

بِسْمِ اللّٰهِ الرَّحْمٰنِ الرَّحِيْمِ

# Algorithmic Game Theory

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# The Investment Game

- **The players:** you
- **The strategies:** each of you chose between investing nothing in a class project (\$0) or invest (\$10)
- **Payoffs:**
  - If you don't invest your payoff is \$0
  - If you invest you're going to make a net profit of \$5. This however requires more than 90% of the class to invest. Otherwise, you loose \$10
- **No communication!**

# The Investment Game

- What did you do?
  - Who invested?
  - Who did not invest?
- What is the NE in this game?

# The Investment Game

- There are **2 NE** in this game
  - All invest
  - None invest
- Let's check:
  - If everyone invests, none would have **regrets**, and indeed the BR would be to invest
  - If nobody invests, then the BR would be to not invest

# The Investment Game

- How did we find the NE?
  - I. We could have checked rigorously what everyone's best response would be in each case
  2. We can just guess and check!
- Actually, **checking is easy, guessing is hard**
  - What does this remind you? Can you tell anything about the complexity of finding a NE?
- Note: checking is easy when you have many players but few strategies

# The Investment Game

- What did you do in this game?
- Players: you
- Strategies: Not Invest (\$0) or Invest \$10
- Payoffs:
  - If no invest  $\rightarrow \$0$
  - If invest \$10  $\rightarrow \begin{cases} \$5 \text{ net profit if } \geq 90\% \text{ invest} \\ -\$10 \text{ net profit if } < 90\% \text{ invest} \end{cases}$

# The Investment Game

- I want you to play the game again, no communication please!!
- What did you do?
  - Who did invest?
  - Who did not invest?
- I want you to play again...
- Where are we going to?

# The Investment Game

- We are **heading toward an equilibrium**  
→ There are certain cases in which playing converges in a natural sense to an equilibrium
- But we're going towards only one of the two equilibria!
- Is any of these two NE better than the other?

# The Investment Game

- Clearly, everyone investing is a better NE
- Nevertheless we were converging very rapidly to a bad equilibrium, where no one gets anything, in which all money is left on the table!
- How can that be?

# The Investment Game

- Formally, we say that one NE ***pareto dominates*** the other
- Why did we end up going to a bad equilibrium?

# The Investment Game

- Remember when we started playing?
  - We were more or less 50 % investing
- The starting point was already bad for the people who invested for them to lose confidence
- Then we just tumbled down
- What would have happened if we started with 95% of the class investing?

# The Investment Game

- Note also the process of converging towards the “bad” equilibrium
  - It coincides with the **idea of a self-fulfilling prediction**
- Provided you think other people are not going to invest, you are not going to invest

# **The Investment Game**

- Does this game belong to the Prisoners' Dilemma family?
- Was there any strictly dominated strategy?

## **Coordination Game**

# The Investment Game

- Why is this a coordination game?
- We'd like everyone to coordinate their actions and invest
- There are a lot of **coordination problems in real life**
  - Examples?

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# **Coordination Games**

A Trusted Third Party (TTP)  
could drive the crowd to  
a better equilibrium!

# Coordination Games

- Let's try to compare this to the Prisoners' Dilemma
- In that case, even the presence of a TTP would not help, because the strategy  $\beta$  would be still dominated and people would chose  $\alpha$  no matter!
- So why a TTP works in coordination games?

# Happy New Year!



# Coordination Games

- In coordination games **communication helps!**
- Indeed, a TTP is not going to impose players to adopt a strictly dominated strategy, but is just leading the crowd towards a better NE point
- In the **PD game**, you **need to change the payoff** of the game to move people's actions

# Coordination Game

		Player 2	
		I	r
Player 1		U	1,1      0,0
		D	0,0      1,1

- Clearly in this game what matters is coordination
- If you played this game, it is quite likely you would end-up being uncoordinated
- A little bit of leadership would make sure you coordinate

# Coordination Game

## Strategic Complements

- **Investment game:** the more people invest the more likely you are to invest
- **Partnership game:** the more the other person does, the more likely for me to do more

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# The Battle of the Sexes

## Going to the Movies

		Player 2			
		M	N	P	
Player 1		M	2,1	0,0	0,-1
		N	0,0	1,2	0,-1
		P	-1,0	-1,0	-2,-2

- The “Going to the Movies” game
- A pair is meeting at the movies and have to decide which movies to watch
- How would you play this game?

# Going to the Movies

		Player 2			
		M	N	P	
Player 1		M	2,1	0,0	0,-1
		N	0,0	1,2	0,-1
		P	-1,0	-1,0	-2,-2

- Are there any dominated strategies?
- If so, how is the game transformed?

# Going to the Movies

		Player 2	
		M	N
Player 1	M	2,1	0,0
	N	0,0	1,2

- How do we play this game?
- Let's try it out: form a pair, write down what you would do, **without showing!!**

# Going to the Movies

		Player 2	
		M	N
Player 1	M	2,1	0,0
	N	0,0	1,2

- Which kind of game is this?
- Does communication help here?
- Let's find the Nash Equilibrium of this game

# Going to the Movies

		Player 2	
		M	N
Player 1	M	2,1	0,0
	N	0,0	1,2

		Player 2	
		I	r
Player 1	U	1,1	0,0
	D	0,0	1,1

- NE: (M,M) and (N,N)
- So it looks like a standard coordination game, with two NE
- What is the trick here?

# Coordination Games

- **Pure coordination games:** there is no conflict whether one NE is better than the other
    - E.g.: in the investment game, we all agreed that the NE with everyone investing was a “better” NE
  - **General coordination games:** there is a source of conflict as players would agree to coordinate, but one NE is “better” for a player and not for the other
    - E.g.:The Battle of the Sexes
- Communication might fail in this case

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# Two-person Zero-sum Games

- One of the first games studied
  - most well understood type of game
- Players interest are strictly opposed
  - what one player gains the other loses
  - game matrix has single entry (**i.e., gain to player I**)
- Intuitive solution concept
  - players maximize gains

# Analyzing the Game

- Player 1 maximizes matrix entry, while player 2 minimizes

		Player 2				
		A	B	C	D	
Player 1		A	12	-1	1	0
B	3	1	3	-18		
	5	2	4	3		
D	-16	1	2	-1		

Strictly  
dominated  
strategy  
(dominated by C)

Strictly  
dominated  
strategy  
(dominated by B)

# Solving the Game

- Iterated removal of strictly dominated strategies

		Player 2		
		L	M	R
		T	2	-1
Player I	B	3	2	3

- m Player I cannot remove any strategy (neither T or B dominates the other)
- m Player 2 can remove strategy R (dominated by M)
- m Player I can remove strategy T (dominated by B)
- m Player 2 can remove strategy L (dominated by M)
- m **Solution:** (B, M)
  - payoff of 2

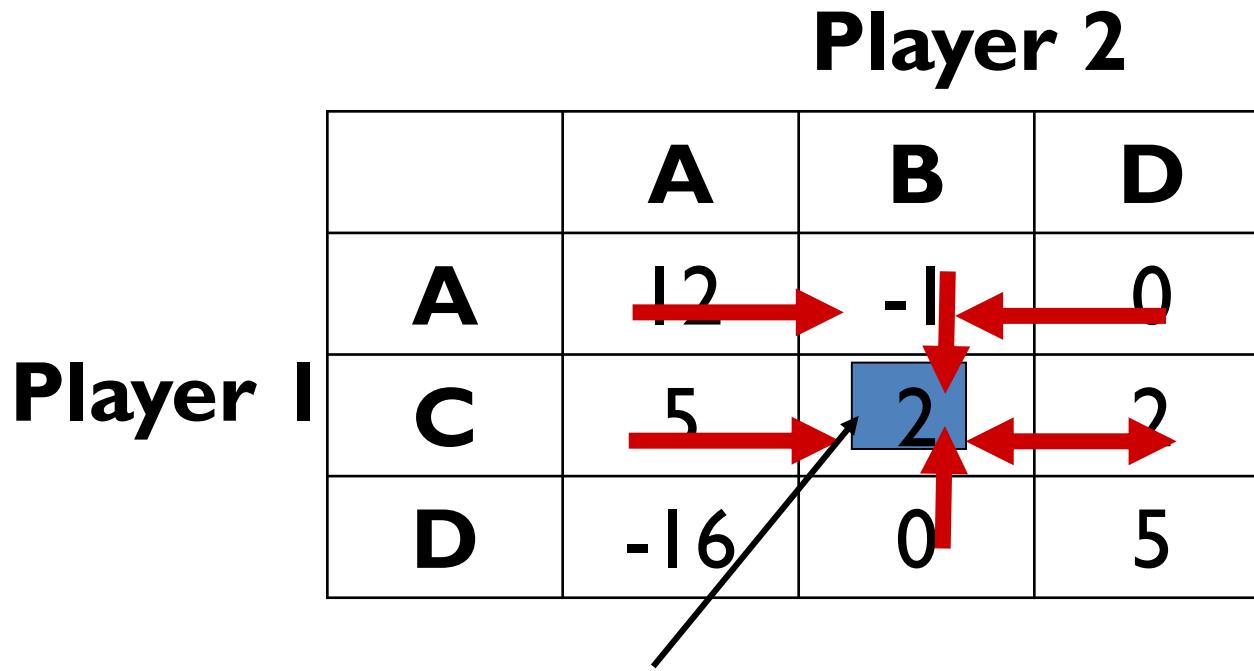
# Solving the Game

- Removal of strictly dominated strategies does not always work
- Consider the game

		Player 2		
		A	B	D
Player 1		A	12	-1
C	5	2	2	
D	-16	0	5	

- Strictly dominated strategy cannot help!
- Requires another solution concept

# Analyzing the Game



Outcome (C, B) seems  
“stable”

m saddle point of game

# Saddle Points

- An outcome is a *saddle point* if it is both less than or equal to any value in its row and greater than or equal to any value in its column
- Saddle Point Principle
  - Players should choose outcomes that are saddle points of the game
- Value of the game
  - value of saddle point outcome if it exists

# Why Play Saddle Points?

		Player 2		
		A	B	D
Player 1		A	12	-1
C	5	2	2	2
	-16	0		5

- If player 1 believes player 2 will play B
  - player 1 should play best response to B (which is C)
- If player 2 believes player 1 will play C
  - player 2 should play best response to C (which is B)

# Solving the Game (min-max algorithm)

		Player 2					
		A	B	C	D		
Player 1		A	4	3	2	5	2
B		-10	2	0	-1		-10
C		7	5	1	3		1
D		0	8	-4	-5		-5
		7	8	2	5		

- choose maximum entry in each column
- choose the minimum among these
- this is the minimax value
- choose minimum entry in each row
- choose the maximum among these
- this is maximin value

if minimax == maximin, then this is the saddle point of game

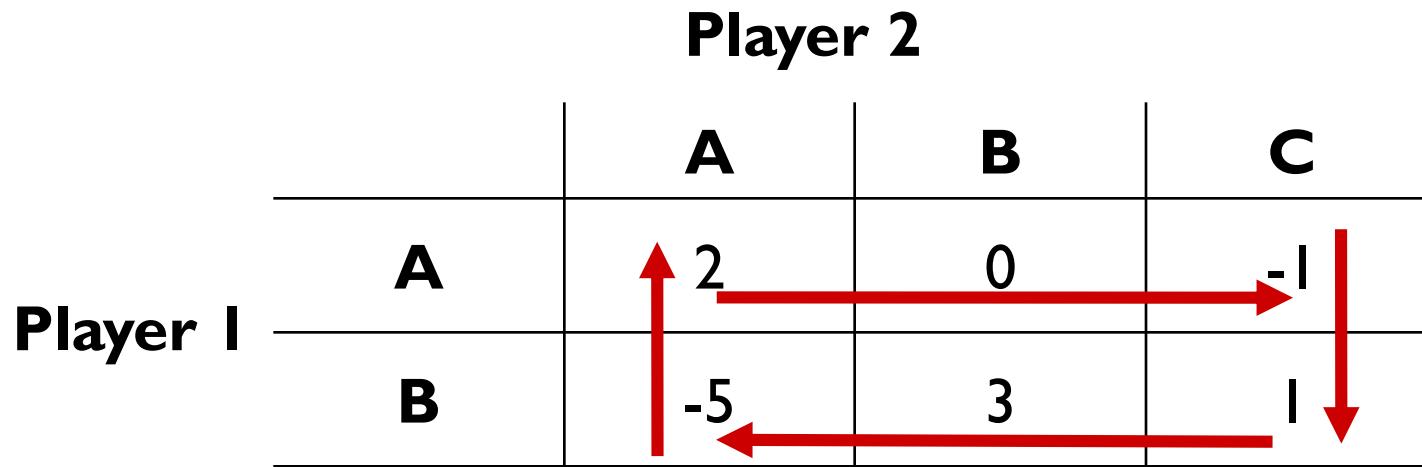
# Multiple Saddle Points

- In general, game can have multiple saddle points

		Player 2					
		A	B	C	D		
Player 1		A	3	2	2	5	2
		B	2	-10	0	-1	
		C	5	2	2	3	2
		D	8	0	-4	-5	-5
		8	2	2	5		

- Same payoff in *every* saddle point
  - ✧ unique value of the game
- Strategies are interchangeable
  - ✧ Example: strategies (A, B) and (C, C) are saddle points
  - ✧ Then (A, C) and (C, B) are also saddle points

# Games With no Saddle Points



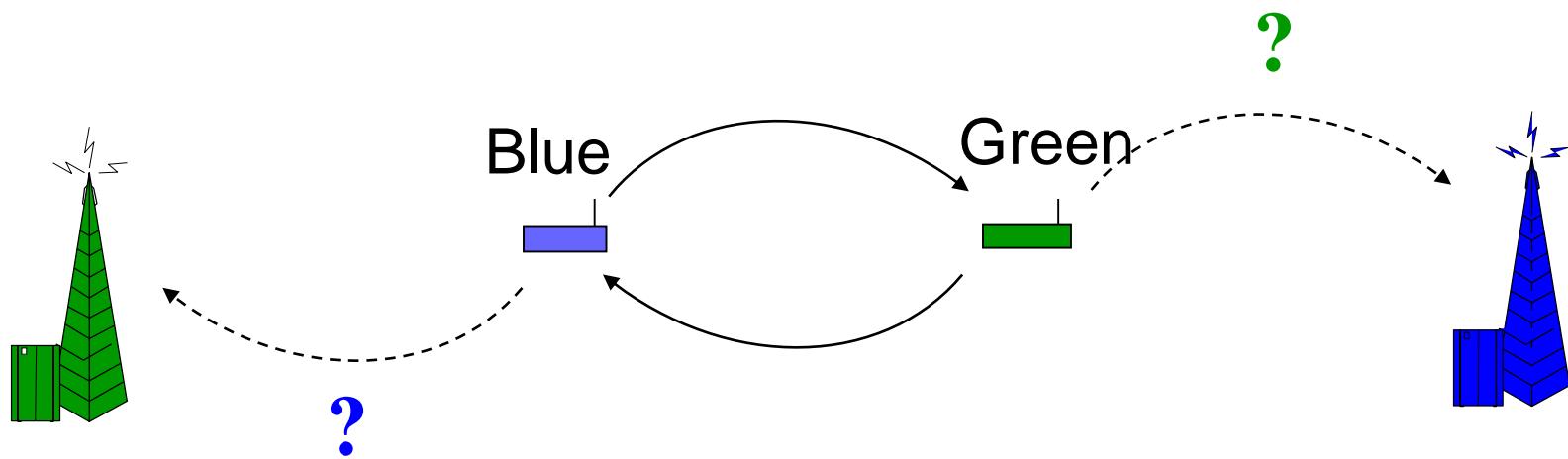
- What should players do?
  - resort to randomness to select strategies

Wait we will get back to this!

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# The Forwarder's Dilemma



# Forwarder Game

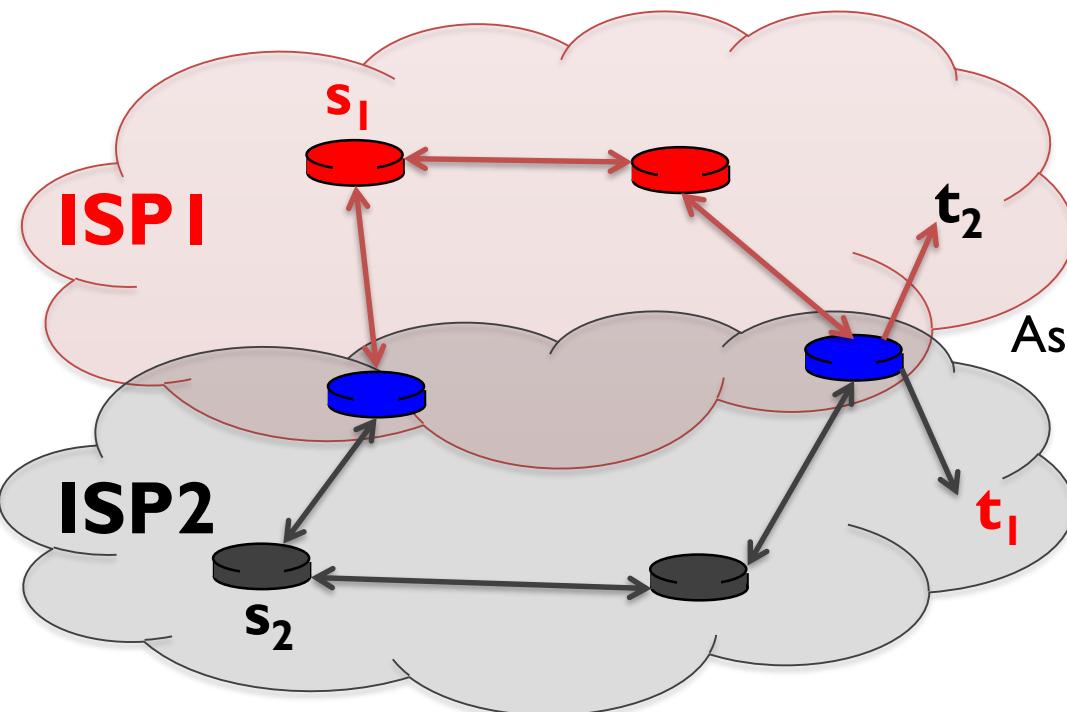
- users controlling the devices are *rational* = try to maximize their benefit

	Green	
	Blue	
Forward	Forward	Drop
Drop	(1-c, 1-c)	(-c, 1)
	(1, -c)	(0, 0)

- Reward for packet reaching the destination: 1
- Cost of packet forwarding: c ( $0 < c \ll 1$ )

(Drop , Drop) is NE

# ISP Routing Games

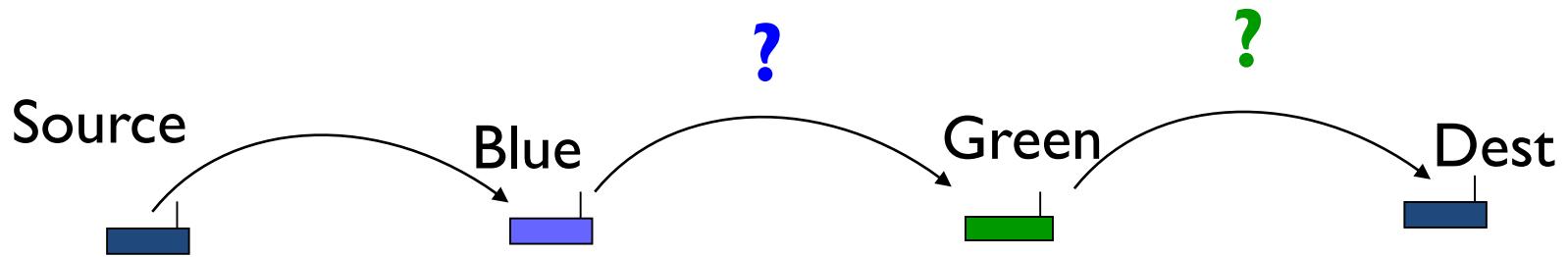


Assume that the unit cost along a link is 1

	ISP2	Hot Potato	Cooperate
ISP1	Hot Potato	(-5, -5)	(-2, -6)
Cooperate	(-6, -2)	(-3, -3)	

(Hot Potato, Hot Potato) is NE

# The Joint Packet Forwarding Game

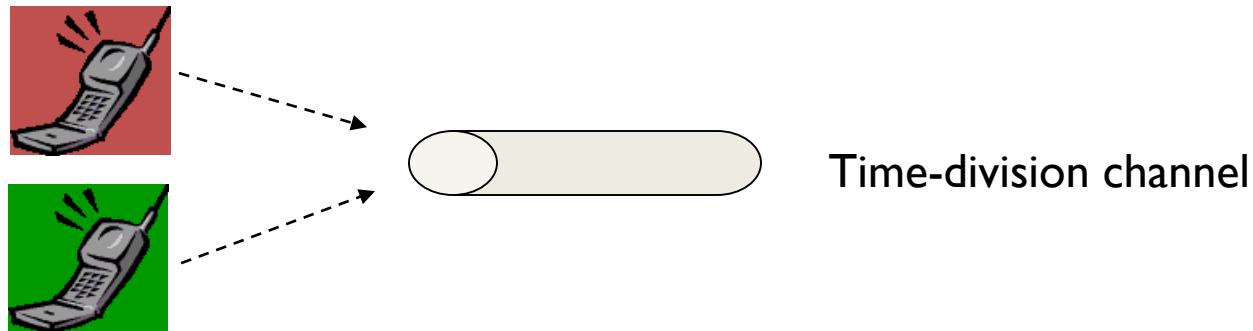


- Reward for packet reaching the destination:  $I$
- Cost of packet forwarding:  $c$  ( $0 < c \ll I$ )

	Green	Forward	Drop
Blue	Forward	$(1-c, 1-c)$	$(-c, 0)$
Drop	Forward	$(0, 0)$	$(0, 0)$

(Forward , Forward) and (Drop , Drop) are NE

# The Multiple Access game



Reward for successful transmission:  $I$

Cost of transmission:  $c$   
 $(0 < c \ll I)$

	Green	Quiet	Transmit
Blue	(0, 0)	(0, 1- $c$ )	
Quiet	(1- $c$ , 0)		(- $c$ , - $c$ )
Transmit			

**There is no strictly dominating strategy**

(Transmit , Quiet) and (Quiet , Transmit) are NE