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SMR.1656 - 14

School and Workshop on Structure and Function of Complex Networks

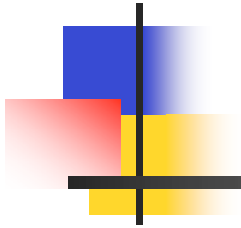
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Complex Networks, Public Goods and Externalities

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These are preliminary lecture notes, intended only for distribution to participants

Complex networks, public goods and externalities



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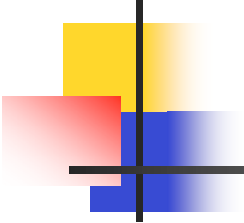
Many interesting phenomena combine:

Local interaction: as embedded in the social network

Local externalities: reflected by a payoff/profit function whose arguments are choices in the neighborhood

Examples:

- **Investment in education:** benefits to an agent of effort devoted to education (research) depends on efforts of people with whom he interacts.
- **Information acquisition:** returns to gathering information are shared locally if new knowledge is pooled with “neighbors”.
- **Technological adoption:** payoffs of a technology depends on number of neighbors who use it (issue of compatibility)
- **Crime and social pathologies:** inducement to crime and other misbehavior is shaped locally by the behavior of friends, classmates, family.



Formally, let $\Gamma = \{ij \in 2^N : i \leftrightarrow j\}$
be the underlying **social network**

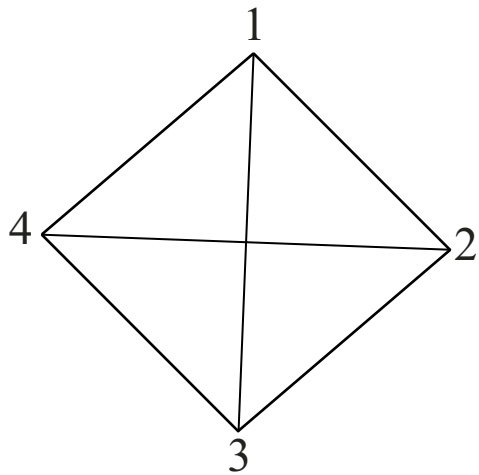
Paradigmatic payoff functions:

- **complementary efforts** $\pi_i(e_i, \vec{e}_{-i}; \Gamma) = \phi\left(e_i \times \prod_{j \in N_i} e_j\right) - c(e_i)$
(investment in education)
- **substitutable efforts** $\pi_i(e_i, \vec{e}_{-i}; \Gamma) = \phi\left(e_i + \sum_{j \in N_i} e_j\right) - c(e_i)$
(public good, e.g. information)

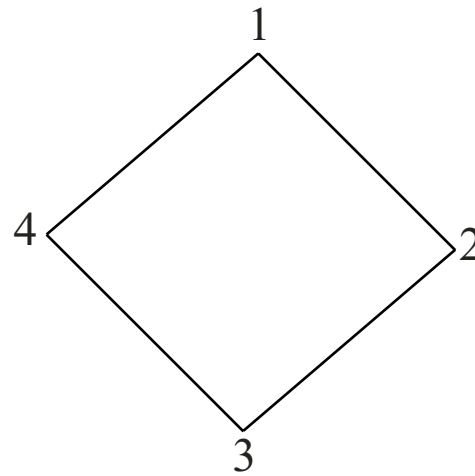
where $\phi(\cdot)$ and $c(\cdot)$ are positive increasing functions



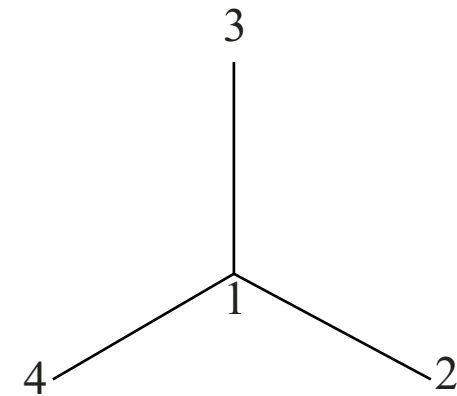
Assume $n = 4$ and three possible networks:



complete



cycle



star

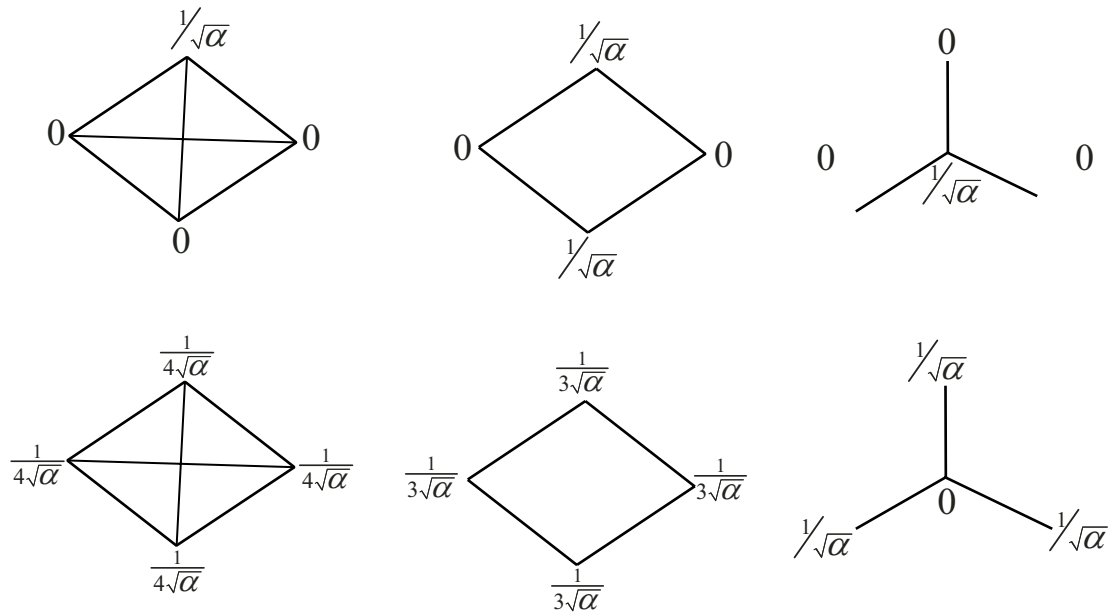
Nash equilibria: effort profiles

substitutable efforts

with

$$\phi(x) = 2\sqrt{x}$$

$$c(e_i) = \alpha e_i, \quad \alpha > 0$$

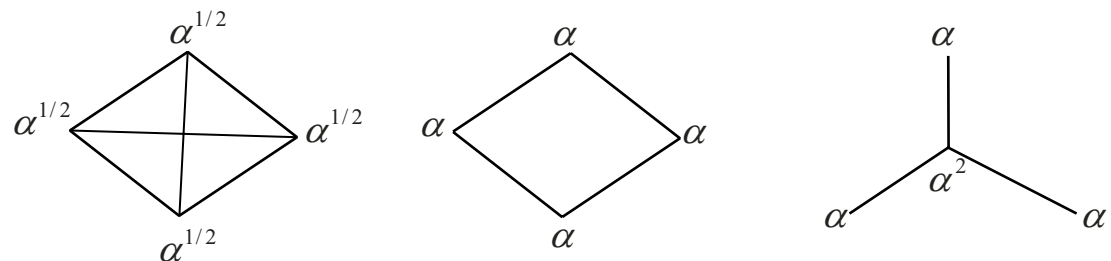


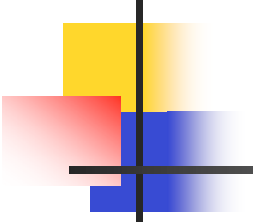
complementary efforts

with

$$\phi(x) = x$$

$$c(e_i) = \frac{1}{2}\alpha e_i^2, \quad \alpha > 0$$





In general, Nash equilibria display high complexity or/and wide multiplicity!

Complexity/multiplicity “finely” depends on the **overall** network architecture

Is it reasonable to posit that players can tailor behavior to such precise knowledge of the network?

If network is complex, players might have only

- local information (e.g. her degree)
- overall aggregate information on statistical regularities

This suggests looking at

- games of incomplete information
- on an underlying random (complex) network

Then, we find sharper predictability and enhanced tractability!!



Model

Large (infinite) population N interacts via network Γ

Network Γ : realization of a **statistical ensemble** characterized by **degree distribution** $\mathbf{p} = \{p_\kappa\}_{\kappa=0}^\infty$

- Each agent $i \in N$ is **informed only** of his degree κ_i

- he has prior $\tilde{\mathbf{p}} = \{\tilde{p}_\kappa\}_{\kappa=0}^\infty$ with $\tilde{p}_\kappa = \frac{p_\kappa \kappa}{\sum_{\kappa'} \kappa' p_{\kappa'}}$

for the degree of each of his κ_i neighbors

- he has to **choose effort level** $e_i \in \mathbb{R}_+$



Payoffs: complementary efforts

[Galeotti and Vega-Redondo (2005)]

Let $\hat{e} = \{\hat{e}(\kappa)\}_{\kappa=0}^{\infty}$ be the strategy played by population

Denote $\psi_{\kappa}(e_i, \hat{e}) \equiv \mathbf{E}_p \left[\phi \left(e_i \times \prod_{j \in N_i} e_j \right) - c(e_i) \mid \kappa_i = \kappa, e_j = \hat{e}(\kappa_j) \right]$

the expected payoff of an agent of degree κ

when population strategy is $\hat{e} = \{\hat{e}(\kappa)\}_{\kappa=0}^{\infty}$



Simplifying assumptions

linear utility:

$$\phi(x) = x$$

quadratic costs:

$$c(e_i) = \frac{1}{2}\alpha e_i^2, \quad \alpha > 0$$

Then:

$$\psi_{\kappa}(e, e^*) = \sum_{\substack{r=(r_1, r_2, \dots) \\ r_1+r_2+\dots=\kappa}} P_{\kappa}(r_1, r_2, \dots) \left[e \times \underbrace{e^*(1) \times \dots \times e^*(1)}_{r_1 \text{ times}} \times \underbrace{e^*(2) \times \dots \times e^*(2)}_{r_2 \text{ times}} \times \dots \right] - \frac{1}{2}\alpha e^2$$

with multinomial probabilities:

$$P_{\kappa}(r_1, r_2, \dots) \equiv \frac{\kappa!}{r_1! r_2! \dots} (\tilde{p}_1)^{r_1} \times (\tilde{p}_2)^{r_2} \times \dots$$



Bayes-Nash equilibrium

A strategy $e^* = \{e^*(\kappa)\}_{\kappa=0}^{\infty}$ defines a

Bayes-Nash Equilibrium (BNE) if

$$e^*(\kappa) \in \arg \max_{e \in \mathbb{R}_+} \psi_{\kappa}(e, e^*) \quad (\kappa = 0, 1, 2, \dots)$$

FONC at BNE: $\frac{\partial \psi_{\kappa}}{\partial e}(e, e^*) \Big|_{e=e^*(\kappa)} = 0 \quad (\kappa = 0, 1, 2, \dots)$

FONC yield

$$\left\{ \begin{array}{l} \alpha e^*(0) = 1 \\ \alpha e^*(1) = \sum_{\kappa'} \tilde{p}_{\kappa'} e^*(\kappa') \\ \alpha e^*(\kappa) = \left[\sum_{\kappa'} \tilde{p}_{\kappa'} e^*(\kappa') \right]^{\kappa} \quad (\kappa = 2, 3, \dots) \end{array} \right.$$

so that $e^*(\kappa) = \frac{1}{\alpha} \left(\alpha e^*(1) \right)^{\kappa} \quad (\kappa = 1, 2, 3, \dots)$

and therefore $\alpha e^*(1) = \frac{1}{\alpha} G_1(\alpha e^*(1))$

where $G_1(x) = \sum_{\kappa=1}^{\infty} \tilde{p}_{\kappa} x^{\kappa}$ is gen. fctn. of $\tilde{\mathbf{p}} = \{\tilde{p}_{\kappa}\}_{\kappa=0}^{\infty}$

Consequently, $\{e^*(\kappa)\}_{\kappa=1}^{\infty} \begin{array}{c} \uparrow \\ \downarrow \end{array}$ if $\begin{array}{l} \alpha e^*(1) > 1 \\ \alpha e^*(1) < 1 \end{array}$



Three paradigmatic scenarios

1. Poisson networks

$$p(\kappa) = \exp(-z) \frac{z^\kappa}{\kappa!} \quad \kappa = 0, 1, 2, \dots$$

z average connectivity

2. Scale-free networks

$$p(\kappa) = \frac{1}{\mathfrak{R}(\gamma)} \kappa^{-\gamma} \quad \kappa = 1, 2, \dots$$

$$\mathfrak{R}(\gamma) = \sum_{\kappa \geq 1} \kappa^{-\gamma} \text{ (Riemann zeta), } \gamma > 2$$

3. Geometric networks

$$p(\kappa) = (1 - \gamma) \gamma^\kappa \quad \kappa = 0, 1, 2, \dots$$

$$0 < \gamma < 1$$



Poisson degree distributions

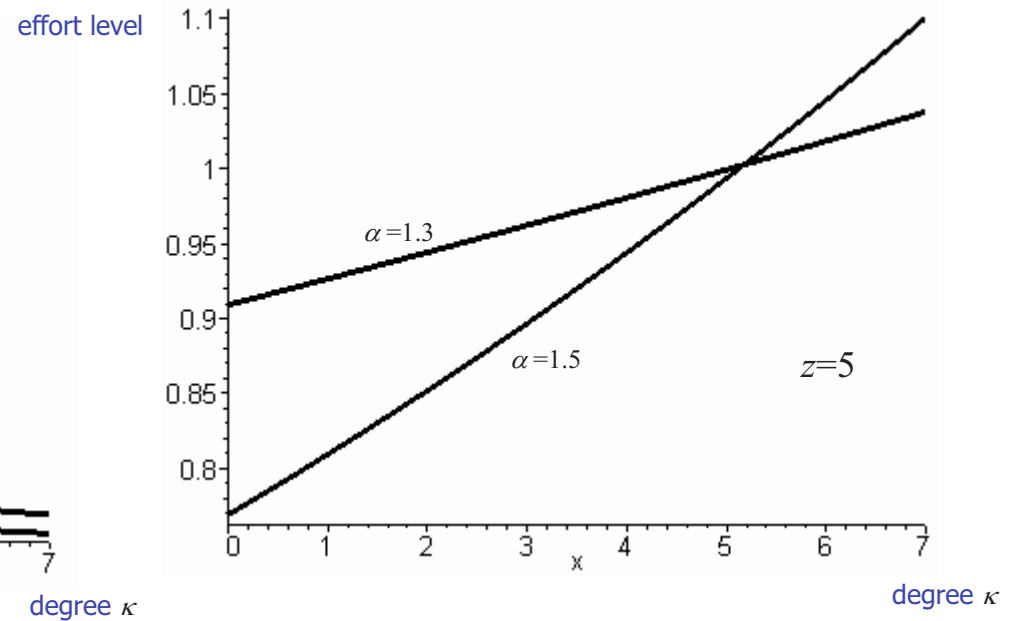
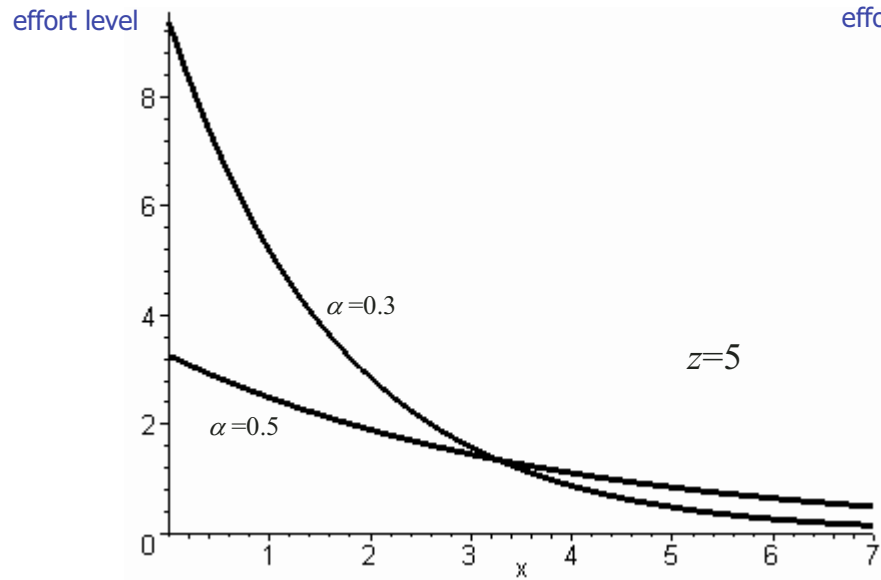
The equilibrium strategy $e^* = \{e^*(\kappa)\}_{\kappa=0}^{\infty}$ satisfies:

$$e^*(\kappa) = \frac{1}{\alpha} \left(\frac{\ln \alpha + z}{z} \right)^\kappa \quad (\kappa = 0, 1, 2, \dots)$$

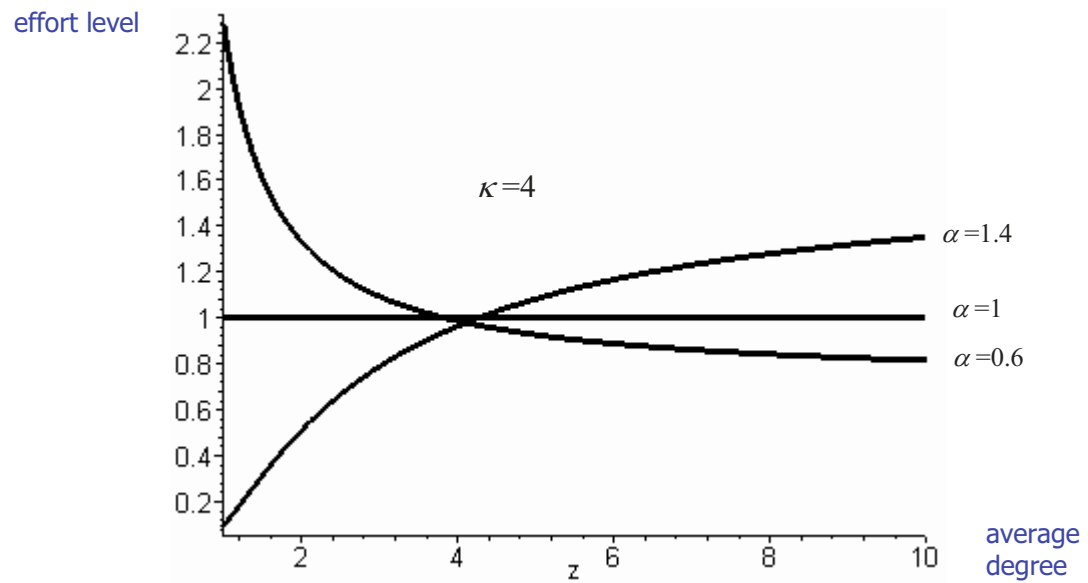
which is well defined as long as $\alpha \geq \frac{1}{\exp z}$

Otherwise, “snowball effect” incompatible with equilibrium displaying positive efforts,

and unique trivial equilibrium $\tilde{e}(\kappa) = 0 \quad (\kappa = 0, 1, 2, \dots)$



comparative equilibrium analysis





Scale-free degree distributions

There exists **one non-trivial equilibrium strategy**

$$\mathbf{e}^* = \{e^*(\kappa)\}_{\kappa=0}^{\infty}$$

if, and only if, $1 \geq \alpha > \frac{1}{\Re(\gamma-1)}$

(Recall $\gamma > 2$ and, therefore, $\Re(\gamma-1) < +\infty$)

If $\alpha < 1$, this equilibrium has:

$$e^*(0) > e^*(1) > e^*(2) > \dots$$



Geometric degree distributions

There are **two** non-trivial equilibrium strategies:

1) $\mathbf{e}^H = \{e^H(\kappa)\}_{\kappa=0}^{\infty}$ s.t. $e^H(\kappa) = \alpha^{\kappa-1} \left(\frac{\alpha + \sqrt{\alpha}(1-\gamma)}{\gamma\alpha^2} \right)$ ($\kappa = 0, 1, 2, \dots$)

with $e^H(0) < e^H(1) < e^H(2) < \dots$

2) If $\alpha \geq (1-\gamma)^2$, $\mathbf{e}^L = \{e^L(\kappa)\}_{\kappa=0}^{\infty}$ s.t. $e^L(\kappa) = \alpha^{\kappa-1} \left(\frac{\alpha - \sqrt{\alpha}(1-\gamma)}{\gamma\alpha^2} \right)$ ($\kappa = 0, 1, 2, \dots$)

with $e^L(0) > e^L(1) > e^L(2) > \dots$

In a sense, combination of conclusions obtained for
Poisson and scale-free degree distributions



Summary and conclusions

Illustration of how

- Network complexity
 - Strategic behavior
- } can be integrated in social network analysis

Topological features of the network have key implications

Approach may be generalized/extended to other contexts



E.g. Galeotti, Goyal, Vega-Redondo (2005)

Focus on **general** random networks & aggregative payoffs:

$$\pi_i(e_i, \vec{e}_{-i}; \Gamma) = \psi \left(e_i, \sum_{j \in N_i} e_j \right)$$

Consider two cases: **Strategic complements** $\frac{\partial^2}{\partial x \partial y} \psi(x, y) \geq 0$
 Strategic substitutes $\frac{\partial^2}{\partial x \partial y} \psi(x, y) \leq 0$

Preliminary } complements \Rightarrow Efforts increase in degree
conclusions } substitutes \Rightarrow Efforts decrease in degree

To understand: **How specific features of network topology affect details of “strategic” behavior**