



15-382 COLLECTIVE INTELLIGENCE – S18

LECTURE 27: GAME THEORY 2

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THE PROFESSOR'S DILEMMA

- Simultaneous move
- Non-cooperative game
- Complete information
- Imperfect information
- **Solution concept:** predict how the game will be played with rational agents
- Prediction \equiv Solution
- Nash: **Equilibrium concept**

		Class	
		Listen	Sleep
Professor	Make effort	$10^6, 10^6$	$-10, 0$
	Slack off	$0, -10$	$0, 0$

Dominant strategies?

Nope, if Class listen, and Professor slacks off, Sleep provides a higher payoff!
No *dominant* strategy: best strategy it doesn't matter what other player's strategy

NASH EQUILIBRIUM (1951)

- Can we find an **equilibrium** also in absence of a dominant strategy?
- At equilibrium, each player's strategy is a **best response** to strategies of others
- Formally, a Nash equilibrium is *strategy profile* $s = (s_1, \dots, s_n) \in S^n$ such that:

$$\forall i \in N, \forall s'_i \in S, u_i(s) \geq u_i(s'_i, s_{-i})$$

John F. Nash,
Nobel Prize in Economics, 1994



NASH EQUILIBRIUM

- In equilibrium, each player is playing the strategy that is a “**best response**” to the strategies of the other players. No one has an *incentive* to change strategy given the strategy choices of the others
- A NE is an equilibrium where each player’s strategy is *optimal given the strategies of all other players*.
- A Nash Equilibrium exists when there is no unilateral profitable deviation from any of the players involved
- Nash Equilibria are *self-enforcing* strategies: when players are at a Nash Equilibrium they have no desire to move because they will be worse off → **Equilibrium** in the policy space
- **Dominant strategy** \Rightarrow **Nash equilibrium**: All solutions in dominant strategies are also Nash equilibria, but the vice versa is *not* necessarily (and not usually) true

NASH EQUILIBRIUM

Equilibrium is *not*.

- *The best possible outcome of the game.*
Equilibrium in the one-shot prisoners' dilemma is for both players to confess, which is not the best possible outcome (not Pareto optimal)
- A situation where players always choose the same action. Sometimes equilibrium will involve changing action choices (*mixed strategy equilibrium*).

NASH EQUILIBRIUM

- How many Nash equilibria does the Professor's Dilemma have?

	Listen	Sleep
Make effort	$10^6, 10^6$	$-10, 0$
Slack off	$0, -10$	$0, 0$

ML - SS

NASH EQUILIBRIA: HOW DO WE FIND THEM?







- *Nash equilibrium*: A play of the game where each strategy is a best reply to the given strategy of the other.
- Let's examine all the possible pure strategy profiles and check if for a profile (X,Y) one player could improve its payoff, given the strategy of the other
- ✓ (M, L) ? If Prof plays M, then L is the best reply given M. Neither player can increase its the payoff by choosing a different action
- (S,L) ? If Prof plays S, S is the best reply given S, not L
- (M, S) ? If Prof plays M, then L is the best reply given M, not S
- ✓ (S,S) ? If Prof plays S, then S is the best reply given S. Neither player can increase its the payoff by choosing a different action

NASH EQUILIBRIUM FOR PRISONER'S DILEMMA

		Prisoner B	
		Don't confess	Confess
Prisoner A	Don't Confess	-1, -1 → -9, 0	-9, 0
	Confess	0, -9 ↓ -6, -6	-6, -6

The table illustrates the Prisoner's Dilemma. The Nash Equilibrium is highlighted by a black box around the bottom-right cell, representing the outcome where both prisoners confess, resulting in a payoff of (-6, -6). A blue box highlights the top-left cell (-1, -1), which represents the outcome where both prisoners do not confess. Yellow arrows indicate the best response for each player given the other's choice: from (-1, -1) to (-9, 0) for Prisoner B, and from (0, -9) to (-6, -6) for Prisoner A. Green arrows indicate the best response for each player given their own choice: from (-1, -1) to (0, -9) for Prisoner A, and from (-9, 0) to (-6, -6) for Prisoner B.

COORDINATION GAME: STAG HUNT

S _h			
		COOPERATE	DEFECT
	COOPERATE		
	DEFECT		

(Originally from J.J. Rousseau)

	stag	rabbit
stag	5, 5	0, 3
rabbit	3, 0	3, 3

- **Two equilibria** at $(stag, stag)$ and $(rabbit, rabbit)$ → Players' optimal strategy depend on their *expectation* on what the other player may do.
- This game has been used as an analogy for social cooperation, and mutual trust
- In Prisoner's dilemma, the Nash equilibrium corresponds to defect, no cooperate!

COMPETITION GAME

Player 1 \ Player 2	Player 2 chooses '0'	Player 2 chooses '1'	Player 2 chooses '2'	Player 2 chooses '3'
Player 1 chooses '0'	0, 0	2, -2	2, -2	2, -2
Player 1 chooses '1'	-2, 2	1, 1	3, -1	3, -1
Player 1 chooses '2'	-2, 2	-1, 3	2, 2	4, 0
Player 1 chooses '3'	-2, 2	-1, 3	0, 4	3, 3

- Both players simultaneously choose an integer from 0 to 3
- They *both* win the smaller of the two numbers in points.
- In addition, if one player chooses a larger number than the other, then it has to give up two points to the other.

Does the (unique) NE at (0,0) make sense?

ROCK-PAPER-SCISSORS

	R	P	S
R	0,0	-1,1	1,-1
P	1,-1	0,0	-1,1
S	-1,1	1,-1	0,0

Nash equilibrium?

Is there a pure strategy as best response?

ROCK-PAPER-SCISSORS

	R	P	S
R	0,0	-1,1	1,-1
P	1,-1	0,0	-1,1
S	-1,1	1,-1	0,0

No (pure) Nash equilibria:
Best response:
randomize!

- For every pure strategy (X,Y), there is a different strategy choice that increases the payoff of a player
- E.g., for strategy (P,R), player B can get a higher payoff playing strategy S instead R
- E.g., for strategy (S,R), player A can get a higher payoff playing strategy P instead S
- No strategy equilibrium can be settled, *players have the incentive to keep switching their strategy*

MIXED STRATEGIES

- **Mixed strategy:** a *probability distribution* over (*pure*) strategies
- The mixed strategy of player $i \in N$ is x_i , where $x_i(s_i) = \Pr[i \text{ plays } s_i]$ (e.g., $x_i(R) = 0.3$, $x_i(P) = 0.5$, $x_i(S) = 0.2$)
- The (**expected**) **utility** of player $i \in N$ is

$$u_i(x_1, \dots, x_n) = \sum_{(s_1, \dots, s_n) \in S^n} u_i(s_1, \dots, s_n) \cdot \prod_{j=1}^n x_j(s_j)$$

Mixed strategy profile Pure strategy profile Utility of pure strategy profile Joint probability of the pure strategy profile given the mixed profile

EXERCISE: MIXED NE

- Player 1 plays $(\frac{1}{2}, \frac{1}{2}, 0)$, player 2 plays $(0, \frac{1}{2}, \frac{1}{2})$. What is u_1 ?
- Both players play $(\frac{1}{3}, \frac{1}{3}, \frac{1}{3})$. What is u_1 ?

	R	P	S
R	0,0	-1,1	1,-1
P	1,-1	0,0	-1,1
S	-1,1	1,-1	0,0

EXERCISE: MIXED NE

Player 1 plays $(\frac{1}{2}, \frac{1}{2}, 0)$, player 2 plays $(0, \frac{1}{2}, \frac{1}{2})$. What is u_1 ?

$$\begin{aligned} u_1(x_1(R, P, S), x_2(R, P, S)) &= \\ &u_1(R, R)p(R, R|x_1, x_2) + u_1(R, P)p(R, P|x_1, x_2) + u_1(R, S)p(R, S|x_1, x_2) + \\ &u_1(P, R)p(P, R|x_1, x_2) + u_1(P, P)p(P, P|x_1, x_2) + u_1(P, S)p(P, S|x_1, x_2) + \\ &u_1(S, R)p(S, R|x_1, x_2) + u_1(S, P)p(S, P|x_1, x_2) + u_1(S, S)p(S, S|x_1, x_2) \\ &= 0 \cdot (\frac{1}{2} \cdot 0) + (-1) \cdot (\frac{1}{2} \cdot \frac{1}{2}) + 1 \cdot (\frac{1}{2} \cdot \frac{1}{2}) \\ &+ 1 \cdot (\frac{1}{2} \cdot 0) + 0 \cdot (\frac{1}{2} \cdot \frac{1}{2}) + (-1) \cdot (\frac{1}{2} \cdot \frac{1}{2}) \\ &+ (-1) \cdot (0 \cdot 0) + 1 \cdot (0 \cdot \frac{1}{2}) + 0 \cdot (0 \cdot \frac{1}{2}) \\ &= -\frac{1}{4} \end{aligned}$$

	R	P	S
R	0,0	-1,1	1,-1
P	1,-1	0,0	-1,1
S	-1,1	1,-1	0,0

In the second case, because of symmetry, the utility is zero: It's a **zero-sum game**

MIXED STRATEGIES EQUILIBRIUM IS NASH

- The mixed strategy profile x^* in a strategic game is a **mixed strategy Nash equilibrium** if

$$u_i(x_i^*, x_{-i}^*) \geq u_i(x_i, x_{-i}^*) \quad \forall x_i \text{ and } i$$

- $u_i(x)$ is player i 's expected utility with mixed strategy profile x
- → Same definition as in the case of pure strategies, where u_i was the utility of a pure strategy instead of a mixed strategy

MIXED STRATEGIES NASH EQUILIBRIUM

- Using *best response* functions, x^* is a mixed strategy NE iff x_i^* is the **best response** for every player i .
- If a mixed strategy x^* is a best response, then each of the *pure strategies in the mix must be best response*: they must yield the same expected payoff (otherwise it would just make sense to choose the one with the better payoff)
- → If a mixed strategy is a best response for player i , then the player must be **indifferent among the pure strategies in the mix**
- E.g., in the RPS game, if the mixed strategy of player i assigns non-zero probabilities p_R for playing R and p_P for playing P, then **i 's expected utility for playing R or P has to be the same**

EXERCISE: MIXED NE

■ Which is a NE?

1. $\left(\left(\frac{1}{2}, \frac{1}{2}, 0 \right), \left(\frac{1}{2}, \frac{1}{2}, 0 \right) \right)$

2. $\left(\left(\frac{1}{2}, \frac{1}{2}, 0 \right), \left(\frac{1}{2}, 0, \frac{1}{2} \right) \right)$

3. $\left(\left(\frac{1}{3}, \frac{1}{3}, \frac{1}{3} \right), \left(\frac{1}{3}, \frac{1}{3}, \frac{1}{3} \right) \right)$

4. $\left(\left(\frac{1}{3}, \frac{2}{3}, 0 \right), \left(\frac{2}{3}, 0, \frac{1}{3} \right) \right)$

	R	P	S
R	0,0	-1,1	1,-1
P	1,-1	0,0	-1,1
S	-1,1	1,-1	0,0

Any other NE?

NASH'S THEOREM

- **Theorem [Nash, 1950]:** In any game with finite number of strategies there exists at least one (possibly mixed) Nash equilibrium

		Player B	
		Left	Right
Player A	Up	1,2	0,4
	Down	0,5	3,2

This game has no pure strategy Nash equilibria but it does have a Nash equilibrium in **mixed strategies**. [How is it computed?](#)

COMPUTATION OF MS NE

		Player B	
		Left	Right
Player A	Up	1,2	0,4
	Down	0,5	3,2

Player A plays Up with probability p_U and plays Down with probability $1-p_U$

Player B plays Left with probability p_L and plays Right with probability $1-p_L$.

COMPUTATION OF MS NE

		Player B	
		L, π_L	R, $1-\pi_L$
Player A	U, π_U	1,2	0,4
	D, $1-\pi_U$	0,5	3,2

COMPUTATION OF MS NE

		Player B	
		L, π_L	R, $1-\pi_L$
Player A	U, π_U	1, 2	0, 4
	D, $1-\pi_U$	0, 5	3, 2

If B plays Left, its expected utility is

$$2\pi_U + 5(1 - \pi_U)$$

COMPUTATION OF MS NE

		Player B	
		L, π_L	R, $1-\pi_L$
Player A	U, π_U	1,2	0,4
	D, $1-\pi_U$	0,5	3,2

If B plays Right, its expected utility is

$$4\pi_U + 2(1 - \pi_U)$$

COMPUTATION OF MS NE

		Player B	
		L, π_L	R, $1-\pi_L$
Player A	U, π_U	1,2	0,4
	D, $1-\pi_U$	0,5	3,2

If $2\pi_U + 5(1 - \pi_U) > 4\pi_U + 2(1 - \pi_U)$ then

B would play only Left, which would be a pure strategy.
But there are no (pure) Nash equilibria in which B plays only Left.

COMPUTATION OF MS NE

		Player B	
		L, π_L	R, $1-\pi_L$
Player A	U, π_U	1,2	0,4
	D, $1-\pi_U$	0,5	3,2

If $2\pi_U + 5(1 - \pi_U) < 4\pi_U + 2(1 - \pi_U)$ then

B would play only Right.

But there are no (pure) Nash equilibria in which B plays only Right

COMPUTATION OF MS NE

		Player B	
		L, π_L	R, $1-\pi_L$
Player A	U, π_U	1,2	0,4
	D, $1-\pi_U$	0,5	3,2

For there to exist a MS Nash equilibrium, B must be indifferent between playing Left or Right:

$$2\pi_U + 5(1 - \pi_U) = 4\pi_U + 2(1 - \pi_U)$$

COMPUTATION OF MS NE

		Player B	
		L, π_L	R, $1-\pi_L$
Player A	U, π_U	1,2	0,4
	D, $1-\pi_U$	0,5	3,2

$$2\pi_U + 5(1 - \pi_U) = 4\pi_U + 2(1 - \pi_U)$$
$$\Rightarrow \pi_U = 3/5$$

COMPUTATION OF MS NE

		Player B	
		L, π_L	R, $1-\pi_L$
Player A	U, $\frac{3}{5}$	1,2	0,4
	D, $\frac{2}{5}$	0,5	3,2

$$\pi_U = \frac{3}{5} \quad 1 - \pi_U = \frac{2}{5}$$

COMPUTATION OF MS NE

		Player B	
		L, π_L	R, $1-\pi_L$
Player A	U, $\frac{3}{5}$	1,2	0,4
	D, $\frac{2}{5}$	0,5	3,2

If A plays Up its expected payoff is

$$1 \times \pi_L + 0 \times (1 - \pi_L) = \pi_L$$

COMPUTATION OF MS NE

		Player B	
		L, π_L	R, $1-\pi_L$
Player A	U, $\frac{3}{5}$	1,2	0,4
	D, $\frac{2}{5}$	0,5	3,2

If A plays Down his expected payoff is

$$0 \times \pi_L + 3 \times (1 - \pi_L) = 3(1 - \pi_L)$$

COMPUTATION OF MS NE

		Player B	
		L, π_L	R, $1-\pi_L$
Player A	U, $\frac{3}{5}$	1,2	0,4
	D, $\frac{2}{5}$	0,5	3,2

If $\pi_L > 3(1 - \pi_L)$ then

A would play only Up.

But there are no pure Nash equilibria in which A plays only Up.

COMPUTATION OF MS NE

		Player B	
		L, π_L	R, $1-\pi_L$
Player A	U, $\frac{3}{5}$	1,2	0,4
	D, $\frac{2}{5}$	0,5	3,2

If $\pi_L < 3(1 - \pi_L)$ then

A would play only Down.

But there are no Nash equilibria in which A plays only Down.

COMPUTATION OF MS NE

		Player B	
		L, π_L	R, $1-\pi_L$
Player A	U, $\frac{3}{5}$	1,2	0,4
	D, $\frac{2}{5}$	0,5	3,2

For there to exist a Mixed Nash equilibrium, A must be indifferent between playing Up or Down:

$$\pi_L = 3(1 - \pi_L)$$

COMPUTATION OF MS NE

		Player B	
		L, π_L	R, $1-\pi_L$
Player A	U, $\frac{3}{5}$	1,2	0,4
	D, $\frac{2}{5}$	0,5	3,2

$$\pi_L = 3(1 - \pi_L) \Rightarrow \pi_L = 3/4$$

COMPUTATION OF MS NE

		Player B	
		L, $\frac{3}{4}$	R, $\frac{1}{4}$
Player A	U, $\frac{3}{5}$	1,2	0,4
	D, $\frac{2}{5}$	0,5	3,2

$$\pi_L = \frac{3}{4} \quad 1 - \pi_L = \frac{1}{4}$$

COMPUTATION OF MS NE

		Player B	
		L, $\frac{3}{4}$	R, $\frac{1}{4}$
Player A	U, $\frac{3}{5}$	1,2	0,4
	D, $\frac{2}{5}$	0,5	3,2

Game's only Nash equilibrium has A playing the mixed strategy $(\frac{3}{5}, \frac{2}{5})$ and B playing the mixed strategy $(\frac{3}{4}, \frac{1}{4})$

COMPUTATION OF MS NE

		Player B	
		L, $\frac{3}{4}$	R, $\frac{1}{4}$
Player A	U, $\frac{3}{5}$	1,2	0,4
	D, $\frac{2}{5}$	0,5	3,2

Payoffs:

- (1,2) with probability $(\frac{3}{5} \times \frac{3}{4}) = \frac{9}{20}$
- (0,4) with probability $(\frac{3}{5} \times \frac{1}{4}) = \frac{3}{20}$
- (0,5) with probability $(\frac{2}{5} \times \frac{3}{4}) = \frac{6}{20}$
- (3,2) with probability $(\frac{2}{5} \times \frac{1}{4}) = \frac{2}{20}$

COMPUTATION OF MS NE

		Player B	
		L, $\frac{3}{4}$	R, $\frac{1}{4}$
Player A	U, $\frac{3}{5}$	1,2	0,4
	D, $\frac{2}{5}$	0,5	3,2

A's expected Nash equilibrium payoff:

$$1 \times \frac{9}{20} + 0 \times \frac{3}{20} + 0 \times \frac{6}{20} + 3 \times \frac{2}{20} = \frac{3}{4}$$

COMPUTATION OF MS NE

		Player B	
		L, $\frac{3}{4}$	R, $\frac{1}{4}$
Player A	U, $\frac{3}{5}$	1,2	0,4
	D, $\frac{2}{5}$	0,5	3,2

B's expected Nash equilibrium payoff:

$$2 \times \frac{9}{20} + 4 \times \frac{3}{20} + 5 \times \frac{6}{20} + 2 \times \frac{2}{20} = \frac{16}{5}$$