

INFO-F-409

Learning dynamics

An introduction to Game Theory



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MLG, Université Libre de Bruxelles and
AI-lab, Vrije Universiteit Brussel



Computational Game Theory

An introduction to Game Theory



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AI-lab, Vrije Universiteit Brussel



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- telephone: 02/650 60 04
- email: tlenaert@ulb.ac.be
- <http://mlg.ulb.ac.be/> and
<http://ai.vub.ac.be/>



Schedule

Date (thursdays)	Description
22/09/2016	No course this day
29/09/2016	Game theory basics
6/10/2016	Mixed strategies and Nash algorithms
13/10/2016	Extensive form games and their equilibria
20/10/2016	N-armed bandits (stateless reinforcement learning)
27/10/2016	Evolutionary Game Theory and the evolution of cooperation
3/11/2016	Networks and their influence on cooperation
10/11/2016	No course this week
17/11/2016	Reinforcement learning and MDPS
24/11/2016	Sparse Interactions
1/12/2016	Selfish load balancing
8/12/2016	Graphical games
15/12/2016	Project preparation time
22/12/2016	Project preparation time
29/12/2016	Winter break
5/01/2017	Exam: Article + presentation of group project

Practical things

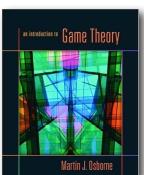
- ~3 Assignments during the course
 - They are taken into account (50%) for the final grade.
 - **Assignments are personal (NO TEAMWORK), this will be checked !**
 - Mail your solutions
 - NO paper copies !!!
 - Please provide a single (self-contained) *.PDF file.
- Schedule (temporary)
 - Assignment 1 Game theory basics
 - Assignment 2 Evolutionary game theory
 - Assignment 3 Reinforcement learning

Practical things

- Exam = scientific project
 - study a topic related to the course (some possibilities will be provided)
 - Look for something **YOU** like on for instance [google scholar](#)
 - Formulate a question you want to study
 - implement a software that allows you to answer that question
 - Write a scientific article ([The unofficial guide for authors](#))
 - Present and discuss articles in January

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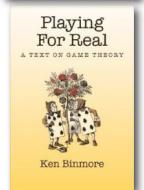
Bibliography



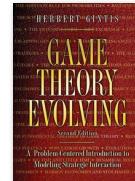
M.J. Osborne (2003) An introduction to Game Theory. Oxford University Press



K. Binmore (2007) Game Theory, A very short introduction. Oxford University Press



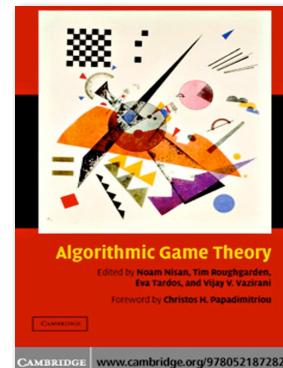
K. Binmore (2007) Playing for real; a text on game theory. Oxford University Press



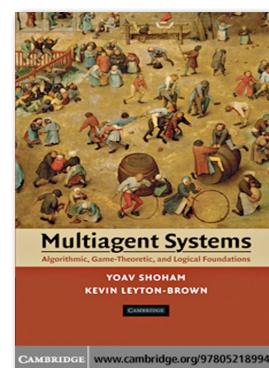
H. Gintis (2009) Game Theory evolving; a problem-centered introduction to modeling strategic interactions. Princeton University Press

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for computer science



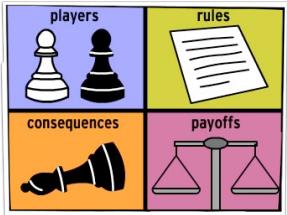
Algorithmic Game Theory
Edited by Noam Nisan, Tim Roughgarden, Eva Tardos, and Vijay V. Vazirani
Foreword by Christos H. Papadimitriou



Multiagent Systems
Algorithmic, Game-Theoretic, and Logical Foundations
YOAV SHOHAM
KEVIN LEYTON-BROWN

What?

[...] A game is a competitive activity in which players contend with each other according to a set of rules [...]



[...] Game theory is a theory/tool that helps us understand situations in which decision-makers interact [...]

What ?



games

What ?



g

economy

What ?



g

economy

What ?



economy

What ?



game

politics

What ?



Game shows

What?



Fragment from Golden Balls (ITV)

What?



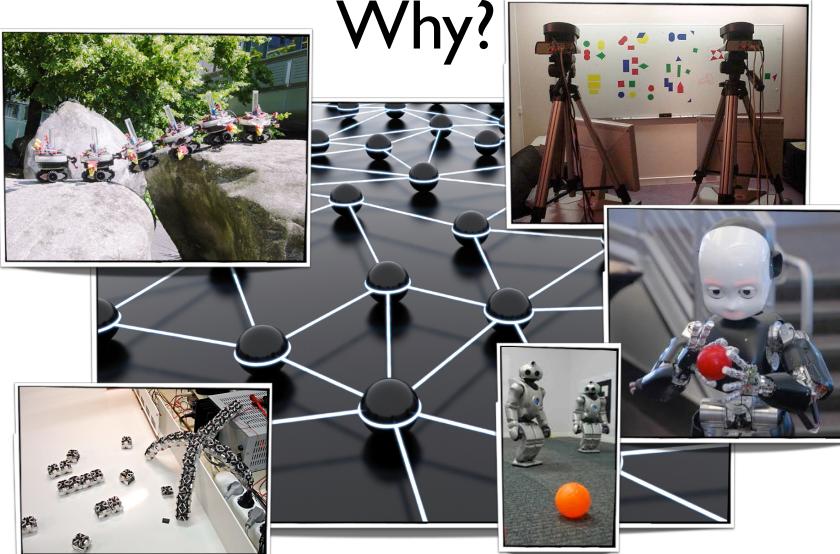
Fragment from Golden Balls (ITV1)

What ?



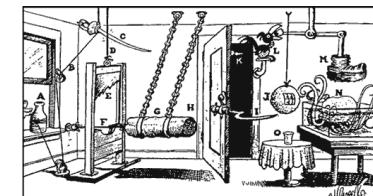
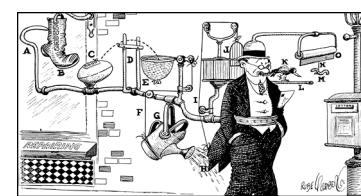
Biology

Why?



Model building

[...] Game-theoretic modeling starts with an idea related to some aspect of interacting decision-makers. We express this idea precisely in a model, incorporating features of the situation that appear to be relevant. [...] We wish to put enough ingredients into the model to obtain nontrivial insights, [...] we wish to lay bare the underlying structure of the situation as opposed to describing its every detail. The next step is to analyze the model - to discover its implications [...] Our analysis may confirm our idea, or suggest it is wrong. If it is wrong the analysis should help us understand why [...]



Short history

E. Borel



1871

Short history

J. von Neumann



E. Borel



1871

1902

1903

O. Morgenstern

Short history

E. Borel

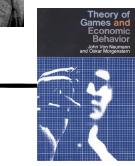


J. von Neumann



1871

1902



1903

1944

O. Morgenstern

Short history

J. von Neumann



E. Borel



J. Nash



1871

1902

1903

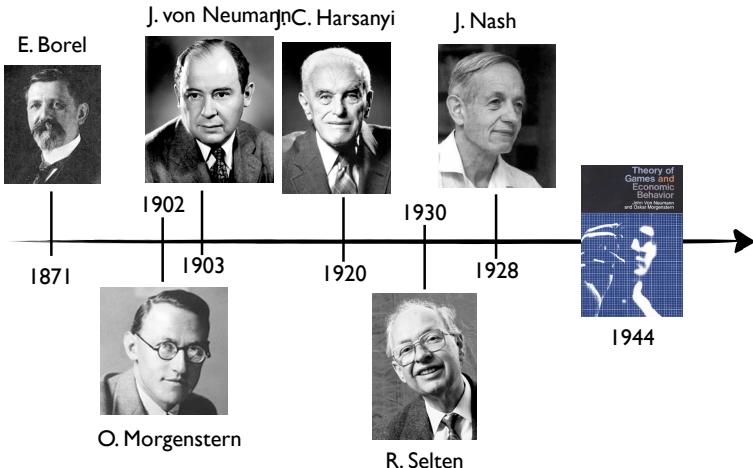
1928



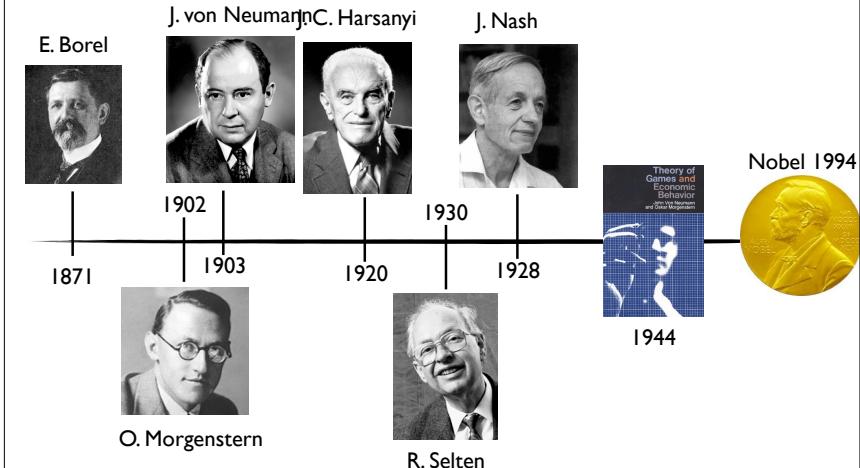
1944

O. Morgenstern

Short history



Short history

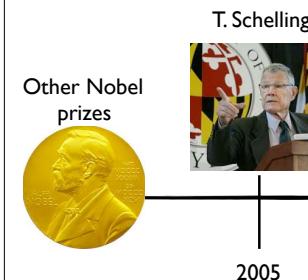


recent history

Other Nobel
prizes



recent history



recent history



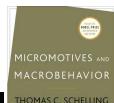
Other Nobel
prizes



T. Schelling



2005



THOMAS C. SCHELLING

recent history



Other Nobel
prizes



T. Schelling



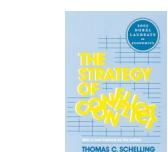
2007

2005



E. Maskin

recent history



Other Nobel
prizes



T. Schelling



2007

E. Ostrom



2009

2005



E. Maskin

recent history



Other Nobel
prizes



T. Schelling

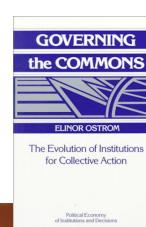


2007

2005



E. Maskin

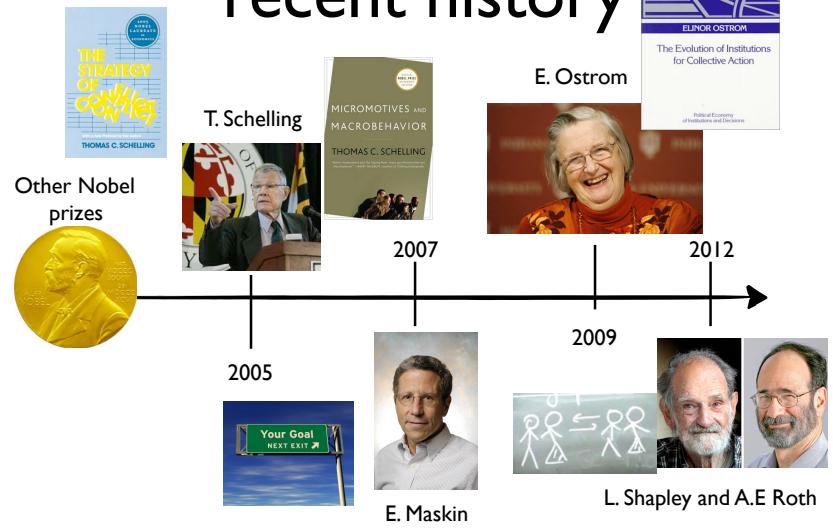


GOVERNING
the COMMONS
ELINOR OSTROM
The Evolution of Institutions for Collective Action

E. Ostrom



recent history

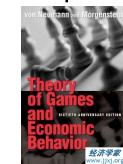


Evolutionary game theory

J.Von Neumann &
O. Morgenstern



1944



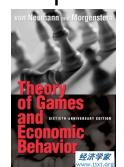
Evolutionary game theory

J.Von Neumann &
O. Morgenstern



1944

1950



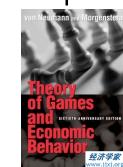
J. Nash

Evolutionary game theory

J.Von Neumann &
O. Morgenstern



1944



J. Nash

1950

1964



W. Hamilton

Evolutionary game theory

J. Von Neumann &
O. Morgenstern



1944

J. Maynard-Smith

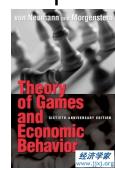


1950



Evolution
and the
Theory of
Games

1964 1970



Theory
of Games
and
Economic
Behavior

J. Nash



W. Hamilton



Evolutionary game theory

J. Von Neumann &
O. Morgenstern

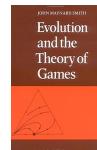


1944

J. Maynard-Smith



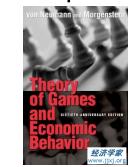
1950



Evolution
and the
Theory of
Games

1964 1970

1971



Theory
of Games
and
Economic
Behavior

J. Nash



W. Hamilton



R. Trivers



Rational choice

A decision-maker chooses the best **action** according to her **preferences**, among all the actions available

Actions in Golden Balls game : $A = \{\text{split}, \text{steal}\}$

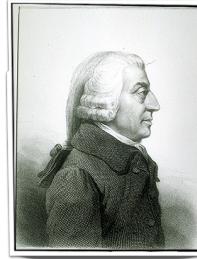
Preferences should be consistent and can be represented by a function $u(x)$

In Golden Balls game : $u(\text{steal}) > u(\text{split})$

The scale of the numbers in this function do not relate to the importance of a preference

The theory of rational choice

A. Smith
1723-1790



[...] The action chosen by a decision-maker is at least as good, according to her preferences, as every other available action [...]

This theory pervades economic theory !

Is not always applicable !

Rational choice according to Nash



Fragment from A Beautiful mind (2001)

Rational choice according to Nash



Fragment from A Beautiful mind (2001)

Other decision-makers

A decision-maker preferences' are affected by the preferred actions of other decision-makers

Such situations are modeled as games !



Strategic games

Fragment from The Big-Bang Theory (2008)



Consists of :

- a set of players
- for each player a set of actions
- for each player, **preferences over the set of actions**

Strategic games

Fragment
from The Big-
Bang Theory
(2008)



Consists of :

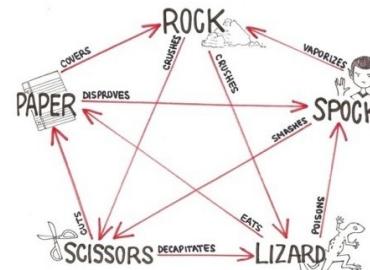
- a set of players
- for each player a set of actions
- for each player, preferences over the set of actions

Strategic games

Players : Sheldon and Rajesh

Actions : {rock, paper, scissors, lizard, spock}

Preferences :

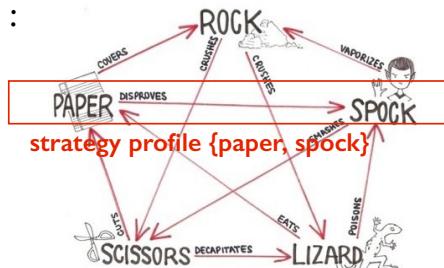


Strategic games

Players : Sheldon and Rajesh

Actions : {rock, paper, scissors, lizard, spock}

Preferences :



The Golden Balls dilemma

Players : Sarah and Steve

Actions : {split, steal}

Preferences :



	split	steal
split	50075	100150
steal	50075	0
	0	0
	100150	0

The prisoner's dilemma

Players : Two thieves

Actions : {Quiet, Fink}



Preferences :

		Quiet	Fink
Quiet	Quiet	3	7
	Fink	3	0
Fink	Quiet	0	1
	Fink	7	1

$$u(Fink, Quiet) > u(Quiet, Quiet) > u(Fink, Fink) > u(Quiet, Fink)$$

The prisoner's dilemma

This game extends to a variety of situations

- working on a joint project,
- duopoly
- arms race
- use of a common property



The chicken game



Fragment from Footloose (1984)

The chicken game



Fragment from Footloose (1984)

The chicken game

Players : Kevin Bacon and Chuck

Actions : {swerve, straight}

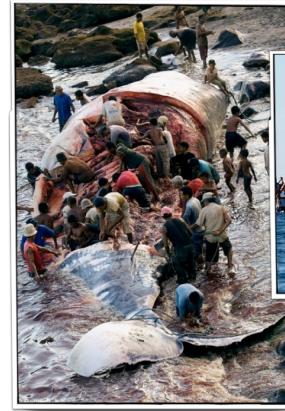


		swerve	straight
swerve	swerve	0	+1
	straight	0	-1
straight	swerve	-1	-10
	straight	+1	-10

a.k.a. snowdrift game

$$u(\text{straight, straight}) > u(\text{swerve, straight}) > u(\text{swerve, swerve}) > u(\text{straight, swerve})$$

The stag-hunt game



The stag-hunt game

Players : two hunters

Actions : {whale, fish}



		whale	fish
whale	whale	2	1
	fish	2	0
fish	whale	0	1
	fish	1	1

a.k.a. coordination game

$$u(\text{whale, whale}) > u(\text{fish, whale}) > u(\text{fish, fish}) > u(\text{whale, fish})$$

arms race?

		Refrain	Arm
Refrain	Refrain	2	3
	Arm	2	0
Arm	Refrain	0	1
	Arm	3	1

prisoner's dilemma

		Refrain	Arm
Refrain	Refrain	3	2
	Arm	3	0
Arm	Refrain	0	1
	Arm	2	1

stag-hunt game
a.k.a. security dilemma



Matching pennies

Strictly competitive



Players : two players

Actions : {head, tail}

	head	tail
head	-1	+1
tail	+1	-1

Zero-sum game

tail

Matching pennies

Example : IPad and look-a-likes



A newcomer will prefer that his ipad-clone looks and feels like the original

The established producer wants to ensure the difference

Matching pennies

Example : IPad and look-a-likes



A newcomer will prefer that his ipad-clone looks and feels like the original

The established producer wants to ensure the difference

Bach-Stravinsky game



a.k.a. Battle of the sexes

Players : two players

Actions : {Bach, Stravinsky}

	Bach	Strav.
Bach	1	0
Strav.	2	0

	Bach	Strav.
Bach	1	0
Strav.	0	2

Asymmetric games

A game is called symmetric when the row and column player have the same preferences over the same actions

... when they have the same payoff matrix ($A=B^T$)

Symmetric games : prisoners dilemma, the chicken game, the stag-hunt game, ...

Asymmetric games : Bach-Stravinsky, inspection game, ...

Inspection game

"A tax authority wants taxpayers to truthfully report income, an employer wants an employee to work hard, a regulator wants a factory to comply with pollution regulations, police want motorists to observe speed limits, etc.

A fundamental problem for authorities is how to induce compliance with desired behavior when individuals have incentives to deviate from such behavior. A standard approach is to monitor a proportion of individuals and penalize those caught misbehaving." (Quote from D. Nosenzo et al 2010 Discussion Paper 2010-02)



Comply Cheat

	Comply	Cheat
Don't Inspect	25 60	40 0
Inspect	25 52	20 12

Symmetrization

An asymmetric game can be transformed into a symmetrical version of the game either by

- Assuming that each player can act as row and column player 50% of the time

DC meets DC
i) D against C = 60
ii) C against D = 25

average = 42.5

	DC	DH	IC	IH
DC	42.5 42.5	50 12.5	37.5 42.5	46 12.5
DH	12.5 50	20 20	18.5 40	26 10
IC	42.5 37.5	40 18.5	37.5 37.5	36 18.5
IH	12.5 46	10 26	18.5 36	16 16

Symmetrization

An asymmetric game can be transformed into a symmetrical version of the game either by

- Assuming that both players have the same actions but only receives payoff when playing against the correct ones

When playing D against D, I against I, C against C and H against H, there is no payoff

	D	I	C	H
D	0 0	0 0	25 60	40 0
I	0 0	0 0	25 52	20 12
C	60 25	52 25	0 0	0 0
H	0 40	12 20	0 0	0 0

Nash equilibrium

Which action will be chosen by each player?

Nash equilibrium

Which action will be chosen by each player?

Theory of rational choice states that each player chooses the **best available action**

Nash equilibrium

Which action will be chosen by each player?

Theory of rational choice states that each player chooses the **best available action**

Since this choice depends on the actions of the other player, each player must form a **belief** about the other players' actions and preferences

Nash equilibrium

Which action will be chosen by each player?

Theory of rational choice states that each player chooses the **best available action**

Since this choice depends on the actions of the other player, each player must form a **belief** about the other players' actions and preferences

This belief is formed based on the **knowledge of the game and past experiences**

Nash equilibrium

Which action will be chosen by each player?

Theory of rational choice states that each player chooses the **best available action**

Since this choice depends on the actions of the other player, each player must form a **belief** about the other players' actions and preferences

This belief is formed based on the **knowledge of the game and past experiences**

BUT ! each play is considered in isolation (players do not know each other)

Nash equilibrium

Definition :

A Nash Equilibrium (NE) is an action profile a^* with the property that no player i can do better by choosing an action different from a_i^* given that every other player j adheres to a_j^*

A NE corresponds to a stable “social norm”: if everyone follows it, no person will wish to deviate from this

Note that the solution proposed in the bar game in the movie a beautiful mind does not correspond to a Nash equilibrium (Anderson and Enger, 2002)

Nash equilibrium

Assume that (a_i', a_{-i}) is the action profile in which every player j except i chooses her action a_j as specified by a , whereas player i deviates to a_i'

Definition :

The action profile a^* in a strategic game is a Nash Equilibrium if for every player i and for every action a_i of player i , a^* is at least as good according to player i 's preferences as the action profile (a_i, a_{-i}^*) in which player i chooses a_i while every other player j chooses action a_j^* . Equivalently, for every player i ,

$u_i(a^*) \geq u_i(a_i, a_{-i}^*)$ for every action a_i of player i
where u_i is the payoff function that represents player i 's preferences

Examples

I. The prisoner's dilemma

Assume the profile :

	Quiet	Fink
Quiet	3 3	7 0
Fink	7 0	1 1

(Fink, Fink) $u_1 \rightarrow 1$ $u_2 \rightarrow 1$

Examples

I. The prisoner's dilemma

Assume the profile :

	Quiet	Fink
Quiet	3 3	0 7
Fink	7 0	1 1

$$(\text{Quiet}, \text{Quiet}) \quad u_1 \rightarrow 3 \quad u_2 \rightarrow 3$$

$$(\text{Fink}, \text{Quiet}) \quad u_1 \rightarrow 7$$

$$(\text{Fink}, \text{Fink}) \quad u_1 \rightarrow 1 \quad u_2 \rightarrow 1$$

$$(\text{Quiet}, \text{Fink}) \quad u_2 \rightarrow 7$$

Examples

I. The prisoner's dilemma

Assume the profile :

	Quiet	Fink
Quiet	3 3	0 7
Fink	7 0	1 1

$$(\text{Quiet}, \text{Quiet}) \quad u_1 \rightarrow 3 \quad u_2 \rightarrow 3$$

$$(\text{Fink}, \text{Quiet}) \quad u_1 \rightarrow 7$$

$$(\text{Quiet}, \text{Fink}) \quad u_2 \rightarrow 7$$

$$(\text{Fink}, \text{Fink}) \quad u_1 \rightarrow 1 \quad u_2 \rightarrow 1$$

Examples

I. The prisoner's dilemma

Assume the profile :

	Quiet	Fink
Quiet	3 3	0 7
Fink	7 0	1 1

$$(\text{Quiet}, \text{Quiet}) \quad u_1 \rightarrow 3 \quad u_2 \rightarrow 3$$

$$(\text{Fink}, \text{Quiet}) \quad u_1 \rightarrow 7$$

$$(\text{Quiet}, \text{Fink}) \quad u_2 \rightarrow 7$$

$$(\text{Fink}, \text{Fink}) \quad u_1 \rightarrow 1 \quad u_2 \rightarrow 1$$

$$(\text{Quiet}, \text{Fink}) \quad u_1 \rightarrow 0$$

Examples

I. The prisoner's dilemma

Assume the profile :

	Quiet	Fink
Quiet	3 3	0 7
Fink	7 0	1 1

$$(\text{Quiet}, \text{Quiet}) \quad u_1 \rightarrow 3 \quad u_2 \rightarrow 3$$

$$(\text{Fink}, \text{Quiet}) \quad u_1 \rightarrow 7$$

$$(\text{Quiet}, \text{Fink}) \quad u_2 \rightarrow 7$$

$$(\text{Fink}, \text{Fink}) \quad u_1 \rightarrow 1 \quad u_2 \rightarrow 1$$

$$(\text{Quiet}, \text{Fink}) \quad u_1 \rightarrow 0$$

$$(\text{Fink}, \text{Quiet}) \quad u_2 \rightarrow 0$$

Examples

I. The prisoner's dilemma

Assume the profile :

	Quiet	Fink
Quiet	3 3	0 7
Fink	7 0	1 1

- (Quiet, Quiet) $u_1 \rightarrow 3 \quad u_2 \rightarrow 3$
- (Fink, Quiet) $u_1 \rightarrow 7 \quad u_2 \rightarrow 0$
- (Quiet, Fink) $u_2 \rightarrow 7 \quad u_1 \rightarrow 0$
- (Fink, Fink) $u_1 \rightarrow 1 \quad u_2 \rightarrow 1$
- (Quiet, Fink) $u_1 \rightarrow 0 \quad u_2 \rightarrow 7$
- (Fink, Quiet) $u_2 \rightarrow 0 \quad u_1 \rightarrow 1$

Examples

I. The prisoner's dilemma

	Quiet	Fink
Quiet	3 3	0 7
Fink	7 0	1 1

Note that any deviation from this NE results in a worse outcome.
 This NE is therefore also a strict NE : for every player i , $u_i(a^*) > u_i(a_i, a_{-i}^*)$ for every action a_i of player i

- (Fink, Fink) $u_1 \rightarrow 1 \quad u_2 \rightarrow 1$
- (Quiet, Fink) $u_1 \rightarrow 0 \quad u_2 \rightarrow 7$
- (Fink, Quiet) $u_2 \rightarrow 0 \quad u_1 \rightarrow 1$

Examples

2. The chicken game

Assume the profile :

	Swerve	Straight
Swerve	0 0	+1 -
Straight	- +1	-10 -10

- (swerve, swerve) $u_1 \rightarrow 0 \quad u_2 \rightarrow 0$

- (straight, straight) $u_1 \rightarrow -10 \quad u_2 \rightarrow -10$

Examples

2. The chicken game

Assume the profile :

	Swerve	Straight
Swerve	0 0	+1 -
Straight	- +1	-10 -10

- (swerve, swerve) $u_1 \rightarrow 0 \quad u_2 \rightarrow 0$

- (straight, swerve) $u_1 \rightarrow +1 \quad u_2 \rightarrow 0$

- (straight, straight) $u_1 \rightarrow -10 \quad u_2 \rightarrow -10$

Examples

2.The chicken game

Assume the profile :

	Swerve	Straight
Swerve	0	+1
Straight	-	-10
	+1	-10

(swerve, swerve) $u_1 \rightarrow 0 \quad u_2 \rightarrow 0$

(straight, swerve) $u_1 \rightarrow +1$

(swerve, straight) $u_2 \rightarrow +1$

(straight, straight) $u_1 \rightarrow -10 \quad u_2 \rightarrow -10$

Examples

2.The chicken game

Assume the profile :

	Swerve	Straight
Swerve	0	+1
Straight	-	-10
	+1	-10

(swerve, swerve) $u_1 \rightarrow 0 \quad u_2 \rightarrow 0$

(straight, swerve) $u_1 \rightarrow +1$

(swerve, straight) $u_2 \rightarrow +1$

(straight, straight) $u_1 \rightarrow -10 \quad u_2 \rightarrow -10$

(swerve, straight) $u_1 \rightarrow -1$

Examples

2.The chicken game

Assume the profile :

	Swerve	Straight
Swerve	0	+1
Straight	-	-10
	+1	-10

(swerve, swerve) $u_1 \rightarrow 0 \quad u_2 \rightarrow 0$

(straight, swerve) $u_1 \rightarrow +1$

(swerve, straight) $u_2 \rightarrow +1$

(straight, straight) $u_1 \rightarrow -10 \quad u_2 \rightarrow -10$

(swerve, straight) $u_1 \rightarrow -1$

(straight, swerve) $u_2 \rightarrow -1$

Examples

2.The chicken game

Assume the profile :

	Swerve	Straight
Swerve	0	+1
Straight	-	-10
	+1	-10

(straight, swerve) $u_1 \rightarrow +1 \quad u_2 \rightarrow -1$

(swerve, straight) $u_1 \rightarrow -1 \quad u_2 \rightarrow +1$

Examples

2.The chicken game

Assume the profile :

	Swerve	Straight
Swerve	0	+1
Straight	-	-10
(swerve, straight)	$u_1 \rightarrow -1$	$u_2 \rightarrow +1$

(straight, swerve) $u_1 \rightarrow +1$ $u_2 \rightarrow -1$

(swerve, swerve) $u_1 \rightarrow 0$

(swerve, straight) $u_1 \rightarrow -1$ $u_2 \rightarrow +1$

Examples

2.The chicken game

Assume the profile :

	Swerve	Straight
Swerve	0	+1
Straight	-	-10
(straight, swerve)	$u_1 \rightarrow +1$	$u_2 \rightarrow -1$

(swerve, swerve) $u_1 \rightarrow 0$

(straight, straight) $u_2 \rightarrow -10$

(swerve, straight) $u_1 \rightarrow -1$ $u_2 \rightarrow +1$

Examples

2.The chicken game

Assume the profile :

	Swerve	Straight
Swerve	0	+1
Straight	-	-10
(straight, swerve)	$u_1 \rightarrow +1$	$u_2 \rightarrow -1$
(swerve, swerve)	$u_1 \rightarrow 0$	
(straight, straight)	$u_2 \rightarrow -10$	
(swerve, straight)	$u_1 \rightarrow -1$	$u_2 \rightarrow +1$
(straight, straight)	$u_1 \rightarrow -10$	

(straight, swerve) $u_1 \rightarrow +1$ $u_2 \rightarrow -1$

(swerve, swerve) $u_1 \rightarrow 0$

(straight, straight) $u_2 \rightarrow -10$

(swerve, straight) $u_1 \rightarrow -1$ $u_2 \rightarrow +1$

(straight, straight) $u_1 \rightarrow -10$

Examples

2.The chicken game

Assume the profile :

	Swerve	Straight
Swerve	0	+1
Straight	-	-10
(straight, swerve)	$u_1 \rightarrow +1$	$u_2 \rightarrow -1$

(swerve, swerve) $u_1 \rightarrow 0$

(straight, straight) $u_2 \rightarrow -10$

(swerve, straight) $u_1 \rightarrow -1$ $u_2 \rightarrow +1$

(straight, straight) $u_1 \rightarrow -10$

(swerve, swerve) $u_2 \rightarrow 0$

Examples

2. The chicken game

Assume the profile :

	Swerve	Straight
Swerve	0 0	+1 -1
Straight	-1 +1	-10 -10

- (straight, swerve) $u_1 \rightarrow +1$ $u_2 \rightarrow -1$
- (swerve, swerve) $u_1 \rightarrow 0$
- (straight, straight) $u_2 \rightarrow -10$
- (swerve, straight) $u_1 \rightarrow -1$ $u_2 \rightarrow +1$
- (straight, straight) $u_1 \rightarrow -10$
- (swerve, swerve) $u_2 \rightarrow 0$

Examples

2. The chicken game

Assume the profile :

	Swerve	Straight
Swerve	0 0	+1 -1
Straight	+1 -1	-10 -10

- Both NE are also strict NE
- (straight, swerve) $u_1 \rightarrow 0$
- (straight, straight) $u_2 \rightarrow -10$
- (swerve, straight) $u_1 \rightarrow -1$ $u_2 \rightarrow +1$
- (straight, straight) $u_1 \rightarrow -10$
- (swerve, swerve) $u_2 \rightarrow 0$

Examples

3. The stag-hunt or whale-fish game

Assume the profile :

	whale	fish
whale	2 2	1 0
fish	0 1	1 1

- (whale, whale) $u_1 \rightarrow 2$ $u_2 \rightarrow 2$
- (fish, fish) $u_1 \rightarrow 1$ $u_2 \rightarrow 1$

Examples

3. The stag-hunt or whale-fish game

Assume the profile :

	whale	fish
whale	2 2	1 0
fish	0 1	1 1

- (whale, whale) $u_1 \rightarrow 2$ $u_2 \rightarrow 2$
- (fish, whale) $u_1 \rightarrow 1$
- (fish, fish) $u_1 \rightarrow 1$ $u_2 \rightarrow 1$

Examples

3.The stag-hunt or whale-fish game

Assume the profile :

	whale	fish
whale	2 2 0 1	1 0 1 1
fish		
(whale, whale)	$u_1 \rightarrow 2$	$u_2 \rightarrow 2$
(fish, whale)	$u_1 \rightarrow 1$	
(whale, fish)	$u_2 \rightarrow 1$	
(fish, fish)	$u_1 \rightarrow 1$	$u_2 \rightarrow 1$

Examples

3.The stag-hunt or whale-fish game

Assume the profile :

	whale	fish
whale	2 2 0 1	1 0 1 1
fish		
(whale, whale)	$u_1 \rightarrow 2$	$u_2 \rightarrow 2$
(fish, whale)	$u_1 \rightarrow 1$	
(whale, fish)	$u_2 \rightarrow 1$	
(fish, fish)	$u_1 \rightarrow 1$	$u_2 \rightarrow 1$
(whale, fish)	$u_1 \rightarrow 0$	

Examples

3.The stag-hunt or whale-fish game

Assume the profile :

	whale	fish
whale	2 2 0 1	1 0 1 1
fish		
(whale, whale)	$u_1 \rightarrow 2$	$u_2 \rightarrow 2$
(fish, whale)	$u_1 \rightarrow 1$	
(whale, fish)	$u_2 \rightarrow 1$	
(fish, fish)	$u_1 \rightarrow 1$	$u_2 \rightarrow 1$
(whale, fish)	$u_1 \rightarrow 0$	
(fish, whale)	$u_2 \rightarrow 0$	

Examples

3.The stag-hunt or whale-fish game

Assume the profile :

	whale	fish
whale	2 2 0 1	1 0 1 1
fish		
(whale, whale)	$u_1 \rightarrow 2$	$u_2 \rightarrow 2$
(fish, whale)	$u_1 \rightarrow 1$	
(whale, fish)	$u_2 \rightarrow 1$	
(fish, fish)	$u_1 \rightarrow 1$	$u_2 \rightarrow 1$
(whale, fish)	$u_1 \rightarrow 0$	
(fish, whale)	$u_2 \rightarrow 0$	

Examples

3. The stag-hunt or whale-fish game

Assume the profile :

		whale	fish	
		2	1	$u_2 \rightarrow 2$
whale	whale	2	0	$u_2 \rightarrow 1$
	fish	0	1	$u_1 \rightarrow 1$
fish	whale	1	1	$u_1 \rightarrow 0$
	fish	1	0	$u_2 \rightarrow 0$

Both NE are also a strict NE

(whale, fish) $u_1 \rightarrow 1$ $u_2 \rightarrow 1$

(fish, fish) $u_1 \rightarrow 1$ $u_2 \rightarrow 1$

(whale, fish) $u_1 \rightarrow 0$

(fish, whale) $u_2 \rightarrow 0$

Examples

4. The Bach-Stravinsky or Battle of the sexes game

Assume the profile :

		Bach	Strav.	
		1	0	$u_1 \rightarrow 2$
Bach	Bach	1	0	$u_2 \rightarrow 1$
	Strav.	0	2	$u_1 \rightarrow 1$
Strav.	Bach	0	1	$u_2 \rightarrow 2$
	Strav.	1	0	$u_1 \rightarrow 0$

(Strav., Strav.) $u_1 \rightarrow 1$ $u_2 \rightarrow 2$

Examples

4. The Bach-Stravinsky or Battle of the sexes game

Assume the profile :

		Bach	Strav.	
		1	0	$u_2 \rightarrow 1$
Bach	Bach	1	0	$u_1 \rightarrow 2$
	Strav.	2	0	$u_1 \rightarrow 0$
Strav.	Bach	0	2	$u_2 \rightarrow 2$
	Strav.	0	1	$u_1 \rightarrow 1$

(Strav., Strav.) $u_1 \rightarrow 1$ $u_2 \rightarrow 2$

Examples

4. The Bach-Stravinsky or Battle of the sexes game

Assume the profile :

		Bach	Strav.	
		1	0	$u_2 \rightarrow 1$
Bach	Bach	1	0	$u_1 \rightarrow 2$
	Strav.	2	0	$u_1 \rightarrow 0$
Strav.	Bach	0	2	$u_2 \rightarrow 0$
	Strav.	0	1	$u_1 \rightarrow 1$

(Strav., Strav.) $u_1 \rightarrow 1$ $u_2 \rightarrow 2$

Examples

4.The Bach-Stravinsky or Battle of the sexes game

Assume the profile :

	Bach	Strav.
Bach	1 2	0 0
Strav.	0 0	2 1

(Bach, Bach)	$u_1 \rightarrow 2$	$u_2 \rightarrow 1$
(Strav., Bach)	$u_1 \rightarrow 0$	
(Bach, Strav.)	$u_2 \rightarrow 0$	
(Strav., Strav.)	$u_1 \rightarrow 1$	$u_2 \rightarrow 2$
(Bach, Strav.)	$u_1 \rightarrow 0$	

Examples

4.The Bach-Stravinsky or Battle of the sexes game

Assume the profile :

	Bach	Strav.
Bach	1 2	0 0
Strav.	0 0	2 1

(Bach, Bach)	$u_1 \rightarrow 2$	$u_2 \rightarrow 1$
(Strav., Bach)	$u_1 \rightarrow 0$	
(Bach, Strav.)	$u_2 \rightarrow 0$	
(Strav., Strav.)	$u_1 \rightarrow 1$	$u_2 \rightarrow 2$
(Bach, Strav.)	$u_1 \rightarrow 0$	
(Strav., Bach)	$u_2 \rightarrow 0$	

Examples

4.The Bach-Stravinsky or Battle of the sexes game

Assume the profile :

	Bach	Strav.
Bach	1 2	0 0
Strav.	0 0	2 1

(Bach, Bach)	$u_1 \rightarrow 2$	$u_2 \rightarrow 1$
(Strav., Bach)	$u_1 \rightarrow 0$	
(Bach, Strav.)	$u_2 \rightarrow 0$	
(Strav., Strav.)	$u_1 \rightarrow 1$	$u_2 \rightarrow 2$
(Bach, Strav.)	$u_1 \rightarrow 0$	
(Strav., Bach)	$u_2 \rightarrow 0$	

Examples

4.The Bach-Stravinsky or Battle of the sexes game

Assume the profile :

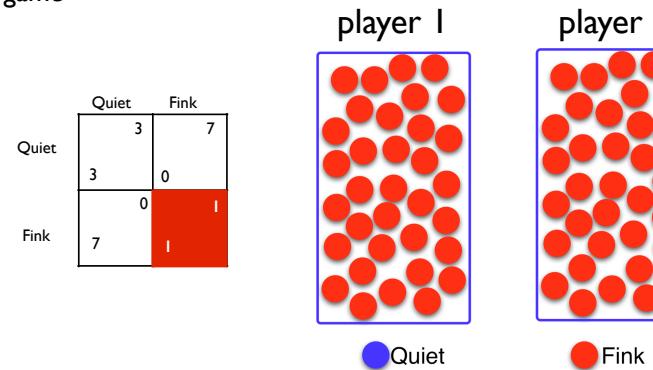
	Bach	Strav.
Bach	1 2	0 0
Strav.	0 0	2 1

Both NE are also a strict NE

(Bach, Strav.)	$u_1 \rightarrow 0$	$u_2 \rightarrow 0$
(Strav., Strav.)	$u_1 \rightarrow 1$	$u_2 \rightarrow 2$
(Bach, Strav.)	$u_1 \rightarrow 0$	
(Strav., Bach)	$u_2 \rightarrow 0$	

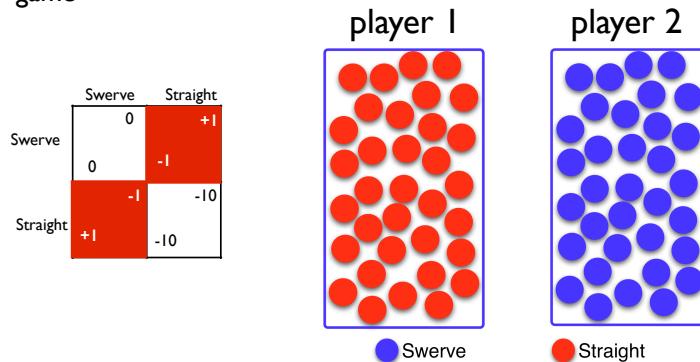
Population steady state

A NE corresponds to a *steady state* of an interaction between the members of several populations, one for each player in the game



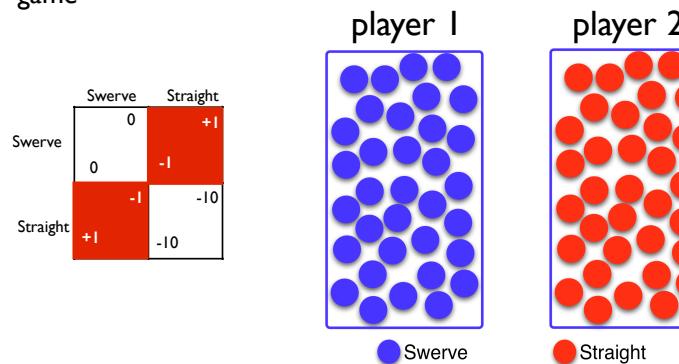
Population steady state

A NE corresponds to a *steady state* of an interaction between the members of several populations, one for each player in the game



Population steady state

A NE corresponds to a *steady state* of an interaction between the members of several populations, one for each player in the game



Best-response

How to find the Nash Equilibrium in bigger games?

	Bach	Strav.
Bach	1, 2	0, 0
Strav.	0, 0	2, 1

For every action a column player chooses there is a subset of best responses of the row player

$$B_r(\text{Bach}) = \{\text{Bach}\} \text{ and } B_r(\text{Strav}) = \{\text{Strav}\}$$

best response function of r player

$$B_i(a_{-i}) = \{a_i \in A_i : u_i(a_i, a_{-i}) \geq u_i(a'_i, a_{-i}) \forall a'_i \in A_i\}$$

Best-response

Best response function can thus be used to define NE

Definition :

The action profile a^* in a strategic game is a Nash Equilibrium if and only if every player's action is a best response to the other player's actions

$$a_i^* \text{ is in } B_i(a_{-i}^*) \text{ for every player } i$$

Best-response

Best-response functions can be used to find the NE
METHOD :

STEP 1: find the best-response function for each player

STEP 2: find the action profiles that satisfy : a_i^* is in $B_i(a_{-i}^*)$ for every player i

Best-response

Best-response functions can be used to find the NE

Example : STEP 1: find the best-response function for each player

	L	C	F
T	2	1	0
M	1	1	0
E	0	0	2

Best response of player 1 to player 2

Best response of player 2 to player 1

Best-response

Best-response functions can be used to find the NE

Example : STEP 1: find the best-response function for each player

	L	C	F
T	1	2	0
M	1	1	0
E	0	0	2

Best response of player 1 to player 2

$$B_I(L) = \{M\}$$

Best response of player 2 to player 1

Best-response

Best-response functions can be used to find the NE

Example : STEP I: find the best-response function for each player

	L	C	F
T	2 I	I 2	I I
M	I 2	0 I	0 I
E	0	0	I 2

Best response of player 1 to player 2

$$B_1(L)=\{M\} \quad B_1(C)=\{T\}$$

Best response of player 2 to player 1

Best-response

Best-response functions can be used to find the NE

Example : STEP I: find the best-response function for each player

	L	C	F
T	2 I	I 2	I I
M	I 2	0 I	0 I
E	0	0	I 2

Best response of player 1 to player 2

$$B_1(L)=\{M\} \quad B_1(C)=\{T\} \quad B_1(R)=\{T,B\}$$

Best response of player 2 to player 1

Best-response

Best-response functions can be used to find the NE

Example : STEP I: find the best-response function for each player

	L	C	F
T	2 I	I 2	I I
M	I 2	0 I	0 I
E	0	0	I 2

Best response of player 1 to player 2

$$B_1(L)=\{M\} \quad B_1(C)=\{T\} \quad B_1(R)=\{T,B\}$$

Best response of player 2 to player 1

$$B_2(T)=\{L\}$$

Best-response

Best-response functions can be used to find the NE

Example : STEP I: find the best-response function for each player

	L	C	F
T	2 I	I 2	I I
M	I 2	0 I	0 I
E	0	0	I 2

Best response of player 1 to player 2

$$B_1(L)=\{M\} \quad B_1(C)=\{T\} \quad B_1(R)=\{T,B\}$$

Best response of player 2 to player 1

$$B_2(T)=\{L\} \quad B_2(M)=\{L,C\}$$

Best-response

Best-response functions can be used to find the NE

Example : STEP 1: find the best-response function for each player

	L	C	F
I	2 1	2 1	1 0
M	2 0	1 0	0 0
E	0 1	0 1	2 1

Best response of player 1 to player 2

$$B_1(L)=\{M\} \quad B_1(C)=\{T\} \quad B_1(F)=\{T,B\}$$

Best response of player 2 to player 1

$$B_2(T)=\{L\} \quad B_2(M)=\{L,C\} \quad B_2(B)=\{R\}$$

Best-response

Best-response functions can be used to find the NE

Example : STEP 1: find the best-response function for each player

	L	C	F
I	2 1	2 1	1 0
M	2 0	1 0	0 0
E	0 1	0 1	2 1

Best response of player 1 to player 2

$$B_1(L)=\{M\} \quad B_1(C)=\{T\} \quad B_1(F)=\{T,B\}$$

Best response of player 2 to player 1

$$B_2(T)=\{L\} \quad B_2(M)=\{L,C\} \quad B_2(B)=\{R\}$$

STEP 2: boxes with two coloured payoffs are NE

Best-response

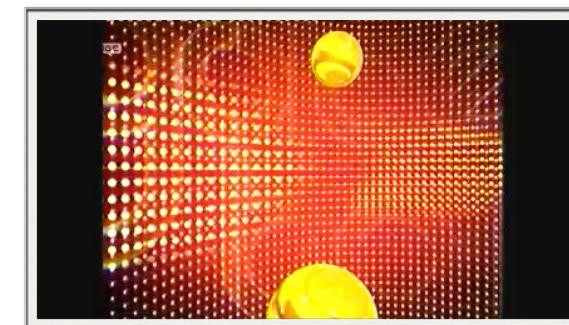
	Split	Steal
Split	3 3	7 0
Steal	0 7	1 1

	Swerve	Straight
Swerve	0 0	+1 -10
Straight	-10 +1	-10 -10

	whale	fish
whale	2 2	1 0
fish	0 1	1 1

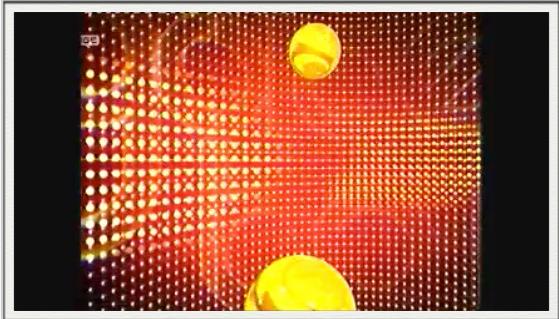
	Bach	Strav.
Bach	1 2	0 0
Strav.	0 0	2 1

How to beat the game?



Fragment from Golden Balls (ITV1)

How to beat the game?



Fragment from Golden Balls (ITV)

Dominance

In any game, a player's action *strictly dominates* another action if it is superior, no matter what the other player does

	Split	Steal
Split	3 3	7 0
Steal	0 7	1 1

Steal strictly dominates Split
If player 2 plays Split, then player 1 prefers Steal

If player 2 plays Steal, then player 1 also prefers Steal

Dominance

Definition :

In a strategic game player i 's action a_i'' **strictly dominates** her action a_i' if

$u_i(a_i'', a_{-i}) > u_i(a_i', a_{-i})$ for every list a_{-i} of the other player's action

We say that a_i' is **strictly dominated**

Strictly dominated actions can never be part of a NE since they are not part of a best response to any actions

Dominance

Definition :

In a strategic game player i 's action a_i'' **weakly dominates** her action a_i' if

$u_i(a_i'', a_{-i}) \geq u_i(a_i', a_{-i})$ for every list a_{-i} of the other player's action and

$u_i(a_i'', a_{-i}) > u_i(a_i', a_{-i})$ for **some** list a_{-i} of the other player's action

We say that a_i' is **weakly dominated**

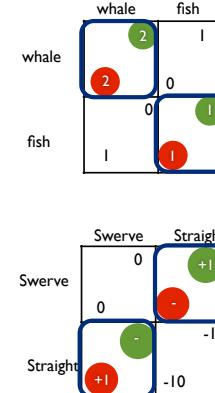
Dominance

	L	R
T	1	0
M	2	0
B	2	1

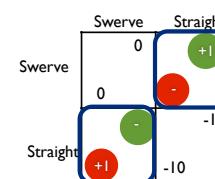
No matter what the column player does...
 M weakly dominates T
 B weakly dominates M
 BUT: B strictly dominates T

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Dominance



Neither whale nor fish strictly or weakly dominates the other player's action

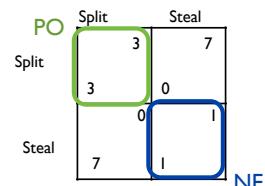
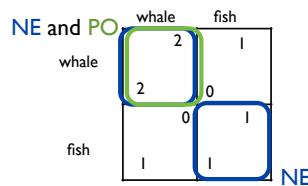


Neither swerve nor straight strictly or weakly dominates the other player's action

Pareto efficiency

Pareto optimality is a measure of efficiency.

"An outcome of a game is Pareto optimal if there is no other outcome that makes every player at least as well off and at least one player strictly better off. That is, a Pareto Optimal outcome cannot be improved upon without hurting at least one player."

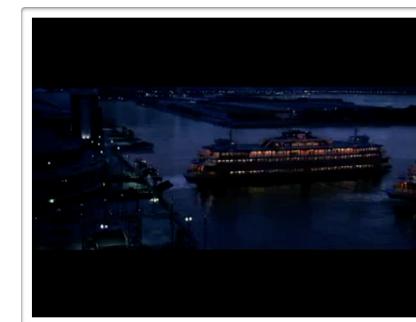


Shor, Mikael, "Pareto Optimal." Dictionary of Game Theory Terms, GameTheory.net, <<http://www.gametheory.net/dictionary/ParetoOptimal.html>> Web accessed: 11/09/2012

NE

Game theory in popular culture

The Joker's Social experiment



What does the payoff matrix look like? Are there any pure Nash equilibria?

Game theory in popular culture

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What does the payoff matrix look like? Are there any pure Nash equilibria?