# Game theory

Master course for Information Engineers, Computer scientists, Data scientists

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# Time inconsistencies

Contradictory discounting

### Scarce resource allocation

- A player has a fixed resource budget K to allocate over N subsequent time steps
  - For simplicity, assume N=3 (can be generalized)
  - $\blacksquare$  Assume a discount factor of  $\delta$
  - Total payoff = sum of discounted partial payoffs
  - $\mathbf{v}(\mathbf{x}_1, \mathbf{x}_2, \mathbf{x}_3) = \mathbf{u}(\mathbf{x}_1) + \delta \mathbf{u}(\mathbf{x}_2) + \delta^2 \mathbf{u}(\mathbf{x}_3)$
- - note that this is a single-person optimization

#### Scarce resource allocation

- $\square$  To set the ideas, set:  $u(x) = \log x$ , K=1
- □ Take  $1^{st}$ -order derivative of  $v(1-x_2-x_3, x_2, x_3)$
- Solution of the problem is

$$\mathbf{x}_1 = \frac{1}{1 + \delta + \delta^2} \quad \mathbf{x}_2 = \frac{\delta}{1 + \delta + \delta^2} \quad \mathbf{x}_3 = \frac{\delta^2}{1 + \delta + \delta^2}$$

- For the special case  $\delta = 1$ , equal split
- Is this choice consistent? Or can the player regret it later on in the game?

# Time consistency

- □ If the player already spent  $x_1 = (1 + \delta + \delta^2)^{-1}$
- □ Now the player is left with  $K' = 1 x_1$ , to be split between 2 periods,  $x_2 + x_3 = K'$ 
  - At period 2,  $u(x_2)$  is weighed 1 (time 2 = present), while  $u(x_3)$  is discounted by  $\delta$

Solution: 
$$x_2 = \delta (1 + \delta + \delta^2)^{-1}$$
  
 $x_3 = \delta^2 (1 + \delta + \delta^2)^{-1}$ 

Same as before!
 Exponential discount is time-consistent

### Time consistency

- □ What if we have consistency issues? Assume  $v(x_1, x_2, x_3) = u(x_1) + \beta \delta u(x_2) + \beta \delta^2 u(x_3)$ 
  - Future payoffs are all discounted (only once) by an additional factor  $\beta$ ,  $0 < \beta < 1$ ; discount factor between two future periods is still  $\delta$
- This time, the player knows he will act strangely and wants to contain this problem
  - Struggle between: Player 1 (present-day player) and Player 2 (future self at step 2)

### Time consistency

- □ For simplicity, fix  $u(x) = \log x$ ,  $\beta = 0.5$ ,  $\delta = 1$ 
  - $\blacksquare$  Real discount is  $\frac{1}{2}$  but player 2 is not applying it
  - Player 2 will do equal split. Player 1 knows it!
  - Player 1 anticipates it with backward induction
  - This means, if player 1 consumes  $x_1$ , subsequent allocations are  $x_2 = (1-x_1)/2$ ,  $x_3 = (1-x_1)/2$

max v, s.t.: 
$$x_1 + x_2 + x_3 = 1 \rightarrow \text{solution } x_1 = \frac{2}{3}$$

Overconsumption to leave less for future self

Same players playing multiple games

- Normal form games describe well situations where players act simultaneously
- Extensive form games add a time dimension
  - But payoffs are given only at the end nodes
- Many real games have intermediate steps that give partial payoffs, valued on aggregate
  - Tournaments, Rounds of Cards, Partial Exams...
- Can we see them as a single grand game?

- Define multistage games as a finite sequence of T normal form stage games
  - Stage games are defined independently of each other and include the same set of players
  - □ They are complete but imperfect information games (that is, simultaneous move games)
  - possible extension to infinite horizon
     we will see it only in some special cases
- Total payoffs are evaluated from the sequence of outcomes of the stage games

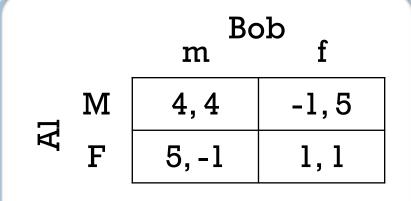
- Example: a sequence of 2 stage games with same players but different action sets
  - Actions chosen in each game lead to an outcome for that game, and thus to a partial payoff  $u_i^{(j)}$
  - Players get the same payoffs for their second decisions, whatever the outcome of the first game
  - Total payoffs are the (discounted) sums of partial payoffs for each player (discount factor  $\delta$  is the same for all the users, and is common knowledge)
  - $\blacksquare$  total payoff for player i:  $\mathbf{u}_i = \sum_{i=1...T} \delta^i \mathbf{u}_i^{(i)}$

# Example: Prisoner-Revenge

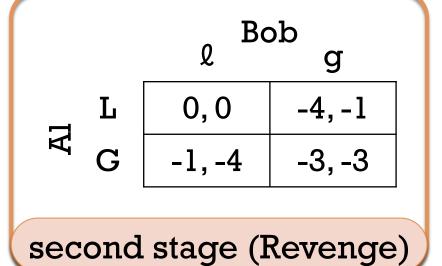
- Al and Bob play the Prisoner's Dilemma
- After that, they go out of jail and they can either join a gang (G) or remain a "loner" (L)
  - If they both stay alone, they never meet again → payoff is 0 for both
  - If they both join a gang, they fight each other → negative payoff for both
  - If only one has a gang to defend him, he gets a (small) loss, the other a (heavy) loss

# Prisoner-Revenge

Suppose the payoffs are as follows

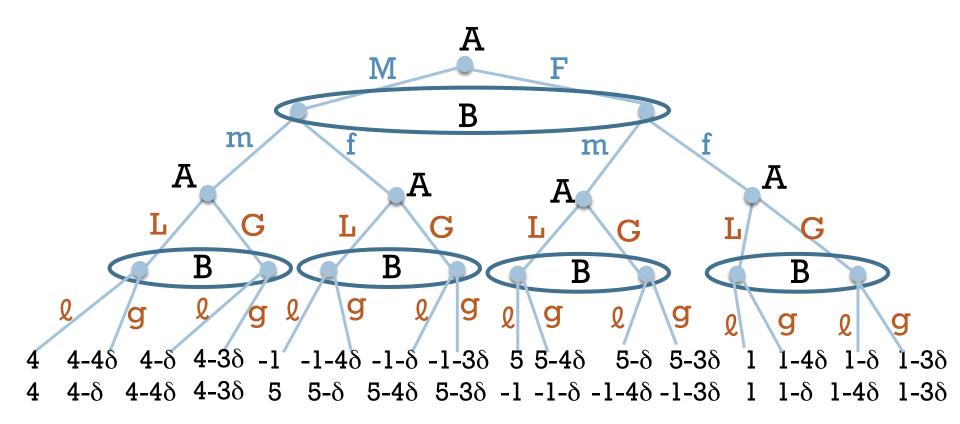


first stage (Prisoner)



 $\square$  And they are aggregated with discount  $\delta$ 

# Prisoner-Revenge



# Strategies of multistage games

- A strategy for each player must specify
  - what to do in the first stage (just one action)
  - what to do in the subsequent game(s) depending on the outcome of the previous game(s)
- The Prisoner-Revenge game has already 32 possible strategies (already complex enough)
- Strategies can be thought of as "I start by playing X, then I play Y if this happens"

# Subgame perfect equilibria

- Remember that a SPE is a joint strategy such that a NE is played in every subgame
- The stage games are independent, thus:
- □ **Theorem 1.** If  $s_j^*$  is a NE strategy profile for the *j*th stage game, then there exists a SPE whose equilibrium path is  $s_1^*$ ,  $s_2^*$ , ...,  $s_T^*$ 
  - **Proof.** Consider a strategy where each player is allowed to only play what  $s_j^*$  states at stage j. This implies a NE is achieved in every subgame

# Prisoner-Revenge

- □ Remember that (F,f) is a NE of the first stage
- This means that A playing (F, L, L, L, L) and
   B playing (f, l, l, l, l) must be a SPE because
   (L, l) is a NE of the second stage game
- Similarly, (F, G, G, G, G) (f, g, g, g, g) is another SPE, as (G,g) is a NE of stage 2
- Note that we removed any strategic link
  - The games are played independently
  - Is there an alternative with strategic connection?

# Subgame perfect equilibria

- We need to start from the end of the game
  - Same as we did for backward induction!
- □ **Theorem 2.** Any NE s\* (even if it is no SPE) of a multistage game  $(G_1, G_2, ..., G_T)$  must dictate a NE is played in stage game  $G_T$ 
  - Proof. Stage T is the last one, and this is common knowledge. No future to influence the actions of the players: they play only best responses
- □ **Theorem 3.** If  $G_1, G_2, ..., G_T$  all have a unique NE, then  $(G_1, G_2, ..., G_T)$  has a unique SPE

- Theorems 2 and 3 imply that if the last stages have only one NE, this will be played
  - Not much of a surprise, and nothing we can do
- What if the Tth stage has multiple NE?
- Surprisingly, this enables non-NE to be played (in other stages of course)
  - This means that SPE can be built, where some of the intermediate stages have non-NE strategies that are played!

- See for example the Prisoner-Revenge game
- In the second stage:
  - two NEs: (L, ℓ) "friendly" and (G,g) "gang"
  - (M,m) is not a NE in the first stage
  - If a static Prisoner game is played, joint strategy (M,m) cannot be supported (it is dominated)
  - However, we can enforce it to be played if the discount factor is high enough

- □ Set strategy  $s_1 = (M, L, G, G, G)$  for player A and similarly,  $s_2 = (m, \ell, g, g, g)$  for player B
- In other words, both players are adopting a strategy described as "In stage 1, I mum.
   Then if the first outcome is (M,m) I play loner, otherwise I play gang"
- □ Such a joint strategy  $(s_1, s_2)$  is a SPE if the discount factor  $\delta$  is "high enough" (see later)

- **Proof.** Clearly no player wants to deviate in the second stage. They also always play a NE in each subgame. Thus, if  $(s_1, s_2)$  gives a NE in the whole game we prove that it is an SPE
- We need to check whether in stage 1,
   s<sub>1</sub> is a best response to s<sub>2</sub>
  - All that s<sub>1</sub> does in stage 1 is to play M
  - $\mathbf{u}_{1}(\mathbf{M}, \mathbf{s}_{2}) = 4 + 0 \delta$  ,  $\mathbf{u}_{1}(\mathbf{F}, \mathbf{s}_{2}) = 5 3 \delta$
  - M is a best response if  $4 > 5 3\delta \rightarrow \delta \ge \frac{1}{3}$

#### Comment

- Strategic connection is possible if the last stage has multiple NEs that are considerably different: a "stick" and a "carrot"
- So, the SPE is created as follows:
  - Play desired non-NE action in the first stage
  - Reward opponents with carrot if they do the same
  - Otherwise... threaten opponents with stick!

#### Comment

- $\blacksquare$  The value  $\delta$  relates to credibility of threats
  - For example, if  $\delta = 0$ , the players do not care about the future; thus, threatening punishment with stick  $\rightarrow$  non credible
- Effective punishment if short-term gains are not worth compared to long-term losses
  - $\blacksquare$  Note that the latter are weighted on  $\delta$
- The example shown is complex enough to apply the theorems

- The carrot-and-stick procedure can work to create a SPE where the first move is whatever
  - For example, we can create a SPE that supports the initial play of (F, m)
  - the rest of the strategy is identical: friendly NE if all players comply, gang NE otherwise)
  - However, Bob may complain (if he does not, Al also keeps quiet!). Bob likes this SPE if

$$u_2(s_1, m) = -1 + 0 \delta$$
,  $u_2(s_1, m) = 1 - 3 \delta \rightarrow \delta \ge \frac{2}{3}$  (higher discount factor is needed)

- Does Prisoner-Revenge capture everything?
  - Deviations were possible only at stage 1
  - Stage 2 is the last: players must have a NE there
- One may wonder what happens if more stages are present
  - Maybe if the game is five-stage, they may want to deviate from their gameplay at stage 1 and 3, but not individually
- Check the one-stage deviation principle

- Principle used in constrained optimization
   however, backward induction is the same!
- □ A strategy  $s_i$  is **optimal** if there is no way to improve it for every information set  $h_i$ 
  - I.e., no  $s_i$ ' and  $h_i$  for which  $u_i(s_i', h_i) > u_i(s_i, h_i)$
- □ A strategy  $s_i$  is **one-stage unimprovable** if there is no way to improve it by changing an action done in a given information set  $h_i$

- □ Denying  $u_i(s_i', h_i) > u_i(s_i, h_i)$  implies:
  - $\square$  if  $s_i$  is generic: the strategy is optimal
  - $\square$  if  $s_i$ ' is very similar to  $s_i$ , just changes an action: the strategy is one-stage unimprovable
- □ Clearly optimum ⇒ one-stage unimprovable
  - Interestingly, also the converse statement is true
- Theorem 4. A one-stage unimprovable strategy must be optimal

- For simplicity: proof by contradiction
  - assume  $s_i$  is 1-step unimprovable but not optimal: then it exists  $s_i$ ' that deviates in 2 steps or more
  - $\blacksquare$  if  $s_i$ ' deviates from  $s_i$  under information set  $h_i$ , it must have a finite number of "deviations" that differentiate it: take the **last** of them
  - take the subgame starting at that point (if not a singleton, take the first parent node that is)
  - in this subgame, there is a single deviation improving the payoff of player  $i \rightarrow$  contradiction