

Algorithmic and Economic Aspects of Networks

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Networked Markets

Garmets Market

Marseille Fish Market

Labor Markets

Why Network

Trust, predicability, referrals,
incomplete contracts, friction,
moral hazard/adverse selection

price, reputation

Labor Markets

better

“You hear about jobs through your friends.”

– Granovetter

Boorman's Model

Network of **strong** and **weak** ties

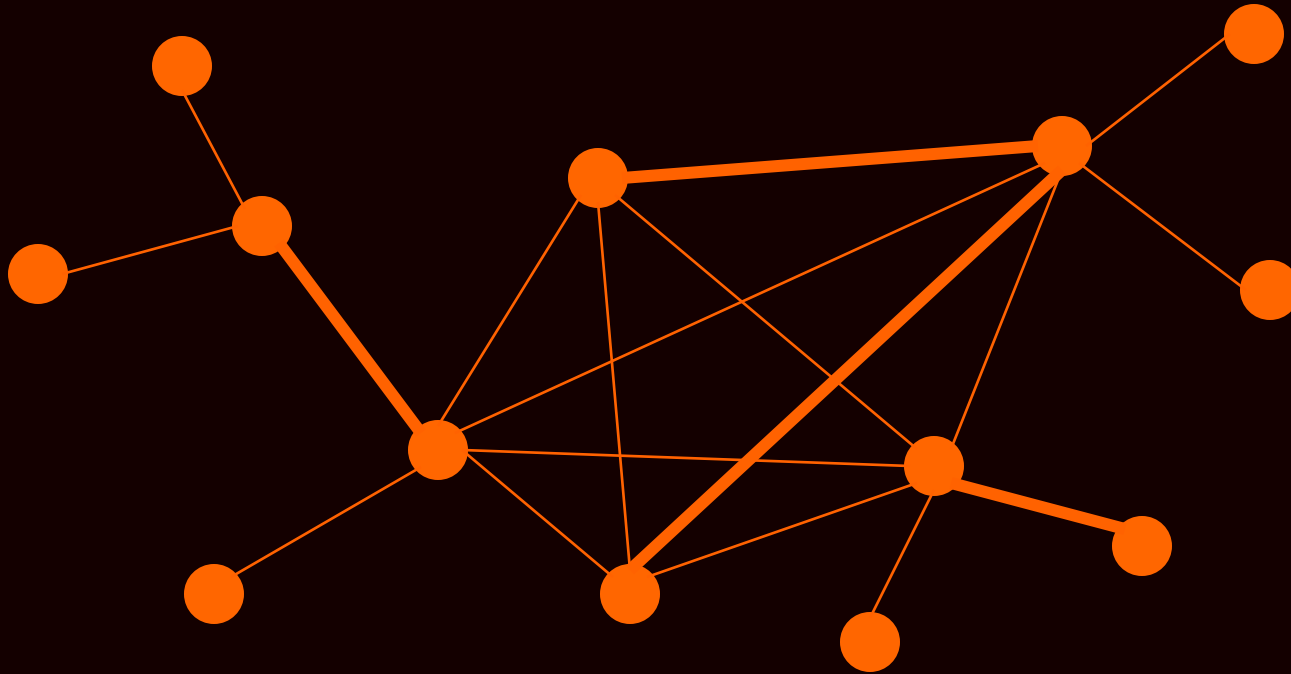
Preferential flow of information about job openings through network

Strong and Weak Ties



$$\text{Weak} + \lambda \cdot \text{Strong} = \text{Time}$$

Information Flow



- 1) People need jobs with prob. μ .
- 2) People hear about jobs with prob. δ .
- 3) People tell (stronger) friends about jobs.

Boorman's Results

Study trees, fix degree of strong/weak ties, consider equilibria via simulation

- 1) As cost of strong ties \uparrow , # strong ties \downarrow .
- 2) As unemployment prob. \downarrow , # strong ties \downarrow .

What's Missing?

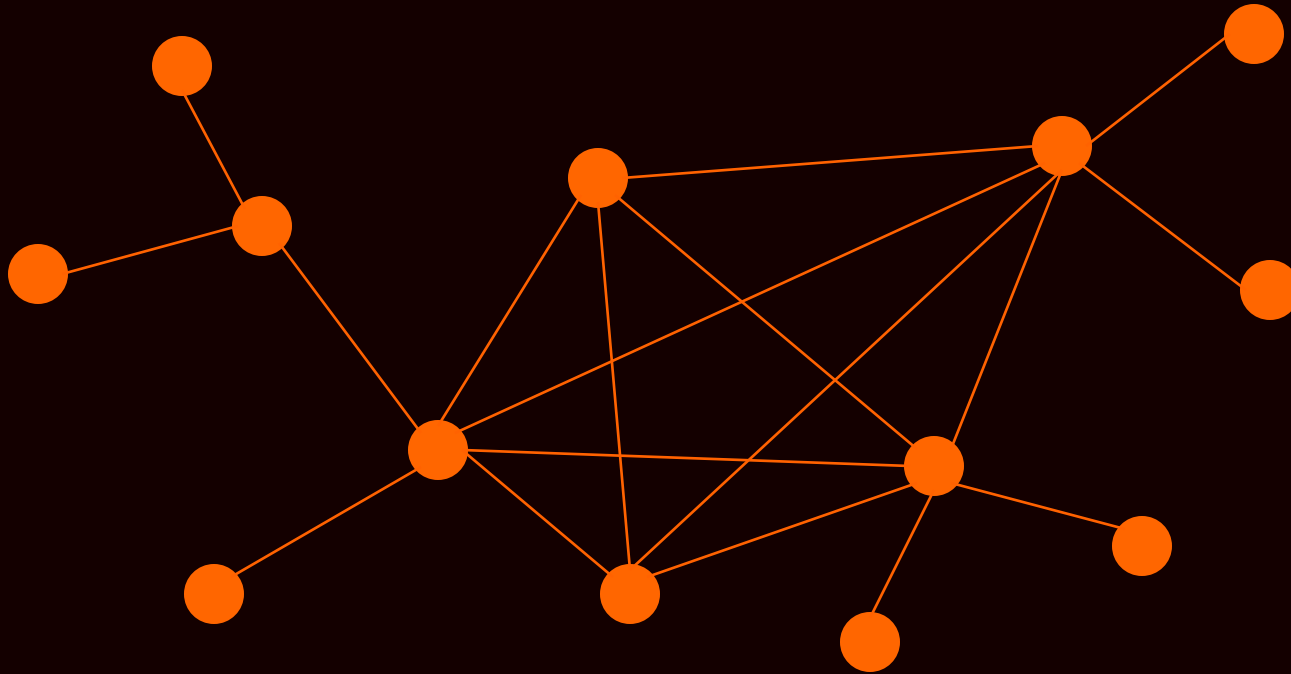
network architecture, e.g., weak ties more likely to be bridges

correlation in employment state over time and network structure

Carvo-Armengol & Jackson

Drop strong/weak distinction, but
incorporate time.

Information Flow



- 1) People need jobs with prob. μ .
- 2) People hear about jobs with prob. δ .
- 3) People tell friends about jobs.

Tarred with the Same Brush

Time causes correlation in employment:

you are more likely to find a job if
more of your friends have jobs

Persistence of (Lack of) Luck

The longer you are unemployed, the less likely you will find a job tomorrow:

because you are more likely to have more unemployed neighbors

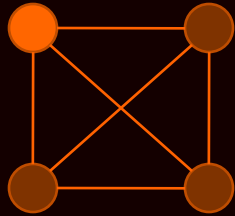
Education

Agents can pay cost c_i to be educated.

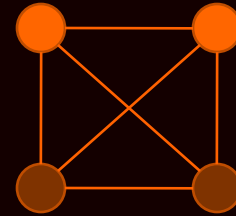
educated – apply previous model

uneducated – payoff zero

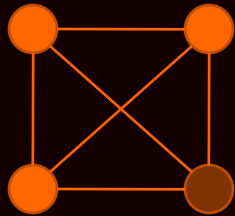
Poverty Traps



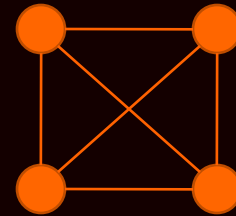
Payoff: $0.5 - c_i$



Payoff: $0.6 - c_i$



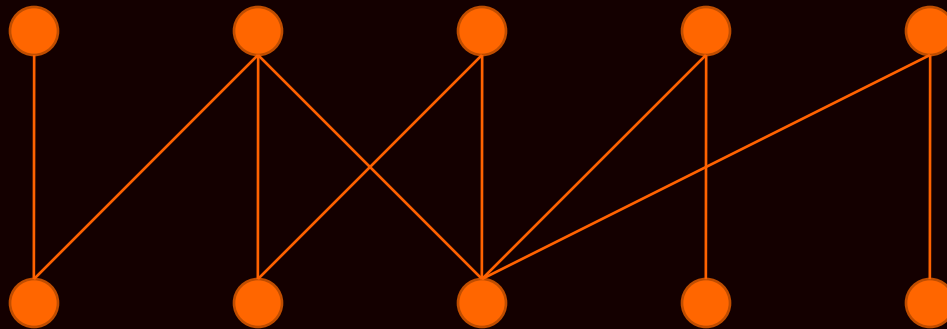
Payoff: $0.65 - c_i$



Payoff: $0.69 - c_i$

Networked Exchange Theory

Network represents potential trades



what prices result?

Nash Bargaining

How to split a dollar?



Matt (\$0.50)



Mykell (\$0.50)

If negotiations fail, you get nothing.

Nash Bargaining

How to split a dollar?



Trevor (\$0.70)

William (\$0.30)

If negotiations fail, Trevor gets \$0.60, William gets \$0.20.

Nash Bargaining

Any division in which each agent gets at least the outside option is an equilibrium.

Yet agents usually agree to **split the surplus**.

Nash Bargaining

If when negotiation **fails**,

- A gets \$a
- B gets \$b

Then when **succeed**,

- A gets $\$(a + s/2)$
- B gets $\$(b + s/2)$

$s = (1 - a - b)$
is the surplus

Nash Bargaining

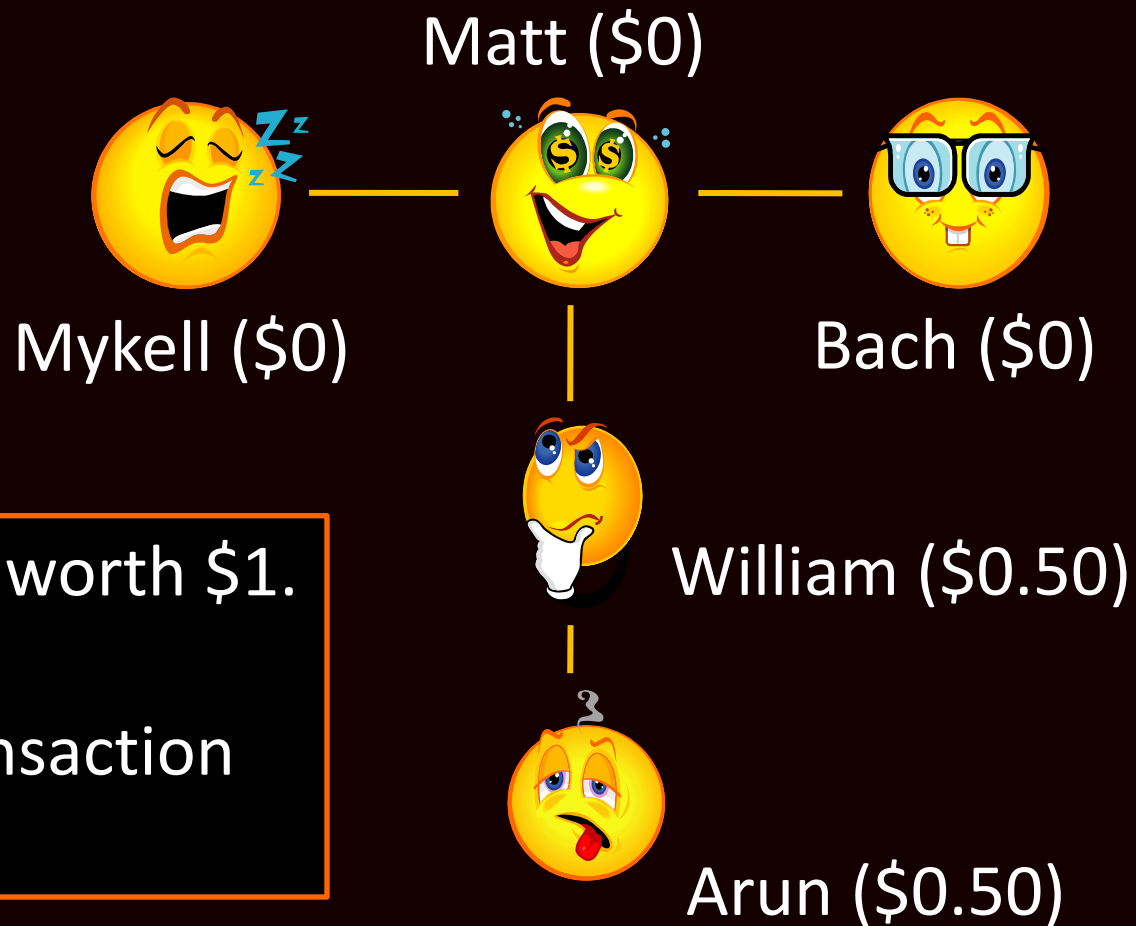
Nash: "Agents will agree to split the surplus."

Motivated by axiomatic approach, optimization approach, and outcome of particular game-theoretic formulations.

Bargaining in Networks

Value of outside option arises as result of network structure.

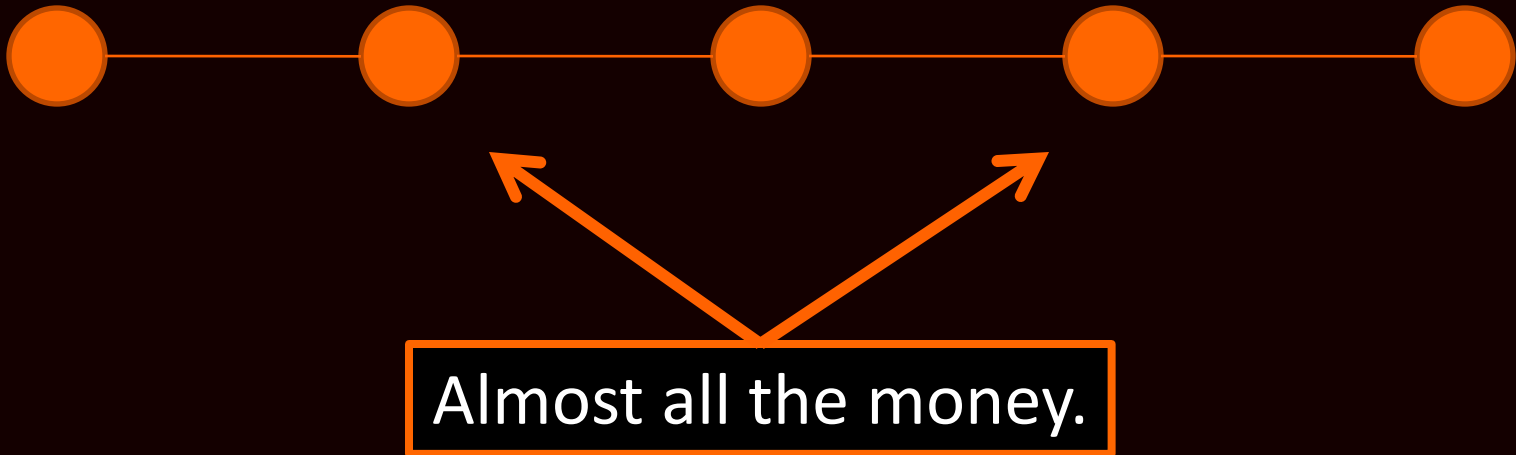
Bargaining in Networks



Transactions worth \$1.

Only one transaction per person!

Bargaining in Networks

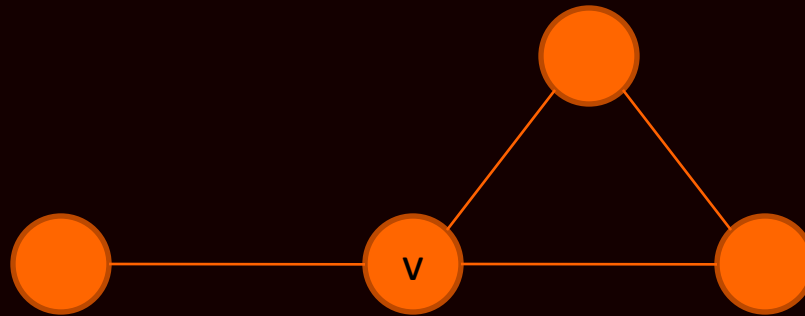


Bargaining in Networks



v gets between $7/12$ and $2/3$ in negotiation to left.

Bargaining in Networks



v gets between $1/2$ and 1 in negotiation to left.

Cook and Yamagishi

A solution for a network G is a **matching M** and a set of **values v_u** for each node u s.t.,

- For (u,v) in M , $v_u + v_v = 1$
- For unmatched nodes u , $v_u = 0$

Stable Outcomes

Node u could negotiate with unmatched neighbor v and get $(1 - v_v)$.

Outside option of u is $\alpha_u = \text{maximum over unmatched neighbors } v \text{ of } (1 - v_v)$.

Stable Outcomes

Defn. An outcome is **stable** if for all u , $v_u \geq \alpha_u$.

Notice there are many stable outcomes, so which one should we expect to find?

Balanced Outcomes

Each individual bargaining outcome should agree with the Nash bargaining solution.

$$s_{UV} = 1 - \alpha_U - \alpha_V$$

$$v_U = \alpha_U + s/2$$

And similarly for v_V .

Computing Balanced Outcomes

A balanced outcome exists if and only if a stable outcome exists.

Balanced outcomes can be computed and characterized using Edmonds-Galai decompositions.

[Kleinberg-Tardos STOC'o8]

Assignment:

- Readings:
 - Social and Economic Networks, Chapter 10
 - The two Kearns papers or a paper on labor markets of your choosing (see refs in book)
- Reaction to paper
- Presentation volunteers?