3.1 — Mixed Strategies
ECON 316 • Game Theory • Fall 2021
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Outline

When Pure Strategies Won't Work

MSNE in Constant Sum Games

Coordination Games: PSNE and MSNE













Oskar Morgenstern

1902—1977

"Sherlock Holmes, pursued by his opponent, Moriarty, leaves London for Dover. The train stops at a station on the way, and he alights there rather than travelling on to Dover. He has seen Moriarty at the railway station, recognizes that he is very clever and expects that Moriarty will take a faster special train in order to catch him in Dover. Holmes's anticipation turns out to be correct. But what if Moriarty had been still more clever, had estimated Holmes's mental abilities better and had foreseen his actions accordingly? Then, obviously, he would have travelled to the intermediate station [Canterbury]. Holmes again would have had to calculate that, and he himself would have decided to go on to Dover. Whereupon, Moriarty would again have 'reacted' differently," (p.173-4).





"All that I have to say has already crossed your mind,' said he. 'Then possibly my answer has crossed yours,' I replied. 'You stand fast?' 'Absolutely.'"

— Arthur Conan Doyle, 1893, *The Final Problem*









Expected Value



• Expected value of a random variable X, written E(X) (and sometimes μ), is the long-run average value of X "expected" after many repetitions

$$E(X) = \sum_{i=1}^{k} p_i x_i$$

•
$$E(X) = p_1 x_1 + p_2 x_2 + \dots + p_k x_k$$

- A **probability-weighted average** of *X*, with each possible *X* value, *x_i*, weighted by its associated probability *p_i*
- Also called the "mean" or "expectation" of X, always denoted either E(X) or μ_X



Example: Suppose you lend your friend \$100 at 10% interest. If the loan is repaid, you receive \$110. You estimate that your friend is 99% likely to repay, but there is a default risk of 1% where you get nothing. What is the expected value of repayment?

Mixed Strategies

- **Pure strategy**: is a complete strategy profile that a player will play
 - Recall, strategy is a list of choices player will take at every possible decision node
- Mixed strategy is a probability distribution over a strategy profile
 - Plays a variety of pure strategies according to probabilities





Mixed Strategies

- The logic of mixed strategies is best understood in the context of repeated constant-sum games
- If you play one strategy repeatedly (i.e. a pure strategy), your opponent can exploit your (predictable) strategy with their best response
- You want to "keep your opponent guessing"





Mixed Strategy Nash Equilibrium

- We have already seen Nash equilibrium in pure strategies (PSNE)
- Nash (1950) proved that any *n*-player game with a finite number of pure strategies has at least one equilibrium
 - A game may have no PSNE, but there will always be a unique mixed strategy Nash equilibrium (MSNE)
 - Games may have *both* pure and a mixed NE



Mixed Strategy Nash Equilibrium

- Finding this is relatively straightforward with two players and two strategies
- 1. Let *p* be the probability of one player playing one of their available strategies
 - Let (1-p) be the probability of that player playing their other available strategy
- 2. Let *q* be the probability of the other player playing one of their available strategies
 - Let (1-q) be the probability of that player playing their other available strategy
- There exists some (*p*,*q*) mix that is a Nash equilibrium in mixed strategies





• Consider the following game between a **Kicker** and a **Goalie** during a penalty kick



- Consider the following game between a **Kicker** and a **Goalie** during a penalty kick
- A constant sum game (in this case, zerosum)
 - If both choose same direction, Goalie
 blocks goal
 - If both choose different directions,
 Kicker gets goal





- Palacios-Huerta (2003) calculated average success rates in English, Spanish, & Italian leagues (1995-2000)
- If both Kicker and Goalie choose same direction, Kicker's payoff is higher if he chooses his natural side (often Right)

Palacios-Huerta, Ignacio, 2003, "Professionals Play Minimax," *Review of Economic Studies* 70(2): 395–415





- This game has no Nash equilibrium in pure strategies (PSNE)
 - From any outcome, at least one player would prefer to switch strategies
 - No outcome has *all* players playing a best response





- What if **Kicker** were to **randomize** strategies
 - Say 50% of the time, Kick Left, 50% of the time, Kick Right
- Let p be probability that Kicker plays
 Kick Left

 $\circ p = 0.50$

GoalieDive LeftDive RightKick Left5895425Kick Right9370730



• Then Goalie wants to maximize his expected payoff, given Kicker plays Kick Left with p = 0.50





- Then Goalie wants to maximize his expected payoff, given Kicker plays Kick Left with p = 0.50
- If **Goalie** plays Dive Left:

 $\mathbb{E}[\text{Dive Left}] = 42(p) + 7(1-p)$ = 42(0.50) + 7(1 - 0.50)

• He can **expect** to earn 24.5





- Then Goalie wants to maximize his expected payoff, given Kicker plays Kick Left with p = 0.50
- If **Goalie** plays Dive Right:

 $\mathbb{E}[\text{Dive Right}] = 5(p) + 30(1-p)$ = 5(0.50) + 30(1 - 0.50)

• He can **expect** to earn 17.5





- Then Goalie wants to maximize his expected payoff, given Kicker plays Kick Left with p = 0.50
- Goalie will play Dive Left to maximize his expected payoff (24.5 ≻ 17.5)



- Now consider **Kicker**'s **expected** payoff under this mixed strategy
- Since **Goalie** will Dive Left to maximize his expected payoff, **Kicker** can expect to earn:

$$58(p) + 93(1 - p)$$

$$58(0.50) + 93(1 - 0.50)$$

$$75.5$$

• **Goalie** playing Dive Left holds **Kicker**'s expected payoff down to 75.5





The Minimax Theorem

- In constant sum games, note that even in mixed strategies, one player increases their own (expected) payoff by pulling down the other player's (expected) payoff!
- In this game, even expected payoffs always sum to 100
 - Kicker's $\mathbb{E}[\pi] = 75.5$
 - \circ Goalie's $\mathbb{E}[\pi] = 24.5$





The Minimax Theorem



- von Neumann & Morgenstern's minimax theorem (simplified): in a 2-person, constant sum game, each player maximizes their own expected payoff by minimizing their opponent's expected payoff
- The name **"minimax"** is a popular strategy in games, trying to minimize the risk of your maximum possible loss

Penalty Kicks: 50:50?

- **Kicker**'s "randomizing" 50:50 (Kick Left, Kick Right) was not random enough!
- **Goalie** recognizing this pattern can exploit it and hold down **Kicker**'s expected payoff
- **Kicker** can do better by picking a better *p* (and similarly, so can **Goalie**)
 - Hint: if Goalie knew Kicker's p before
 Goalie chose, would he have a clearly
 better choice of Dive Left vs. Dive
 Right?





The Opponent Indifference Principle

- Want to find the optimal probability mix that leaves your opponent(s) *indifferent* between their strategies to respond
- In constant sum games (i.e. sports, board games, etc)
 - Making your opponent indifferent ⇒
 minimizing your opponent's ability to
 recognize & exploit patterns in your actions
- This principle is the same in non-constant sum games too!
- Implies game is played repeatedly
- Not always intuitive, but a simple principle



- We want to find **Kicker**'s optimal mixed strategy that leaves **Goalie** indifferent between his (pure) strategies
- Suppose **Kicker** plays Kick Left with probability p





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- We want to find Kicker's optimal mixed strategy that leaves Goalie indifferent between his (pure) strategies
- Suppose Kicker plays Kick Left with probability p
- Goalie's expected payoff of playing Dive Left: 42p+7(1-p)
- **Goalie**'s expected payoff of playing Dive Right: 5p+30(1-p)
- What value of p would make **Goalie** indifferent between Dive Left and Dive Right?
 - i.e. $\mathbb{E}[Left] = \mathbb{E}[Right]$





Kicker's Optimal Choice of p, Graphically







Kicker's Optimal Choice of p: Algebraically

• Find value of p that equates **Goalie**'s expected payoff of Dive Left and Dive Right:

 $\mathbb{E}[Left] = \mathbb{E}[Right]$ $\mathbb{E}[42p + 7(1-p)] = \mathbb{E}[5p + 30(1-p)]$

• $p^{\star} = 0.383$

- Kicker plays Kick Left with p = 0.383 and Kick Right with 1 p = 0.617
 - \circ Goalie's expected payoff of Dive Left: $42(0.383) + 7(0.617) \approx 20.41$
 - Goalie's expected payoff of Dive Right: $5(0.383) + 30(0.617) \approx 20.41$

Goalie's Optimal Choice of q

- We want to find Goalie's optimal mixed strategy that leaves Kicker indifferent between his (pure) strategies
- Suppose Goalie plays Dive Left with probability
 q


Goalie's Optimal Choice of q

- We want to find Goalie's optimal mixed strategy that leaves Kicker indifferent between his (pure) strategies
- Suppose Goalie plays Dive Left with probability
 q
- **Kicker**'s expected payoff of playing Dive Left: 58q+95(1-q)





Goalie's Optimal Choice of q

- We want to find Goalie's optimal mixed strategy that leaves Kicker indifferent between his (pure) strategies
- Suppose Goalie plays Dive Left with probability
 q
- **Kicker**'s expected payoff of playing Dive Left: 58q+95(1-q)
- Kicker's expected payoff of playing Dive Right: 93q+70(1-q)





Goalie's Optimal Choice of q

- We want to find Goalie's optimal mixed strategy that leaves Kicker indifferent between his (pure) strategies
- Suppose Goalie plays Dive Left with probability
 q
- **Kicker**'s expected payoff of playing Dive Left: 58q+95(1-q)
- Kicker's expected payoff of playing Dive Right: 93q+70(1-q)
- What value of p would make **Kicker** indifferent between Kick Left and Kick Right?

• i.e. $\mathbb{E}[Left] = \mathbb{E}[Right]$





Goalies's Optimal Choice of q, Graphically





Goalie's Optimal Choice of q: Algebraically

• Find value of **q** that equates **Kicker**'s expected payoff of **Kick Left** and **Kick Right**:

 $\mathbb{E}[Left] = \mathbb{E}[Right]$ $\mathbb{E}[58q + 95(1-q)] = \mathbb{E}[93q + 70(1-q)]$

• $q^{\star} = 0.417$

- Goalie plays Dive Left with q=0.417 and Dive Right with 1-q=0.583
 - Kicker's expected payoff of Kick Left: $58(0.417) + 95(0.583) \approx 79.57$
 - Kicker's expected payoff of Kick Right: $93(0.417) + 70(0.583) \approx 79.57$



- Goalie is indifferent between Dive Left and Dive Right when Kicker plays Kick Left with p=0.383
- Kicker is indifferent between Kick Left and Kick Right when Goalie plays Dive Left with q=0.417





- Goalie is indifferent between Dive Left and Dive Right when Kicker plays Kick Left with p=0.383
- Kicker is indifferent between Kick Left and Kick Right when Goalie plays Dive Left with q=0.417
- Mixed Strategy Nash Equilibrium (MSNE):
 (p, q) = (0.383, 0.417)





- Goalie is indifferent between Dive Left and Dive Right when Kicker plays Kick Left with p=0.383
- Kicker is indifferent between Kick Left and Kick Right when Goalie plays Dive Left with q=0.417
- Mixed Strategy Nash Equilibrium (MSNE):
 (p, q) = (0.383, 0.417)
 - **Kicker**'s expected payoff: 79.57
 - **Goalie**'s expected payoff: 20.41
 - $\circ~$ Note they sum to 1!





- p = pr(Kicker kicks Left)
- q = pr(Goalie dives Left)



- p = pr(Kicker kicks Left)
- q = pr(Goalie dives Left)
- Goalie's Best Response

 $= \begin{cases} Right & \text{if } p < 0.383\\ Indifferent & \text{if } p = 0.383\\ Left & \text{if } p > 0.383 \end{cases}$





- p = pr(Kicker kicks Left)
- q = pr(Goalie dives Left)
- Goalie's Best Response
 - $=\begin{cases} Right & \text{if } p < 0.383\\ Indifferent & \text{if } p = 0.383\\ Left & \text{if } p > 0.383 \end{cases}$
- Kicker's Best Response
 - $=\begin{cases} Left & \text{if } q < 0.417\\ Indifferent & \text{if } q = 0.417\\ Right & \text{if } q > 0.417 \end{cases}$





- p = pr(Kicker kicks Left)
- q = pr(Goalie dives Left)
- Goalie's Best Response

 $=\begin{cases} Right & \text{if } p < 0.383\\ Indifferent & \text{if } p = 0.383\\ Left & \text{if } p > 0.383 \end{cases}$

• Kicker's Best Response

 $=\begin{cases} Left & \text{if } q < 0.417\\ Indifferent & \text{if } q = 0.4173\\ Right & \text{if } q > 0.417 \end{cases}$

 Like any Nash equilibrium, players are playing mutual best responses to each other (probabilistically)





Goalie's Best Reponse (q) to p



 $=\begin{cases} Right & \text{if } p < 0.383\\ Indifferent & \text{if } p = 0.383\\ Left & \text{if } p > 0.383 \end{cases}$

Prob(Goalie Dives Left), q



Kicker's Best Reponse (p) to q



Prob(Kicker Kicks Left), p

• Like any Nash equilibrium, where best response functions intersect



- A two player game with *three* strategies available to each
- Graphically more difficult, but same principle to find MSNE
 - find probabilities that make
 opponent indifferent between their
 responses
- Game is symmetric, so only need to find one player's optimal mixed strategy





- Define for Column:
 - $\circ r = pr(Rock)$
 - p = pr(Paper)
 - $\circ 1 r p = pr(Scissors)$



• Define for Column:

• r = pr(Rock)• p = pr(Paper)• 1 - r - p = pr(Scissors)

• **Column** must choose *r*, *p* that make **Row** indifferent between their strategies





- List the expected payoffs to Row from Column's mix of r, p
- **Row**'s expected payoff must equal for all three strategies
 - So let's take any two and set them equal:

$$2r + p - 1 = p - r$$





- List the expected payoffs to Row from Column's mix of r, p
- **Row**'s expected payoff must equal for all three strategies
 - So let's take any two and set them equal:

$$2r + p - 1 = p - r$$

• $r = \frac{1}{3}$ • $p = \frac{1}{3}$ • $(1 - r - p) = \frac{1}{3}$





• MSNE: each player plays all three strategies with equal probability $\left(\frac{1}{3}\right)$







Coordination Games: PSNE and MSNE

MSNE in Coordination Games

- The necessity of MSNE is easy to see for constant-sum games with no PSNE
- But MSNE also exist for non-constant sum games, and for games with one or more PSNE



- We know an **assurance game** has two PSNE
- Let's solve for MSNE





- Let p = pr(Harry goes to Whitaker)
- Let q = pr(Sally goes to Whitaker)



- Let p = pr(Harry goes to Whitaker)
- Let q = pr(Sally goes to Whitaker)





- Let *p* =pr(Harry goes to Whitaker)
- Let q = pr(Sally goes to Whitaker)

• $p^{\star} = \frac{1}{3}$

- $q^{\star} = \frac{1}{3}$
- MSNE: (p, q) = $(\frac{1}{3}, \frac{1}{3})$





 Calculate expected payoffs to Harry and Sally with (p, q) MSNE





 Calculate expected payoffs to Harry and Sally with (p, q) MSNE

• Harry:
$$\frac{2}{3}$$

• Sally: $\frac{2}{3}$



 Calculate expected payoffs to Harry and Sally with (p, q) MSNE

• Harry: $\frac{2}{3}$ • Sally: $\frac{2}{3}$

- Problem: MSNE is even worse than either PSNE in this game!
 - Significant probability of going to different places
 - Also very fragile, anything >, $<\frac{2}{3}$ reverts to PSNE







• Sally's BR 1.000 Sally's BR PSNE 2 $=\begin{cases} Starbucks & \text{if } p < \frac{1}{3} \\ Indifferent & \text{if } p = \frac{1}{3} \\ Whitaker & \text{if } p > \frac{1}{3} \end{cases}$ Prob(Sally goes to Whitaker), q • Harry's BR $=\begin{cases} Starbucks & \text{if } q < \frac{1}{3} \\ Indifferent & \text{if } q = \frac{1}{3} \\ Whitaker & \text{if } q > \frac{1}{3} \end{cases}$ MSNE 0.333 Harry's BR

PSNE 1

0.333

0.000

1.000

- All intersections of best response functions are Nash equilibria
- Interior solution: MSNE
- Corner solutions: PSNE
 - PSNE are special cases of MSNE where $p \in \{0, 1\}$ and $q \in \{0, 1\}$



- Hawk-Dove/Chicken game: 2 PSNE
- Let's solve for MSNE





- Let p =pr(Row plays Hawk)
- Let q =pr(Column plays Hawk)





- Let p =pr(Row plays Hawk)
- Let q = pr(Column plays Hawk)



- Let p =pr(Row plays Hawk)
- Let q = pr(Column plays Hawk)
- $p^{\star} = 0.5$
- $q^{\star} = 0.5$
- MSNE: (p, q) = (0.5, 0.5)




Calculate expected payoffs to Row and Column with (p, q) MSNE





- Calculate expected payoffs to Row and Column with (p, q) MSNE
 - **Row:** 0.5
 - **Column:** 0.5





- Calculate expected payoffs to Row and Column with (p, q) MSNE
 - **Row:** 0.5
 - **Column:** 0.5
- Expected payoff in MSNE is:
 - better than PSNE when you're a **dove** against a **hawk**
 - worse than PSNE when you're a hawk against a dove





• Column's BR

• Row's BR





Row's BR

PSNE 2

1.0