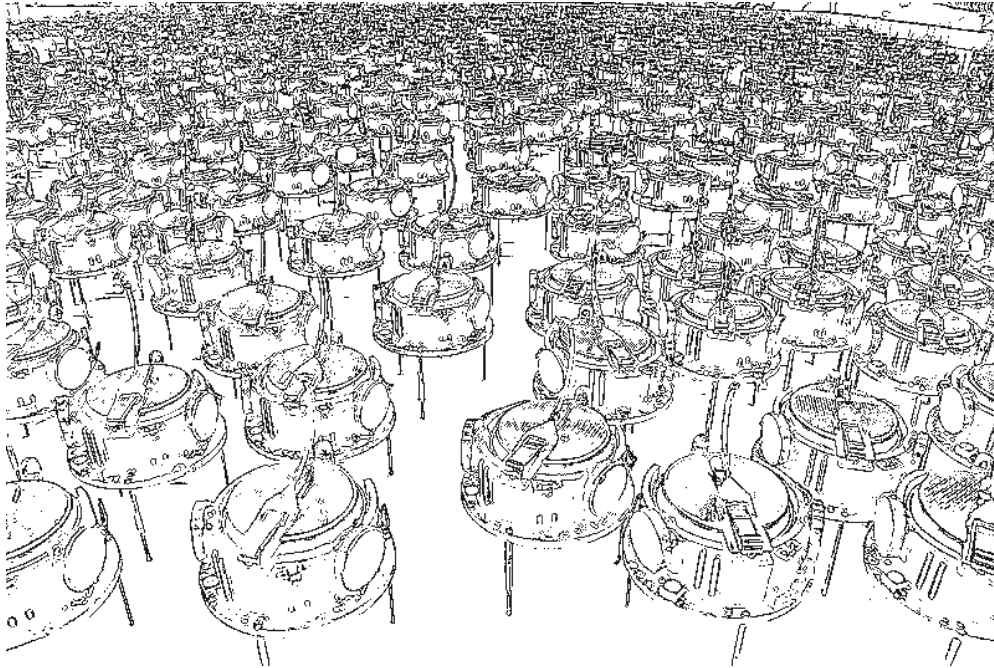


Intelligent Multi Agent Systems



Game Theory

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Agenda



- ➡ Introduction in Game Theory
- ➡ Some Example Games
- ➡ Solution Concepts:
 - ➡ Dominance
 - ➡ Pareto Optimality
 - ➡ Nash Equilibria
 - ➡ Correlated Equilibrium
 - ➡ MaxMin and MinMax strategies
 - ➡ Rationalizability

Game Theory



- ➡ In a multi-agent system, the decision of an agent may affect other agents.
- ➡ Typically, an agent will be uncertain about the actions of the other agents.
- ➡ Game theory is the study of multi-agent decision making under uncertainty.

It is based on two premises:

- ➡ The agents are **rational**.
- ➡ The agents reason **strategically**.

Class-room game



Lets play a little game:

- ➔ Everyone gets two cards (red and black)
- ➔ You will be matched with a random person

Rules of the game:

- ➔ Hold your card against the chest, reveal it simultaneously
- ➔ **Red card:** you get 2 points
- ➔ **Black card:** your partner gets 3 points

Pay-Off Table:

		Player II	
		black	red
Player I	black	3,3	0,5
	red	5,0	2,2

Class-room game



Remixing partners...

Pay-Off Table, 2nd Round:

		Player II	
		black	red
Player I	black	8,8	0,10
	red	10,0	2,2

Class-room game



Remixing partners...

Pay-Off Table, 3rd Round, now we play 3 games against the same partner

		Player II	
		black	red
Player I	black	8,8	0,10
	red	10,0	2,2

Class-room game



This game is actually called „prisoner's dilemma“

This game extends to a variety of situations:

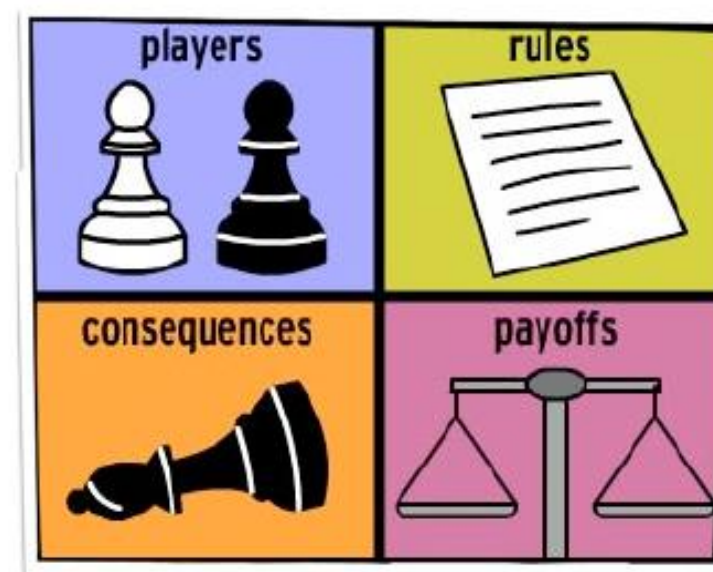
- ➡ working on a joint project,
- ➡ duopoly
- ➡ arms race
- ➡ use of a common property



Game Theory Premises



- ➡ Simultaneous actions
- ➡ No communication
- ➡ Outcome depends on combination of actions
- ➡ Utility (payoff) encapsulates everything about preferences over outcomes
- ➡ (Typically) no repeated games



Strategic Games: Formal Definition



A strategic game is the simplest game-theoretic model of agent interactions.

- ➡ There are $n > 1$ agents in the world.
- ➡ Each agent i can choose an action a_i from his own action set A_i . The vector (a_1, \dots, a_n) of individual actions is called a joint action or an action profile, and is denoted by a or (a_i) .
- ➡ The profile (a_{-i}, a_i) indicates that agent i plays a_i .
- ➡ The game is played on a fixed world state s . The state consists of the n agents, their action sets A_i , and their payoffs.

Strategic Games: Formal Definition



- ➡ Each agent i has his own payoff function $u_i(a)$ that measures the goodness of the joint action a for the agent i .
- ➡ The state is **fully observable** to all agents.
- ➡ **Common knowledge**: all agents know
 - ➡ each other
 - ➡ the action sets of each other
 - ➡ the payoff functions of each other.
- ➡ Each agent chooses a single action. All agents choose their actions simultaneously and independently of each other.

2 Player Games



In the special case of two agents, a strategic game can be graphically represented by a payoff matrix:

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

- ➔ Original version of **prisoner's dilemma**
- ➔ A prisoner's dilemma is any game with $b < d < a < c$



	C	D
C	a, a	b, c
D	c, b	d, d

Some more games



Stag-hunt game:

➡ Players: 2 fishermen

➡ Actions: fish, whale

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



Also known as **coordination game**

Some more games



Chicken game:

➡ Players: 2 „brave“ car drivers

➡ Actions: straight, swerve

	swerve	straight
swerve	0	+1
straight	-1	-10

	swerve	straight
swerve	0	-1
straight	+1	-10



Some more games...



Matching Pennies:

➡ Player 1: Match

➡ Player 2: Dismatch

Zero-sum game

➡ Strictly competitive

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



„Optimal“ Action Selection



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 the selected actions of other players)

Which solution should we take



There are different solution concepts:

- ➡ Dominance
- ➡ Pareto Optimality
- ➡ Nash Equilibria
- ➡ MaxMin and MinMax strategies

Dominance



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

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 !

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

Dominance



Definition:

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

Dominance



Definition:

In a strategic game player i 's action a_i'' **weakly dominates** another 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
- ➔ $u_i(a_i'', a_{-i}) > u_i(a_i', a_{-i})$ for **some** list a_{-i} of the other player's action

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

Dominance



No matter what the column player does...

➔ M weakly dominates T

➔ B weakly dominates M

➔ BUT: B strictly dominates T

Dominance is not a real solution concept but can be used to **eliminate actions**.

	L	R
T	1 0	0 0
M	2 0	0 0
B	2 1	1 1

Dominance



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

➡ Dominance?

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

➡ Dominance?

Dominance



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

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

ht}	swerve	straight
swerve	0, 0	+1, -1
straight	-1, +1	-10, -10

➔ Dominance?

Dominance



	whale	fish
whale	2 (green), 2 (red)	1, 0
fish	0, 1	1 (green), 1 (red)

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

	Swerve	Straight
Swerve	0, 0	0 (green), - (red)
Straight	- (green), +1 (red)	-10, -10

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

Identifying dominated strategies



However, actions can also be **dominated by mixed strategies**:

- ➡ M is not dominated by U or D
- ➡ But M is dominated by **a mixed strategy** that takes D and U with equal probability.

	L	C
U	3, 1	0, 1
M	1, 1	1, 1
D	0, 1	4, 1

Which solution should we take



There are different solution concepts:

- ➡ Dominance
- ➡ Pareto Optimality
- ➡ Nash Equilibria
- ➡ MaxMin and MinMax strategies

Pareto Optimality



“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. “

Pareto Optimal Solutions

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

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

Which solution should we take



There are different solution concepts:

- ➡ Dominance
- ➡ Pareto Optimality
- ➡ Nash Equilibria
- ➡ MaxMin and MinMax strategies

Best Response and Nash Equilibrium



If you knew what everyone else was going to do, it would be easy to pick your own action

➡ Actions of other agents: a_{-i}

Best-response for player i given a_{-i} :

$$a_i^* \in B_i(a_{-i}) \text{ iff } \forall a_i \in A_i, u_i(a_i^*, a_{-i}) \geq u_i(a_i, a_{-i})$$

➡ a_i^* optimizes the utility of agent i given a_{-i}

Nash Equilibrium (pure strategy)



Idea: look for stable action profiles!

$a = (a_1, \dots, a_n)$ is a (“pure strategy”) **Nash equilibrium** iff a_i is the best response for all agents i , i.e, $\forall i, a_i \in BR(a_{-i})$

➡ $u_i(a^*) \geq u_i(a_i, a_{-i}^*)$ for every action a_i of player i

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

Example: The prisoner's dilemma



Assume the profile :

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

(Quiet, Quiet) $u_1 \rightarrow 3$ $u_2 \rightarrow 3$

(**Fink**, Quiet) $u_1 \rightarrow \mathbf{7}$

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

Example: The prisoner's dilemma



Assume the profile :

	Quiet	Fink
Quiet	3	7
Fink	0	1

(Quiet, Quiet) $u_1 \rightarrow 3$ $u_2 \rightarrow 3$

(**Fink**, Quiet) $u_1 \rightarrow \mathbf{7}$

(Quiet, **Fink**) $u_2 \rightarrow \mathbf{7}$

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

Example: The prisoner's dilemma



The prisoner's dilemma

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

Any deviation of this NE results in a worse outcome

➔ This NE is a **strict Nash Equilibrium**

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

(**Quiet**, Fink) $u_1 \rightarrow 0$

(Fink, **Quiet**) $u_2 \rightarrow 0$

Example: The prisoner's dilemma



The prisoner's dilemma

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

Any deviation of this NE results in a worse outcome

➔ This NE is a **strict Nash Equilibrium**

Comparison to **Pareto Optimal Solutions**

➔ **Prisoner's dilemma paradoxon:** Nash equilibrium is the only solution that is not Pareto Optimal!

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

(**Quiet**, Fink) $u_1 \rightarrow 0$

(Fink, **Quiet**) $u_2 \rightarrow 0$

Examples: Chicken Game



Assume the profile :

	Swerve	Straight
Swerve	0	+1
Straight	-	-10

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

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

Examples: Chicken Game



Assume the profile :

	Swerve	Straight
Swerve	0	+1
Straight	-	-10

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

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

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

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

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

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

Both profiles are
unstable!

Examples: Chicken Game



Assume the profile :

	Swerve	Straight
Swerve	0	+1
Straight	-	-10

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

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

Examples: Chicken Game



Assume the profile :

	Swerve	Straight
Swerve	0	+1
Straight	-1	-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**) $u_2 \rightarrow 0$

Both profiles are
stable!

Examples: Chicken Game



Both profiles are
strict NE!

	Swerve	Straight
Swerve	0	+1
Straight	-1	-10

Assume the profile :

(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: Stag hunt



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: Stag hunt



Both profiles are strict NE!

Assume the profile :

	whale	fish
whale	2	1
fish	1	1

(whale, whale) $u_1 \rightarrow 2 \quad u_2 \rightarrow 2$

(fish, whale) $u_1 \rightarrow 1$

(whale, fish) $u_2 \rightarrow 1$

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

(whale, fish) $u_1 \rightarrow 0$

(fish, whale) $u_2 \rightarrow 0$

Examples: Matching Pennies



Best response analysis

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

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

Examples: Matching Pennies



Best response analysis

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

Nash Equilibrium?

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

Mixed Strategies



It would be a pretty bad idea to play any deterministic strategy in matching pennies

Idea: confuse the opponent by playing **randomly**

- ➔ Define a strategy α_i for agent i as any probability distribution over the actions A_i .
- ➔ **pure strategy** a : only one action is played with positive probability
- ➔ **mixed strategy** α : more than one action is played with positive probability
 - ➔ $\alpha(a_k) \dots$ probability of choosing action a_k
 - ➔ These actions are called the support of the mixed strategy
 - ➔ Aka. Lottery

von Neumann/Morgenstern Preferences



Preferences regarding **distributions/lotteries** α

➡ Given utility function u compute **expected utility**

$$U(\alpha) = \sum_a \alpha(a)u(a)$$

Mixed Strategy Nash Equilibrium



Assume that (α_i', α_{-i}) is the **mixed** strategy profile in which every player j **except** i chooses its mixed strategy α_j as specified by α , whereas player i deviates to α_i'

Definition :

The mixed strategy profile α^* in a strategic game is a **mixed strategy Nash Equilibrium** if for every player i and for every mixed strategy α_i of player i , the expected payoff to i in α^* is at least as large as the expected payoff to i in $(\alpha_i, \alpha_{-i}^*)$ according to a payoff function that represents player i 's preferences over lotteries.



Mixed Strategy Nash Equilibrium



Definition :

Equivalently, for every player i , $U_i(\alpha^*) \geq U_i(\alpha_i, \alpha_{-i}^*)$ for every mixed strategy α_i of player i , where $U_i(\alpha)$ is the player's i expected payoff to the mixed strategy profile α

Every finite game has at least one (mixed) Nash equilibrium! [Nash, 1950]



Best-response



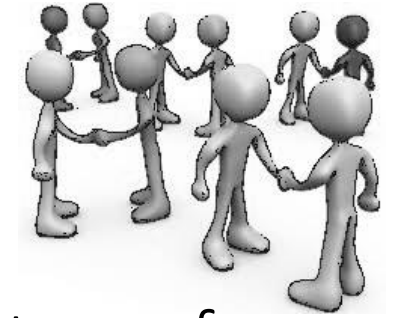
To find the mixed strategy NE, we can again make use of the notion of a Best-response.

➡ The mixed strategy profile α^* in a strategic game is a mixed strategy Nash Equilibrium if and only if α_i^* is in $B_i(\alpha_{-i}^*)$ for every player i

Definition :

➡ $B_i(\alpha_{-i})$ is the set of all player i 's best mixed strategies when the list of the other players' mixed strategy is α_{-i}

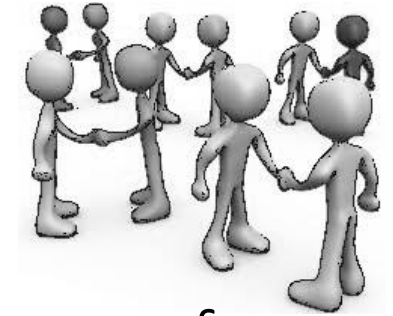
Two Player Games



What is the set of best responses of player 1 to a mixed strategy of player 2?

	L (q)	R ($1-q$)
T (p)	pq	$p(1-q)$
B ($1-p$)	$(1-p)q$	$(1-p)(1-q)$

Two Player Games



What is the set of best responses of player 1 to a mixed strategy of player 2?

	L (q)	R (1-q)
T (p)	pq	$p(1-q)$
B (1-p)	$(1-p)q$	$(1-p)(1-q)$

$$U_1(\alpha) = p(qu_1(T, L) + (1 - q)u_1(T, R)) + (1 - p)(qu_1(B, L) + (1 - q)u_1(B, R))$$

$$U_1(\alpha) = pU_1(T, \alpha_{-1}) + (1 - p)U_1(B, \alpha_{-1})$$

➡ the expected payoff of player 1, given player 2's mixed strategy is a **linear function of p**

Two Player Games



The linearity implies 3 possible outcomes :

1. player 1's unique best response is the pure strategy T
➡ (when $U_1(T, \alpha_{-1}) > U_1(B, \alpha_{-1})$)
2. player 1's unique best response is the pure strategy B
➡ (when $U_1(T, \alpha_{-1}) < U_1(B, \alpha_{-1})$)
3. all player 1's mixed strategies are all best responses
➡ (when $U_1(T, \alpha_{-1}) = U_1(B, \alpha_{-1})$)

Matching Pennies



player 1's expected payoff for the pure strategy *Head* (p) is

player 1's expected payoff for the pure strategy *Tail* ($1-p$) is

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

Matching Pennies



player 1's expected payoff for the pure strategy *Head* (p) is

$$q \cdot 1 + (1 - q) \cdot (-1) = 2q - 1$$

player 1's expected payoff for the pure strategy *Tail* ($1-p$) is

$$q \cdot (-1) + (1 - q) \cdot 1 = 1 - 2q$$

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

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

Matching Pennies



player 1's expected payoff for the pure strategy *Head* (p) is

$$q \cdot 1 + (1 - q) \cdot (-1) = 2q - 1$$

player 1's expected payoff for the pure strategy *Tail* ($1-p$) is

$$q \cdot (-1) + (1 - q) \cdot 1 = 1 - 2q$$

1. $2q-1 < 1-2q$ when $q < 1/2$ for any value of $p > 0.0$

➡ Thus best response set is {Tail} or $p=0$

2. $2q-1 > 1-2q$ when $q > 1/2$ for any value of $(1-p) > 0.0$

➡ Thus best response set is {Head} or $p=1$

3. $2q-1 = 1-2q$ when $q = 1/2$ for any mixed strategy

➡ Thus best response set is the **set of all mixed strategies**

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

Matching Pennies



player 2's expected payoff for the pure strategy H

$$p \cdot 1 + (1 - p) \cdot (-1) = 2p - 1$$

player 2's expected payoff for the pure strategy

$$p \cdot (-1) + (1 - p) \cdot 1 = 1 - 2p$$

1. $2p - 1 < 1 - 2p$ when $p < 1/2$ for any value of $q > 0.0$

➡ Thus best response set is {Tail} or $q = 0$

2. $2p - 1 > 1 - 2p$ when $p > 1/2$ for any value of $(1 - q) > 0.0$

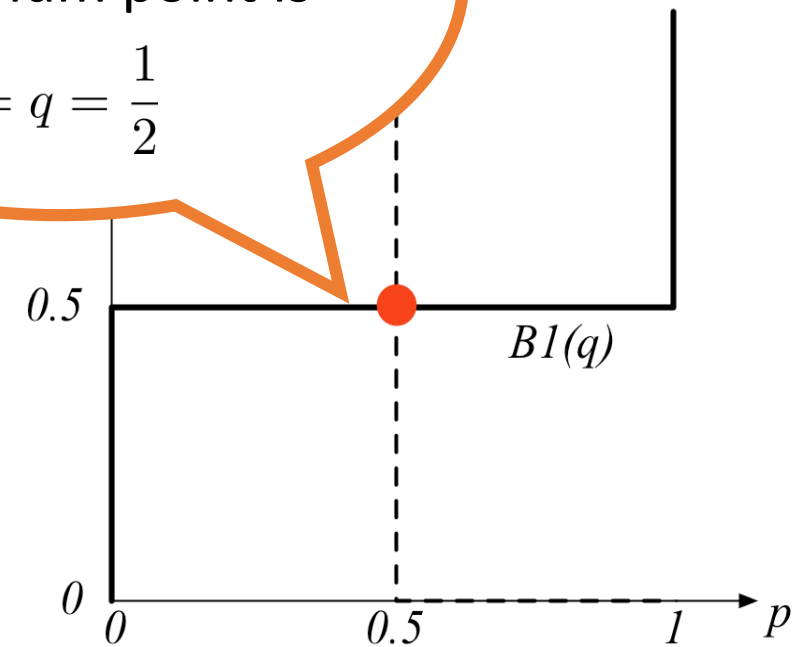
➡ Thus best response set is {Head} or $q = 1$

3. $2p - 1 = 1 - 2p$ when $p = 1/2$ for any mixed strategy

➡ Thus best response set is the **set of all mixed strategies**

The only stable
equilibrium point is

$$p = q = \frac{1}{2}$$



Interpreting mixed strategies



What does it mean to play a **mixed strategy**?

Different interpretations:

- ➡ Randomize to confuse your opponent
- ➡ Players randomize when they are uncertain about the other's action
- ➡ Mixed strategies are a concise description of what might happen in repeated play: count of pure strategies in the limit

Which solution should we take



There are different solution concepts:

- ➡ Dominance
- ➡ Pareto Optimality
- ➡ Nash Equilibria
- ➡ MaxMin and MinMax strategies

MaxMin Strategies



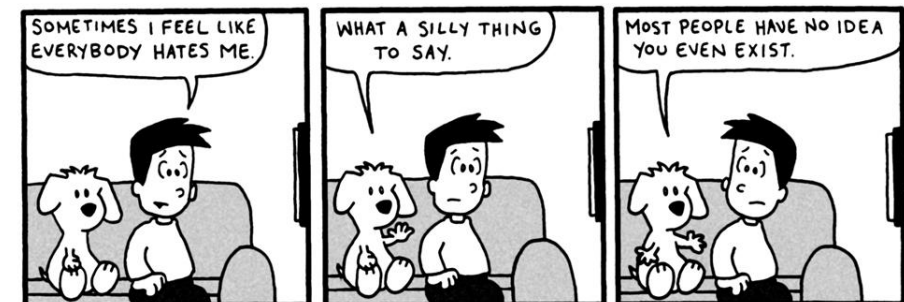
Player i 's **maxmin strategy** is a strategy that maximizes i 's worst-case payoff, where all the other players $-i$ play the strategies which cause the greatest harm to i .

Why would player i want to play a maxmin strategy?

- ➔ a conservative agent maximizing worst-case payoff
- ➔ a paranoid agent who believes everyone hates him

Definition (MaxMin):

- ➔ The maxmin strategy for player i is $\arg \max_{\alpha_i} \min_{\alpha_{-i}} u_i(\alpha_1, \alpha_2)$
and the maxmin value for player i is $\max_{\alpha_i} \min_{\alpha_{-i}} u_i(\alpha_1, \alpha_2)$



MinMax Strategies



Player i 's **minmax strategy** against player $-i$ in a 2-player game is a strategy that minimizes $-i$'s best-case payoff

Why would player i want to play a minmax strategy?

➡ to punish the other agent as much as possible (he really hates him)

Definition (Minmax, 2-player)

➡ In a two-player game, the minmax strategy for player i against player $-i$ is $\arg \min_{\alpha_i} \max_{\alpha_{-i}} u_{-i}(\alpha_i, \alpha_{-i})$ and player $-i$'s minmax value is $\min_{\alpha_i} \max_{\alpha_{-i}} u_{-i}(\alpha_i, \alpha_{-i})$



MaxMin and MinMax in Zero Sum Games

Theorem (Minimax theorem (von Neumann, 1928))

In any finite, two-player, **zero-sum game**, in **any Nash equilibrium** each player **receives a payoff that is equal** to both his **maxmin value** and his **minmax value**.

- ➡ Each player's maxmin value is equal to his minmax value. By convention, the maxmin value for player 1 is called the value of the game.
- ➡ For both players, the set of maxmin strategies coincides with the set of minmax strategies.
- ➡ Any maxmin strategy profile (or, equivalently, minmax strategy profile) is a Nash equilibrium. Furthermore, these are all the Nash equilibria. Consequently, all Nash equilibria have the same payoff vector.

Summary



What we learned today:

- ➡ Definition of a game in normal form
- ➡ Rational Agents
- ➡ Solution Concepts: Pareto Optimality, Nash, ...
- ➡ Best Responses and Nash Equilibrium
- ➡ Mixed and Pure Nash Strategies

Correlated Equilibrium



Consider the following “traffic” game:

➡ What are the Nash equilibria?

What is the natural solution here?

	<i>go</i>	<i>wait</i>
<i>go</i>	$-100, -100$	$10, 0$
<i>B</i>	$0, 10$	$-10, -10$

Correlated Equilibrium

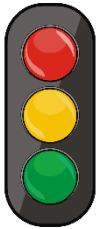


Consider the following “traffic” game:

➔ What are the Nash equilibria?

What is the natural solution here?

	<i>go</i>	<i>wait</i>
<i>go</i>	-100, -100	10, 0
<i>B</i>	0, 10	-10, -10



➔ **Traffic lights**: a fair randomizing device that tells one of the agents to go and the other to wait.

Benefits:

➔ the negative payoff outcomes are completely avoided

➔ **fairness** is achieved

➔ the **sum of social welfare** might exceed that of any Nash equilibrium

Correlated Equilibrium



- ➡ Our example presumed that everyone perfectly observes the random event; not required.
- ➡ More generally, some **random variable v** with a commonly known distribution, and a **private signal** to each player about the outcome.
 - ➡ v can be used for coordination
 - ➡ signal doesn't determine the outcome or others' signals;
 - ➡ however, correlated
- ➡ For every Nash equilibrium there exists a corresponding correlated equilibrium.
- ➡ Not every correlated equilibrium is equivalent to a Nash equilibrium
 - ➡ Weaker notion than Nash

Correlated Equilibrium



We can view the problem now as finding a set of correlated strategies

➡ The strategies of **all agents** can be expressed by a **joint distribution $p(a)$**

Some convenient notation:

$$\text{Expected Utility for action } a_i^j : U_i(a_i^j, p_{-i}) = \sum_{a_{-i} \in A_{-i}} p(a_{-i} | a_i^j) u_i(a_i^j, a_{-i})$$

$$\begin{aligned} \text{Expected Utility for agent } i : U_i(p) &= \sum_{a_i^j} p(a_i^j) U_i(a_i^j, p_{-i}) \\ &= \sum_{a_i^j} \sum_{a_{-i} \in A_{-i}} p(a_i^j) p(a_{-i} | a_i^j) u_i(a_i^j, a_{-i}) \\ &= \sum_{a \in A} p(a) u_i(a) \end{aligned}$$

Rationalizability



Rather than ask what is irrational, ask what is a best response to **some** beliefs about the opponent

- ➡ assumes opponent is rational
- ➡ assumes opponent knows that you and the others are rational

Rationalizable Strategy: Can we find a belief under which the strategy is rational?

Examples:

- ➡ is heads rational in matching pennies?
- ➡ is cooperate rational in prisoner's dilemma?

Will there always exist a rationalizable strategy?

- ➡ Yes, equilibrium strategies are always rationalizable.

Correlated Equilibrium



Definition (**Correlated Equilibrium**)

$$U_i(p) \geq U_i(a'_i, p_{-i})$$

$$\forall i \in N, a'_i \in A_i$$

$$p(a) \geq 0$$

$$\forall a \in A$$

$$\sum_{a \in A} p(a) = 1$$

The expected utility for player i given the joint strategy profile p needs to be at least as high as the utility the player could get with another action a'_i (given profile p_{-i} of the other players)