

Biology X:  
Introduction to (evolutionary) game theory

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see Gintis, *Game theory evolving*, Chapters 2, 3, 10

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# Overview

Evolutionary game theory: motivation and background

Classical game theory

Evolutionary game theory: Stable states formalized

# Beginnings of evolutionary GT

- ▶ Why do competing animals usually not fight to death?
  - ▶ Idea: strategic behavior
  
- ▶ How can strategic behavior be explained?
  - ▶ Idea: (Simple) behaviors are determined genetically, evolution generates them
  
- ▶ What kinds of behaviors can this ultimately lead to?
  - ▶ Idea: Behaviors that are resistant to invasion by mutants

## Hawk-Dove

- ▶ Consider a population of animals competing for food, where each (pairwise) conflict is solved by fighting (“Hawk”)
- ▶ Contestants get severely injured, decreasing their fitness
- ▶ Assume a mutant occurs that withdraws before getting hurt, when defeat is evident (“Dove”)
- ▶ When two Doves meet, they share; when a Dove meets a Hawk, she retreats
- ▶ Avoiding injury, Doves can overall be fitter
- ▶ So their genes can spread in the population
- ▶ What happens in a population consisting purely of Doves?
- ▶ EGT examines dynamics and stable states (“equilibria”)

## Alarm calls

- ▶ Vervet monkeys have a sophisticated system of alarm calls
- ▶ Why would a monkey put itself at risk by calling out?
  
- ▶ In repeated interactions, the mutual benefit may outweigh the risk
- ▶ So a small mutant population can spread in a non-signaling population
  
- ▶ Again, in a signaling population, some “cheaters” may profit from alarm calls without contributing themselves

## Important features in these examples

- ▶ Population of individuals with (partial) conflict of interest
- ▶ Encounters take place among groups of individuals
- ▶ Behavior is controlled by genes and inherited
- ▶ Repeated interaction
- ▶ Random encounters, “anonymous”, no history
- ▶ But there may be correlation of encounters:
  - ▶ Spatial structure/geometry
  - ▶ Kinship
  - ▶ ...
- ▶ Depending on the parameters, different dynamics and equilibria may occur

# Evolutionary game theory (EGT)

- ▶ EGT puts these ideas into a mathematical framework and studies their properties
- ▶ Put differently, EGT studies dynamics and equilibria of individual behaviors in populations
- ▶ Most important initiator of EGT:
  - ▶ John Maynard Smith (1920–2004); *Evolution and the Theory of Games* (1982)
- ▶ Other people paved the way:
  - ▶ Ronald Fisher (1890–1962); his work on sex ratios (1930)
  - ▶ William D. Hamilton (1936–2000); his notion of an **unbeatable strategy** (1967)
  - ▶ George R. Price (1922–1975); JMS's coauthor on their seminal 1973 *Nature* paper

see also [http://en.wikipedia.org/wiki/Evolutionary\\_game\\_theory](http://en.wikipedia.org/wiki/Evolutionary_game_theory)

## Based on game theory

- ▶ EGT is an application of game theory to evolutionary biology
- ▶ To properly understand it, we must therefore start with classical game theory
- ▶ (Non-cooperative) game theory is **interactive decision theory**
- ▶ The basic entity is the **rational (self-interested) agent**
- ▶ A rational agent acts so as to maximize his own **well-being**
- ▶ Agents may have **conflicting interests**
- ▶ What the best act is may depend on how **other agents** act
- ▶ Game theory studies the behavior of such agents
- ▶ Important people:
  - ▶ John von Neumann (1903–1957), Oskar Morgenstern (1902–1977); *Theory of games and economic behavior* (1944)
  - ▶ John Nash (1994 Nobel prize in Economics)

# Outline

Evolutionary game theory: motivation and background

Classical game theory

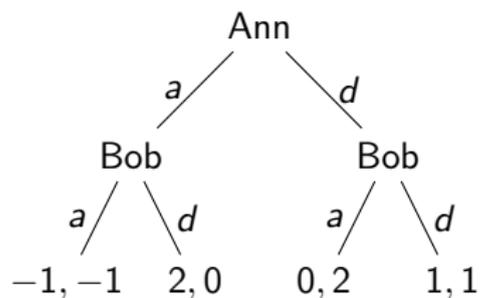
Evolutionary game theory: Stable states formalized

## Basic ingredients of game theory

- ▶ Agents, or players:  $N = \{1, \dots, n\}$
- ▶ Actions, or strategies:  $S_1, \dots, S_n$
- ▶ Utilities, or payoffs:  $\pi_1, \dots, \pi_n : S \rightarrow \mathbb{R}$ ,  
where  $S = S_1 \times \dots \times S_n$
  
- ▶ The payoff to a particular agent can depend not only on his choice of action, but on that of all players.
- ▶ Payoffs reflect an agents' preferences over the possible outcomes of an interaction.
- ▶ Agents are assumed to be **rational**, i.e., they try to maximize their (expected) payoff and only care for their own payoff.

# Basic concepts of game theory

Extensive form game:



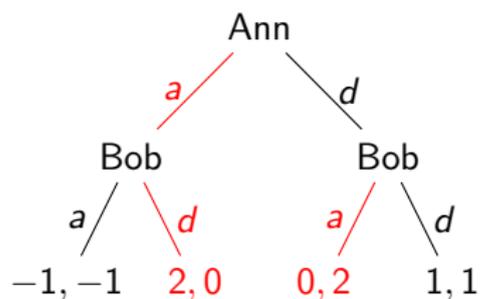
Normal/strategic form game:

		Bob			
		<i>aa</i>	<i>dd</i>	<i>ad</i>	<i>da</i>
Ann	<i>a</i>	-1, -1	2, 0	-1, -1	2, 0
	<i>d</i>	0, 2	1, 1	1, 1	0, 2

# Basic concepts of game theory

Extensive form game:

► Backward induction



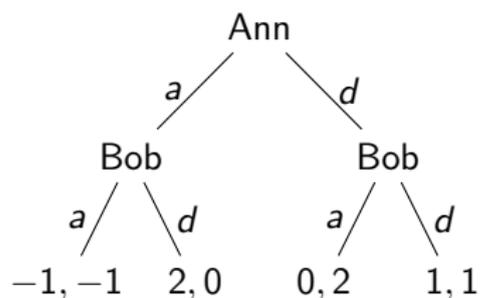
Normal/strategic form game:

		Bob			
		<i>aa</i>	<i>dd</i>	<i>ad</i>	<i>da</i>
Ann	<i>a</i>	$-1, -1$	$2, 0$	$-1, -1$	$2, 0$
	<i>d</i>	$0, 2$	$1, 1$	$1, 1$	$0, 2$

# Basic concepts of game theory

Extensive form game:

- ▶ Backward induction
- ▶ Equilibria

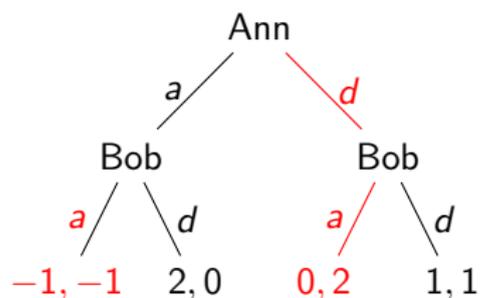


Normal/strategic form game:

		Bob			
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# Basic concepts of game theory

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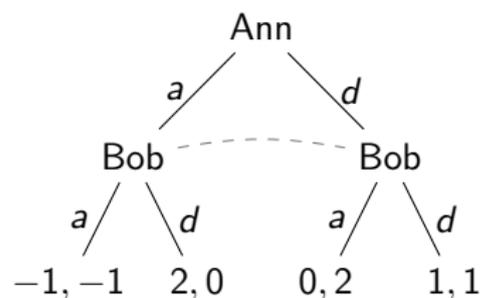
- ▶ Backward induction
- ▶ Equilibria
- ▶ Incredible threats

Normal/strategic form game:

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# Basic concepts of game theory

Extensive form game:



- ▶ Backward induction
- ▶ Equilibria
- ▶ Incredible threats
- ▶ Alternating vs simultaneous moves

Normal/strategic form game:

		Bob			
		<i>aa</i>	<i>dd</i>	<i>ad</i>	<i>da</i>
Ann	<i>a</i>	$-1, -1$	$2, 0$	$-1, -1$	$2, 0$
	<i>d</i>	$0, 2$	$1, 1$	$1, 1$	$0, 2$

		Bob	
		<i>a</i>	<i>d</i>
Ann	<i>a</i>	$-1, -1$	$2, 0$
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## Prisoner's dilemma

	Cooperate	Defect
Cooperate	2,2	0,3
Defect	3,0	1,1

- ▶ Defection dominates
- ▶ (Can be fixed by repetition)

## Stag hunt: Risky cooperation vs safe defection

	Stag	Hare
Stag	2,2	0,1
Hare	1,0	1,1

- ▶ (Stag, Stag) and (Hare, Hare) are both equilibria
- ▶ Outcome depends on mutual beliefs and risk attitude

# Nash equilibrium

- ▶ Strategy profile  $s = (s_1, \dots, s_n)$ : one strategy for each player
- ▶ Strategies of players except  $i$ :  $s_{-i} = (s_1, \dots, s_{i-1}, s_{i+1}, \dots, s_n)$

## Definition

$s_i$  is a **best response** to  $s_{-i}$  iff

$$\pi_i(s_i, s_{-i}) \geq \pi_i(s'_i, s_{-i}) \text{ for all } s'_i \in S_i$$

## Definition

A strategy profile  $s$  is a **Nash equilibrium** iff

for each player  $i$ ,  $s_i$  is a best response to  $s_{-i}$ .

- ▶ No player “regrets” his choice, given the others’ choices
- ▶ No player would benefit from **unilaterally deviating**.

## Matching pennies: no pure strategy equilibrium

	H	T
H	1, -1	-1, 1
T	-1, 1	1, -1

- ▶ “Circular” preferences, zero sum
- ▶ No equilibrium in pure strategies

## Mixed strategies

- ▶ Mixed strategy  $\sigma_i \in \Delta S_i$ : random choice among  $i$ 's pure strategies  $S_i$
- ▶ Assigns some probability  $\sigma_i(s_i)$  to any pure strategy  $s_i \in S_i$
- ▶ E.g., flipping the penny gives  $\sigma_i$  with  $\sigma_i(H) = \sigma_i(T) = 0.5$

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- ▶ Mixed-strategy profile:  $\sigma = (\sigma_1, \dots, \sigma_n)$
- ▶ E.g.,  $\sigma = (\sigma_1, \sigma_2)$  with  $\sigma_1 = \sigma_2 = \sigma_i$  above
- ▶ Since players are independent, for a joint strategy  $s \in S$  we let

$$\sigma(s) = \sigma_1(s_1) \cdot \dots \cdot \sigma_n(s_n)$$

- ▶ E.g.,  $\sigma(H, H) = \sigma_1(H) \cdot \sigma_2(H) = 0.5 \cdot 0.5 = 0.25$

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- ▶ E.g.,  $\sigma(H, H) = \sigma_1(H) \cdot \sigma_2(H) = 0.5 \cdot 0.5 = 0.25$
- ▶ Rational players maximize their **expected payoff**:

$$\pi_i(\sigma) = \sum_{s \in S} \sigma(s) \pi_i(s)$$

# Nash equilibrium in mixed strategies

## Definition

$\sigma_i$  is a **best response** to  $\sigma_{-i}$  iff

$$\pi_i(\sigma_i, \sigma_{-i}) \geq \pi_i(\sigma'_i, \sigma_{-i}) \text{ for all } \sigma'_i \in \Delta S_i$$

## Definition

A mixed-strategy profile  $\sigma$  is a **Nash equilibrium** iff

for each player  $i$ ,  $\sigma_i$  is a best response to  $\sigma_{-i}$ .

## Theorem (Nash, 1950)

*Every finite game has a Nash equilibrium in mixed strategies.*

- ▶ E.g.  $(\sigma_1, \sigma_2)$  from before is a Nash equilibrium

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# From rationality to evolution

- ▶ **Strategy**: genotypic variants
  - ▶ **Mixed strategy**: different ratios of pure-strategy individuals in a population
  - ▶ **Game**: repeated random encounters (“stage game”)
  - ▶ **Payoff**: fitness
  - ▶ **Rationality**: evolution
  - ▶ **Equilibrium**: fixation of (mix of) genetic traits
- 
- ▶ How do we get to an equilibrium? (Dynamics, to be discussed later)
  - ▶ What equilibrium concept reflects evolutionary stability?

## Hawk-Dove: Aggressive vs defensive

	Hawk	Dove
Hawk	-1,-1	2,0
Dove	0,2	1,1

- ▶ Two pure-strategy Nash equilibria: (Hawk, Dove), (Dove, Hawk)
- ▶ But no pure strategy can stably be adopted by a population
- ▶ Not immune against small perturbations (“mutants”)

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  - ▶ or  $\pi(\sigma, \sigma) = \pi(\tau, \sigma)$  and  $\pi(\sigma, \tau) > \pi(\tau, \tau)$   
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- ▶ Refinement of Nash equilibrium

## Hawk-Dove revisited

	Hawk	Dove
Hawk	-1,-1	2,0
Dove	0,2	1,1

- ▶ Assume a population of Doves:  
and a mutant Hawk:

$$\sigma(H) = 0, \sigma(D) = 1$$
$$\tau(H) = 1, \tau(D) = 0$$

- ▶  $\pi(\sigma, \sigma) = 1 < 2 = \pi(\tau, \sigma)$
- ▶ Hawks can invade

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- ▶ Hawks can invade
- ▶ But  $\pi(\sigma, \tau) = 0 > -1 = \pi(\tau, \tau)$ , so Hawks have an advantage only while the population has still mostly Doves
- ▶ Hawks won't be able to take over completely

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- ▶ Hawks won't be able to take over completely
- ▶ Mixed-strategy Nash equilibrium:  $\sigma(H) = \frac{1}{2}, \sigma(D) = \frac{1}{2}$
- ▶ This is also the unique ESS

# Summary

- ▶ **Evolutionary Game Theory** tries to explain observed stable states of populations as equilibria in an evolutionary process
- ▶ It is based on classical game theory (“interactive rational choice theory”), replacing rationality by evolution and choice by genotypic variants
- ▶ Members of a population are assumed to repeatedly participate in random encounters of a certain strategic form
- ▶ Payoffs represent fitness
  
- ▶ **Nash equilibrium** is a set of strategies such that no single player would benefit from deviating
- ▶ **Evolutionary Stable Strategy** is a refinement of Nash equilibrium for symmetric games
- ▶ Intuition: if played by a population, then no small mutant population can invade