

## An Intro to Game Theory

15-451    Avrim Blum    12/02/03

## Plan for Today

- 2-Player Zero-Sum Games (matrix games)
  - Minimax optimal strategies
- General-Sum Games (bimatrix games)
  - notion of Nash Equilibrium
- Proof of existence of Nash Equilibria
  - using Brouwer's fixed-point theorem
- do FCEs at end...

test material  
not test material

## 2-Player Zero-Sum games

- Two players R and C. Zero-sum means that what's good for one is bad for the other.
- Game defined by matrix with a row for each of R's options and a column for each of C's options. Matrix tells who wins how much.
- E.g., matching pennies / penalty shot / hide-a-coin:

		Left	Right	
	Left	(-1,1)	(1,-1)	shooter wins and goalie loses
	Right	(1,-1)	(-1,1)	
shooter loses and goalie wins				

## An algorithmic example

Sorting three items (A,B,C):

- Compare two of them. Then compare 3<sup>rd</sup> to larger of 1<sup>st</sup> two. If we're lucky it's larger, else need one more comparison.

	largest is: C	B	A	← adversary
(A,B) first	2	3	3	(payoff to adversary)
(A,C) first	3	2	3	
(B,C) first	3	3	2	

## Minimax-optimal strategies

- Minimax optimal strategy is a (randomized) strategy that has the best worst-case expected gain. [maximizes the minimum]
- I.e., it's the thing to play if your opponent knows you well.
- Same as our notion of a randomized strategy with a good worst-case bound.

## Minimax-optimal strategies

Sorting three items (A,B,C): Compare two of them. Then compare 3<sup>rd</sup> to larger of 1<sup>st</sup> two. Minimax optimal cost is  $2 + (2/3)$ .

	largest is: C	B	A	← adversary
(A,B) first	2	3	3	(payoff to adversary)
(A,C) first	3	2	3	
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### Minimax-optimal strategies

- E.g., matching pennies / penalty shot / hide-a-coin

	Left	Right
Left	(-1,1)	(1,-1)
Right	(1,-1)	(-1,1)

Minimax optimal for both players is 50/50. Gives expected gain of 0. Any other is worse.

### Minimax-optimal strategies

- E.g., penalty shot with goalie who's weaker on the left.

	Left	Right
Left	(0,0)	(1,-1)
Right	(1,-1)	(-1,1)

Minimax optimal for both players is (2/3,1/3). Gives expected gain 1/3. Any other is worse.

### Minimax Theorem (von Neumann 1928)

- Every 2-player zero sum game has a unique value  $V$ .
- Minimax optimal strategy for  $R$  guarantees  $R$ 's expected gain at least  $V$ .
- Minimax optimal strategy for  $C$  guarantees  $R$ 's expected gain at most  $V$ .

Counterintuitive: against an optimal opponent, it doesn't hurt to reveal your randomized strategy. (Borel had proved for symmetric 5x5 but thought was false for larger games)

### Matrix games and Algorithms

- Gives a useful way of thinking about guarantees on algorithms.
- Think of rows as different algorithms, columns as different possible inputs.
- $M(i,j)$  = cost of algorithm  $i$  on input  $j$ .  
Of course matrix is HUGE. But helpful conceptually.

### Matrix games and Algs

- What is a deterministic alg with a good worst-case guarantee?
  - A row that does well against all columns.
- What is a lower bound for deterministic algorithms?
  - Showing that for each row  $i$  there exists a column  $j$  such that  $M(i,j)$  is bad.
- How to give lower bound for randomized algs?
  - Give randomized strategy for adversary that is bad for all  $i$ .

	Adversary
Alg player	

### E.g., hashing

- Rows are different hash functions.
- Cols are different sets of items to hash.
- $M(i,j)$  = #collisions incurred by alg  $i$  on set  $j$ .  
[alg is trying to minimize]
- For any row, can reverse-engineer a bad column.
- Universal hashing is a randomized strategy for row player.

	Adversary
Alg player	

### One more example

1-card poker in a 3-card deck {J, Q, K}:

	[FP,FP,CB]	[FP,CP,CB]	[FB,FP,CB]	[FB,CP,CB]
[PF,PF,PC]				
[PF,PF,B]				
[PF,PC,PC]				
[PF,PC,B]				
[B,PF,PC]				
[B,PF,B]				
[B,PC,PC]				
[B,PC,B]				

### Minimax-optimal strategy

- Minimax optimal for 1<sup>st</sup> player is:
  - If hold J, then 5/6 PassFold and 1/6 Bet.
  - If hold Q, then 1/2 PassFold and 1/2 PassCall.
  - If hold K, then 1/2 PassCall and 1/2 Bet.
- Note the bluffing and underbidding... (Minimax for 2<sup>nd</sup> player has this too)
- Minimax value of game is -1/18 for 1<sup>st</sup> player and 1/18 for 2<sup>nd</sup>.
- See Chvatal, *Linear Programming*. Chap 15. (Remember can solve for minimax with LP)

### General-sum games

- In general-sum (bimatrix) games, can have win-win and lose-lose situations.
- E.g., "what side of road to drive on?":

	Left	Right
Left	(1,1)	(-1,-1)
Right	(-1,-1)	(1,1)

### General-sum games

- In general-sum (bimatrix) games, can have win-win and lose-lose situations.
- E.g., "which movie should we go to?":

	MatRev	loveactually
MatRev	(8,2)	(0,0)
loveactually	(0,0)	(2,8)

No longer a unique "value" to the game.

### General-sum games

- Economists use as models of interaction.
- E.g., pollution / prisoner's dilemma:
  - (imagine pollution controls cost \$4 and improve everyone's environment by \$3)

	pollute	don't pollute
pollute	(-1,-1)	(2,-2)
don't pollute	(-2,2)	(1,1)

Need to add extra incentives to get desired behavior.

### Nash Equilibrium

- A Nash Equilibrium is a stable pair of strategies (could be randomized).
- Stable means that neither player has incentive to deviate on their own.
- E.g., "what side of road to drive on":

	Left	Right
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NE are: both left, both right, or both 50/50.

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NE are: both MR, both la, or (80/20,20/80)

## Existence of NE

- Nash (1950) proved: any general-sum game must have at least one such equilibrium.
  - Might require randomized strategies (called "mixed strategies")
- This also yields minimax thm as a corollary.
  - Pick some NE and let  $V$  = value to row player in that equilibrium.
  - Since it's a NE, neither player can do better even knowing the (randomized) strategy their opponent is playing.
  - So, they're each playing minimax optimal.

## Existence of NE

- Proof will be non-constructive.
- Unlike case of zero-sum games, we know of no polynomial-time algorithm for finding Nash Equilibria in general-sum games.
- Notation:
  - Assume an  $n \times n$  matrix.
  - Use  $(p_1, \dots, p_n)$  to denote mixed strategy for row player, and  $(q_1, \dots, q_n)$  to denote mixed strategy for column player.

## Proof

- We'll start with Brouwer's fixed point theorem.
  - Let  $S$  be a compact convex region in  $\mathbb{R}^n$  and let  $f: S \rightarrow S$  be a continuous function.
  - Then there must exist  $x \in S$  such that  $f(x)=x$ .
  - $x$  is called a "fixed point" of  $f$ .
- Simple case:  $S$  is the interval  $[0,1]$ .
- We will care about:
  - $S = \{(p,q): p,q \text{ are legal probability distributions on } 1, \dots, n\}$ . I.e.,  $S = \text{simplex}_n \times \text{simplex}_n$

## Proof (cont)

- $S = \{(p,q): p,q \text{ are mixed strategies}\}$ .
- Want to define  $f(p,q) = (p',q')$  such that:
  - $f$  is continuous. This means that changing  $p$  or  $q$  a little bit shouldn't cause  $p'$  or  $q'$  to change a lot.
  - Any fixed point of  $f$  is a Nash Equilibrium.

## Try #1

- What about  $f(p,q) = (p',q')$  where  $p'$  is best response to  $q$ , and  $q'$  is best response to  $p$ ?
- Problem: not continuous:
  - E.g., matching pennies. If  $p = (0.51, 0.49)$  then  $q' = (1,0)$ . If  $p = (0.49, 0.51)$  then  $q' = (0,1)$ .

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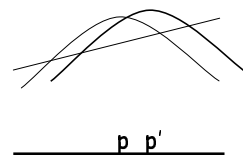
### Try #1

- What about  $f(p,q) = (p',q')$  where  $p'$  is best response to  $q$ , and  $q'$  is best response to  $p$ ?
- Problem: also not necessarily well-defined:
  - E.g., if  $p = (0.5,0.5)$  then  $q'$  could be anything.

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### Instead we will use...

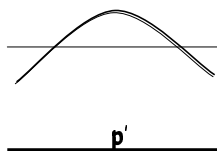
- $f(p,q) = (p',q')$  such that:
  - $q'$  maximizes [(expected gain wrt  $p$ ) -  $\|q-q'\|^2$ ]
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Note: quadratic + linear = quadratic.

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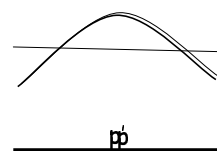
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- $f(p,q) = (p',q')$  such that:
  - $q'$  maximizes [(expected gain wrt  $p$ ) -  $\|q-q'\|^2$ ]
  - $p'$  maximizes [(expected gain wrt  $q$ ) -  $\|p-p'\|^2$ ]
- $f$  is well-defined and continuous since quadratic has unique maximum and small change to  $p,q$  only moves this a little.
- Also fixed point = NE. (even if tiny incentive to move, will move little bit).
- So, that's it!