Algorithmic Game Theory and Applications

Games and Solution Concepts

The formal definition of a (strategic) game

Definition: A game in normal or strategic form is a tuple $(N, S_1, S_2, ..., S_n, u_1, u_2, ..., u_n)$ where

- 1. $N = \{1, ..., n\}$ is a set of players (sometimes called "agents").
- 2. For each player $i \in N$, there is a set S_i of (pure) strategies.

A vector $(s_1, s_2, ..., s_n) \in S_1 \times S_2 \times ... \times S_n = S$ is called a strategy profile.

3. For each player $i \in N$, there is a payoff (or utility) function $u_i : S \to \mathbb{R}$ which assigns a numerical value $u_i(s_1, s_2, ..., s_n)$ to player *i* for a given strategy profile $(s_1, s_2, ..., s_n)$.

Example 3: Cheating Partners



A First Game: Prisoner's Dilemma

Two criminals have been arrested and are imprisoned in isolation (i.e., they cannot talk to each other!).

The police does not have enough evidence to convict them on the charges, but they do have enough to convict them on other charges (2 years).

The offer each prisoner a bargain: Confess to the crime and you will get a reduced sentence (1 year).

If the other person does not confess, they will be sentenced to 10 years.

But if both prisoners confess, they each receive a sentence of 5 years.

A First Game: Prisoner's Dilemma



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For Player 1, confessing is better regardless of the strategy of Player 2



Player 2 (column player)

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(Weakly) Dominant Strategy: A (pure) strategy $s_i \in S_i$ for player $i \in N$ is a (weakly) dominant strategy, if it results in at least as high utility as any other strategy $s'_i \in S_i$, regardless of the strategies of the others.

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<u>Mathematically</u>: $u_i(s_i, s_{-i}) \ge u_i(s'_i, s_{-i})$ for all $s'_i \in S_i$ and all $s_{-i} \in S_1 \times \ldots \times S_{i-1} \times S_{i+1} \times \ldots \times S_n = S_{-i}$.

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Question: Can a game have multiple weak dominant strategy equilibria?

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Question: Do all games have weak dominant strategy equilibria?

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This means that if there are no (weakly) dominant pure strategies, then there are also no (weakly) dominant mixed strategies.

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Drawback of DSE: It is not <u>universal</u> - there are (many) games for which it does not exist.

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	L	С	R
U	3, 1	0, 1	0, 0
Μ	1, 1	1, 1	5, 0
D	0,1	4, 1	0, 0



If Player 2 plays R, they always get a utility of 0.





R is strictly dominated (by C).



This means that we can remove R.

C is clearly better than R, no matter what Player 1 does. R is strictly dominated (by C).



















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We usually don't remove weakly dominated strategies.



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We cannot find any more strictly dominated strategies.

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<u>Clearly: If x is a DSE, it is also an IEDSE.</u>









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But we will return to it, because it can be useful as a tool for stronger solution concepts.













If you were Player 1, would you watch FOTC?		Peep Show	FOTC
If you were Player 1, would you watch Peep Show?	Peep Show	10, 7	5, 5
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If you were Player 1, would you watch FOTC?

For either(Peep Show, Peep Show) or(FOTC, FOTC),Player 1 does not want todeviate to watching the
other show.Peep
Show10, 75, 5

FOTC

1, 1

7, 10
For either (Peep Show, Peep Show) or (FOTC, FOTC), Player 1 does not want to *deviate* to watching the other show.

What about Player 2?



For either (Peep Show, Peep Show) or Peep Show (FOTC, FOTC), FOTC Player 1 does not want to *deviate* to watching the Peep other show. 10, 7 5, 5 Show What about Player 2? Player 2 does not want to 1, 1 7, 10 deviate either! FOTC

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Player 2 does not want to deviate either!

So, assuming that the other player does not change strategy, no player wants to change.

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Before we proceed... DSE vs PNE?

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What is the difference?

<u>Which of the following statements is true?</u>1. Every DSE is a PNE.2. Every PNE is a DSE.

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RPS does not have any PNE!

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<u>But:</u> There are important classes of games for which it does exist (stay tuned).



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Solution Concept #3*: (Mixed) Nash Equilibrium

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So it seems that we have to compare against any other mixed strategy x'_i .

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Since $\sum_{s_i \in S_i} x'_i(s_i) = 1$











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Introduced by Nash in 1951 (in his PhD dissertation).

Advantage of MNE: Much more reasonable outcome - "I won't change unless the others change", hence a *stable* outcome.



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Theorem (Nash 1951): Every (finite normal-form) game has at least one mixed Nash equilibrium.



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1. First, think about how to model the situation that you see in the scene as a game.

2. Then, explain why the solution proposed by the fictional John Nash is actually *not* a Nash equilibrium.