

# Choice under Uncertainty (Lecture 1a)

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## Our Outline:

- (1) Guiding Principles
- (2) History of Risk
- (3) Defining the Environment
- (4) Expected Value Theory
- (5) Risk Aversion

## #1: Carefully Define Your Environment

My view: it is impossible to operate without precise definitions of things.

- E.g., if we don't define what it means for someone to "get sick", we can have annoying conversations about appropriate health policy.

This rings especially true when we try to deal with "intuitive" things like "risk".

■ Your task: understand the definitions in this course. They are precise.

1. What are the arguments of the utility function?
2. Can a risk-loving person choose \$10 for sure over a gamble between \$0 and \$14? Why or why not?

The study of risk is perhaps the oldest element of "decision science" or behavioral economics.

Renaissance, scientists and mathematicians such as Girolamo Cardano mused about probability and concocted puzzles around games of chance.

- Franciscan monk Luca Pacioli proposed "the problem of points", which asks how one should divide the stakes in an incomplete game.
- "Fast forward" to 1654: French mathematicians Blaise Pascal and Pierre de Fermat developed a way to determine the likelihood of each possible result of a simple game (balla, which had fascinated Pacioli).
- "Fun" fact: the problem of points led directly to the first mathematical proofs by induction and the development of Pascal's infamous triangle.

Today's lecture will cover insights from the mid 18th century to modern approaches.

**Definition:** A *lottery* (or *gamble* or *risky prospect*) is a set of possible outcomes and a probability of each outcome occurring.

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**Example A:** If you go to a roulette table and place \$10 on **black**, you have just purchased a lottery. With probability **18/38** you will receive \$20, and with probability **20/38** you will receive \$0.

**Example B:** When you buy a new car, you are buying a lottery. For instance, it might be that with probability **1/2** it will be a car that you love (high value), with probability **2/5** it will be a car that only adequately serves your needs (low value), and with probability **1/10** it will be a "lemon" (worthless).

Side note: why do we call them lemons? Lemons are fine. Were other citrus fruits considered?

**Example C:** More abstractly, you might get  $x_1$  with probability  $p_1$ ,  $x_2$  with probability  $p_2$ , and  $x_3$  with probability  $p_3$  (where  $p_1 + p_2 + p_3 = 1$ ).

Ways to write lotteries:

- As a probability tree.
- As a vector of outcome-probability pairs:

**Example A:** Payoff = (\$20, 18/38 ; \$0, 20/38).

**Example B:** Car Value = ( high, 1/2; low, 2/5; worthless, 1/10).

- As a type of equation (see board in class):

Example B:

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Car Value	Probability
High	$1/2$
Low	$2/5$
Worthless	$1/10$

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In the realm of choice under uncertainty, we examine people's choices of lotteries.

Next step: Develop models of behavior.

- Suppose you face a choice between two lotteries. How do you decide?

(Not a rhetorical question... how do you? Reflect for a moment.)



One model of behavior: People choose the option with the largest "expected value."

**Definition:** The *expected value* of a lottery  $\mathbf{x} = (x_1, p_1; \dots; x_n, p_n)$  is

$$EV(\mathbf{x}) \equiv \sum_{i=1}^n p_i x_i.$$

E.g. the expected value of a 50/50 gamble in which you might win \$10 and otherwise win nothing is \$5.

## **St. Petersburg Paradox** (Bernoulli, 1713)

Consider the following bet: I'm going to flip a coin, and I'm going to keep on flipping it until I flip a HEADS. Then you'll be paid as a function of how many times we flip. Specifically:

- If I immediately flip a HEADS, you get \$2.
- If I flip one TAILS and then a HEADS, you get \$4.
- If I flip two TAILS and then a HEADS, you get \$8.
- If I flip three TAILS and then a HEADS, you get \$16.
- And so forth....

**Simple Question:** How much are you willing to pay for this bet?

How much would an expected-value maximizer pay?

- The *EV* of this bet is  $\infty$ , but people are unwilling to pay much for it. Hence, *EV* is not a good description of people's choices.

## St. Petersburg Paradox

"Now it is highly probable that any increase in wealth, no matter how insignificant, will always result in an increase in utility which is inversely proportionate to the quantity of goods already possessed." Bernouilli, 1738 (translated in 1954)

- People have **diminishing marginal utility** of money.
- Just because the gamble is worth infinite money does not mean it is infinitely valuable to a would-be gambler.

**Immediate implication:** People should maximize *utility*, not money.

| What the  $f^{\#}$  does that mean? Aren't we just moving the goalposts?

**Implication 2:** Maximizing utility implies people turn down many risks.

Simple answer: risk aversion.

**Definition:** A person is *risk-averse* if for any (risky) lottery  $\mathbf{x}$  she prefers to have  $EV(\mathbf{x})$  for sure instead of lottery  $\mathbf{x}$ .

**Definition:** A person is *risk-neutral* if for any (risky) lottery  $\mathbf{x}$  she is indifferent between  $EV(\mathbf{x})$  for sure vs. lottery  $\mathbf{x}$ .

**Definition:** A person is *risk-loving* if for any (risky) lottery  $\mathbf{x}$  she prefers to have lottery  $\mathbf{x}$  instead of  $EV(\mathbf{x})$  for sure.

⇒ Evidence suggests people are risk-averse.

⇒ Also your intuition suggests people are risk-averse.

...except it's not true all the time and we'll discuss this later.

A second model of behavior, building on economic models and Bernoulli's intuition: People choose the option with the largest "expected utility".

**Definition:** The *expected utility* of a lottery  $\mathbf{x} = (x_1, p_1; \dots; x_n, p_n)$  is

$$EU(\mathbf{x}) \equiv \sum_{i=1}^n p_i u(x_i).$$

for some function  $u : \mathbb{R} \rightarrow \mathbb{R}$ .

**Reminder:**  $u(x)$  is a mathematical representation of *observable choices*.

Could an expected-utility maximizer (EU maximizer) choose

$(100, \frac{1}{2}; 0, \frac{1}{2})$  over  $(100, \frac{1}{2}; 100, \frac{1}{2})$ ?

Could an expected-utility maximizer (EU maximizer) choose

$(100, \frac{1}{2}; 0, \frac{1}{2})$  over  $(100, \frac{1}{2}; 50, \frac{1}{2})$ ?

Could an expected-utility maximizer (EU maximizer) choose

$(100, \frac{1}{2}; 0, \frac{1}{2})$  over  $(200, \frac{1}{2}; 0, \frac{1}{2})$ ?

**Point:** If we put no restrictions on the utility function  $u(x)$ , then expected-utility theory can explain **any** individual choice

...and we're left with a pretty unsatisfying theory of behavior.

## Three Comments:

(1) We say that expected-utility theory can "explain" a choice if there exists a utility function  $u(x)$  such that an EU maximizer with utility function  $u(x)$  would make that choice.

(2) Even when we put no restrictions on the utility function  $u(x)$ , although an individual choice cannot violate EU, combinations of choices can violate EU.

E.g.:

$$(100, \frac{1}{2}; 0, \frac{1}{2}) \succ (200, \frac{1}{2}; 0, \frac{1}{2})$$

AND

$$(100, \frac{1}{3}; 500, \frac{2}{3}) \prec (200, \frac{1}{3}; 500, \frac{2}{3})$$

(3) When we put **restrictions** on the utility function  $u(x)$ , then even an individual choice could violate EU.



A natural restriction: We virtually always assume that **more is better** --- that is,  $u$  is increasing in  $x$ .

**Definition:** Lottery  $\mathbf{x}$  *dominates* lottery  $\mathbf{y}$  (or equivalently, lottery  $\mathbf{y}$  *is dominated* by lottery  $\mathbf{x}$ ) if for any amount  $z$  the probability of getting at least  $z$  in lottery  $\mathbf{x}$  is (weakly) larger than the probability of getting at least  $z$  in lottery  $\mathbf{y}$ .

Examples:

$$(200, \frac{1}{2}; 0, \frac{1}{2}) \text{ vs. } (100, \frac{1}{2}; 0, \frac{1}{2})$$

$$(200, \frac{1}{2}; 0, \frac{1}{2}) \text{ vs } (150, \frac{1}{2}; 50, \frac{1}{2})$$

$$(200, \frac{1}{3}; 150, \frac{1}{3}, 75, \frac{1}{3}) \text{ vs. } (150, \frac{1}{2}; 75, \frac{1}{2})$$

## A Modestly Uninteresting Punchline

**Result:** Under expected utility with more is better, a person will never choose a dominated lottery.

To incorporate risk-aversion (or risk-seeking), we must assume more about the utility function.

**Result:** Under expected-utility theory, a person is risk-averse if and only if her utility function is concave:  $u''(x) < 0$

**Result:** Under expected-utility theory, a person is risk-neutral if and only if her utility function is linear:  $u''(x) = 0$

**Result:** Under expected-utility theory, a person is risk-loving if and only if her utility function is convex:  $u''(x) > 0$

(1) The utility function is unique up to a positive affine transformation.

**Definition:** The function  $\tilde{u}(x)$  is a *positive affine transformation* of the function  $u(x)$  if  $\tilde{u}(x) = a \cdot u(x) + b$  for some  $a > 0$  and any  $b$ .

**Definition:**  $\tilde{u}(x)$  and  $u(x)$  *reflect the same preferences* if for any pair of lotteries  $\mathbf{x}$  and  $\mathbf{y}$

$$EU(\mathbf{x}) > EU(\mathbf{y}) \text{ if and only if } E\tilde{U}(\mathbf{x}) > E\tilde{U}(\mathbf{y}).$$

**Theorem:**  $\tilde{u}(x)$  and  $u(x)$  reflect the same preferences *if and only if*  $\tilde{u}(x)$  is a positive affine transformation of  $u(x)$ .

(2) Can  $u(\mathbf{x})$  be negative? Can  $EU(\mathbf{x})$  be negative?

- Answer: Sure. Consider an affine transformation w/  $b = -10000$ .
- Point: The level of utility doesn't matter, only the comparisons.

(3) Integration: *EU* operates on *final wealth*.

So thus far we have been doing things a bit sloppily.

Proper way to use expected-utility theory:

Let  $w$  be a person's *wealth*.

Let  $\mathbf{x} = (x_1, p_1; \dots; x_n, p_n)$  be a lottery (or gamble or risky prospect).

- Note:  $\mathbf{x}$  yields *income*  $x_i$  with probability  $p_i$ .

EU theory says evaluate prospect  $\mathbf{x}$  according to:

$$EU(\mathbf{x}; w) \equiv \sum_{i=1}^n p_i u(w + x_i).$$

(4) Closely related: *EU* operates on *reduced lotteries*.

- Example: If you face the possibility of both lottery  $\mathbf{x} = (100, 1/2; -90, 1/2)$  and  $\mathbf{y} = (95, 1/2; -85, 1/2)$ , you must first combine these into a reduced lottery before applying *EU*.

If they are independent, the reduced lottery is

$$(195, 1/4; 15, 1/4; 5, 1/4; -175, 1/4).$$

If they have perfect positive correlation, the reduced lottery is

$$(195, 1/2; -175, 1/2).$$

If they have perfect negative correlation, the reduced lottery is

$$(15, 1/2; 5, 1/2).$$

(5) There is a natural mathematical way to describe the degree of risk aversion. (At least, it is natural in a way.)

**Goal:** We'd like to make statements of the form: "If person  $A$  is more risk-averse than person  $B$ , then  $A$  is less likely to accept a particular gamble."

**Question:** How to formally define "more risk averse" ?

**Definition:** The *coefficient of risk aversion* at wealth  $w$  is

$$r(w) = \frac{-u''(w)}{u'(w)}.$$

Suppose  $w_A$  is person  $A$ 's wealth and  $w_B$  is person  $B$ 's wealth. If  $r(w_A) > r(w_B)$  then person  $A$  is less likely than person  $B$  to accept a risky gamble.



Note: A person's risk aversion depends on both her utility function and her wealth.

$$r(w) = \frac{-u''(w)}{u'(w)}.$$

**How** is one's willingness to accept a gamble likely to depend on my wealth?

- Economists often *assume* risk aversion decreases with wealth:

$$\uparrow w \implies \downarrow r(w).$$

Part 2 Coming Soon