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Utility Concepts 2

Decision Theory

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1

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But first another EVSI example:

You are thinking about investing \$1000 in one of 3 stocks, A, B, or C. The return on investment of these stocks depends on the probability that each company will release their latest product in the next 6 months.

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Let R = new product release
NR = no product release

The net returns on the investments after 1 year are estimated to be:

Stock	R	NR
A	200	0
B	400	-100
C	300	-200

With prior probabilities of product release:

$P(R) = 0.70$
 $P(NR) = 0.30$

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You have the option of buying an on-line investment newsletter that costs \$10/month that tracks whether the new product releases of companies are on schedule or not. Their track record is summarized by the following likelihoods. Let

S = on schedule

L = late/not on schedule

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$P(S|R) = 0.85$

$P(S|NR) = 0.10$

$P(L|R) = 0.15$

$P(L|NR) = 0.90$

- What is the EVPI?
- What is the EVSI?
- What is your optimal decision strategy?

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• What is the EVPI?

Prob = 0.70 0.30

Stock	R	NR
A	200	0
B	400	-100
C	300	-200

EV
140
250* ←
150

- $EVPI = EV \text{ given PI} - EV(a^*)$
 $= .7(400) + .3(0) - 250 = 30$

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• What is the EVSI?

$$= \text{EV with SI} - \text{EV without SI}$$

- Need to compute posterior probabilities
- and the decision tree...

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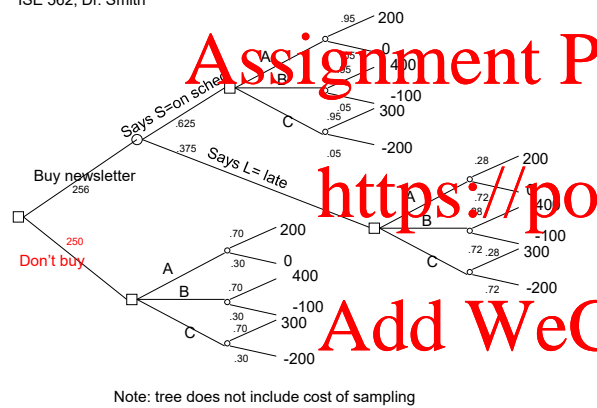
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S=sched	P(R)	P(S R)	Product	Post(R S)
R	.70	.85	.595	.952
NR	.30	.10	.03	.048
			.625	
L=late	P(R)	P(L R)	Product	Post(R L)
R	.70	.15	.105	.28
NR	.30	.90	.270	.72
			.375	

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$$\text{EVSI} = \text{EV with SI} - \text{EV without SI}$$

- $\text{EVSI} = 256 - 250 = 6$
- It appears that the value of additional information (newsletter) is positive. Now the EVSI must be compared to the cost of the information (cost of sampling, CS)
- That is $\text{ENGSI} = \text{EVSI} - \text{CS} = 6 - 10 = -4$
- Optimal strategy: don't buy newsletter since $\text{EVSI} - \text{CS} = 10^*$

*Does not matter if cost for one month or year; still a negative ENGSI

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Back to Utilities...

Utility function, $U(X)$

- Maps decision attribute X to the interval $[0, 1]$ where $U(\text{worst case})=0.0$ and $U(\text{best case})=1.0$
- Captures risk attitude
 - Risk neutral
 - Risk seeking
 - Risk averse

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Note that if decision maker is risk neutral, the utility function can be written as:

$$U(X) = a + bX \text{ where } X = \text{return of money}$$

- From definition of expected value:
 $E[U(X)] = E[a + bX] = E[a] + E[bX] = E[a] + bE[X]$
- Expected value of constant = constant so,
 $E[U(X)] = a + bE[X]$ and $E[X] = \text{expected monetary value so,}$
- $EU = a + bEMV$ $b > 0$, so EU a maximum when EMV a maximum

If utility function is linear with respect to \$, then EMV and EU criterion are equivalent

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- Assessing utility function from decision maker interviews is labor-intensive
- Worthwhile for high-value or high-cost consequence decisions
- Provides precision beyond simple risk-neutral assumption
- If time, cost, or payoffs limited in scope, are there simplifications available?

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Yes

- Risk-neutral case (already discussed)
- 3-point utility function (only assess 0.50 certainty equivalent)
- Use mathematical functions to represent utility
 - $U(X) = aX + b$ (piecewise linear)
 - $U(X) = a - e^{-bX}$ (exponential)
 - $U(X) = a \log(X + b)$

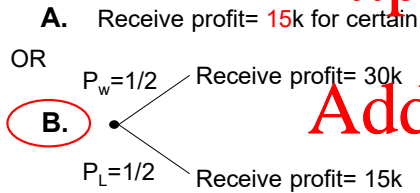
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- Suppose we have investments with profits between \$15k and \$30k. **More > less**; we ask the decision maker, "Which would you prefer?"

IF RATIONAL, SHOULD CHOOSE "B"



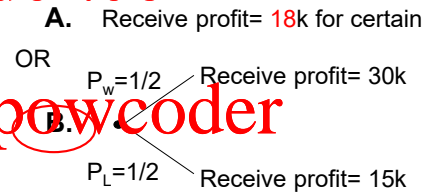
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- Now bump the sure thing up to $\frac{1}{4}$ the interval from worst value: $15 + \frac{1}{4}(30 - 15) \sim 18$

SUPPOSE THEY CHOOSE "B"



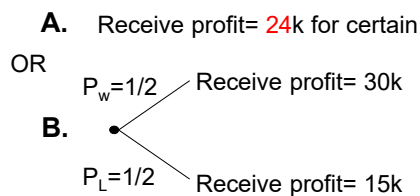
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- They chose B (gamble) so next value between 18 and 30: $(18 + 30)/2 \sim 24$

SUPPOSE THEY CHOOSE "B"



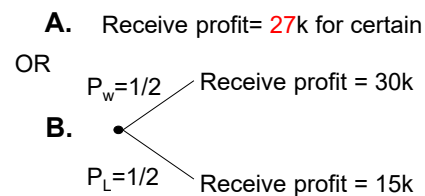
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- Chose gamble so next value between 24 and 30: $(24 + 30)/2 \sim 27$

Suppose they choose B



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- Chose gamble so next value between 27 and 30: $(27 + 30)/2 \sim 28.5$

NOW SUPPOSE THEY ARE INDIFFERENT BETWEEN A AND B
THE CERTAINTY EQUIVALENT OF THE GAMBLE IS 28.5

THE EXPECTED VALUE OF THE GAMBLE IS
 $.50(15) + .50(30) = 22.5$

A. Receive profit = 28.5k for certain

OR

$P_w = 1/2$ Receive profit = 30k

B.

$P_L = 1/2$ Receive profit = 15k

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We can now calculate the risk premium—the amount the decision maker should be willing to pay to avoid the risk of the worst case if positive, or take the risk of getting the best case if negative; it is the difference between the expected value and the certainty equivalent (indifference point):

$$RP = EV - CE$$

For the example $RP = 22.5 - 28.5 = -6$

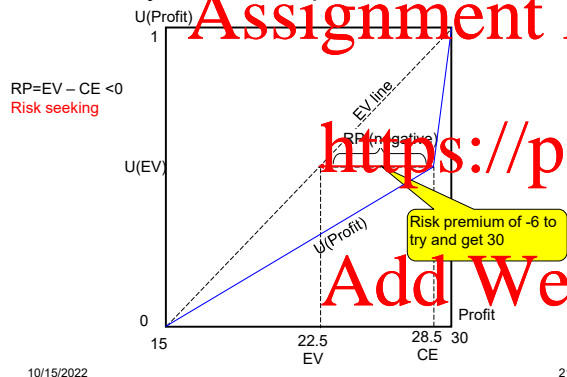
- The negative value indicates the DM is willing to pay to gamble; i.e., they are willing to pay \$6,000 to take the risk of receiving a profit of \$30,000 (pay to play).

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The utility function for profit



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Suppose the decision maker had been indifferent at a CE of \$17,000:

Then $RP = 22.5 - 17 = +5.5$

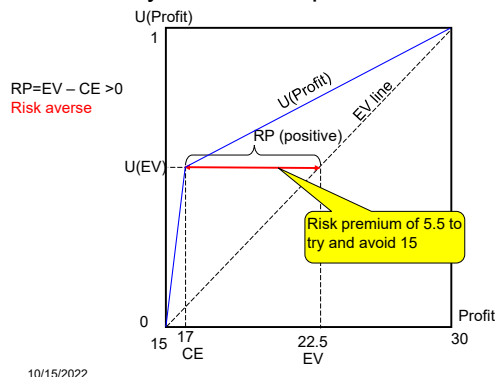
- The positive value indicates the DM wants to avoid the risk of only receiving 15).
- In this case the decision maker would be willing to pay \$5,500 to avoid the chance of receiving a profit of only \$15,000.

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The utility function for profit



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Examples

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Example: Risk attitude

Suppose we have the following utility function:

$$U(x) = \begin{cases} x^2 & 20 \leq x \leq 100 \end{cases}$$

Identify the risk attitude.

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Using the risk premium, $RP = EV - CE$
where

if $RP < 0$ then risk seeking

if $RP > 0$ then risk averse

if $RP = 0$ then risk neutral

Need to compute CE and EV...

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Step 1: find the CE

CE: from expected utility

$$EU = pU(\text{bestcase}) + (1-p)U(\text{worstcase})$$

$$= \frac{1}{2} U(100) + \frac{1}{2} U(20)$$

$$= \frac{1}{2} (10000) + \frac{1}{2} (400) = 5200$$

So CE = inverse of utility function at 5200

$$U(x) = 5200 = x^2 \text{ so } x = 72.1$$

So CE = 72.1

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Step 2: find the EV

EV: from expected value

$$EV = p(\text{bestcase}) + (1-p)(\text{worstcase})$$

$$= \frac{1}{2} (100) + \frac{1}{2} (20)$$

$$= (50) - (0) = 60$$

So EV = 60

$$\text{And } RP = EV - CE = 60 - 72.1 = -12.1$$

Since $RP < 0$, utility function is risk seeking

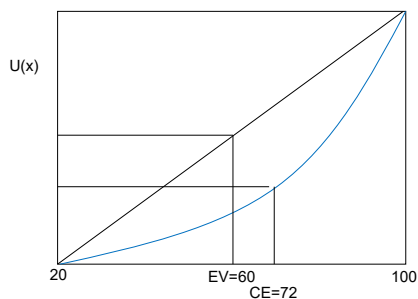
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$$RP = EV - CE = 60 - 72.1 = -12.1$$

Since $RP < 0$, utility function is risk seeking



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Method 2: using G and L

$$\text{Gain } G = U(\text{best case}) - U(EV)$$

$$= U(100) - U(60)$$

$$= 10000 - 3600$$

$$= 6400$$

$$\text{Loss } L = U(EV) - U(\text{worst case})$$

$$= U(60) - U(20)$$

$$= 3600 - 400$$

$$= 3200$$

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Method 2: using G and LIf $G-L > 0$ risk seekingIf $G-L < 0$ risk averseIf $G-L = 0$ risk neutral

So

$$G - L = 6400 - 3200 = 3200 > 0$$

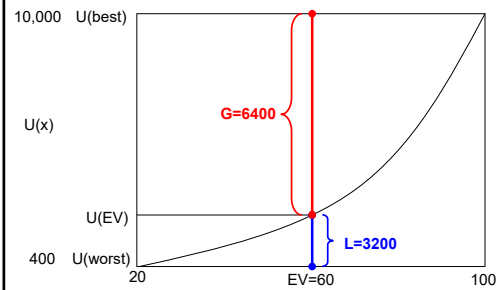
so risk seeking

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$$G=6400 \quad L=3200$$

Since $G-L > 0$, utility function risk seeking

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Another example: Risk attitude

Suppose we have the following utility function:

$$U(x) = \begin{cases} \frac{\sqrt{x-16}}{\sqrt{20}} & 16 \leq x \leq 36 \end{cases}$$

general case:

$$U(x) = \begin{cases} \frac{\sqrt{x-a}}{\sqrt{b-a}} & a \leq x \leq b \end{cases}$$

Identify the risk attitude

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Using the risk premium, $RP = EV - CE$

where

if $RP < 0$ then risk seekingif $RP > 0$ then risk averseif $RP = 0$ then risk neutral

Need to compute CE and EV...

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CE: from expected utility

$$EU = pU(\text{bestcase}) + (1-p)U(\text{worstcase})$$

$$= \frac{1}{2} U(36) + \frac{1}{2} U(16)$$

$$= \frac{1}{2} (1) + \frac{1}{2} (0) = 0.50$$

So CE = inverse of utility function at 0.50

$$U(x) = 0.50 = \frac{\sqrt{x-16}}{\sqrt{20}} \text{ solving for } x = 21$$

So CE=21

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EV: from expected value

$$EV = p(\text{bestcase}) + (1-p)(\text{worstcase})$$

$$= \frac{1}{2} (36) + \frac{1}{2} (16)$$

$$= (18) + (8) = 26$$

So EV = 26

$$\text{And } RP = EV - CE = 26 - 21 = +5$$

Since $RP > 0$, utility function is risk averse

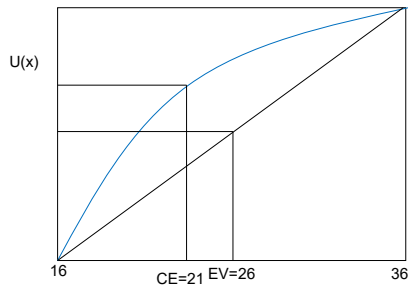
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$$RP = EV - CE = 26 - 21 = +5$$

Since $RP > 0$, utility function is risk averse



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Method 2: using G and L

$$\begin{aligned} \text{Gain } G &= U(\text{best case}) - U(EV) \\ &= U(36) - U(26) \\ &= 1 - 0.707 \\ &= 0.293 \end{aligned}$$

$$\begin{aligned} \text{Loss } L &= U(EV) - U(\text{worst case}) \\ &= U(26) - U(16) \\ &= 0.707 - 0 \\ &= 0.707 \end{aligned}$$

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Method 2: using G and L

If $G - L > 0$ risk seeking

If $G - L < 0$ risk averse

If $G - L = 0$ risk neutral

So

$$G - L = 0.293 - 0.707 = -0.414 < 0$$

so risk averse

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Let's work a real example:

- Suppose you are going to buy a car with 10 possible models to consider.
- The range of mpg is 28 to 42 across the 10 vehicles.
- We want the utility function for mpg.
- I need a volunteer!

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"Which would you prefer?"

A. Receive mpg = 28 for certain

OR

$P_w = 1/2$ Receive mpg = 42

B.

$P_L = 1/2$ Receive mpg = 28k

To overhead display

Utility Function



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Utility theory is based on a set of axioms of coherence for rational decision making. Satisfaction of these axioms implies maximization of expected utility as the decision making criterion.

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1. Completeness Axiom. Existence of a preference ordering. Given any 2 payoffs X_1 and X_2 , the decision maker can decide whether X_1 preferred to X_2 ; X_2 preferred to X_1 ; or indifference between X_1 and X_2
- In other words, the decision maker can make up their mind (not indecisive)

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2. Transitivity of preferences. If the decision maker prefers X_1 to X_2 and X_2 to X_3 , then they should prefer X_1 to X_3 . (same for indifference)
- In other words, the decision maker has a logical preference ordering (logically consistent)

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3. Continuity of preferences. If the decision maker prefers X_1 to X_2 and X_2 to X_3 , then a value of p can be found such that pX_1 and $(1-p)X_3$ is preferred to X_2 ; and another value of p^* can be found such that X_2 is preferred to p^*X_1 and $(1-p^*)X_3$; and another value of p' such that the DM is indifferent between X_2 and $p'X_1$ and $(1-p')X_3$.
- In other words, an *indifference point* can be found between the ranges of X_1 and X_2 ; X_2 and X_3 ; and X_1 and X_3 . (X1 cannot be so good that the transitivity of X1 to X3 is violated ($X_2 > pX_1$ and $(1-p)X_3$).

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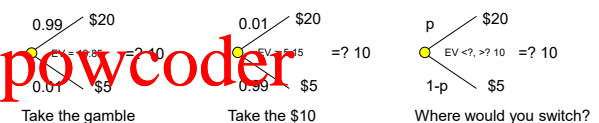
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Continuity (cont). We can always find a value of p , such that if $X_1 > X_2 > X_3$, then:

That is, $L(X_1, X_3, p) = X_2$; we can find a value of p that produces indifference between the lottery and X_2 .

Example: you can receive \$20 ($=X_1$), \$10 ($=X_2$), or \$5 ($=X_3$). So $X_1 > X_2 > X_3$. Continuity states a value of p exists where you will be indifferent. Consider:



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4. Independence. If the decision maker prefers X_1 to X_2 and X_3 is some other payoff, then any pX_1 and $(1-p)X_3$ is preferred to the same pX_2 and $(1-p)X_3$.

$$\begin{array}{c} \text{same} \\ \downarrow \\ pX_1 + (1-p)X_3 > pX_2 + (1-p)X_3 \end{array}$$

- In other words, the decision maker's preference between X_1 and X_2 is independent of other consequences like X_3 using the same probability, p .

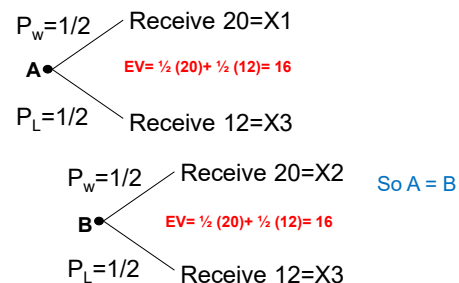
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4. Independence example 1

X_1 =receive \$20; X_2 = receive \$20 ($X_1 = X_2$); let X_3 = receive \$12. X_1 is equal to X_2 so lottery A is equivalent to the same lottery with X_2 and X_3 ; e.g.,



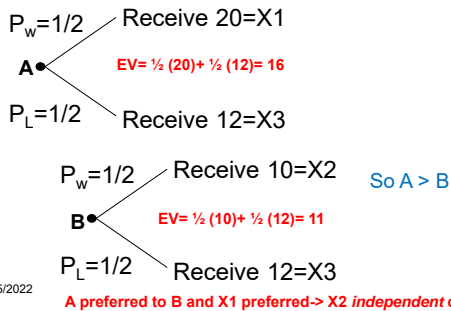
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4. Independence example 1

X1=receive \$20; X2= receive \$10 ($X1 > X2$); let X3= receive \$12. X1 is preferred to X2 and the lottery A is preferred to the same lottery with X2 and X3; e.g.,



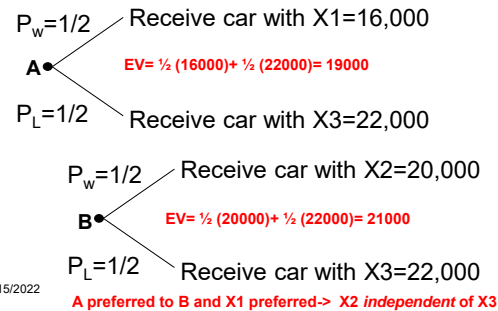
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4. Independence example 2

X1=car costs \$16,000; X2= \$20,000; X3=\$22,000
 X1 is preferred to X2 and the lottery A is preferred to the same lottery with X2 and X3



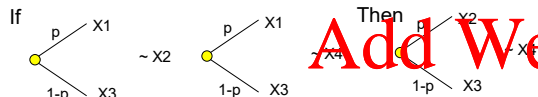
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5. Substitutability. If the decision maker is indifferent between X1 and X2, then they may be substituted for each other as payoffs in any decision making problem.

- In other words, equally preferable payoffs can be substituted for each other in any decision making problem.



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6. Monotonicity. If the decision maker prefers consequence X1 to X2, then $pX1$ and $(1-p)X2$ is preferred to $qX1$ and $(1-q)X2$ if and only if $p > q$.

- In other words, preference for a lottery involving 2 consequences is determined by the probabilities and the consequences.

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- Do the axioms hold?
- Big question in fields of decision theory, economics, and psychology
- Under what conditions are they violated?
- What happens if they are violated?
- How can such problems be mitigated?
- We will address this later in the course during the "Decision biases" lectures.

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- What if the axioms hold?
 - Decision maker preferences can be described by a utility function under the axioms of utility.
 - Subjective judgments about uncertain quantities can be described by a probability distribution satisfying the 3 axioms of probability
 - The rational decision maker should make decisions by maximizing expected utility.

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- Utility and decision making implications
 - Payoffs at terminating branches of decision tree may have more than one attribute
 - Can use multiattribute utility to represent decision maker preferences for different attributes.
 - Additive multiattribute decision model
 - Multiplicative multiattribute decision model
 - Group decision making
 - Group decision rules based on utility
- These topics will be addressed soon

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55

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