The evolutionary robustness of forgiveness and cooperation

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Prisoner's dilemma

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A B	B stays silent	B confesses
	(cooperates)	(defects)
A stays silent	Each serves 1	A: 1 year
(cooperates)	month	B: goes free
A confesses	A: goes free	Each serves 3
(defects)	B: 1 year	months

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Payoff Matrix

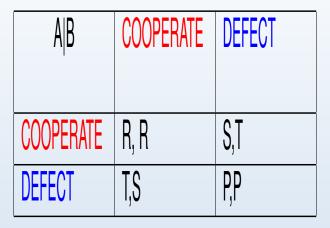
Payoff Matrix Utility function

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Payoff Matrix Utility function T>R>P>S

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Payoff Matrix Utility function T>R>P>S



Temptation, Reward, Punishment, Suck

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Prisoner's dilemma

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Strategies

Strategies either Defect or Cooperate

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Strategies either Defect or Cooperate Best response

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Strategies either Defect or Cooperate Best response

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given s, s^* is the best response to s ($s^* := BR(s)$)

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given s, s^* is the best response to s ($s^* := BR(s)$) if

 $U(s^*,s) \geq U(s',s)$ for any s'

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(s, s) is an equilibrium if BR(s) = s

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Strategies either Defect or Cooperate Best response

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(s, s) is an equilibrium if BR(s) = s

In prisoner's dilemma, the equilibrium is

(D, D) = (Defect, Defect)

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repeation could be an incentive for cooperation to overcome opportunistic behavior

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participants have no reason to think the current interaction is their last.

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Infinitely Repeated Prisoner's dilemma

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Prisoner's dilemma

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Player play infinitely many times with fixed probability, δ of playing again.

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Histories; $h = (a, b) \in H = \{C, D\}^{\mathbb{N}} \times \{C, D\}^{\mathbb{N}}$

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Player play infinitely many times with fixed probability, δ of playing again.

Histories;
$$h = (a, b) \in H = \{C, D\}^{\mathbb{N}} imes \{C, D\}^{\mathbb{N}}$$

strategies;
$$s : \cup_{k \in \mathbb{N} \cup \{0\}} H_k \rightarrow \{C, D\}$$

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Payoff

$$U(s_1, s_2) = (1 - \delta) \sum_{k=0} \delta^k u(a^k, b^k)$$

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$$s_1(h_{k-1}) = a^k, \ s_2(\hat{h}_{k-1}) = b^k.$$

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 $s_1(h_{k-1}) = a^k, \quad s_2(\hat{h}_{k-1}) = b^k.$
 $h_k = ((a^0, b^0), \dots, (a^j, b^j) \dots, (a^k, b^k)),$
 $\hat{h}_k = ((b^0, a^0), \dots, (b^j, a^j) \dots, (b^k, a^k))$

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There are infinitely many possible payoffs

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There are infinitely many possible payoffs

$$U(s_1, s_2) = (1 - \delta) \sum \delta^k u(a^k, b^k)$$

$$u(a^k,b^k)=T,R,P,S$$

There are infinitely many possible payoffs

$$U(s_1, s_2) = (1 - \delta) \sum \delta^k u(a^k, b^k)$$

$$u(a^k, b^k) = T, R, P, S$$

for δ large, set of possible payoffs is a continum.

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Prisoner's dilemma

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Grim (cooperate until somebody defects), is an equilibrium

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 $U(g,g) \ge U(s,g)$ for any strategy s

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 $U(s,g) = (1-\delta)[R+\delta R+\ldots+\delta^{k-1}R+\delta^k T+\delta^{k+1}M\ldots], M = S \text{ or } P$

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Grim (cooperate until somebody defects), is an equilibrium

 $U(g,g) \geq U(s,g)$ for any strategy s $q = C, C, C, \ldots, C$ $q = C, C, C, \ldots, C$ $U(q,q) = (1-\delta)[R+\delta R+\ldots+\delta^{k}R+\ldots] = R$ $s = C, C, C, \dots, C, D, \dots$ $a = C, C, C, \dots, C, C, D, \dots, D$ $U(s,q) = (1-\delta)[R+\delta R+\ldots+\delta^{k-1}R+\delta^k T+\delta^{k+1}M\ldots], M = S \text{ or } P$

 $U(g,g) - U(s,g) \ge \delta^{k}[(1-\delta)[R-T] + \delta(R-P)]$

Grim (cooperate until somebody defects), is an equilibrium

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 $U(g,g) - U(s,g) \ge \delta^k [(1-\delta)[R-T] + \delta(R-P)] > 0, \ \delta$ large

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Others "cooperative" equilibria

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Variations of Grim

Others "cooperative" equilibria

Variations of Grim

Tit for Tat

Others "cooperative" equilibria

Variations of Grim

Tit for Tat

Variations of Tit for Tat

Others "cooperative" equilibria

Variations of Grim

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Variations of Tit for Tat

Win-Stay-Lose-Shift/Simpleton/Pavlov

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Win-Stay-Lose-Shift/Simpleton/Pavlov

For any payoff above (P, P) there is an equilibria

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Variations of Tit for Tat

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For any payoff above (P, P) there is an equilibria

Continuum of equilibriums

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How to compare those equilibrias?

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How to compare those equilibrias?

Do there exist a selection mechanisms?

How to compare those equilibrias?

Do there exist a selection mechanisms?

which is the "optimal" strategy?

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Axelrod proposed to make tournaments

Axelrod proposed to make tournaments

Make rankings base in the tournament

Axelrod proposed to make tournaments

Make rankings base in the tournament

Tournament in 1980,

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Tournament in 1980, winner: Tic for Tat

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Not very nice

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Axelrod: The Evolution of Cooperation

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Introduce dynamics on the space of strategies

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Introduce dynamics on the space of strategies

Which is the appropriate dynamics?

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Replicator dynamic

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inspired in biology

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inspired in biology mimicking evolution

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Introduce dynamics on the space of strategies

Which is the appropriate dynamics?

Replicator dynamic

inspired in biology mimicking evolution

strategies that perform worst than the average, die

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Introduce dynamics on the space of strategies

Which is the appropriate dynamics?

Replicator dynamic

inspired in biology mimicking evolution

strategies that perform worst than the average, die

strategies that perform better than the average, thrive

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Replicator dynamic

 $S = \{s_1 \dots s_n\}$

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Replicator dynamic

 $\mathcal{S} = \{s_1 \dots s_n\}$ $\Delta = \{(x_1 \dots x_n) \in \mathbb{R}^n : x_1 + \dots + x_n = 1, x_j \ge 0, \forall j\}.$

Replicator dynamic

 $S = \{s_1 \dots s_n\}$

 $\Delta = \{ (x_1 \dots x_n) \in \mathbb{R}^n : x_1 + \dots + x_n = 1, x_j \ge 0, \forall j \}.$

 x_i = percentage of the population that use the strategy s_i

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Payoff matrix ($S = \{s_1...,s_n\}$)

$$A = \begin{pmatrix} a_{11} & \dots & a_{1n} \\ \dots & a_{ii} & \dots \\ a_{n1} & \dots & a_{nn} \end{pmatrix}, a_{ij} = U(s_i, s_j)$$

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 $\dot{x}_j = x_j[(AX)_j - x^tAx]$

 $S = \{s_1 \dots s_n\}$

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 $\dot{x}_j = x_j[(AX)_j - x^tAx]$

 $\dot{x}_j = x_j$ (payoff of (s_j) – Average payoff)

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Prisoner's dilemma

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Large class of dynamics

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Large class of dynamics

 $\dot{x}_j = x_j F[(AX)_j - x^t Ax]$

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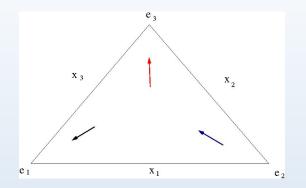
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Large class of dynamics

 $\dot{x}_j = x_j F[(AX)_j - x^t Ax]$

 $F : \mathbb{R} \to \mathbb{R}$, strictly increasing function F(0) = 0.

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Attractors?

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Attractors?

Strict Nash equilibria are attractors

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Attractors?

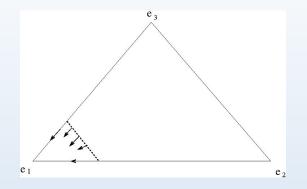
Strict Nash equilibria are attractors

If $U(s, s) > U(s^*, s)$ for any s^* then in any finite population

s is an attractor.

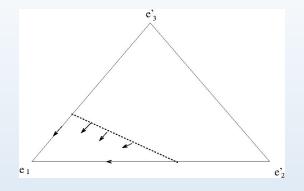
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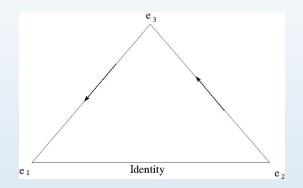


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Ties

It does not exist *s* such that $U(s, s) > U(s^*, s)$ for any *s*^{*} Fooling/upseting strategies (Grim and always cooperate)



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TREMBLES: Probability of small mistakes 1 - p, p

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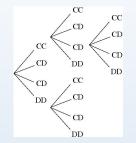
TREMBLES: Probability of small mistakes 1 - p, p

All possible histories are considered. A tree

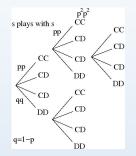
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TREMBLES: Probability of small mistakes 1 - p, p

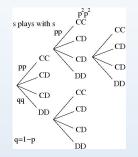
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TREMBLES:Probability of small mistakes 1 - p, pAll possible histories are considered. A tree

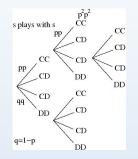


TREMBLES:Probability of small mistakes 1 - p, pAll possible histories are considered. A tree



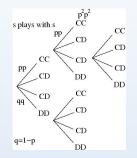
 $U(s_1, s_2) = (1 - p^2 \delta) \sum_{h_k} P_{s_1, s_2}(h_k) \delta^k u(a^k, b^k).$

TREMBLES:Probability of small mistakes 1 - p, pAll possible histories are considered. A tree



 $U(s_1, s_2) = (1 - p^2 \delta) \sum_{h_k} P_{s_1, s_2}(h_k) \delta^k u(a^k, b^k).$ All the paths are explore with some probability

TREMBLES:Probability of small mistakes 1 - p, pAll possible histories are considered. A tree



$$U(s_1, s_2) = (1 - \rho^2 \delta) \sum_{h_k} P_{s_1, s_2}(h_k) \delta^k u(a^k, b^k).$$

All the paths are explore with some probability Intended paths are more probable.

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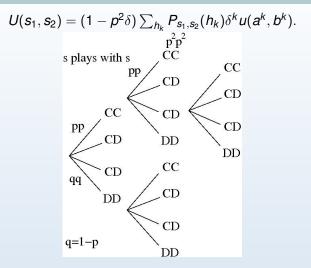
Prisoner's dilemma

How to compute utilities?

 $U(s_1, s_2) = (1 - p^2 \delta) \sum_{h_k} P_{s_1, s_2}(h_k) \delta^k u(a^k, b^k).$

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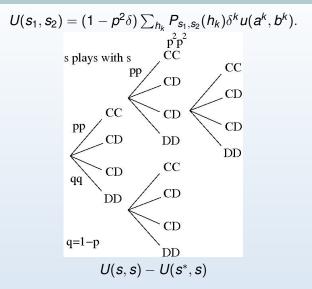
How to compute utilities?



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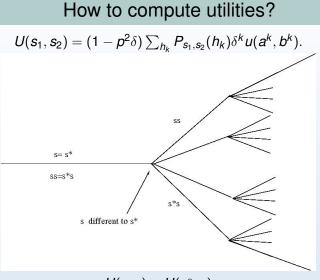
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How to compute utilities?

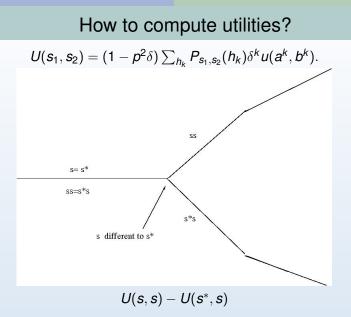


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 $U(s,s) - U(s^*,s)$



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Prisoner's dilemma

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with trembles there exist Strict Nash equilibrium

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with **trembles** there exist Strict Nash equilibrium there exist *s*: $U(s, s) > U(s^*, s)$ for any *s*.

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with **trembles** there exist Strict Nash equilibrium there exist *s*: $U(s, s) > U(s^*, s)$ for any *s*.

there exist strategies that are attractors in any population.

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with **trembles** there exist Strict Nash equilibrium there exist *s*: $U(s, s) > U(s^*, s)$ for any *s*. there exist strategies that are attractors in any population.

TREMBLES BREAK TIES.

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with trembles there exist Strict Nash equilibrium

there exist s: $U(s, s) > U(s^*, s)$ for any s.

there exist strategies that are attractors in any population.

TREMBLES BREAK TIES.

Still, there are infinitely many of Strict Nash equilibria

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Which attractors are frequently choosen in any finite population?

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Which attractors are frequently choosen in any finite population?

Does there exist a strategy, such that in any population if a fixed fraction use that strategy then that strategy is going to become dominant?

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Which attractors are frequently choosen in any finite population?

Does there exist a strategy, such that in any population if a fixed fraction use that strategy then that strategy is going to become dominant?

To have a large basin of attraction in a uniform way regardless of the population

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s has ULBA,

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s has **ULBA**, if there exists $K_0 := K_0(s)$ such that for any δ large and p large,

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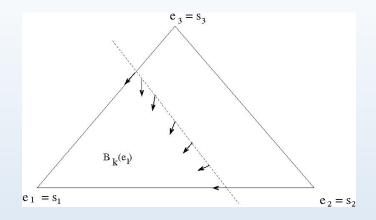
Does it exist such strategy?

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 $B_{K_0}(s) \subset B^s_{loc}(s).$

Does it exist such strategy? Which properties should satisfy?

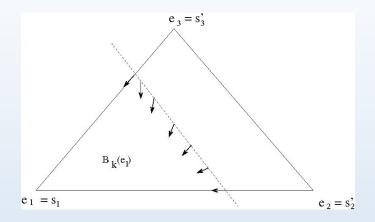
Uniform Large Basin of Attraction



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Uniform Large Basin of Attraction

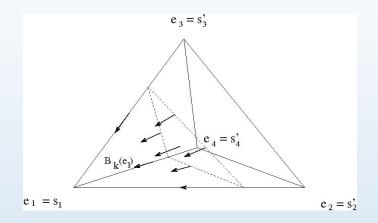


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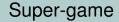
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Uniform Large Basin of Attraction



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Super-game

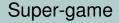
Start with a population $S = \{s, s_2, \dots, s_n\}$

Super-game

Start with a population $S = \{s, s_2, \dots s_n\}$

Run the replicator dynamics for at least time t_0

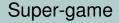
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Run the replicator dynamics for at least time t_0

Change the population (number of strategies could increase or decrease)

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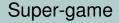


Run the replicator dynamics for at least time t_0

Change the population (number of strategies could increase or decrease)

strategies that has a Uniform large basin of attraction

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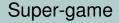


Run the replicator dynamics for at least time t_0

Change the population (number of strategies could increase or decrease)

strategies that has a Uniform large basin of attraction

they keep a large basin



Run the replicator dynamics for at least time t_0

Change the population (number of strategies could increase or decrease)

strategies that has a Uniform large basin of attraction

they keep a large basin

provided that they are kept in the changes of populations.

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Prisoner's dilemma

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Given $\{s, s^*, s'\}$

$$\frac{U(s^*,s') - U(s,s') + U(s',s^*) - U(s,s^*)}{U(s,s) - U(s^*,s)} < M_0$$

the ball of size $\frac{1}{M_0}$ is in the basin of *s* (against s', s^*)

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Given $\{s, s^*, s'\}$

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the ball of size $\frac{1}{M_0}$ is in the basin of *s* (against s', s^*)

$$\sup_{U(s,s)-U(s^*,s)>U(s,s)-U(s',s)}\{\frac{U(s^*,s')-U(s,s')+U(s',s^*)-U(s,s^*)}{U(s,s)-U(s^*,s)},\,0\}$$

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Given $\{s, s^*, s'\}$

$$\frac{U(s^*,s') - U(s,s') + U(s',s^*) - U(s,s^*)}{U(s,s) - U(s^*,s)} < M_0$$

the ball of size $\frac{1}{M_0}$ is in the basin of *s* (against *s'*, *s*^{*})

$$\sup_{U(s,s)-U(s^*,s)>U(s,s)-U(s',s)}\{\frac{U(s^*,s')-U(s,s')+U(s',s^*)-U(s,s^*)}{U(s,s)-U(s^*,s)},\,0\}$$

If the supreme over al strategies is smaller than $M_0 < \infty$

 $B_{\frac{1}{M_0}}(s)$ is in the basin of attraction of *s* in any finite population

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If *s* has a uniform large basin in any set of THREE strategies *s* has a uniform large basin in any finite population

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If *s* has a uniform large basin in any set of THREE strategies *s* has a uniform large basin in any finite population Robustness against invasion by pairs \rightarrow

Robustness against any set of invaders.

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If *s* has a uniform large basin in any set of THREE strategies *s* has a uniform large basin in any finite population Robustness against invasion by pairs \rightarrow

Robustness against any set of invaders.

It is not enough to do well againts attack by individual strategies

Proof: Back to replicator equation

$$A = \begin{pmatrix} a_{11} & \dots & a_{1n} \\ \dots & a_{ii} & \dots \\ a_{n1} & \dots & a_{nn} \end{pmatrix}$$

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 $\dot{x}_j = x_j$ (payoff of (s_j) – Average payoff)

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Proof: Back to replicator equation

 $\dot{x}_j = x_j$ (payoff of (s_j) – Average payoff)

 $\dot{x}_j = x_j[(AX)_j - x^t Ax]$

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Prisoner's dilemma

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$$\dot{x}_j = x_j[(AX)_j - x^tAx]$$

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$$(x_1, \dots, x_n) : \sum x_i = 1, x_i \ge 0$$

$$\dot{x}_j = x_j[(AX)_j - x^t Ax]$$
$$(x_1, \dots, x_n) : \sum x_i = 1, x_i \ge 0$$
vertex e_i are fixed points

$$\begin{split} \dot{x}_{j} &= x_{j}[(AX)_{j} - x^{t}Ax]\\ (x_{1}, \dots, x_{n}) : \sum x_{i} &= 1, x_{i} \geq 0\\ \text{vertex } e_{j} \text{ are fixed points}\\ e_{j} \text{ is an attractor iff } a_{ij} - a_{jj} < 0 \text{ for all } i \neq j.\\ \text{eigenvalues of } D_{e_{i}}X \text{ are } \{a_{ij} - a_{ji}\}_{i \neq j} \end{split}$$

$$\begin{split} \dot{x}_j &= x_j [(AX)_j - x^t Ax] \\ (x_1, \dots, x_n) : \sum x_i &= 1, x_i \ge 0 \\ \text{vertex } e_j \text{ are fixed points} \\ e_j \text{ is an attractor iff } a_{ij} - a_{jj} < 0 \text{ for all } i \neq j. \\ \text{eigenvalues of } D_{e_j} X \text{ are } \{a_{ij} - a_{jj}\}_{i \neq j} \\ \text{In games, they could be arbitrary close to zero} \end{split}$$

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 $\dot{x}_i = x_i[(AX)_i - x^tAx]$ (x_1, \ldots, x_n) : $\sum x_i = 1, x_i > 0$ vertex e_i are fixed points e_i is an attractor iff $a_{ii} - a_{ii} < 0$ for all $i \neq j$. eigenvalues of $D_{e_i}X$ are $\{a_{ii} - a_{ii}\}_{i \neq i}$ In games, they could be arbitrary close to zero size of the basin on the edges $\frac{1}{1+\frac{a_{ij}-a_{jj}}{a_{ij}-a_{ij}}}$.

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Prisoner's dilemma

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Given a positive $K_0 < 1$,

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"Properties" on any matrix $A \in \mathbb{R}^{n \times n}$ (arbitrary *n*) s.t. for the equation

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Given a positive $K_0 < 1$,

"**Properties**" on any matrix $A \in \mathbb{R}^{n \times n}$ (arbitrary *n*) s.t. for the equation

$$\dot{x}_j = x_j[(Ax)_j - x^tAx]$$

the vertex e_1 has a basin of attraction containing the ball of radius K_0 .

 $B_{\mathcal{K}_0}(e_1) \subset B^s_{loc}(e_1).$

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Prisoner's dilemma

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$$N_{j1} = a_{j1} - a_{11}$$

$$egin{aligned} N_{j1} &= a_{j1} - a_{11} \ M_{ij} &= a_{ji} - a_{1i} + a_{11} - a_{j1} \ M_{ji} &= a_{ij} - a_{1j} + a_{11} - a_{i1} \end{aligned}$$

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$$N_{j1} = a_{j1} - a_{11}$$

 $M_{ij} = a_{ji} - a_{1i} + a_{11} - a_{j1}$
 $M_{ji} = a_{ij} - a_{1j} + a_{11} - a_{i1}$
 $M_0 = \max_{i,j \ge i} \{ \frac{M_{ij} + M_{ji}}{-N_i}, 0 \}$

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$$N_{j1} = a_{j1} - a_{11}$$

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$$M_0 = \max_{i,j \ge i} \{ \frac{M_{ij} + M_{ji}}{-N_i}, 0 \}.$$

$$P_0(e_1) = \{ \bar{x} : \sum_{i \ge 2} x_i \le \frac{1}{M_0} \} \subset B^s_{loc}(e_1).$$

Then,

$$B_{rac{1}{M_0}}(e_1) = \{ \bar{x} : \sum_{i \geq 2} x_i \leq rac{1}{M_0} \} \subset B^s_{loc}(e_1).$$

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Given $S = \{s_1 \dots s_n\}$, let *M* be the payoff matrix

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Given $S = \{s_1 \dots s_n\}$, let *M* be the payoff matrix

$$egin{aligned} M_{ij} &= M(s,s_i,s_j) = U(s_i,s_j) - U(s,s_j) + U(s_i,s_j) - U(s,s_i) \ N(s,s_i) &= U(s,s) - U(s_i,s), \end{aligned}$$

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$$M_0(s) = \sup_{s_j, s_i: N(s, s_i) > N(s, s_j)} \{ rac{M(s, s_j, s_i)}{N(s, s_j)}, \ 0 \}$$

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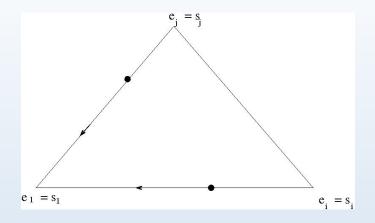
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$$M_0(s) = \sup_{s^*,s^:N(s,s^*) > N(s,s')} \{ rac{M(s,s^*,s')}{N(s,s^*)}, \ 0 \}$$

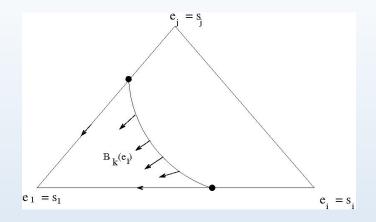
Replicator equation



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Replicator equation

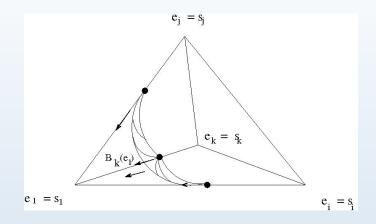


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Replicator equation



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$$\sup_{U(s,s)-U(s^*,s)>U(s,s)-U(s',s)}\{\frac{U(s^*,s')-U(s,s')+U(s',s^*)-U(s,s^*)}{U(s,s)-U(s^*,s)},\,0\}$$

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$$\sup_{U(s,s)-U(s^*,s)>U(s,s)-U(s',s)} \{ \frac{U(s^*,s')-U(s,s')+U(s',s^*)-U(s,s^*)}{U(s,s)-U(s^*,s)}, 0 \}$$

Get in the realm of games

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$$\sup_{U(s,s)-U(s^*,s)>U(s,s)-U(s',s)} \{ \frac{U(s^*,s')-U(s,s')+U(s',s^*)-U(s,s^*)}{U(s,s)-U(s^*,s)}, 0 \}$$

Get in the realm of games

T + P < 2R

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$$\sup_{U(s,s)-U(s^*,s)>U(s,s)-U(s',s)}\{\frac{U(s^*,s')-U(s,s')+U(s',s^*)-U(s,s^*)}{U(s,s)-U(s^*,s)},\,0\}$$

Get in the realm of games

T + P < 2R

The maximal payoff of *s* against *s* is *R*.

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$$\sup_{U(s,s)-U(s^*,s)>U(s,s)-U(s',s)} \{ \frac{U(s^*,s')-U(s,s')+U(s',s^*)-U(s,s^*)}{U(s,s)-U(s^*,s)}, 0 \}$$

Get in the realm of games

T + P < 2R

The maximal payoff of *s* against *s* is *R*.

 $U(s^*,s') + U(s',s^*) \leq 2R$

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Given a strategy s and another one s^*

$$C(s,s^*) = \sup_{s^*} rac{U(s,s) - U(s,s^*)}{U(s,s) - U(s^*,s)}$$

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s satisfies the cross ratio condition if

 $C(s, s^*)$ is uniformly bounded for any s^*

Given a strategy s and another one s^*

$$\mathcal{C}(s,s^*) = \sup_{s^*} rac{U(s,s) - U(s,s^*)}{U(s,s) - U(s^*,s)}$$

s satisfies the cross ratio condition if

 $C(s, s^*)$ is uniformly bounded for any s^*

Cross ratio condition and $T + P < 2R \rightarrow ULBA$

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Given a strategy s and another one s^*

$$\mathcal{C}(s,s^*) = \sup_{s^*} rac{U(s,s) - U(s,s^*)}{U(s,s) - U(s^*,s)}$$

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Cross ratio condition and $T + P < 2R \rightarrow \text{ULBA}$

Meaning?

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Tic for Tac is not an attractor

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Tic for Tac is not an attractor

After (C, D), TfT with itself goes in a path of alternate C and D

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Tic for Tac is not an attractor

After (C, D), TfT with itself goes in a path of alternate C and D

Always Defect has no ULBA

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Tic for Tac is not an attractor

After (C, D), TfT with itself goes in a path of alternate C and D

Always Defect has no ULBA

it has a small basin of attraction against Grim

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Tic for Tac is not an attractor

After (C, D), TfT with itself goes in a path of alternate C and D

Always Defect has no ULBA it has a small basin of attraction against Grim

Grim has no ULBA

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Tic for Tac is not an attractor

After (C, D), TfT with itself goes in a path of alternate C and D

Always Defect has no ULBA it has a small basin of attraction against Grim

Grim has no ULBA

unforgiving strategies lose in payoffs relative to strategies that forgive

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Star-type strategies

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Star-type strategies

given s^* , s and a seed history h_k , we look to the equilibrium path $h_{s^*,s/h_k}$

$$(a^1, b^1), (a^2, b^2), \dots (a^t, b^t) \dots$$

Star-type strategies

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frequencies of s^* getting R, S, T, P whenever plays with s with seed h_k

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frequencies of s^* getting R, S, T, P whenever plays with s with seed h_k

$$b_1 = rac{1-p^2\delta}{p^2} \sum_{j:u^j(s^*,s/h_k)=R} p^{2j+2}\delta^j,$$

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given s^* , s and a seed history h_k , we look to the equilibrium path $h_{s^*,s/h_k}$

$$(a^{1}, b^{1}), (a^{2}, b^{2}), \dots (a^{t}, b^{t}) \dots$$

frequencies of s^* getting R, S, T, P whenever plays with s with seed h_k

$$b_1 = \frac{1 - p^2 \delta}{p^2} \sum_{j: u^j(s^*, s/h_k) = R} p^{2j+2} \delta^j, \ b_2 = \frac{1 - p^2 \delta}{p^2} \sum_{j: u^j(s^*, s/h_k) = S} p^{2j+2} \delta^j,$$

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given s^* , s and a seed history h_k , we look to the equilibrium path $h_{s^*,s/h_k}$

$$(a^1, b^1), (a^2, b^2), \dots (a^t, b^t) \dots$$

frequencies of s^* getting R, S, T, P whenever plays with s with seed h_k

$$b_1 = \frac{1 - p^2 \delta}{p^2} \sum_{j: u^j(s^*, s/h_k) = R} p^{2j+2} \delta^j, \ b_2 = \frac{1 - p^2 \delta}{p^2} \sum_{j: u^j(s^*, s/h_k) = S} p^{2j+2} \delta^j,$$

$$b_3 = \frac{1 - p^2 \delta}{p^2} \sum_{j: u^j(s^*, s/h_k) = T} p^{2j+2} \delta^j, \ b_4 = \frac{1 - p^2 \delta}{p^2} \sum_{j: u^j(s^*, s/h_k) = P} p^{2j+2} \delta^j,$$

given s^* , s and a seed history h_k it is generated history b_1 frequency after h_k of playing (C, C) (s^* gets R) b_2 frequency after h_k of playing (C, D) (s^* gets S) b_3 frequency after h_k of playing (D, C) (s^* gets T) b_4 frequency after h_k of playing (D, D) (s^* gets P)

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Condition 1: *s* is a **Cooperative strategy** (efficient) After any path, (s, s) eventually goes back to a path of cooperation

Trying to move away from low score

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Condition 1: *s* is a Cooperative strategy (efficient)

After any path, (s, s) eventually goes back to a path of cooperation Trying to move away from low score

Condition 2: whenever playing againts a strategy s^* if $b_3 > 0$ (i.e.: (*D*, *C*) holds, s^* defect when *s* cooperate) then

Condition 1: s is a Cooperative strategy (efficient)

After any path, (s, s) eventually goes back to a path of cooperation Trying to move away from low score

Condition 2: whenever playing againts a strategy s^* if $b_3 > 0$ (i.e.: (*D*, *C*) holds, s^* defect when *s* cooperate) then

$$\label{eq:b3} \begin{split} \mathbf{b_3} < \gamma_2 \mathbf{b_2} + \gamma_4 \mathbf{b_4}, \\ \text{where } \gamma_2 = \frac{R-S}{T}, \, \gamma_4 = \frac{R-P}{T} \text{ and } b_2, b_3, b_4. \end{split}$$

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Condition 1: s is a Cooperative strategy (efficient)

After any path, (s, s) eventually goes back to a path of cooperation Trying to move away from low score

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If s^* defected when s cooperated then s has to retaliate.

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COOPERATION

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COOPERATION

RETALIATION *s* retaliate to a defection of *s*^{*} while *s* cooperated

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COOPERATION

RETALIATION *s* retaliate to a defection of s^* while *s* cooperated

What about PAYBACK?

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COOPERATION

RETALIATION *s* retaliate to a defection of s^* while *s* cooperated

What about PAYBACK?

Offer cooperation after taking advantage

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Prisoner's dilemma

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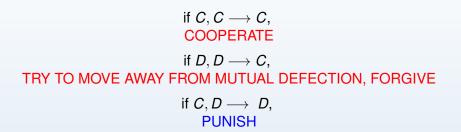
if $C, C \longrightarrow C$, COOPERATE

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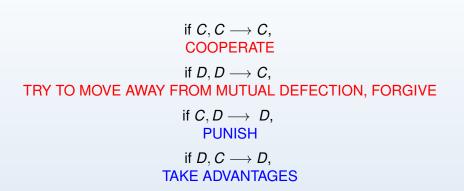
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if $C, C \longrightarrow C$, COOPERATE if $D, D \longrightarrow C$, TRY TO MOVE AWAY FROM MUTUAL DEFECTION, FORGIVE

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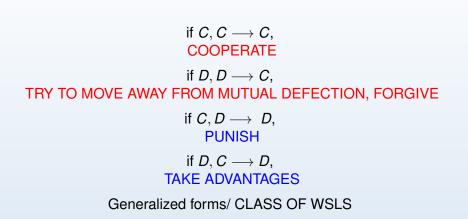


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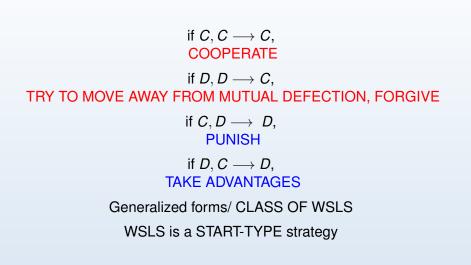
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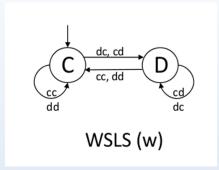
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Prisoner's dilemma

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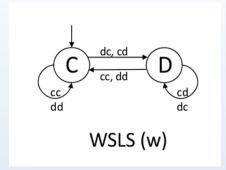
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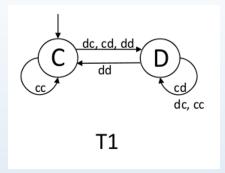
WSLS is a START-TYPE strategy

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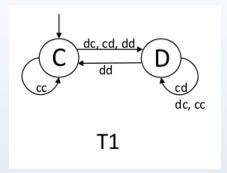
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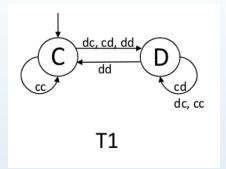
Trigger is a START-TYPE strategy

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Prisoner's dilemma

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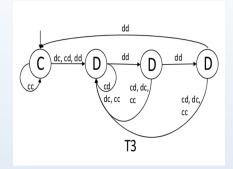
Trigger is a START-TYPE strategy Carefull WSLS

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Prisoner's dilemma

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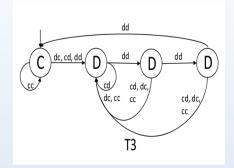
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Trigger-n is a START-TYPE strategy

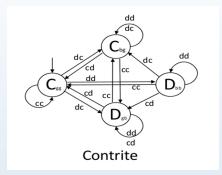
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Contrite strategies

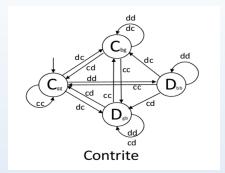


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Contrite strategies



Contrite is a START-TYPE strategy

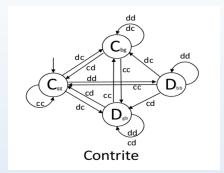
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Contrite strategies



Contrite is a START-TYPE strategy Contrite PAYS BACK

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SIMILARITIES

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SIMILARITIES

COOPERATE

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SIMILARITIES

COOPERATE

Try to move away from low score Intend to go back to cooperation

SIMILARITIES

COOPERATE

Try to move away from low score

Intend to go back to cooperation

RETALIATE

SIMILARITIES

COOPERATE

Try to move away from low score

Intend to go back to cooperation

RETALIATE

DIFFERENCES

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Prisoner's dilemma

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SIMILARITIES

COOPERATE

Try to move away from low score

Intend to go back to cooperation

RETALIATE

DIFFERENCES

WSLS take advantages

SIMILARITIES

COOPERATE

Try to move away from low score

Intend to go back to cooperation

RETALIATE

DIFFERENCES

WSLS take advantages

CONTRITE pays back

Those type of strategies does not appear in the experiments

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Those type of strategies does not appear in the experiments

Previous results show that the become dominat if they are present.

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Can we test that?

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Those type of strategies does not appear in the experiments

Previous results show that the become dominat if they are present.

Can we test that?

How to design an experiment to test the theoretical's predictions

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We show sufficient conditions for a strategy to be sucessful.

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Are they necessary

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Are they necessary

Axelrod's conjecture:

We show sufficient conditions for a strategy to be sucessful.

Are they necessary

Axelrod's conjecture:

Nice/ Cooperative/Efficient;

We show sufficient conditions for a strategy to be sucessful.

Are they necessary

Axelrod's conjecture:

- Nice/ Cooperative/Efficient;
- Retaliating;

We show sufficient conditions for a strategy to be sucessful.

Are they necessary

Axelrod's conjecture:

- Nice/ Cooperative/Efficient;
- Retaliating;
- Forgiving;

We show sufficient conditions for a strategy to be sucessful.

Are they necessary

Axelrod's conjecture:

- Nice/ Cooperative/Efficient;
- Retaliating;
- Forgiving;
- Non-envious.

ULBA implies retaliation

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ULBA implies retaliation

If s is Nash equilibrium, it has to punish a defection

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ULBA implies retaliation

If s is Nash equilibrium, it has to punish a defection

Always Cooperate is not an equilibrium

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Prisoner's dilemma

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For strategies that keep defecting it is possible to find a finite population where they have a small basin of attraction.

For strategies that keep defecting it is possible to find a finite population where they have a small basin of attraction.

Unforgiving strategies do not have a uniformly large basin of attraction.

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Grim does not forgive

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Grim does not forgive

Tit for Tat does not forgive

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Tit for Tat does not forgive

it can enter an infinite sequel that alternate cooperation and defection

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ULBA implies Cooperate (with itself after any path)

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ULBA implies Cooperate (with itself after any path)

If *s* is ULBA, then for any history h_t follows that

 $\lim_{\delta\to 1, p\to 0} U(s, s/h_t) = R.$

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Experiments?

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Experiments?

Dealing with the whole set of strategies:

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Experiments?

Dealing with the whole set of strategies:

• topological and differentiable structure on set of strategies;

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Experiments?

Dealing with the whole set of strategies:

- topological and differentiable structure on set of strategies;
- getting the right PDE.

Experiments?

Dealing with the whole set of strategies:

- topological and differentiable structure on set of strategies;
- getting the right PDE.

Mutations? Dynamics accepting mutations

Experiments?

Dealing with the whole set of strategies:

topological and differentiable structure on set of strategies;getting the right PDE.

Mutations? Dynamics accepting mutations Caviat: Mutations of equilibria is not necessary an equilibria