STRATEGIC MINDS: THE GAME THEORY OF COOPERATION, COORDINATION AND COLLABORATION
DO COOPERATORS SURVIV? MIXED STRATEGIES AND EVOLUTIONARILY STABLE STRATEGIES

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## Pure Nash equilibria always exist.

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## Except when they don't.

## Matching Pennies

Two players have a penny each.
They decide on a face and reveal it at the same time.

If the faces match, player 1 wins $\$ 1$, player 2 loses \$1.

If the faces do not match, player 2 wins \$1, player 1 loses \$1.


There is, however, a different way to play this game.

Sometimes the best thing to do is to flip a coin.

## MIXED STRATEGIES

## DEFINITION

A mixed strategy for player $i$ is a probability ditribution over actions, written $s_{i}=\left(p_{1}, \ldots, p_{j}, \ldots\right)$, where $p_{i}$ is the probability with which player $i$ plays action $j$.

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Note that the pure strategies we've been dealing with so far are special cases of mixed strategies, in which one action is played with probability 1.

With mixed strategies, how are players supposed to play?
They aim to maximize expected utility.

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An agent goes with the action that maximizes this.

## Back to the Matching Pennies game.

## FINDING MIXED EQUILIBRIA

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Would it make sense for Player 2 to mix between Heads and Tails, say with $s_{2}^{\prime}=(0.3,0.7)$ ?

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No mixing gives better results than always going for Tails, so Player 2 wants to play $s_{2}=(0,1)$.

Is $s=\left(s_{1}, s_{2}\right)$ a Nash equilibrium?

No! If Player 2 plays $s_{2}=(0,1)$, Player 1 wants to switch to $s_{1}^{\prime}=(0,1)$.


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So this cannot be a Nash equilibrium.
The only way to avoid this is for Player 1 to play a strategy $s_{1}^{*}=(p, 1-p)$ that makes Player 2 indifferent between their actions, which means that:

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So Player 1 wants to play $s_{1}^{*}=(1 / 2,1 / 2)$.
Similarly, Player 2 wants to play $s_{2}^{*}=(1 / 2,1 / 2)$.


This works for finding mixed Nash equilibria in general.

## NASH'S THEOREM

## THEOREM (NASH, 1951)

Any game with a finite number of players and finite actions has a Nash equilibrium in mixed strategies.

I got the Nobel prize for this result!

Fun fact: humans are not that good at randomizing.

## ARIEL RUBINSTEIN

 In experiments, they keep trying to detect patterns, are susceptible to stories and framing effects.Mookherjee, D., \& Sopher, B. (1994). Learning Behavior in an Experimental Matching Pennies Game Games and Economic Behavior, 7(1), 62-91, Eliaz, K., \& Rubinstein, A. (2011). Edgar Allan Poe's riddle: Framing effects in repeated matching pennies games. Games and Economic Behavior, 71(1), 88-99.

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## COLIN CAMERER

Interestingly, chimps seem to be pretty good at it.


Martin, C. F., Bhui, R., Bossaerts, P., Matsuzawa, T., \& Camerer, C. (2014). Chimpanzee choice rates in competitive games match equilibrium game theory predictions. Nature: Scientific Reports, 4, 5182.

What do the probabilities in a mixed strategy mean?

## WHAT IS A MIXED STRATEGY ABOUT?

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Some strategies (aka, players that play those strategies) are successful, others are not.

Like life.

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Like life.
And, like in life, we can assume successful strategies thrive.
And the others... well, they go extinct.

JOHN MAYNARD SMITH
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In biology, Darwinian fitness provides a natural [...] scale [for utility].
Secondly, and more importantly, in seeking the solution of a game, the concept of human rationality is replaced by that of evolutionary stability.

## DO COOPERATORS SURVIVE?

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What happens in the long run?
Defectors inherit the earth!

In a well-mixed population (i.e., equal probability of being paired with anyone else), defectors drive cooperators to extinction.

## THE CALCULUS

Assume that at some time $t$ there are $c$ cooperators and $d$ defectors.


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The expected payoff of a cooperator is:

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= & 2 \cdot \frac{c-1}{c+d}+0 \cdot \frac{d}{c+d} .
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= & 3 \cdot \frac{c}{c+d}+1 \cdot \frac{d-1}{c+d} .
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Note that $\mathbb{E}[$ Defect $]>\mathbb{E}[$ Cooperate $]$.


Eventually, cooperators die out.

JOHN MAYNARD SMITH
Imagine a world of A players, and throw a B player in there.
The game between As and Bs is given by this game:

| A | B |
| :---: | :---: |
| A | $\mathrm{a}, a$ |
| B | $b, c$ |
| $c, b$ | $d, d$ |

What is the condition for selection to oppose the invasion of Bs ?

## GETTING TO AN EVOLUTIONARILY STABLE STRATEGY

Assume the proportions of Bs is $\varepsilon$, and the proportion of As is $1-\varepsilon$.


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A strategy is evolutionarily stable if $a>c$, or $a=c$ and $b>d$.

JOHN MAYNARD SMITH
Intuitively, an evolutionarily stable strategy is a genetically determined strategy that tends to persist once prevalent in the population.

## EVOLUTIONARILY STABLE STRATEGY

## DEFINITION

We write $u\left(s_{i}, s_{j}\right)$ for the payoff of strategy $s_{i}$ against $s_{j}$.
Strategy $s_{i}$ is an evolutionarily stable strategy (ESS) if:
(i) $u\left(s_{i}, s_{i}\right)>u\left(s_{j}, s_{i}\right)$, for all strategies $s_{j} \neq s_{i}$, or
(ii) $u\left(s_{i}, s_{i}\right)=u\left(s_{j}, s_{i}\right)$ and $u\left(s_{i}, s_{j}\right)>u\left(s_{j}, s_{j}\right)$, for all strategies $s_{j} \neq s_{i}$.

Note that in the Prisoner's Dilemma the ESS is defection.


JOHN MAYNARD SMITH
This makes the problem of cooperation even more acute: how can cooperators survive when they can be so easily invaded by defectors?

