# Minimum Spanning Trees I: Prim's algorithm COMS20010 (Algorithms II)

John Lapinskas, University of Bristol

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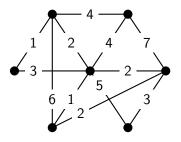
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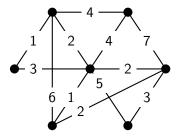


You need every town to be connected to every other town, and you want to spend as little as possible. So you want something like this, not like **this**.

We think of this situation as a connected weighted graph G = ((V, E), w): the vertices are towns, and w(x, y) is the cost of building a connection from x to y. (In this case, E would contain every possible edge.)

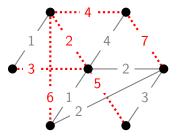


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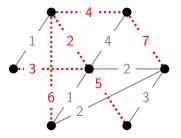
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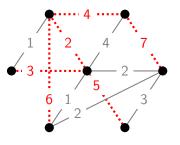
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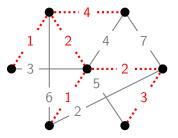


#### Total weight:

$$4+2+7+3+6+5=27$$

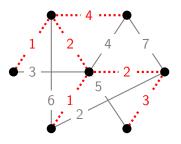
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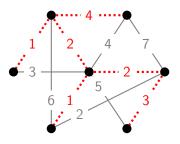


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- this is "NP-hard" (read: no polynomial-time algorithm);
- all the approximation algorithms are based on minimum spanning tree;
- using a minimum spanning tree is already "good enough" at worst twice the weight of a minimum Steiner tree (see problem sheet).

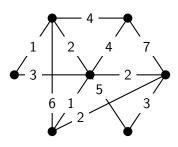
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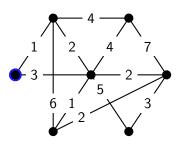
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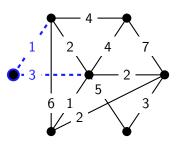
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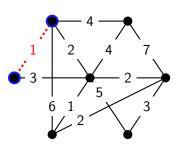
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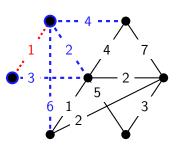
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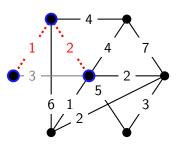
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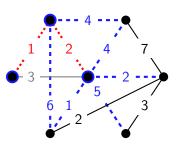
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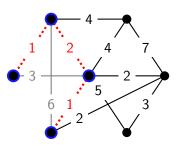
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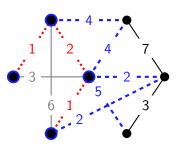
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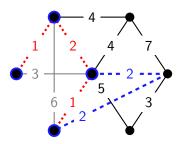
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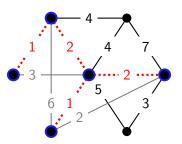
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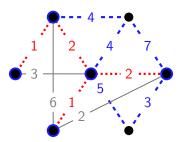
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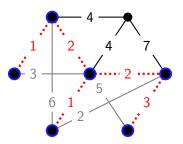
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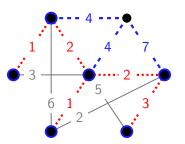
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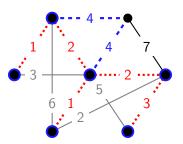
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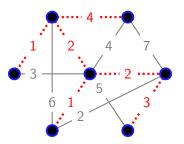
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# Prim's algorithm: Formal version and correctness

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**Formally:** Let  $T_1 = (\{v\}, \emptyset)$  for some arbitrary  $v \in V$ .

Let  $E_i$  be the set of edges from  $V(T_i)$  to  $V \setminus V(T_i)$ .

Form  $T_{i+1}$  by adding a lowest-weight edge  $e_i \in E_i$  to  $T_i$ , so  $V(T_{i+1}) = V(T_i) \cup e_i$  and  $E(T_{i+1}) = E(T_i) \cup \{e_i\}$ .

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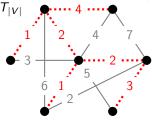
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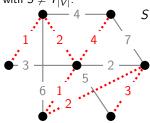
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To prove it's a minimum spanning tree, we use an exchange argument.

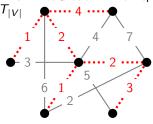
That is, we show we can turn any minimum spanning tree into  $T_{|V|}$  without increasing its weight (like with interval scheduling).

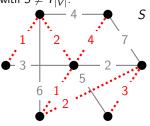
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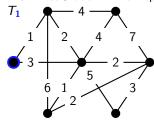


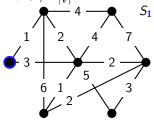


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, and let  $I = \min\{i : S_i \neq T_i\}$ .

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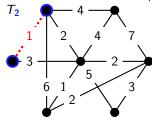


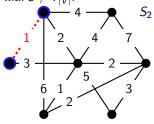


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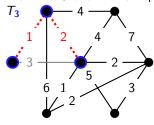


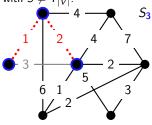


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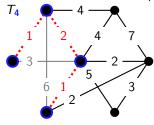


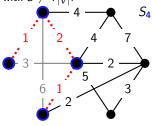


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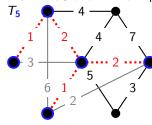


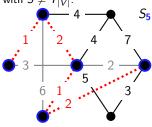


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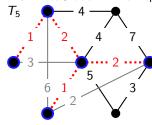


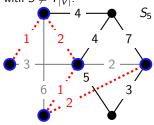


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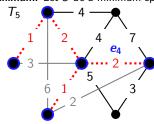


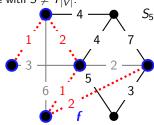


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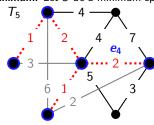
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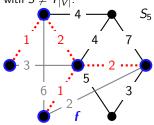
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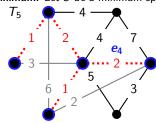
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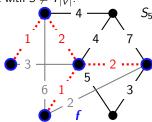
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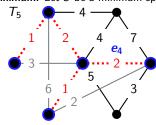
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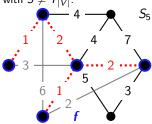
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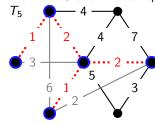
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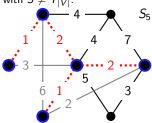
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Still a tree: Since there is only one edge f,  $S[V \setminus V(S_{l-1})]$  is a tree as well (by the FLoT). Joining two disjoint trees by an edge gives another tree (by the FLoT).

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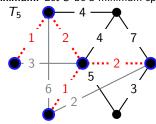
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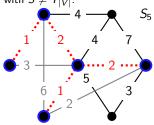
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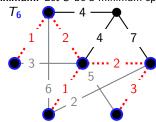
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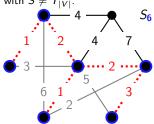
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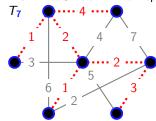
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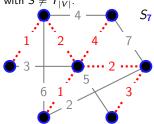
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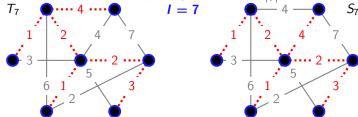
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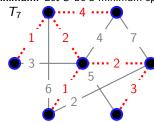
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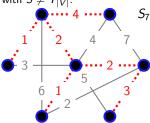
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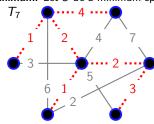
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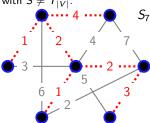
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By repeating the process, we can turn S into  $T_{|V|}$  without increasing its weight. Hence  $w(S) \geq w(T_{|V|})$ . Since S was minimum, we're done!

### Prim's algorithm: Implementation

10

11 Return pred.

Literally just breadth-first search with a priority queue!

```
Algorithm: BFS
  Input : Connected weighted graph G = ((V, E), w).
  Output : A minimum spanning tree for G.
1 Number the vertices of G arbitrarily as v_1, \ldots, v_n.
2 Let L[i] \leftarrow \infty for all i \in [n].
3 Let L[1] \leftarrow 0, pred[1] \leftarrow None.
4 Let queue be a length-|E| priority queue containing all tuples (v, v_i) with \{v, v_i\} \in E,
     using their edge weights as priorities.
6 while queue is not empty do
       Remove front tuple (v_i, v_i) from queue.
       if L[j] = \infty then
            Add (v_i, v_k) to queue for all \{v_i, v_k\} \in E, k \neq i.
            Set L[j] \leftarrow L[i] + 1, pred[j] = i.
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Time analysis: As with breadth-first search, eac

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11

**Time analysis:** As with breadth-first search, each edge is only processed twice. Processing each edge now takes  $\Theta(\log |E|)$  worst-case time, so overall the algorithm runs in  $O(|E|\log |E|)$  time. (Note  $|E| \ge |V|$ .)

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Like with Dijkstra, we could "improve" this to  $O(|E| + |V| \log |V|)$  time (with a much worse constant) by using a Fibonacci heap in place of the priority queue.