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## Algorithmic Game Theory and Mechanism Design (Graphical Games)

Joint work with mentor Rian Neogi

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#### Introduction

- What is Algorithmic Game Theory and Mechanism Design?
  - Mathematical study of games
  - Found applications in analyzing systems involving strategic agents.
  - eg. Prisoner's dilemma, eBay auctions
- Purpose

Develop an efficient algorithm to compute a Nash Equilibrium for cyclic graphical games.

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### Multiplayer Games

- ightharpoonup n players
- Each player has
  - A finite set of actions
  - Specifications of payoffs
- ightharpoonup Define **joint action**  $\vec{a}$  as the action vector denoting actions by all n players
- eg. For rock paper scissors, a joint action between two players could be (rock, rock)

## Payoff Matrix

- Each player i has a payoff matrix that is indexed by the joint actions of all the players.
- $lacktriangledown M_i(ec{a})$  is the payoff to player i resulting from  $ec{a}$
- We'll assume that  $M_i(\vec{a})$  lies in the interval [0, 1]

#### Player One

Table: Payoff Matrix

#### Player One

Player Two

Actions	Rock	Paper	Scissor
Rock	1/2, 1/2	1, 0	0, 1
Paper	0, 1	1/2, 1/2	1, 0
Scissor	1, 0	0, 1	1/2, 1/2

Table: Payoff Matrix

## Pure vs Mixed Strategies

- Actions like Rock, Paper, Scissor are called **pure strategies**
- Mixed strategies are given by probabilities
  - ie. There is a 40% probability that I will play rock, a 50% probability that I will play paper, a 10% probability that I will play scissor
- For pure strategies, the best payoff I can get is 0
  - When I play Rock, my opponent can change their strategy to be Paper.

#### Player One

Player Two

Actions	Rock	Paper	Scissor
Rock	1/2, 1/2	1, 0	0, 1
Paper	0, 1	1/2, 1/2	1, 0
Scissor	1, 0	0, 1	1/2, 1/2

Table: Payoff Matrix

## Pure vs Mixed Strategies

However, I can get a better payoff if I use a mixed strategy

- Instead of playing just one of rock, paper, or scissor, I play all of them with a probability of 1/3
- Then if my opponent plays rock, my payoff becomes 1/3\*1/2+1/3\*1+1/3\*0=1/2
- ▶ We get the same calculation if my opponent plays paper or scissor.

## Pure vs Mixed Strategies (Formally)

- ▶ To keep things simple, assume that there are binary actions {0, 1}
- For a player i, a mixed strategy is the probability  $p_i \in [0,1]$  that player i will play 0
- ightharpoonup A joint mixed strategy is given by a probability vector  $\vec{p}$
- ▶ The **expected payoff** to player i is denoted as  $M_i(\vec{p}) = E_{\vec{a} \sim \vec{p}} M_i(\vec{a})$ , where  $\vec{a} \sim \vec{p}$  indicates that each  $a_j$  is 0 with probability  $p_j$  and 1 with probability  $1 p_j$  independently

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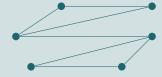
#### Nash Equilibrium

- A Nash equilibrium for the game is a mixed strategy  $\vec{p}$  such that for any player i,  $p_i$  is a **best response** to the rest of  $\vec{p}$ .
- ie. player i cannot improve their expected payoff by deviating from the Nash equilibrium  $\vec{p}$  by playing an alternate strategy  $p_i'$

#### Nash Theorem

For any game using mixed strategies, there exists a Nash Equilibrium.

## **Graphical Games**

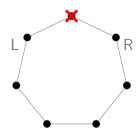


- Every player is represented by a node on the graph
- ▶ Player *i*'s payoff is only dependent on their neighbours' actions

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## TreeNash (Foundation)

- Algorithm TreeNash for computing NE of tree graphical games [Kearns, 2007]
- using dynamic programming



## Nash Equilibrium for Cycle

**Input:** Cycle graphical game G**Output:** Nash equilibrium  $(a^*, \phi_q)$ 

1. Initialize:

Define 
$$A = \left\{ \frac{1}{\epsilon}, \frac{2}{\epsilon}, \dots, 1 \right\}$$
.

2. Iterate:

For each  $a \in A$ :

- Modify payoffs:  $R \to M_{R,a}, \quad L \to M_{L,a}$ .
- Compute Nash equilibrium for  $G_a$ .
- 3. Check Best Response:

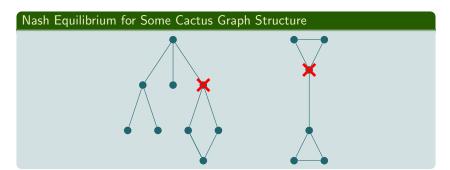
Find  $a^*$  such that it is the best response for player N against  $\phi_q$ .

4. **Output:** Return  $(a^*, \phi_q)$ .

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## Cactus Graph

A connected graph in which every edge belongs to at most one simple cycle.



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#### Conclusion

- Key Achievement Developed an algorithm to compute Nash Equilibrium (NE) for cyclic graphs in polynomial time.
- Limitations & Future Work

  Currently, the algorithm is limited to certain cyclic structures.

  In the future, we aim to extend this approach to compute NE for cactus graphs in polynomial time.

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#### References

Michael Kearns. Graphical games. *Algorithmic Game Theory*, pages 159 – 180, 2007.