

# Rationality and Complexity in Games

Rajiv Sethi

Dynamics of Complex Systems July 2019

## Overview

### Lecture I: **Fundamentals** and **Paradoxes**

- Players, Strategies, and Payoffs
- Nash Equilibrium
- Extensive Form Games
- Paradoxes

### Lecture II: **Complexity** and **Rationality**

- Repeated Games
- Finite Automata
- Procedural Rationality
- Disequilibrium Dynamics

## Experiment

- Ten players
- Each person chooses a (rational) number in the interval  $[0, 100]$
- We compute **half the average**
- Player **closest** to half the average gets \$1000 (shared equally if tied)
- All others get \$0

## Games

A game is defined by

- A set of **players**  $\{1, \dots, n\}$
- For each player  $i$ , a set of **strategies**  $S_i$
- A **payoff function**  $u : S_1 \times \dots \times S_n \rightarrow \mathbf{R}^n$

**Pure strategies** involve a complete plan of **contingent actions**

Chess:  $\approx 10^{47}$  board positions; more pure strategies than atoms in universe

**Mixed strategies** involve randomizations over the set of pure strategies

## Nash Equilibrium

A **strategy profile**  $(s_1^*, \dots, s_n^*) \in S_1 \times \dots \times S_n$  is a **Nash equilibrium** if

$$u_i(s_i^*, s_{-i}^*) \geq u_i(s_i, s_{-i}^*)$$

for all  $i$  and all  $s_i \in S_i$ .

No player can improve her payoff with a **unilateral** change of strategy

A strategy profile is a **strict** Nash equilibrium if the inequality holds strictly

Chess has an (unknown) equilibrium in pure strategies; not all games do

Equilibrium in the Half-the-Average game?

## Public Goods

	<i>H</i>	<i>M</i>	<i>L</i>
<i>H</i>	6, 6	3, 7	0, 8
<i>M</i>	7, 3	4, 4	1, 5
<i>L</i>	8, 0	5, 1	2, 2

## Public Goods

	<i>H</i>	<i>M</i>	<i>L</i>
<i>H</i>	6, 6	3, 7	0, 8
<i>M</i>	7, 3	4, 4	1, 5
<i>L</i>	8, 0	5, 1	2, 2

## All-Pay Auction

Consider an object with value  $v = \frac{5}{2}$  and two bidders

Simultaneous bids, nonnegative integers, ties broken at random

Strategies and payoffs:

	0	1	2
0	$\frac{5}{4}, \frac{5}{4}$	$0, \frac{3}{2}$	$0, \frac{1}{2}$
1	$\frac{3}{2}, 0$	$\frac{1}{4}, \frac{1}{4}$	$-1, \frac{1}{2}$
2	$\frac{1}{2}, 0$	$\frac{1}{2}, -1$	$-\frac{3}{4}, -\frac{3}{4}$

Does a pure strategy equilibrium exist?



## Nash's Existence Theorem

Does every game have an equilibrium?

If  $S_i$  is a **compact** and **convex** subset of a Euclidian space, and  $u$  is a **continuous** function, then an equilibrium exists

Proof: Application of Kakutani's Fixed Point Theorem

Corollary: Every finite game has a mixed strategy equilibrium

Coordination and Hawk-Dove games have pure and mixed equilibria

## Mixed Strategy Equilibria

The coordination game

	Left	Right
Up	5, 5	0, 3
Down	3, 0	4, 4

has a symmetric mixed strategy equilibrium with probabilities  $(2/3, 1/3)$

The Hawk-Dove game

	Hawk	Dove
Hawk	0, 0	8, 2
Dove	2, 8	5, 5

has a symmetric mixed strategy equilibrium with probabilities  $(3/5, 2/5)$

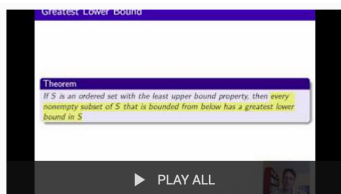
## All-Pay Auction

Strategies and payoffs:

	0	1	2
0	$\frac{5}{4}, \frac{5}{4}$	$0, \frac{3}{2}$	$0, \frac{1}{2}$
1	$\frac{3}{2}, 0$	$\frac{1}{4}, \frac{1}{4}$	$-1, \frac{1}{2}$
2	$\frac{1}{2}, 0$	$\frac{1}{2}, -1$	$-\frac{3}{4}, -\frac{3}{4}$

Symmetric mixed strategy equilibrium with distribution  $(\frac{1}{5}, \frac{3}{5}, \frac{1}{5})$

Equilibrium payoffs are  $\frac{1}{4}$ , collusive payoffs  $\frac{5}{4}$



## Mathematical Methods for Economists

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EDIT



### 01-1 The Least Upper Bound Property

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### 01-2 Functions and Cardinality

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### 01-3 The Bolzano-Weierstrass Theorem

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### 02-1 Metric Spaces

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### 02-2 Sequences and Completeness

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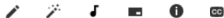
Nash, J.F. (1950) "Equilibrium points in  $n$ -person games." *PNAS*

One may define a concept of an  $n$ -person game in which each player has a **finite set of pure strategies** and in which a definite set of payments to the  $n$  players corresponds to each  $n$ -tuple of pure strategies, one strategy being taken for each player.

For **mixed strategies**, which are probability distributions over the pure strategies, the **pay-off functions are the expectations** of the players, thus becoming **polylinear forms** in the probabilities with which the various players play their various pure strategies.

Any  $n$ -tuple of strategies, one for each player, may be regarded as a **point in the product space** obtained by multiplying the  $n$  strategy spaces of the players.

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## 06-2 Closed Graphs and Fixed Points of Correspondences



Rajiv Sethi

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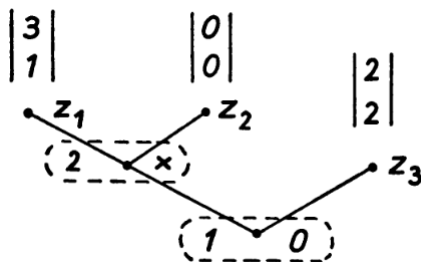
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# SPIELTHEORETISCHE BEHANDLUNG EINES OLIGOPOLMODELLS MIT NACHFRAGETRÄGHEIT

## TEIL I: BESTIMMUNG DES DYNAMISCHEN PREISGLEICHGEWICHTS

von  
REINHARD SELTEN

Frankfurt/M.



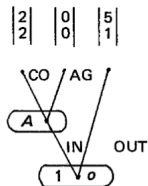
	Left	Right
Left	3, 1	0, 0
Right	2, 2	2, 2

## REINHARD SELTEN

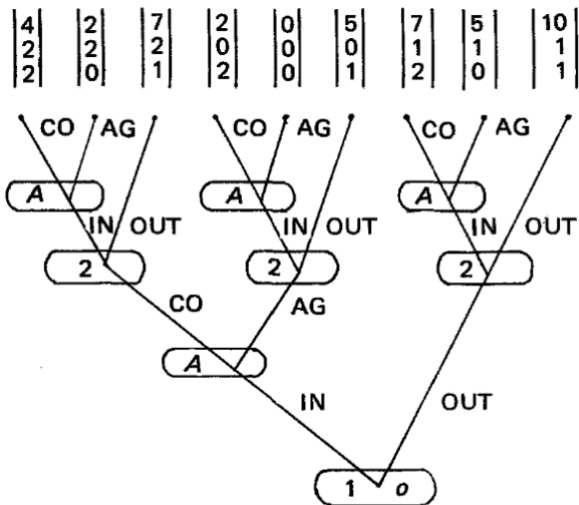
## THE CHAIN STORE PARADOX

TABLE I  
Player *A*'s partial payoffs and player *k*'s payoff.

player <i>k</i> 's decision	player <i>A</i> 's decision in period <i>k</i>	player <i>k</i> 's payoff	player <i>A</i> 's partial payoff for period <i>k</i>
IN	COOPERATIVE	2	2
IN	AGGRESSIVE	0	0
OUT	—	1	5



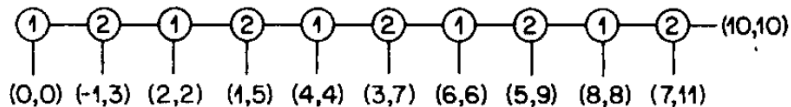
	IN	OUT
COOPERATIVE	2	5
AGGRESSIVE	0	1





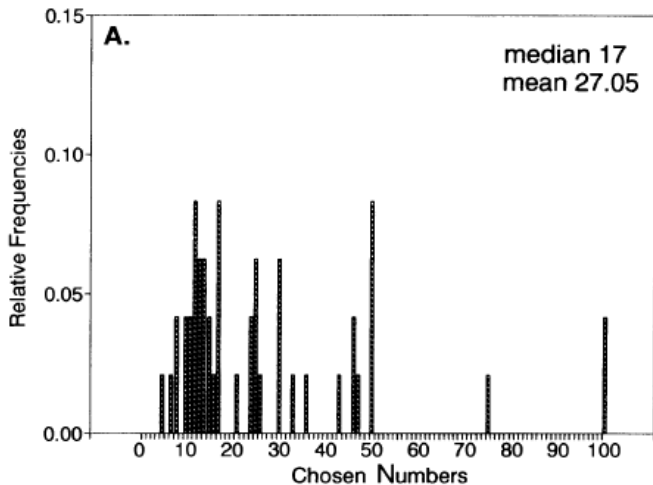
## Games of Perfect Information, Predatory Pricing and the Chain-Store Paradox

ROBERT W. ROSENTHAL



# Unraveling in Guessing Games: An Experimental Study

By ROSEMARIE NAGEL\*



## Overview

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## Level- $k$ Reasoning

Is there a Nash equilibrium in the half-the-average game?

Level  $k$  models

- Level-0 players choose uniformly at random
- Level- $k$  players choose based on belief that others are level  $k - 1$
- Distribution of types implies distribution of strategies

Fits behavior better than Nash in half-the-average and related games

## Level- $k$ Equilibrium in the Public Goods Game

	$H$	$M$	$L$
$H$	6, 6	3, 7	0, 8
$M$	7, 3	4, 4	1, 5
$L$	8, 0	5, 1	2, 2

Level-0 players choose uniformly at random

What about level- $k$  for  $k \geq 1$ ?

What does the model predict?

## Sampling Equilibrium

Consider symmetric two-player game with  $m$  pure strategies (actions)

Let  $p = (p_1, \dots, p_m)$  denote an arbitrary mixed strategy

Suppose each action is sampled once against  $p$

Let  $w_i(p)$  denote probability that action  $i$  results in highest payoff

Then  $p^*$  is a **sampling equilibrium** if

$$w_i(p^*) = p_i^*$$

for all  $i$

Interpretation: steady state of a population with inflows and outflows

## Sampling and Nash in All-Pay Auctions

	0	1	2
0	$\frac{5}{4}, \frac{5}{4}$	$0, \frac{3}{2}$	$0, \frac{1}{2}$
1	$\frac{3}{2}, 0$	$\frac{1}{4}, \frac{1}{4}$	$-1, \frac{1}{2}$
2	$\frac{1}{2}, 0$	$\frac{1}{2}, -1$	$-\frac{3}{4}, -\frac{3}{4}$

Is the Nash equilibrium  $p = (1/5, 3/5, 1/5)$  also a sampling equilibrium?

$$w_0(p) = \left(\frac{1}{5} \times \frac{4}{5}\right) + \left(\frac{4}{5} \times \frac{1}{5} \times \frac{1}{5}\right) = \frac{24}{125} \neq \frac{1}{5}$$

## Sampling Equilibrium in the Public Goods Game

	<i>H</i>	<i>M</i>	<i>L</i>
<i>H</i>	6, 6	3, 7	0, 8
<i>M</i>	7, 3	4, 4	1, 5
<i>L</i>	8, 0	5, 1	2, 2

The **strict Nash equilibrium** at  $p^* = (0, 0, 1)$  is a sampling equilibrium

But there is a **second sampling equilibrium** at  $p^* = (0.20, 0.28, 0.52)$

Which one should we expect to see?



## Stability

Sampling dynamics:

$$\dot{p}_i > 0 \text{ if and only if } w_i(p) > p_i$$

Example:

$$\dot{p}_i = w_i(p) - p_i$$

A **stable sampling equilibrium** is stable rest point of the **sampling dynamics**

Which of the sampling equilibria in the public goods game is stable?

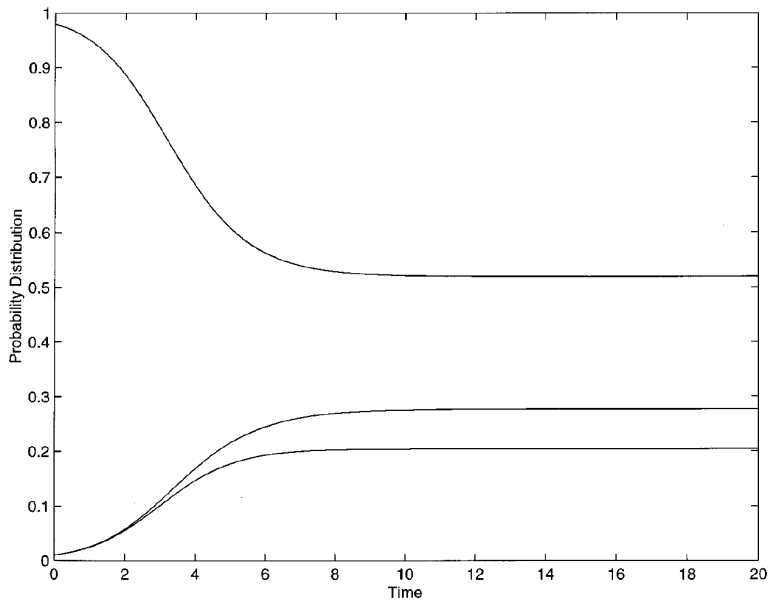


FIG. 1. Convergence to the interior  $S(1)$  equilibrium.

# Stability of Equilibria in Games with Procedurally Rational Players<sup>1</sup>

Rajiv Sethi

DEFINITION. An action profile  $(a_q, a_q, \dots, a_q)$  in a symmetric  $n$ -player game is *inferior* if, for every  $i \neq q$ , there exists  $j(i) \neq q$  such that

$$u(a_{j(i)}, a_i, a_q, \dots, a_q) > u(a_q, a_q, \dots, a_q).$$

It is *twice inferior* if, for every action  $i \neq q$ , there exist  $j(i) \neq q$  and  $k(i) \neq q$  such that  $j \neq k$  and

$$u(a_{j(i)}, a_i, a_q, \dots, a_q) \geq u(a_{k(i)}, a_i, a_q, \dots, a_q) > u(a_q, a_q, \dots, a_q).$$

THEOREM 1. *If  $(\alpha^*, \dots, \alpha^*)$  is an inferior strict Nash equilibrium of a symmetric game with three or more players, then  $\alpha^*$  is unstable under the sampling dynamics (1).*

THEOREM 2. *If  $(\alpha^*, \alpha^*)$  is a twice inferior strict Nash equilibrium of a symmetric two-player game, then  $\alpha^*$  is unstable under the sampling dynamics (1)*

# Stable Sampling Equilibrium in Common Pool Resource Games

Juan Camilo Cárdenas <sup>1</sup>, César Mantilla <sup>2</sup> and Rajiv Sethi <sup>3,\*</sup>

CPR game:  $n$  players, actions  $A = \{a_1, \dots, a_m\}$  (resource extraction levels)

Aggregate extraction is

$$X = \sum_{j=1}^n x_j$$

where  $x_i$  is extraction of player  $i$

Payoff to player  $i$  depends on own action and aggregate action

$$\pi_i = g(x_i, X)$$

where  $g$  is **increasing** in first argument and **decreasing** in second

Divergence between individual incentives and collective interests

Nash equilibrium has **inefficiently high extraction**

American Political Science Review

Vol. 86, No. 2 June 1992

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**COVENANTS WITH AND WITHOUT A SWORD:  
SELF-GOVERNANCE IS POSSIBLE**

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ELINOR OSTROM, JAMES WALKER, and ROY GARDNER

*Indiana University, Bloomington*

Norms from outside and from inside: an experimental analysis on  
the governance of local ecosystems

Juan-Camilo Cardenas\*

## Experiments

$n$  players, token **endowment**  $e$ , divided between two markets, payoffs:

$$\pi_i = w(e - x_i) + \frac{x_i}{X} f(X)$$

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**Cárdenas [11]    Ostrom *et al.* [4]**  
**Students**

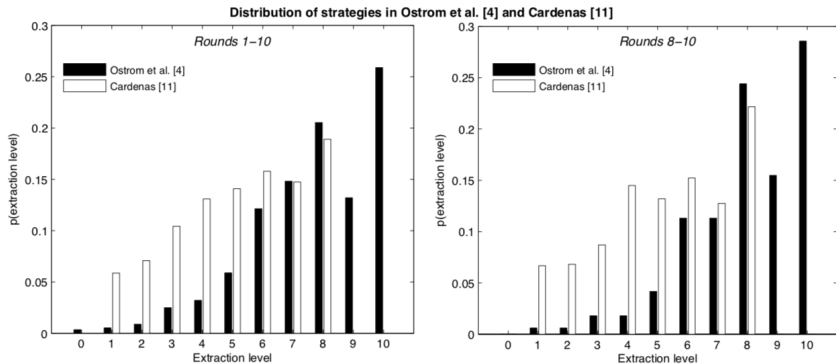
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*a. Experimental setting*

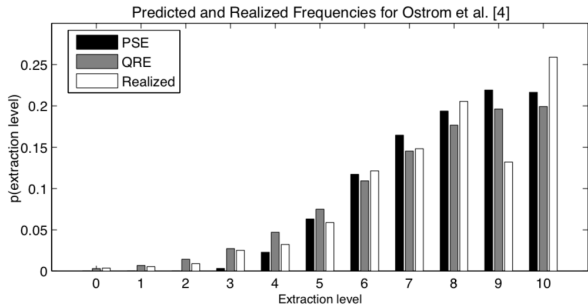
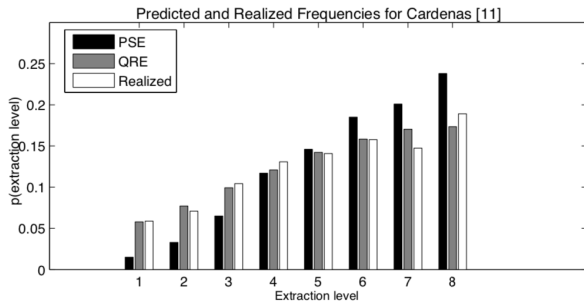
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Number of subjects	230	56
Subjects per group	5	8
Number of rounds	10	10
Action set	{1, ..., 8}	{0, ..., 10}
Nash equilibrium	8	8
Surplus maximizing per-capita extraction	1	4.5

---







# Efficiency and stability of sampling equilibrium in public goods games

César Mantilla<sup>1</sup>  | Rajiv Sethi<sup>2</sup>  | Juan Camilo Cárdenas<sup>1</sup> 

## Public Goods Game

Symmetric game,  $n$  players, action set  $A = \{0, 1, \dots, e\}$

Interpretation: contributions to public good, given endowment  $e$

Payoff to a player who contributes  $a$  when aggregate contribution is  $S$ :

$$(e - a) + f(S),$$

where  $f$  is (weakly) concave and satisfies  $f(0) = 0$ .

Linear case: each unit contributed yields some  $\mu$  to each player:

$$(e - a) + \mu S$$

If  $\mu n > 1$  and  $\mu < 1$ , this represents a **social dilemma**

- $\mu n > 1$  implies socially optimal for all to contribute fully
- $\mu < 1$  implies individually rational to contribute zero

## Example

Linear case,  $n = 3$ ,  $A = \{0, 1\}$ , payoffs:

			$S - a_i$	
		0	1	2
$a_i$	0	1	$1 + \mu$	$1 + 2\mu$
	1	$\mu$	$2\mu$	$3\mu$

where  $3\mu > 1$

If  $\mu < 1$  NE has **no contribution**, if  $\mu > 1$  then NE **full contribution**

All strict Nash equilibria are sampling equilibria

But what about **stable** sampling equilibria?

	Nash	Stable Sampling
$\mu \in (1/3, 1/2)$	(1,0)	(1,0)
$\mu \in (1/2, 1)$	(1,0)	(0.72,0.28)
$\mu > 1$	(0,1)	(0.28,0.72)

So the strict Nash equilibrium is **unstable** even when it is **efficient**

Prediction: **behavioral heterogeneity** even in simple environments

## Example

Linear case,  $n = 2$ ,  $A = \{0, 1, 2\}$ , payoffs:

		$S - a_i$		
		0	1	2
$a_i$	0	2	$2 + \mu$	$2 + 2\mu$
	1	$1 + \mu$	$1 + 2\mu$	$1 + 3\mu$
	2	$2\mu$	$3\mu$	$4\mu$

where  $2\mu > 1$

Public goods game if  $\mu \in (1/2, 1)$ ; efficient dominant strategy if  $\mu > 1$ .

If  $\mu < 1$  NE has **no contribution**, if  $\mu > 1$  then NE **full contribution**

Now **stable sampling** differs only when the **Nash equilibrium** is **inefficient**

	Nash	Stable Sampling
$\mu \in (1/2, 2/3)$	(1,0,0)	(1,0,0)
$\mu \in (2/3, 1)$	(1,0,0)	(0.52,0.28,0.20)
$\mu > 1$	(0,0,1)	(0,0,1)

## Conclusions

Nash equilibrium works well in some cases, poorly in others

Same goes for alternative models (level  $k$ , sampling)

No solution concept has **universal applicability**

Approach to games must be **context dependent**



## Further Reading

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