

## Making Decisions Against an Opponent

- Two people/teams in competition
- Outcome depends on both sides' simultaneous decisions
- Many examples in business, sports, economics, and even everyday life

## Simpsons Decision-Making



Bart

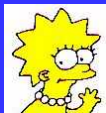
VS.



Lisa

### Rock-Paper-Scissors

Good old rock...  
You can always  
count on rock.



Poor, predictable  
Bart...always  
chooses rock.

Lisa's Optimal  
Choice



	Rock	Paper	Scissors
Rock	0	-1	1
Paper	1	0	-1
Scissors	-1	1	0

1 = Bart wins

-1 = Lisa wins

### What if...?

Good old rock...  
60% of the time,  
you can count  
on rock.



?



	Rock	Paper	Scissors
Rock	0	-1	1
Paper	1	0	-1
Scissors	-1	1	0

1 = Bart wins

-1 = Lisa wins

### What if...?

Good old rock...  
60% of the time,  
you can count  
on rock.



Paper!



	Rock	Paper	Scissors
60% Rock	0	-1	1
20% Paper	1	0	-1
20% Scissors	-1	1	0
Average =	0	-0.4	+0.4

1 = Bart wins

-1 = Lisa wins

## So, what's the outcome?

	Rock	Paper	Scissors
Average =	0	-0.4	+0.4

- Lisa should choose the column with the best results (paper), and wins 40% more
- In general, Bart's overall result equals the value of Lisa's best (lowest) column.
- **But...** if Bart knows Lisa will choose paper, he should choose scissors... and so on

## Bart's Mathematical Model

$x$  = probability that Bart chooses rock,  
 $y$  = probability that Bart chooses paper,  
 $z$  = probability that Bart chooses scissors

	Rock	Paper	Scissors
(x) Rock	0	-1	1
(y) Paper	1	0	-1
(z) Scissors	-1	1	0

Average =  $y - z$        $z - x$        $x - y$

$v$  = total value (smallest of column totals)

- Let's use a Linear Programming Model

## Linear Programming Models

- "Objective Function" - minimize or maximize
- "Constraints" - mathematical restrictions
- All linear functions
  - No powers ( $x^2$ )
  - No square roots, trig functions, logs, etc.
  - No variables multiplied by each other
- Find values for the variables that
  - satisfy all constraints
  - give the best (optimal) objective function value

## Bart's Linear Program

	Rock	Paper	Scissors
(x) Rock	0	-1	1
(y) Paper	1	0	-1
(z) Scissors	-1	1	0

Average =  $y - z$        $z - x$        $x - y$

Maximize  $v$

Subject to  $v \leq y - z$  (Rock)

$v \leq z - x$  (Paper)

$v \leq x - y$  (Scissors)

$x + y + z = 1$

$x \geq 0, y \geq 0, z \geq 0$



## Lisa's Mathematical Model

$a$  = probability that Lisa chooses rock,  
 $b$  = probability that Lisa chooses paper,  
 $c$  = probability that Lisa chooses scissors

	Rock(a)	Paper(b)	Scissors(c)	Avg.
Rock	0	-1	1	$c - b$
Paper	1	0	-1	$a - c$
Scissors	-1	1	0	$b - a$

$d$  = total value (largest of row totals)

- Another Linear Programming Model

## Lisa's Linear Program

	Rock(a)	Paper(b)	Scissors(c)	Avg.
Rock	0	-1	1	$c - b$
Paper	1	0	-1	$a - c$
Scissors	-1	1	0	$b - a$

Minimize  $d$

Subject to  $d \geq b - c$  (Rock)

$d \geq c - a$  (Paper)

$d \geq a - b$  (Scissors)

$a + b + c = 1$

$a \geq 0, b \geq 0, c \geq 0$



## Two Optimization Models

- Bart's Model



– Maximize outcome

– Outcome =  
lowest column average

– Solution:  $x = y = z = 1/3$

– Value = 0

- Lisa's Model



– Minimize outcome

– Outcome =  
highest row average

– Solution:  $a = b = c = 1/3$

– Value = 0

Note: The two values will always be equal

## A More Interesting Example: 2-point conversions in football

- Offense gets the ball at 3 yard line, has one play to score
- Many offensive play choices
- Many defensive strategies

So, let's simplify a little bit...

## Simplified Model: Run or Pass

- Offense can choose to run or to pass
- Defense can choose run defense or pass defense

	Run Defense	Pass Defense
Run	30%	50%
Pass	80%	40%

Success Rates

What do you expect?

## Two Linear Programs

	Run (a)	Pass (b)
Defense	Run (x)	Pass (y)
Run	30%	50%
Pass	80%	40%

### Offense

Maximize  $v$   
 Subject to  $v \leq .3x + .8y$   
 $v \leq .5x + .4y$   
 $x + y = 1$   
 $x \geq 0, y \geq 0$

### Defense

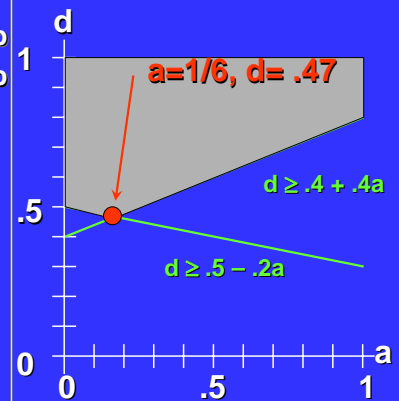
Minimize  $d$   
 Subject to  $d \geq .3a + .5b$   
 $d \geq .8a + .4b$   
 $a + b = 1$   
 $a \geq 0, b \geq 0$

## Defense's Optimization

Minimize  $d$   
 Subject to  $d \geq .3a + .5b$   
 $d \geq .8a + .4b$   
 $a + b = 1$   
 $a \geq 0, b \geq 0$

- Substitute  $b = 1 - a$

Minimize  $d$   
 Subject to  $d \geq .5 - .2a$   
 $d \geq .4 + .4a$   
 $0 \leq a \leq 1$

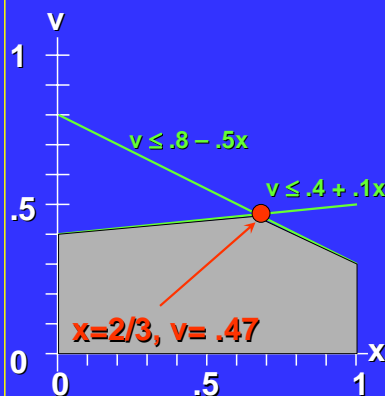


## Offense's Optimization

Maximize  $v$   
 Subject to  $v \leq .3x + .8y$   
 $v \leq .5x + .4y$   
 $x + y = 1$   
 $x \geq 0, y \geq 0$

- Substitute  $y = 1 - x$

Maximize  $v$   
 Subject to  $v \leq .8 - .5x$   
 $v \leq .4 + .1x$   
 $0 \leq x \leq 1$



## Summary

- Start with a complex problem (making decisions against an opponent)
- Create a simplified mathematical model (Optimization/linear programming)
- Use the model to suggest a strategy (in this case, a surprising strategy!)

Slides at [www.isye.gatech.edu/~jsokol/2030.ppt](http://www.isye.gatech.edu/~jsokol/2030.ppt)