

Strategic games and equilibrium concepts

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 - If both remain silent, they will go to prison for only 1 year
 - If one confesses and the other remains silent, then the former will be set free and the latter will go to prison for 5 years

Prisoner's dilemma

- We can represent their payoffs using a bi-matrix

	confess	silent
confess	-3, -3	0, -5
silent	-5, 0	-1, -1

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 - remaining silent yields 5 years in prison
 - **best action = confess**

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 - remaining silent yields 1 year in prison

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- How does the row-prisoner think in order to find the best action?
- In any case, **confessing is the best action**, and the same holds for the column-prisoner due to symmetry
- Confessing is a **dominant strategy** for both prisoners since, whatever the other prisoner does, this action is always better

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- Given the strategies of the other players, each player aims to select its strategy in order to maximize its utility
 - Such a strategy is called a **best response**

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- Given the strategies of the other players, each player aims to select its strategy in order to maximize its utility
 - Such a strategy is called a **best response**
- A state consisting of best responses is stable, and called a **pure Nash equilibrium**: no player would like to deviate and select a different strategy

Back to prisoner's dilemma

- Players = the two prisoners
- Strategies = {confess, silent}
- Possible states = {(confess, confess), (confess, silent), (silent, confess), (silent, silent)}

- Utilities given by the bi-matrix:

	confess	silent
confess	-3, -3	0, -5
silent	-5, 0	-1, -1

- Confessing is a best response to any strategy of the other player
- (confess, confess) is a pure Nash equilibrium of the game

Battle of the sexes

- A couple (man and woman) want to decide what to do this evening; they can either attend a sports game or stay home and watch a movie
- They have different utilities for the two activities, but they would like to be together

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		man	
		sports	movie
woman	sports	3, 6	1, 1
	movie	2, 2	6, 3

Battle of the sexes

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		sports	movie
woman	sports	3, 6	1, 1
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- How does the woman think?

Battle of the sexes

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woman	sports	3, 6	1, 1
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- How does the woman think?
- If the man chooses sports, then she also prefers sports (3 vs. 2)

Battle of the sexes

		man	
		sports	movie
woman	sports	3, 6	1, 1
	movie	2, 2	6, 3

- How does the woman think?
- If the man chooses sports, then she also prefers sports (3 vs. 2)
- If the man chooses movie, then she also prefers movie (6 vs. 1)

Battle of the sexes

		man	
		sports	movie
woman	sports	3, 6	1, 1
	movie	2, 2	6, 3

- There is **no dominant strategy** for the woman (nor for the man)
- What is the equilibrium strategy profile then?

Battle of the sexes

		man	
		sports	movie
woman	sports	3, 6	1, 1
	movie	2, 2	6, 3

- Is the state (movie, sports) an equilibrium?

Battle of the sexes

		man	
		sports	movie
woman	sports	3, 6	1, 1
	movie	2, 2	6, 3

- Is the state (movie, sports) an equilibrium?
- No, the woman would prefer to **unilaterally change** her strategy to sports:
 - the state (sports, sports) gives her utility 3, while now she only gets utility 2

Battle of the sexes

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- Is the state (sports, sports) an equilibrium?

Battle of the sexes

		man	
		sports	movie
woman	sports	3, 6	1, 1
	movie	2, 2	6, 3

- Is the state (sports, sports) an equilibrium?
- Yes, none of the two players has incentive to unilaterally change its strategy:
 - a deviation to movie would give utility 1 to the man and 2 to the woman, compared to the utility of 6 and 3 they now get

Nash dynamics graph

- An easy way to graphically find Nash equilibria
- Built a graph containing a node per state
- A directed edge between two nodes represents the fact that there exists a player with a profitable unilateral deviation
- A node with only incoming edges corresponds to an equilibrium state: no player would like to deviate from there

Battle of the sexes

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		sports	movie
woman	sports	3, 6	1, 1
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sports, sports

sports, movie

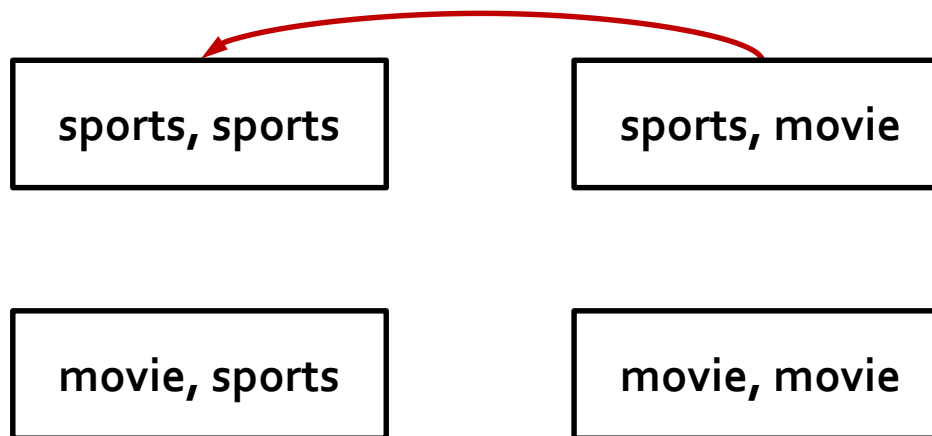
movie, sports

movie, movie

Battle of the sexes

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Man improves from 1 to 6



Battle of the sexes

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		sports	movie
woman	sports	3, 6	1, 1
	movie	2, 2	6, 3

Man improves from 1 to 6

Woman improves from 2 to 3

sports, sports

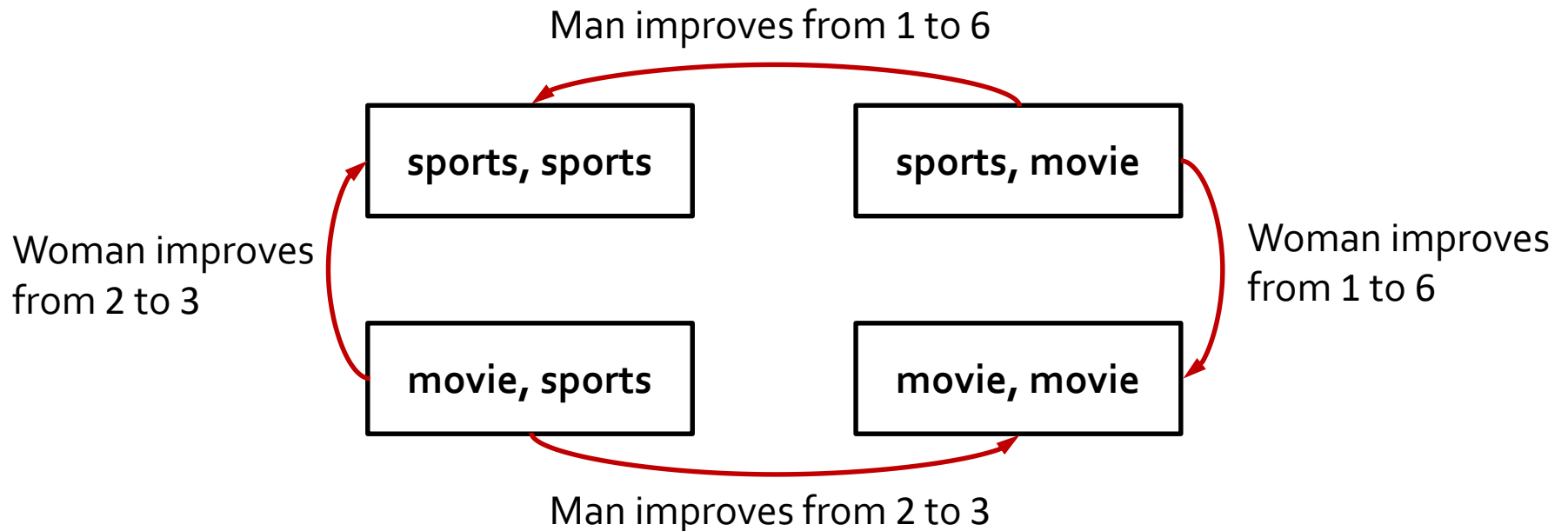
sports, movie

movie, sports

movie, movie

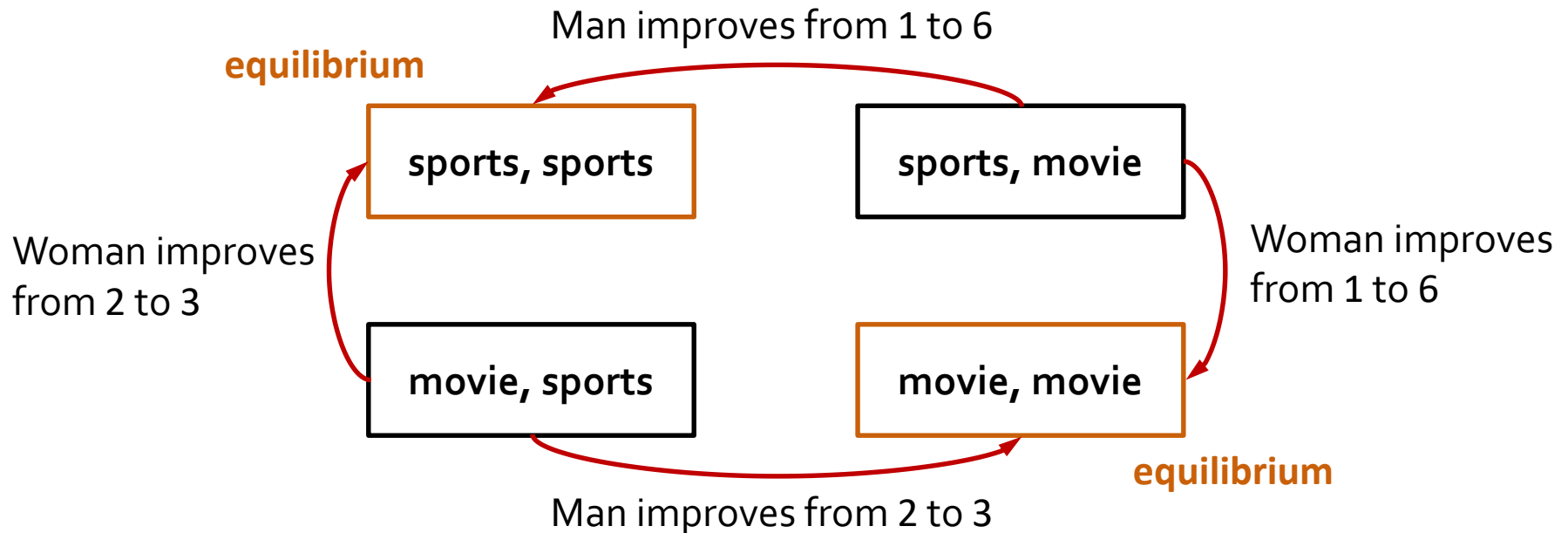
Battle of the sexes

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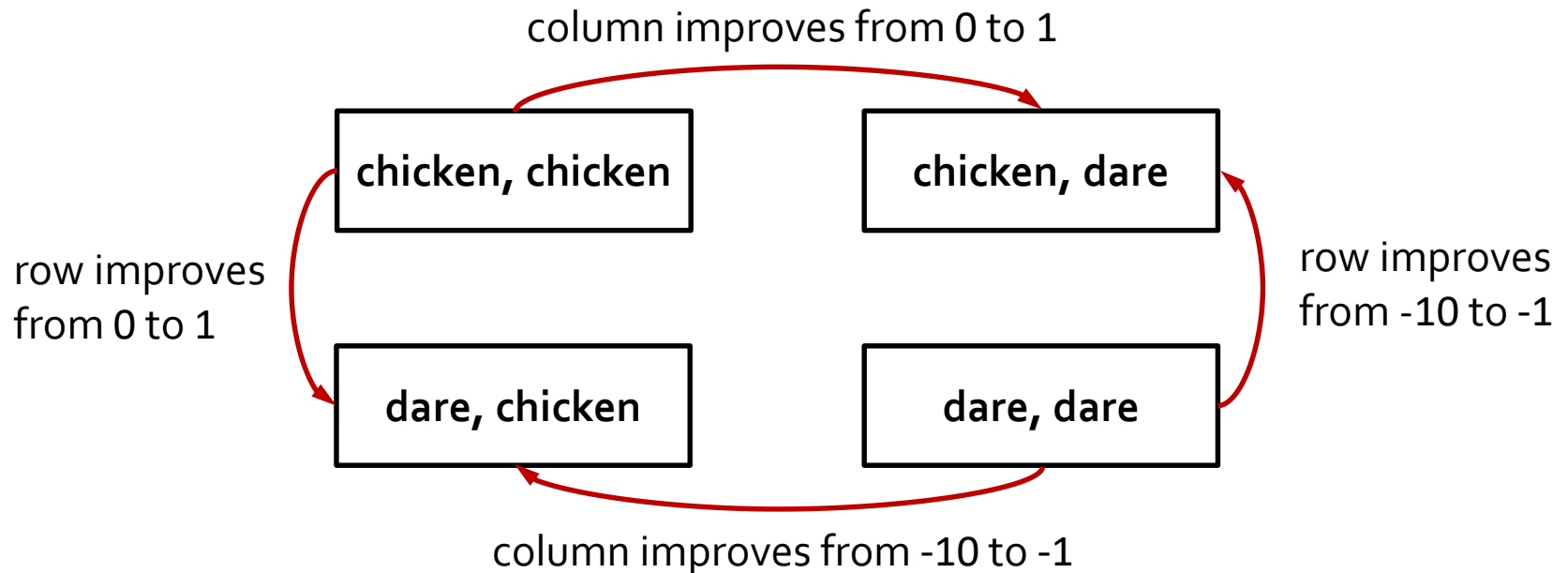


Chicken

		column-driver	
		chicken	dare
row-driver	chicken	0, 0	-1, 1
	dare	1, -1	-10, -10

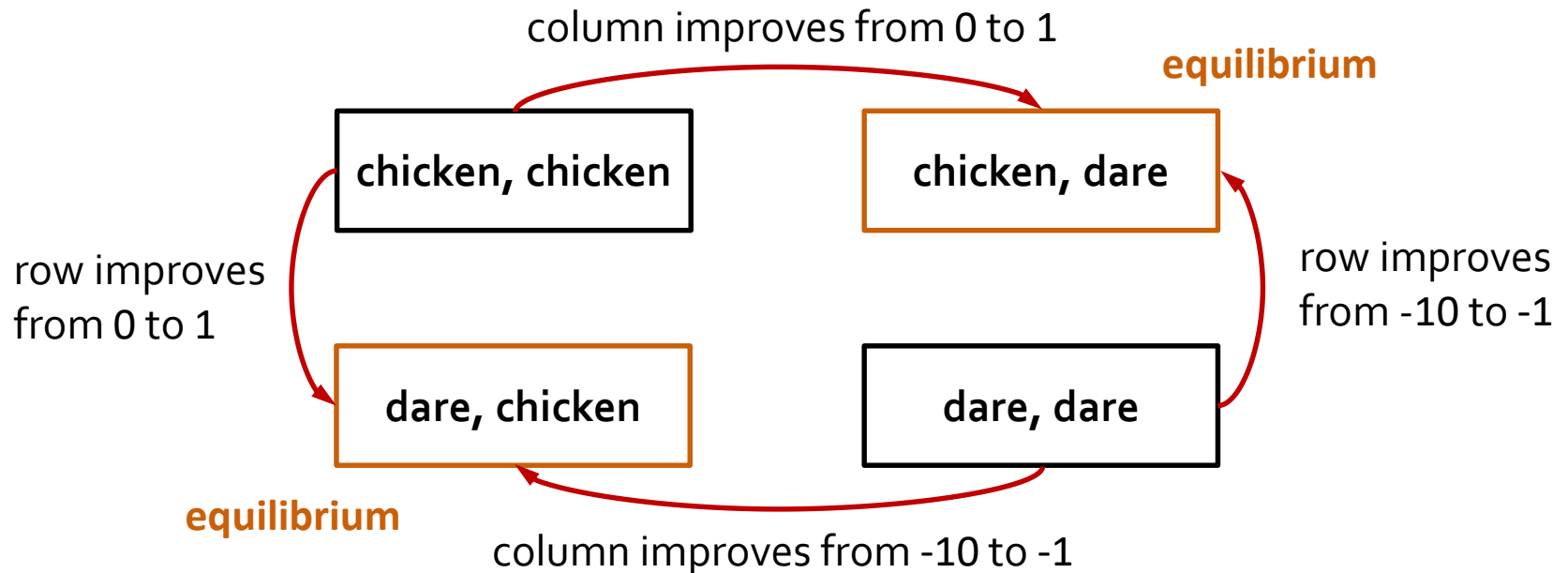
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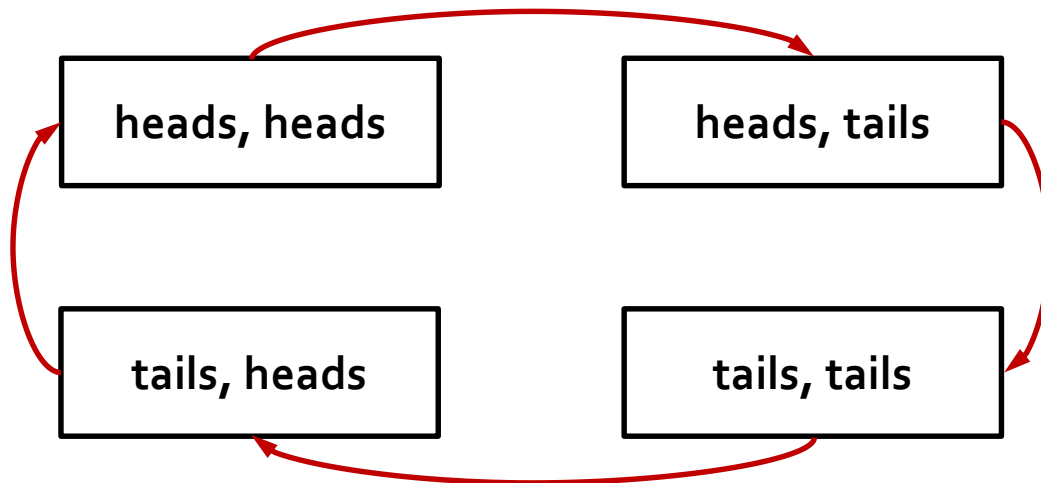


Matching pennies

		odd	
		heads	tails
even	heads	1, -1	-1, 1
	tails	-1, 1	1, -1

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- A **mixed strategy** for player i defines a probability $p_i(a)$ for each strategy $a \in S_i$ such that $\sum_{a \in S_i} p_i(a) = 1$
- The game is at a state $\mathbf{s} = (s_1, s_2, \dots, s_n)$ with probability

$$p(\mathbf{s}) = p_1(s_1) \cdot p_2(s_2) \cdot \dots \cdot p_n(s_n) = \prod_i p_i(s_i)$$

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$$p(\mathbf{s}) = p_1(s_1) \cdot p_2(s_2) \cdot \dots \cdot p_n(s_n) = \prod_i p_i(s_i)$$

- The **expected utility** of player i is then

$$\mathbb{E}_p[u_i] = \sum_{\mathbf{s}} p(\mathbf{s}) \cdot u_i(\mathbf{s})$$

Matching pennies

		odd			
		heads	tails		
even	heads	1, -1	-1, 1	0.8	
	tails	-1, 1	1, -1	0.2	
		0.4	0.6		

Matching pennies

		odd			
		heads	tails		
even	heads	1, -1	-1, 1	0.8	
	tails	-1, 1	1, -1	0.2	
		0.4	0.6		

- $p(\text{heads, heads}) = 0.8 \cdot 0.4 = 0.32$
- $p(\text{heads, tails}) = 0.8 \cdot 0.6 = 0.48$
- $p(\text{tails, heads}) = 0.2 \cdot 0.4 = 0.08$
- $p(\text{tails, tails}) = 0.2 \cdot 0.6 = 0.12$

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- $p(\text{tails, heads}) = 0.2 \cdot 0.4 = 0.08$
- $p(\text{tails, tails}) = 0.2 \cdot 0.6 = 0.12$
- $\mathbb{E}_p[u_e] = 0.32 \cdot 1 + 0.48 \cdot (-1) + 0.08 \cdot (-1) + 0.12 \cdot 1 = -0.12$
- $\mathbb{E}_p[u_o] = 0.32 \cdot (-1) + 0.48 \cdot 1 + 0.08 \cdot 1 + 0.12 \cdot (-1) = 0.12$

Mixed equilibria

- **Mixed equilibrium:** A profile of *mixed* strategies such that each player maximizes its expected utility, given the strategies of the other players

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Theorem [Nash, 1951]

Every finite strategic game of n players has at least one mixed equilibrium

- Every pure equilibrium is also a mixed equilibrium
 - Every pure strategy can be seen as a probability distribution over all strategies that assigns probability 1 to this one pure strategy

Matching Pennies: mixed equilibria

		odd	
		heads	tails
even	heads	1, -1	-1, 1
	tails	-1, 1	1, -1

- Even player selects heads with probability x and tails with $1 - x$
- Odd player selects heads with probability y and tails with $1 - y$

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		heads	tails
even	heads	1, -1	-1, 1
	tails	-1, 1	1, -1

- Even player selects heads with probability x and tails with $1 - x$
- Odd player selects heads with probability y and tails with $1 - y$
- $p(\text{heads, heads}) = xy$
- $p(\text{heads, tails}) = x(1 - y)$
- $p(\text{tails, heads}) = (1 - x)y$
- $p(\text{tails, tails}) = (1 - x)(1 - y)$

Matching Pennies: mixed equilibria

		odd		
		heads	tails	
even	heads	1, -1	-1, 1	x
	tails	-1, 1	1, -1	$1 - x$
		y	$1 - y$	

- $\mathbb{E}_p[u_e]$
 $= xy \cdot 1 + x(1 - y) \cdot (-1) + (1 - x)y \cdot (-1) + (1 - x)(1 - y) \cdot 1$

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- $\mathbb{E}_p[u_e]$
 $= xy \cdot 1 + x(1 - y) \cdot (-1) + (1 - x)y \cdot (-1) + (1 - x)(1 - y) \cdot 1$
 $= 4xy - 2x - 2y + 1$
 $= x(4y - 2) - 2y + 1$

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even	heads	1, -1	-1, 1	x
	tails	-1, 1	1, -1	$1 - x$
		y	$1 - y$	

- $\mathbb{E}_p[u_e]$
 $= xy \cdot 1 + x(1 - y) \cdot (-1) + (1 - x)y \cdot (-1) + (1 - x)(1 - y) \cdot 1$
 $= 4xy - 2x - 2y + 1$
 $= \mathbf{x(4y - 2) - 2y + 1}$
- $\mathbb{E}_p[u_o]$
 $= xy \cdot (-1) + x(1 - y) \cdot 1 + (1 - x)y \cdot 1 + (1 - x)(1 - y) \cdot (-1)$
 $= \mathbf{y(2 - 4x) + 2x - 1}$

Matching Pennies: mixed equilibria

- $\mathbb{E}_p[u_e] = x(4y - 2) - 2y + 1$
- $\mathbb{E}_p[u_o] = y(2 - 4x) + 2x - 1$
- The expected utility of each player is a **linear function** in terms of her corresponding probability

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- To analyze how a player is going to act, we need to see whether the slope of the linear function is negative or positive

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- The expected utility of each player is a **linear function** in terms of her corresponding probability
- To analyze how a player is going to act, we need to see whether the slope of the linear function is negative or positive
- **Negative:** the function is decreasing and the player aims to set a small value for the probability
- **Positive:** the function is increasing and the players aims to set a high value for the probability

Matching Pennies: mixed equilibria

- $\mathbb{E}_p[u_e] = x(4y - 2) - 2y + 1$
- $\mathbb{E}_p[u_o] = y(2 - 4x) + 2x - 1$
- **Even player:** the slope is $4y - 2$ and it depends on y , the probability with which the odd player selects heads

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- **$y < 1/2$**
 - ⇒ the slope $4y - 2$ is **negative**

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- **$y < 1/2$**
 - \Rightarrow the slope $4y - 2$ is **negative**
 - \Rightarrow the function $\mathbb{E}_p[u_e]$ is **decreasing in x**

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 - \Rightarrow even player sets $x = 0$ to maximize $\mathbb{E}_p[u_e]$

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 - \Rightarrow the function $\mathbb{E}_p[u_e]$ is **decreasing in x**
 - \Rightarrow even player sets $x = 0$ to maximize $\mathbb{E}_p[u_e]$
 - \Rightarrow the slope $2 - 4x = 2$ of the odd player is **positive**

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- $y < 1/2$
 - \Rightarrow the slope $4y - 2$ is **negative**
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 - \Rightarrow even player sets $x = 0$ to maximize $\mathbb{E}_p[u_e]$
 - \Rightarrow the slope $2 - 4x = 2$ of the odd player is **positive**
 - \Rightarrow the function $\mathbb{E}_p[u_o]$ is **increasing in y**
 - \Rightarrow odd player sets $y = 1$ to maximize $\mathbb{E}_p[u_o]$

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Matching Pennies: mixed equilibria

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- For these values of x and y both slopes are equal to 0 and the linear functions are maximized
- The pair $(x, y) = (1/2, 1/2)$ corresponds to a mixed equilibrium, which is actually unique for this game

Unbalanced coordination

- Two players with two possible strategies A and B
- If both players select A, they get one point
- If both of them select B, they get two points
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		col player	
		A	B
row player	A	1, 1	0, 0
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- Easy to verify that (A, A) and (B, B) are pure equilibria
- Are there any other mixed equilibria?

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- row player selects A with probability x and B with $1 - x$
- col player selects A with probability y and B with $1 - y$
- $p(A, A) = xy$
- $p(A, B) = x(1 - y)$
- $p(B, A) = (1 - x)y$
- $p(B, B) = (1 - x)(1 - y)$

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row player	A	1, 1	0, 0	x
	B	0, 0	2, 2	$1 - x$
		y	$1 - y$	

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 $= xy \cdot 1 + x(1 - y) \cdot 0 + (1 - x)y \cdot 0 + (1 - x)(1 - y) \cdot 2$
 $= \mathbf{x(3y - 2) + 2 - 2y}$
- $\mathbb{E}_p[u_c]$
 $= xy \cdot 1 + x(1 - y) \cdot 0 + (1 - x)y \cdot 0 + (1 - x)(1 - y) \cdot 2$
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- $(x, y) = (0, 0)$ is a mixed equilibrium
- We already knew that: it corresponds to the pure equilibrium (A, A)

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- $(x, y) = (1, 1)$ is a mixed equilibrium corresponding to the pure equilibrium (B, B)

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- $(x, y) = (2/3, 2/3)$ is a fully mixed equilibrium of the game

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