

Evolutionary game theory and cognition

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Zero-sum games

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

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$$\begin{bmatrix} (3, 1) & (2, 3) \\ (-1, 2) & (3, -1) \end{bmatrix}$$



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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

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

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

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.

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



Prisoner's dilemma

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

- ▶ b is the benefit of receiving and c is the cost of giving.
- ▶ Strategy 1 is called cooperate or C and strategy 2 is called defect or D .

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- ▶ The best for the players taken together (or Pareto optimum) is mutual cooperation.



Nash equilibrium

Definition

A strategy pair (p, q) is a Nash equilibrium of a game G if for all other strategies r we have:

$$fst(G(p, q)) \geq fst(G(r, q))$$

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- ▶ 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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- ▶ To find a Nash equilibrium Alice needs to be able to simulate the game and she must be able to place yourself in Bob's shoes.
- ▶ 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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- ▶ The assumptions of the ESS:
 - ▶ Random interactions (inviscid population)
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 - ▶ Zero cognition in individual agents
- ▶ Various augmentations of the model create fascinating results, among them: cooperation.



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- ▶ Indirect reciprocity: the ability to track social constructs like reputation



