

A Short Introduction to Game Theory

Heiko Hotz

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INTRODUCTION

Game Theory - What is it?

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- Generally, game theory investigates conflict situations, the interaction between the agents and their decisions.
- A game in the sense of game theory is given by a (mostly finite) number of players, who interact according to given rules.
- *The subject of game theory are situations, where the result for a player does not only depend on his own decisions, but also on the behaviour of the other players.*

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Game Theory - What is it?

- Game theory has its historical origin in 1928. By analysing parlour games, John von Neumann realised very quickly the practicability of his approaches for the analysis of economic problems.
- In his book *Theory of Games and Economic Behavior*, which he wrote together with Oskar Morgenstern in 1944, he already applied his mathematical theory to economic applications.
- The publication of this book is generally seen as the initial point of modern game theory.



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INTRODUCTION

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- When there is competition for a resource to be analysed, game theory can be used either to explain existing behaviour or to improve strategies.
- The first is especially applied by sciences which analyse long-term situations, like biology or sociology.
- In animality, for example, one can find situations, where cooperation has developed for the sake of mutual benefits.
- The latter is a crucial tool in sciences like economics. Companies use game theory to improve their strategical situation in the market.
- Many more sciences like sociology, philosophy, psychology and cultural anthropology use game theory as an appropriate tool.

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DEFINITIONS

Normal Form Games

Normal Form Games

A game in *normal form* consists of:

- 1 A finite number of players.
- 2 A strategy set assigned to each player.
- 3 A payoff function, which assigns a certain payoff to each player depending on his strategy and the strategy of the other players.

Both players choose their strategy simultaneously

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Payoff Matrix

If the number of players is limited to two and if their sets of strategies consist of only a few elements, the outcome of the payoff function can be represented in a matrix, the so-called *payoff matrix*, which shows the two players, their strategies and their payoffs:

Player1 \ Player2	L	R
U	3 , 3	0 , 5
D	5 , 0	1 , 1

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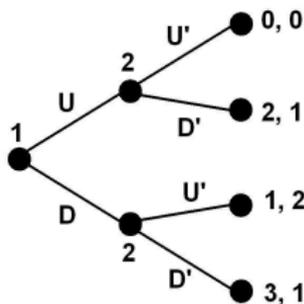
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Extensive Form Games

Extensive Form Games

Contrary to the normal form game, the rules of an *extensive form game* are described such that the agents of the game execute their moves consecutively.



DEFINITIONS

Nash Equilibrium

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If each player has chosen a strategy and no player can benefit by changing his strategy while the other players keep theirs unchanged, then the current set of strategy choices and the corresponding payoffs constitute a Nash equilibrium.

John Nash showed in 1950, that every game with a finite number of players and finite number of strategies has at least one mixed strategy Nash equilibrium.



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Nash Equilibrium

- In a pure strategies, one strategy is played with probability 1.
- A mixed strategy is a linear combination of at least two pure strategies.
- The coefficients denote the probabilities of the pure strategies to be played.

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Best Response

The best response is the strategy (or strategies) which produces the most favorable immediate outcome for the current player, taking other players' strategies as given.

Localizing a Nash Equilibrium in a Payoff Matrix

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GAMES

Prisoner's Dilemma

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- Two suspects arrested
- Police has insufficient evidence for a conviction
- If both testify:
 - *Both receive 2-year sentence*
- If both stay silent:
 - *Only a six-month-sentence for a minor charge*
- If one testifies and the other remains silent:
 - *Betrayer goes free, accomplice receives 10-year sentence*

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Payoff Matrix of the Prisoner's Dilemma

- Abbreviations: To testify means to betray the other suspect and thus to defect (D), to remain silent means to cooperate (C) with the other suspect.
- We will use positive numbers in the payoff matrix.

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GAMES

Public Good Game

Public Good Game

- A group of 4 people are given \$200 each.
- They can invest an amount of money in a 'project'.
- Every \$1 invested will yield \$2, which would be distributed to all group members.
- If everyone invested, each would get \$400.
- However, if only one person invested, that "sucker" would take home a mere \$100.

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Payoff Function of the Public Good Game

This is a game in normal form and therefore has a payoff function for each player. The payoff function for, let's say, player 1 is given by

$$\begin{aligned} P_1 &= \frac{2 \cdot (s_1 + s_2 + s_3 + s_4)}{4} - s_1 \\ &= \frac{2 \cdot (s_2 + s_3 + s_4)}{4} - 0,5 \cdot s_1 \end{aligned}$$

- Every investment s_1 of player 1 will diminish his payoff.
- Therefore, a rational player will choose the strategy $s_n = 0$, i.e. he will invest no money at all.

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GAMES

Rock, Paper, Scissors

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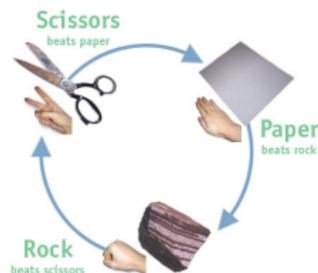
- Two players form a symbol (rock, paper or scissors) with their hands
- *Rock* crushes *Scissors*
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EVOLUTIONARY GAME THEORY

Why EGT?

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- Games can be played repeatedly, and also with a population of players.
- Which populations/strategies are stable?
- Is it possible for mutants to invade a given population?
- How does cooperation arise and evolve?
- How does biodiversity emerge?

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EGT- New Concepts

- Evolutionary stable strategy (ESS)
 - To investigate the stability of populations.
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Evolutionary Stable Strategy (ESS)

- Let $E(\mu, \sigma)$ be the payoff for a player playing μ against a player playing σ .
- For σ to be a Nash equilibrium it is demanded:
 $E(\sigma, \sigma) \geq E(\mu, \sigma)$
- For σ to be an ESS it is demanded:
 - 1 $E(\sigma, \sigma) > E(\mu, \sigma)$ (equilibrium condition), or
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Hawk-Dove Game

Hawk-Dove Game

- Two individuals compete for a resource V .
- Each individual follows exactly one of two strategies described below:
 - **Hawk**: Initiate aggressive behaviour, not stopping until injured or until one's opponent backs down.
 - **Dove**: Retreat immediately if one's opponent initiates aggressive behaviour.

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Hawk-Dove Game

We assume

- whenever two individuals both initiate aggressive behaviour, conflict eventually results and the two individuals are equally likely to be injured,
- the cost of the conflict reduces individual fitness by some constant value C ,
- when a hawk meets a dove, the dove immediately retreats and the hawk obtains the resource, and
- when two doves meet the resource is shared equally between them.

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Hawk-Dove Game

This leads to the following payoff matrix:

	Hawk	Dove
Hawk	$\frac{1}{2}(V - C), \frac{1}{2}(V - C)$	$V, 0$
Dove	$0, V$	$V/2, V/2$

- *Dove* is no stable strategy, since $\frac{V}{2} = E(D, D) < E(H, D) = V$.
- Because of $E(H, H) = \frac{1}{2}(V - C)$ and $E(D, H) = 0$, *H* is an ESS if $V \geq C$.
- But what if $V < C$?
- Neither *H* nor *D* is an ESS.

Hawk-Dove Game

This leads to the following payoff matrix:

	Hawk	Dove
Hawk	$\frac{1}{2}(V - C), \frac{1}{2}(V - C)$	$V, 0$
Dove	$0, V$	$V/2, V/2$

- *Dove* is no stable strategy, since $\frac{V}{2} = E(D, D) < E(H, D) = V$.
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EVOLUTIONARY GAME THEORY

The Replicator Dynamics

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- Let us consider now a population consisting of n types, and let $x_i(t)$ be the frequency of type i at some time t .
- The state of the population is given by the vector $\mathbf{x}(t) = x_1(t), \dots, x_n(t)$.
- The state of the population will change, since some species will get higher payoffs and will reproduce better than others, or others adopt the strategy of the species with the better fitness.
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- If individuals meet randomly and then engage in a symmetric game with payoff matrix A , then $(A\mathbf{x})_i$ is the expected payoff for an individual of type i
- $\mathbf{x}^T A \mathbf{x}$ is the average payoff in the population state \mathbf{x} .
- The evolution of \mathbf{x} over time is described by the replicator equation:

$$\dot{x}_i = x_i [(A\mathbf{x})_i - \mathbf{x}^T A \mathbf{x}]$$

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- By setting $\dot{x}_i = 0$, we obtain the *evolutionary stable states* of a population.
- A population is said to be in an *evolutionarily stable state* if its genetic composition is restored by selection after a disturbance, provided the disturbance is not too large.
- For $V > C$, the only evolutionary stable state is a population consisting of hawks.
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- We have seen, that the logical move in the Prisoner's Dilemma is to defect
- Consider spatially structured populations
- Limited local interactions enable cooperators to form clusters
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- Theoretical models have shown that competing species can coexist if ecological processes such as dispersal, movement, and interaction occur over small spatial scales.
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Biodiversity

- There exist three strains of *Escherichia coli* bacteria.
- Type A releases toxic colicin and produces, for its own protection, an immunity protein.
- Type B produces the immunity protein only.
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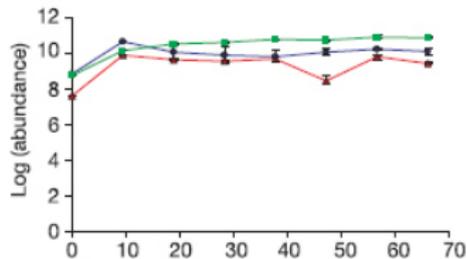
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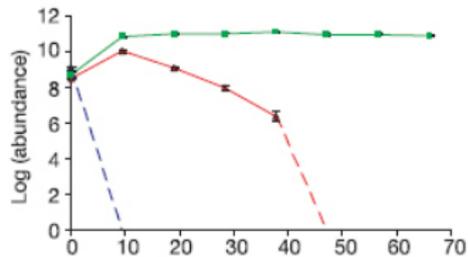
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Biodiversity

a Static Plate



b Flask



green: resistant strain

red: colicin producing strain

blue: sensitive strain

OUTLOOK

Outlook

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- Emerging fields as diverse as metabolic control networks within cells and evolutionary psychology, for example, should benefit from game theory.

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