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- At 8 am, each nurse begins her "morning round" of patients under her care.
- • Morning round ends when all nurses have returned to their bases.
- $\bullet$  Objective: Assign patients to nurses so that morning rounds end ASAP.

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- $\bullet$ • Star cover: Cover with stars, same objective; may be rooted or unrooted.



# **Hardness (of rooted** k**-star cover)**

 $\bullet$ • Reduction from BIN-PACK: Given elements  $U$  with sizes  $s_u$ ,  $k$  bins of size  $B$ . Can we pack elements in  $k$  bins?



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- $\bullet$ • Convert to Rooted  $k$ -star cover: Complete bipartite graph between elements and bins, edge weights <sup>=</sup> element sizes, bins <sup>=</sup> roots.
- Claim: BIN-PACK is identical to this special case of Rooted  $k$ -star cover.



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- • Binary search yields (weakly) polynomial time <sup>4</sup>-approximation algorithm.
- •• Can be made strongly polynomial; approximation ratio worsens to  $4+\epsilon.$

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- 4. Match trees  $\{S_i^j\}_i^j$  to roots in  $R$  within distance  $B$  from it.
	- If possible, return "success".
	- $\bullet$ If impossible, return "fail".

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 $B^*|N(S)| \ge B^*|T^*(S)| \ge w(T^*(S)) \ge w(S) \ge B|S|.$ 

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3. If  $\sum_i (k_i + 1) > k$ , return "fail".



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# $k_i = \lfloor \frac{w(MST_i)}{2B} \rfloor.$

- 3. If  $\sum_i (k_i + 1) > k$ , return "fail".
- 4. Decompose each  $MST_i$  into at most  $k_i\!+\!1$  trees  $S_i^1\!+\!\ldots\!+\!S_i^{k_i}\!+\!L_i$ such that  $w(S_i^j) \, \in \, [2B, 4B)$  and  $w(L_i) < 2B$ . Return "success". Final solution

# **Algorithm for Unrooted** k**-tree cover**

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Therefore  $k_i^* \geq \frac{w(MST_i)}{2B} + \frac{1}{2} > k_i$ .

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- $\bullet$ • Tree cover algorithms also yield constant factor approximations for tour cover, the original nursing station location problem.
- $\bullet$ Questions?

This research was sponsored in part by National Science Foundation (NSF) grant no. CCR-0122581.