

Prospect Theory

- Kahneman & Tversky
- Modification of EUT
 - **Utilities not evaluated in absolute sense**
 - **Evaluated wrt reference point**
 - Utilities not multiplied by objective probabilities
 - Multiplied by the π function instead

Framing Effects



Reference Point: 600 deaths

- Imagine the US is preparing for an outbreak of disease which is expected to kill 600 people. 2 programs are proposed:
- Program A: 200 people will be saved
- Program B:
 - 1/3 prob 600 people saved
 - 2/3 prob no people will be saved

Alternative Framing



- Program C: 400 people will die
- Program D: 1/3 probability no people will die, 2/3 probability 600 people will die

Reference Point: status quo (no deaths)

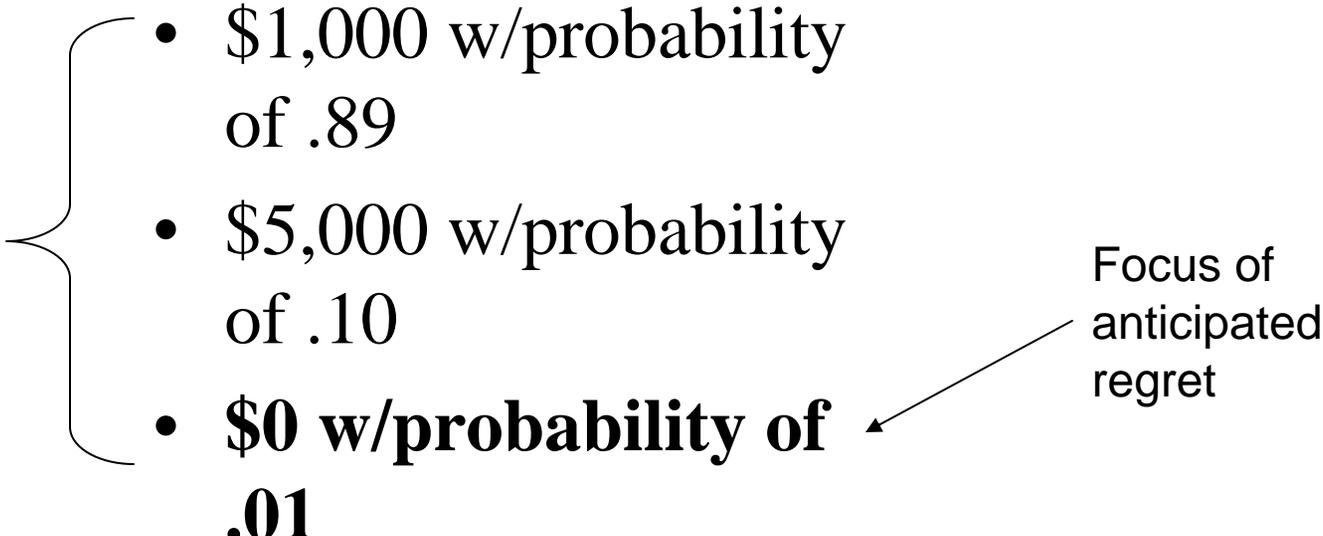
Regret Theory

- People overweight anticipated feelings of regret when the difference between outcomes is large

Allais Paradox

- \$1,000 w/probability of 1.0
- \$1,000 w/probability of .89
- \$5,000 w/probability of .10
- **\$0 w/probability of .01**

Focus of anticipated regret



Regret Theory

- People overweight anticipated feelings of regret when the difference between outcomes is large

	Ticket Numbers				
Option	1-9	10-21	22-24		
A	\$24	\$0	\$0	←	Chance of not getting \$24 similar to that of not getting \$16, and \$24 better outcome
B	\$0	\$16	\$0		
	Ticket Numbers				
Option	1-9	10-12	13-24		
C	\$24	\$0	\$0		1-9 outcomes fairly similar, so focus on 10-12 and compare winning something vs. nothing
D	\$16	\$16	\$0	←	

Irrationality

- 2 accounts of irrational decisions
 - Prospect Theory
 - Regret Theory
- Is regret important?
 - Should it be included when calculating utilities?
- Bounded Rationality
 - Limited Processing Resources
 - Huge Amount of Information

Heuristics & Biases

- Heuristics – cognitive shortcuts
- Use of heuristics leads to various judgment biases
- Double-edged sword
 - Used by experts, Usable by novices
 - Can be misleading

Kahneman & Tversky



- Deviations from rational judgment result from use of heuristics
- Anchoring & Adjustment
- Availability
- Representativeness

Anchoring & Adjustment

- Strategy in which estimation begins with an initial anchor and adjusts estimate in light of incoming information

$$1 \times 2 \times 3 \times 4 \times 5 \times 6 \times 7 \times 8 = 512$$

$$8 \times 7 \times 6 \times 5 \times 4 \times 3 \times 2 \times 1 = 2,250$$

$$=40,320$$



Availability Heuristic

- Tendency to form a judgment on the basis of what's readily brought to mind

_____ n _	125
_____ i n g	880

Tversky & Kahneman (1974)

- If a word of 3 or more letters is taken randomly from an English text, is it more likely that the word starts with r or has r as its 3rd letter?
- Availability reflects effectiveness of search strategy
 - May or may not reflect actual probability

Pros & Cons of Availability

- Availability → Frequency
 - Frequency -> Probability
- Memory distortions
 - Availability not correlated w/Probability
 - Recency
 - Publicity

Von Restorff Effect

- Finding that a single non-category member embedded in a list of items from a category will be the best remembered
- Carrot
- Celery
- Cucumber
- Porsche
- Zucchini
- Eggplant
- Squash

Solo or Token Members

Group A

5 Caucasians

1 African American

Tape

6 voices

Group B

3 Caucasians

3 African Americans

- Statements attributed to African American remembered better in group A than group B
- Statements attributed to the African American were more negatively evaluated in group A than group B

Hindsight Bias

- Tendency to overestimate probability you would have predicted X, once you know X occurred
- Arkes & colleagues
 - 4 Hindsight Groups
 - Assigned 2-3x > probability estimates to the “correct” diagnosis than did the foresight group



Availability & Hindsight

- Availability of correct outcome outweighs other evidence
 - Even when consciously ‘ignoring’ it
- Hindsight Bias can lead outside observers to an inadequate appreciation of original difficulty of a decision
 - Medical Diagnosis
 - Airline Operation

Causal Schema

- Evaluate the probability of an event via the difficulty you have imagining a plausible scenario leading to that outcome
- **Good** for understanding events and stories
 - The careless man threw a cigarette out the window.
The forest won't be restored in our lifetime.
- Use of causal schemas to *estimate probabilities* can be **misleading**

Down Side of Causal Schemas

- People have limited imaginations
- Overestimate likelihood of events consistent w/causal schemas
 - Predicting daughter's eye color from mother's eye color vs. mother's eye color from daughter's
 - Predicting scores on a short quiz from performance on a 10-hour exam, or vice versa

Representativeness Heuristic

- Evaluate evidence by judging it's similarity to the outcome
 - What's the probability that exemplar E is a member of category C?
 - How many features typical of C does E have?
 - Lots: Probable!
 - Few: Improbable...

Steve



- Steve is very shy and withdrawn, invariably helpful, but with little interest in people, or in the world of reality. A meek tidy soul, he has a need for order and structure and a passion for detail.
- What's the probability that he's a
 - Farmer
 - Pilot
 - Doctor
 - Librarian

Conjunction Fallacy

Which of the following events is the most likely?

1. That a man is under 55 and has a heart attack
2. That a man has a heart attack
3. That a man smokes and has a heart attack
4. That a man is over 55 and has a heart attack

Conjunction Fallacy

Which of the following events is the most likely?

1. That a man is under 55 and has a heart attack
- 2. That a man has a heart attack**
3. That a man smokes and has a heart attack
4. That a man is over 55 and has a heart attack

Representativeness Heuristic and Bayes Theorem

$P(O E)$	Probability of Outcome given Evidence
$P(O)$	Base Rate (Prior Probability of Outcome)
$P(\sim O)$	Inverse of Base Rate ($1 - P(O)$)
$P(E O)$	Hit Rate (Prob of Evidence given Outcome)
$P(E \sim O)$	False Alarm Rate

$$P(O|E) = \frac{P(E|O)P(O)}{P(O)P(E|O) + P(\sim O)P(E|\sim O)}$$

} Bayes' Theorem

An Example

Given that Harold talks to strangers,
how likely is it that he is an extravert?

(What is the probability of the outcome given the evidence?)

Evidence: Harold talks to strangers = T

Outcome: Harold is an extravert = X

Evidence: Harold talks to strangers = T

Outcome: Harold is an extravert = X

Assume

P(Outcome): Base Rate of being an extravert $p(X) = .6$

P(Evidence): Probability of talking to strangers $p(T) = .85$

P(E&O): Probability of being extraverted and
talking to strangers $p(T\&X)=.6$

Harold

Assume

P(Outcome): Base Rate of
being an extravert

$$p(X) = .6$$

P(Evidence): Probability of
talking to strangers

$$p(T) = .85$$

P(E&O): Probability of being
extraverted and
talking to strangers

$$p(T\&X) = .6$$

Calculate

Likelihood: Probability of
evidence given outcome

$$p(T|X) = p(T\&X)/p(X)$$

=

$$.6/.6$$

=

$$1$$

$$p(X|T)$$

But what is the probability of the outcome given the evidence? $p(X|T)$

$$\begin{aligned} p(X|T) &= p(X\&T)/p(T) \\ &= .6/.85 \\ &= .71 \end{aligned}$$

Some people who talk to strangers are not extraverts.

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Probabilities vs. Frequencies

The probability of breast cancer is 1% for a woman at age 40 who participates in routine screening. If a woman has breast cancer, the probability is 80% that she will get a positive mammography. If a woman does not have breast cancer, the probability is 9.6% that she will get a positive mammography. A woman in this age group had a positive mammography in a routine screening. What is the probability that she actually has breast cancer?

High Base Rate

$$P(\text{Illness})=.10$$

$$P(\sim\text{Illness})=.90$$

$$P(E|\text{Illness})=.80$$

$$P(E|\sim\text{Illness})=.20$$

$$P(\text{Illness}|E)=$$

$$\frac{.80(.10)}{.10(.80)+.90(.20)}$$

$$.10(.80)+.90(.20)$$

$$=.01$$

Low Base Rate

$$P(\text{Illness})=.01$$

$$P(\sim\text{Illness})=.99$$

$$P(E|\text{Illness})=.80$$

$$P(E|\sim\text{Illness})=.20$$

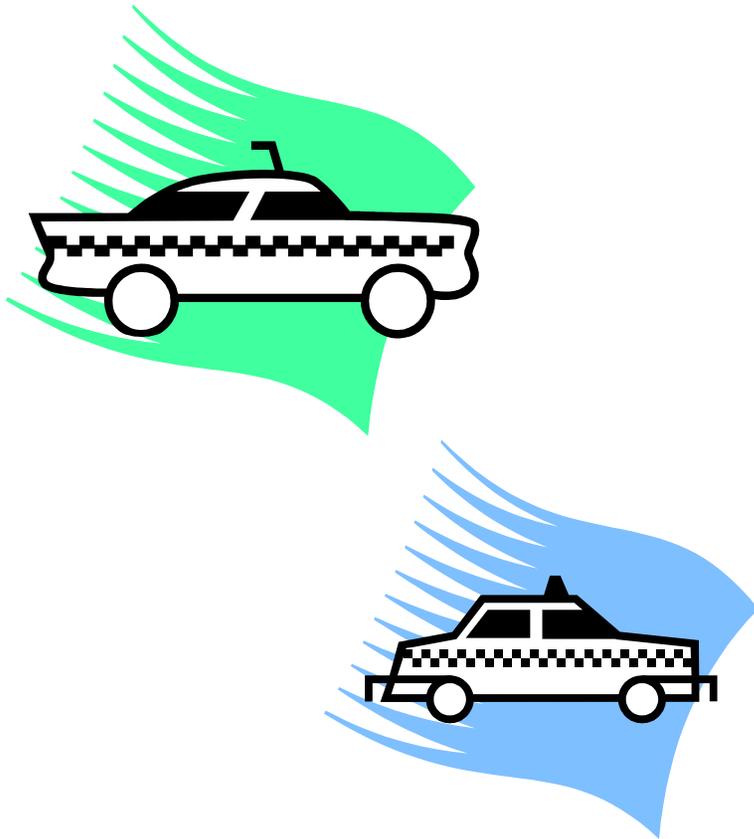
$$P(\text{Illness}|E) =$$

$$\frac{.80(.01)}{.01(.80)+.99(.20)}$$

$$.01(.80)+.99(.20)$$

$$=.004$$

Base Rate Neglect



- 85% cabs green
- 15% cabs are blue
- Witness: “Cab was blue.”
- Witness: 80% accurate when identifying colors in similar conditions
- What’s the probability that the cab in the accident was blue?
 - Survey Says: 80%
 - Bayes Says: 41%