

# Stable Networks with Bargaining and Heterogeneous Costs

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- Network: representation of a set of elements and their relationships.

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Stable components:

- Equitable components: always pairs and odd cycles
- Inequitable components: certain bipartite graphs. More variety with the second cost structure than with the first.



# Literature Review

R&D Networks: Creating a link leads to a cost reduction. Firms are ex-ante homogeneous but, ex-post, they can be homogeneous or heterogeneous.

- Goyal and Moraga-González (2001), Goyal and Joshi (2003).

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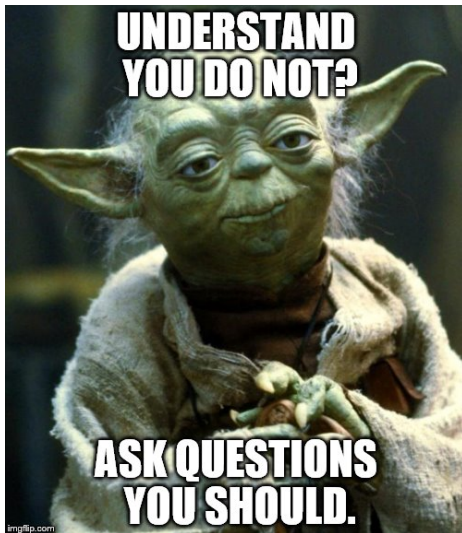
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Bargaining networks: Creating a link may alter the bargaining power.

- Stationary networks: Manea (2011), Gauer and Hellmann (2017).
- Non-stationary networks: Kranton and Minehart (2001), Elliott and Nava (2019).

# Questions



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Two-stage game:

- $t = 0$ : players form undirected, costly links.
  - The linking cost differs.
- $t = 1, 2, \dots$ : given the network formed in the previous stage, infinite-horizon game in which pairs of players connected through a link are randomly matched to bargain *à la Manea*.



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*Neighbors* of player  $i$  in network  $g$ :  $N_i(g) = \{j \in N \mid ij \in g\}$

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*Path*: sequence of links which joins a sequence of nodes which are all distinct.

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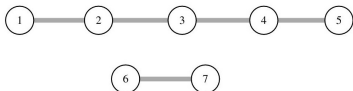
- $g + ij := g \cup \{ij\}$ : network obtained by adding link  $ij$  to the existing network  $g$
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The stationary equilibrium payoffs are denoted by  $v$ .

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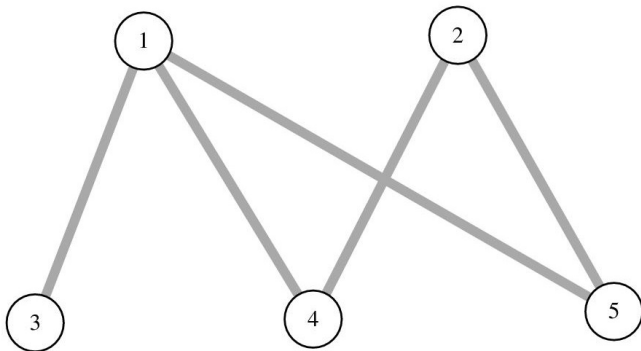
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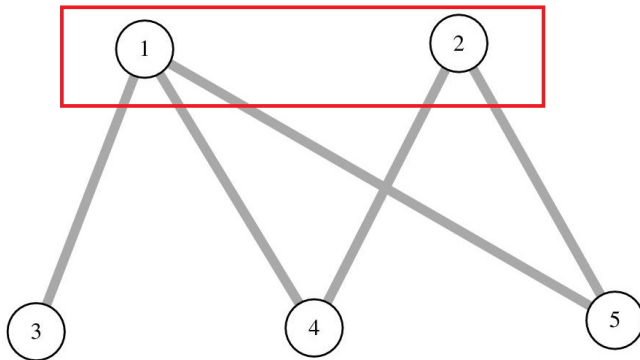
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- Set  $g_{s+1} = g_s \setminus (M_s \cup L^{g_s}(M_s))$  and repeat.

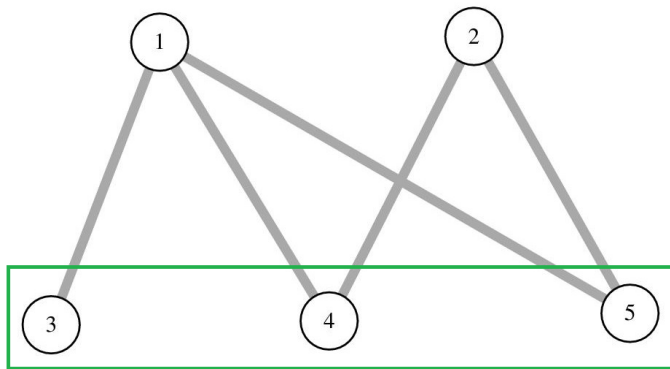
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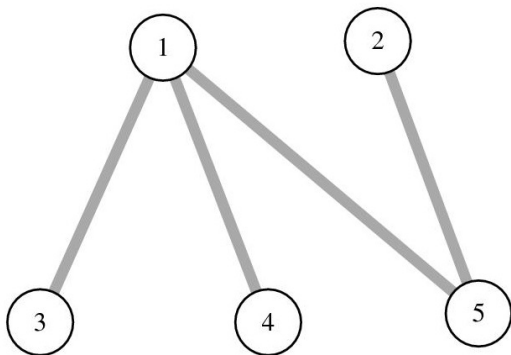
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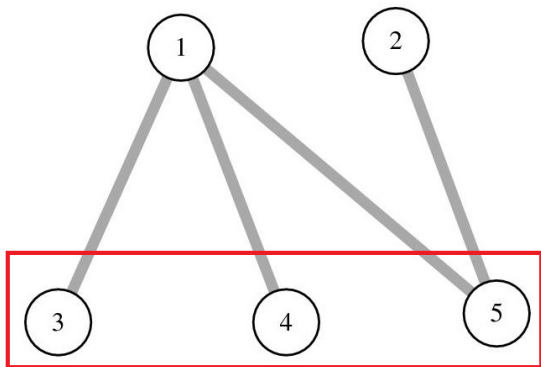
The algorithm finishes in one step:

$$M_1 = \{3, 4, 5\}, L^{G^1}(M_1) = \{1, 2\}; r_1 = 2/3, x_1 = 2/5, 1 - x_1 = 3/5$$

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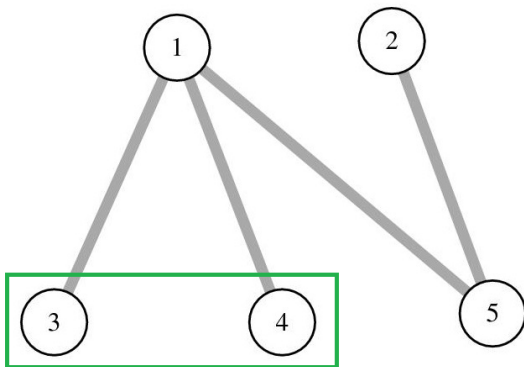


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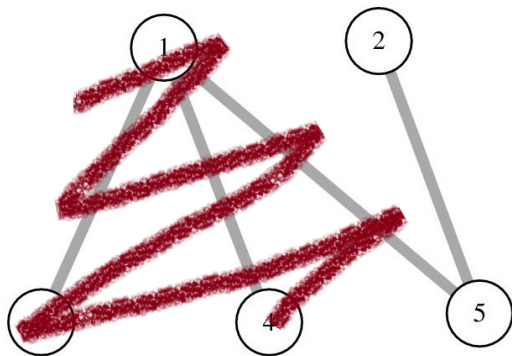




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The algorithm finishes in two steps:

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$$M_2 = \{5\}, L^{g^2}(M_2) = \{2\}; r_1 = 1, x_1 = 1 - x_1 = 1/2$$

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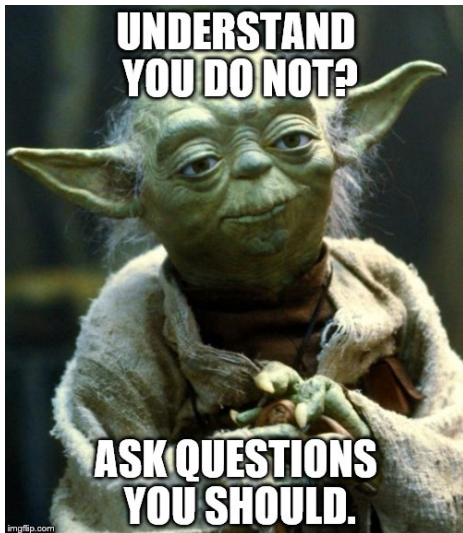
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A network  $g$  is *pairwise stable* if:

- for all  $ij \in g$  :  $u_i(g) \geq u_i(g - ij)$  and  $u_j(g) \geq u_j(g - ij)$ , and
- for all  $ij \notin g$  : if  $u_i(g + ij) > u_i(g)$ , then  $u_j(g + ij) < u_j(g)$

# Questions



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Inequitable components: certain bipartite graphs such that all its leaves are elements of  $M$ .

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Anyhow, each link has a cost either  $\underline{c}$  or  $\bar{c}$  for both players, with  $\underline{c} < \bar{c}$ . This cost depends only on the types of the adjacent players.

# Cheap Connections with Same Type: Components I

Equitable components: essentially the same as in Gauer and Hellmann.



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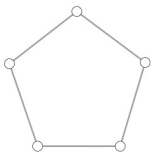
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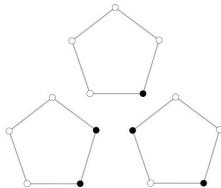


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$$\underline{c} \leq \frac{1}{6},$$

with at most  $\frac{1}{2\underline{c}}$  players



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# Cheap Connections with Same Type: Components II

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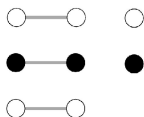
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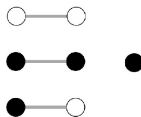
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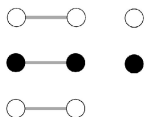


(b)

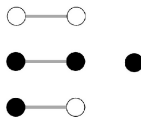
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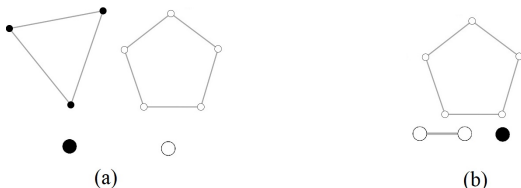
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There can be networks formed by pairs of the same types and two isolated nodes of different types (the former depend on  $\underline{c}$  and the latter on  $\bar{c}$ ).

However, if there are pairs of players of different types, there can only be one isolated node.

# Cheap Connections with Same Type: Networks II

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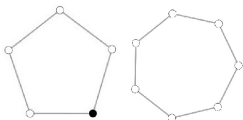
There can be networks formed by odd cycles of the same types and two isolated nodes of different types (the former depend on  $\underline{c}$  and the latter on  $\bar{c}$ ).

If in addition to the cycles of same types there are pairs, all of the same type, there can only be one isolated node of type different from the pairs.

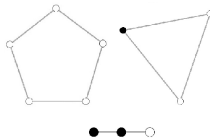


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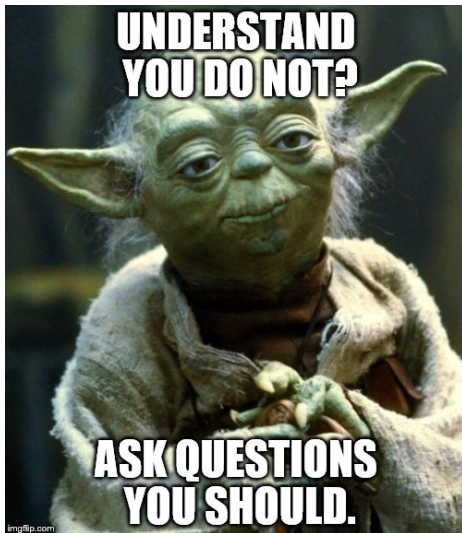


(d)

Given the maximum size of the cycles that connect players of the same type, the cycles that connect players of different types cannot be larger.

A single line of length three that connects players of different types can coexist with cycles of size three that connect players of different types and with cycles that connect players of the same type. If  $\underline{c}$  is large enough, there can also be pairs.

# Questions



# Cheap Connections with Different Type: Components I

Pairs and odd cycles are still the only equitable components.

But now there are inequitable components besides the line of length three!

# Cheap Connections with Different Type: Components I

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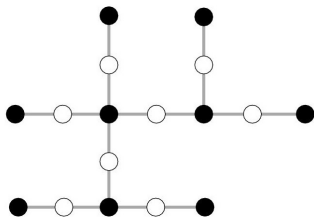
But now there are inequitable components besides the line of length three!



Odd lines of length  $m$

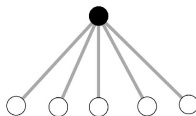
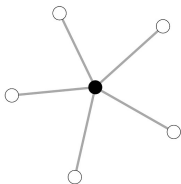
$$M_1 = \{\text{blacks}\}$$

# Cheap Connections with Different Type: Components II



$$M_1 = \{\text{blacks}\}$$

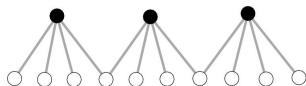
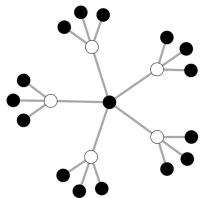
# Cheap Connections with Different Type: Components III



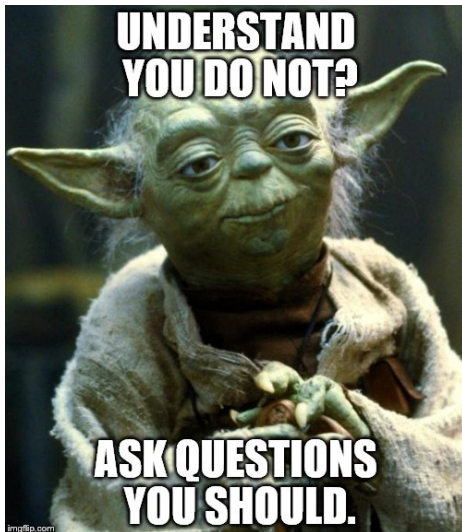
Stars with  $n$  leaves, all of the same type and different from the root

$$M_1 = \{\text{leaves}\}$$

# Cheap Connections with Different Type: Components IV



# Questions





# Conclusions

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# Conclusions

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- When it is cheaper in the overall to collaborate between types that are different, there are more architectures of inequitable components.

# Future Work

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