

# Hardness and Approximation Results for Packing Steiner Trees

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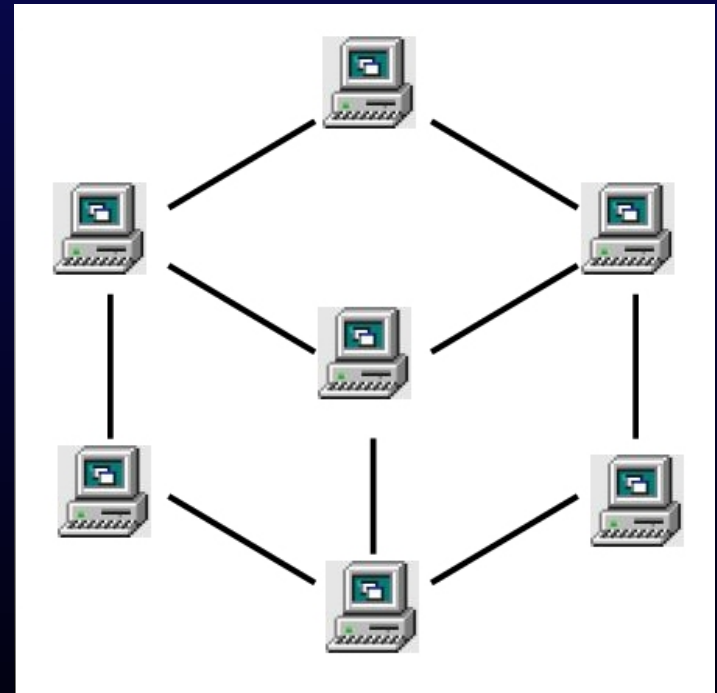
joint with

Joseph Cheriyan

Department of Combinatorics and Optimization  
University of Waterloo

## A Network Problem

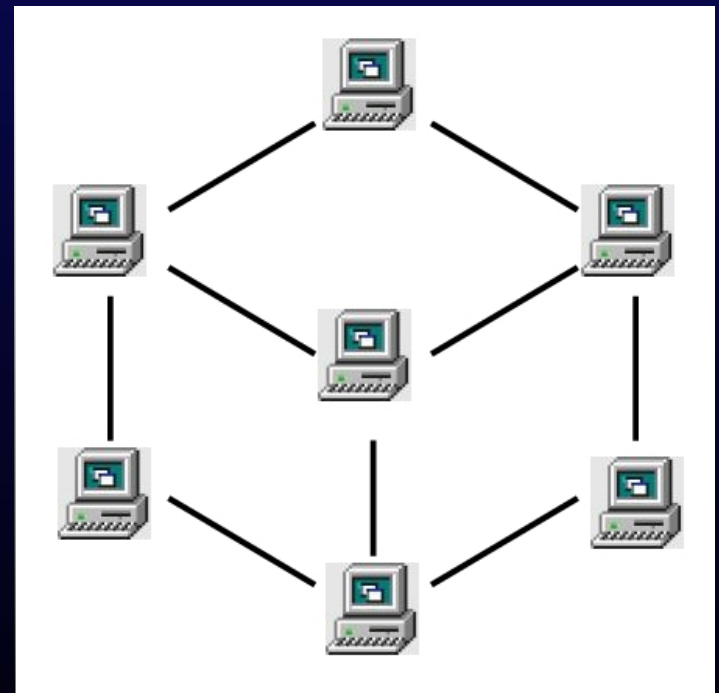
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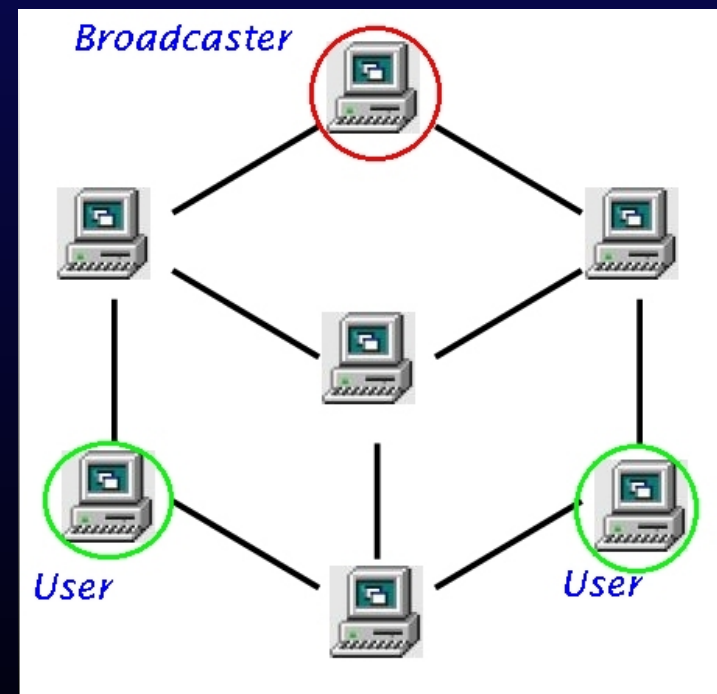
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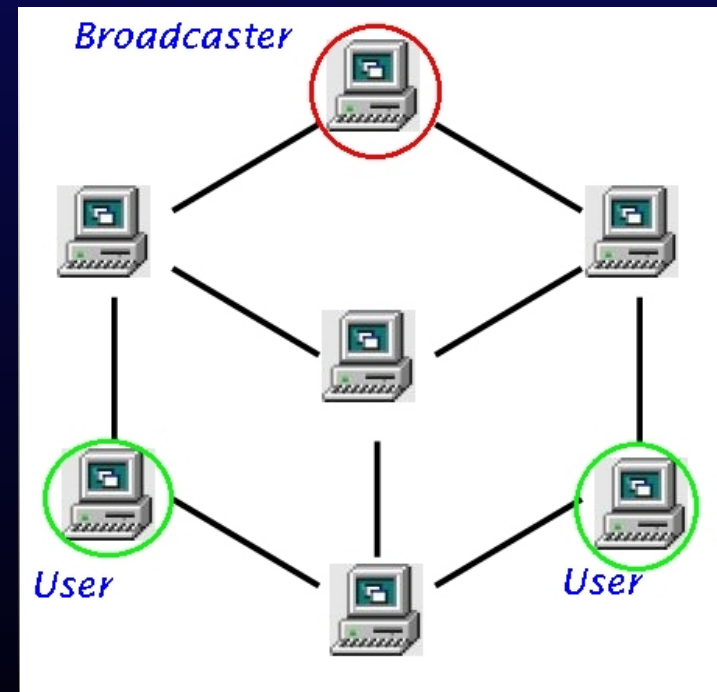


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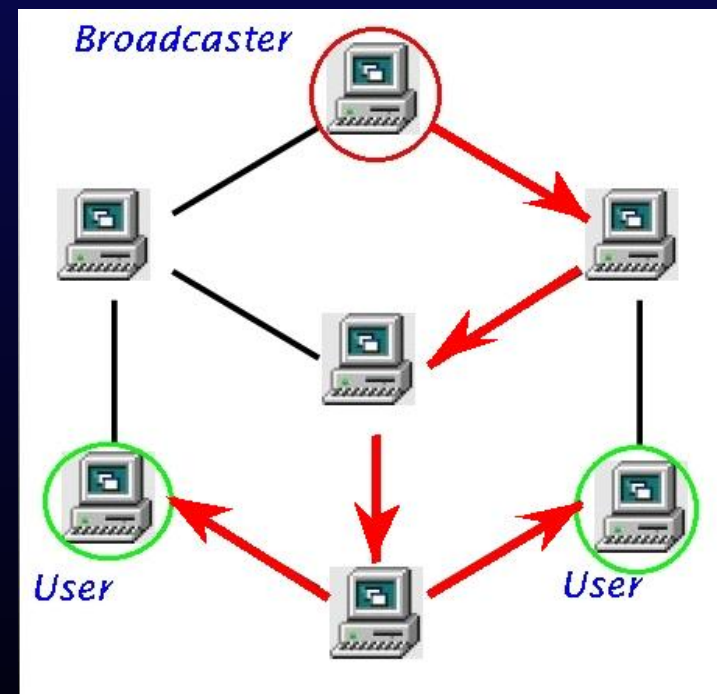


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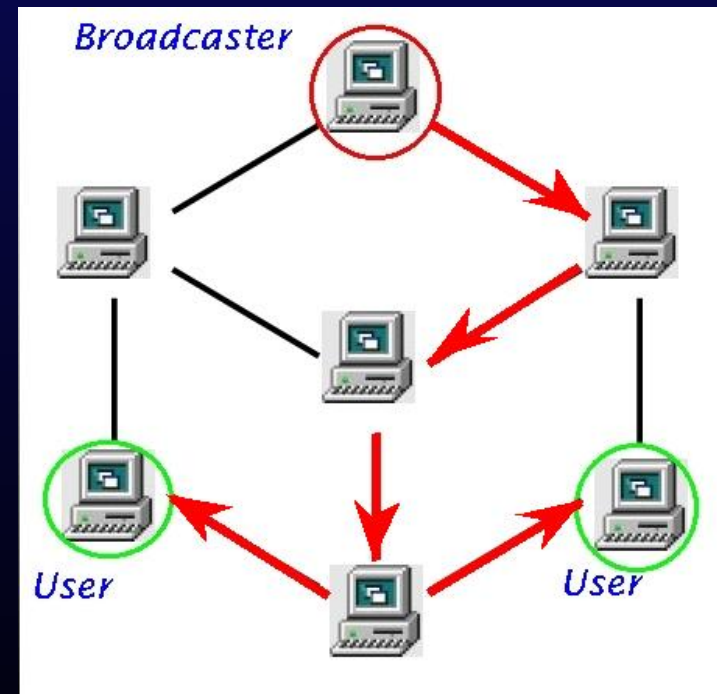
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**Goal:** Find the maximum number of edge-disjoint Steiner trees.



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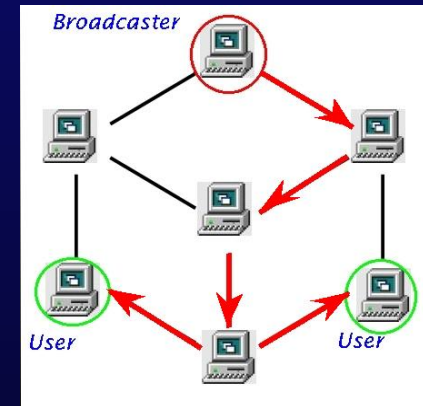
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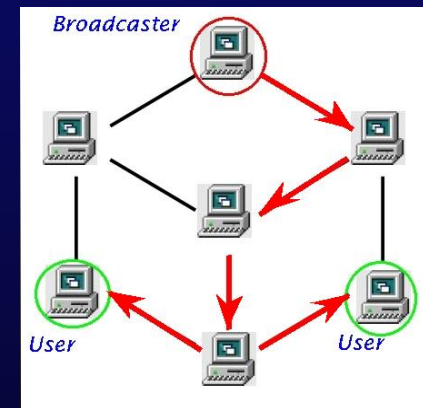


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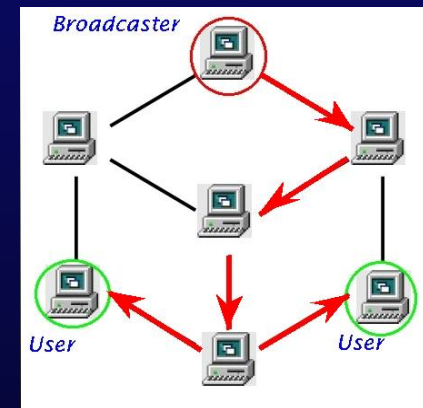
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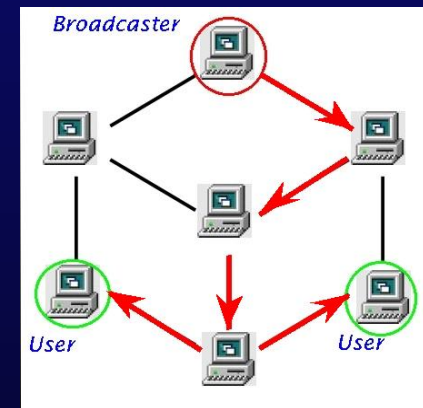
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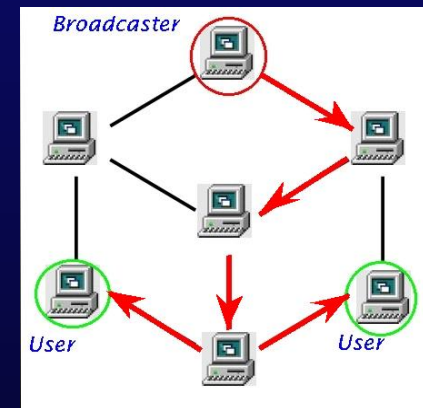
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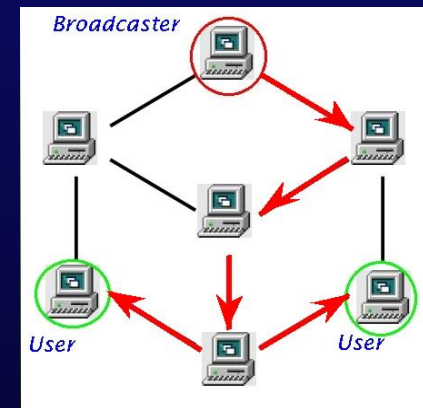
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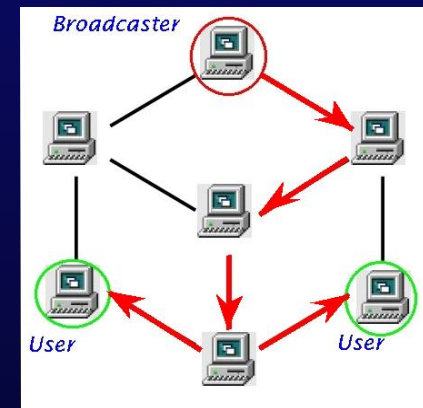
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**Theorem [Frank, Király, Kriesell'01]:** If  $G - T$  is independent set and the  $T$ -edge-connectivity of  $G$  is  $3k$ , then there are  $k$  edge-disjoint Steiner trees in  $G$ .





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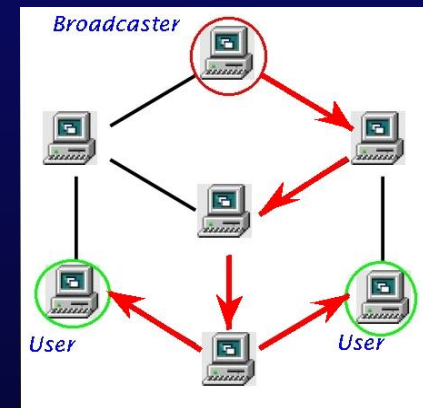
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Fractional PEU is the corresponding LP. The separation oracle for the dual LP is the min. Steiner Tree problem.

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This theorem holds in more general settings and we will use this later.

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### Proof idea:

A reduction from Bounded 3-Dimensional-Matching (B3DM).

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**Packing Vertex-disjoint Direct Steiner trees (PVD):** Similar to PED, except that trees have to be disjoint on Steiner nodes.

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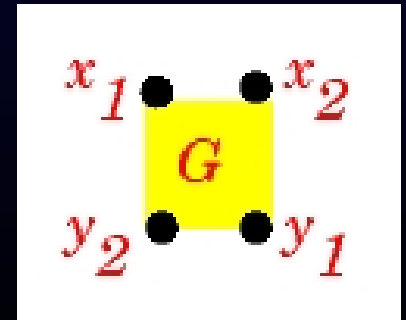
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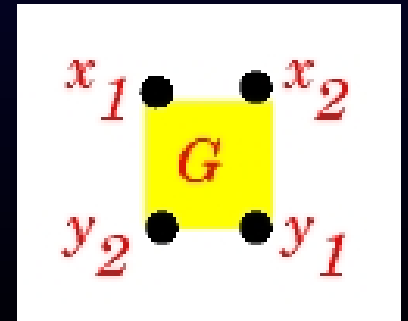
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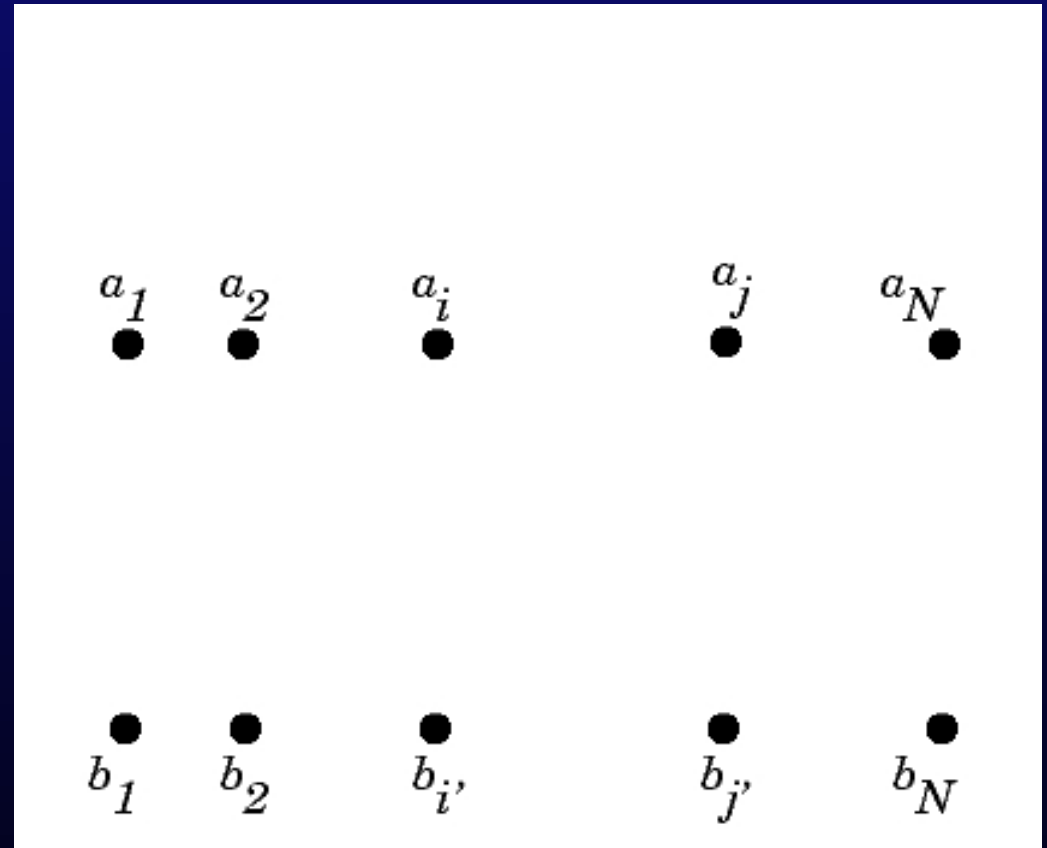
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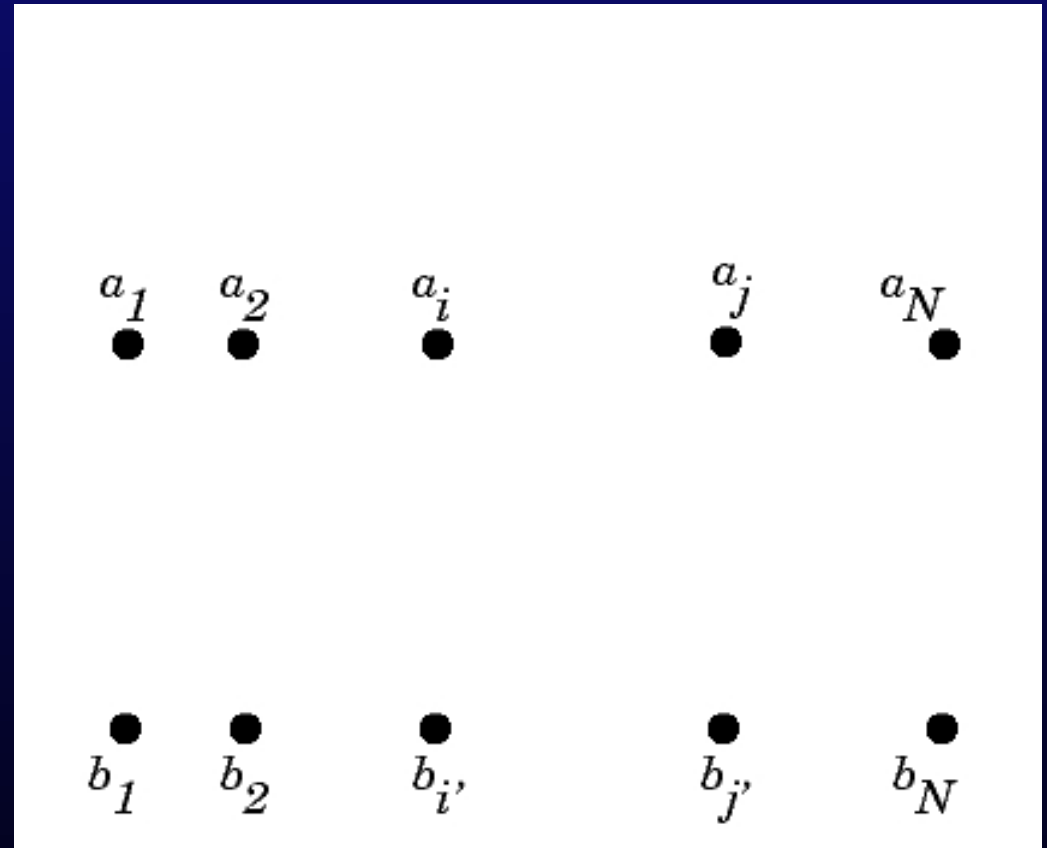
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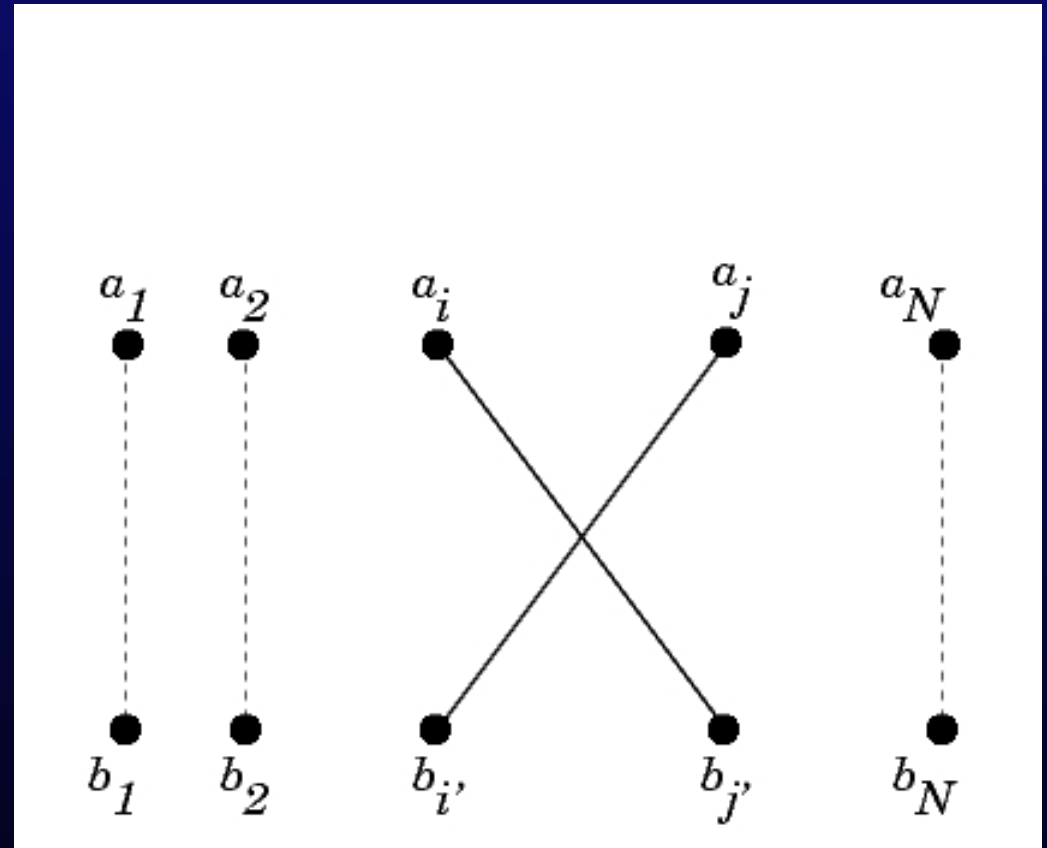
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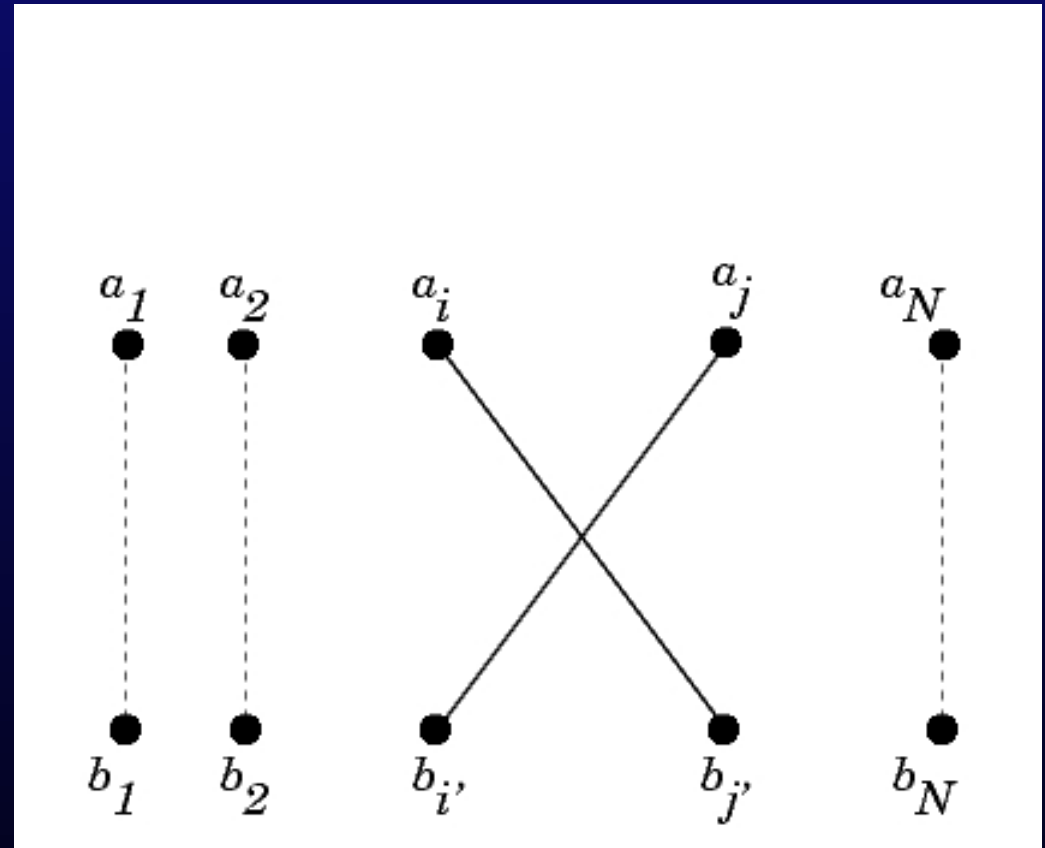
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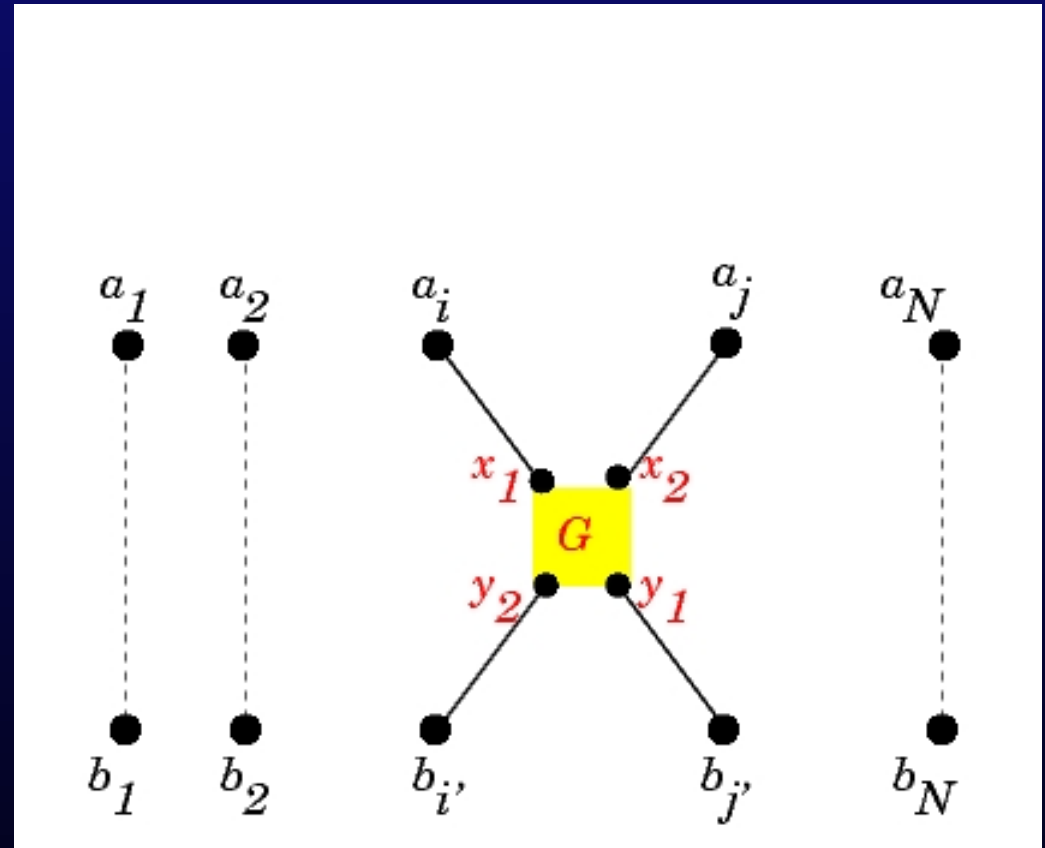
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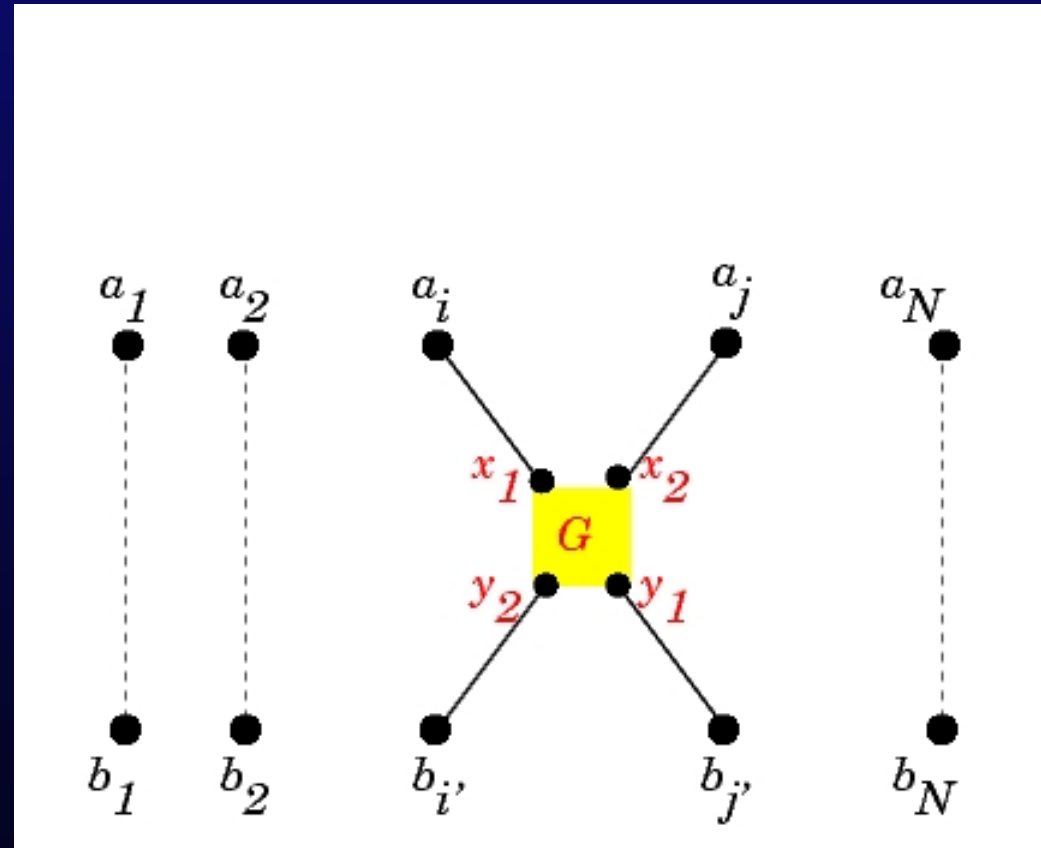


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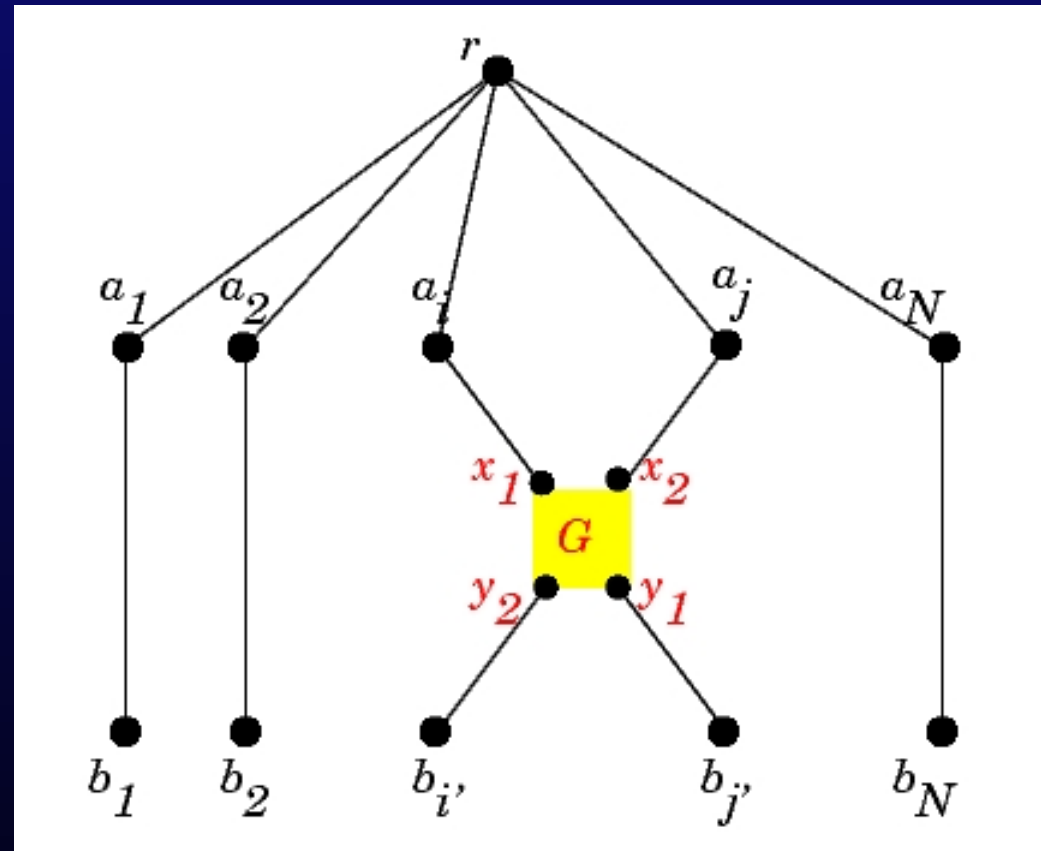


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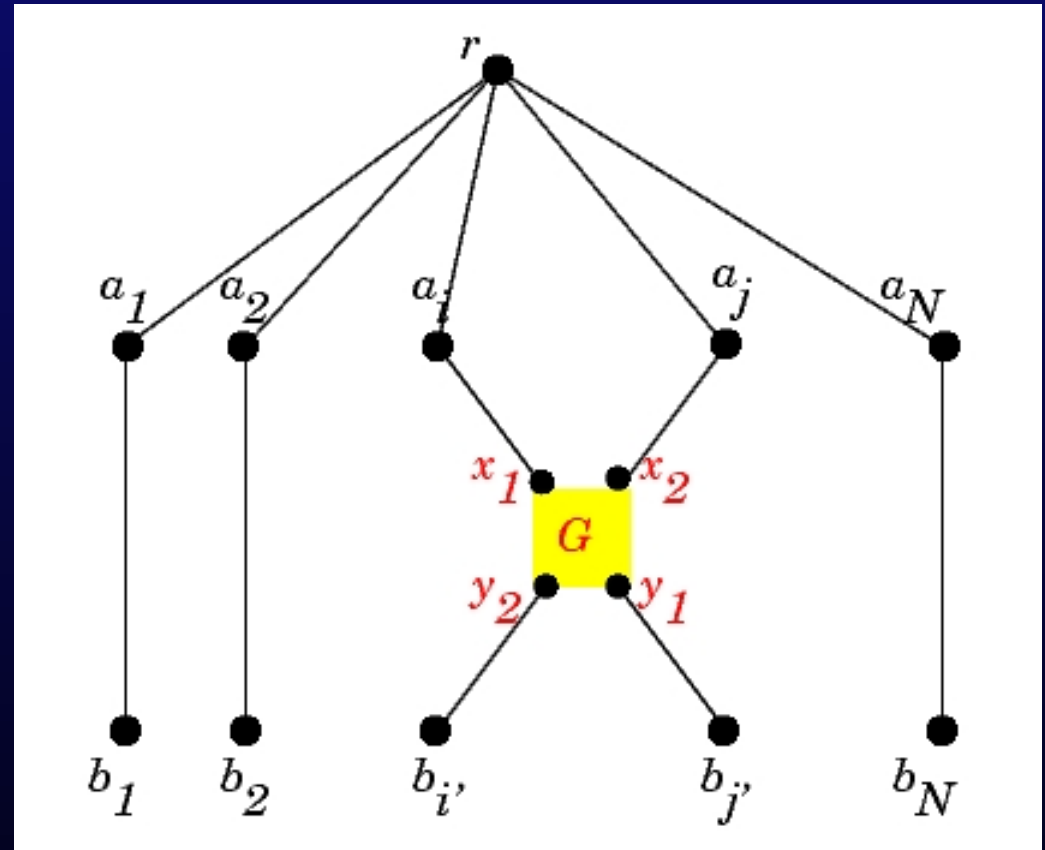
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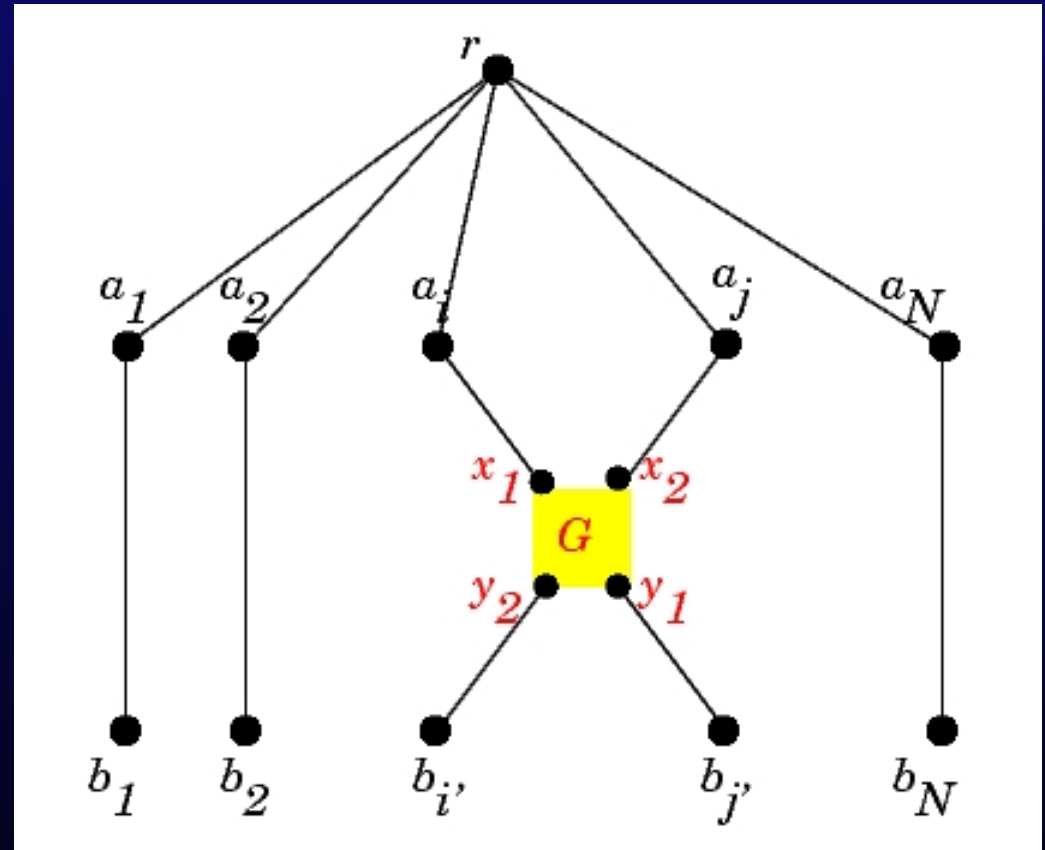
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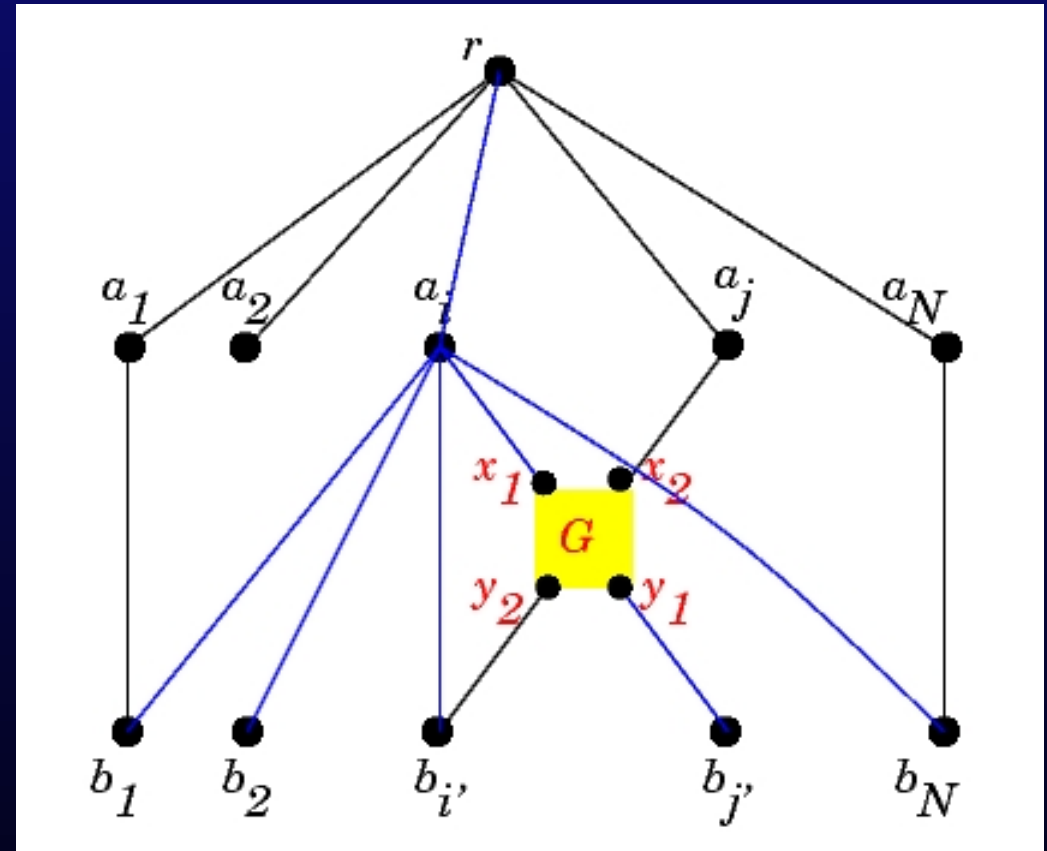
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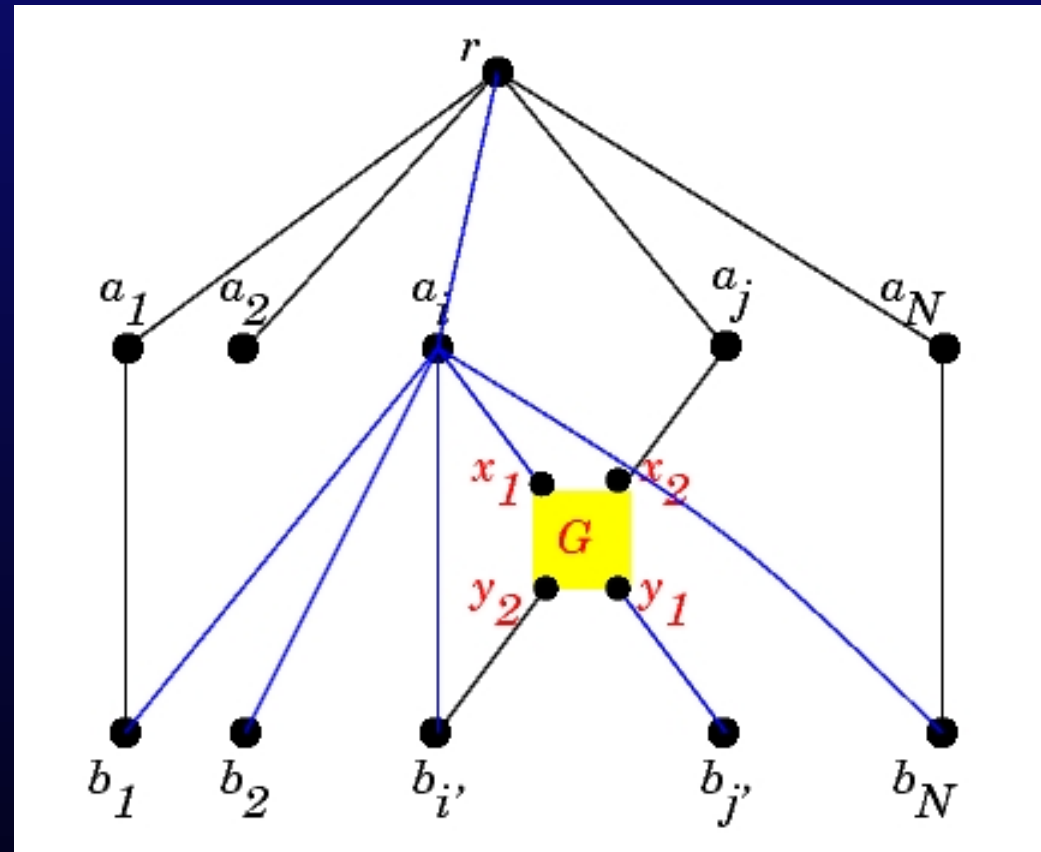
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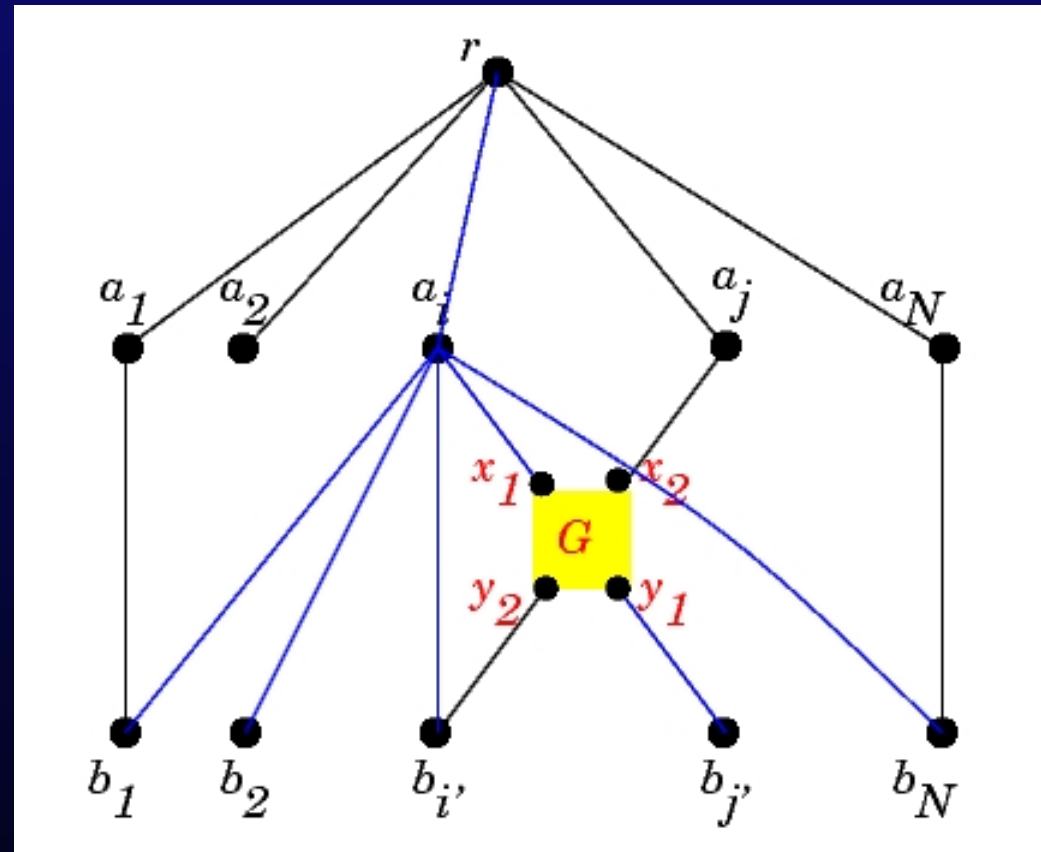
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- Close the gap for PEU.
- We know PEU with 4 terminals is APX-hard. What about 3 terminals? Is it NP-complete?
- We have found an  $O(\log^2 n)$  approx for PVU. Is there an  $O(\log n)$  approx?
- What is the integrality gap for PVU?

Thanks!