

Applied economic networks - IV

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Today's class

- ▶ Strategic network formation.
- ▶ Mushegh's presentation: *The law of the few.*
- ▶ Robin's presentation: *The network structure of international trade.*

Takeaway from random networks

- ▶ **Erdos-Renyi model:** Pure randomness, nice properties.
- ▶ **Barabasi-Albert model:** Preferential attachment, explains effectively power-law degree distributions.
- ▶ **Watts-Strogatz model:** Rewiring from a circle, range of rewiring probability that generates low diameter and high clustering.
- ▶ **Jackson-Rogers model:** Randomness and preferential attachment, flexible model that can be adapted to fit lot of different data.

A general consideration

Random network models

Positive analysis:
Random models are great to explain a specific configuration

Normative analysis:
good to analyze big shocks to the overall functioning of the system.

Strategic models

Positive analysis: a primary goal is to identify a strategy that matches observed behavior

Normative analysis: if the theory is good, then it is useful to formulate predictions.

Arguments for strategic models

- ▶ Why?
- ▶ What about efficiency?
- ▶ Empirics?

How do we build a model of network formation?

1. Costs and benefits associated to a network configuration.
2. How agents choose links.

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Results

- ▶ What network configurations are likely to form?
- ▶ Analyze social efficiency: is there a tension between stability and efficiency?

Plenty of choices

Incentive to form and delete links:

- ▶ is consensus needed?
- ▶ is the process dynamic or static?
- ▶ how sophisticated are the agents?
- ▶ what do agents know when making a decision?
- ▶ do errors happen?
- ▶ can agents compensate each other?
- ▶ can agents adjust the intensity of a link?

Jackson Wolinsky (1996)

Among the first economic papers on networks.

Practically, it has initiated the field of **Social and Economic Networks**.

Published in 1996, on the *Journal of Economic Theory*.

The main idea

Agents obtain payoff $u(g)$ that depend on the network structure g .

Two models with undirected network formation.

The connections model

- ▶ Agents obtain a benefit from direct and indirect connections.
- ▶ $\delta \in [0, 1]$ is the benefit between an agent i and an agent j .
- ▶ Links are costly: $c_{ij} \geq 0$ is the cost to i of a link to j .
- ▶ $\ell(i, j)$ is the shortest path between i and j .

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Payoff

$$u_i(g) = \sum_j \delta^{\ell(i,j)} - \sum_{j \in N_i(g)} c_{ij}$$

The main questions

- ▶ Which networks will the agents form?
- ▶ Which networks are the best for the whole society?

Main solution concepts

- ▶ **Non-cooperative approach:** Individuals act individually.
⇒ Nash equilibrium
- ▶ **Cooperative approach:** Individuals operate in groups.
⇒ Pairwise Stability (this paper), Pairwise Nash stability, . . .

An example of Nash equilibrium

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- ▶ Nash equilibrium: no incentives to deviate.



A pairwise form of agreement

- ▶ No agent gains from deleting a link,
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Pairwise stability



$$u_i(g) \geq u_i(g - ij) \quad \text{for } ij \in g$$

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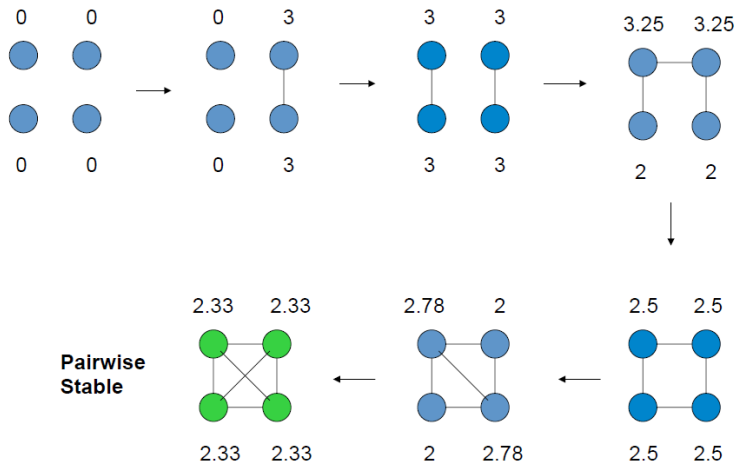


$$u_i(g + ij) \geq u_i(g)$$

$$u_j(g + ij) \geq u_j(g)$$

No two agents both gain from adding a link (at least one strictly)

An example of pairwise stability



Efficiency

Pareto efficiency

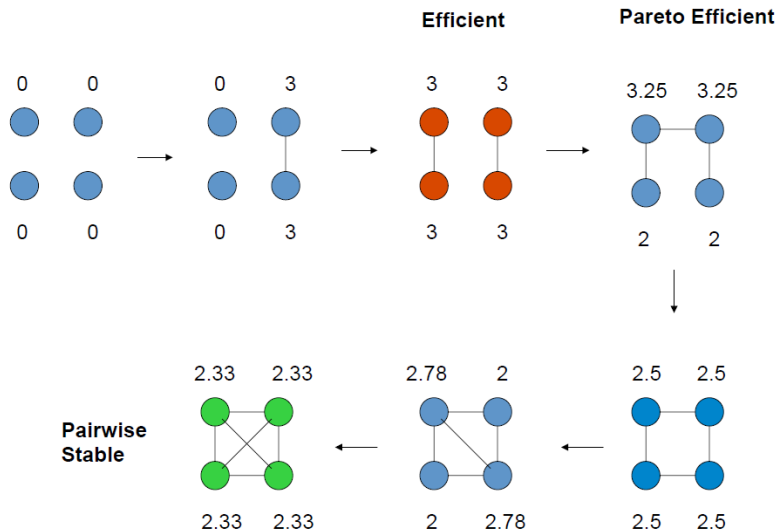
A network g is Pareto efficient if there does not exist a network g' such that:

$$u_i(g') \geq u_i(g) \quad \text{for all } i.$$

Efficiency

A network g is efficient if it maximizes $\sum u_i(g)$.

Back to our example



A generalization of the “connections model”

A more general version, called the distance based utility model (Bloch Jackson, 2005)

- ▶ Let b be a decreasing function
- ▶ Links are costly: $c \geq 0$ is the cost of a link.
- ▶ $\ell(i, j)$ is the distance between i and j .

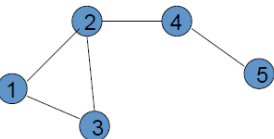
Payoff

$$u_i(g) = \sum_j b(\ell(i, j)) - d_i(g)c$$

Intuition

- ▶ The benefit from a friend is $b(1)$
- ▶ The benefit from a friend of a friend is $b(2) < b(1), \dots$
- ▶ Cost $c > 0$

$$u_1 = 2b(1) + b(2) + b(3) - 2c$$



$$u_2 = 3b(1) + b(2) - 3c$$

$$u_5 = b(1) + b(2) + 2b(3) - c$$

Efficient networks

- ▶ **Low cost:** $c < b(1) - b(2) \implies$ the complete network is uniquely efficient.
- ▶ **Medium cost:** $b(1) - b(2) < c < b(1) + (n - 2)b(2)/2 \implies$ star networks are uniquely efficient.
- ▶ **High cost:** $c > b(1) + (n - 2)b(2)/2 \implies$ empty network is uniquely efficient.

Sketch of the proof

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The value of a star with k players is

$$2(k-1)[b(1) - c] + (k-1)(k-2)b(2)$$

The value of a network with k players and m links is at most:

$$2m[b(1) - c] + [k(k-1) - 2m]b(2)$$

Sketch of the proof - II

If we take the difference we obtain:

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replaced with a link at distance 3. The star is better. What if more than one star?

Pairwise stability

- ▶ **Low cost:** $c < b(1) - b(2) \implies$ the complete network is pairwise stable.
- ▶ **Medium- low cost:** $b(1) - b(2) < c < b(1) \implies$ star networks are pairwise stable, but not uniquely.
- ▶ **Medium- high cost:** $b(1) < c < b(1) + (n - 2)b(2)/2 \implies$ star networks are not pairwise stable, and the pairwise stable networks are over-connected and with few agents.
- ▶ **High cost:** $c > b(1) + (n - 2)b(2)/2 \implies$ empty network is uniquely pairwise stable.

Externalities

- ▶ **Positive externalities:** As in the connections model, there is an inefficiency.
- ▶ **Negative externalities:** ?

The coauthor model

Agents obtain value from research collaborations:

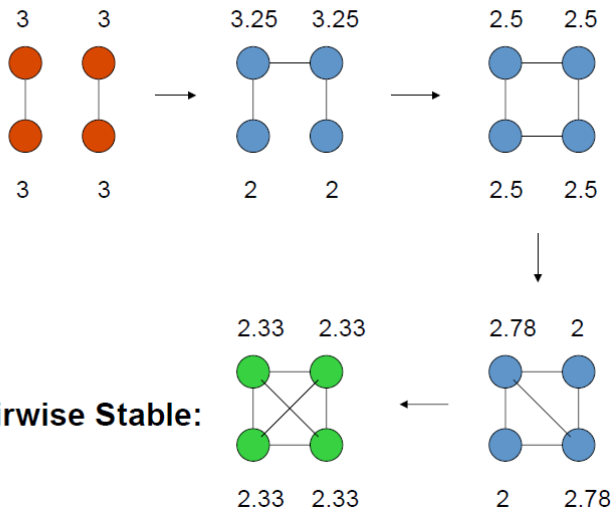
- ▶ A value for each relationship: depends on the time invested in the relation.
- ▶ An interaction term: the product of the time spent.

$$u_i(g) = \sum_{j:ij \in g} [1/d_i + 1/d_j + 1/(d_i d_j)]$$

$$u_i(g) = 1 + \sum_{j:ij \in g} [1/d_j + 1/(d_i d_j)]$$

The co-author model

Efficient:



Pairwise Stable:

Results

No direct costs to links.

- ▶ **Efficient networks:** pairs
- ▶ **Pairwise stable networks:** completely connected components

Again a tension between stability and efficiency.

Thank you for your attention