

## Foundations of Game Theory for Electrical and Computer Engineering

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Let's solve prisoners' dilemma!

#### **REPEATED GAMES**

# Introduction

- We focus on a class of games with several interactions, i.e., **Repeated Game**
- Our ultimate goal is to model and solve the problem of prisoners' dilemma with a repeated interaction, examples include
  - Several *real life situations* such as, friendship, marriage, and wars.
  - Engineering Applications such as, multiple access protocols in wireless communications, packet forwarding, and jamming.

# **A Brief Reminder**

- A Nash Equilibrium (s<sub>1</sub>\*,s<sub>2</sub>\*,...,s<sub>N</sub>\*) is a Sub-Game Perfect Nash Equilibrium (SPNE) if it induces a Nash Equilibrium in every sub-game of the game
- We looked for the Nash equilibria in each of the sub-games, roll the payoffs back up, and then see what the optimal moves are higher up the tree (e.g., Mixed NE in the BoS Game)

## The War of Attrition

- 2-Player game
- In each period of the game each chooses Fight
  (F) or Quit (Q)
  - I. If the other player quits first, you win a prize  $\mathbf{V}$
  - 2. Each period in which both **F**, each player pays cost **-c**
  - 3. If both quit at once they get **0**

(Repeated TDMA Transmission)

 Example: First World War, The Battle for Broadband [IEEE Spectrum, 2005]

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# **Two Period Game**



#### **Assumptions:**

- > We now focus on a two stage game
- > Later we will play it for infinite stages
- $\succ$  We assume that v > c

## **Analysis of the Second Sub-game**



- Two Pure-Strategy NE in this sub-game
  - (F(2),q(2)) and (Q(2),f(2))
  - Payoffs are (V,0) and (0,V)
- Note that c (sunk costs) does not matter!

#### Roll the Payoffs Back Up to the First Sub-Game





For **(F(2),q(2))** in stage 2 (tomorrow) The NE is: (F(1),q(1))

	В		
	f(1)	q(1)	
F(1)	-c+0,-c+V	V,0	
Q(1)	0,V	0,0	

For **(Q(2),f(2))** in stage 2 (tomorrow) The NE is (Q(1),f(1))

# Pure Strategy SPNE (V>c)

- Two SPNE (Fighter vs Quitter)
  - -[(F(1),F(2)),(q(1),q(2))]
  - -[(Q(1),Q(2)),(f(1),f(2))]
- Main Lesson: If we know I am going to win tomorrow, then I win today
- Our first intuition: Rational players should involve fights in NE, but here one only involves to fight and other quits!
- What did we miss?

#### Second Sub-game Analysis <u>Mixed Strategy NE</u> f(2) B q(2)



- If A Fights → -cp + V(1-p)
- If A Quits  $\rightarrow$  0p + 0(1-p)

 $V(1-p) = pc \rightarrow p=V/(V+c)$  and 1-p = c/(V+c)

- Mixed NE has both fight with probability = V/(V+c)
- Payoffs in this mixed NE = (0,0)
- Probability of fight **increases** in **V** and **decreases** in **c**

## Roll the Payoffs Back Up to the First Sub-Game





# Conclusions

- When we rolled back, the matrix is the same as the second game (last sub-game)
- Same payoff matrix, so ...
- Both Fights with p=V/(V+c) → Mixed SPE [(p\*, p\*),(p\*, p\*)]
  → Expected payoff is 0
- We end up fighting in each game with probability of  $p^*$  (in infinite horizon)



## **And Solution!**



- $\diamond$  Assume that we play in Stage "n" = 659870
- $\diamond$  If mix in future then the continuation value is (0,0)
- ♦ This game is already analyzed (solved for mixed)
- $\Rightarrow$  Both mix with F with p<sup>\*</sup> = V/(V+c)
- $\diamond$  And the fight will continue ....

# **Probability of Continued Fight**



Long fight between rational players

# Take away Messages

- We could sustain fighting by players that were **rational in a war of attrition.** 
  - Break the analysis up into what we might call "stage games"
  - Break the payoffs up into: the payoffs that are associated with that stage and
    - Payoffs that are associated with the past (they're sunk, so they don't really matter)
    - Payoffs that are going to come in the future from future equilibrium play

#### **REPEATED PRISONERS' DILEMMA**

#### Relationships are Repeated Not Contractual

• Friendship

- If you are nice to me I will nice to you

Nations Relationships

– Visa issues

- Exchange goods and Services
  - Change fruit with petrol

# Why Repeated Interactions?

In ongoing relationships the promise of **future rewards** and the **threat of future punishments** may sometimes provide **incentives** for **good behavior today** 

Good News: Repeated interaction might get us out of prisoners' dilemma

#### **Prisoners' Dilemma**



#### Let's Play This Game Repeatedly!

# **Repeated Solution**

- The game at the last stage is just a simple Prisoners' Dilemma
- Then player should defect
- We put payoffs of tomorrow in the game of today and we have

		В		
		Соор	Defect	
	Соор	2+0,2+0	-1+0,3+0	
Α	Defect	3+0,-1+0	0+0,0+0	

# **Repeated Solution**

- It is again a PD game and we have again unraveling from back
- The problem is not solved!!!!

# **Example:**

• Lame Duck Effect



 However, even a Finite game has Let's discuss an example



# **Another Example**

	A	В	C
Α	4,4	0,5	0,0
В	5 <i>,</i> 0	1,1	0,0
C	0,0	0,0	3,3

- We play twice
- We would like to sustain (A,A) Cooperation
- But (A,A) is not a NE in one-shot game
- The NE are (B,B) and (C,C)
  - There are some Mixed NE, but let's focus on pure NE
  - → We cannot sustain (A,A) in period 2

# **New Strategy**

- Play A, then:
  - Play C if (A,A) was played
  - Play B otherwise
- Pay attention to information sets
  - It says what to do in all I+9 information sets (we are fine!)
- Question: Is this a SPNE?
- Or can we sustain Nash behavior in all subgames?

# **Repeated Analysis**

- For each activity in the first period we make a new sub-game
- In period 2:
  - After (A,A) this strategy induces (C,C)
    - Which is a NE<sup>©</sup>
  - After the other choices in period I, this strategy induces (B,B)
    - Which is a NE<sup>(2)</sup>

We are fine with all subgames after the first move (i.e., 9 subgames)

# What about the Whole Game?

• In the whole game:

 $-A \rightarrow u(A,A) + u(C,C) = 4 + 3 = 7$ 

- If Defect (an obvious defection, check the rest at home<sup>(i)</sup>):

•  $B \rightarrow u (B,A) + u (B,B) = 5 + I = 6$ 

Temptation to defect (cheat) today ≤ (Value of rewards <u>tomorrow</u> – Value of punishment <u>tomorrow</u>)

 $5 - 4 \le 3 - 1 \rightarrow 1 \le 2$ 

 $\rightarrow$  Temptation is outweighed by the difference between the value of the reward and the value of the punishment

#### **Important Lesson**

If a "Stage Game" has more than one NE, then we **may be able** to use the prospect of playing different equilibria tomorrow to **provide incentives** (rewards and punishments) **for cooperating today** 

## **A Brief Comment!**

- There may be a problem of renegotiation
  - Between two stages they negotiate to switch to
    (C,C) → Then there is no incentive to cooperate in the first stage!
  - E.g., 2008 crisis (bail out or bankruptcy)

# **Repeated Prisoners' Dilemma**



- Each round we toss a coin twice and decide to follow the game or not
- Main difference: We do not know the end

# **Grim Trigger Strategy**



- The game continue with probability of  $\delta$  (toss a coin two times)
- Play C then
  - Play C if no one has played D
  - Play D otherwise

# Is it NE?

- Temptation to defect (cheat) <u>today</u> ≤ (Value of rewards <u>tomorrow</u> – Value of punishment <u>tomorrow</u>)
- $3-2 \leq \delta$  (u(C,C) forever u (D,D) forever)
- >Why  $\delta$ ?
  - Because the game may end
  - You need money today!

#### Is it NE?

# $3-2 \leq \delta$ (u(C,C) forever – u (D,D) forever)

#### > u(D,D) forever = 0 > u(C,C) forever = 2 + 2 $\delta$ + 2 $\delta$ <sup>2</sup>+ 2 $\delta$ <sup>3</sup>+ ... = 2/(1- $\delta$ )

#### Is it NE?

- Is Grim Trigger a Nash Equilibrium?
  - $| \leq [2/(1-\delta)-0] \delta$
  - $\delta \geq 1/3$

# **Any other NE?**

- What about playing D now, then C, then D forever?
- (D,C), (C,D), (D,D), (D,D), ...
- $u = 3 + (-1) \delta + 0 + 0 + 0 + ... = 3 \delta$
- It is even worse comparing to all D after the first D (D,D,D,...)

#### Punishment (D,D) forever is a SPNE

# Lesson

# We can get cooperation in Prisoner's Dilemma using the Grim Trigger Strategy (as a SPNE) provided $\delta \ge 1/3$

# **General Lesson**

For an ongoing relationship to provide incentives for good behavior today, it helps for there to be a <u>high probability that</u> <u>the relationship will continue</u> (weight you put on the future)

## **One Period Punishment**

- Play C to start, then
  - -Play C if either (C,C) or (D,D) were played last
  - Play D if either (C,D) or (D,C) were played last

#### Is this a SPNE?

Temptation to defect (cheat) today ≤
 (Value of promise <u>tomorrow</u> – Value of the threat
 <u>tomorrow</u>)

 $3-2 \leq [(2 \text{ "forever"}) - (value of "0" for tomorrow and then "2" forever starting the next day)] <math>\delta$ 

$$3-2 \leq [2/(1-\delta) - 2\delta/(1-\delta)] \delta$$

 $\frac{1}{2} \leq \delta$ 

Shorter punishments need more weight (  $\delta$  ) on future

#### **The Repeated Forwarder's Dilemma**



# **NE in Finite Repeated FD**

In the finite-horizon Repeated Forwarder's Dilemma, the strategy profile (All-D,All-D) is a Nash equilibrium.

# Payoffs in the Repeated Game FD

- Finite-horizon vs. infinite-horizon games
- Myopic vs. long-sighted repeated game

myopic: 
$$\overline{u}_i = u_i (t+1)$$
  
long-sighted finite:  $\overline{u}_i = \sum_{t=0}^T u_i (t)$   
long-sighted infinite:  $\overline{u}_i = \sum_{t=0}^\infty u_i (t)$   
payoff with discounting:  $\overline{u}_i = \sum_{t=0}^\infty u_i (t) \cdot \delta^t$ 

 $0 < \delta \leq 1$  is the discounting factor

#### **Strategies in the Repeated Game FD**

• usually, history-1 strategies, based on different inputs:

- others' behavior:  $m_i(t+1) = s_i[m_{-i}(t)]$ 

- others' and own behavior:  $m_i(t+1) = s_i[m_i(t), m_{-i}(t)]$ - payoff:  $m_i(t+1) = s_i[u_i(t)]$ 

Example strategies in the Forwarder's Dilemma:

Blue (t)	initial move	F	D	strategy name
Green (t+1)	F	F	F	AIIC
	F	F	D	Tit-For-Tat (TFT)
	D	D	D	AIID
	F	D	F	Anti-TFT

# Analysis of the Repeated Forwarder's Dilemma (1/3)

Infinite game with discounting:  $\overline{u}_i = \sum_{i=0}^{t} u_i(t) \cdot \delta^t$ 

Blue strategy	Green strategy	Blue utility	Green utility
AIID	AIID	0	0
AIID	TFT	1	-C
AIID	AIIC	1/(1-δ)	-c/(1-δ)
AIIC	AIIC	(1-c)/(1-δ)	(1-c)/(1-δ)
AIIC	TFT	(1-c)/(1-δ)	(1-c)/(1-δ)
TFT	TFT	(1-c)/(1-δ)	(1-c)/(1-δ)

#### **Discount Factor Interpretation:**

- I. The player cares more about the near term payoff than in the long term payoff
- 2. The player has no preferences, but the game ends with probability of 1-  $\delta\,$  in each stage

### Analysis of the

#### **Repeated Forwarder's Dilemma (2/3)**

Blue strategy	Green strategy	Blue utility	Green utility
AIID	AIID	0	0
AIID	TFT	1	-C
AIID	AIIC	1/(1-δ)	-c/(1-δ)
AIIC	AIIC	<b>(1-c)/(1-</b> δ)	(1-c)/(1-δ)
AllC	TFT	<b>(1-c)/(1-</b> δ)	(1-c)/(1-δ)
TFT	TFT	(1-c)/(1-δ)	(1-c)/(1-δ)

- AllC receives a high payoff with itself and TFT, but
- AllD exploits AllC
- AllD performs poor with itself
- TFT performs well with AllC and itself, and
- TFT retaliates the defection of AIID

TFT is the best strategy if  $\delta$  is high enough!

#### **NE in Infinite Repeated FD**

In the Repeated Forwarder's Dilemma, if both players play AlID, it is a Nash equilibrium.

# **NE in Infinite Repeated FD**

In the Repeated Forwarder's Dilemma, both players playing TFT is a Nash equilibrium (if  $\delta > c$ ).

#### **Sketch of Proof:**

If one deviate in stage t, then its payoff is:  $(I - \delta) [(I + \delta + \delta^2 ... + \delta^{t-1})(I - c) + \delta^t] =$  $I - c + \delta^t (c - \delta) \rightarrow$ 

Hence if " $\delta > c$ " there is no temptation to deviate

Or (i.e., other approach):  $I - (I - c) \le \delta (u(C, C) \text{ forever} - u (D, D) \text{ forever})$  $c \le \delta ((1-c)/(1-\delta) - 0) \rightarrow \delta > c$ 

#### **Pareto-optimal in Repeated FD**

The Nash equilibrium  $s_{Blue} = TFT$  and  $s_{Green} = TFT$  is Pareto-optimal (but  $s_{Blue} = AIID$  and  $s_{Green} = AIID$  is not) !

#### **Sketch of Proof:**

There is no way for a player to go above his normalized payoff of I-c without hurting his opponent's payoff

Formal Definition!

#### EQUILIBRIUM IN INFINITE REPEATED GAME

#### **Minmax Value**

The minmax value is the lowest stage payoff that the opponents of player *i* can force him to obtain with punishments, provided that *i* plays the best response against them.

$$\underline{u_i} = \min_{s_{-i}} \left[ \max_{s_i} u_i(s_i, s_{-i}) \right]$$

#### **Enforceable Payoff Profile**

A payoff profile  $u = (u_1, u_2, ..., u_n)$  is enforceable if  $u_i \ge \underline{u_i}$ 

## **Feasible Payoff Profile**

In n-player game G=(N,S,u), a payoff profile u is **feasible** if there exist rational, non-negative values  $\alpha_j$  such that for all j, we can express  $u_i$  as  $\sum_{j \in |S|} \alpha_j u_i(j)$ , with  $\sum_{j \in S} \alpha_j = 1$ .

# **Example of Feasible Profile**



- (1,1) is a feasible payoff given that we assign 0.5 to the strategy profile over diagonal.
- (2,2) is not feasible

#### Theorem

Player i's normalized payoff is at least equal to Minmax value in any Nash equilibrium of the infinitely repeated game, regardless of the level of the discount factor

**Intuition:** a player playing All-D will obtain a (normalized) payoff of at least 0

#### **Folk Theorem**

#### (Infinitely Repeated Game with Average Rewards)

Consider any n-player game G and any payoff vector  $(u_1, u_2, \ldots, u_n)$ .

- I. If u is the payoff in any Nash equilibrium of the infinitely repeated G with average rewards, then for each player  $i, u_i$  is enforceable.
- 2. If u is both feasible and enforceable, then u is the payoff in **some Nash equilibrium** of the infinitely repeated G with average rewards.

#### **Folk Theorem**

#### **Infinitely Repeated Game with discounting Factor**

For every feasible payoff vector  $u = \{u_i\}_i$  with  $u_i > \underline{u}_i$  (i.e., it is enforceable as well), there exists a discounting factor  $\underline{\delta} < 1$ , such that for all  $\underline{\delta} < \delta < 1$ , there is a Nash equilibrium with payoff u.

#### Feasible Payoffs in the Repeated Forwarder's Dilemma



Note that  $p_i$  can obtain at least his minmax value in any stage (*enforceable payoffs are always* higher than the minmax payoff)

# Intuition and Example!

If the game is long enough, the gain obtained by a player by deviating once is outweighed by the loss in every subsequent period, when loss is due to the punishment (minmax) strategy of the other players.

**Example:** In infinite repeated FD, a player is deterred from deviating, because the short term gain obtained by the deviation (1 instead of 1-c) is outweighed by the risk of being minmaxed (for example using the Trigger strategy) by the other player (provided that  $c < \delta$ ).