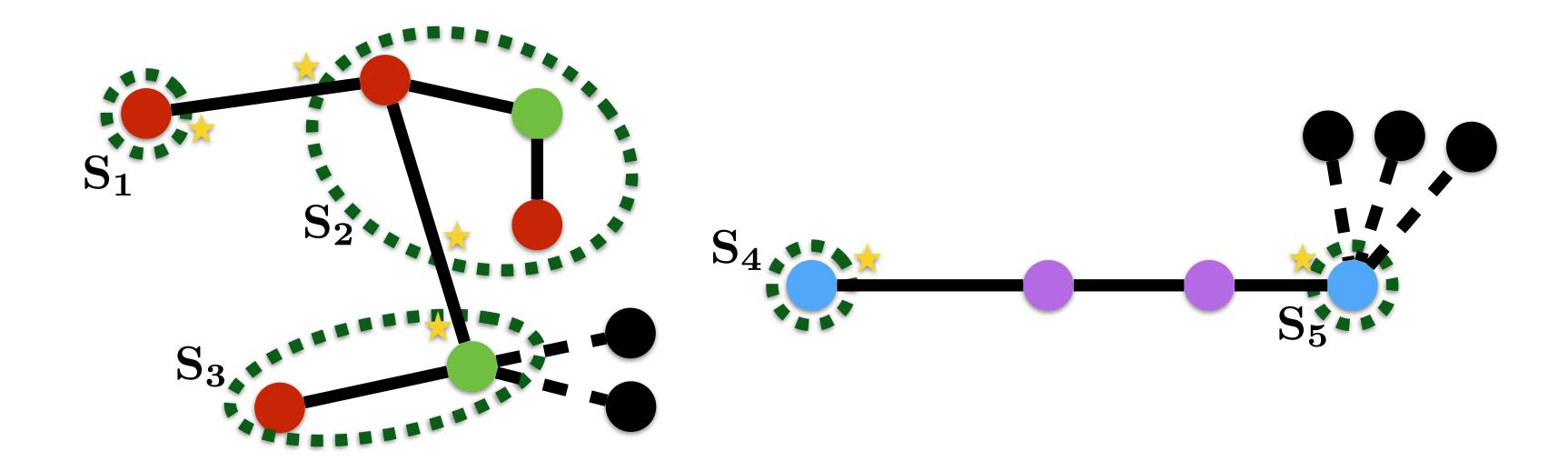
### Steiner forest



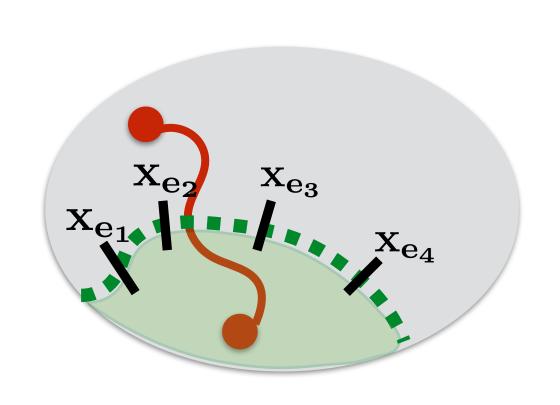
#### Lemma

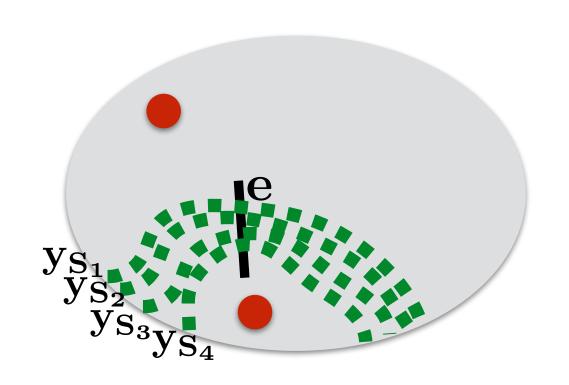
Let F' denote the output set of edges Fix a time of the execution and say a set S is active if its dual variable is being raised.

Then: 
$$\frac{\sum_{\text{S active}} |\mathbf{F}' \cap \delta(\mathbf{S})|}{\#(\text{active sets})} \leq 2$$



#### What properties do F' and active sets have?





#### Initialization:

 $\begin{array}{c} \mathbf{x} \leftarrow \mathbf{0}, \mathbf{y} \leftarrow \mathbf{0} \\ \text{Iteration: while } \mathbf{x} \text{ not satisfiable} \\ \text{in parallel, raise every unfrozen } \mathbf{y_S} \text{ with} \\ \mathbf{S} \text{ minimal} \\ \text{stopped by tight constraint (e)} \\ \mathbf{x_e} \leftarrow \mathbf{1} \end{array}$ 

freeze ys in tight constraints

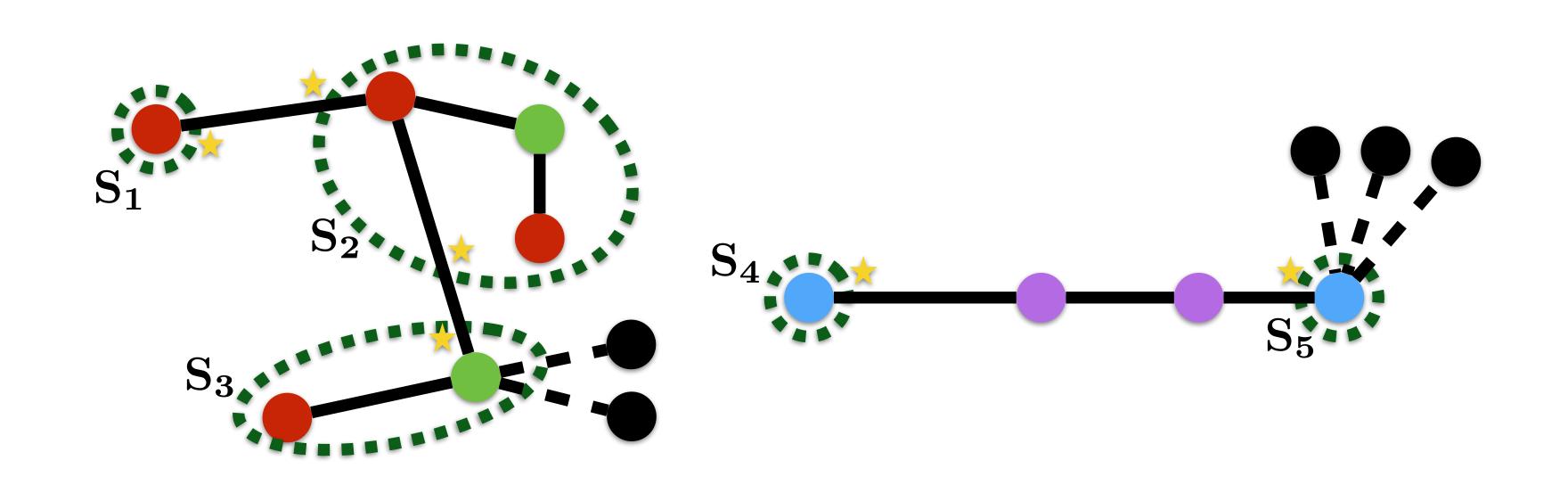
Pruning: let F={edges defined by x}

for each edge e of F in reverse order,

remove e if unnecessary

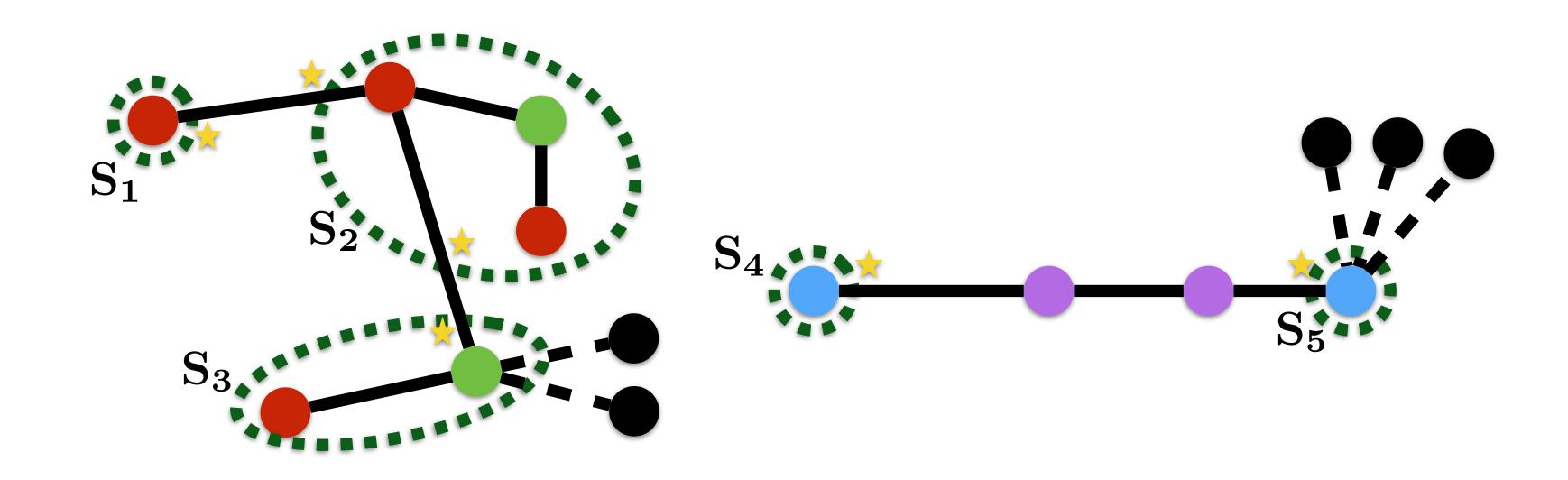
#### Properties of active sets

## active sets are disjoint subsets of nodes containing terminals



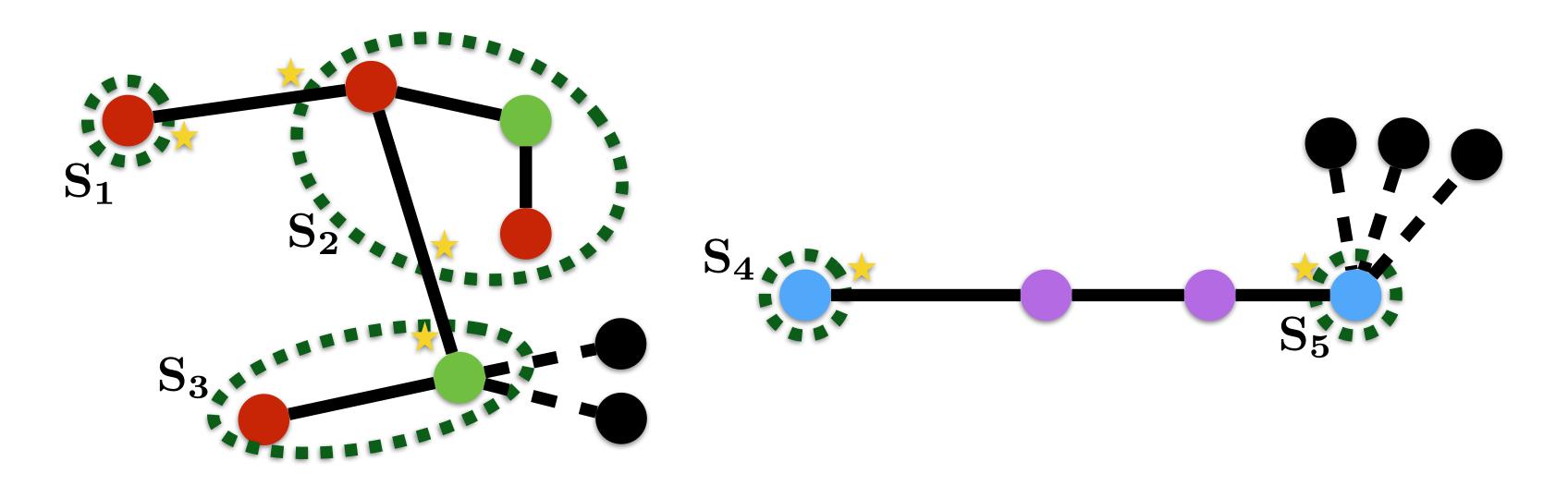
#### Properties of F'

#### F' is a forest and its leaves are terminals

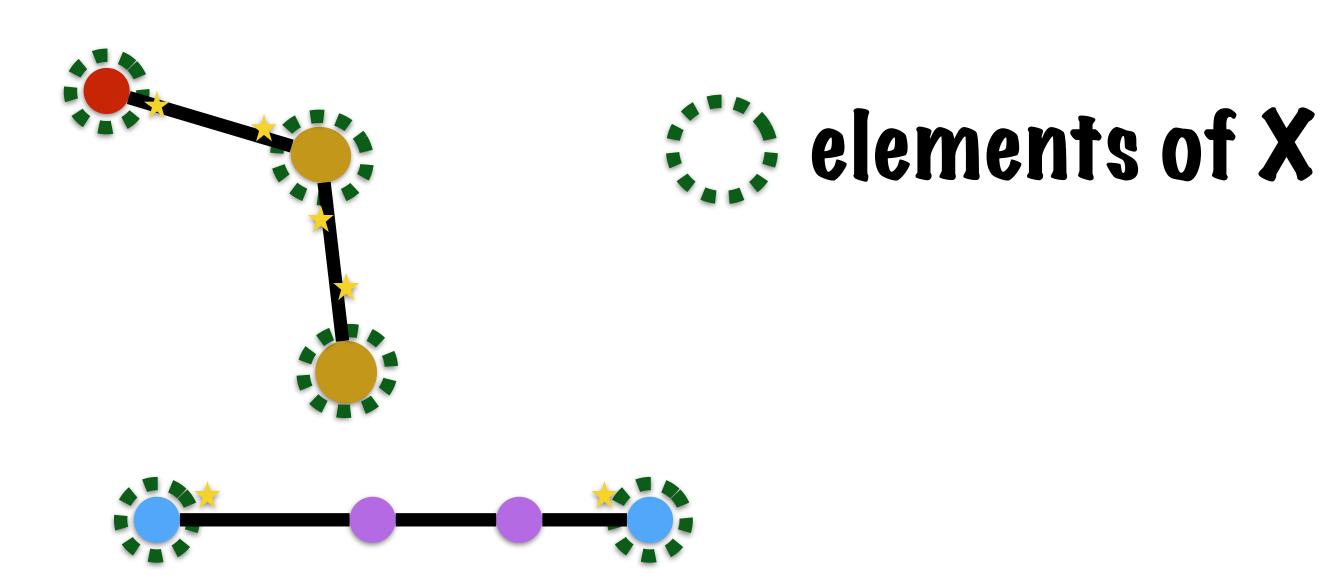


#### Joint properties of F' and of active sets

Consider a tree of F'
Assume it intersects some active sets
the active sets are subtrees
all the leaves are in active sets



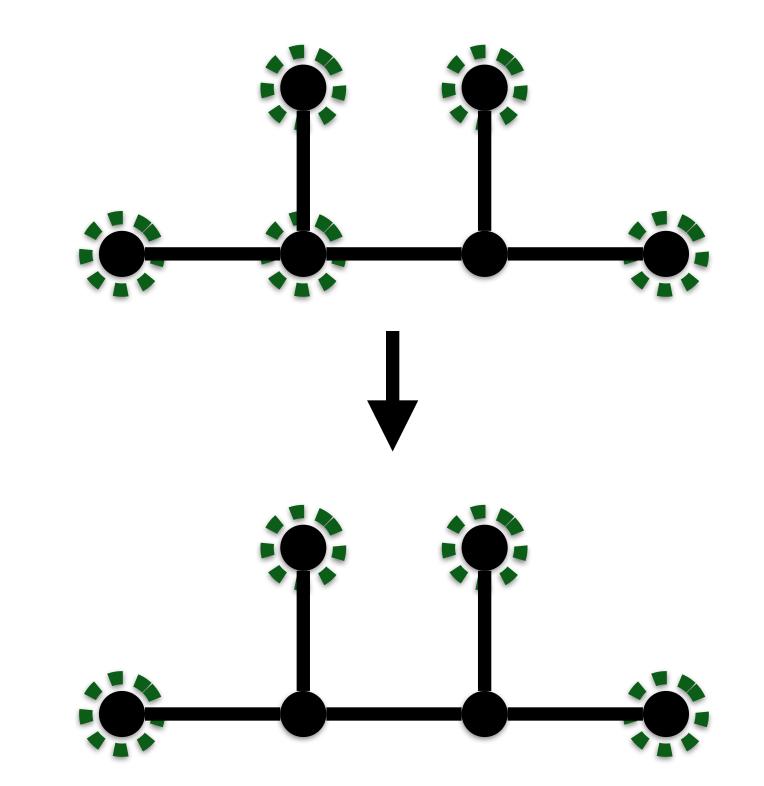
# Graph theory lemma Given a tree T and a subset X of its vertices that includes all the leaves: $\sum_{\mathbf{v} \in \mathbf{X}} \deg(\mathbf{v}) \leq 2 \cdot |\mathbf{X}|$



#### Graph theory lemma

T tree, X subset of vertices

including all leaves: 
$$\sum_{\mathbf{v} \in \mathbf{X}} \mathbf{deg}(\mathbf{v}) \leq 2 \cdot |\mathbf{X}|$$



#### Proof: induction

- true for X=V

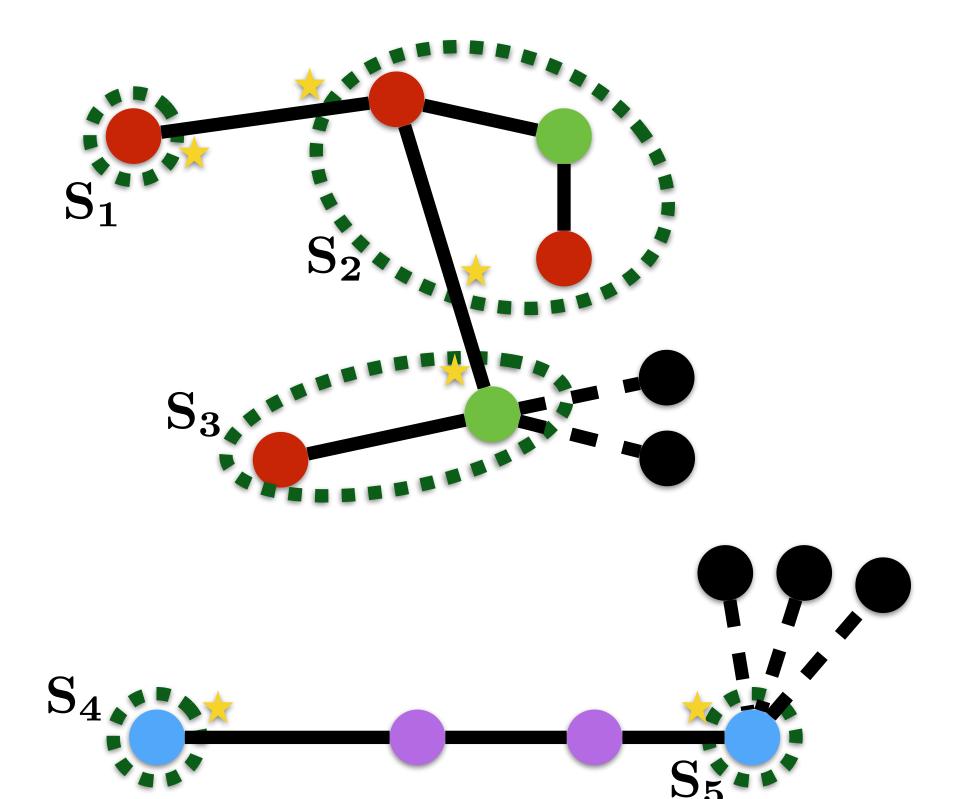
$$\sum_{\mathbf{v} \in \mathbf{V}} \mathbf{deg}(\mathbf{v}) = 2|\mathbf{E}| = 2(|\mathbf{V}| - 1) < 2 \cdot |\mathbf{V}|$$

- if true for X then remains true when removing an internal node from X, QED.

#### Lemma

#### F'output forest

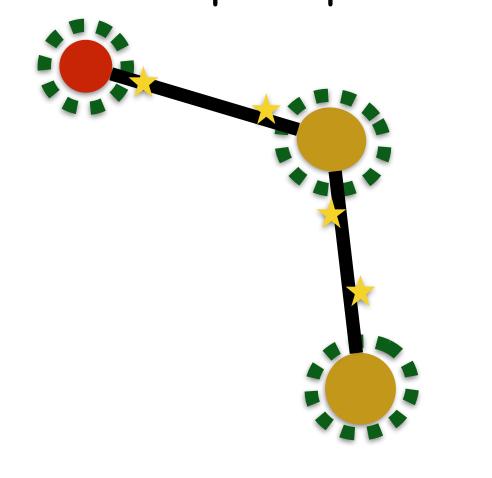
$$\frac{\sum_{\text{S active}} |\mathbf{F}' \cap \delta(\mathbf{S})|}{\#(\text{active sets})} \leq 2$$

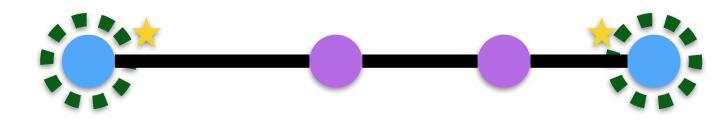


#### Graph theory lemma

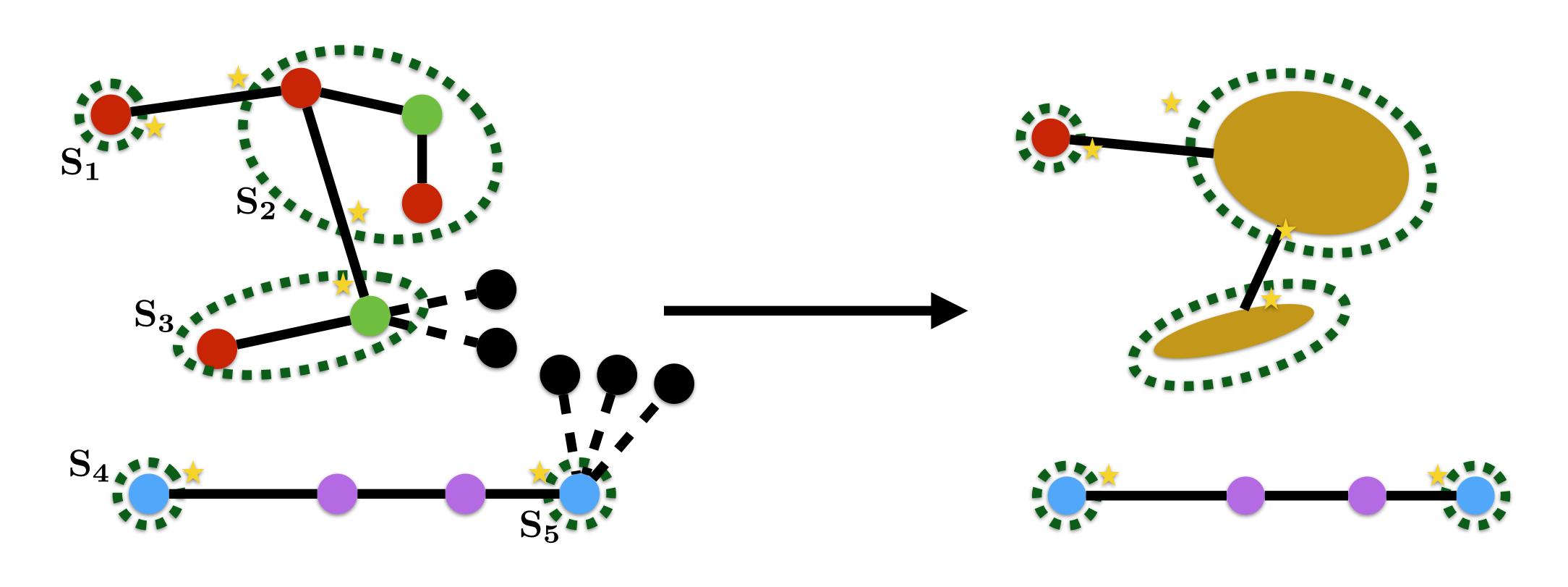
T tree, X subset of vertices including all leaves:

$$rac{\sum_{\mathbf{v} \in \mathbf{X}} \mathbf{deg}(\mathbf{v})}{|\mathbf{X}|} \leq 2$$





Lemma F'output forest: 
$$\frac{\sum_{S \text{ active}} |F' \cap \delta(S)|}{\#(active \text{ sets})} \leq 2$$



#### Contracting active sets does not change

 $\sum_{\mathbf{S} \text{ active}} |\mathbf{F}' \cap \delta(\mathbf{S})|$  nor  $\#(\mathbf{active sets})$ 



#### Result:

## a 2-approximation algorithm for the Steiner forest problem Comments

- extends: connectivity problems, and beyond
- primal-dual is greedy
  - dual gives insight
- post-processing can be necessary
- combinatorial: LPs are guides, not computational tools

### Steiner forest

