

# Lecture 6

## Equilibrium and Chance

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## Lecture Outline

- <http://www.youtube.com/watch?v=3EkBuKQEki0>
- Best Responses.
- The “Beautiful Equilibrium”, Nash Equilibrium
  - defining the NE
  - finding NE -examples
  - How many?
  - Are there any?
- Randomizing behavior
  - Motivation
  - explanation
  - computation.
  - examples.

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## Best Responses

- Even in simultaneous move games, it is always worth asking yourself, “For any particular strategy that my rival MIGHT choose, what would I choose to do best against it?”
- For example, even though you do not KNOW your opponent is running the ball, you do want to know that a safety or linebacker blitz is the best defense against it.
- Even though you do not know your opponent is choosing Rock, you want to recognize that Paper is the best strategy against that.

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## Best Responses

- For any particular strategy your opponent has, a best response to that strategy is the strategy that YOU have that yields you the highest payoff when the opponent chooses to play that strategy.
- Best responses are important building blocks in developing an idea of how to play a game.
- They are like a collection of “What if?” statements.
  - What if my rival throws a screen?
  - What if my rival runs a draw?
  - What if my rival throws it deep?
  - etc.

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## Best Responses and Dominant Strategies

- If you have a Dominant strategy then that strategy is a Best Response to ALL of your rival's strategies.
- However, many games do not have Dominant strategies.
- In that case, when you have your collection of best responses, you can start assessing which strategy your opponent is most likely to play, and choose your own strategy accordingly.

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## Computing BRs

|    | C1      | C2     | C3     | C4     |
|----|---------|--------|--------|--------|
| R1 | (1,2)   | (-5,2) | (4,3)  | (3,0)  |
| R2 | (-10,4) | (30,2) | (40,3) | (12,9) |
| R3 | (6,5)   | (9,30) | (3,6)  | (3,7)  |

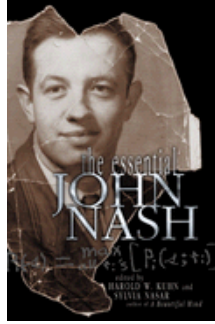
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## A Pricing Game.

|    | BBLearn | 38    | 39    | 40    | 41    | 42    |
|----|---------|-------|-------|-------|-------|-------|
| RE |         |       |       |       |       |       |
| 38 |         | 36720 | 36860 | 36800 | 36540 | 36080 |
| 39 | 36720   | 38160 | 38380 | 39600 | 41040 | 42480 |
| 40 | 38160   | 38380 | 38400 | 38220 | 37840 |       |
| 41 | 36860   | 38380 | 39900 | 41420 | 42940 |       |
| 42 | 39600   | 39900 | 40000 | 39900 | 39600 |       |
|    | 36800   | 38400 | 40000 | 41600 | 43200 |       |
|    | 41040   | 41420 | 41600 | 41580 | 41360 |       |
|    | 36540   | 38220 | 39900 | 41580 | 43260 |       |
|    | 42480   | 42940 | 43200 | 43260 | 43120 |       |
|    | 36080   | 37840 | 39600 | 41360 | 43120 | 7     |

## Using Best Responses

- Suppose your opponent has two strategies (eg. Run or Pass)
- Blitz is a BR to a Run and Cover 2 is a BR to the Pass.
- What should you do?
  - Answer 1: You might just guess that since he ran (say) 30% of the time and passed 70%, then Cover 2.
  - Answer 2: Or you might try to figure out HIS Best Response.
- But how is he going to guess what YOU are going to do?



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- [www.gametheory.net](http://www.gametheory.net)
- <http://mitworld.mit.edu/video/39>
- <http://www.veoh.com/collection/s274425/watch/e107370y6p2Dpwx>
- <http://www.gametheory.net/media/Beautiful.mov>

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## A Nash Equilibrium

- In games that cannot be solved by using dominant strategies or by eliminating dominated strategies, John Nash proposed the following idea
- Look for a profile of strategies of all players all of which are best responses to each other.
- This is known as a Nash Equilibrium:

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## Nash Equilibrium Example

- There are two pure strategy NE. in this game:

|    | C1    | C2    |
|----|-------|-------|
| R1 | (2,3) | (1,2) |
| R2 | (1,0) | (2,5) |

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## Example

- Consider the pricing game example from the book
- B.B. Lean and Rainbow's End are pricing clothing against each other
- as one company lowers its price, it gains more sales both from non buyers and from its rival.
- The next chart shows best responses and how to use them to find the NE.

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## A Pricing Game.

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## The Hunting Game

- Another game from the book is the “coordination” game between Fred and Barney.
- They have to decide on their own what they are going to hunt.
- If their decisions agree, then they will bag a big game, else a rabbit or go hungry.



## The Hunting Game

|        | Stag         | Bison        | Rabbit       |
|--------|--------------|--------------|--------------|
| Stag   | <b>(3,3)</b> | (0,0)        | (0,1)        |
| Bison  | (0,0)        | <b>(3,3)</b> | (0,1)        |
| Rabbit | (1,0)        | (1,0)        | <b>(1,1)</b> |

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## Multiple NE

- There are many NE of this game. Which will they choose?
- Convention? The “Best”
- History
- The role of society and culture.
- Focal Points?
- Location games.

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## The Game of Chicken

- This game has come up in many guises, the most famous is The Rebel but here is a funny one from Footloose.
- <http://www.youtube.com/watch?v=JA1wrvqDRNw>

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## CHICKEN!

|          | Swerve  | Straight  |
|----------|---------|-----------|
| Swerve   | (0,0)   | (-5,10)   |
| Straight | (10,-5) | (-10,-10) |

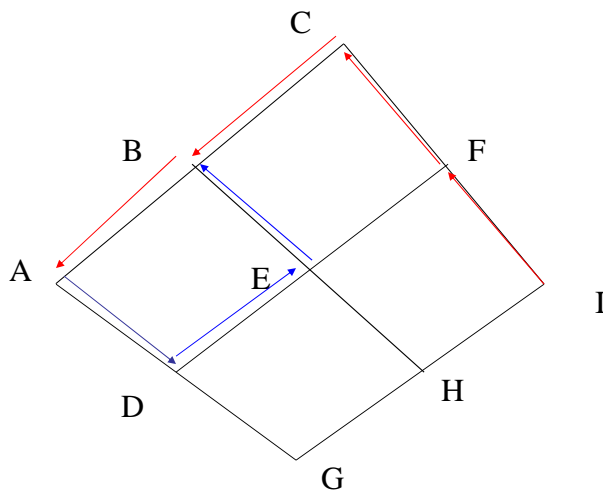
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## Are there always NE?

- Recall the missile game:
- By eliminating dominated strategies we were able to simplify this game significantly
- But we still did not have it completely figured out.

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## The Missile Game



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|    | B1 | B2 | B3 | B4 | B5 | B6 | B7 | B8 |
|----|----|----|----|----|----|----|----|----|
| A1 | H  |    |    |    |    |    |    | H  |
| A2 |    | H  | H  |    | H  | H  | H  | H  |
| A3 |    | H  | H  | H  |    | H  | H  | H  |
| A4 |    | H  | H  | H  | H  | H  | H  | H  |
| A5 |    |    |    | H  | H  |    |    |    |
| A6 |    | H  | H  | H  |    | H  | H  | H  |
| A7 |    | H  | H  | H  |    | H  | H  | H  |
| A8 | H  | H  | H  | H  |    | H  | H  | H  |

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## The Much Simplified Game.

|    | B1 | B5 |
|----|----|----|
| A4 |    | H  |
| A8 | H  |    |

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## Examples

- There are many strategic situations of this type:
- the serve and return part of tennis
- the penalty kick
- <http://www.youtube.com/watch?v=S2iNGFRtLkI>
- most defense and offense in football
- pricing discount games
- Vizzini and the dread pirate Roberts.

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## The Penalty Kick Game

| Goalie<br>Kicker | Left      | Right     |
|------------------|-----------|-----------|
| Left             | (58%,42%) | (95%,5%)  |
| Right            | (93%,7%)  | (70%,30%) |

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## The Penalty Kick Game

- There is no (pure strategy) NE of this game.
- Whenever Kicker chooses left, Goalie wants to choose left, but when Goalie chooses left kicker wants to choose R.
- How might this game be played?
- Note that one player wants to mimic, the other wants to avoid being mimicked.
- Perhaps this can be achieved by “mixing” it up.

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## The Kicker's Viewpoint

- If Kicker always chose L, the goalie would figure this out and drive the kicker to 58% by selecting L.
- If Kicker always chose R, the goalie would figure this out and drive the kicker to 70% by selecting R.
- What if Kicker mixed for starters, say 50-50?

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## The Kicker's Viewpoint

- A 50-50 mix on left or right would give the kicker:
  - $.5*58+.5*93=75.5\%$  if goalie chooses L
  - $.5*95+.5*70=82.5$  if goalie chooses R.
- Both are better than 70 or 58 and it might be reasonable to expect the goalie would choose Left (why?)

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## The Kicker's Viewpoint

- Both are better than 70 or 58 and it might be reasonable to expect the goalie would choose Left (why?)
- Can the Kicker do better than mixing 50-50? What if he chose L 38.3% of the time and R 61.7%?
  - when G goes L, K gets  $.38*58+.62*93=79.6\%$
  - when G goes R, K gets  $.38*95+.62*70=79.6\%$

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## Why Be Unpredictable?

- Notice that Kicker gets the same probability of a goal with L as with R.
- Why bother mixing then? Isn't it too much trouble?
- If Kicker did NOT mix, say chose R with probability 1 (ie for certain), then we know what G would end up doing, (ie R)
- Mixing is the only way Kicker can keep Goalie from copying him and winning.

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## The Mixing Equilibrium

- What about the Goalie?
- Same argument, if G chose one side for sure, the Kicker would choose the opposite.

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## Maximin--Minimax

- Let's look at the Goalie more carefully.
- If Goalie chooses L, the worst case scenario is if K chooses R, and the Goalie loses 93% of the time.
- If Goalie chooses R, the worst case scenario is if K chooses L, and the Goalie loses 95% of the time.
- If Goalie chooses 50-50, the worst case scenario is if K chooses R, and the Goalie loses 81.5% of the time which is better.
- The mix the MINimizes the MAXimum loss for the goalie is Left 41.7% and Right 58.3% yielding a Minimax of 79.6%.

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## MAXimin

- We already computed the mix that MAXimized the MINimum win percent for the goalie as Left (38.3%) and Right (61.7%)=79.6%
- Notice that the Minimax for the goalie is the same as the Maximin for the Kicker
  - This is not an accident
  - This game has the property that every time one player does better, the other does worse.
  - It is a “zero-sum” game.
- In Zero-sum games, the best worst case scenario for one player is the best worst case scenario for the other.
- Other zero sum games: the missile game, Princess Bride, Rock Paper Scissors.

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## MAXimin

- Notice also, that at the Minimax, the goalie has the same probability of success when the Kicker goes Left as when the Kicker goes Right.
- If this were not true, then the goalie would always do better by changing the probabilities of one of her strategies.

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## The Problem with 50-50

- Why not just flip a fair coin?
- The reason 50-50 is not the minimax/maximin solution is because the game is not symmetric.
- The kicker has generally a higher probability of success on the right than on the left.

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## Computing Minimax/Maximin

- There are two ways that the minimax equilibrium can be computed.
- The first is to find the probability mixing for player 1 (say) so that the probability of winning is the same no matter which strategy player 2 uses.
- Then do the same thing for player 2.

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## Computing Minimax/Maximin

- A more useful way is to use a graph. Consider the general type of mixing game

|    | C1         | C2         |
|----|------------|------------|
| R1 | (A, 100-A) | (B, 100-B) |
| R2 | (C, 100-C) | (D, 100-D) |

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## Computing

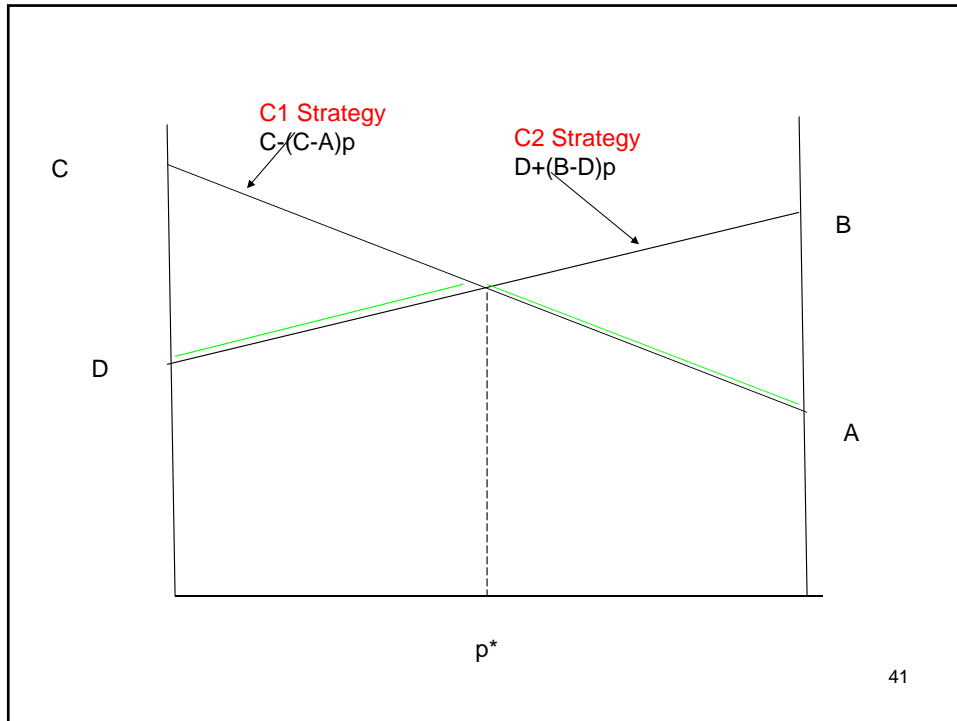
- For this game not to have a pure strategy equilibrium, we need  $C > A$ ,  $B > D$ ,  $100 - A > 100 - B$  (or  $B > A$ ), and  $100 - D > 100 - C$  (or  $C > D$ ).
- Collecting these we get
- $C > A$ ,  $B > A$
- $C > D$ ,  $B > D$

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## Computing

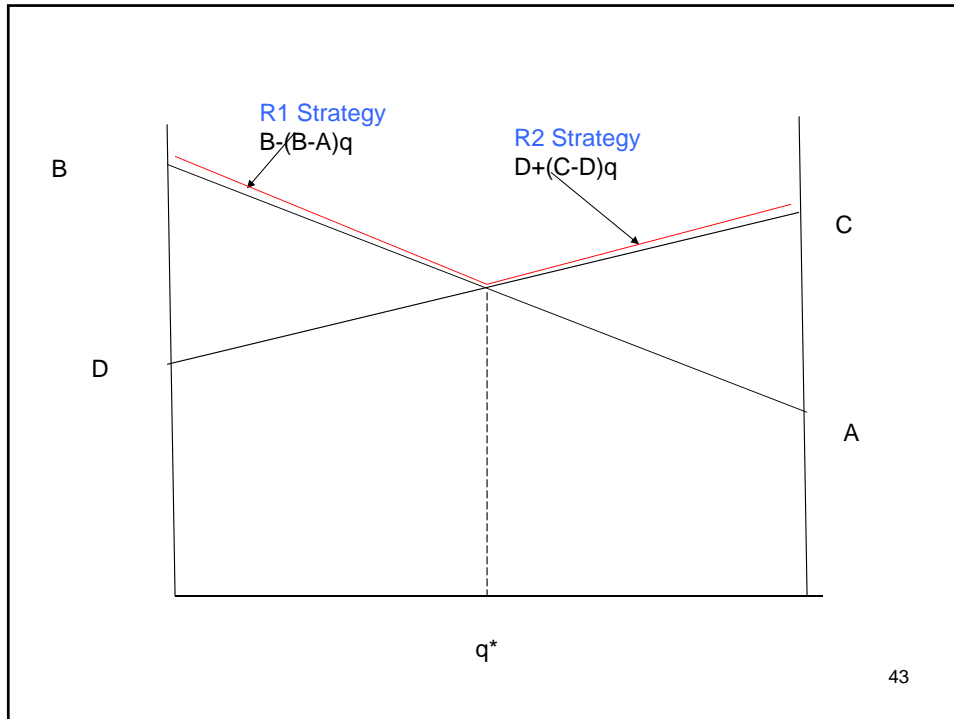
- Suppose row player choose R1 with probability  $p$ .
- Probability of success when Column player chooses C1 is
  - $p \cdot A + (1-p)C$  or  $C - (C-A)p$
- Probability of success when Column player chooses C2 is
  - $p \cdot B + (1-p)D$  or  $D + (B-D)p$
- Graphing these lines we get

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## Computing

- Similarly, suppose column player choose C1 with probability  $q$ .
- Probability of success (of ROW) when Row player chooses R1 is
  - $q^*A + (1-q)B$  or  $B - (B-A)q$
- Probability of success (of ROW) when Row player chooses R2 is
  - $q^*C + (1-q)D$  or  $D + (C-D)q$
- The red line shows the maximum probability (which is the worst case for column).
- The kink is at the lowest worst case, with probability mix  $q^*$



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## Computing Minimax/Maximin

- Recall the PK game:

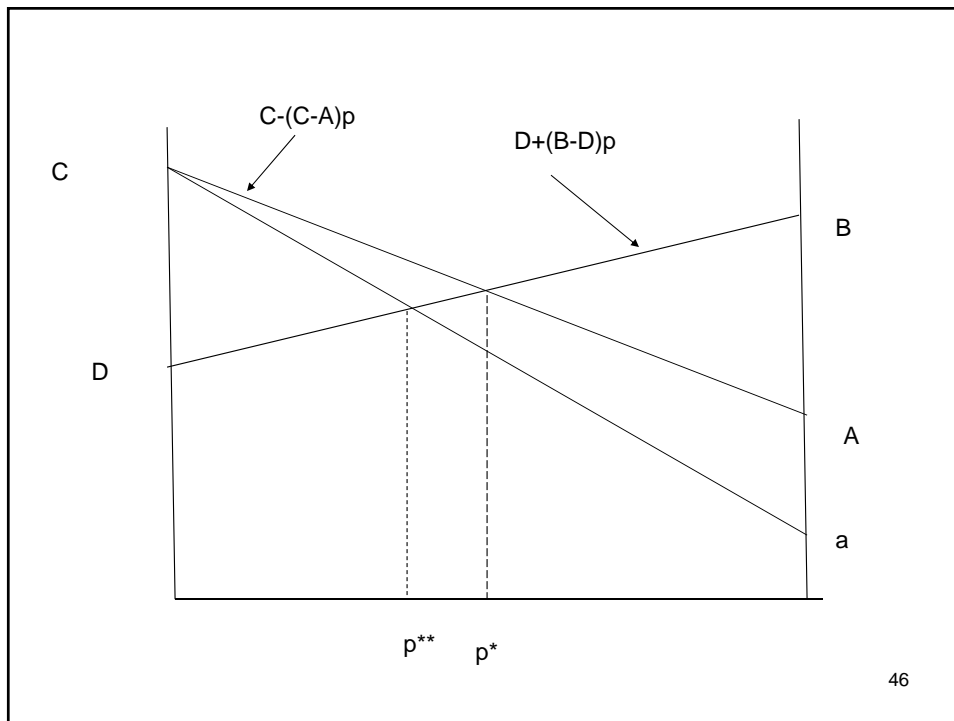
|    | C1          | C2          |
|----|-------------|-------------|
| R1 | (A=58%,42%) | (B=95%,5%)  |
| R2 | (C=93%,7%)  | (D=70%,30%) |

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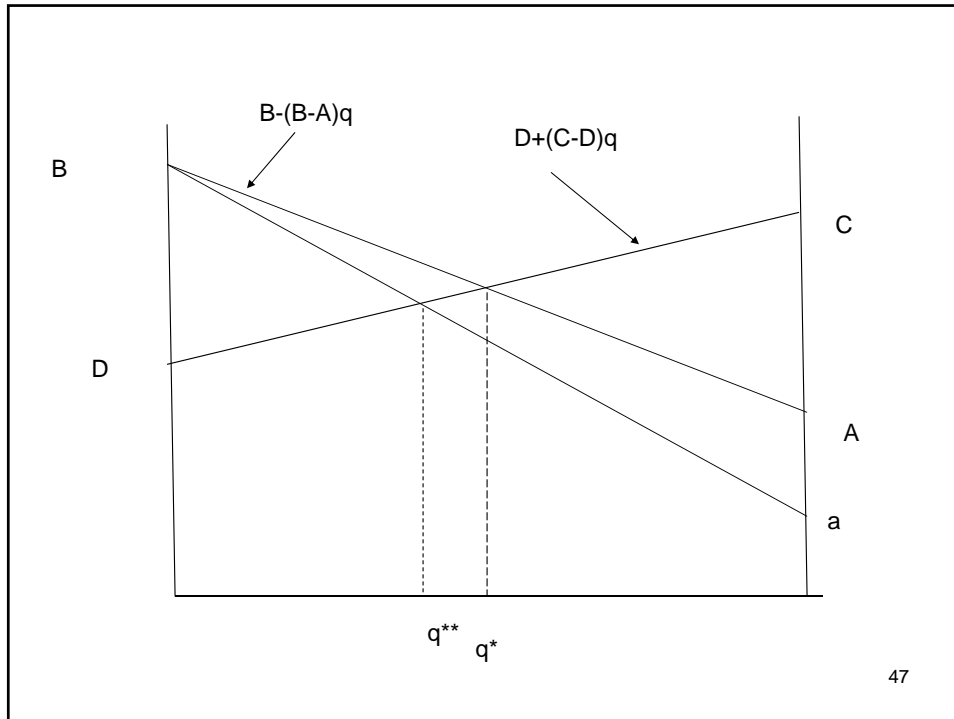
## Looking at effects in Minimax games

- We could use the graph to compute  $p^*=38.3\%$  and  $q^*=41.7\%$  by finding the intersection points of the lines.
- But we can use the graph to see some more interesting effects.
- Suppose the goalie becomes better at saving balls kicked to his left when he guesses correctly. (so  $A$  falls to  $a < A$ )
- What happens to the strategies?

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## Effects of Improving Skill

- Notice that if goalie becomes better at saving balls kicked to the left, then, as we might expect, kicker kicks less frequently to the left ( $p^{**} < p^*$ )
- More intriguing is the prediction that the goalie also guesses less frequently to the left ( $q^{**} < q^*$ ).
- This is precisely because the kicker does not go left as much.

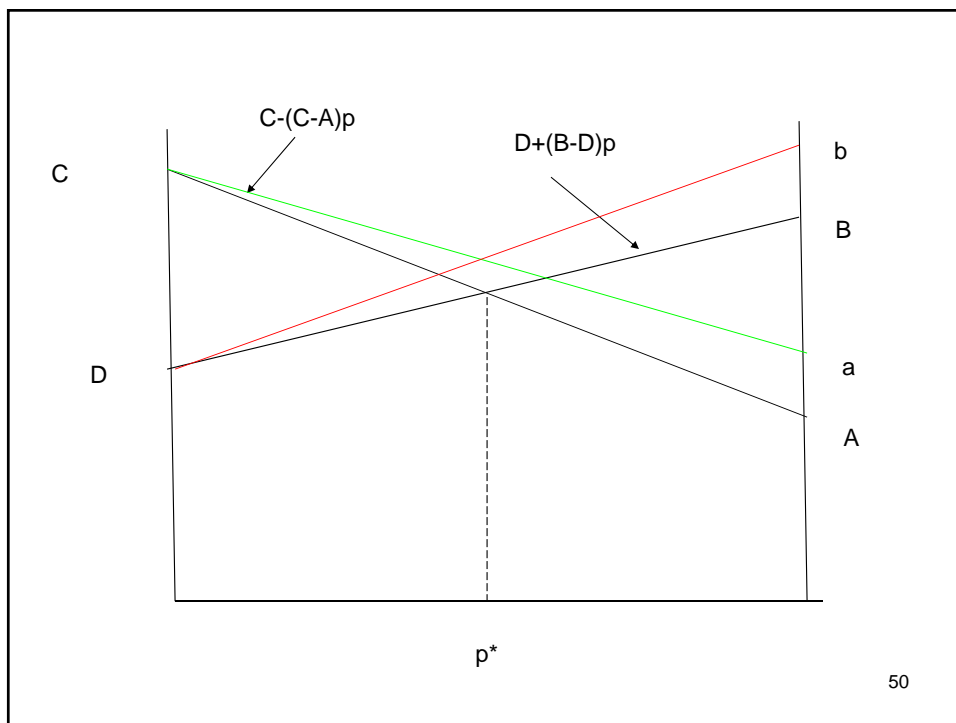
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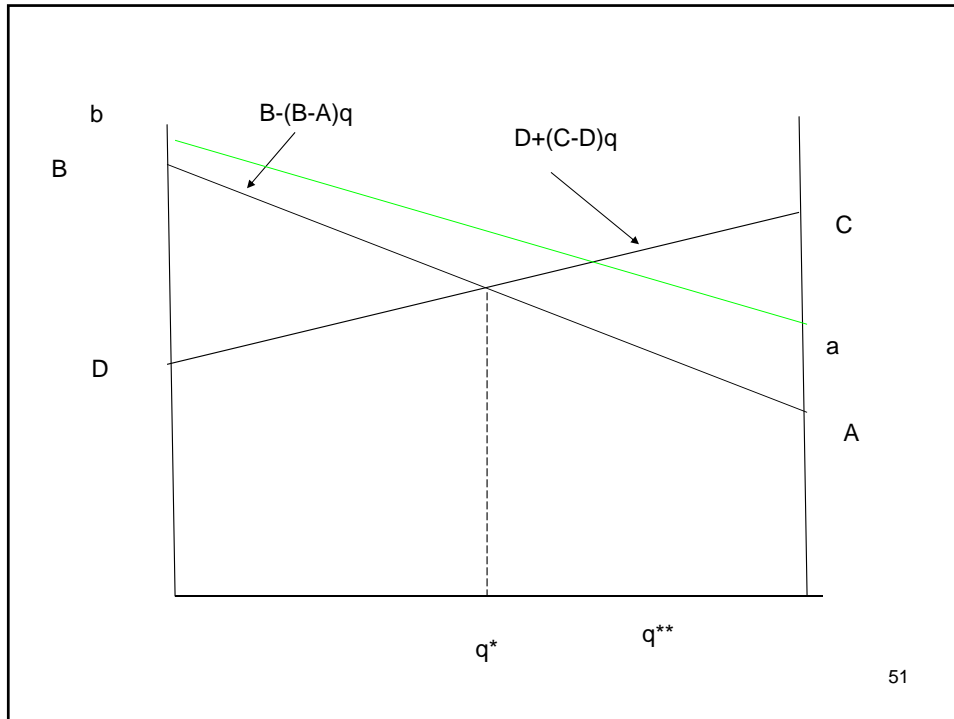
## Effects of Improving Skills

- What if the kicker becomes more accurate when kicking to the left so he misses the goal less often?
- In this case, both A and B may go up.

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## Improving Skills

- In this case, the keeper clearly goes to the left more often.
- But it is not clear what the kicker does. He may go left more often or he may go right.
- As drawn, the kicker chooses exactly the same as before but in general, it will depend on how much  $A$  and  $B$  change.
- If  $A$  goes up a lot relative to  $B$ , then the kicker increases the shots to the left.
- However, if instead  $B$  goes up more then the goalie increases the guesses to the right.
- Suppose only  $B$  goes up. Then for sure  $p^*$  goes down. Why? The rise in  $B$  makes Right less attractive for the Keeper so  $q^*$  falls. Therefore, the kicker wants to increase the chances of avoiding him.
- <http://www.nytimes.com/2006/06/18/sports/soccer/18score.html?ex=1308283200&en=67391adea0395a75&ei=5088&partner=rssnyt&emc=rss>

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## Do Soccer Players Really Mix?

| Proportion of Left |        |       |
|--------------------|--------|-------|
| Kicker             | Best   | 38.3% |
|                    | Actual | 40%   |
| Keeper             | Best   | 41.7% |
|                    | Actual | 42.3% |

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## What Game is This?

|   | R      | P      | S      |
|---|--------|--------|--------|
| R | (0,0)  | (-1,1) | (1,-1) |
| P | (1,-1) | (0,0)  | (-1,1) |
| S | (-1,1) | (1,-1) | (0,0)  |

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## Questions

- Is there a deterministic equilibrium?
- Are there mixed strategy equilibria?
- Can you guess?
  
- <http://video.yahoo.com/watch/1185303/4223046>

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## Do Professional Athletes Actually Play Minimax?

- In a new paper, Kovash and Levitt examine behavior of baseball pitchers and football offenses to determine if they use minimax strategies.
  - PROFESSIONALS DO NOT PLAY MINIMAX: EVIDENCE FROM MAJOR LEAGUE BASEBALL AND THE NATIONAL FOOTBALL LEAGUE: NBER WP 15347. Sept. 2009
- <http://www.nber.org/papers/w15347>
- Notice both situations, a pitcher facing a batter and an offense facing a defense, are “zero-sum” situations
  - any gain made by one side is a direct one for one loss imposed on the other

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## How do we tell?

- We cannot literally read the minds of the decision-makers so there is no direct way of confirming if the players randomize in the way that theory predicts.
- However, Minimax theory does predict that we should observe some related results. If those results are not observed, we should be able to conclude the theory is not predicting behavior.

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## Predictions of Game Theory

- Our analysis from before predicts at least three features of equilibrium behavior:
  - 1) all strategies that are selected give the same probability of success.
  - 2) Every strategy that is selected must do no worse than any strategy that is not used
  - 3) Over the repetition of play, strategies should be serially independent (they should not exhibit negative or positive serial correlation).
- Observations 1) and 3) can be tested with data.

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## Baseball: The pitcher-batter duel

- Authors collected data on the types of pitches thrown to batters in similar situations.
- They have over 3M observations.
- Use On-base Percentage and Slugging (OPS) as a measure of success.
  - When a pitch type increases OPS the batter increases the chance of winning and pitcher decreases chance of winning.
- on 0-2 counts, non-fastballs lead to an OPS that is 100 points *lower* than do fastballs.

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## Baseball

- this bias towards fastballs persists even when factors such as who the P and B are, innings pitched etc are taken into account.
- Paper also finds *negative serial correlation*.
- Chances a fastball is selected given a fastball was selected in a similar situation in the past is 4.1% lower.
- If the batter is aware of this, he could conceivably raise his OPS by approx. .006 or about 10-15 runs per season!

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## Football.

- Similar test was applied to frequency of selection by offense of run versus pass in similar situations.
- On average, pass plays generate .066 more points than *run* plays!
- There is strong negative correlation. Teams that passed on the previous situation are 10% less likely to pass in the current situation!
- Defenses that adjusted for this could increase their final outcome by approx 1 point per game leading to approx  $\frac{1}{2}$  more wins per season!

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