

# Covering Graphs Using Trees and Stars

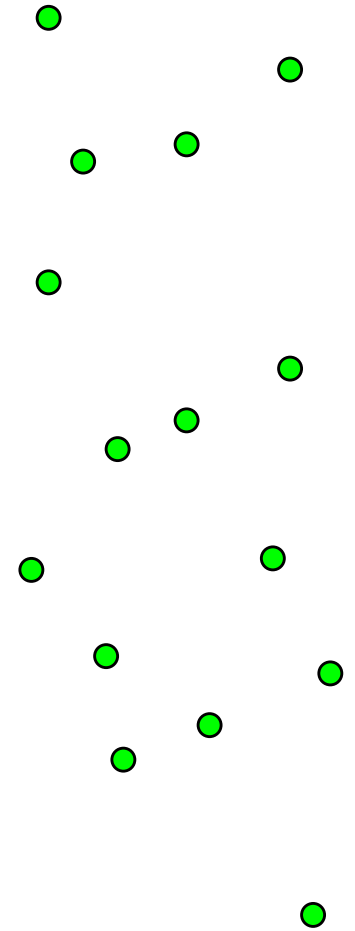
Guy Even (Tel-Aviv), Naveen Garg (Delhi),  
and

Jochen Könemann, R. Ravi and A. Sinha (Pittsburgh)

Third Haifa Workshop on Interdisciplinary Applications of Graph Theory, Combinatorics  
and Computing

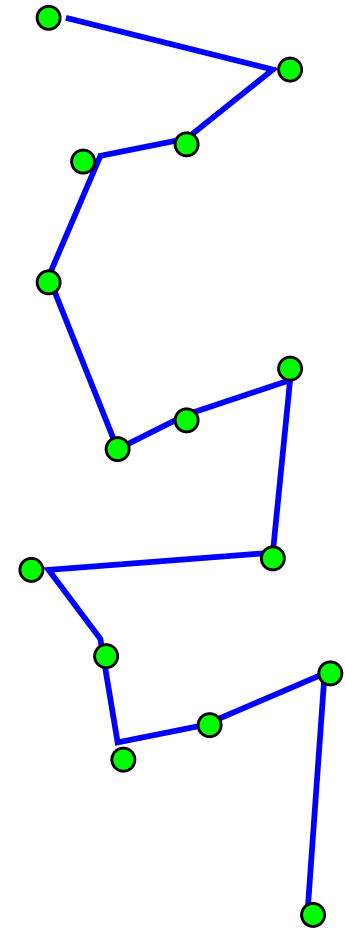
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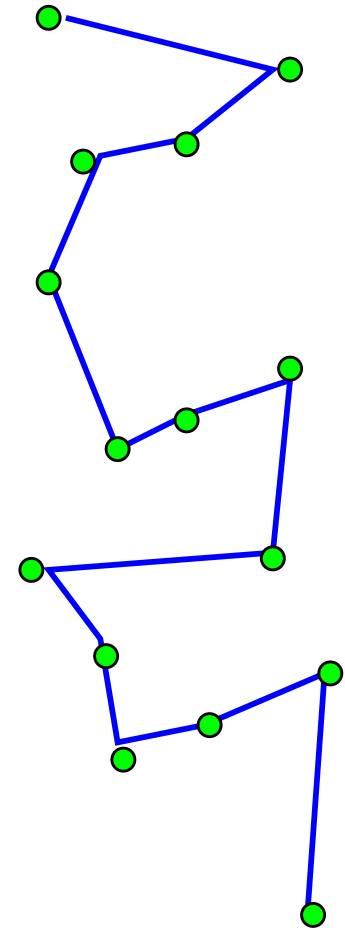
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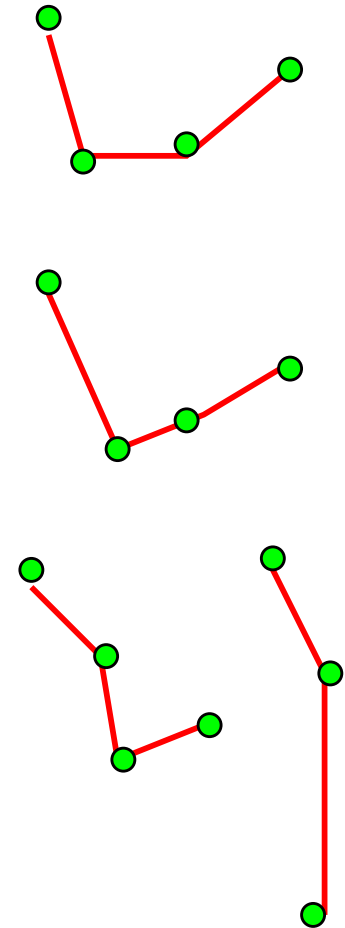
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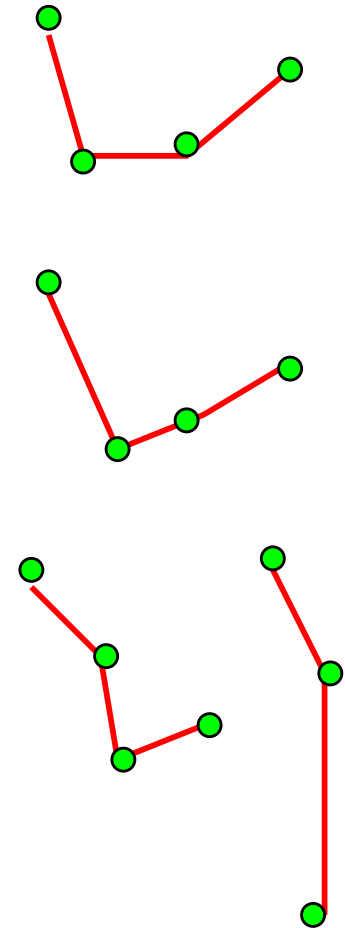
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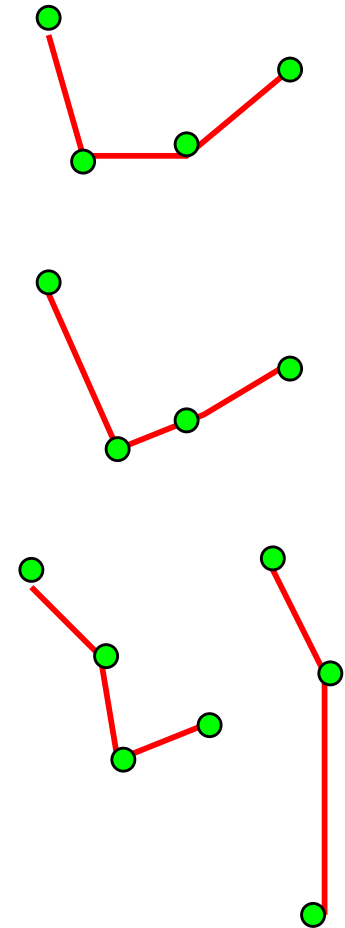
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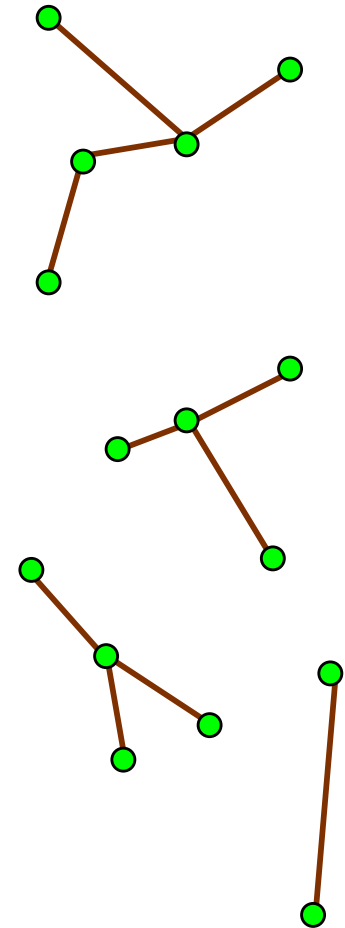
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- MST is a constant ratio approx of a min tour  $\Rightarrow$   $k$ -Tree Cover Problem.

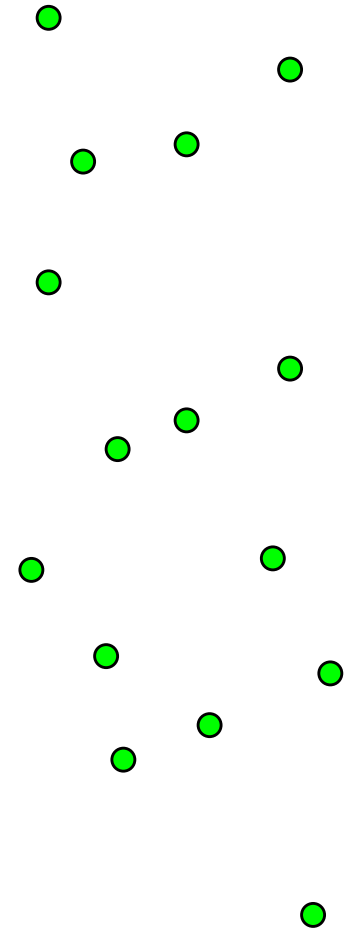




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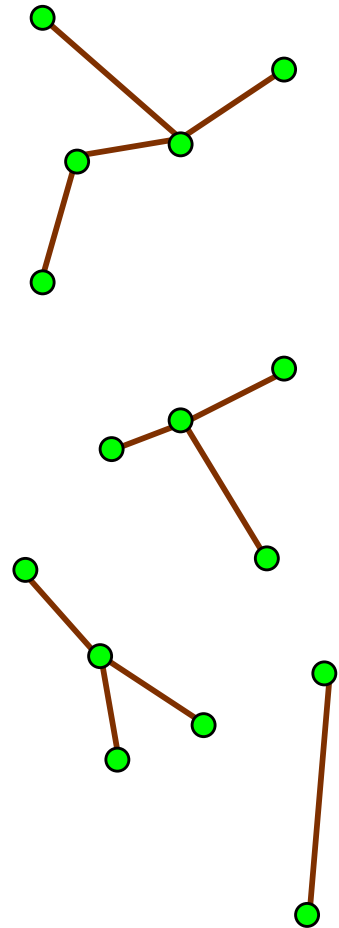
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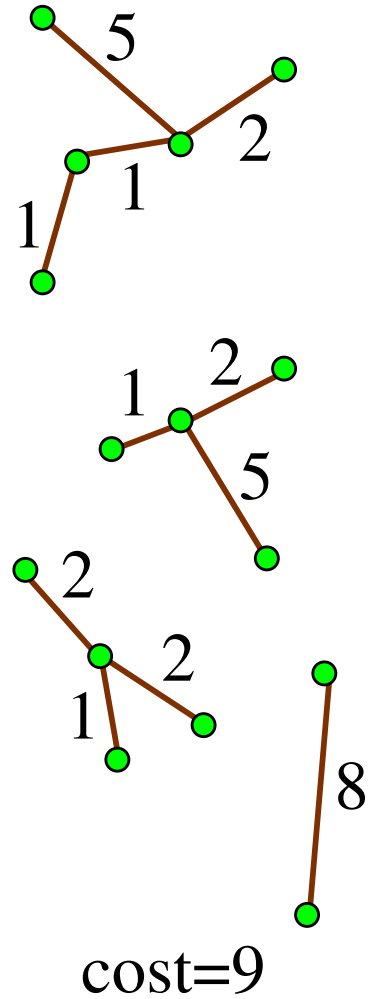


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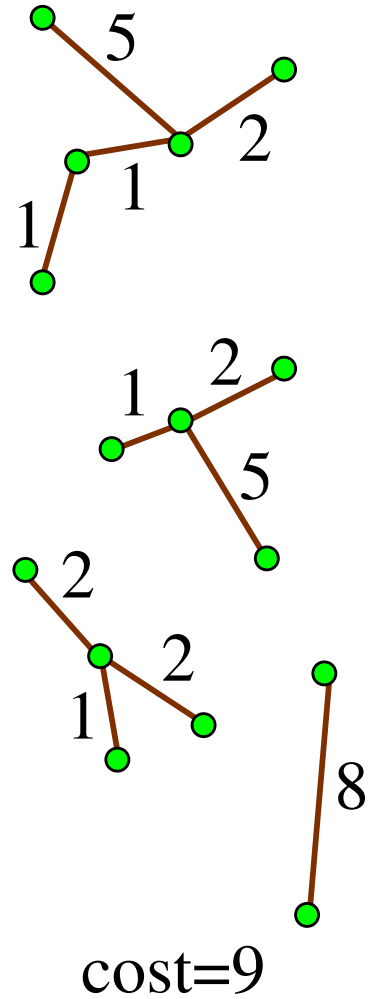
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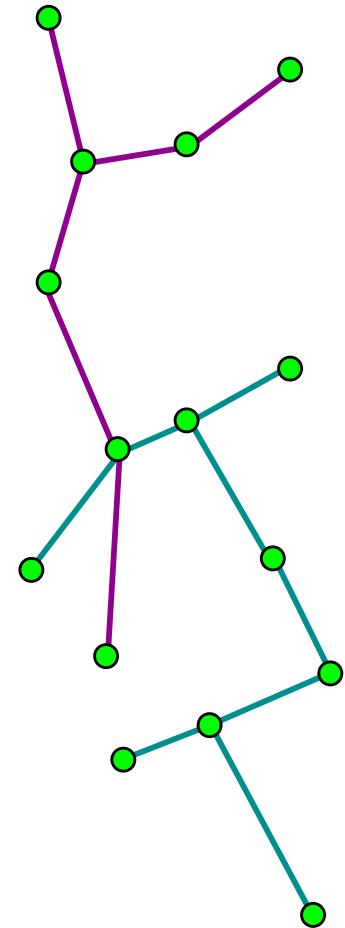
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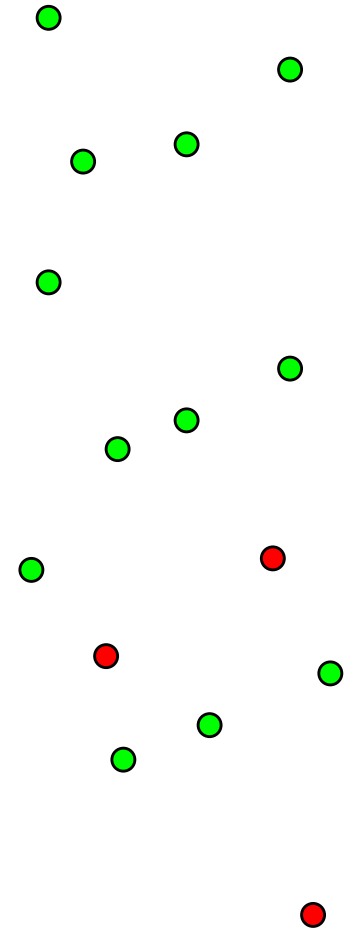
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**remark :** trees may share nodes & edges in a tree cover.



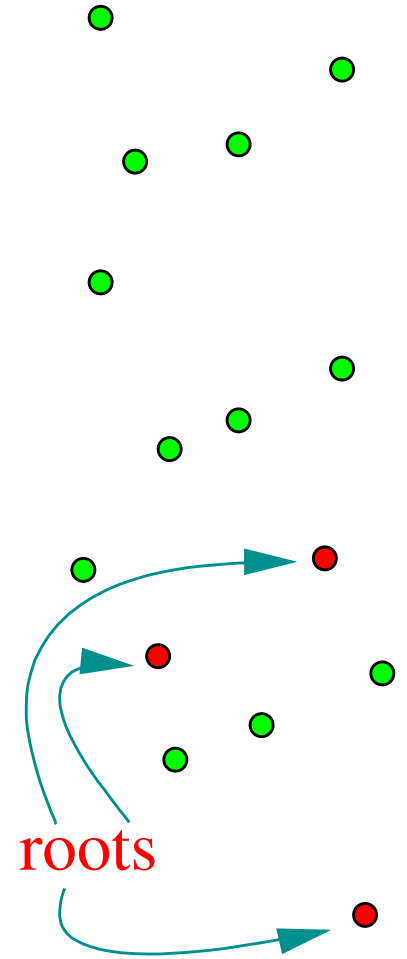
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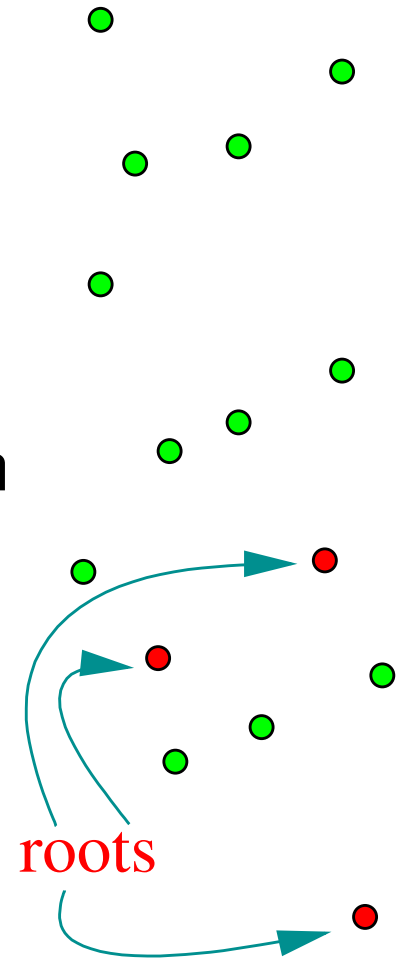
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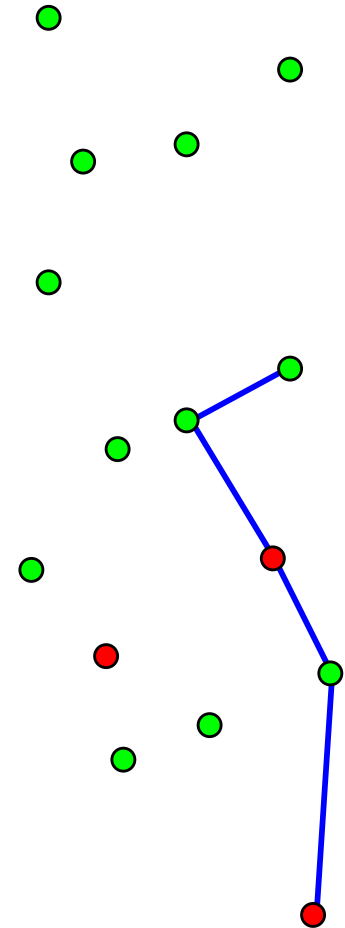
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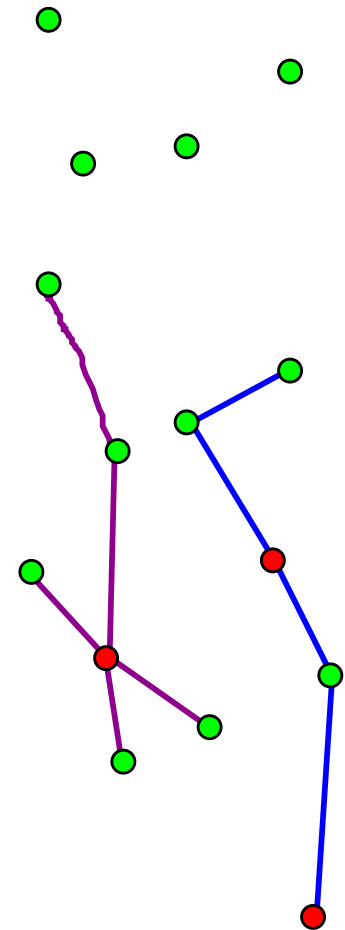
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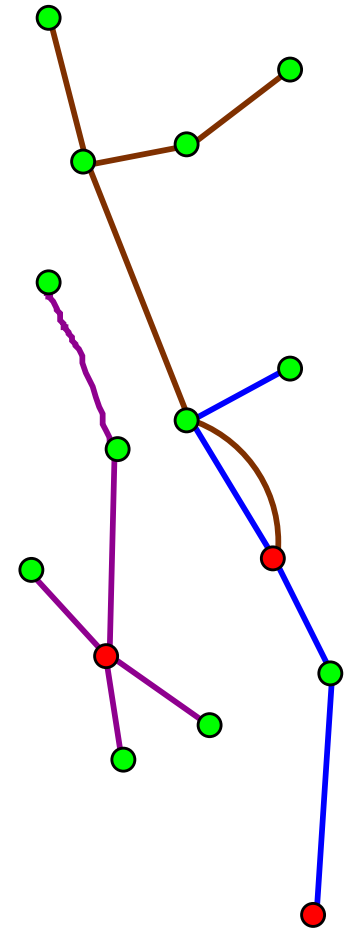
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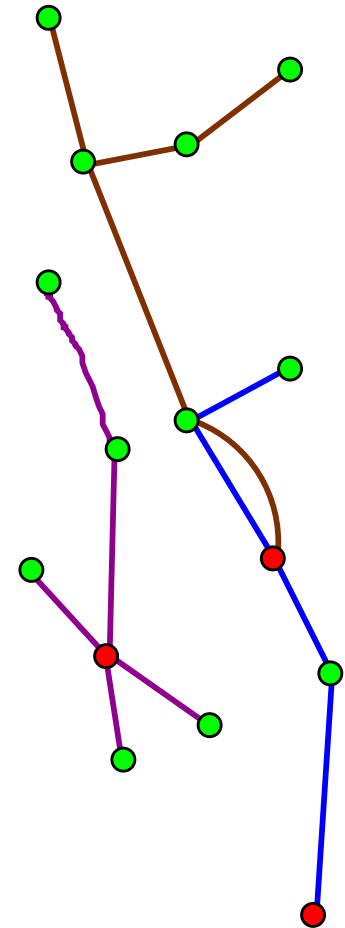
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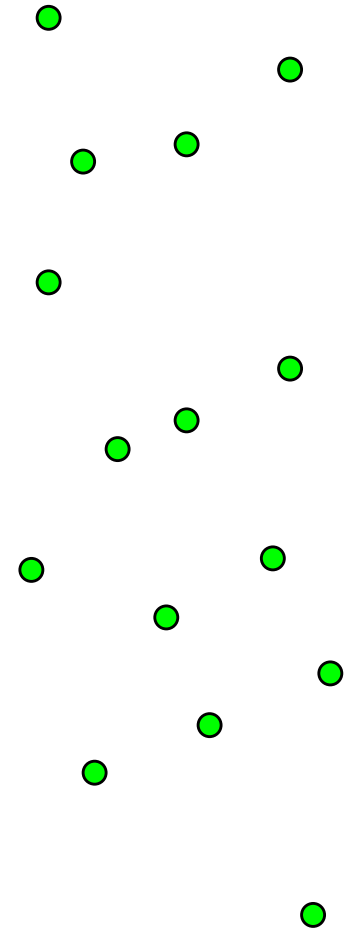
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**motivation :** agents start their tour in different locations.



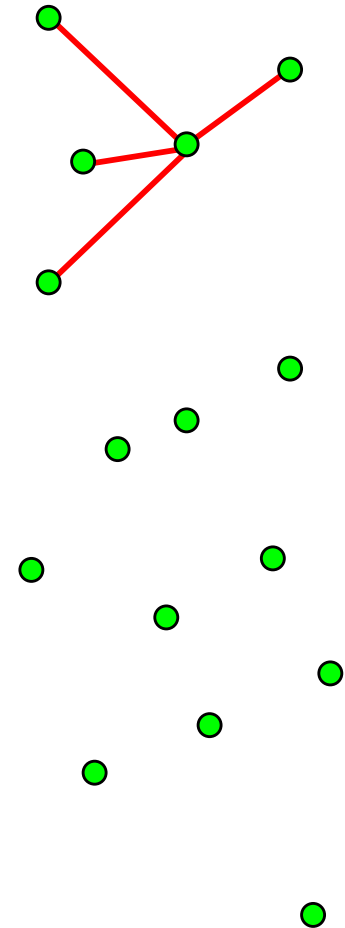
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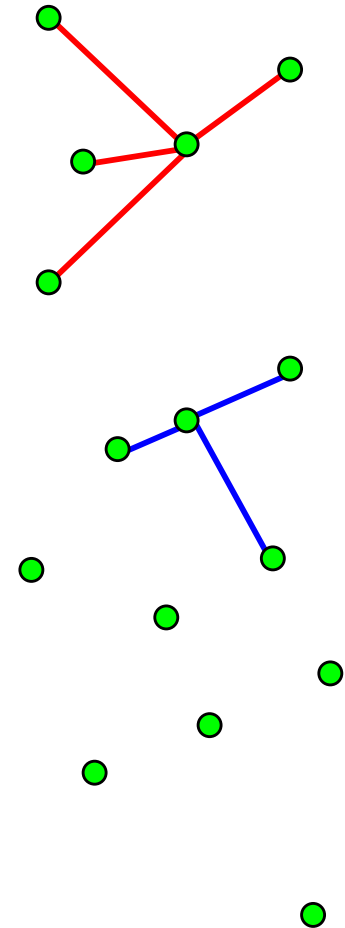
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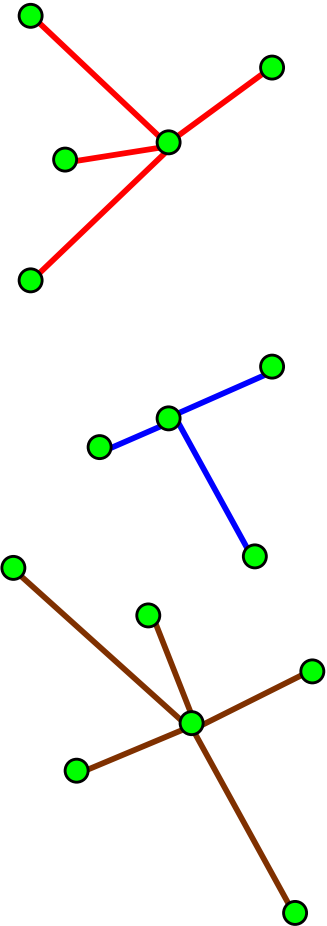




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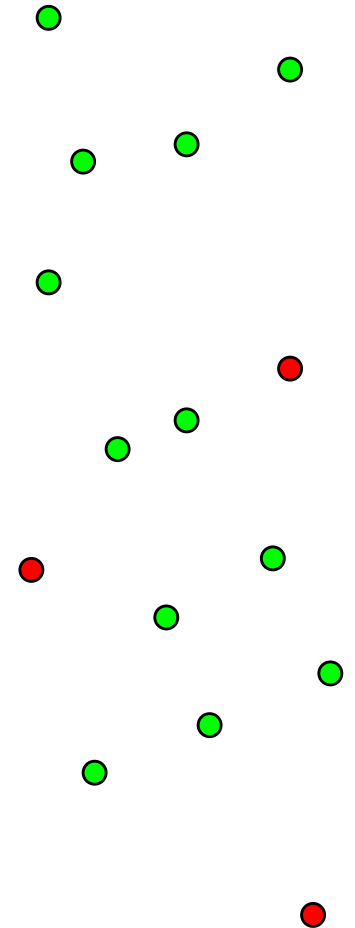


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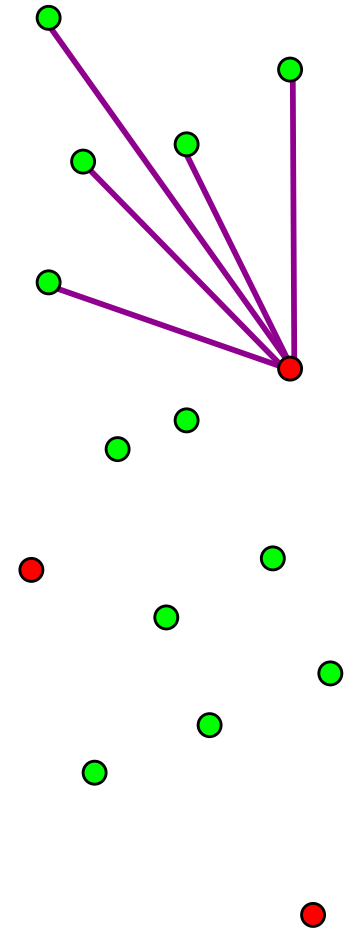


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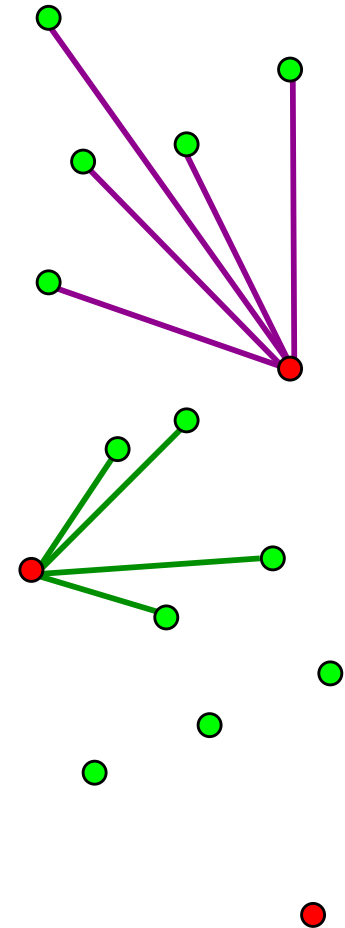


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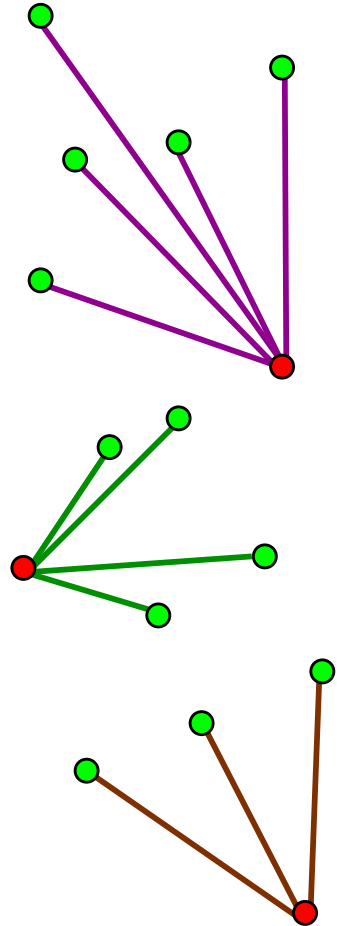


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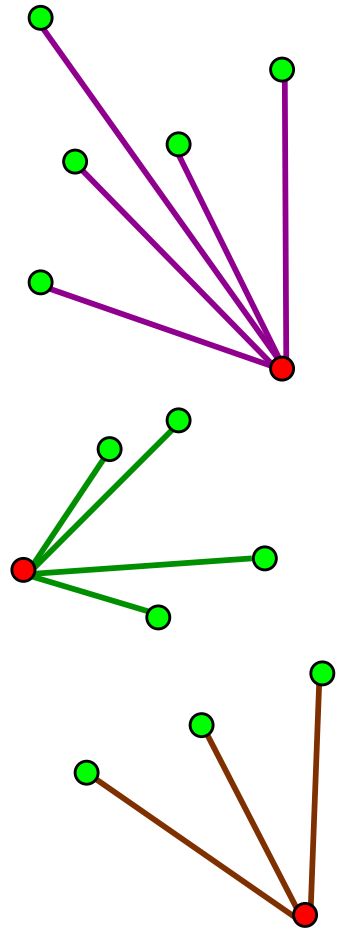
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**motivation :** agents must return to base after each visit.



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- **Vehicle Routing**: Vast amount of work, e.g. Survey [Toth, Vigo, 2002]

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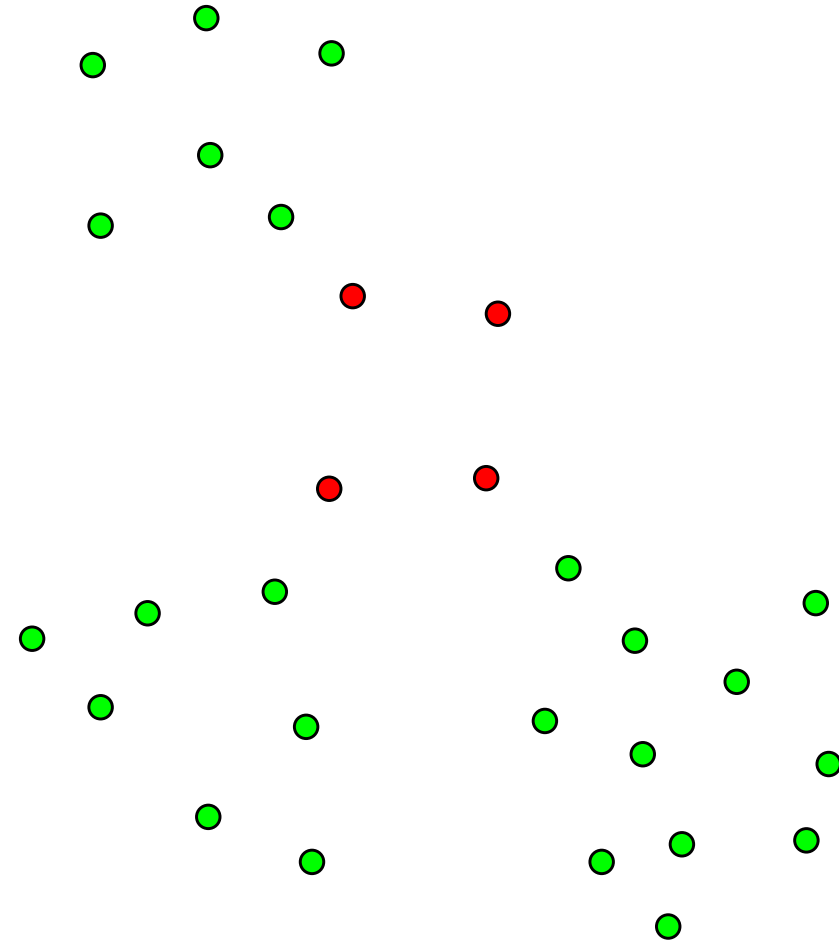
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  - Rooted version: equivalent to min. makespan of  $k$  machines and  $n$  jobs. 2-approximation of [Shmoys & Tardos, 1993].

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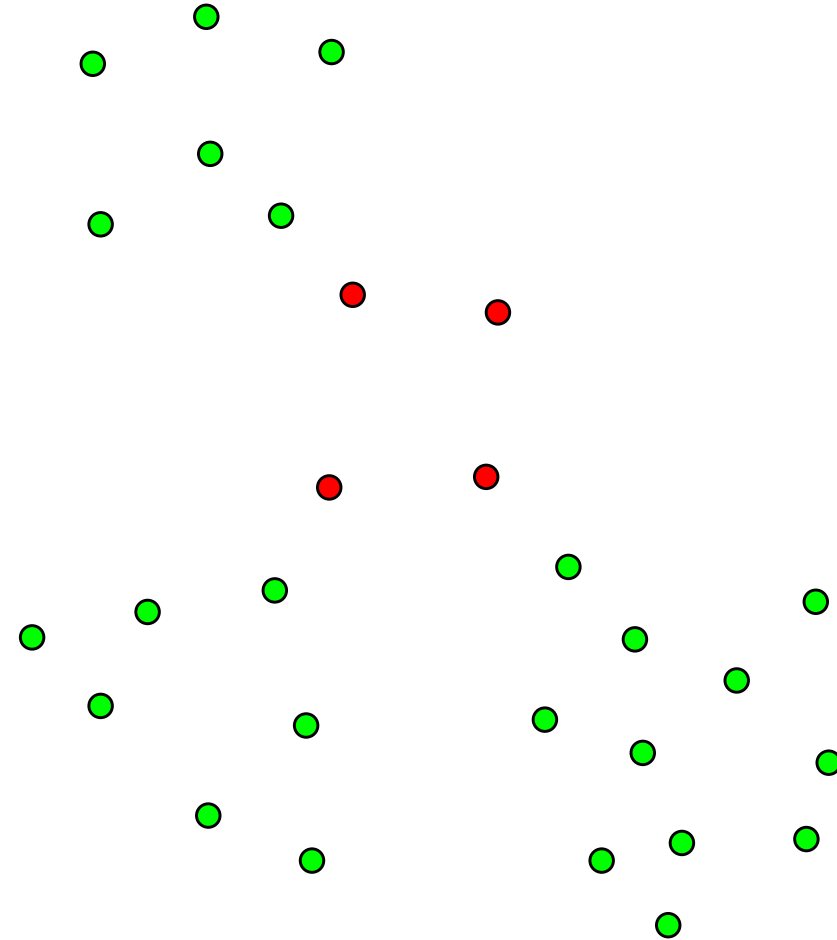
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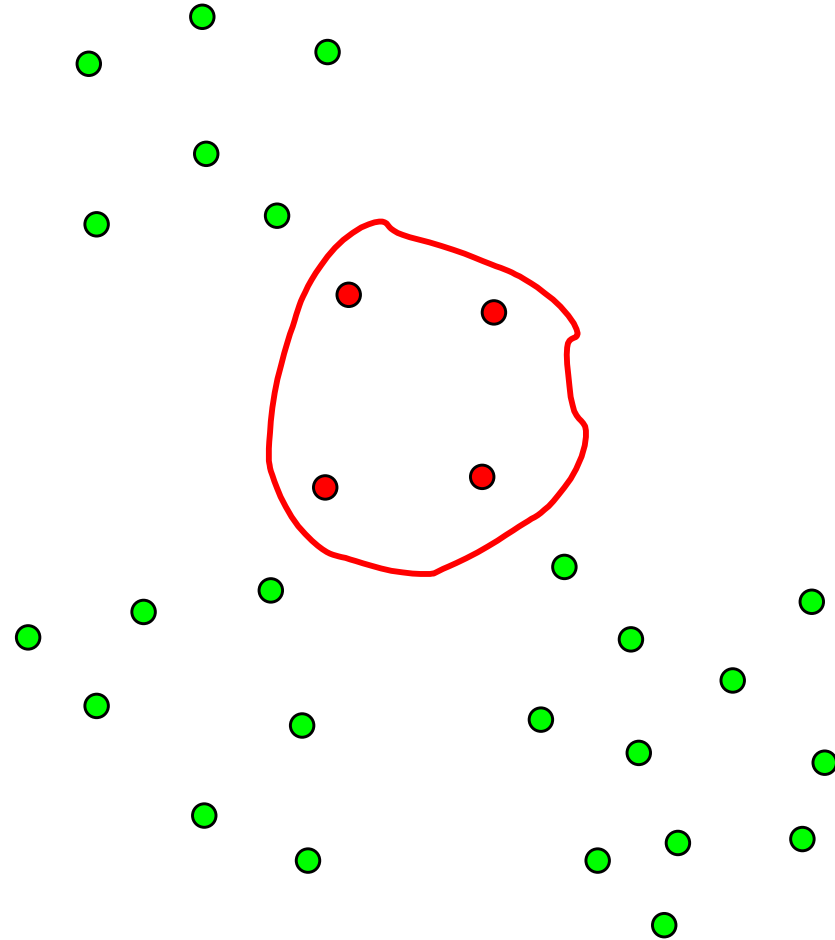
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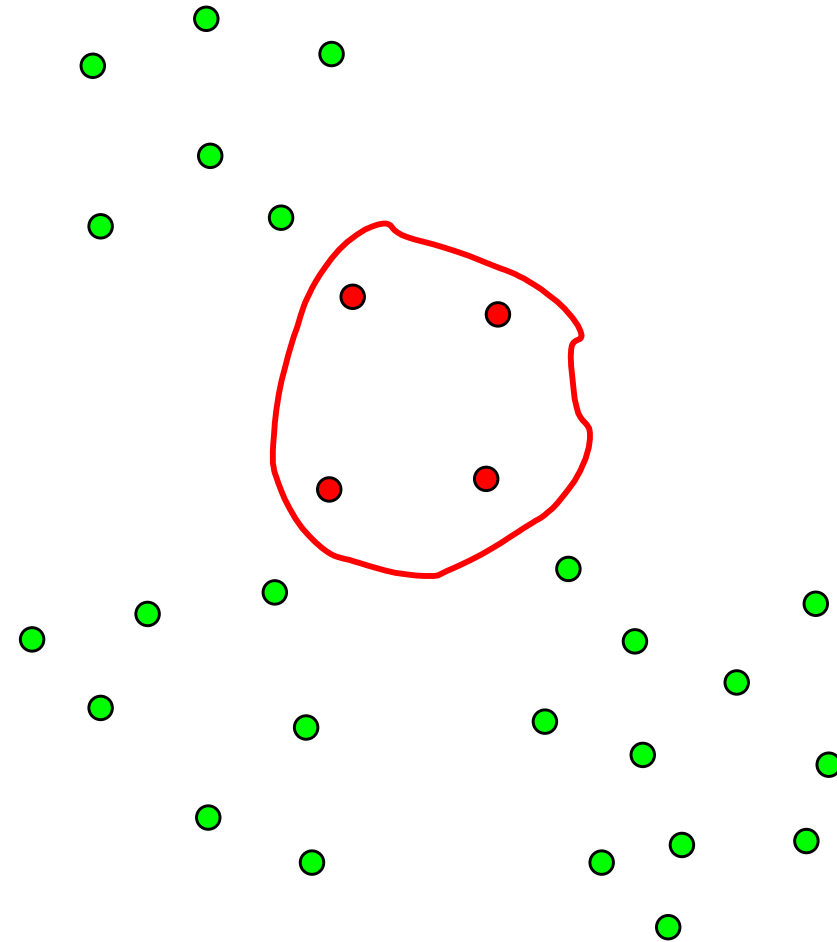
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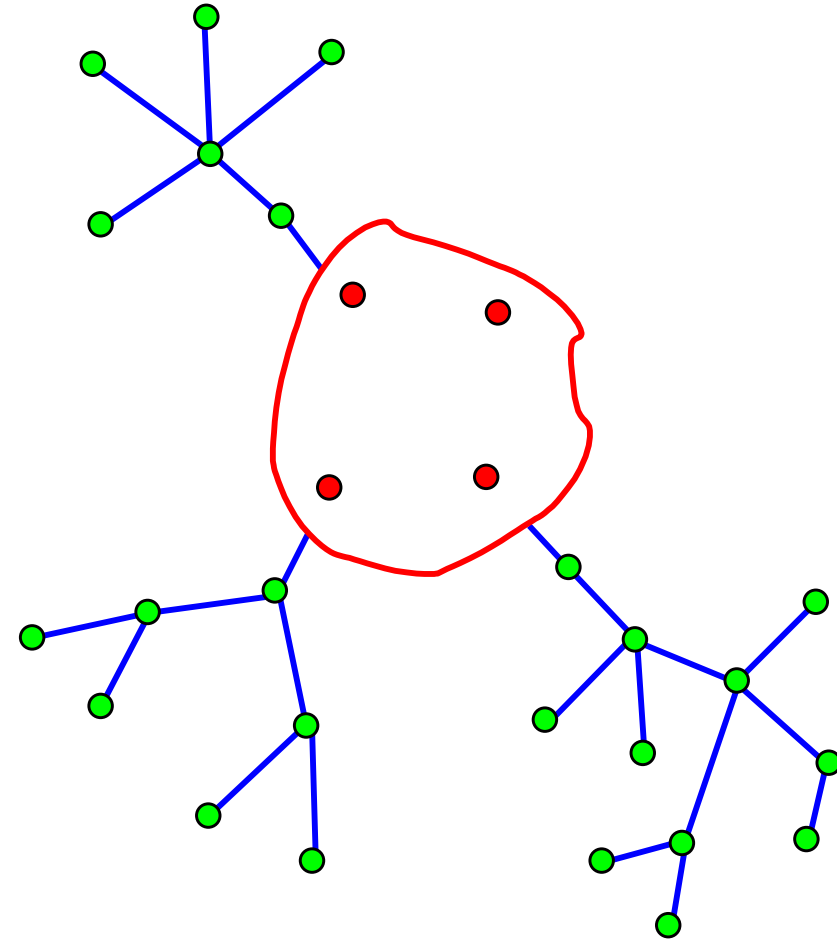
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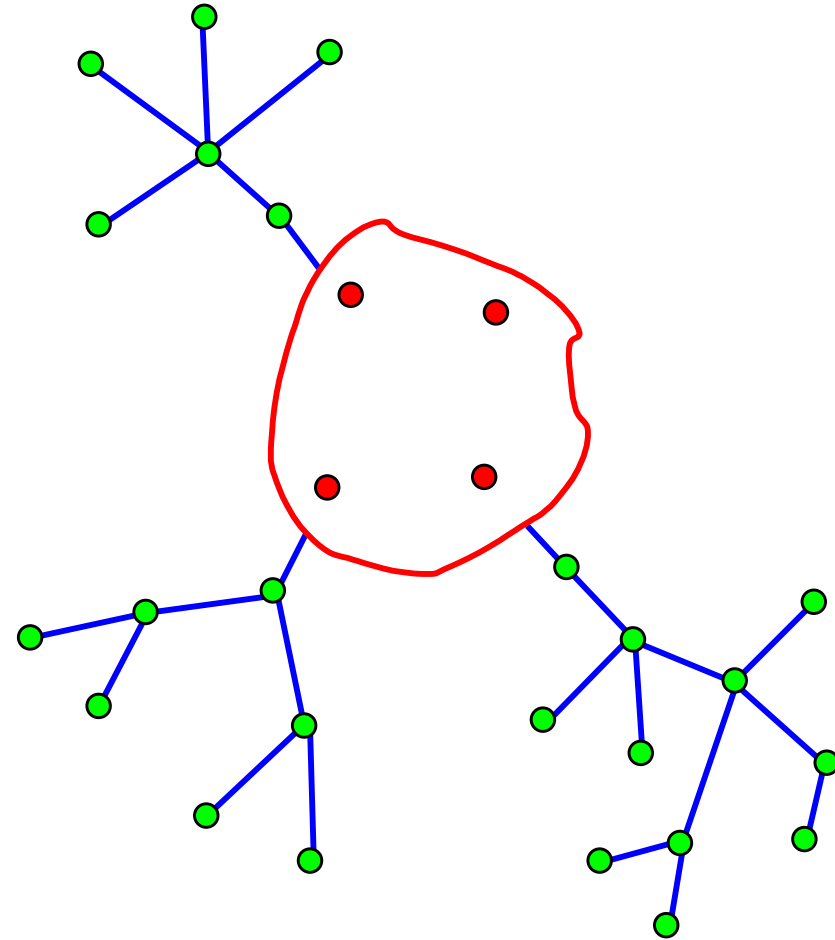




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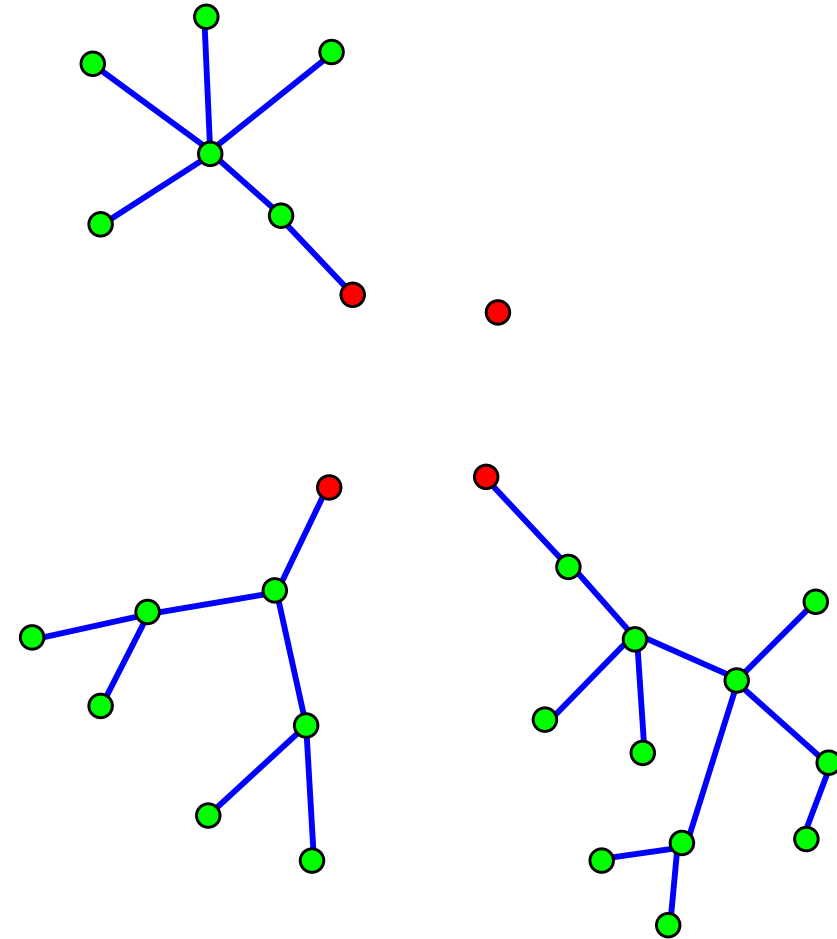
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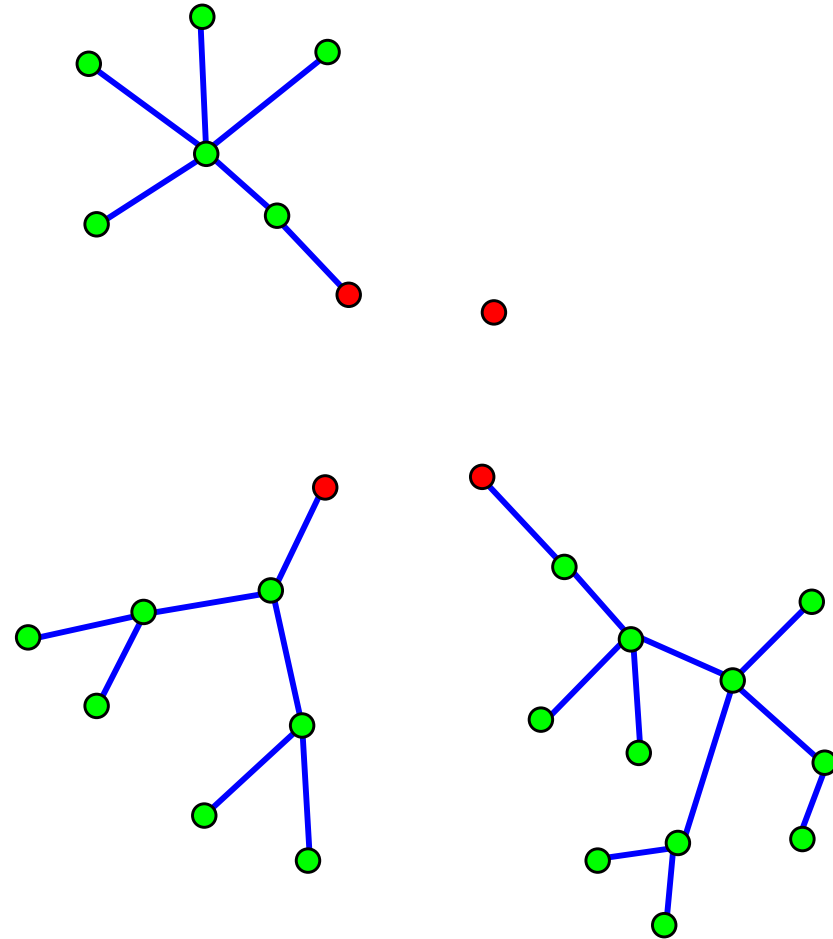
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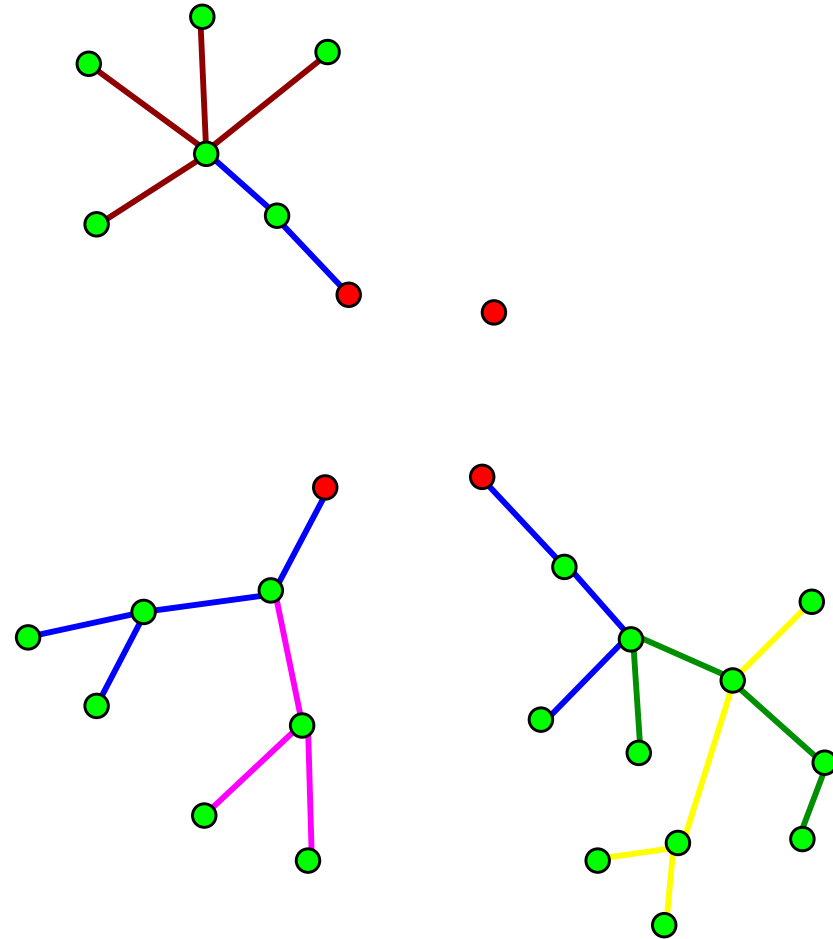
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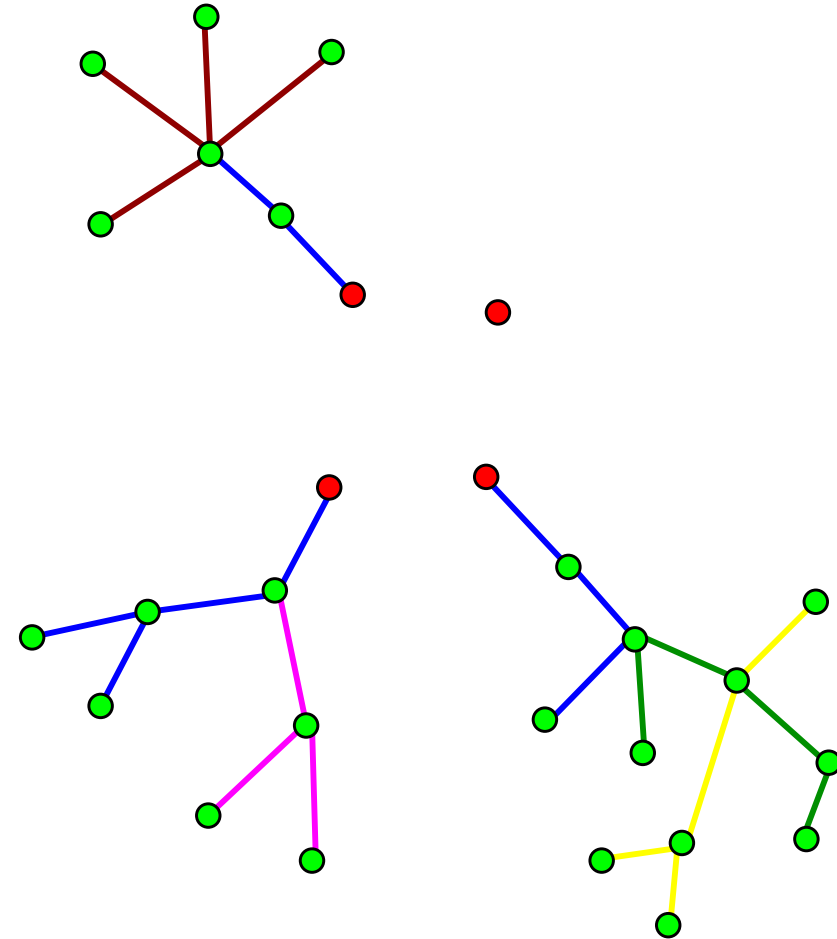
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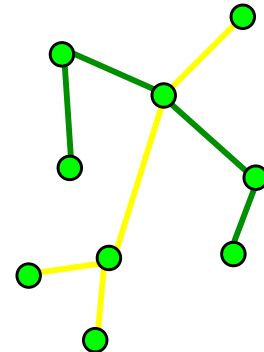
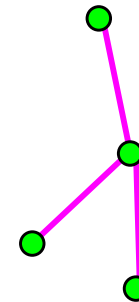
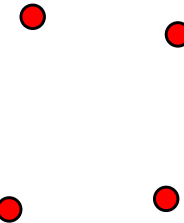
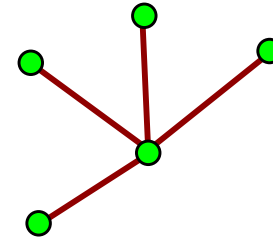
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5. max match subtrees to roots (if  $\text{dist} \leq B$ ).



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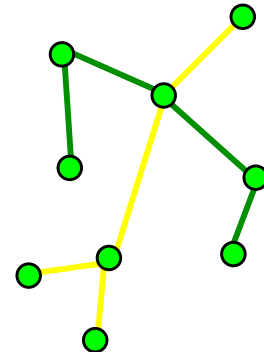
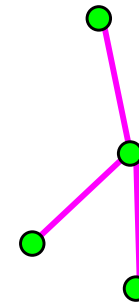
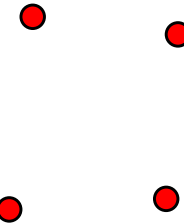
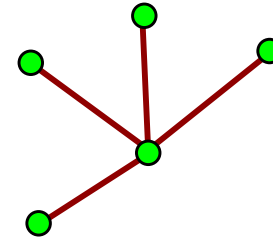
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2. compute MST.
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# approximation algorithm: $k$ -rooted tree cover

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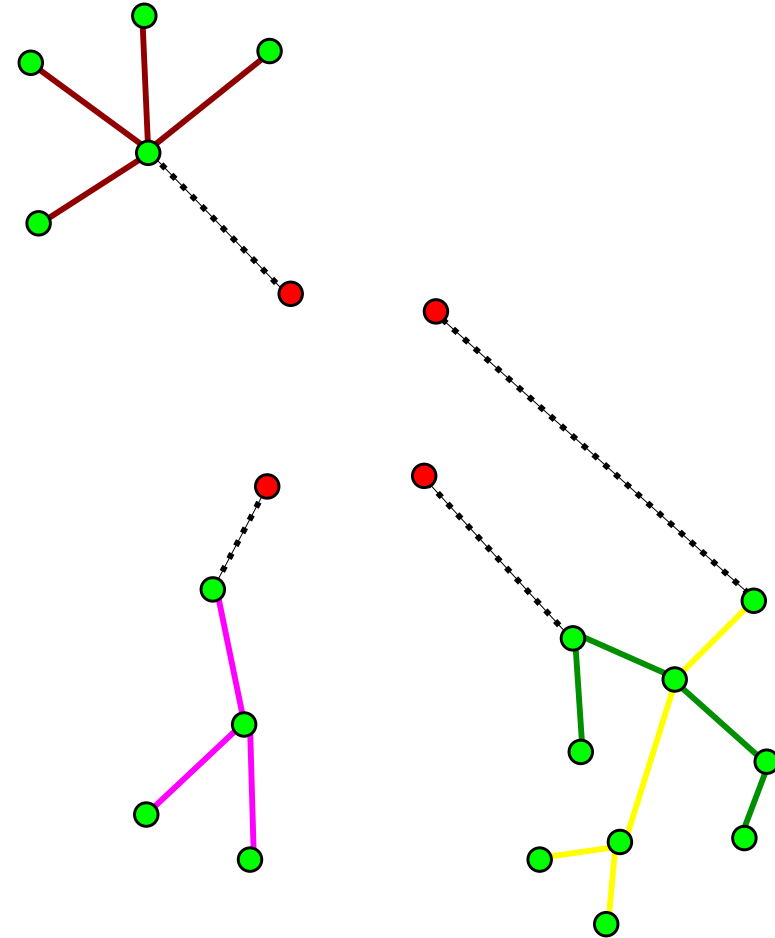
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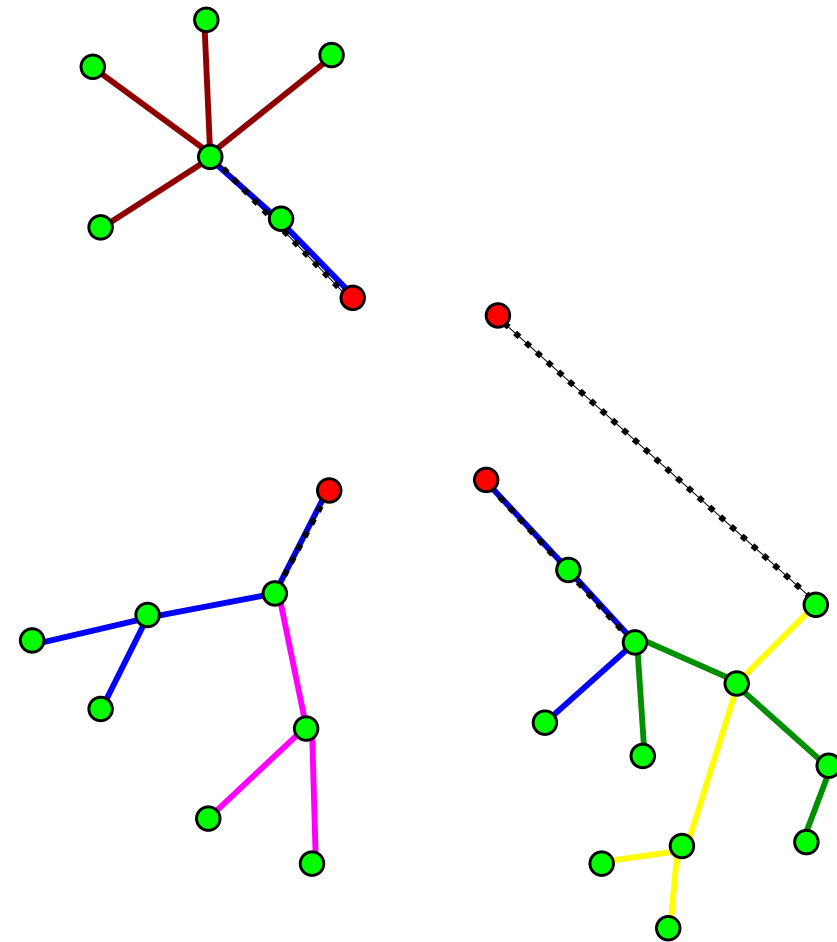




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$\Rightarrow$  weight of every tree in solution is  $< 4 \cdot B$ .

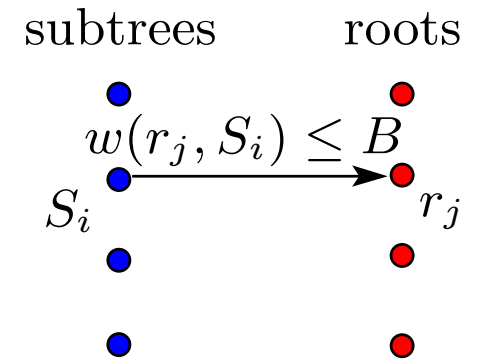
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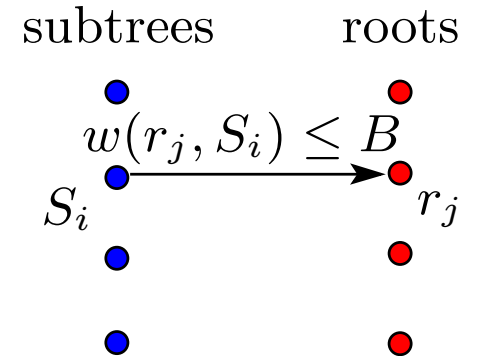
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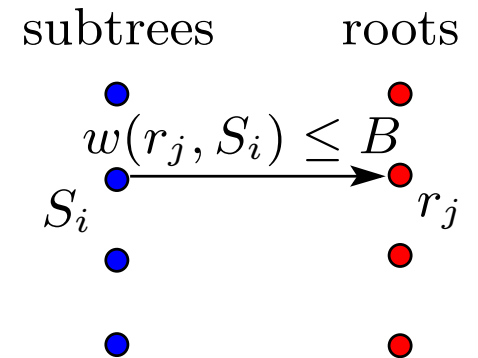
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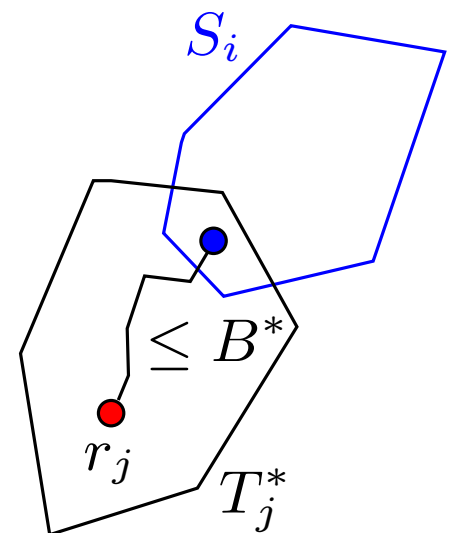
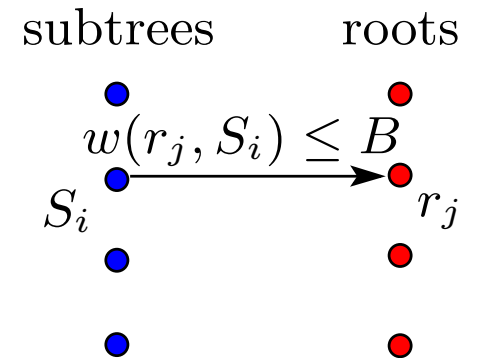
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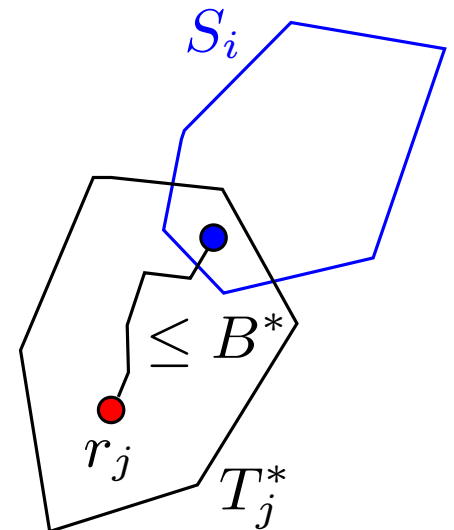
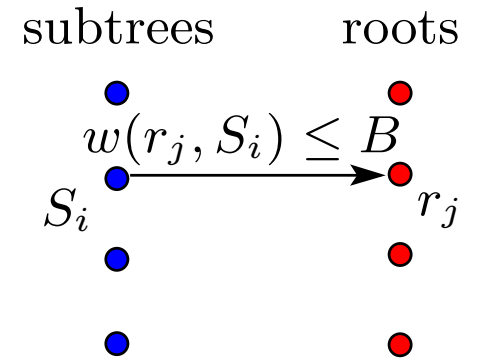
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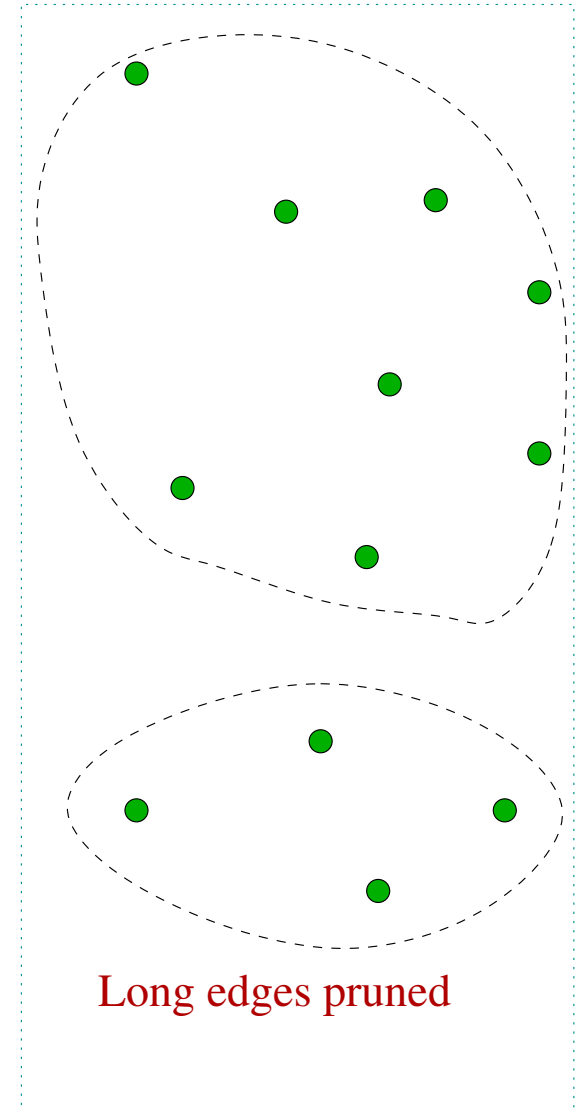
But

$$T' \triangleq MST + \mathcal{T}^*(\mathcal{S}) - \mathcal{S}$$

is a spanning tree and  $w(T') < w(MST)$ , contradiction. QED

# Algorithm for Unrooted $k$ -tree cover

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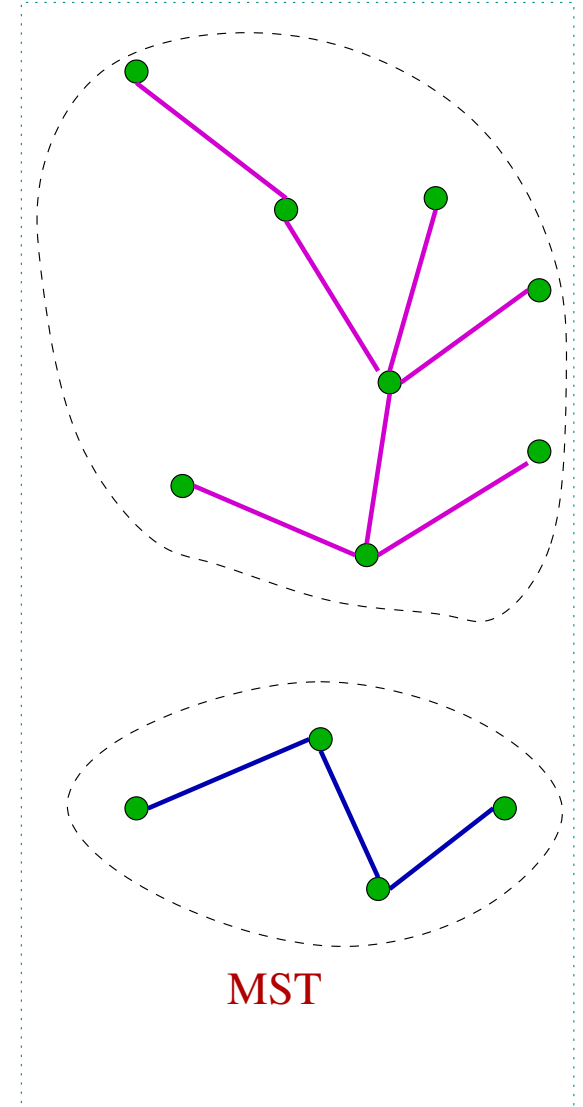


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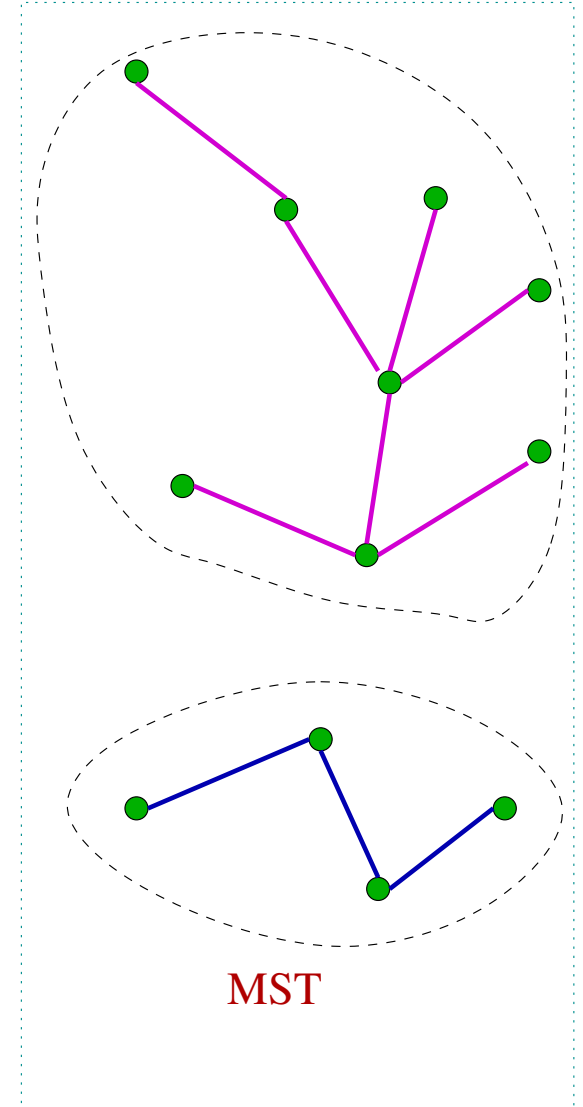
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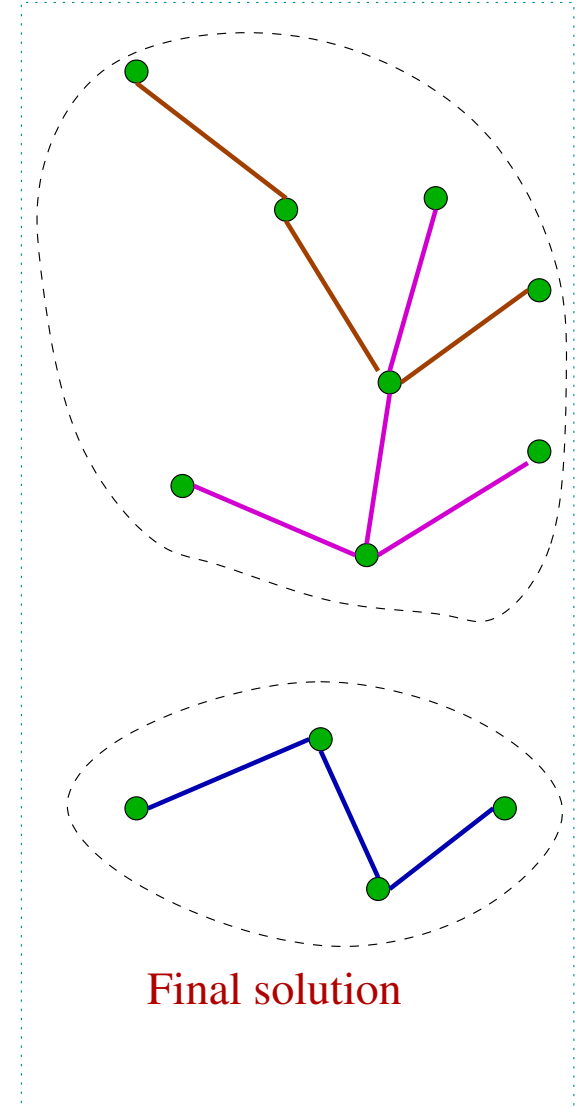
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