- . (a) Red street in the city Shampoo-Banana can be modeled as a straight line starting at 0. The street has n houses at locations  $x_1, x_2, \ldots, x_n$  on the line. The local cable company wants to install some new fiber optic equipment at several locations such that every house is within distance r from one of the equipment locations. The city has granted permits to install the equipment, but only at some m locations on the street given y locations  $y_1, y_2, \ldots, y_m$ . For simplicity assume that all the x and y values are distinct. You can also assume that  $x_1 < x_2 < \ldots < x_n$  and that  $y_1 < y_2 < \ldots < y_m$ .
  - Describe a greedy algorithm that finds the minimum number of equipment locations that the cable company can build to satisfy the desired constraint that every house is within distance r from one of them. Your algorithm has to detect if a feasible solution does not exist. Prove the correctness of the algorithm. One way to do this by arguing that there is an optimum solution that agrees with the first choice of your greedy algorithm.
  - Not to submit: The cable company has realized subsequently that not all locations are equal in terms of the cost of installing equipment. Assume that  $c_j$  is the cost at location  $y_j$ . Describe a dynamic programming algorithm that minimizes the total cost of installing equipment under the same constraint as before. Do you see why a greedy algorithm may not work for this cost version?

**Solution:** The greedy algorithm's strategy is to repeatedly choose the rightmost  $y_j$  that covers the leftmost uncovered  $x_i$  until all the houses are covered. The algorithm will return the set of fiber optic cable equipment locations.

## **Greedy Algorithm:**

- $S \leftarrow \emptyset, i \leftarrow 1, j \leftarrow 1$
- While  $i \le n$ 
  - If j > m or  $x_i < y_j D$ , return IMPOSSIBLE
  - While  $j \le m$  and  $x_i \ge y_j D$ , increment j
  - Add  $y_{i-1}$  to S
  - While  $i \le n$  and  $x_i \le y_{i-1} + D$ , increment i
- Return S

The preceding algorithm runs in O(n+m) time. Note that we are assuming here that the locations are given in a sorted order. Otherwise we would need to spend  $O(n\log n + m\log m)$  time to sort them first. In order to prove the correctness via induction it is convenient to rephrase the greedy algorithm in a recursive fashion described below. Here we assume that the array X[1..n] stores the locations  $x_1, \ldots, x_n$  and Y[1..m] stores the locations  $y_1, \ldots, y_m$ . The algorithm below will be called in the main program with a = 1, b = n and c = 1, d = m.

## **RecursiveGreedy** (X[a..b], Y[c..d]):

- If a > b return  $\emptyset$ .
- If none of  $y_c, ..., y_d$  covers  $x_a$ , return IMPOSSIBLE.
- Let j be the largest index in c, c + 1, ..., d such that  $y_j$  covers  $x_a$ .
- Let i be the largest index in a, a + 1, ..., b such that  $x_i$  is not covered by  $y_i$
- $S' = \mathbf{RecursiveGreedy}(X[i..b], Y[j+1..d])$
- Output  $S' \cup \{y_i\}$ .

The correctness of the algorithm can then be proved by induction.

## **Proof of correctness:**

We shall first prove that there is an optimum solution that contains the first choice of  $y_j$  that the greedy algorithm would pick. Suppose OPT is any optimum solution. The first location Greedy would choose to include,  $g_1$ , is the rightmost  $y_j$  that covers  $x_1$ , which is the leftmost  $x_i$  and therefore the one Greedy would seek to cover first by definition. We'll show that OPT could also have been constructed using  $g_1$  without any loss of optimum quality, so if there are any optimum solutions to the problem,  $g_1$  is part of at least one such solution.

Let  $o_1$  be the leftmost position that OPT chose. If  $o_1 = g_1$ , the proof is complete. Otherwise we consider other possible positions for  $o_1$ . Suppose  $o_1$  is to the right of  $g_1$ ; then  $o_1$  does not cover  $x_1$ , because  $g_1$  was the rightmost position that could; also, because there is no other element in OPT to the left of  $o_1$  by definition, nothing in OPT can cover  $x_1$ , so OPT is not a solution; this is a contradiction, so  $o_1$  is not to the right of  $g_1$ . So suppose  $o_1$  is to the left of  $g_1$ . Then we know that  $o_1$  can't be so far to the left that it fails to cover  $x_1$  at all, because then  $o_1$  could be removed from OPT to form a solution OPT' that is smaller in size and thus better; this would make OPT not optimum, a contradiction. So  $o_1$  must cover  $x_1$ , and  $o_1$  is to the left of  $g_1$ . We also know that if  $o_1$  covers any houses to the right of  $x_1$ , then  $g_1$  also covers them, since  $g_1$  at least covers  $x_1$  like  $o_1$  does, and  $g_1$  is situated further to the right than  $o_1$ . This means OPT could replace  $o_1$  with  $g_1$  without losing any coverage or losing optimality.

We can then use induction to prove that the greedy algorithm in its entirety provides an optimal solution to the problem. It is convenient here to use the recursive version of the algorithm. We omit the formal inductive argument.

(b) **Solution:** Why Greedy might fail: Let  $D=1, x_1=1, y_1=1, y_2=2, c_1=1, c_2=2$ . The greedy algorithm will pick the equipment location at  $y_2$  as it is the rightmost equipment location that covers the only (and therefore leftmost uncovered) house at  $x_1$ , thus the greedy solution has cost 2. However, we can cover the only house with  $y_1$  which only has cost 1. Thus greedy does not work for all inputs.

In the following we will assume that the  $x_i$ 's and  $y_i's$  are sorted by taking  $O(n \log n + m \log m)$  time. Let Next(j) be the smallest index i such that  $x_i > D + y_j$  or n+1 if no such index exists. We can preprocess this in  $O(m \log n)$  time via binary search (even though linear searching would be sufficient for the same overall runtime) for each  $j \in [1, m]$  and store it in an array N[1..m]. This allows us to find the index of the rightmost house more than D distance away from  $y_j$  if one exists in constant time. Let MCFS(i, j) be the minimum total cost of building a subset of the rightmost (m - j + 1) cable locations such that the rightmost (n - i + 1) houses are within D distance of an equipment location. The recurrence below satisfies this definition.

$$MCFS(i,j) = \begin{cases} 0 & \text{if } i > n \\ \infty & \text{if } j > m \text{ or } y_j - x_i > D \\ MCFS(i,j+1) & \text{if } x_i - y_j > D \\ \min\{c_j + MCFS(N[j], j+1), MCFS(i,j+1)\} & \text{otherwise} \end{cases}$$
Thus the call  $MCFS(1,1)$  will return the minimum cost to cover all  $n$  houses with

Thus the call MCFS(1,1) will return the minimum cost to cover all n houses with cable equipment locations chosen such that all houses are within D distance of an

equipment location. Since this algorithm has O(mn) distinct calls and its arguments are integers, we will memoize using a 2d array MCFS[1..n+1][1..m+1]. The total work is constant for all cases due to the preprocessing of Next, thus it runs in O(nm) time. Overall, including the sorting and time spent constructing N[1..m], it takes  $O(n \log n + m \log m + m \log n + mn)$  time.

**Rubric:** Out of 10 points, we would allocate:

- 5 points for the greedy algorithm (standard DP algorithm rubric scaled)
- 5 points for proof. 4 points for the main claim regarding the the existence of an optimum solution containing the first location opened by Greedy. 1 point for discussing inductive proof based on the main claim.

2. Let G=(V,E) be an edge-weighted undirected graph. We are interested in computing a minimum spanning tree T of G to find a cheapest subgraph that ensures connectivity. However, some of the nodes in G are unreliable and may fail. If a node fails it can disconnect the tree T unless it is a leaf. Thus, you want to find a cheapest spanning tree in G in which all the unreliable nodes (which is a given subset  $U \subset V$ ) are leaves. Describe an efficient for this problem. Note that your algorithm should also check wither a feasible spanning tree satisfying the given constraint exists in G.

**Solution:** We first note that if T is a spanning tree of G such that all unreliable nodes are leaves in T, then removing the nodes in U from T will leave a tree T' on  $V \setminus U$ , since each node of U is a leaf in T. Moreover, if  $u \in U$  and (u, v) is the unique edge in T incident to u then  $v \notin U$ , as otherwise, v would have to have degree 2 in T (recall that U is a proper subset of V, so T must contain at least one node not in U; if  $v \in U$ , then v must be adjacent to both u and one such node  $u' \notin U$ ). Therefore edges connecting two U-nodes must not appear in T.

From the above observations we derive the following algorithm.

```
CALCULATERELIABLEMST(G, U):
Remove from G all edges (u, v) where both u, v \in U
Let G' be the graph obtained by removing U from G
If G' is not connected, output that no feasible solution exists
Compute an MST T in G'
For each u \in U:
If u has no edges incident to it in G, output that no feasible solution exists
Else, let (u, v) be the lowest-weight edge incident to u in G. Add (u, v) to T.
```

As we loop through all edges of G once during the first step and the for loop iterates through each vertex and edge in G at most once, the algorithm can be implemented in O(m+n+A(m,n)) time where A(m,n) is the time required to find an MST in a graph with m edges and n nodes. Any MST algorithm could be used; in particular, we have an  $O(m+n\log n)$  algorithm for MST computation by running Prim's algorithm using a Fibonacci heap, so we get an overall running time of  $O(m+n\log n)$  where m is the number

**Note:** It is possible to modify Prim's and/or Kruskal's algorithm to obtain a correct solution to this problem. While that is a reasonable approach, it is often better to step back and understand the problem structure first before thinking of a specific algorithm.

## Rubric: 10 points:

of edges in G and n is the number of nodes.

Output T

- ullet 3 points for correctly removing all nodes from U and calculating an initial MST
- 2 points for noting that all edges (u, v), with  $u, v \in U$ , cannot be included in the resulting MST
- 2 points for properly adding the lowest-weight edge incident to each  $u \in U$  to the tree
- 1 point for noting that no feasible solution exists if a node u ∈ U has no edges incident to it in G after removing all edges (u, v) from G with u, v ∈ U
- 2 points for correct runtime analysis

3. Consider the language  $L_{\text{OH}} = \{\langle M \rangle \mid M \text{ halts on at least one input string} \}$ . Note that for  $\langle M \rangle \in L_{\text{OH}}$ , it is not necessary for M to accept any string; it is sufficient for it to halt on (and possibly rejects) some string. Prove that  $L_{\text{OH}}$  is undecidable.

**Solution:** For the sake of argument, suppose there is an algorithm DecideOH that correctly decides the language  $L_{OH}$ . Then we can solve the halting problem as follows:

We prove this reduction correct as follows:

 $\implies$  Suppose M halts on input w.

Then M' halts on *every* input string x.

Thus, M' halts on at least one input string.

So DecideOH accepts the encoding  $\langle M' \rangle$ .

So DecideHalt correctly accepts the encoding  $\langle M, w \rangle$ .

 $\iff$  Suppose M does not halt on input w.

Then M' diverges on *every* input string x.

That is, M' does not halt on any input string.

So DecideOH rejects the encoding  $\langle M' \rangle$ .

So DecideHalt correctly rejects the encoding  $\langle M, w \rangle$ .

In both cases, DecideHalt is correct. But that's impossible, because Halt is undecidable. We conclude that the algorithm DecideOH does not exist. ■

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Rubric: 10 points:
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- 4 points for correct reduction.
- 3 points for "if" proof.
- 3 points for "only if" proof.