

# Exact Algorithms

Sommer Term 2020

## Lecture 8. Finding Trees and Partitioning Numbers

Based on: [Exact Exp. Algos: §9.1, Param. Algos: §10.1.2]

Trees: see [J. Nederlof, Algorithmica (2013) 868–884. <https://doi.org/10.1007/s00453-012-9630-x>]

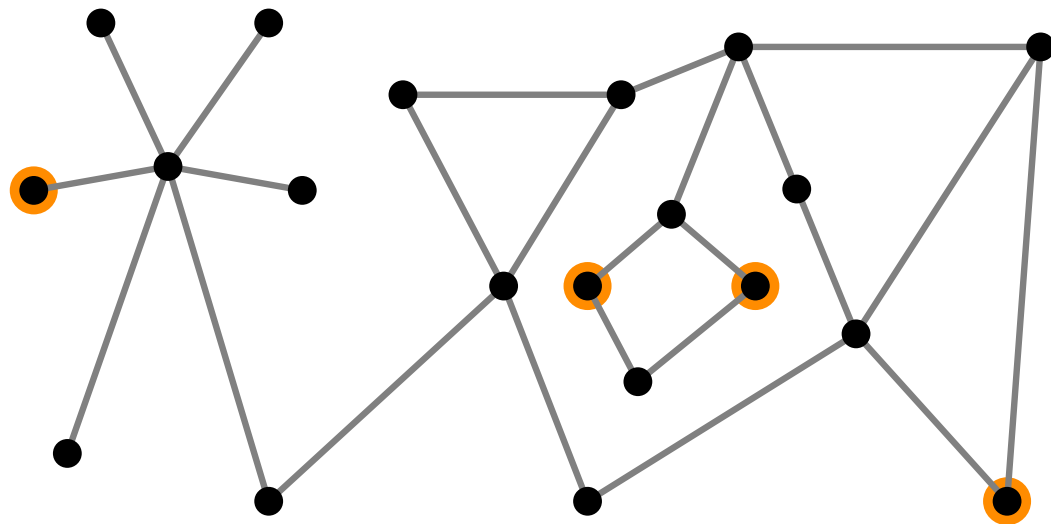
(slides by J. Spoerhase, Th. van Dijk, S. Chaplick, and A. Wolff)

# Steiner Tree Problem

**Given:** Graph  $G = (V, E)$ , terminals  $K \subseteq V$ , number  $c$

**Question:** Does there exist a subtree  $(V', E')$  of  $G$  such that

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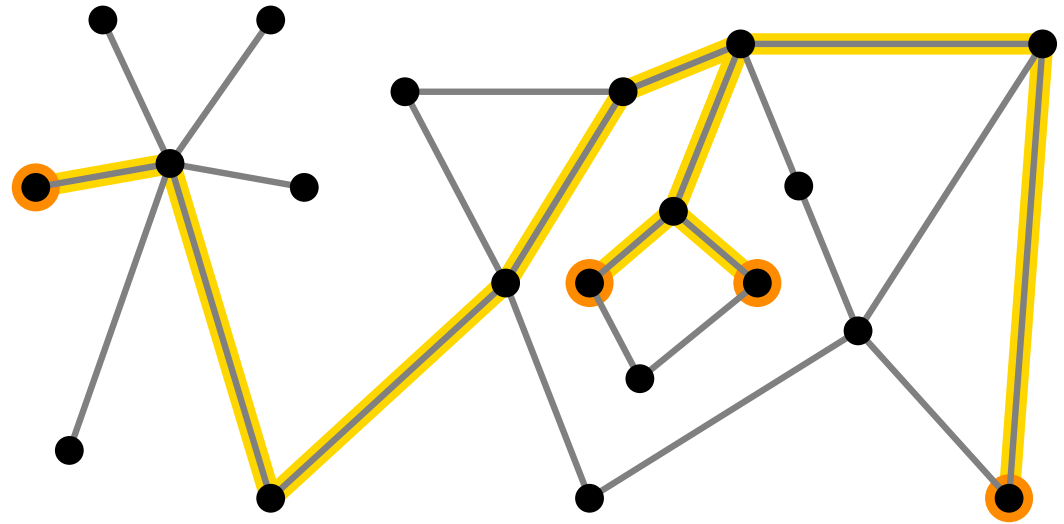


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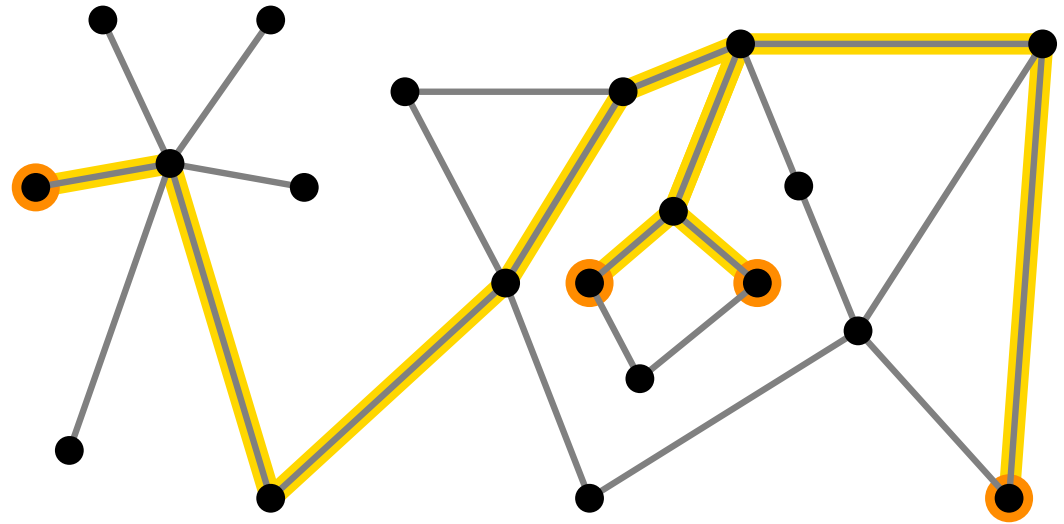


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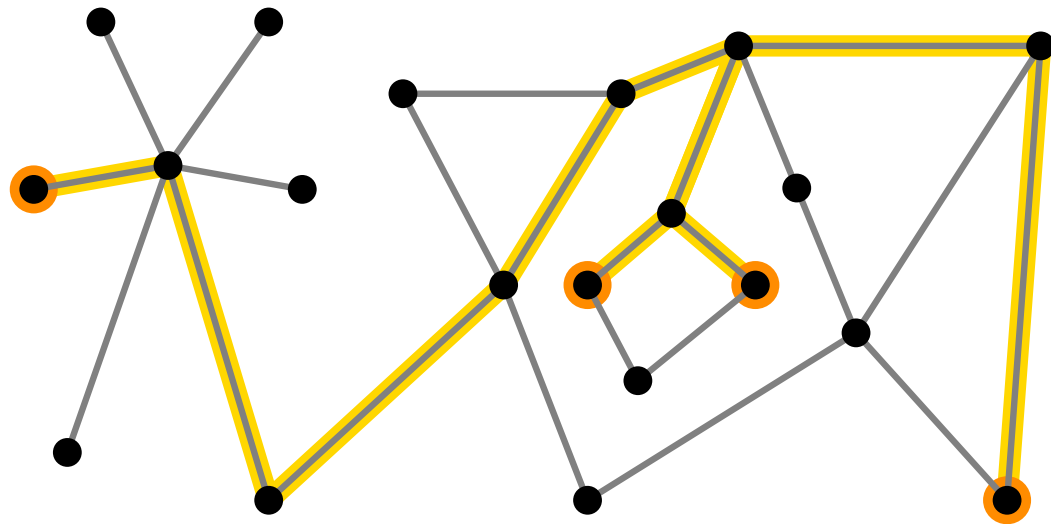
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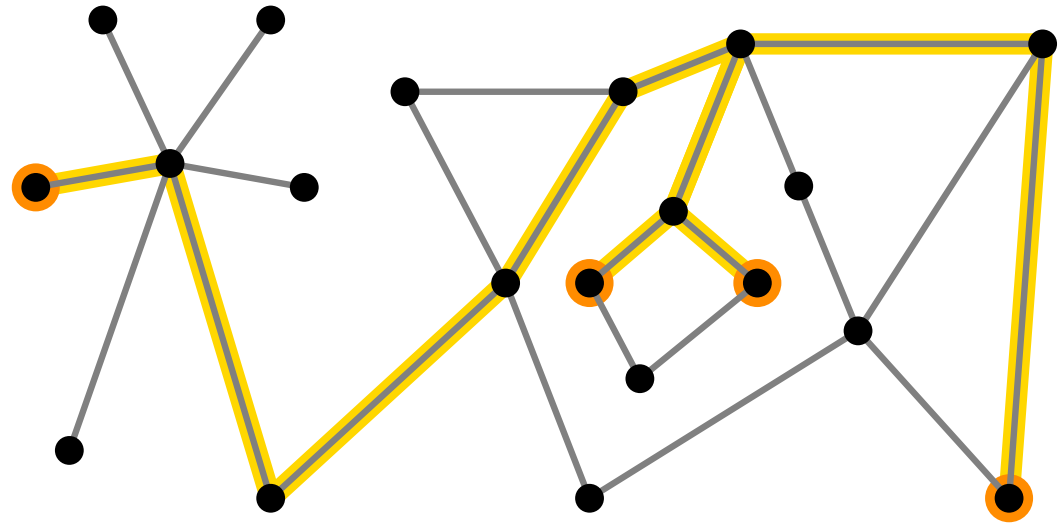
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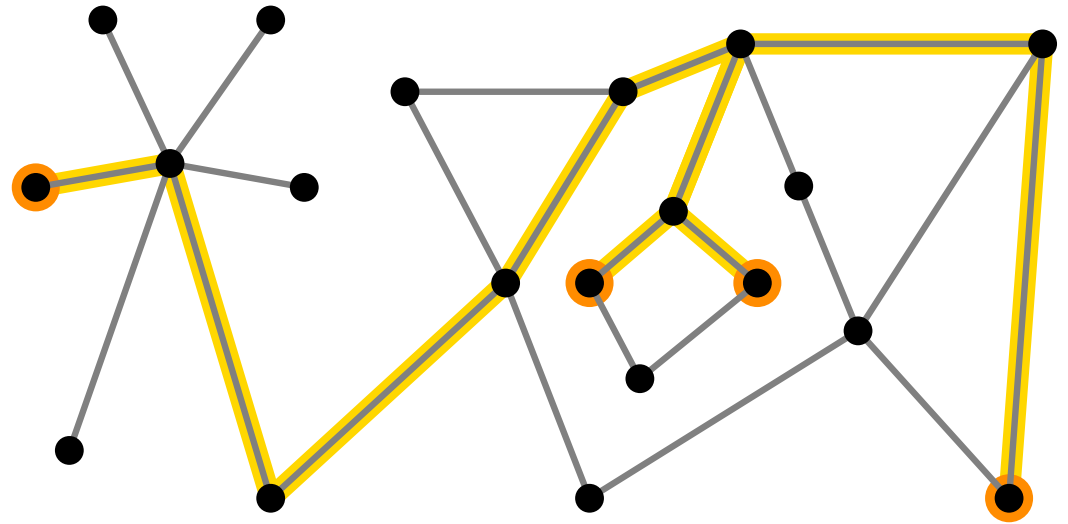
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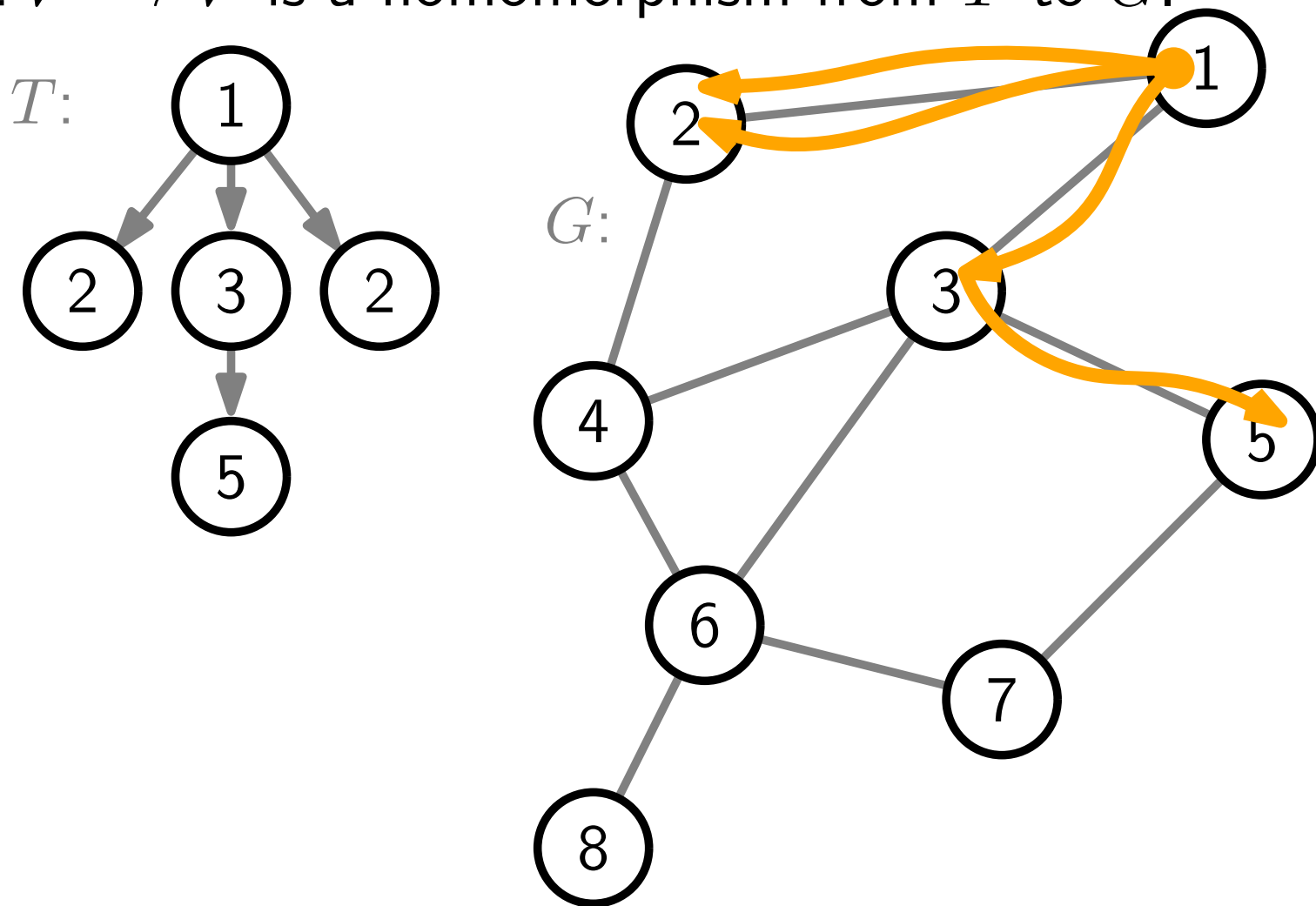
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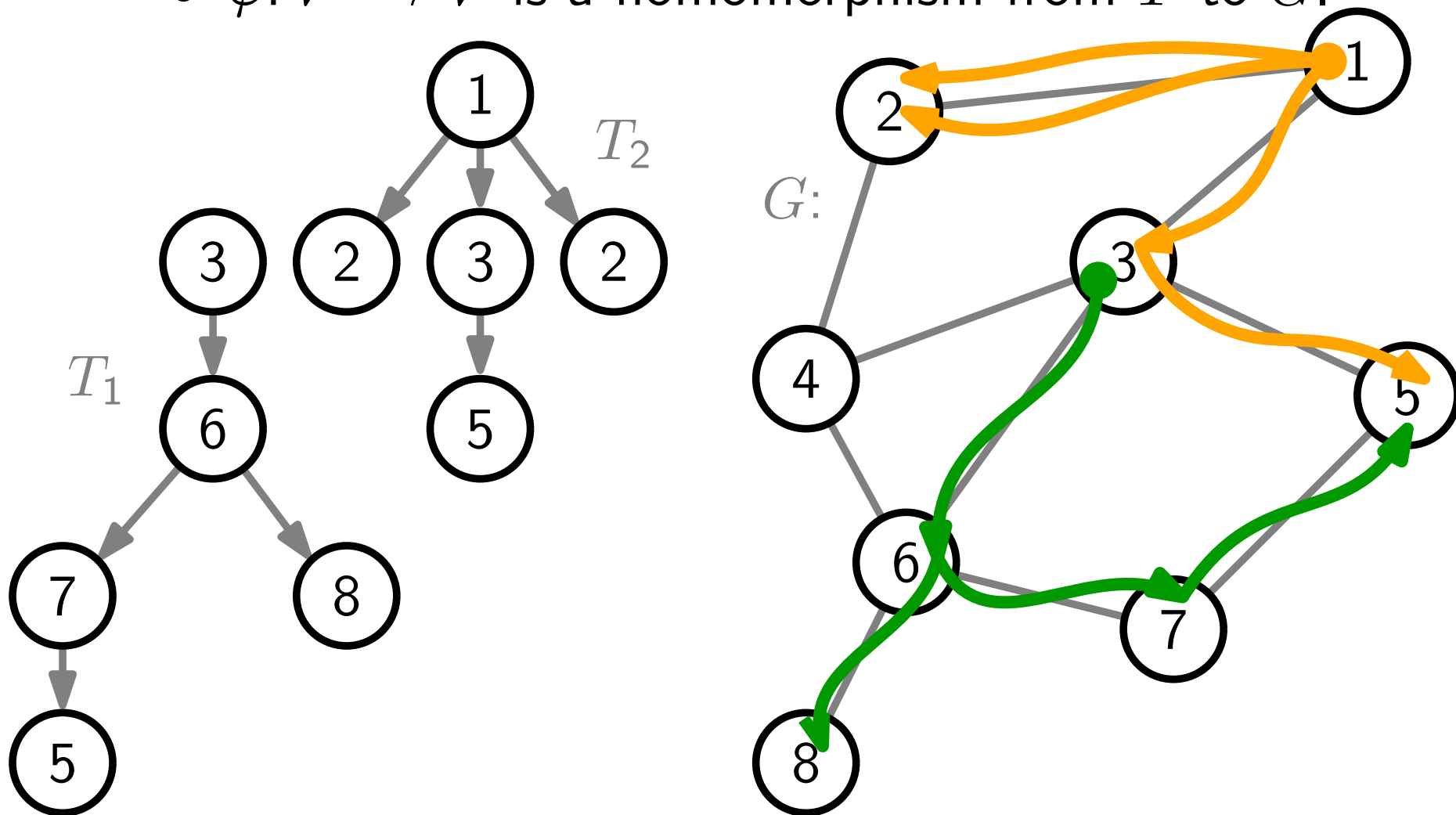




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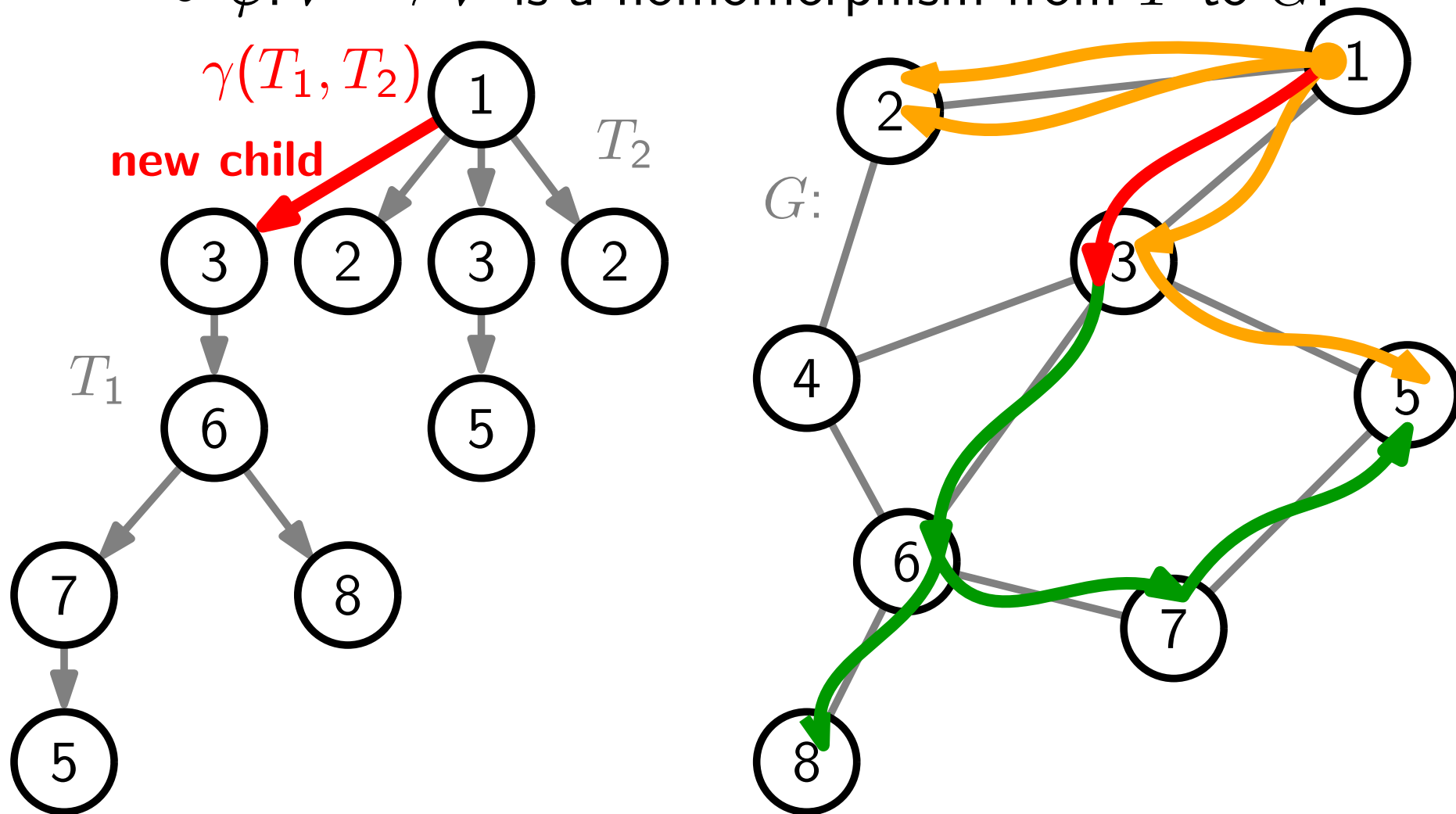
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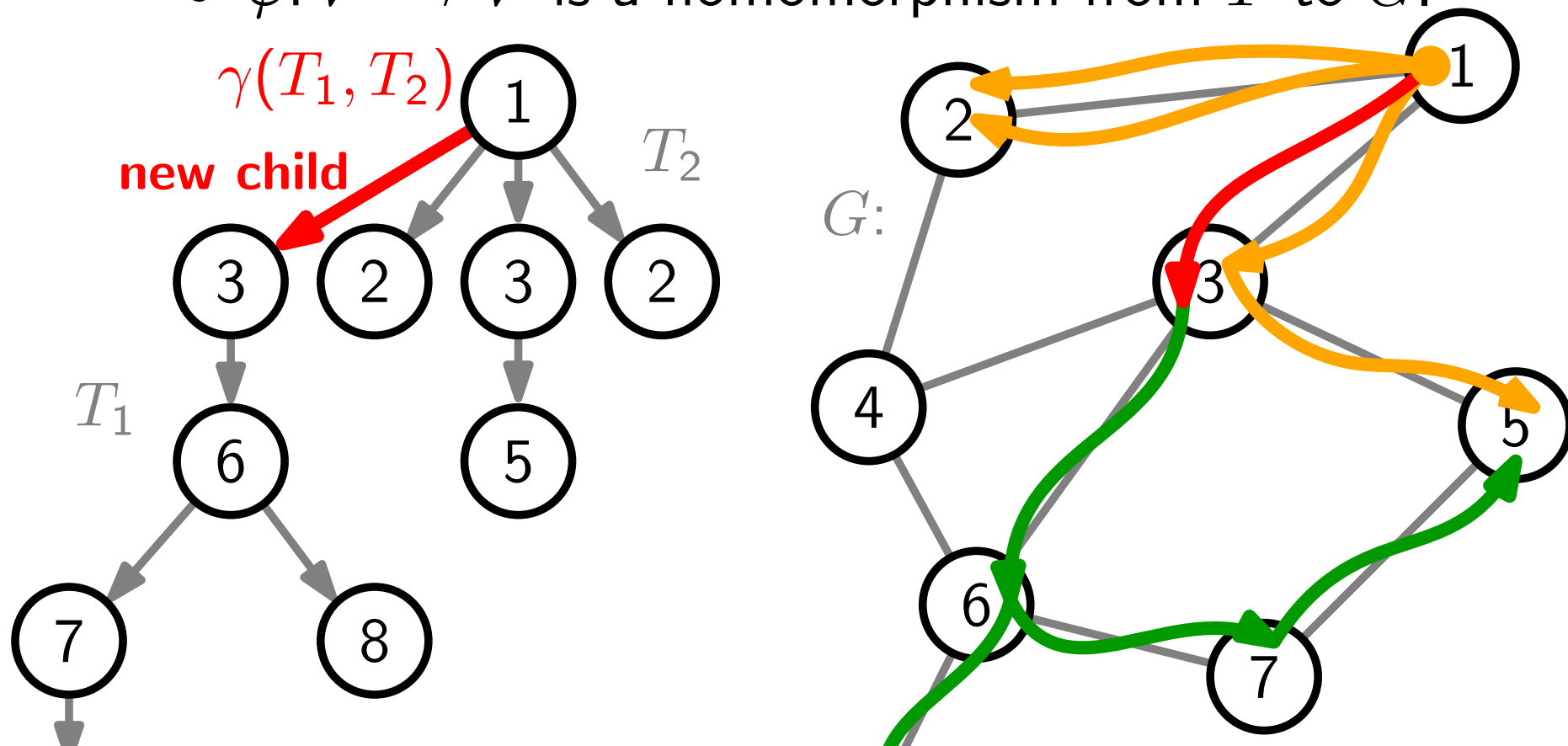
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**Def.**  $\gamma(A, B) :=$  result of making  $root(A)$  first child of  $root(B)$

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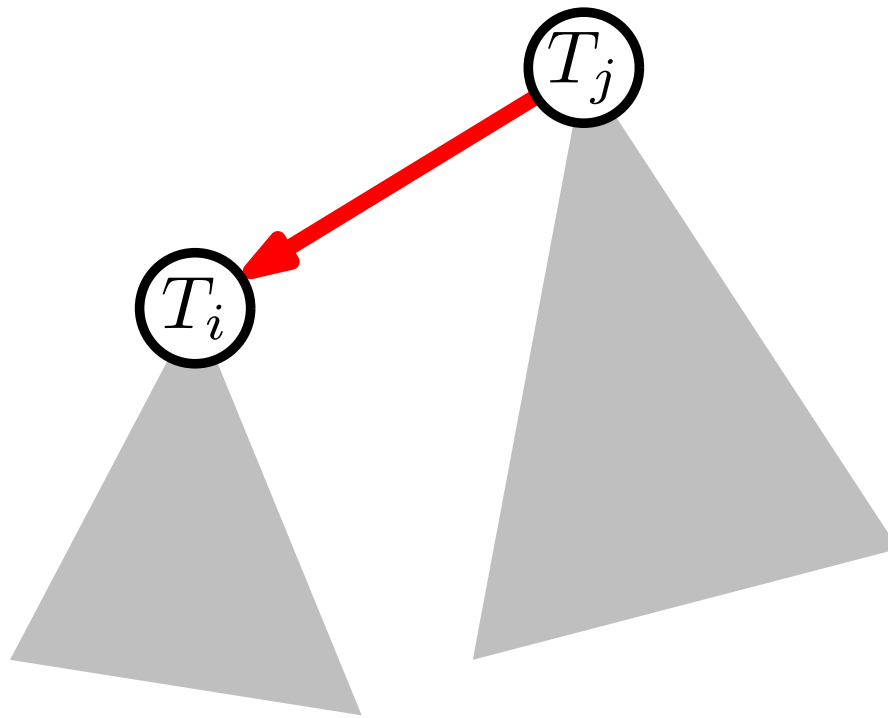
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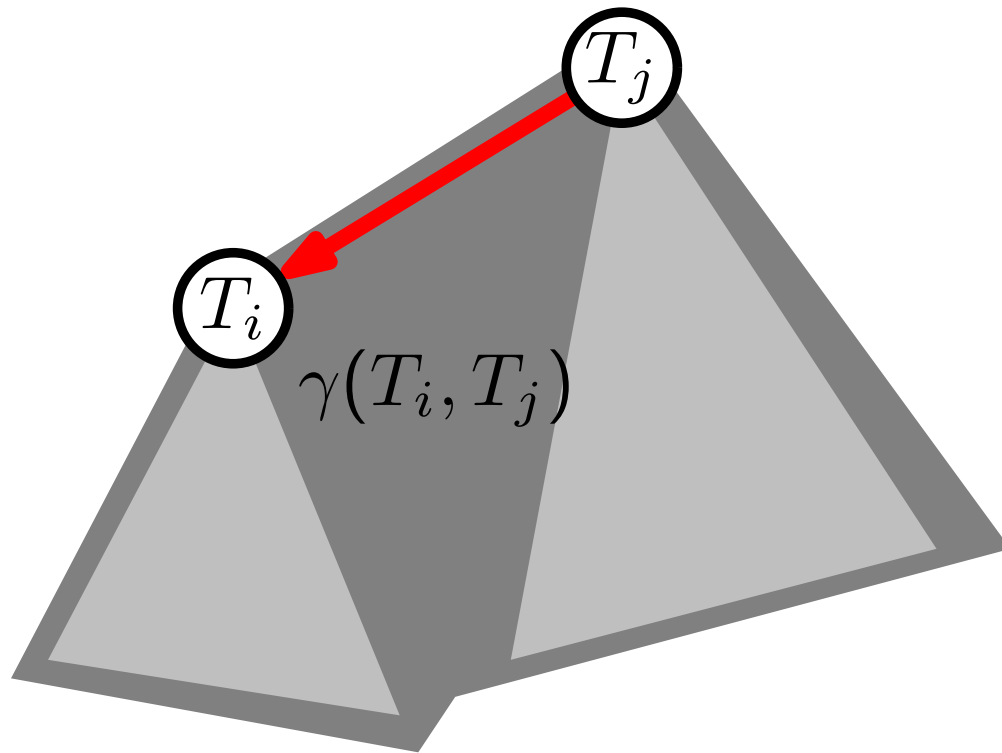
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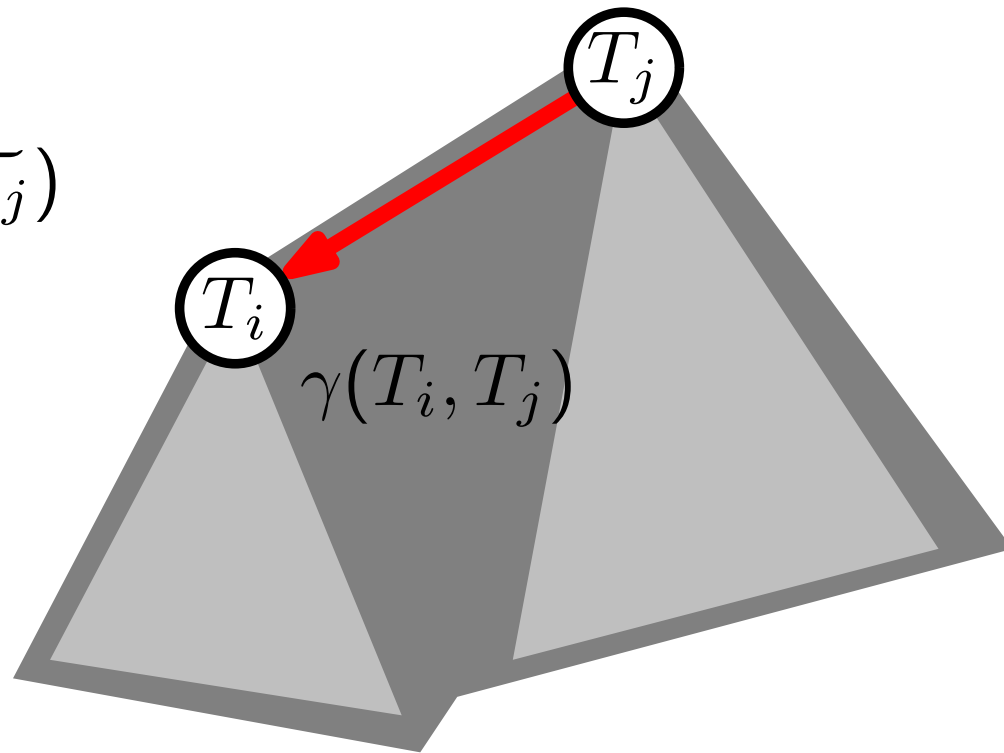
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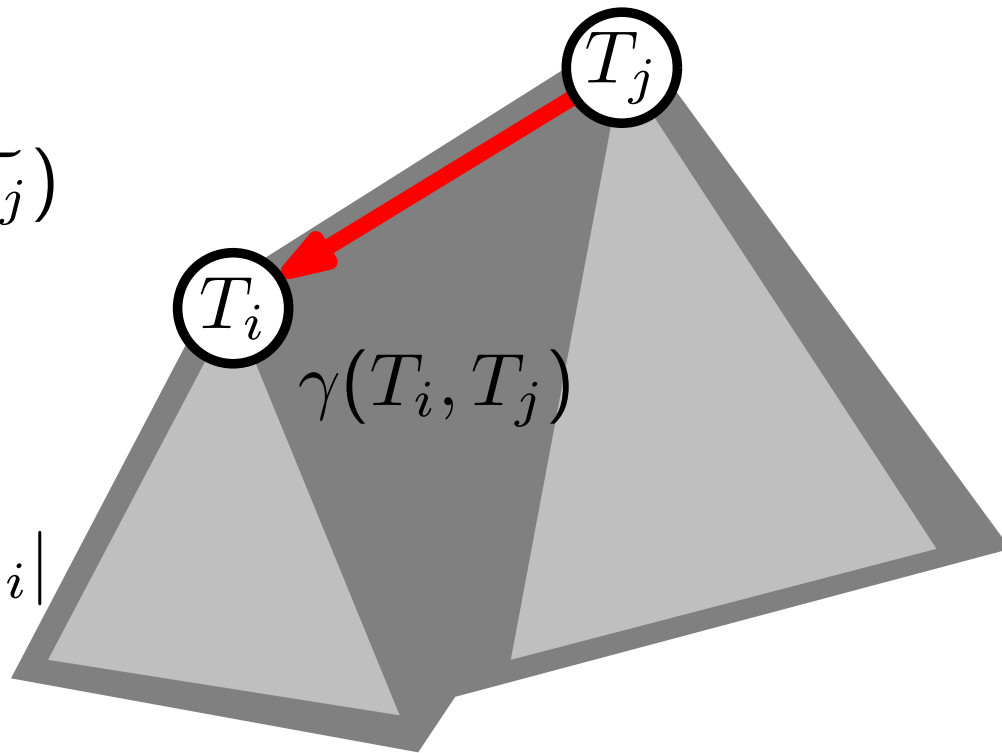
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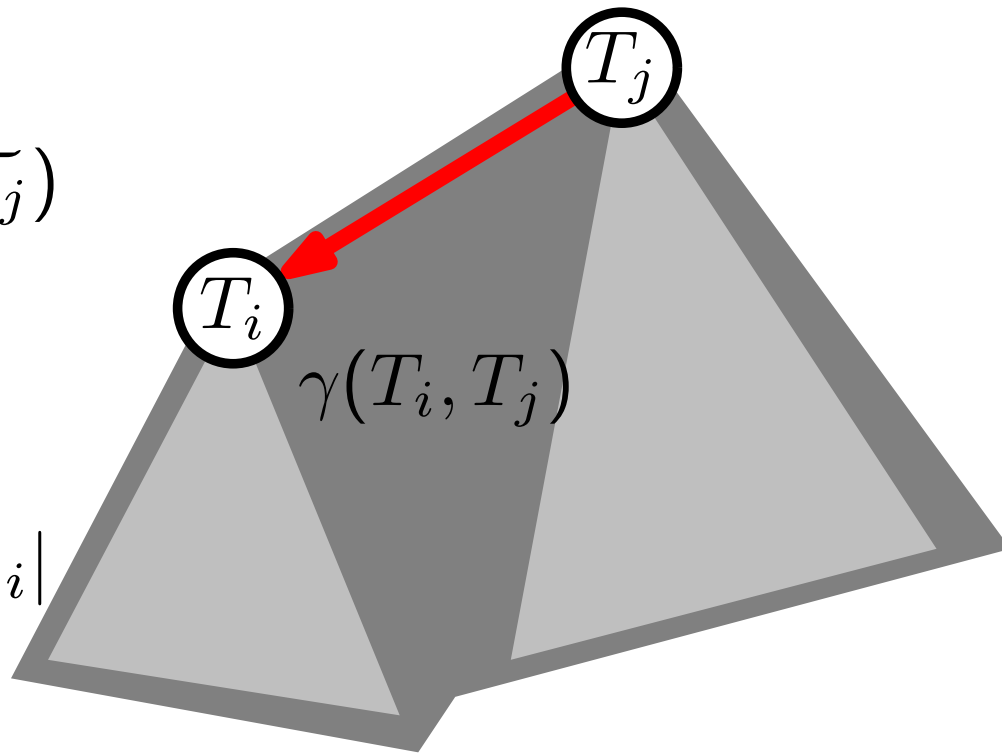
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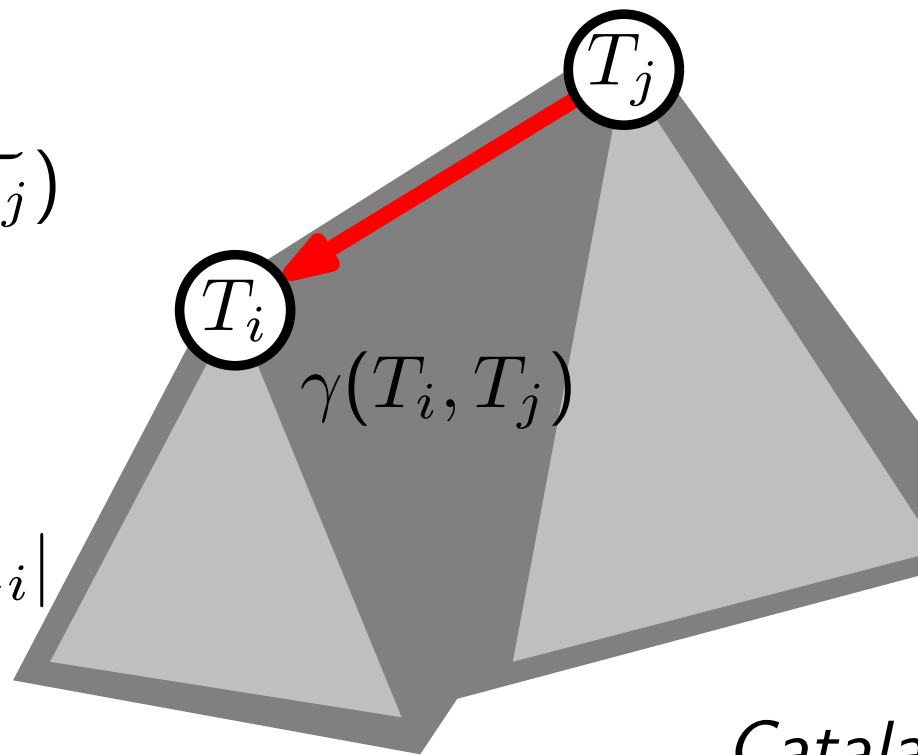
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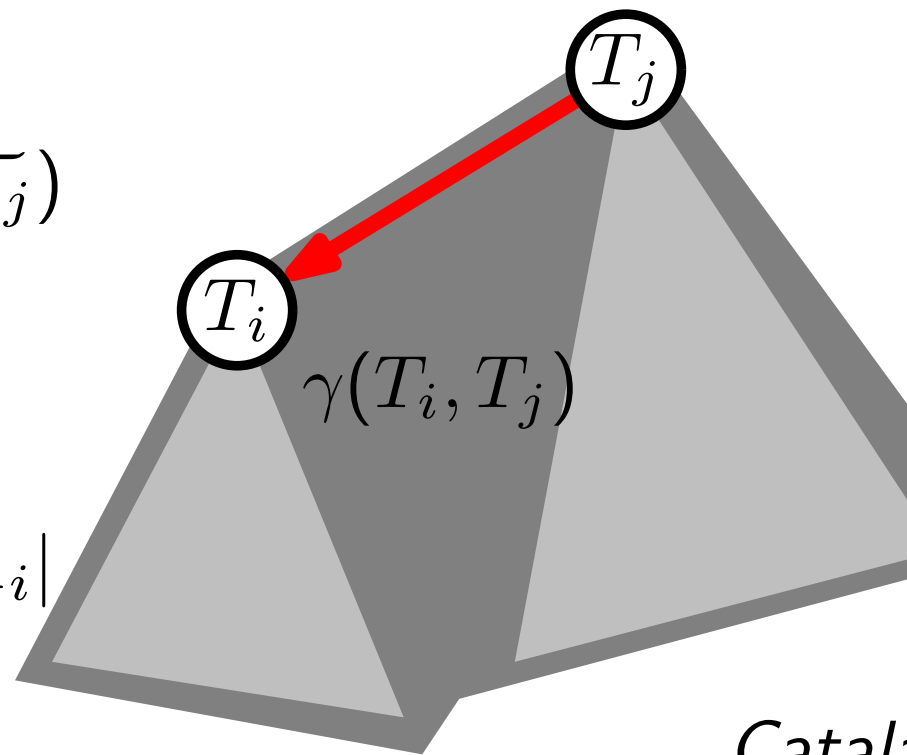
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$$C_0 = 1; C_n = \sum_{i=0}^{n-1} C_i C_{n-1-i} \sim \frac{4^n}{n^{3/2} \sqrt{\pi}}$$

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**Runtime:**  $O(n^2 \cdot n^3) = O(n^5)$  – unweighted case  
 $O(nc \cdot nc^2) = O(n^2 c^3)$  – weighted case

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**Given:** Graph  $G = (V, E)$ , terminals  $K \subseteq V$ , number  $c$

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**Runtime:**  $O(2^k \cdot \text{poly}(n))$  unweighted

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[Amini et al., ICALP'09]

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**Easier Problem:** (find and solve it yourself!)

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[Fernau et al., WG'09]

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$\exists t_1, t_2$  such that  $t_1 + t_2 = t$  and  $S_1$  has a subset of sum  $t_1$   
and  $S_2$  has a subset of sum  $t_2$

# Subset Sum – A Solution

$$S = \left\{ \underbrace{\dots, \dots, \dots, \dots, \dots, \dots}_{\text{sum } t_1}, \underbrace{\dots, \dots, \dots, \dots, \dots}_{\text{sum } t_2} \right\}$$

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**Runtime:** ...  $\Sigma_1 \times \Sigma_2$  candidates to check?

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Can we get rid of this factor?