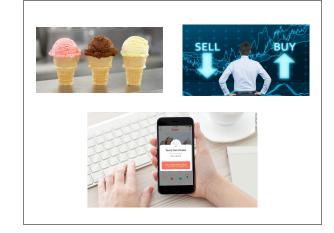
How We Decide

(or: being wrong about the future)



PRESENT PAST FUTURE



How We Decide?

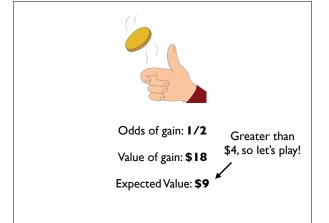
Expected Value

odds of gain x value of gain

\$18 if you call it right!



Would you pay \$4 to play?



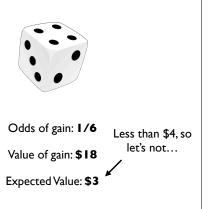
Expected Value

odds of gain x value of gain

\$18 if you call it right!



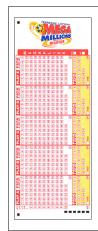
Would you pay \$4 to play?



Expected Value

odds of gain x value of gain

end of story?



Pay \$1

Pick 6 #s between 1-75

Get 5 right, win \$1,000,000!

Odds: I in >18,000,000

Expected Value
\$1 million / 18 million = ~\$0.05
(a bit more with secondary prizes)

But we still play!

Expected Value

odds of gain x value of gain

errors of odds

errors of value

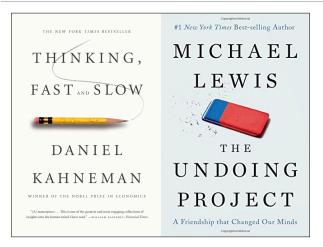


Daniel Kahneman



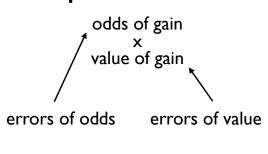
Amos Tversky



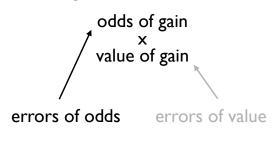




Expected Value



Expected Value



400 babies are born each day in a large hospital, and 40 babies are born each day in a small hospital. For any day in which more than 60% of the births at a hospital are girls, that hospital hands out free girl scout cookies.

Which hospital will have more free-cookie days?

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Which hospital will have more free-cookie days?

A

B

C

400

40

Same

400 babies are born each day in a large hospital, and 40 babies are born each day in a small hospital. For any day in which more than 60% of the births at a hospital are girls, that hospital hands out free girl scout cookies.

Which hospital will have more free-cookie days?

"They'll be the same!"

Errors of Odds

Sample Size Neglect

Law of Small Numbers

smaller #s of observations: greater chance of "weird" results

Coin flips

40 flips	400 flips	4000 flips	40000 flips
44%	48%	50%	50%
65%	47%	48%	50%
48%	54%	50%	50%
53%	46%	50%	50%
55%	52%	51%	50%
39%	47%	50%	50%
61%	48%	49%	50%
50%	50%	50%	50%

Coin flips

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50%	50%	50%	50%

400 babies are born each day in a large hospital, and 40 babies are born each day in a small hospital. For any day in which more than 60% of the births at a hospital are girls, that hospital hands out free girl scout cookies. Which hospital will have more free-cookie days? "They'll-be the same!"	
Law of Small Numbers	
smaller #s of observations: greater chance of "weird" results	
Counties with the lowest incidence of kidney cancer rural, sparsely populated, religious	
Counties with the highest incidence of kidney cancer rural, sparsely populated, religious	
Errors of Odds	
Sample Size Neglect	

Ron is an opera buff who enjoys touring art museums when on vacation. Growing up, he loved listening to classical music and playing chess with friends and family.	
Which is more likely? - Ron plays trumpet in a major symphony orchestra - Ron is a farmer	
Trumpeters in major symphony orchestras: ~300 Farmers: ~2,000,000	
Ron is 6'7" tall.	
Which is more likely? - Ron starts for an NBA team - Ron is a teacher	
NBA starters: 150	
Teachers: ~ 3,200,000	
Errors of Odds	
Sample Size Neglect	
Base Rate Neglect	

Ron is an opera buff who enjoys touring art museums when on vacation. Growing up, he loved listening to classical music and playing chess with friends and family.	
Which is more likely? - Ron plays trumpet in a major symphony orchestra - Ron is a farmer	
The representativeness heuristic the description seems more representative	
of a classical musician than a farmer	
Errors of Odds	
Sample Size Neglect	
Base Rate Neglect	
\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\	
Which has More?	
Are there more English words with "r" as the first letter, or with "r" as the third letter?	

Α

В

Which is More Likely?





The availability heuristic

a dog on a leash comes to mind more easily than a pig on a leash, so it's probably more likely

Which has More?

Are there more English words with "r" as the first letter, or with "r" as the third letter?

Α

r_ _ _ ...

В

r ...

Which has More?

Are there more English words with "r" as the first letter, or with "r" as the third letter?

Α

r ...

2370

easy to think of ring, rope, road hard to think of bare, dirt, tire

В

r ...

5580

Sample Size Neglect

Base Rate Neglect

Availability Bias





It's happened so many times...why not me?

Sample Size Neglect

Base Rate Neglect

Availability Bias

Pres. Daniels plays LeBron James in a one-on-one game of basketball. What are the odds that:

The first scoring play of the game is a layup by President Daniels

The first scoring play of the game is a layup by President Daniels, but then King James takes over and crushes President Daniels

Prez Daniels scores first

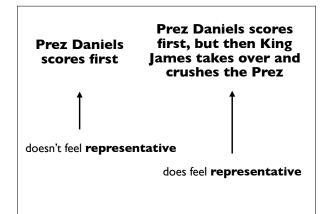
Prez Daniels scores first, but then King James takes over and crushes the Prez



A & B

Probability of A & B can't be **greater** than the probability of A!

Sample Size Neglect
Base Rate Neglect
Availability Bias
Conjunction Fallacy



Prez Daniels scores first

Prez Daniels scores first, but then King James takes over and crushes the Prez

A

A & B

Probability of A & B can't be **greater** than the probability of A!

Sample Size Neglect
Base Rate Neglect
Availability Bias
Conjunction Fallacy



Set to begin construction in spring 2022 and to be completed by fall 2024, the new Hopkins Student
Center, received overwhelmingly positive veriews from students, staff, and alumni, who contributed to
the selection process. Bid's third academic building in the United States-following the Isenberg
School of Management Business Innovation Hub for the University of Massachusetts Amherst and The
Heights Building for Arlington Public Schools, both completed in 2019-1s in collaboration with Shepley
Builfinch as Architect of Record, along with Rockwell Group for interior design and Michael Van
Valkenburg Associates for landscape design.

SGA announces updates on the Hopkins Student
Center's construction

By AMEL CHO and ORIGITA (Suplember 17, 202)

CENTER PORT
By Amel Construction

By Amel Construction

By Amel Construction

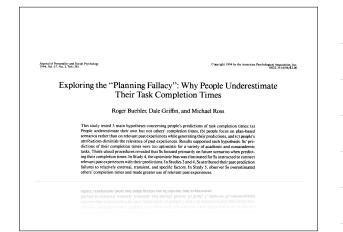
By Amel Construction

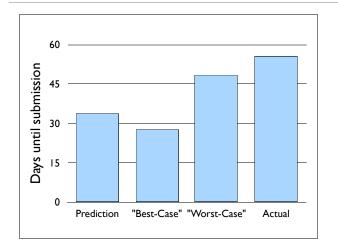
CENTER PORT
By Amel Construction

By Amel Construction

CENTER PORT
By A

Sample Size Neglect
Base Rate Neglect
Availability Bias
Conjunction Fallacy
Planning Fallacy





easy to imagine what it will be like to do the work (availability!) hard to imagine all the distractions **Errors of Odds** Sample Size Neglect Base Rate Neglect Availability Bias Conjunction Fallacy Planning Fallacy **Expected Value** odds of gain ' x value of gain errors of odds errors of value

Expected Value

odds of gain

x
value of gain

errors of odds

errors of value

You want to buy a **car stereo**.
You can buy one near your house for \$248, or you can go to DC to get the same exact stereo for just \$48.

Would you spend two hours to save \$200?



You want to buy a **car**.
You can buy one near your house for \$30,348, or you can go to DC to get the same exact car for just \$30,148.

Would you spend two hours to save \$200?





 ${\it Journal of Economic Perspectives-Volume~5, Number~1-Winter~1991-Pages~193-206}$

Anomalies

The Endowment Effect, Loss Aversion, and Status Quo Bias

Daniel Kahneman, Jack L. Knetsch, and Richard H. Thaler

According to the consequence of the consequence of



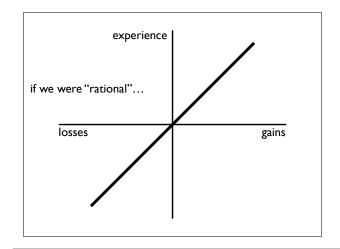
Endowment Effect

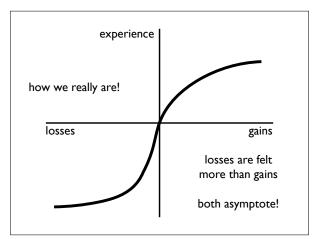
Nobel in Economics Is Awarded to Richard Thaler

By BINYAMIN APPELBAUM OCT. 9, 201



ne economist Richard H. Thaler at his home in Chicago on Monday after winning the 2017 Nobel





\$10 now s \$12 in 2 weeks

Temporal Discounting

\$10 in 50 s \$12 in 52 weeks

weeks weeks

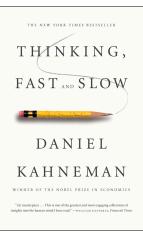
What can we do about this?

- I. Try not to make these mistakes to begin with
- 2. **Exploit** these biases to improve society!

What can we do about this?

- I. Try not to make these mistakes to begin with
- 2. **Exploit** these biases to improve society!

think slower!



Answer all three questions and you could win a prize! You don't even need to get them 'right' — just answer! Question 1. A bat and a ball cost \$1.10 in total. The bat costs \$1.00 more than the ball. How much does the ball cost? — cents Your answer Question 2. If it takes 5 machines 5 minutes to make 5 widgets, how long would it take 100 machines to make 100 widgets? — minutes Your answer Question 3. In a lake, there is a patch of lily pads. Every day, the patch doubles in size. If it takes 48 days for the patch to cover the entire lake, how long would it take for the patch to cover half of the lake? — days

Cognitive Reflection Test (CRT)

(Frederick, 2005)



A bat and a ball cost \$1.10. The bat costs a dollar more than the ball. How much does the ball cost?

5 cents!

But 10 cents "feels" like the right answer (and 21% of you said it!)

It takes 5 machines 5 minutes to make 5 widgets; how long will it take 100 machines to make 100 widgets? 5 minutes! But 100 minutes "feels" like the right answer (and 18% of you said it!)	
In a lake, there is a patch of lily pads. Every day, the patch doubles in size. If it takes 48 days for the patch to cover the entire lake, how long would it take for the patch to cover half the lake? 47 days! But 24 days "feels" like the right answer (and 12% of you said it!)	
Scores on the CRT correlate withpatience in generallow temporal discountingbetter alignment with expected value	

What can we do about this?

- I. Try not to make these mistakes to begin with
- 2. **Exploit** these biases to improve society!

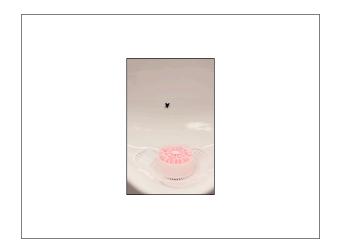
What can we do about this?

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Richard H. Thaler Cass R. Sunstein



Improving Decisions About Health, Wealth, and Happiness







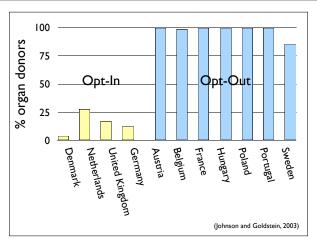
Journal of Economic Perspectives-Volume 5, Number 1-Winter 1991-Pages 193-206

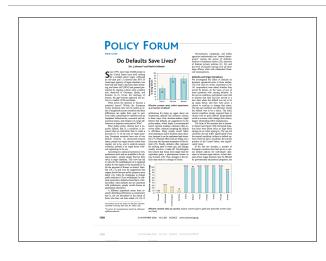
Anomalies

The Endowment Effect, Loss Aversion, and Status Quo Bias

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Economics can be distinguished from other social sciences by the belief that most (all') behavior can be explained by assuming that agents have table-call-defined performers and make rational choose constituent with those pref-call-defined performers and make rational choose constituent with these pref-cases and the second of the second constituent of th





How We Decide (or: being wrong about the future)

