

Part II: Explaining departures from Nash Equilibrium

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The motivating example – the traveler's dilemma game



An airline loses 2 identical suitcases belonging to 2 different travelers.

The airline manager separates the travelers and asks them to write down the value of their case between \$2 and \$100.

If both write down the same amount, each gets this amount.

If one amount is smaller, then each of them will get this amount with a bonus/malus:

- ► The traveler who chose the smaller amount will get \$2 extra
- ► The other traveler will have to pay \$2 penalty.



What strategy should both travelers follow to decide the value they should write down?



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- ► Intuitively: close to \$100
- ► Nash Equilibrium strategy: \$2

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The game presented above was first proposed by Basu (1994) and is called the *traveler's dilemma*.



Why is Nash Equilibrium strategy intuitive in some cases and not in other?

How can we explain departures from the game theory predictions?

When people do not play according to the game theory predictions, are they rational or irrational?



Jacob Goeree and Charles Holt Ten little treasures of game theory and ten intuitive contradictions, AER, 2001

- Lab data for games played once.
- ► For each game two payoff structures:
 - ► the treasure in which the observed behavior agrees with the NE prediction.
 - another one which produces a striking inconsistency between the two.

We shall focus only on **static games of complete information**.



- 1. Some theory
- 2. Treasures of game theory
- 3. Hypothesis
- 4. The Game of Rows mobile app



Consider a game Γ in strategic form:

- 1. The set of players ${\cal N}$
- 2. For each player $i \in N$ a set of actions A_i

3. For each player $i \in N$ a payoff function $u_i : A \to \mathbb{R}$ Notation:

- ► A set of all players profiles of actions is denoted by $A \equiv \times_{i \in N} A_i$ with a typical element denoted by *a*.
- A set of all players but player *i* profiles of actions is denoted by A_{-i} ≡ ×_{j∈N\i} with a typical element denoted by a_{-i}.



Definition Nash equilibrium in pure strategies is a profile of actions $a^* \in A$ such that:

$$a_i^* \in \arg \max_{a_i \in A_i} u_i(a_i, a_{-i}^*), \quad \forall a_{-i} \in A_{-i}, \ \forall i \in \mathbb{N}$$

$$(1)$$



Definition

Given any strategic form game Γ , a randomized strategy for any player *i* is a probability distribution over A_i . Let $\Delta(A_i)$ denote the set of all possible randomized strategies for player *i*. The set of all randomized strategy profiles will be denoted by $\Delta(A) = \times_{i \in N} \Delta(A_i)$. It must be that:

$$\sum_{a_i \in A_i} \sigma_i(a_i) = 1, \;\; orall i \in N$$

We will write $\sigma \equiv (\sigma_i)_{i \in N}$, where $\sigma_i \equiv (\sigma_i(a_i))_{a_i \in A_i}$, for each *i*. For any randomized strategy profile σ , let $u_i(\sigma)$ denote the expected payoff that player *i* would get when the players independently choose their pure strategies according to σ :

$$u_i(\sigma) = \sum_{a \in A} \left(\prod_{j \in N} \sigma_j(a_j) \right) u_i(a), \quad \forall i \in N$$
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Games & Decisions

Mixed strategy Nash Equilibrium

For any $\sigma'_i \in \Delta(A_i)$, we denote (σ'_i, σ_{-i}) the randomized strategy profile in which the i-th component is σ'_i and all other components are as in σ . Thus:

$$u_i(\sigma'_i,\sigma_{-i}) = \sum_{a \in A} \left(\prod_{j \in N \setminus i} \sigma_j(a_j) \right) \sigma'_i(a_i) u_i(a)$$

Definition

A randomized strategy profile $\sigma^* \in \Delta(A)$ is a Nash equilibrium of Γ if the following holds:

$$\sigma_i^* \in \arg \max_{\sigma_i \in \Delta(A_i)} u_i(\sigma_i, \sigma_{-i}^*), \quad \forall i \in N$$
(2)



Definition

There is **common knowledge** of *p* in a group of agents *G* when all the agents in *G* know *p*, they all know that they know *p*, they all know that they all know that they know *p*, and so on ad infinitum.

The crucial **assumption** underlying the Nash Equilibrium is that there is common knowledge among players in the game about:

- the game and all its components,
- rationality of all players.

We shall question this assumption.



Definition

The **rationalizable set of actions** (Bernheim, 1984 and Pearce, 1984) can be computed as follows:

- 1. Start with the full action set for each player.
- 2. Remove all actions which are never a best reply to any belief about the opponents' actions
 - ► No rational player will choose such actions.
- 3. Remove all actions which are never a best reply to any belief about the opponents' remaining actions
 - Each player knows that the other players are rational.
- 4. Continue the process until no further actions are eliminated.
- 5. In a game with finitely many actions, this process always terminates and leaves a non-empty set of actions for each player.



Players respond optimally to some belief about their opponents' actions, but Nash equilibrium requires that these beliefs be correct while rationalizability does not.

The general idea is to provide the weakest constraints on players while still requiring that players are rational and this rationality is common knowledge among the players.





Let p (q) denote the probability of Robert (Cindy) choosing "high".



- Robert's best response function
- Expected payoff from choosing:
 - high: 2q 3(1 q) = -3 + 5q
 - ▶ low: 1
- ► If -3 + 5q > 1 or q > 4/5, Robert should choose high, i.e. p = 1.
- ▶ If -3 + 5q < 1 or q < 4/5, he should choose low, i.e. p = 0.
- ▶ If -3 + 5q = 1 or q = 4/5, then he is indifferent $p \in [0, 1]$.

Robert's best response correspondence:

$$BR_R(q) = \begin{cases} \{1\}, & \text{if } q > 4/5\\ [0,1], & \text{if } q = 4/5\\ \{0\}, & \text{if } q < 4/5 \end{cases}$$



- Cindy's best response function
- Expected payoff from choosing:
 - high: 2p 3(1 p)
 - ▶ low: 1
- ► If 2p 3(1 p) > 1 or p > 4/5, Cindy should choose high, i.e. q = 1
- ► If 2p 3(1 p) < 1 or p < 4/5, she should choose low, i.e. q = 0
- ▶ If 2p 3(1 p) = 1 or p = 4/5, then she is indifferent, i.e. $q \in [0, 1]$

Cindy's best response correspondence:

$$BR_C(p) = \begin{cases} \{1\}, & \text{if } p > 4/5\\ [0,1], & \text{if } p = 4/5\\ \{0\}, & \text{if } p < 4/5 \end{cases}$$

Note that in calculating mixed strategy for one player, one takes into account only payoffs of his/her opponent, not his/her own.



- simple coordination game,
- ► the traveller's dilemma,
- a matching pennies game,
- ▶ a coordination game with a secure outside option,
- ▶ a minimum effort coordination game,
- ▶ the Kreps game



Simple coordination game

Consider two games of a "choose-an-effort" variety.

	Game A				Game	e B	
	L	R			L	R	
Т	<u>2, 2</u>	-3, 1		Т	<u>5</u> , <u>5</u>	0,1	
В	1, -3	<u>1</u> , <u>1</u>		В	1,0	<u>1</u> , <u>1</u>	

There are two Nash equilibria in pure strategies (T, L), (B, R) in each of the games and the mixed strategy equilibrium:

- (.8T + .2B, .8L + .2R) in game A
- (.2T + .8B, .2L + .8R) in game B.

Assuming people play the mixed strategy, we should most often (64% of the time) observe (T, L) in game A, and (B, R) in game B.

Experimental evidence shows exactly the opposite: (B, R) is most frequent in game A and (T, L) in game B.

ames & Decisions

Let's consider the travellers' dilemma with two players and action space $A_i = \{180, 181, ..., 300\}$ for each $i \in N = \{1, 2\}$. Payoffs are the following:

$$u_{i}(a'_{i}, a'_{j}) = \min(a'_{i}, a'_{j}) + P(a'_{i}, a'_{j}), \quad i \neq j, \quad i, j \in N,$$

where $P(a'_{i}, a'_{j}) = \begin{cases} P & \text{if } a'_{i} < a'_{j} \\ 0 & \text{if } a'_{i} = a'_{j} \\ -P & \text{if } a'_{i} > a'_{j} \end{cases}$, where $P \in \mathbb{Z}^{+}$



Analysis

When P = 0 and for P = 1, any profile of strategies for which $a_i = a_j$, $i \neq j$ is a pure strategy Nash equilibrium.

When P > 1, note that given any strategy of the opponent it is optimal to underbid her by \$1. So bidding \$300 is never a best response to any belief.

Since players are rational and know that their opponent is rational, they can delete this action from their strategy space.

But then \$299 is never a best response to any belief. So it can be deleted as well.

Continuing this way, the only strategy pair, that survives this iterated procedure is (180, 180), i.e. the unique rationalizable strategy profile.



How about experimental evidence, *R* denotes the bonus/malus



FIGURE 1. CLAIM FREQUENCIES IN A TRAVELER'S DILEMMA FOR R = 180 (LIGHT BARS) AND R = 5 (DARK BARS)



The matching pennies games (in brackets: mixed NE in BLACK, experimental evidence in RED)





A coordination game with a secure outside option (in brackets: mixed NE in BLACK, x = 0 treatment in RED, x = 400 treatment in BLUE)

The following is the so called extended coordination game:

 Payoff table

 L (.67)
 M (.33)/(.84)/(.76)
 R

 T
 90,90
 0,0
 x,40

 B (.33)/ (.96)/(.64)
 0,0
 180, 180
 0,40

Since strategy *R* is dominated by a 50-50 combination of *L* and *M*, so it cannot be part of any Nash equilibrium. It is easy to see that the set of Nash equilibria of this game is the same irrespective of the value x



Consider the game of choosing an effort level, where $N = \{1, 2\}, A_i = \{110, 111, ..., 170\}, i \in N$. The payoffs for a given profile of actions $(a'_i, a'_i) \in A$ are defined as follows:

$$u_i(a'_i,a'_j) = \min(a'_i,a'_j) - ca'_i$$

where $c \in (0, 1)$. The set of Nash equilibria consists of all the pairs (a, a), where $a \in A_i$.



Experimental evidence



FIGURE 2. EFFORT CHOICE FREQUENCIES FOR A MINIMUM-EFFORT COORDINATION GAME WITH HIGH EFFORT COST (LIGHT BARS) AND LOW EFFORT COST (DARK BARS)



The following is the so called Kreps game:

	E	ayoff table?		
	L (.13)/(.26)	M (.08)	NN (.68)	R (.87)/(.00)
T (.49) /(.68)	<u>200, 50</u>	0,45	10,30	20, -250
B (.51)/(.32)	0, -250	<u>10</u> , –100	<u>30</u> , 30	<u>50, 40</u>



Common knowledge of rationality is a very strong assumption

It is violated if people:

- make mistakes
- do not pay attention
- are not sure about their opponent, his/her motivation, state of mind, etc.

Sometimes playing the NE strategy is risky, i.e. in case your opponent does not conform, you may loose a lot.

Maybe we should drop the assumption of common knowledge of rationality.



Example: Choosing among multiple Nash Equilibria

	Game	А		Game	e B	
	L	R		L	R	
Т	<u>2, 2</u>	-3,1	 Τ	<u>5,5</u>	0,1	_
В	1, -3	<u>1, 1</u>	В	1,0	<u>1, 1</u>	

Observe that the mixed strategy is calculated based on your opponent's payoff only.

Note that if we drop the assumption of common knowledge of rationality, playing T (or L) in game A is **more risky** in game A than in game B

► in A you risk getting -3 instead of 1 and in B getting 0 instead of 1

We can capture this effect by treating the opponent as unpredictable nature.



Gai	me A			Gar	ne B	
	s_1	<i>s</i> ₂			<i>s</i> ₁	<i>s</i> ₂
T or L	2	-3	T or	: L	5	0
B or R	1	1	B or	R	1	1

where s_1 , s_2 are two states of the world.

Observe that the strategies T and L in the game A are more uncertain (giving the payoff of either 2 or -3) than the strategies B and R (giving the certain payoff of 1). Similarly, in the game B the strategies B and R are certain (giving the payoff of 1), whereas the strategies T and L are uncertain (giving the payoff of either 5 or 0).



Uncertainty is modeled by having preferences defined over acts $f : S \rightarrow X$, where *S* is an exhaustive and exclusive set of states of nature and *X* is the set of consequences.

Frank Knight (1921) distinguished between:

- ► Uncertainty (no quantifiable information is available)
- Risk (exact probabilities are given)
- Mark Machina prefers to use the terms:
 - Objective uncertainty
 - Subjective uncertainty

Beliefs (probabilities) are very subjective. Complete ignorance does not require probabilities. It is a good benchmark.



Rules for making decisions under complete ignorance

- 1. Maxmin rule (Abraham Wald)
- 2. Maxmax rule
- 3. Minmax regret rule (Leonard Savage)
- 4. Principle of insufficient reason (Jacob Bernoulli)
- 5. Hurwicz criterion



Consider the following choice problem:

	Crisis	No crisis
Safe	0	2
Medium	-3	6
Risky-Hedge	10	-6



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	Crisis	No crisis
Safe	0	2
Medium	-3	6
Risky-Hedge	10	-6

The investor is ignorant and he does not know the probability of Crisis/No Crisis.



The investor may choose a strategy that maximizes the minimal payoffs across the states



The investor may choose a strategy that maximizes the minimal payoffs across the states

	C	NC	MaxMin
S	0	2	0
М	-3	6	-3
R-H	10	-6	-6



The investor may choose a strategy that maximizes the minimal payoffs across the states

	С	NC	MaxMin
S	0	2	0
М	-3	6	-3
R-H	10	-6	-6

Drawback: pessimism



Alternatively, the investor may choose a strategy that maximizes the maximal payoffs across the states



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	C	NC	MaxiMax
S	0	2	2
Μ	-3	6	6
R-H	10	-6	10



Alternatively, the investor may choose a strategy that maximizes the maximal payoffs across the states

	C	NC	MaxiMax
S	0	2	2
М	-3	6	6
R-H	10	-6	10

Drawback: optimism



The investor may choose a strategy that maximizes a linear combination of Maximin and Maximax



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	С	NC	Hurwicz
S	0	2	$\alpha \times 0 + (1 - \alpha) \times 2$
М	-3	6	$\alpha \times (-3) + (1 - \alpha) \times 6$
R-H	10	-6	$\alpha \times (-6) + (1 - \alpha) \times 10$



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	С	NC	Hurwicz
S	0	2	$\alpha \times 0 + (1 - \alpha) \times 2$
М	-3	6	$\alpha \times (-3) + (1 - \alpha) \times 6$
R-H	10	-6	$\alpha \times (-6) + (1 - \alpha) \times 10$

Drawbacks: a) the pessimism coefficient is a free parameter, b) mixing of two optimal actions may not be optimal



The investor may assume that each state is equally probable and choose a strategy that maximize expected value



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	C	NC	Laplace
S	0	2	$\frac{1}{2} \times 0 + \frac{1}{2} \times 2 = 1$
Μ	-3	6	$\frac{1}{2} \times (-3) + \frac{1}{2} \times 6 = 1.5$
R-H	10	-6	$\frac{1}{2} \times (-6) + \frac{1}{2} \times 10 = 2$



The investor may assume that each state is equally probable and choose a strategy that maximize expected value

	C	NC	Laplace
S	0	2	$\frac{1}{2} \times 0 + \frac{1}{2} \times 2 = 1$
Μ	-3	6	$\frac{1}{2} \times (-3) + \frac{1}{2} \times 6 = 1.5$
R-H	10	-6	$\frac{1}{2} \times (-6) + \frac{1}{2} \times 10 = 2$

Drawbacks: a) Subdividing states may change the optimal action, b) seems arbitrary: does not reflect lack of knowledge



The investor may choose a strategy that minimizes a maximal regret across states



The investor may choose a strategy that minimizes a maximal regret across states

	Payoff table		Regre	et table	
	С	NC	С	NC	Minimax regret
S	0	2	10	4	10
М	-3	6	13	0	13
R-H	10	-6	0	12	12

Drawback: violates independence of irrelevant alternatives



Each of these rules have their drawbacks.

However, note that in the context of a game, violation of IIA in the case if minimax regret is not an issue.

Hence we postulate using this rule.



Conjecture: People depart from the NE strategy if it is very risky to play it.

There is a trade-off between:

- What is achievable using strategic interaction (Nash equilibria)
- ► And what is risky in case others do not conform to the rationality principle (minimax regret strategies).

To predict what will actually be played in a given game one should weight the benefits of the NE stability and minimax regret safety.



Regret

Definition **Regret** from chosing $a'_i \in A_i$ given a profile of other players' actions $a'_{-i} \in A_{-i}$ is defined as:

$$R_{i}(a'_{i}, a'_{-i}) = \max_{a_{i} \in \mathcal{A}_{i}} [u_{i}(a_{i}, a'_{-i})] - u_{i}(a'_{i}, a'_{-i})$$
(3)

Maximum regret from choosing $a'_i \in A_i$ is then given by:

$$\max_{a_{-i}\in A_{-i}} R_i(a'_i, a_{-i}) \tag{4}$$

Minimax regret strategy for a player $i \in N$ is an action $a_i^* \in A_i$ such that:

$$a_i^* \in \arg\min_{a_i \in A_i} \left[\max_{a_{-i} \in A_{-i}} R_i(a_i, a_{-i}) \right]$$
(5)



Choosing among multiple Nash Equilibria - regret

Payoff table				Regret table					
	L	F	7			L	F	2	max
Τ	<u>2, 2</u>	3	8,1	7	- (), ()	4,1	L	4
В	1, -3	3 <u>1</u> ,	<u>1</u>	E	3 1	,4	0,0)	1
				max	C	4	1	L	
Payoff table				Regret table					
	L	R				L	R	ľ	max
7	<u>5</u> ,	<u>5</u> 0,1	1	Т	0,	0	1,4		1
E	3 1,	0 <u>1</u> , <u>1</u>	1	В	4,	1	0,0		4
			1	max		1	4		

Max regret shows that the safe strategy is (B, R) in A and (T, L) in B.



	Payoff table			Regret table					
		L	R		L	R	max		
Camo A	Τ	<u>80</u> , 40	40, <u>80</u>	Т	0,40	40,0	40		
Game A	В	40, <u>80</u>	<u>80</u> , 40	В	40,0	0,40	40		
				max	40	40			
		Payoff ta	able		Regret table				
		L	R			L P	R max		
Gamo B	Τ	<u>320</u> , 40	40, <u>80</u>	T	0,4	0 40,0	0 40		
Game D	В	40, <u>80</u>	<u>80</u> ,40	В	280,	0 0,40	280		
				max	4	0 40	C		
	Payoff table				Regre	t table			
		L	R		L	R	max		
Game C	Т	<u>44</u> , 40	40, <u>80</u>	Т	0,40	40,0	40		
	В	40, <u>80</u>	<u>80</u> , 40	В	4,0	0,40	4		
				max	40	40			
						Gai	mes & Decisions		

The traveler's dilemma

Regret of player *i* for a given strategy profile $(a'_i, a'_j) \in A$ is equal to:

$$R_i(a'_i, a'_2) = \max_{a_i \in A_i} \left(\min(a_i, a'_j) + P(a_i, a'_j) \right) - \left(\min(a'_i, a'_j) + P(a'_i, a'_j) \right)$$

To calculate it we need to consider two cases:

$$a'_{j} = 180 \Rightarrow R_{i}(a'_{i}, 180) = \begin{cases} 180 - 180 = 0 & \text{if } a'_{i} = 180 \\ 180 - 180 + P = P & \text{if } a'_{i} > 180 \end{cases}$$

$$a'_{j} > 180 \Rightarrow R_{i}(a'_{i}, a'_{j}) = a'_{j} - 1 + P - (\min(a'_{i}, a'_{j}) + P(a'_{i}, a'_{j}))$$

We can summarize it in the form of the table:



The traveler's dilemma

So the maximum regret of player *i* for a given strategy $a'_i \in A_i$ is equal to:

$$\max \operatorname{regret}_{i}(a'_{i}) = \begin{cases} 119 & \text{when } a'_{i} = 180 \\ \max(P, 118) & \text{when } a'_{i} = 181 \\ \max(2P - 1, 0) & \text{when } a'_{i} \ge 182 \end{cases}$$

Now we can solve for the minimax strategies in this game which is summarized in the following table:

Values of P	Minmax regret strat.	Minmax value		
P = 0	{300}	0		
$P \in \{1,, 59\}$	{300 - 2 <i>P</i> ,, 299, 300}	2P – 1		
$P \in \{60, 61,, 118\}$	$\{181\}$	118		
P = 119	$\{180, 181\}$	119		
$P \in \{120, 121,\}$	{180}	119		



For example, for P = 0, the only minimax regret strategy is to bid 300. For P = 5, any bid in the set {290, 291, ..., 300} is a minimax regret strategy. For P = 180 the only minimax regret strategy is to bid 180.



Choose an effort game

The regret of a given profile of actions $(a'_i, a'_i) \in A$ is given by:

$$\begin{aligned} R_i(a'_i, a'_j) &= \max_{a_i \in A_i} \left(\min(a_i, a'_j) - ca_i \right) - \left(\min(a'_i, a'_j) - ca'_i \right) \\ &= a'_j - ca'_j - \min(a'_i, a'_j) + ca'_i \end{aligned}$$

Maximum regret for a strategy a'_i is given by:

$$\begin{aligned} \max \operatorname{regret}_{i}(a'_{i}) &= \max_{a_{j} \in A_{j}} \left(a_{j} - ca_{j} - \min(a'_{i}, a_{j}) + ca'_{i} \right) \\ &= \max \left(170(1 - c) - a'_{i}, -110c \right) + ca'_{i} \end{aligned}$$

Minimax regret is given by:

$$\min_{a_i \in A_i} \left[\max \left(170(1-c) - a_i, -110c \right) + ca_i \right]$$

Let's define $a_i^* \in A_i$ as the value of player *i* strategy for which the two elements of the above max function are equal:

$$170(1-c) - a_i^* = -110c \implies a_i^* = 170 - c(170 - 110)$$



In order to find the minimax regret, it is clear that we need to consider three cases:

$$a'_{i} = 110 \implies \max \operatorname{regret}_{i}(110) = (1 - c)(170 - 110)$$

 $a'_{i} = a^{*}_{i} \implies \max \operatorname{regret}_{i}(a^{*}_{i}) = c(1 - c)(170 - 110)$
 $a'_{i} = 170 \implies \max \operatorname{regret}_{i}(170) = c(170 - 110)$

Since $c \in (0, 1)$ it must be that the minimax regret strategy is $a'_i = a^*_i$ and the minimax regret value is max regret_i $(a^*_i) = c(1 - c)(170 - 110)$. For example if c = 0.1, the minimax regret strategy is equal to 164 and if c = 0.9, the minimax regret strategy is equal to 116, which is in accordance with the experimental evidence.



- 1. Write a program in Microsoft Excel that calculates minmax regret strategies in the traveller's dilemma game depending on the value of a bonus/malus.
- 2. Write a program in Microsoft Excel that calculates minmax regret strategies in choose an effort game depending on the cost of effort value.



A coordination game with a secure outside option



where $x \in \mathbb{R}$. So

- if x < 180, then minimax regret strategies are (B, M)
- if x > 180, then minimax regret strategies are (T, M)





The only Nash equilibria in pure strategies of this game are (T, L) and (B, R). On the other hand, the only minimax regret pure strategy profile is (T, NN).



We have developed an application to test departures from Nash-Equilibria.

You may find info here: http://www.mlewandowski.waw.pl/game-of-rows/

And also download the app here: https://play.google.com/store/apps/details?id=pl.sgh. gametheory



Team members (apart from me): Michał Jakubczyk and Bogumił Kamiński







