traced back from endpoint via the predecessors in the st array

#### EXERCISE

 Assume we have just completed running Dijkstra's algorithm with starting vertex v. Write code to print out the path from vertex v to w or "No path" if the path does not exist. (It is ok to print it in reverse order.)

#### TRACE EXECUTION OF DIJKSTRA'S ALGORITHM FROM STARTING VERTEX 2

