

# Evolutionary game theory and cognition

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## Two player games

- ▶ A game between two players (Alice and Bob) is represented by a matrix  $G$  of pairs.

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- ▶ If Alice plays strategy  $i$  and Bob plays strategy  $j$  then  $(a, b) := G_{ij}$  is the outcome, where  $a$  corresponds to the change in Alice's utility and  $b$  to Bob's.

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- ▶ Zero-sum games are the epitome of competition. Any gain for Alice is a loss for Bob, and vice-versa.

# Coordination games

## Definition

A two-strategy game  $G$  is a coordination game if we have

$$G = \begin{pmatrix} (a_1, b_1) & (c_2, d_1) \\ (c_1, d_2) & (a_2, b_2) \end{pmatrix}$$

And  $a_1 > c_1$ ,  $a_2 > c_2$ ,  $b_1 > d_1$ ,  $b_2 > d_2$ .



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- ▶ The diagonals are always better for both players, they just have to figure out how to pick the same strategy.
- ▶ Captures the idea of win-win, lose-lose situations.

## What do these two types of games tell us?

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- ▶ Being non-zero-sum does not ensure cooperation.

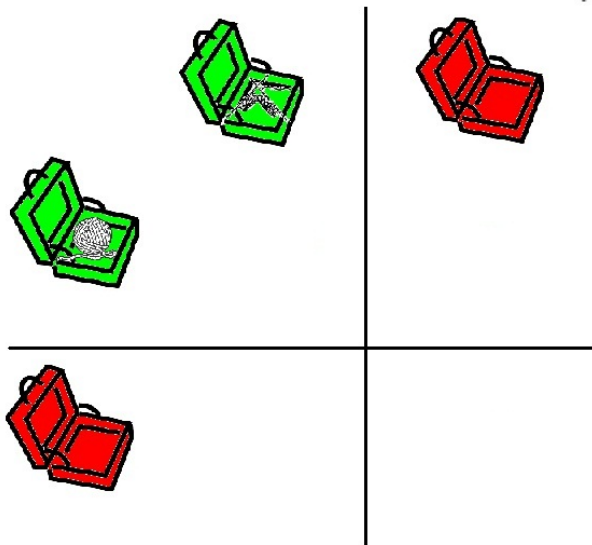
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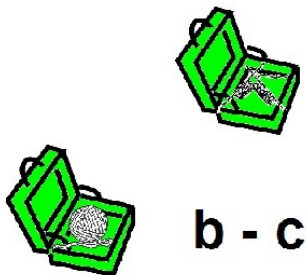




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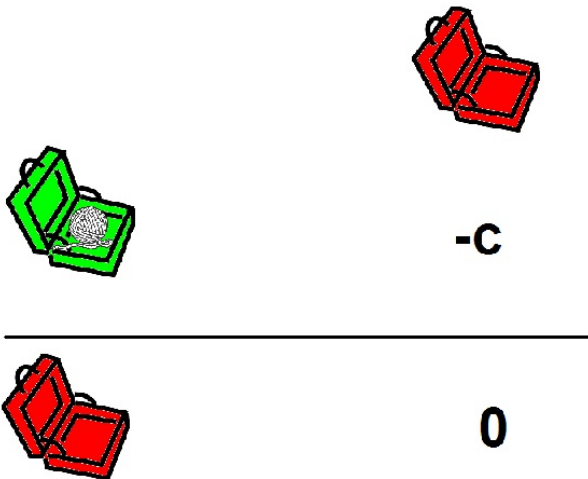


**b - c**

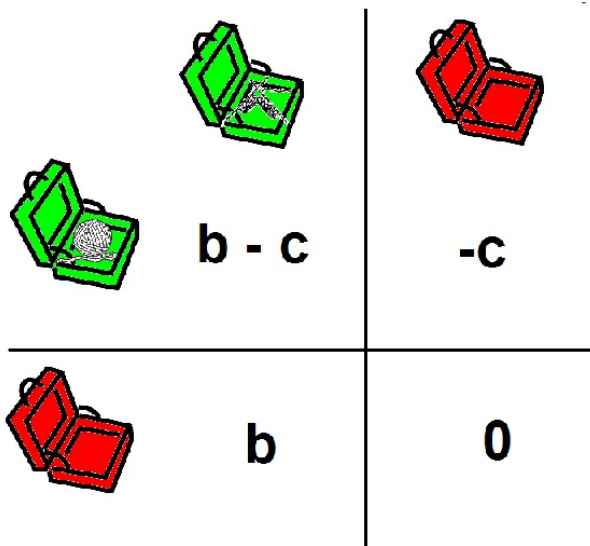


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$$\begin{pmatrix} (b - c, b - c) & (-c, b) \\ (b, -c) & (0, 0) \end{pmatrix}$$

		
	<b>b - c</b>	<b>-c</b>
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- ▶ Strategy 1 is called cooperate or  $C$  and strategy 2 is called defect or  $D$ .





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- ▶ The rational strategy (or Nash equilibrium) is mutual defection.
- ▶ The best for the players taken together (or Pareto optimum) is mutual cooperation.

# Symmetric games

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- ▶ Neither player is preferred or treated differently: every player is identical with respect to the game rules.
- ▶ The representation of a game does not require writing those confusing pairs
- ▶ For example, all 2 player 2 strategy symmetric games can be written in the form:

$$\left( \begin{array}{cc} (R, R) & (S, T) \\ (T, S) & (P, P) \end{array} \right) \rightarrow \begin{pmatrix} R & S \\ T & P \end{pmatrix}$$

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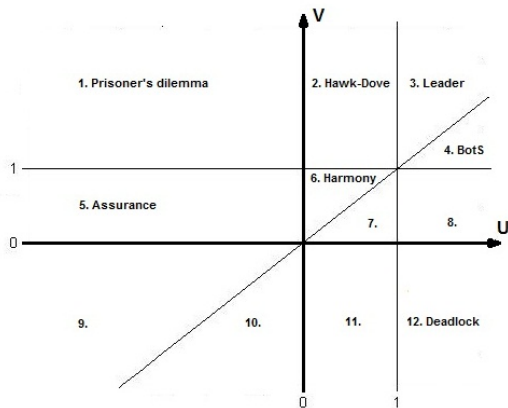
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- ▶ This captures the interesting two player games.
- ▶ Allows us to reduce the general game to two parameters by removing constant offset and picking our units:

$$\begin{pmatrix} R & S \\ T & P \end{pmatrix} \rightarrow \begin{pmatrix} 1 & U \\ V & 0 \end{pmatrix}$$

# U-V plane

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- ▶ Informally: neither Alice nor Bob can improve their payoff by unilateral change of strategy.
- ▶ If we only allow pure strategies then replace  $G(i, j)$  by  $G_{ij}$
- ▶ If we allow mixed strategies, then every game has at least one Nash equilibrium

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## Example

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- ▶ Do we even expect humans to be able to do all of this?
- ▶ Let's bound rationality and see what happens!

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- ▶ What happens to rationality?

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A strategy  $s$  is an evolutionary stable strategy for a game  $G$  if for all other strategies  $r$  we have (a)  $fst(G(s, s)) > fst(G(r, s))$ , or (b)  $fst(G(s, s)) = fst(G(r, s))$  and  $fst(G(s, r)) > fst(G(r, r))$ .

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  - ▶  $r$  has the same fitness when interacting with  $s$  and the same or greater fitness when interacting with other  $r$ .
- ▶ Compare this to the Nash equilibrium conditions.
- ▶ The conditions are almost identical: we can think of the evolutionary process as a rational process (entity?)!.

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  - ▶ Zero cognition in individual agents
- ▶ Various augmentations of the model create fascinating results, among them: cooperation.

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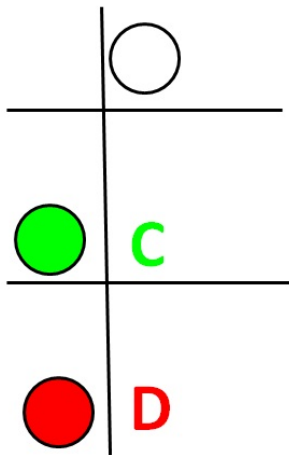
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- ▶ Tag-based conditional strategies



# Ethnocentrism in spatial models

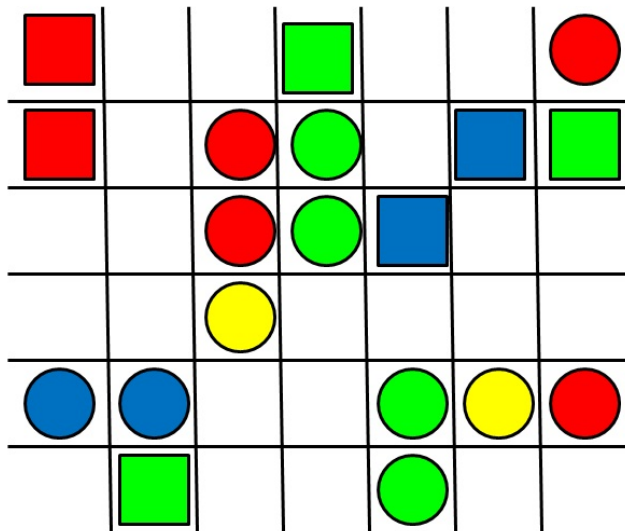
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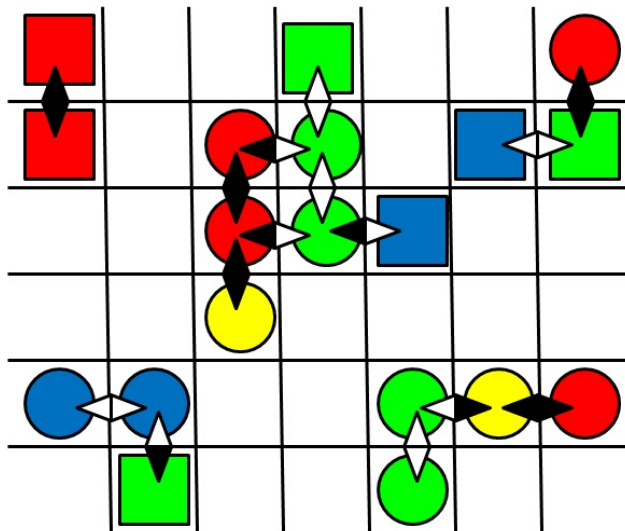
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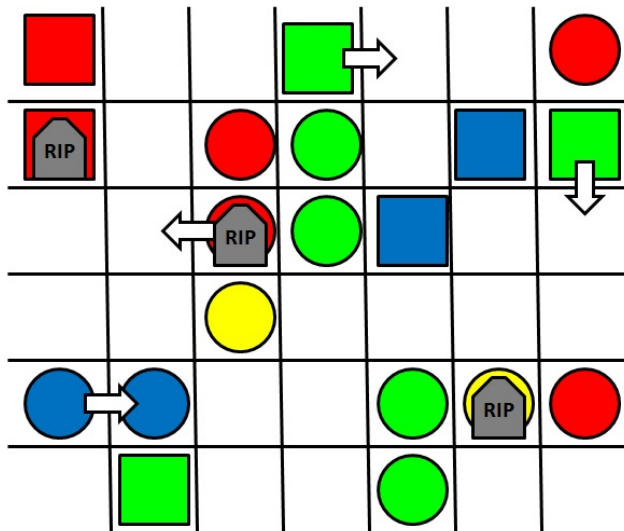
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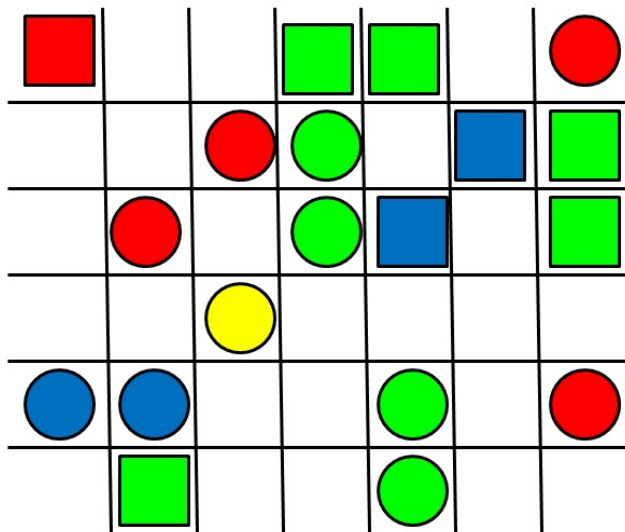
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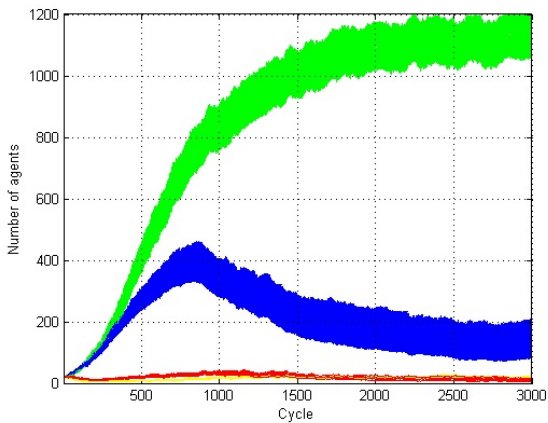
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# Thank you!

For more info feel free to contact me at:  
`artem.kaznatcheev@mail.mcgill.ca`

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[artem.kaznatcheev@mail.mcgill.ca](mailto:artem.kaznatcheev@mail.mcgill.ca)

Some fun resources:

1. Robert Wright: "The evolution of compassion"  
[http://www.ted.com/talks/lang/eng/robert\\_wright\\_the\\_evolution\\_of\\_compassion.html](http://www.ted.com/talks/lang/eng/robert_wright_the_evolution_of_compassion.html)
2. Howard Rheingold: "On collaboration"  
[http://www.ted.com/talks/lang/eng/howard\\_rheingold\\_on\\_collaboration.html](http://www.ted.com/talks/lang/eng/howard_rheingold_on_collaboration.html)
3. Jonathan Haidt: "On the moral roots of liberals and conservatives"  
[http://www.ted.com/talks/jonathan\\_haidt\\_on\\_the\\_moral\\_mind.html](http://www.ted.com/talks/jonathan_haidt_on_the_moral_mind.html)
4. Artem Kaznatcheev: "Evolving Cooperation"  
<http://www.youtube.com/watch?v=bRuE3oP-JT8>
5. Stanford Encyclopedia of Philosophy: "Evolutionary Game Theory"  
<http://plato.stanford.edu/entries/game-evolutionary/>