#### HOW OFTEN SHOULD ONE COOPERATE?

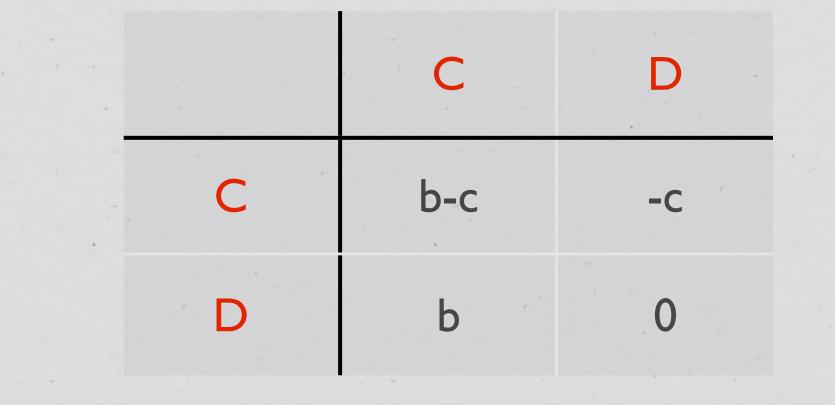
#### PARETO-INEFFICIENCY OF PURE NASH EQUILIBRIUM IN SOME FINITE RANDOM GAMES

\* \* \* \*

Christine Taylor Harvard University

Banff 2010 Workshop on Evolutionary Games

## **Prisoner's Dilemma**



How to take penalties: Freakonomics explains, S. J. Dubner and S. D. Levitt, Times Online, June 12, 2010

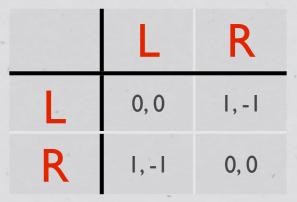


How to take penalties: Freakonomics explains, S. J. Dubner and S. D. Levitt, Times Online, June 12, 2010

	L	R
L	0, 0	١,-١
R	١,-١	0, 0

\* How good are footballers at randomizing their penalty kicks?

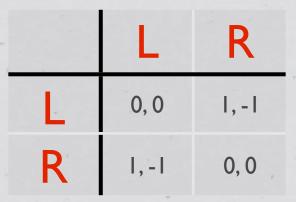
How to take penalties: Freakonomics explains, S. J. Dubner and S. D. Levitt, Times Online, June 12, 2010



\* How good are footballers at randomizing their penalty kicks?

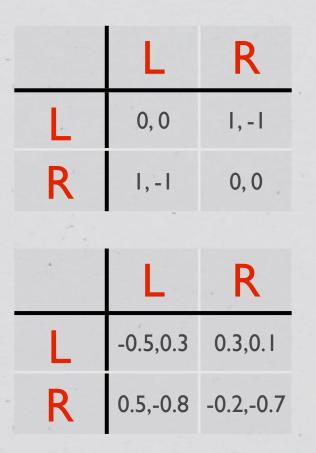
\* Just Enough Education to Perform? Data from top French and Italian leagues show that "football players, most of whom are not renowned for their many years of formal education, are capable of doing the kind of mental calculations that garlanded scholars need long, complicated formulas to produce."

How to take penalties: Freakonomics explains, S. J. Dubner and S. D. Levitt, Times Online, June 12, 2010



- \* How good are footballers at randomizing their penalty kicks?
- \* Just Enough Education to Perform? Data from top French and Italian leagues show that "football players, most of whom are not renowned for their many years of formal education, are capable of doing the kind of mental calculations that garlanded scholars need long, complicated formulas to produce."
- \* 3 strategies: L, C, R One prediction failed to hold in the data: kicking to the center is most successful, but least chosen.

How to take penalties: Freakonomics explains, S. J. Dubner and S. D. Levitt, Times Online, June 12, 2010



- \* How good are footballers at randomizing their penalty kicks?
- \* Just Enough Education to Perform? Data from top French and Italian leagues show that "football players, most of whom are not renowned for their many years of formal education, are capable of doing the kind of mental calculations that garlanded scholars need long, complicated formulas to produce."
- \* 3 strategies: L, C, R One prediction failed to hold in the data: kicking to the center is most successful, but least chosen.

How to take penalties: Freakonomics explains, S. J. Dubner and S. D. Levitt, *Times Online, June 12, 2010* 

**Cooperation and self-interest: Pareto-inefficiency of Nash equilibria in finite random games,** J. E. Cohen, *Proc. Natl. Acad. Sci. USA 1998* 

\* Setpup: n players, player p has m<sub>p</sub> strategies.

Cooperation and self-interest: Pareto-inefficiency of Nash equilibria in finite random games, J. E. Cohen, *Proc. Natl. Acad. Sci. USA 1998* 

Thursday, June 17, 2010

 $\langle \bullet \rangle$ 

\* Setpup: n players, player p has m<sub>p</sub> strategies.

\* Payoffs: for each player, there is a payoff matrix, each entry is i.i.d. continuous random variable, eg. U(0,1).

Cooperation and self-interest: Pareto-inefficiency of Nash equilibria in finite random games, J. E. Cohen, *Proc. Natl. Acad. Sci. USA 1998* 

- \* Setpup: n players, player p has m<sub>p</sub> strategies.
- \* Payoffs: for each player, there is a payoff matrix, each entry is i.i.d. continuous random variable, eg. U(0,1).
- \* Self-interest: Nash Equilibrium Profile (NE) is one in which each player's strategy is best response to other players' strategies.

**Cooperation and self-interest: Pareto-inefficiency of Nash equilibria in finite random games,** J. E. Cohen, *Proc. Natl. Acad. Sci. USA 1998* 

- \* Setpup: n players, player p has m<sub>p</sub> strategies.
- \* Payoffs: for each player, there is a payoff matrix, each entry is i.i.d. continuous random variable, eg. U(0,1).
- \* Self-interest: Nash Equilibrium Profile (NE) is one in which each player's strategy is best response to other players' strategies.
- \* Cooperation arises: when NE is Pareto dominated by another strategic profile in which every player fares at least as well, and some fares better.

**Cooperation and self-interest: Pareto-inefficiency of Nash equilibria in finite random games,** J. E. Cohen, *Proc. Natl. Acad. Sci. USA 1998* 

Thursday, June 17, 2010

 $\langle \bullet \rangle$ 

\* 1928 - John von Neumann: any two-person zero-sum game has an equilibrium, a min-max pair of randomized strategies.

- \* 1928 John von Neumann: any two-person zero-sum game has an equilibrium, a min-max pair of randomized strategies.
- \* 1951 John Nash: every game has an equilibrium in mixed strategies. The proof relies on Brouwer's fixed point theorem, highly nonconstructive.

- \* 1928 John von Neumann: any two-person zero-sum game has an equilibrium, a min-max pair of randomized strategies.
- \* 1951 John Nash: every game has an equilibrium in mixed strategies. The proof relies on Brouwer's fixed point theorem, highly nonconstructive.
- \* Finding NE is NP hard...,

- \* 1928 John von Neumann: any two-person zero-sum game has an equilibrium, a min-max pair of randomized strategies.
- \* 1951 John Nash: every game has an equilibrium in mixed strategies. The proof relies on Brouwer's fixed point theorem, highly nonconstructive.
- \* Finding NE is NP hard...,
- \* but finding PNE is easy.

Probability distribution of k, the number of PNEs:

$$P(k, m_1, m_2) = \sum_{j=0}^{k-1} (-1)^j \binom{k+j}{k} \binom{m_1}{k+j} (m_1 m_2)^{-(k+j)} \binom{m_2}{k+j} (k+j)!$$

\* Probability that a PNE is PPO is given by

$$\int_{x \in [0,1]^n} (1 - \prod_{p=1}^n (1 - x_p))^{\prod_{p=1}^n m_p - \sum_{p=1}^n m_p + n - 1} \prod_{p=1}^n (m_p x_p^{m_p - 1} dx_p)$$

If all m<sub>p</sub>=m, the probability that a PNE is PPO is not monotonic in n, the number of players. However, the probability that a PNE is PPO decreases as m<sub>p</sub> increases.

- For fixed n, the probability that a PNE is PPO is bounded from below by 1/e when all m<sub>p</sub> tends to infinity.
- \* If all players have the same number of strategies, as n tends to infinity, a PNE is always PPO.

The Probability of an Equilibrium Point, K. Goldberg, A. Goldman, M. Newman, J. Res. Nat. Bur. Stand. U.S.A. 72, 93-101 1968.

Cooperation and self-interest: Pareto-inefficiency of Nash equilibria in finite random games, J. E. Cohen, *Proc. Natl. Acad. Sci. USA 1998* 

# 2-person m-strategy random games

(A,B): a random two-person m-strategy game

A,B are  $m \times m$  payoff matrices, one for each player. The m<sup>2</sup> payoff entries  $a_{ij}$  and  $b_{ij}$  are i.i.d. (real-valued, independent, identically distributed continuous random variables), we shall assume them to be U(0,1) for this talk.

The pure strategy pair  $(i^*, j^*)_{is a PNE if}$   $a_{i^*,j^*} = \max_i a_{i,j^*}, b_{i^*,j^*} = \max_j b_{i^*,j}$ In symmetric random games,  $a_{ij} = b_{ji}$ 

In zero-sum games  $a_{ij} = -b_{ij}$ 

In common payoffs games,  $a_{ij} = b_{ij}$ 

# 2-person 2-strategy two-role games

Trust Game: PNE (3,3) is Pareto-Dominated by (1,1), (4,4), (1,2), (2,4), (1,4)

**Public good games with incentives: the role of reputation.** H. De Silva and K. Sigmund, in *Games, Groups, and the Global good,* S. A. Levin (ed.), Springer Series in Game Theory, 2009

Thursday, June 17, 2010

\*

 $\langle \bullet \rangle$ 

# 2-person m-strategy two-role games

Consider a game with two roles I and II and m strategies for each role. Let  $a_{ij}$  and  $b_{ij}$  be the respective payoffs to role I and II players when the role I player uses strategy i and the role II player uses strategy j. A and B are mxm payoff matrices whose entries are independent U(0,1) distribution. A coin toss decides which role to assign to each player. The resulting game is a 2-person m<sup>2</sup>-strategy symmetric game whose m<sup>2</sup>-xm<sup>2</sup> payoff matrix C has entries given by  $c_{ij,kl} = a_{il} + b_{kj}$ 

The strategic profile  $(i^*j^*, k^*l^*)$  is PNE if

 $a_{i^{*}l^{*}} + b_{k^{*}j^{*}} = max_{(i,j)}a_{il^{*}} + b_{k^{*}j}, \qquad a_{i^{*}l^{*}} + b_{k^{*}j^{*}} = max_{(k,l)}a_{i^{*}l} + b_{kj^{*}}$ 

# Some main questions

# **Some main questions**

\* How often is there a PNE? What is the probability distribution of the number of PNEs?

## **Some main questions**

- \* How often is there a PNE? What is the probability distribution of the number of PNEs?
- \* How often is a PNE not PPO? i.e. how often can cooperation lead to improvement for all players involved.

#### Probability distribution of the number of PNES

\* random game

 $\langle \bullet \rangle$ 

$$P(k,m) = \nu(k,m) \sum_{i=0}^{m-k} (-1)^i \frac{1}{m^{2i+2k}} \nu(i,m-k), \qquad \nu(k,m) = \binom{m}{k} \frac{m!}{(m-k)!}$$

\* symmetric random game

$$P(k,m) = \sum_{j=0}^{\lfloor \frac{k}{2} \rfloor} \frac{m!}{(k-2j)! 2^j j! m^k} \sum_{i=0}^{\lfloor \frac{m-k}{2} \rfloor} (-1)^i \frac{1}{i! 2^i m^{2i}} \sum_{l=0}^{m-k-2i} (-1)^l \frac{1}{l! (m-k-2i-l)! m^l}$$

\* zero-sum game

$$P(0,m) = 1 - \frac{(m!)^2}{(2m-1)!}, \qquad P(1,m) = \frac{(m!)^2}{(2m-1)!}$$

\* common payoffs game

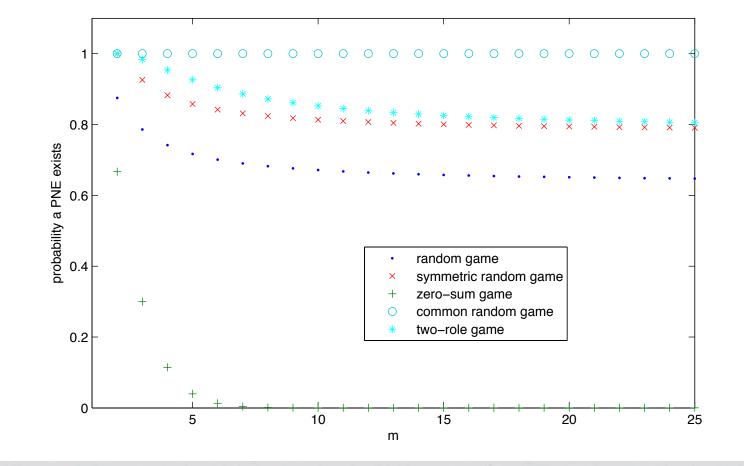
$$P(k,m) = \frac{(m!)^2}{((m-k)!)^2 k!} \sum_{j=0}^{m-k} (-1)^j \nu(j,m-k) \frac{(2m-1-k-j)!}{(2m-1)!}$$

\* two-role game

$$P(k,m^2) = \sum_{j=0}^{\lfloor \frac{k}{2} \rfloor} \frac{(m!)^2}{(k-2j)!j!2^j} \sum_{i=0}^{\lfloor \frac{m-k}{2} \rfloor} \frac{(-1)^i}{i!2^i} \sum_{l=0}^{m-k-2i} \frac{(-1)^l}{m^{2k+4i+2l}l!((m-k-2i-l)!)^2}$$

### How often does PNE exist?

 $\langle \bullet \rangle$ 



Thursday, June 17, 2010

 $\langle \mathbf{O} \rangle$ 

#### Asymptotic behavior of number of PNEs for large m

- \* random game:
- $P(k,m) \rightarrow \frac{e^{-1}}{k!}$  $P(k,m) \rightarrow e^{-1.5} \sum_{j=0}^{\lfloor \frac{k}{2} \rfloor} \frac{1}{j! 2^j (k-2j)!}$ \* symmetric random game:
- \* zero-sum game:
- \* common payoffs game:
- \* two-role game

$$P(0,m) \to 1, \qquad P(1,m) \to 0$$

$$P(k,m) \to \frac{m^k}{k! 2^k e^{m/2}}$$

$$P(k,m^2) \to e^{-1.5} \sum_{j=0}^{\lfloor \frac{k}{2} \rfloor} \frac{1}{j! 2^j (k-2j)!}$$

#### **Expected the number of PNES**

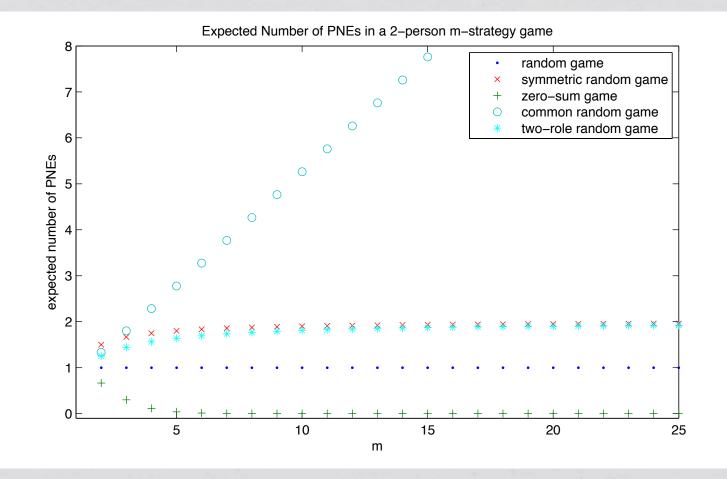
\* random game:

 $\langle \bullet \rangle$ 

- \* symmetric random game:
- \* zero-sum game:
- \* common random game:
- \* two-role game

$$\frac{1\frac{m-1}{m}}{(m!)^2} \\
\frac{(m!)^2}{(2m-1)!} \\
\frac{m^2}{2m-1} \\
\frac{(m-1)^2}{m^2}$$

#### **Expected the number of PNES**



# How often is a PNE PPO?

\* random game

 $\Pi = \int_0^1 \int_0^1 m^2 x^{m-1} y^{m-1} (1 - (1 - x)(1 - y))^{(m-1)^2} dy dx$ 

\* symmetric random game

$$\Pi = \frac{m}{2m-1} \left( J_m + \frac{m-1}{m} K_m \right)$$
  
$$J_m = \int_0^1 m x^{2(m-1)} (1 - (1 - x)^2)^{(m-2)(m-1)/2} dx$$
  
$$K_m = 2 \int_0^1 \int_0^x m^2 x^{2m-3} y^{m-1} (x^2 + 2(1 - x)y)^{(m-2)(m-3)/2} dy dx$$

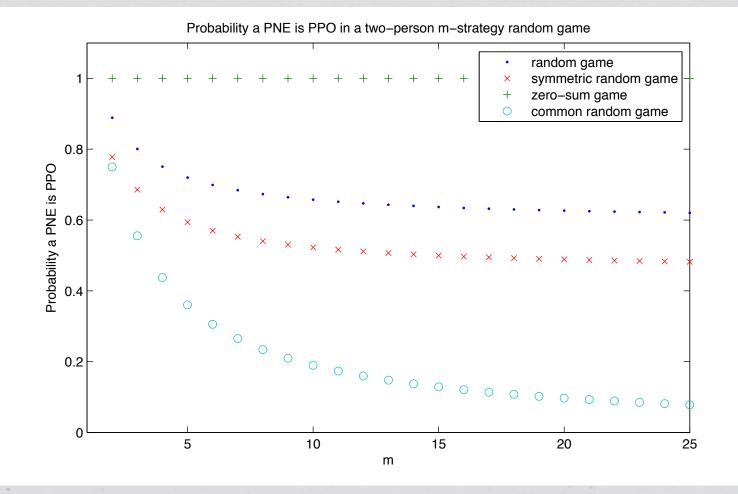
\* zero-sum game

$$\Pi = 1$$

\* common random game

$$\Pi = \frac{2m-1}{m^2}$$

# How often is a PNE PPO?



.

 $\langle \! \rangle$ 

\* Probability that a PNE is PPO is independent of distribution.

- \* Probability that a PNE is PPO is independent of distribution.
- \* As m, the number of strategies increases, cooperation becomes more favorable.

- \* Probability that a PNE is PPO is independent of distribution.
- \* As m, the number of strategies increases, cooperation becomes more favorable.
- \* As the correlation between payoffs increases, cooperation becomes more desirable.

n-person 2-strategy symmetric random games

\* 2 strategies A and B, with payoff values

 $\vec{\alpha} = (\alpha_1, \cdots, \alpha_n), \qquad \vec{\beta} = (\beta_0, \beta_1, \cdots, \beta_{n-1})$ \* i\* is PNE if

$$\alpha_i > \beta_{i-1}, \qquad \beta_i > \alpha_{i+1}$$

\* Probability distribution of k, the number of PNEs.

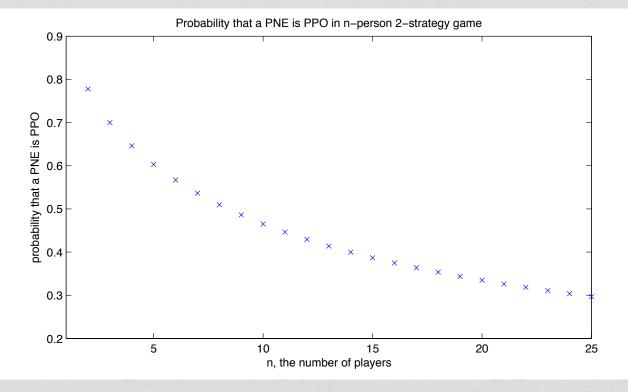
$$P(k,n) = \frac{1}{2^n} \begin{pmatrix} n+1\\ 2k-1 \end{pmatrix}, \qquad E(X) = \frac{n+3}{4}$$

n-person 2-strategy symmetric random games

\* PNE 0<sup>\*</sup> or n<sup>\*</sup> are PPO with probability

$$\sum_{i=0}^{n-2} (-1)^{i} {\binom{n-2}{i}} 2^{n-2-i} \frac{2}{n+1+i}$$
\* PNE 1\* or (n-1)\* are PPO with probability
$$\sum_{i=0}^{n-3} (-1)^{i} {\binom{n-3}{i}} \sum_{j=0}^{n-3-i} {\binom{n-3-i}{j}} \frac{4}{(n-1-j)(2+i+j)} \left(1-\frac{1}{n+2+i}\right)$$
\* PNE 2\*, 3\*,..., (n-2)\* are PPO with probability
$$\sum_{i=0}^{n-4} (-1)^{i} {\binom{n-4}{i}} \sum_{j=0}^{n-4-i} {\binom{n-4-i}{j}} \frac{4}{(n-2-j)(2+i+j)} \left(1-\frac{2}{n+1+i}+\frac{2}{(n+2+i)(n+1+i)}\right)$$

# n-person 2-strategy symmetric random games



asymmetric case: Π(2,2)> Π(2,2,2)< Π(2,2,2,2)< Π(2,2,2,2,2)< Π(2,2,2,2,2,2)

# To be continued...

- \* Expected gain from cooperation.
- \* Evolution of cooperation in repeated finite random games.