

From Last Time

① Can prove that path compression alone with  $n$  Make-Set ops,  $f$  FIND-SET ops, and arbitrary # of unions (up to  $n-1$ ) cost  $\Theta(n + f(1 + \log_{2+\frac{f}{n}} n))$

②  $\mathcal{O}(m \alpha(n))$ , where  $m =$  total # ops, running time using forest of trees with union-by-rank and path compression proven in § 21.4

— You ARE NOT RESPONSIBLE FOR THIS

# Greedy Algorithms

Greedy algorithm: Overall problem solved in series of steps. Choice made at each step looks best at the moment without explicit reference to overall problem. ← "locally optimal"

Example:

We need to make 99¢ in change with minimum # of coins. We do this with a greedy algorithm automatically.

$$\begin{array}{r}
 99¢ = (25¢) \times 3 + \\
 \underline{-75} \\
 24 = \quad \quad \quad (10¢) \times 2 + \\
 \underline{-20} \\
 4 \quad \quad \quad \quad \quad \quad (5¢) \times 0 + (1¢) \times 4 \\
 \underline{0} \\
 0
 \end{array}$$


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3 quarters + 2 dimes + 4 pennies

This greedy algorithm gives correct solution.  
 Starting with largest coin, take as many as possible without going over.

**BUT** ---

① start with pennies:  $99¢ = (1¢) \times 99 \Rightarrow 99$  coins

② If the dime was replaced by an 11¢ piece, make 15¢:  
 greedy:  $15¢ = (11¢) \times 1 + (6¢) \times 1 + (1¢) \times 4 \rightarrow 5$  coins  
 correct answer:  $15¢ = (11¢) \times 0 + (5¢) \times 3 \rightarrow 3$  coins

No greedy algorithms

- sometimes yield correct solution (globally optimal)
- sometimes do not
  - change made is correct, but minimum number of coins not achieved

Depends on

- structure of algorithm (forward/reverse)
- structure of problem (coin values)

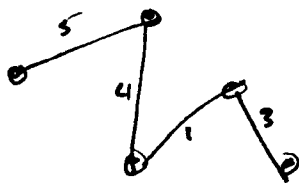
We will see that

① in some cases can prove greedy algorithm leads to globally optimal solution

② in other cases greedy solutions lead to good solutions (avg case behavior) that are rapid to find and worthwhile, but not guaranteed optimal.

Graphs (CLRS Appendix B.4)

- Graph is a set of vertices (points) connected by edges (lines that join two points) - directed/undirected
- "Weight" is additional information such as distance between vertices (associated with edge)
- "Connected": a path exists between any pair of vertices by traversing (multiple) edges



## Minimum Spanning Tree (MST) Problem

Input: A connected, undirected graph  $G=(V,E)$  with weight function  $w: E \rightarrow \mathbb{R}$

Output: A spanning tree,  $T$  (connecting all vertices) of minimum weight

$$W(T) = \sum_{(u,v) \in T} w(u,v)$$

↙ sum over edges of tree

Why is this problem interesting?

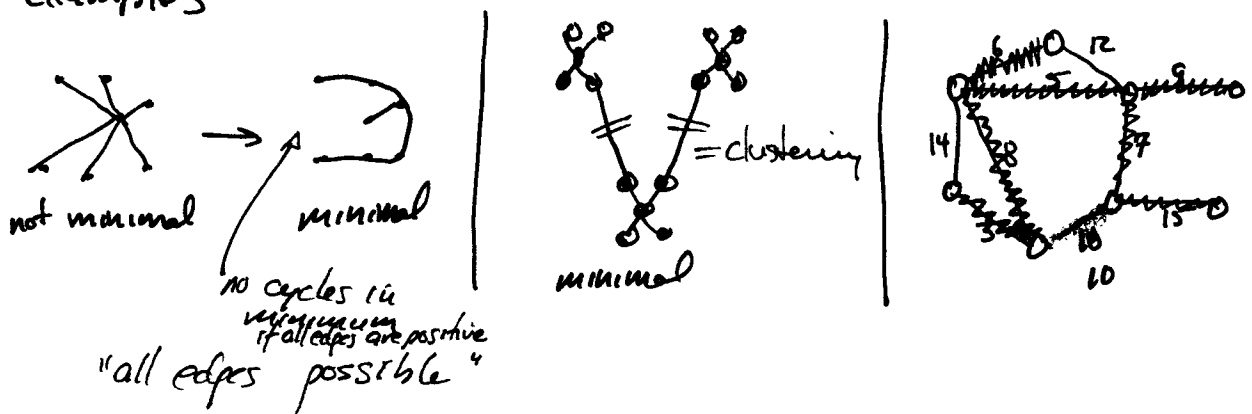
① Shortest Path Connectivity

ⓐ For electric circuitry, often need to wire together set of contacts. Desirable to use minimal amount of wire.  $\rightarrow$  MST problem

ⓑ On a larger scale, to connect multiple sites by telecommunications network, want minimal cost scheme. Weights could be length of wire or cost to install, or other

② One form of clustering achieved by cutting longest edges in MST

Examples



Some properties: # of edges =  $|E| = O(V^2)$   $\rightarrow$  bounded from above  
 If graph  $G$  connected, then  $|E| \geq |V| - 1 \Rightarrow \lg |E| = \Theta(\lg |V|)$   
 $\downarrow$  bounded from below

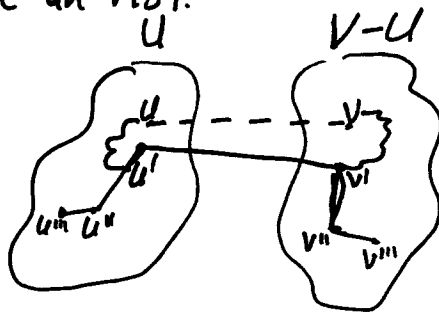
Would you think a greedy algorithm would work here?

Can growing a tree one step at a time (in a greedy manner) lead to a globally optimum smallest weight solution?

**THE MST PROPERTY**  $\rightarrow$  Somewhat different from book

Theorem: Let  $G=(V,E)$  be connected graph with cost function defined on edges. Let  $U$  be some proper subset of  $V$ . If  $(u,v)$  is an edge of lowest cost such that  $u \in U$  and  $v \in V-U$ , then there is an MST containing  $(u,v)$ . "light edge"

Proof: (Every MST satisfies above) (By "cut-and-paste")  
 Assume the theorem false: no MST that includes  $(u,v)$ .  
 Let  $T$  be an MST.



- adding  $(u,v)$  introduces a cycle, because  $T$  is an MST so already has path from  $u$  to  $v$
- there must be another edge from  $U$  to  $V-U$ ,  $(u',v')$  wlog and there may be more than one

Can't have cycles, even if weight is negative, because then not a tree

- deleting edge  $(u',v')$  breaks cycle, giving tree  $T'$
- $T'$  has weight  $\leq T$  because  $(u,v)$  was lowest cost edge
- Thus, our assumption is wrong and theorem is true:  
 $(u,v)$  in MST

Now do you think greedy algorithm might work? We can use local information to exclude (and include) edges from growing MSTs.

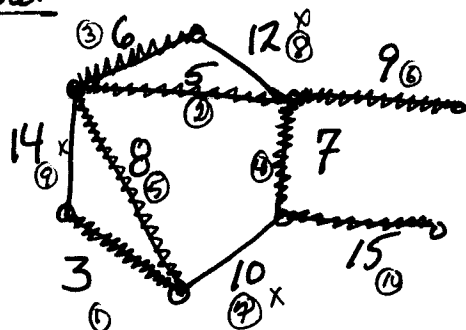
Size of search space - All graphs - Each edge can be in or out:  $2^{|E|}$

- some will not be trees
- some will not be connected
- some will not be minimum cost
- could enumerate each, evaluate whether connected (disjoint set operations) and compute weight

### Kruskal's Algorithm

- Initially  $T = (V, \emptyset)$  (vertices but no edges)
- Examine edges of  $E$  in "increasing" weight order
  - If edge connects two <sup>non-decreasing</sup> unconnected components, add edge to  $T$
  - Else discard edge and continue (forms cycle)
  - Can terminate when all edges in single connected component

Example:



Correctness of ~~Proof~~ Alg.: Loop invariant

Prior to each iteration,  $T$  is a subset of a MST

Initialization:  $T$  has no edges, so trivially satisfied

Maintenance: Edges are only accepted in loop if part of MST

Termination: All edges are examined and added to  $T$  if in MST, so  $T$  must be MST

Book does somewhat stronger proof for non-unique MST.

Pseudo Code for Implementation  
MST-Kruskal ( $G, W$ )

~~Make-Set~~

initialize edge list to  $A \leftarrow \emptyset$

make a forest of trees (root only) for the vertices

DISJOINT SET OPS OF LAST TIME

for each vertex  $v \in V[G]$  do Make-Set( $v$ )  $\rightarrow O(V)$   
 $\rightarrow$  account for below  
 sort the edges of  $E$  into non-decreasing order by  $w \rightarrow O(E \log E)$

for each edge  $(u, v) \in E$  in non-decreasing order

if edge connects disconnected components  $\rightarrow$  do if Find-Set( $u$ )  $\neq$  Find-Set( $v$ )

then  $A \leftarrow A \cup \{(u, v)\}$

add edge to MST  $\rightarrow$  UNION( $u, v$ )  
 return  $A$

join disconnected components

$O(E)$  Find-Set & Union operations plus  $O(V)$  Make-Set

$\Rightarrow O((V+E)\alpha(V))$

connected:  $|E| \geq |V| + 1$

$\Rightarrow O(E\alpha(V))$

$\alpha(V) = O(\log V) = O(\log E)$

$\Rightarrow O(E \log E) \Rightarrow O(E \log V)$