

Topics in Experimental and Behavioral Economics

Social behavior on networks

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Why of interest?

1. Social embeddedness of economic decision making
(Coleman AER 1984, Granovetter AJS 1985)

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2. Strength of weak ties (Granovetter AJS 1973)

3. Networks structures and cooperation - Imitation and locality

4. Free choice for free people

Exogeneous & endogenous structures

1. Cooperation on exogenously imposed structures
2. Cooperation on endogenously chosen structures

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Social behavior on exogenous structures

Cassar 2002/2004

- To which extent do network structures influence cooperation and coordination?
- Network structures can be:
 - **Local** → links form a simple lattice structure such as a circle or grid
 - **Random** → links are equally likely between each pair of agents
 - **Small-world** → local with a few links substituted by long-distance links

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Game in network

- Each agent is playing a 2×2 normal form game with all her neighbors

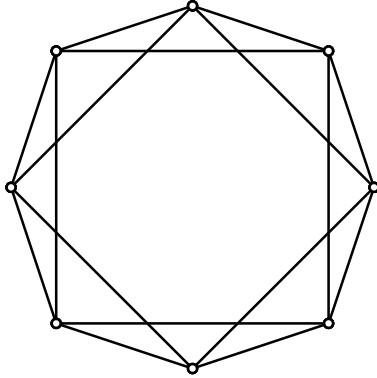
Single strategy \leftrightarrow no neighbor contingent choices

Payoff to player i	neighbor j	
	A_j	B_j
$\Pi = \frac{\sum_{j \in L_i} \pi_i(\sigma_i, \sigma_j)}{ L_i }$	A_i	B_i
player i	a, a	b, b
L_i ... set of neighbors	a, c	b, d
$l_i := L_i $... cardinality of L_i		

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- Coordination: $a > c, d > b, a > d, a - c < d - b$
 ($a = 5, b = -1, c = 4, d = 1$)
 \Rightarrow all A payoff dominant, all B risk dominant
- Cooperation: $c > a, d > b$ and $a > d$ ($a = 4, b = 0, c = 5, d = 1$)
 \Rightarrow all A Pareto efficient, all B standard Nash

Network structures - Local

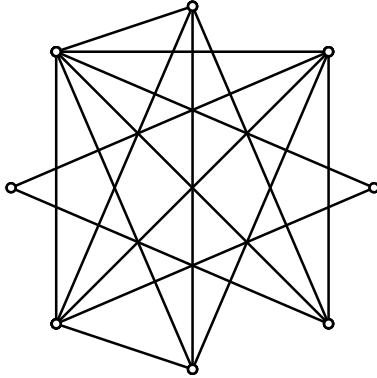


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- $N (= 18)$ players are arranged on circle
- may interact only with l_i (4) most immediate neighbors
- gives $Nl_i/2$ connections
- clustering coefficient $C = 0.5$
- characteristic path length $D = 2.647$

Network structures - Random

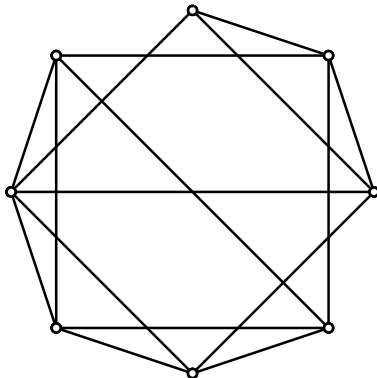
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- N players 'form' random links
- each pair has equal probability to become connected
- rewiring each of the $Nl/2$ connections of the local structure \rightarrow each agent is connected with an average of l other agents which can be located anywhere on the circle
- clustering coefficients $C = 0.181, 0.061, 0.180$
- characteristic path length $D = 2.033, 2.026, 2.078$

Network structures - Small world

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- has properties of both the local and the random structure
- N players form random links
- rewiring each of the $Nl/2$ connections of the local structure with very small probability \rightarrow most agents are still connected to immediate neighbors with only few links to players far away on the circle
- clustering coefficients $C = 0.406, 0.472, 0.354$
- characteristic path length $D = 2.301, 2.458, 2.366$

Cassar's hypotheses

- Coordination game: High clustering helps to coordinate on payoff dominant equilibrium
- Cooperation game: High clustering fosters cooperation
- Coordination game: Shorter characteristic path length leads to faster convergence towards (any) equilibrium
- Cooperation game: Shorter characteristic path length is bad for cooperation

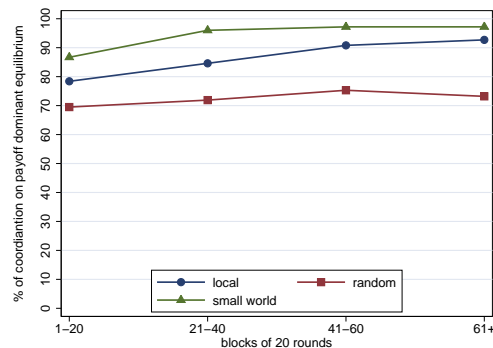
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Thus:

1. Local and small world networks exhibit most coordination on payoff dominant equilibrium; coordination is fastest in small world
2. Cooperation is highest in local network

Cassar's results - coordination

- Coordination game



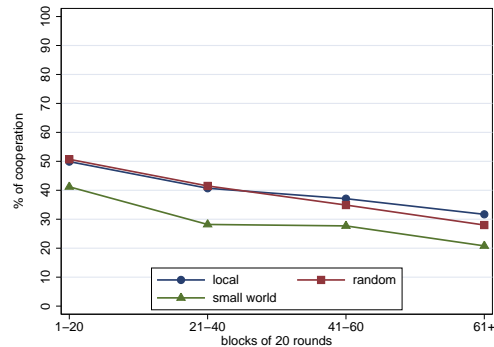
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- Interactions on local structures cause faster coordination than interaction on random structures
- This coordination is rather on the payoff dominant than on the risk dominant equilibrium

Cassar's results - cooperation

- Cooperation game

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- Cooperation is hard to sustain independent of the network structure
- Cooperation does relatively best on the local structure and relatively worst in the small world

Cassar's conclusions

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- Different network structures lead to different behavior
- Small world leads to fast equilibration
- Subjects mostly coordinate on payoff dominant equilibrium on all network structures
- Subjects are not able to sustain cooperation on any of the network structures

Caveat: Isn't any connected network in the lab a small world?

Cooperation on endogenous structures

Riedl & Ule 2005 w.i.p.

- People are (often) free to choose with whom to interact
- Network structures become endogenous
- Examples:
 - trade network in Oceania
 - information networks
 - boycott of strikebreakers
 - stock market crowds
- Exclusion as cooperation enforcement device

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Cooperation on endogenous structures - cont.

- Interaction with important (exogenous) environmental parameters
 - outside opportunities
 - information on the network
- Simultaneous dynamics of network structure and cooperative behavior
 - up to now: mainly considered in isolation

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The Network Game

- Basic game: **Social dilemma** game

	<i>Cooperate</i>	<i>Defect</i>
<i>Cooperate</i>	50, 50	10, 70
<i>Defect</i>	70, 10	30, 30

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The Network Game

- Extended basic game: **Social dilemma** game with **outside option**.

	<i>Cooperate</i>	<i>Defect</i>	<i>Refuse</i>
<i>Cooperate</i>	50, 50	10, 70	v, v
<i>Defect</i>	70, 10	30, 30	v, v
<i>Refuse</i>	v, v	v, v	v, v

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- n -players extension - embedded in an endogenous network
 - refusing to play = refusing a link
 - exclusion is possible (could be costly)
 - two-sided linking, uniform action

The Network Game

- A **player's payoff** in the network game:

$$\pi_i(s_i, s_{-i}, L_i) = \sum_{j \in L_i} u(s_i, s_j) + \sum_{j \notin L_i} v$$

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- $L_i \longrightarrow$ neighbors of i after links are formed
- $s_i \in \{C, D\} \longrightarrow$ decision of i in the social dilemma game

Note: mutual link formation, no costs of linking; behavior in social dilemma not neighbor contingent

(computer screen)

Experimental Design and Treatments

- Number of players in experiment $n = 6$
- Repeated play with partners for 60 rounds
- **Four experimental treatments:** differ in **outside option value** and **information** about other players' past behavior
 - **Low** outside option: $v = 0$
 - **High** outside option: $v = 40$
 - **Maximal information:** **all** past choices of **all** others in the group
 - **Minimal information:** **only actions** of **neighbors**
- **Control treatment:** exogenously fixed full network

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Theory - One-Shot Game

Standard preferences:

- **LowMax**
 - **complete network** & **full defection** in unique strict Nash equilibrium (SNE)
 - non-strict Nash equilibria with empty or partial network
- **HighMax**
 - **empty network** in any Nash equilibrium

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Proposing a link and cooperating is never part of an equilibrium strategy, regardless of the outside option value v

- **FullFix**
 - **full defection** in unique Nash equilibrium

Theory - One-Shot Game

Two alternative models:

- **Levine - intentional altruism**

$$u_i(\pi) = \pi_i + \sum_{j \neq i} \frac{a_i + \lambda a_j}{1 + \lambda} \pi_j$$

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$$-1 < a_i < 1 \quad \text{and} \quad \lambda = 0.45$$

- **Fehr & Schmidt - inequity aversion**

$$u_i(\pi) = \pi_i - \frac{\alpha_i}{n-1} \sum_j \max\{\pi_j - \pi_i, 0\} - \frac{\beta_i}{n-1} \sum_j \max\{\pi_i - \pi_j, 0\}$$

$$0 \leq \beta_i < 1 \quad \text{and} \quad \beta_i \leq \alpha_i$$

Theory - One-Shot Game

Levine - intentional altruism: (Levine's estimate of $a_i < 0.5$)

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- **LowMax**
 - complete network & cooperation in SNE \Rightarrow coops' *average* $a_i \geq 0.5$
 - non-strict Nash equilibria with empty or partial network & cooperation only if $a_i \geq 0.5$ for some i
 - $a_i < 0.5 \Rightarrow$ **full defection** & **complete network** in SNE
- **HighMax**
 - sub-networks of cooperators with *average* $a_i \geq 0.5$
 - $a_i < 0.5 \Rightarrow$ **empty network**
- **FullFix**
 - cooperation \Rightarrow coops' *average* $a_i \geq 0.5$
 - $a_i < 0.5 \Rightarrow$ **full defection**

Theory - One-Shot Game

Fehr & Schmidt - inequity aversion: FS's estimate of $\beta_i \leq 0.6$

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- **LowMax**
 - complete network & cooperation in SNE \Rightarrow *each* $\beta_i > 0.7$
 - partial cooperation in some network in SNE \Rightarrow coop's $\beta_i \simeq 1$
 - NE's with empty or partial network & cooperation \Rightarrow coop's $\beta_i \simeq 1$
 - $\beta_i \leq 0.6 \Rightarrow$ **full defection** & **complete network** in SNE
- **HighMax**
 - clique (sub-network) of cooperators *each* with $\beta_i > 0.7$ in SNE
 - $\beta_i \leq 0.6 \Rightarrow$ **empty network**
- **FullFix**
 - cooperation \Rightarrow *each* $\beta_i > 0.7$
 - $\beta_i \leq 0.6 \Rightarrow$ **full defection**

Theory - Repeated Game

Assuming parameter estimates of Levine and Fehr & Schmidt:

- **LowMax**
 - **All models** - intuitive: complete network and full defection in all rounds; but “Folk Theorem”
- Slide 23 • **HighMax**
 - **All models** - empty network in all rounds
- **FullFix**
 - **All models** - full defection in all rounds

Incomplete information models → multiplicity of equilibria

Let the data speak!

Experimental Treatments and Procedures

Experimental treatments (# of groups)		
Information:	Maximal	Minimal
$v = 0$	I: LowMax (6)	II: LowMin (6)
$v = 40$	III: HighMax (7)	IV: HighMin (8)
V: FullFix (5)		

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- Eleven sessions with 192 subjects
- Each session took approximately two hours
- Average earning per subject: 24.12 Euro
- Computerized experimental sessions at CREED laboratory

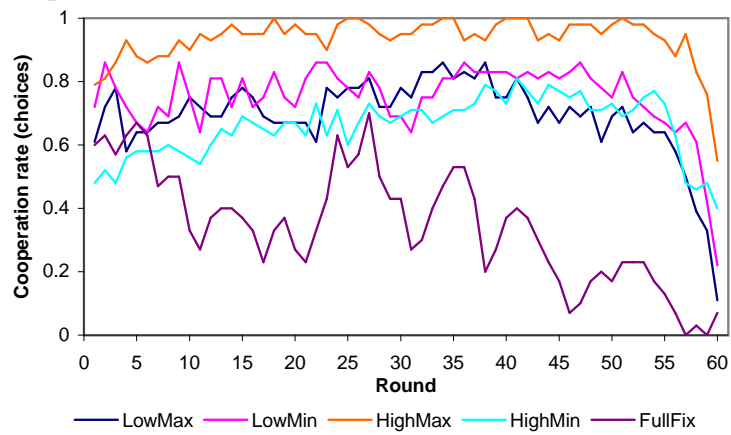
Experimental Results

A snapshot of what happened. "ExclThenCoop(S6G2HighMax)"

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Experimental Results

- Cooperative choices - All rounds



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Experimental Results

Short Summary - Cooperative Behavior

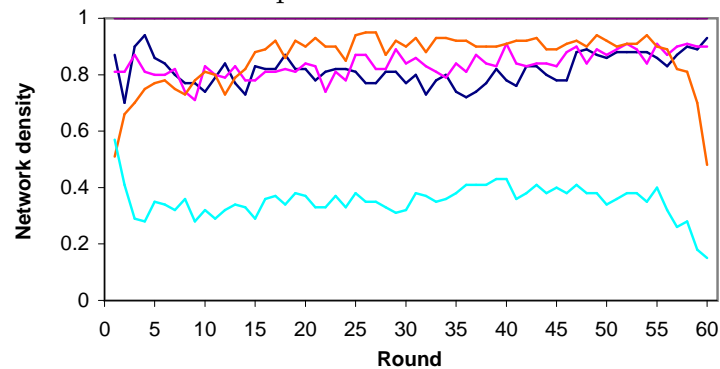
- Compared to the exogenous network treatment (FullFix) the action choices in the treatments with **endogenous network formation** are significantly **more cooperative** and exhibit significantly **more stability**.

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Endogenous network formation seems to be a powerful mean for promoting *and* stabilizing cooperation at a high level

Experimental Results

- **Network structures - network densities:** established links as a fraction of potential links.



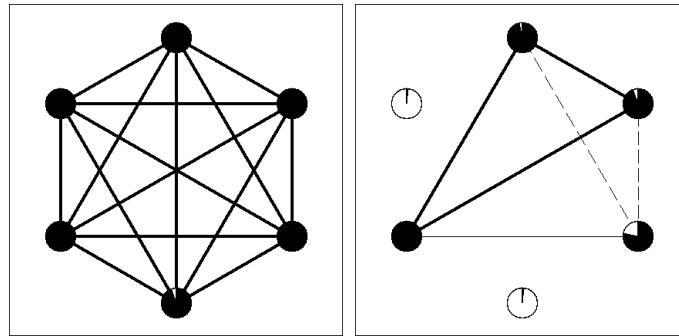
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viewer[2Excluded(S7G2HighMin)]

Experimental Results

- **Network structures:** two ‘typical’ average social structures.

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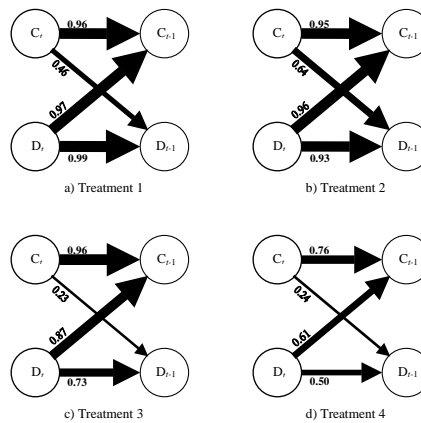
(a) HIGHMAX(GR.6)

(b) HIGHMIN(GR.2)

Experimental Results

- **Network structures - proposed links: defectors are excluded**

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Experimental Results

Short Summary - Network Structure

- Intending cooperators are much more likely to propose links to previous period cooperators than to previous period defectors.
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- Cooperators exclude defectors more often when exclusion is cheap (high outside option) than when it is more costly (low outside option).
 - Defectors try to link to everybody.
 - With high outside option and low information isolation of early round defectors occurs.

Reconciling the Behavioral Dynamics

A simple model of Adaptive Play

- Use simple heuristics
- Look only two steps ahead
- Selfish, altruistic, or inequity averse
- Consider 4 possible heuristics:

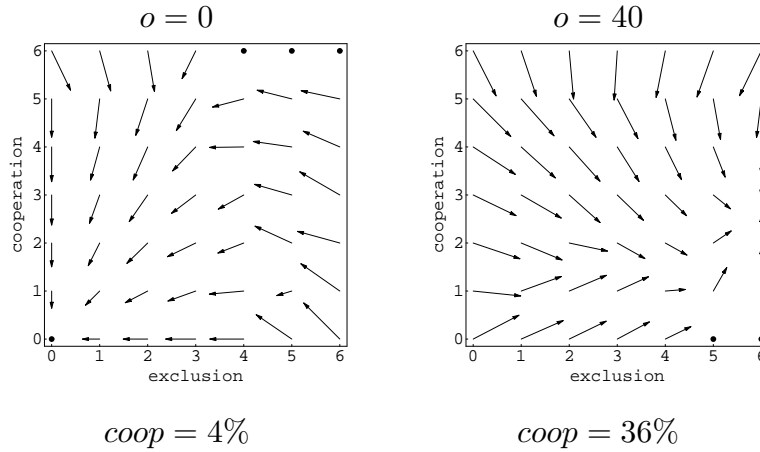
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	<i>Always link</i>	<i>Exclude defectors</i>
<i>Cooperate</i>	<i>CA</i>	<i>CE</i>
<i>Defect</i>	<i>DA</i>	<i>DE</i>

- Updating: strategy which maximizes payoff for next two rounds; but random errors
- Use computer simulations

Adaptive play - Purely selfish players

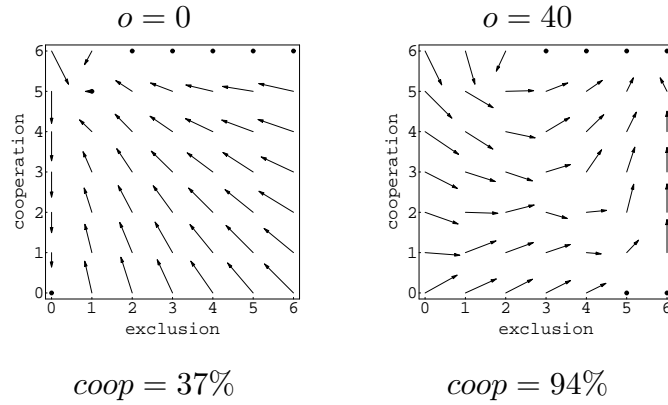
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Adaptive play - Intentional altruists

Intentional altruists ($a_i = 0.453$) looking ahead

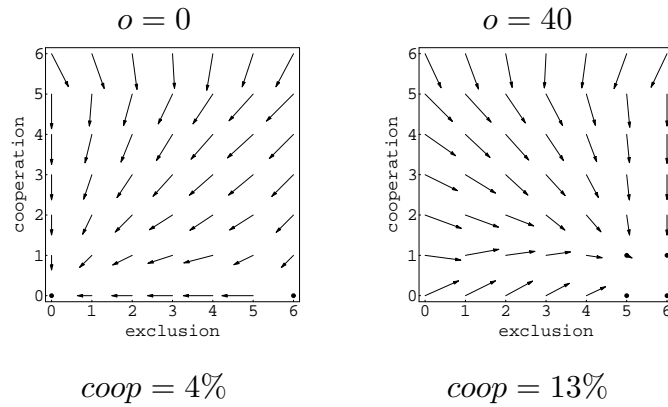
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Model of adaptive play - Shortsighted players

Intentional altruists ($a_i = 0.453$) myopic

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Note - The role of mutual linking

- **Cooperative choices:** fraction of players who choose to cooperate (with 1-sided link formation).

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