

# BA2202 Mathematics of Finance

## Handout 9

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# The St. Petersburg Paradox

- The St. Petersburg game is played by flipping a fair coin until it comes up tails, and the total number of flips,  $n$ , determines the prize, which equals  $\$2^n$ .
- If you were a “rational” gambler, how much would you pay to participate in this game?

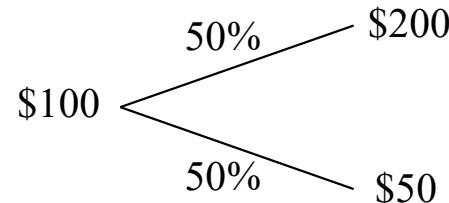
<b><math>n</math></b>	<b><math>P(n)</math></b>	<b>Prize</b>	<b>Expected Payoff</b>
1	$\frac{1}{2}$	\$2	\$1
2	$\frac{1}{4}$	\$4	\$1
3	$\frac{1}{8}$	\$8	\$1
4	$\frac{1}{16}$	\$16	\$1
5	$\frac{1}{32}$	\$32	\$1
6	$\frac{1}{64}$	\$64	\$1
7	$\frac{1}{128}$	\$128	\$1
8	$\frac{1}{256}$	\$256	\$1
9	$\frac{1}{512}$	\$512	\$1
10	$\frac{1}{1024}$	\$1,024	\$1

# Utility Theory and Uncertainty

## Utility theory

### 1. Introduction

- **Utility:** the satisfaction that an individual obtains from a particular course of action.
- **Risk (uncertainty):** a situation in which the probabilities of the different possible outcomes are known, but it is not known which outcome will occur.



- **Utility functions:** Utility can be assigned to each possible value of the investor's wealth by utility function
  - Log utility function:  $U(w) = \log(w)$  for  $w > 0$
  - Quadratic utility function:  $U(w) = w + dw^2$  for  $-\infty < w < -\frac{1}{2d}$
  - Power utility function:  $U(w) = \frac{w^{\gamma}-1}{\gamma}$  for  $w > 0$
  - The exponential utility function:  $U(w) = e^{-aw}$

# Utility Theory and Uncertainty

## Utility theory

### 2. The expected utility theorem

- A utility function  $U(w)$  can be constructed as representing an investor's utility of wealth  $w$  at some future time.
- Decisions are made in a manner to maximize the expected value of utility given the investor's particular beliefs about the probability of different outcomes.

**Example** An investor who has the log utility function face the uncertainty described in the previous slide. What is the expected wealth and what is the expected utility of wealth?

- The expected wealth =  $0.5(200) + 0.5(50) = \$125$
- The expected utility =  $0.5 \log(200) + 0.5\log(50) = 4.6052$

# Utility Theory and Uncertainty

## Utility theory

### 2. The expected utility theorem

**Example** An investor has an initial wealth of 100 and the log utility function. Investment Z offers a return of -18% or +20% with equal probability.

- (1) What is the investor's expected utility if nothing is invested in Investment Z?
- (2) What is the investor's expected utility if 100 is invested in Investment Z?
- (3) What proportion  $a$  of wealth should be invested in Investment Z under the expected utility theorem? What is the expected utility for this investment?

### Solution

- (1)  $\log(100) = 4.605$
- (2)  $E[U(w)] = 0.5 \log(0.82 \times 100) + 0.5 \log(1.2 \times 100) = 4.597$
- (3)  $E[U(w)] = 0.5 \log(100(1 - 0.18a)) + 0.5 \log(100(1 + 0.2a))$

Differentiating w.r.t.  $a$  to find a maximum

$$\frac{dE[U(w)]}{da} = 0.5 \left( \frac{-18}{100 - 18a} \right) + 0.5 \left( \frac{20}{100 + 20a} \right)$$

Setting equal to zero, we find  $a = 0.2777$ .

$$\Rightarrow E[U(w)] = 4.6066 @a = 0.2777$$

# Utility Theory and Uncertainty

## Economics characteristics

### 1. Non-satiation

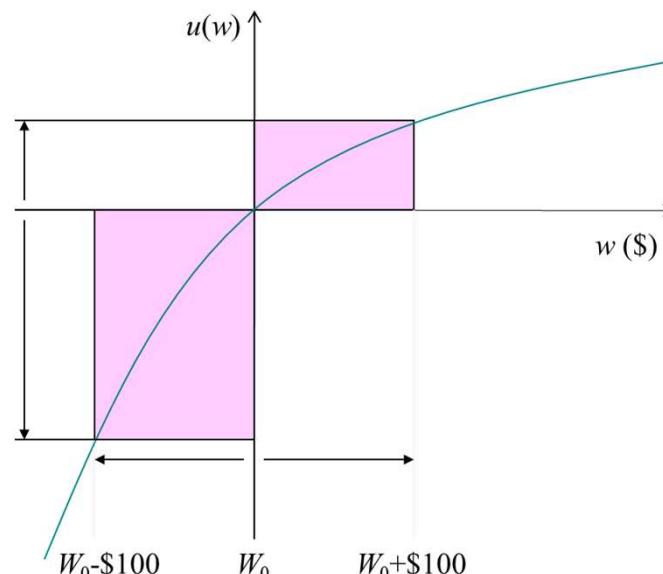
- People prefer more wealth to less (positive marginal utility of wealth):

$$U'(w) > 0$$

### 2. Risk Aversion

- A risk-averse investor values an increase in wealth less highly than a decrease (diminishing marginal utility) and will reject a fair gamble:

$$U''(w) < 0$$



# Utility Theory and Uncertainty

## Economics characteristics

### 3. Risk Seeking

- A risk-seeking investor values a marginal increase in wealth more highly than a marginal decrease and will seek a fair gamble. The utility function condition is:

$$U''(w) > 0$$

### 4. Risk Neutral

- A risk-neutral investor is indifferent between a fair gamble and the status quo. The utility function condition is:

$$U''(w) = 0$$

# Utility Theory and Uncertainty

## Economics characteristics

**Example** Which statements are correct?

- (1) A risk-averse person will
  - A. never gamble
  - B. accept fair gambles
  - C. accept fair gambles and some gambles with an expected loss
- (2) A risk-neutral person will
  - A. always accept fair gambles
  - B. always accept unfair gambles
  - C. always accept better than fair gambles
- (3) A risk-loving person will
  - A. always accept a gamble
  - B. always accept unfair gambles
  - C. always accept fair gambles

# Utility Theory and Uncertainty

## Insurance demand

### 1. The expected utility principle

- When making a choice, an individual should choose the course of action that gives the highest expected utility rather than the highest expected payout.

$$E[U(w)] = \sum_{i=1}^n U(w_i)p(w_i)$$

- where  $i$  = possible outcomes;  $w$  = wealth;  $p(w)$  = probability of a possible outcome

### 2. Example

- $w_0 = \$100K$
- $U(w) = \ln(w+100)$
- $w_1 = \$0$  with  $p(w_1) = 1\%$  and  $w_2 = \$100K$  with  $p(w_2) = 99\%$
- The expected loss (fair premium) = \$1,000
- Insurance cost to cover the loss = \$1,200

# Utility Theory and Uncertainty

## Insurance demand

### 3. With and without insurance

- With insurance, the expected utility is reduced to:

$$EU(w) = \ln(100K - 1,200 + 100) = 11.5 \text{ --- better off}$$

- Without insurance, the expected utility is:

$$EU(w) = 0.99*\ln(100K + 100) + 0.01*\ln(0 + 100) = 11.4448$$

### 4. Measures

- **Maximum premium ( $P$ )** that an individual will be willing to pay to insure himself against a loss  $X$  is given by the solution of the equation:

$$EU(w - X) = U(w - P)$$

- E.g., the maximum premium in the previous example can be calculated by:

$$0.99*\ln(100K + 100) + 0.01*\ln(0 + 100) = \ln(100K - P + 100)$$

$$\rightarrow P = 100K + 100 - e^{11.4448} = \$6,686 (\text{> the cost of coverage } \$1200)$$

- **Certainty equivalent:** The level of wealth  $w - P$  (ie  $100k - 6,686$ )

- **Risk premium:** a premium that an individual is willing to pay beyond a fair premium

$$\rightarrow \text{Risk premium} = 6,686 - 1,000 = \$5,686$$

# Utility Theory and Uncertainty

## Insurance demand

### 5. The minimum premium an insurer needs to charge

- The **minimum premium** ( $Q$ ) which an insurer should charge against a loss  $X$  is given by the solution of the equation:

$$EU(w + Q - X) = U(w)$$

### 6. Example

- Further assume that the insurer has:
  - $w_0 = \$2,000,000$
  - $U(w) = \ln(w - 1,000,000)$
- the maximum premium in the previous example can be calculated by:
 
$$0.99 * \ln(2m + Q - 1m) + 0.01 * \ln(2m + Q - 1.1m) = \ln(2m - 1m)$$

$$\rightarrow 0.99 * \ln(1m + Q) + 0.01 * \ln(0.9m + Q) = 13.81551$$

$$\rightarrow Q \approx 1,053$$
- The minimum premium is much smaller than the cost of coverage (\$1,200).
- The insure is also better off (mutually beneficial).

# Utility Theory and Uncertainty

## Optimal insurance

### 1. Simple model framework

- Diversification is not possible
- Risk situation is characterized by two states of the world:
  - State L: Loss occurs with probability  $\pi$
  - State NL: Loss does not occur with probability  $(1-\pi)$
- No time value of money, i.e., interest rate is 0 %
- Wealth in the two states of the world is determined by:
  - $w_L = w_0 - L$
  - $w_{NL} = w_0$

$w_0$ : Individual's initial wealth

$w_L, w_{NL}$ : Individual's terminal wealth

$L$ : The amount of loss

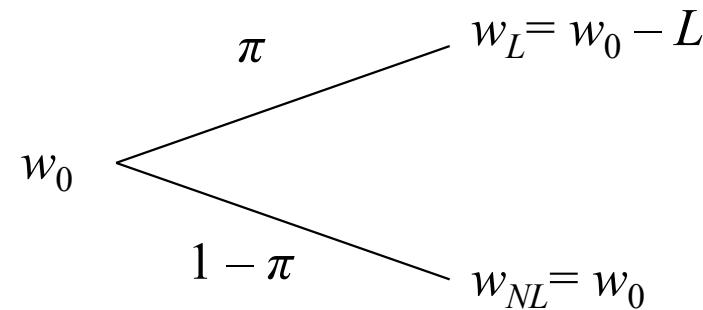
$I$ : Indemnity payment

$P(I)$ : Insurance Premium ( $\pi I$  = Fair premium)

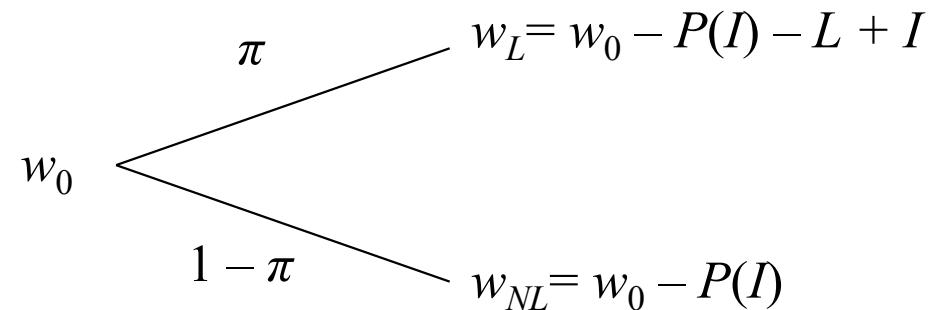
# Utility Theory and Uncertainty

## Optimal insurance

Without Insurance



With Insurance



# Utility Theory and Uncertainty

## Optimal insurance

Individuals choose insurance coverage  $I$  which maximizes the following EU:

$$EU(w) = \pi U(w_0 - P(I) - L + I) + (1 - \pi)U(w_0 - P(I))$$

Assuming fair premium,

$$EU(w) = \pi U(w_0 - L + (1 - \pi)I) + (1 - \pi)U(w_0 - \pi I)$$

Taking a derivative w.r.t.  $I$

$$dEU/dI = \pi(1 - \pi)U'(w_0 - L + (1 - \pi)I) - \pi(1 - \pi)U'(w_0 - \pi I)$$

Setting  $dEU/dI = 0$

$$\pi(1 - \pi)U'(w_0 - L + (1 - \pi)I) - \pi(1 - \pi)U'(w_0 - \pi I) = 0$$

$$\Rightarrow U'(w_0 - L + (1 - \pi)I) = U'(w_0 - \pi I)$$

$$\Rightarrow I^* = L$$

The optimal insurance is *full* coverage

# Utility Theory and Uncertainty

## Optimal insurance

2. Loading factor:  $\lambda (>0)$

Premium is defined by:

$$P(I) = (1 + \lambda)\pi I$$

With a premium with a positive loading factor :

$$w_L = w_0 - L - (1 + \lambda)\pi I + I = w_0 - L + [1 - (1 + \lambda)\pi]I$$

$$w_{NL} = w_0 - (1 + \lambda)\pi I$$

$$\begin{aligned} EU(w) &= \pi U(w_L) + (1 - \pi)U(w_{NL}) \\ &= \pi U(W_0 - L + [1 - (1 + \lambda)\pi]I) + (1 - \pi)U(W_0 - (1 + \lambda)\pi I) \end{aligned}$$

# Utility Theory and Uncertainty

## Optimal insurance

$$EU(w) = \pi U(w_0 - L + [1 - (1 + \lambda)\pi]I) + (1 - \pi)U(w_0 - (1 + \lambda)\pi I)$$

Taking a derivative w.r.t.  $I$

$$dEU/dI = \pi[1 - (1 + \lambda)\pi]U'(w_L) - \pi(1 - \pi)(1 + \lambda)U'(w_{NL})$$

Setting  $dEU/dI = 0$

$$\begin{aligned} & [1 - (1 + \lambda)\pi]U'(w_L) - (1 - \pi)(1 + \lambda)U'(w_{NL}) = 0 \\ \Rightarrow & U'(w_L)/U'(w_{NL}) = (1 - \pi)(1 + \lambda)/[1 - (1 + \lambda)\pi] \\ \Rightarrow & I^* < L \end{aligned}$$

The optimal insurance is *partial* coverage.

# Utility Theory and Uncertainty

## Optimal insurance

### 3. Example:

- Probability of loss: 0.1
- Initial wealth: 500K
- Loss amount: 200K
- Loading factor:  $\lambda = 0.2$
- $u(w) = \ln(w)$

Premium is defined by:

$$P(I) = (1.2)(0.1)I = 0.12I$$

With a premium with a positive loading factor :

$$w_L = 500 - 200 - 0.12I + I = 300 + 0.88I$$

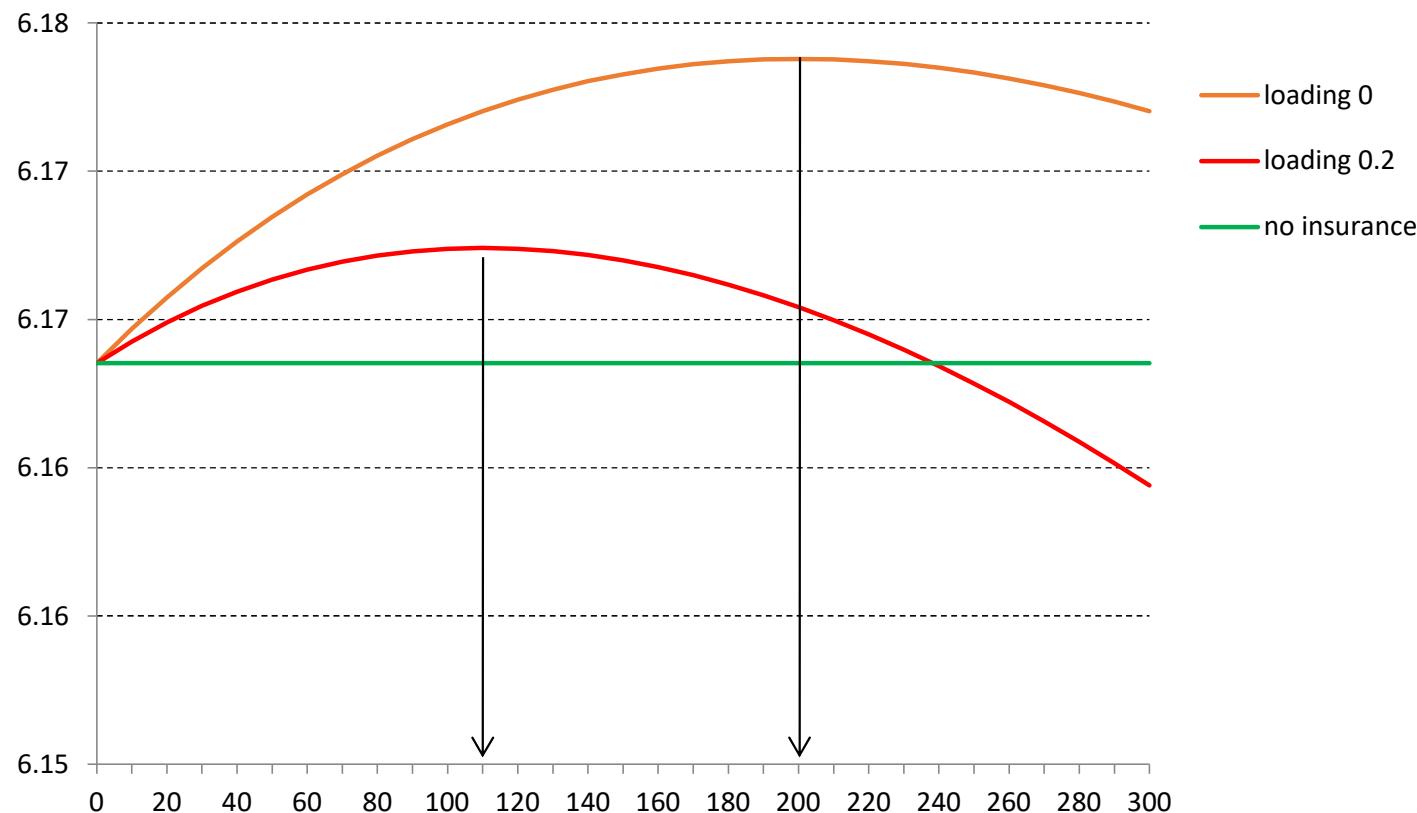
$$w_{NL} = 500 - 0.12I$$

$$\begin{aligned} EU(w) &= \pi u(w_L) + (1-\pi)u(w_{NL}) \\ &= 0.1\ln(300 + 0.88I) + 0.9\ln(500 - 0.12I) \end{aligned}$$

# Utility Theory and Uncertainty

## Optimal insurance

The optimal coverage for a premium loading 0.2 is about 110K



# Utility Theory and Uncertainty

## Optimal insurance

To find the optimal coverage, differentiate the  $EU$  w.r.t.  $I$ :

$$\begin{aligned} dEU(w)/dI &= 0.1\ln(300 + 0.88I) + 0.9\ln(500 - 0.12I) \\ &= 0.1*0.88/(300 + 0.88I) - 0.9*0.12/(500 - 0.12I) \end{aligned}$$

Setting equal to zero:

$$\begin{aligned} 0.1*0.88/(300 + 0.88I) &= 0.9*0.12/(500 - 0.12I) \\ \rightarrow 0.1056I &= 11.6 \\ \rightarrow I^* &= \mathbf{109.85} \end{aligned}$$

Check that the second derivative is negative.

$$-0.1*0.88^2/(300 + 0.88I)^2 - 0.9*0.12^2/(500 - 0.12I)^2 < 0$$

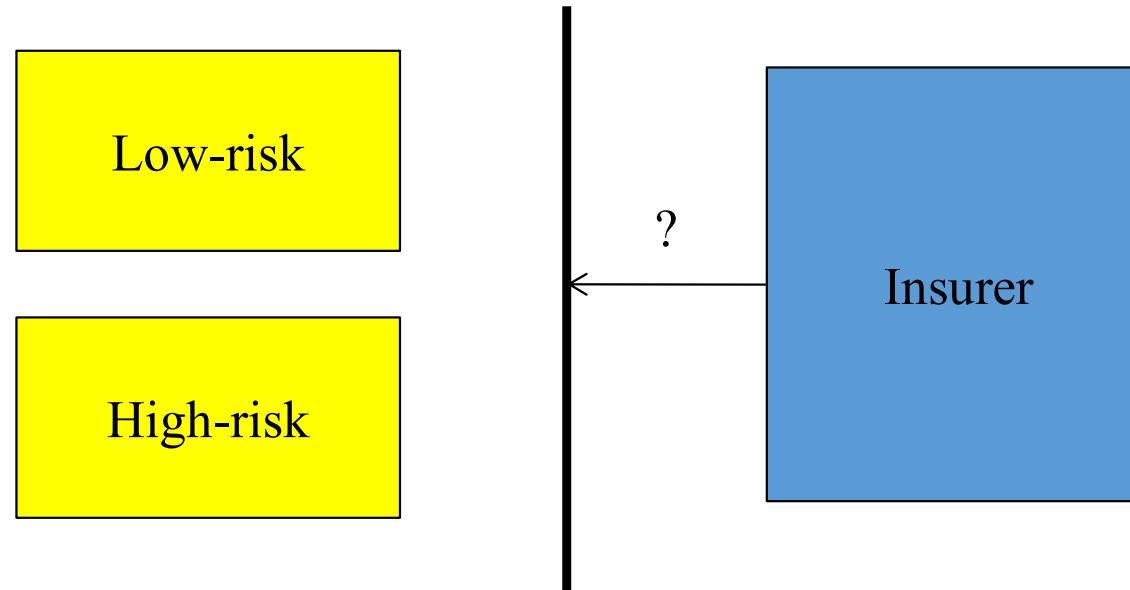
# Utility Theory and Uncertainty

## Adverse selection

### 1. Incentives

Full insurance is optimal for individuals if the premium is fair.

⇒ Is it always optimal for insurers to sell full insurance (if they can offer a fair premium)?



What if insurers cannot observe individuals' risk type?

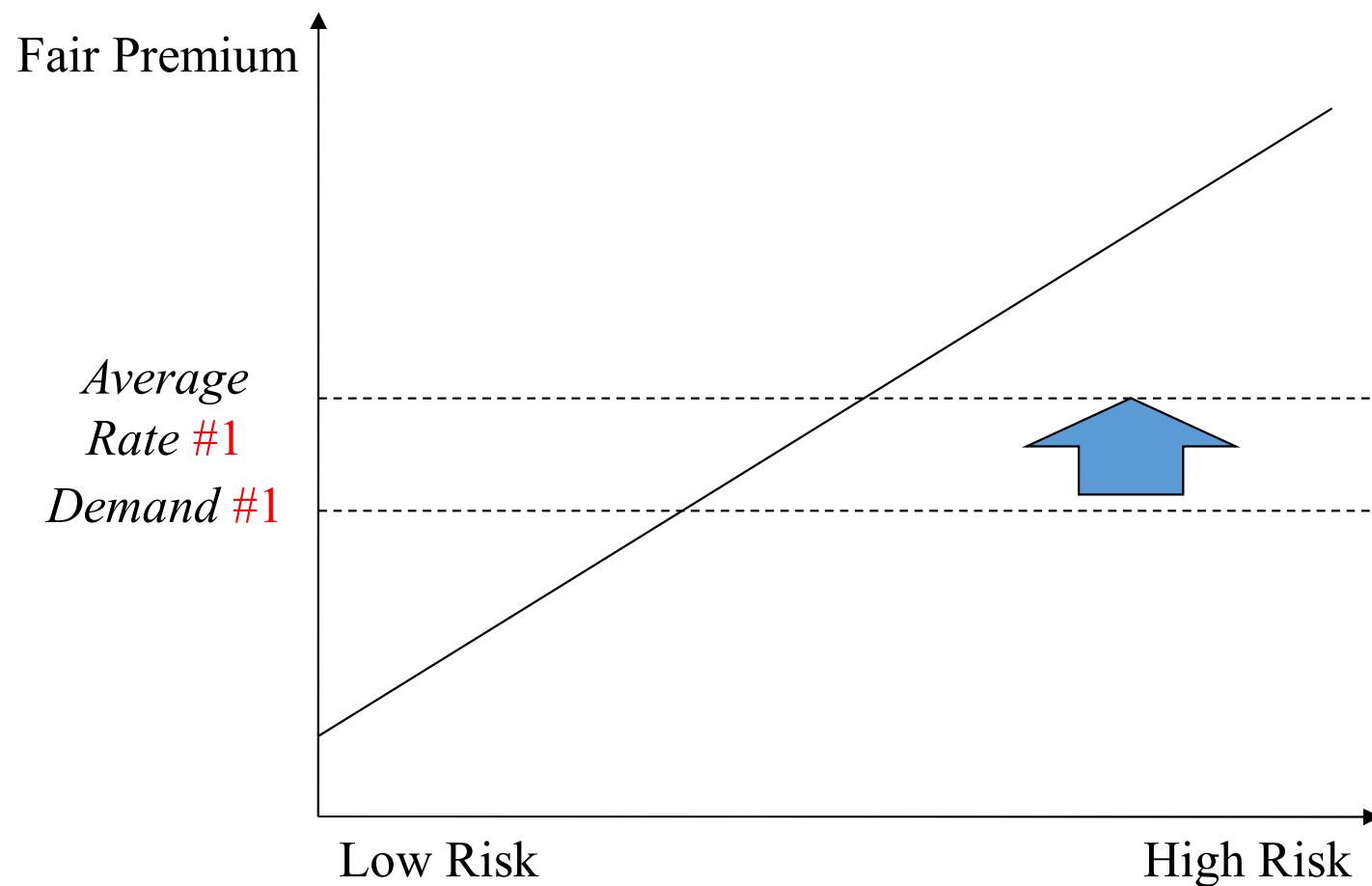
# Utility Theory and Uncertainty

## Adverse selection

- Competitive Market
  - Insurers are profit maximizers.
  - The probability of loss is uniformly distributed:  
    1%, 2%, 3%, ..., 10%
  - Loss amount is \$10,000
  - Insurers cannot distinguish individual's loss probability
1. Insurers offer a full coverage policy (offer their premium, e.g., a fair premium=\$550) first.
  2. Consumers purchase a policy.
  3. Insurer's loss realize as expected.
  4. Revise the premium according to the loss experience.
  5. Consumers purchase a policy.
  6. Repeat the process....

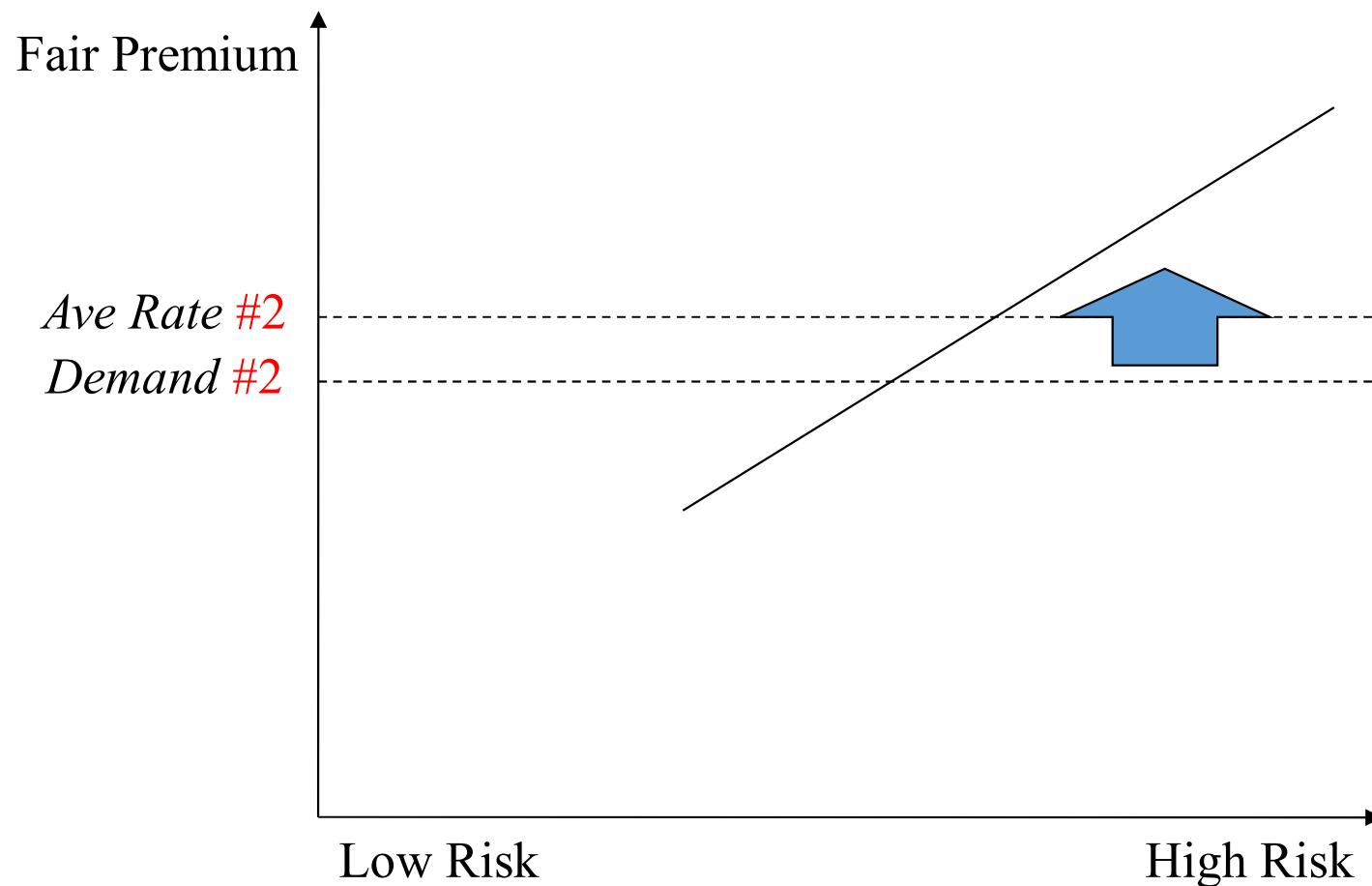
# Utility Theory and Uncertainty

## Adverse selection



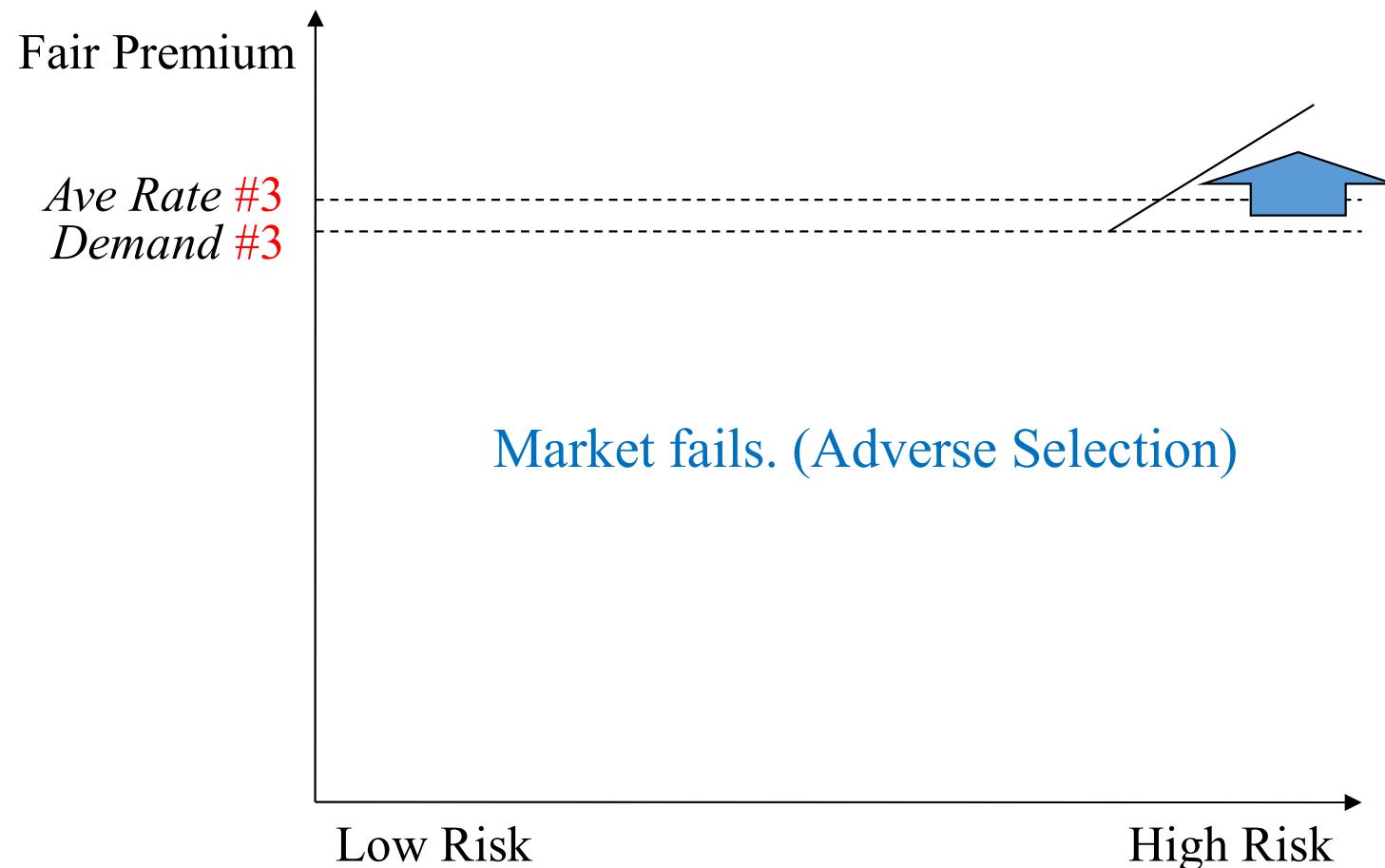
# Utility Theory and Uncertainty

## Adverse selection



# Utility Theory and Uncertainty

## Adverse selection

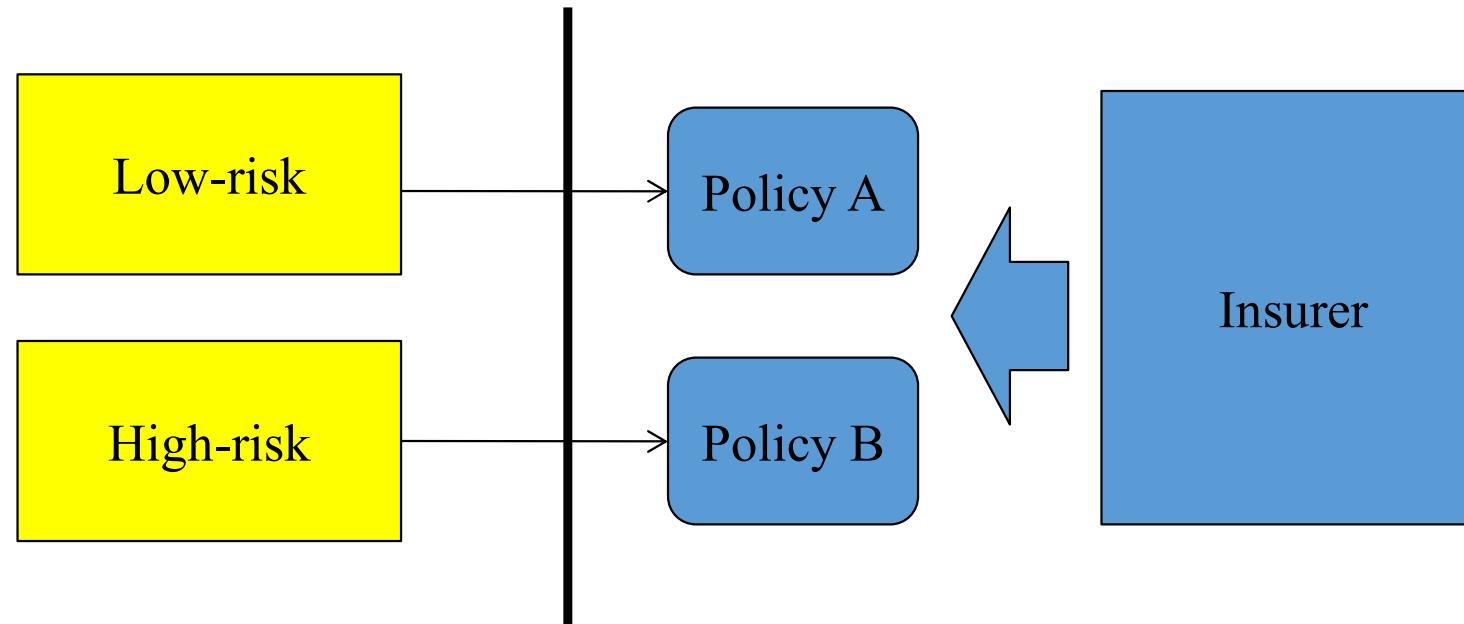


# Utility Theory and Uncertainty

## Adverse selection

### 2. Optimal contract

Insurers rather offer several different contracts such that low-risk chooses Policy A and high-risk chooses Policy B.



For example:

- Policy A is priced at low-risk fair rate but has a higher deductible
- Policy B is priced at high-risk fair rate but has a lower (or no) deductible

# Utility Theory and Uncertainty

## Adverse selection

Example:

- High-risk individual's Probability of loss: 0.1
- Low-risk individual's Probability of loss: 0.05
- Initial wealth: 500K
- Loss amount: 200K
- $U(w) = \ln(w)$

Insurers offer two policies:

- Policy A: Coverage 50K (partial coverage) at premium rate 0.05
- Policy B: Coverage 200K (full coverage) at premium rate 0.1

# Utility Theory and Uncertainty

## Adverse selection

### Low-risk Individuals:

For Policy A

$$EU(w) = 0.05\ln(300 + 0.95(50K)) + 0.95\ln(500 - 0.05(50K)) = \textcolor{red}{6.1917}$$

For Policy B

$$EU(w) = 0.05\ln(300 + 0.9(200K)) + 0.95\ln(500 - 0.1(200K)) = 6.1738$$

**⇒ L-type chooses Policy A (Its fair premium with a high deductible)**

### High-risk Individuals:

For Policy A

$$EU(w) = 0.1\ln(300 + 0.95(50K)) + 0.9\ln(500 - 0.05(50K)) = 6.1737$$

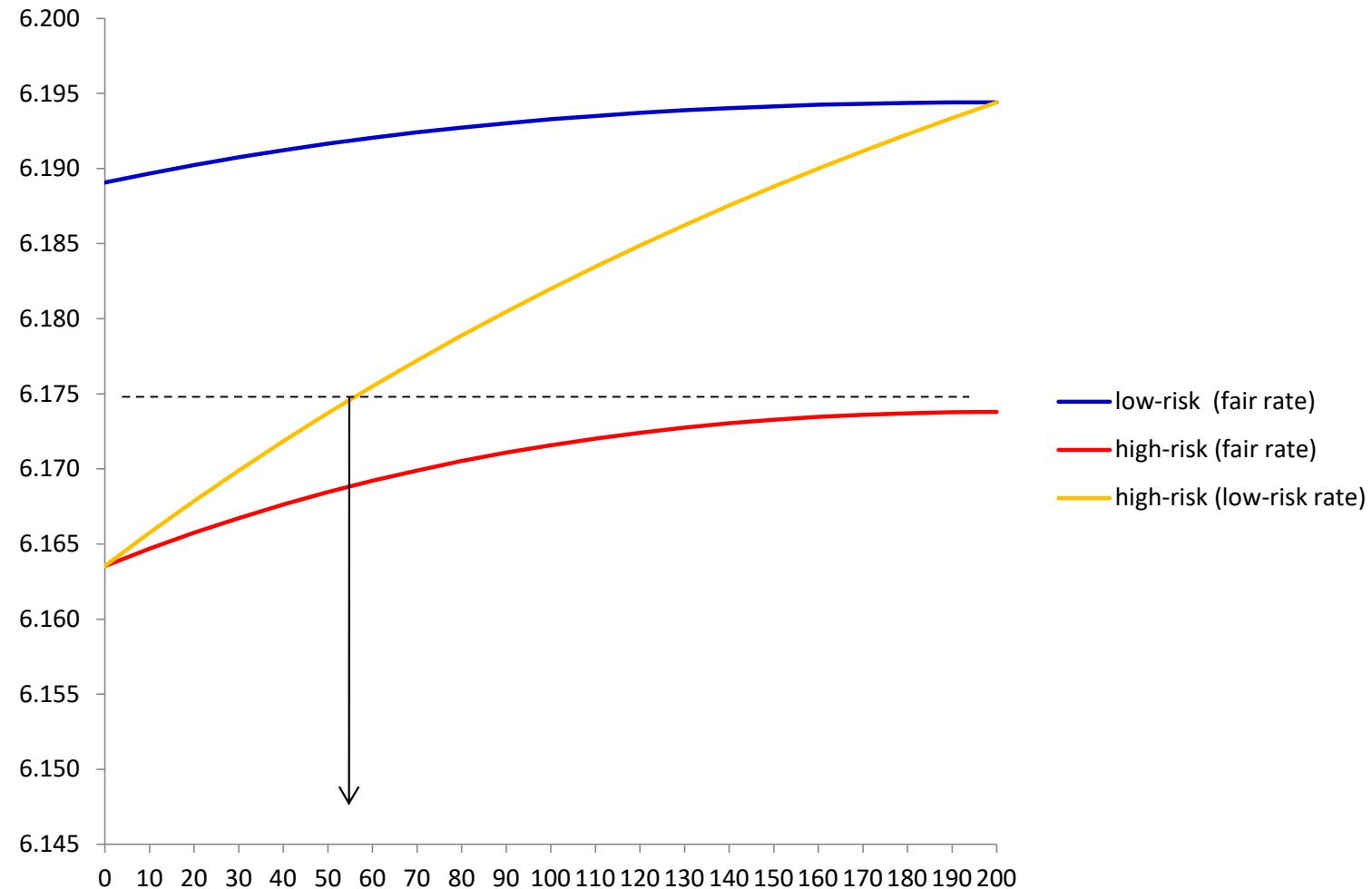
For Policy B

$$EU(w) = 0.1\ln(300 + 0.9(200K)) + 0.9\ln(500 - 0.1(200K)) = \textcolor{red}{6.1738}$$

**⇒ H-type chooses Policy B (Full coverage at its fair premium)**

# Basic Model of Insurance Demand

## Adverse selection

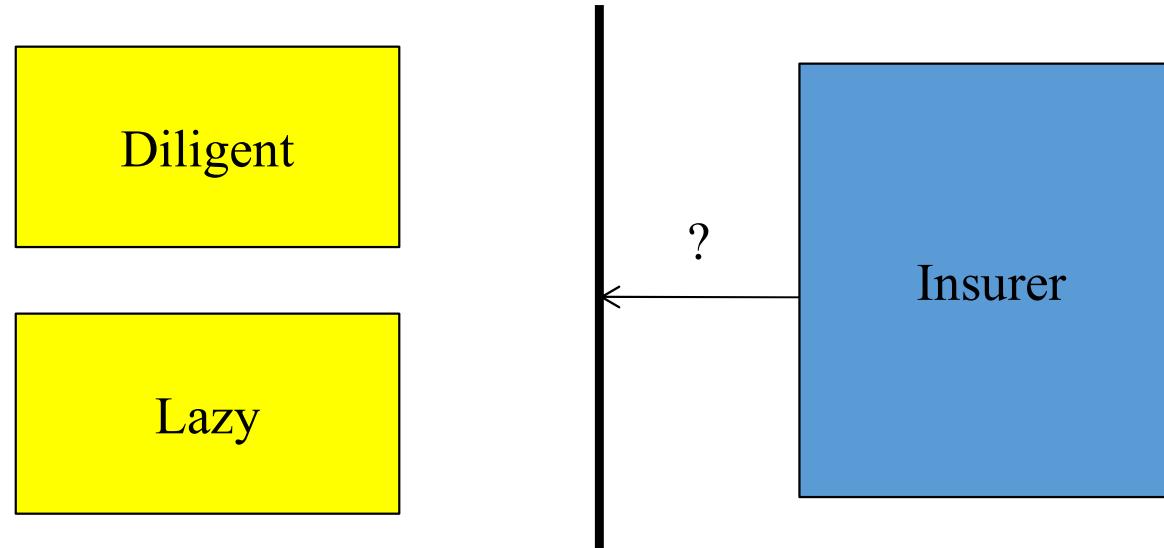


# Utility Theory and Uncertainty

## Moral Hazard

### 1. Incentives

Individuals are different in their costs of exerting effort to avoid losses.



What if insurers cannot observe individuals' level of effort?

# Utility Theory and Uncertainty

## Moral Hazard

Example:

- Individual's probability of loss: 0.1
- Diligent individuals' cost of effort: 100 for 10% reduction of loss prob.
- Lazy individuals never exert effort to reduce loss prob.
- Loss amount: 200K
- Initial wealth: 500K
- $U(w) = \ln(w)$

What would happen if loss is fully covered?

# Utility Theory and Uncertainty

## Moral Hazard

### 2. Optimal contract

If **full coverage** is offered, **diligent Individuals:**

Without Effort

$$EU(w) = 0.1\ln(300 + 0.9(200K)) + 0.9\ln(500 - 0.1(200K)) = \textcolor{red}{6.1738}$$

With Effort

$$\begin{aligned} EU(w) &= (0.9*0.1)\ln(300 - 0.1 + 0.9(200K)) \\ &\quad + (1 - 0.9*0.1)\ln(500 - 0.1 - 0.1(200K)) = 6.1736 \end{aligned}$$

**⇒ Diligent individuals choose not exerting effort**

If **coverage is \$180K**, **diligent Individuals:**

Without Effort

$$EU(w) = 0.1\ln(300 + 0.9(180K)) + 0.9\ln(500 - 0.1(180K)) = 6.1737$$

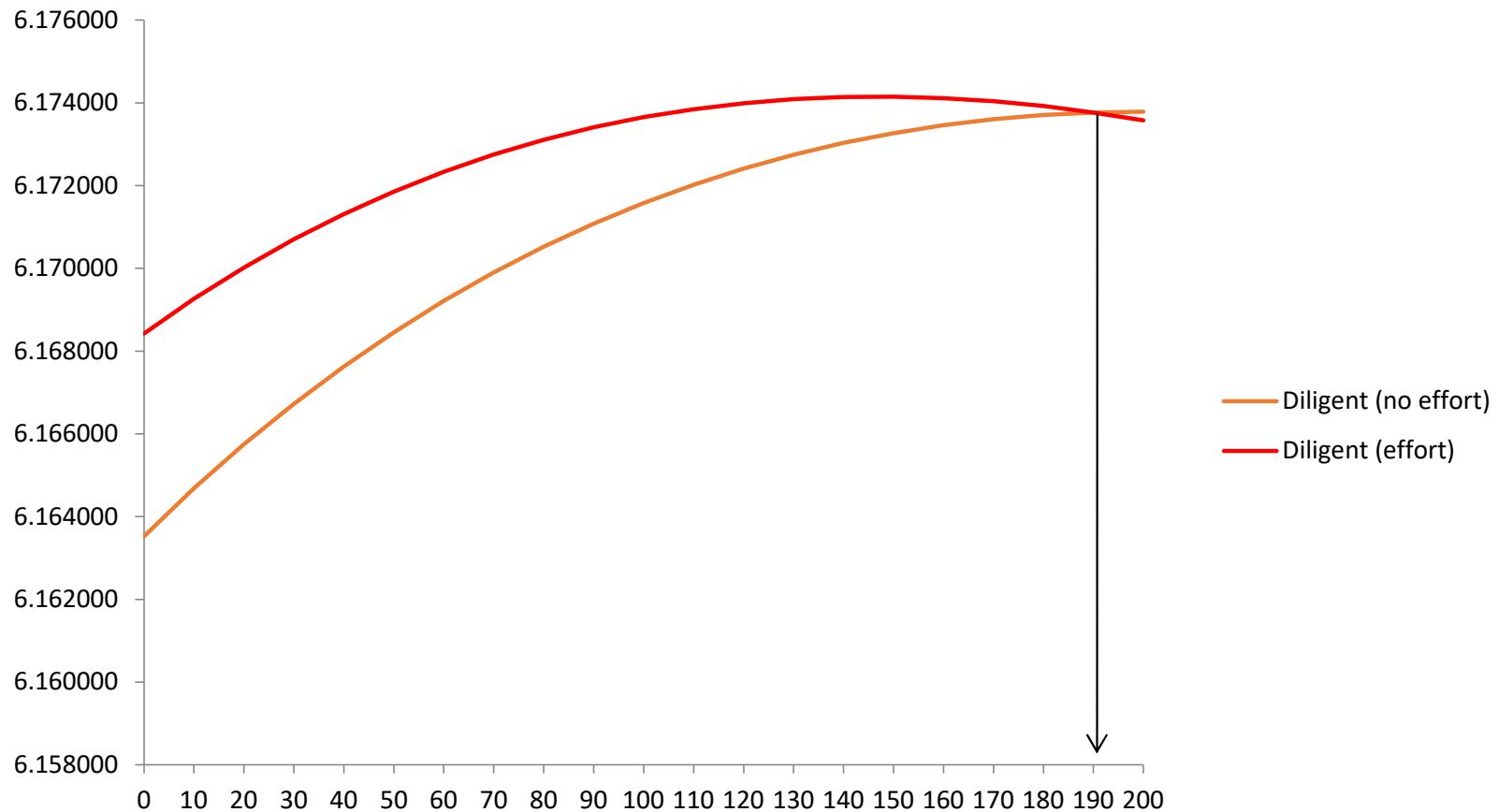
With Effort

$$\begin{aligned} EU(w) &= (0.9*0.1)\ln(300 - 0.1 + 0.9(180K)) \\ &\quad + (1 - 0.9*0.1)\ln(500 - 0.1 - 0.1(180K)) = \textcolor{red}{6.1739} \end{aligned}$$

**⇒ Diligent individuals choose exerting effort**

# Utility Theory and Uncertainty

## Moral Hazard



# Utility Theory and Uncertainty

## Moral Hazard

Change in one party's incentives after a contract agreement is made.

- Insurance (private insurance, deposit insurance, health insurance etc)
- Bank bailout
- Too big to fail
- Subprime mortgage crisis

# Utility Theory and Uncertainty

## Measuring risk aversion

How does risk aversion change with wealth?

- Absolute risk aversion (ARA)

$$A(w) = \frac{-U''(w)}{U'(w)}$$

→ Investors who hold an increasing (decreasing) **absolute** amount of wealth in risky assets as they get wealthier exhibit declining (increasing) **absolute** risk aversion.  
 In practice, decreasing absolute risk aversion is often assumed.

- Relative risk aversion (RRA)

$$R(w) = -w \frac{U''(w)}{U'(w)}$$

→ Investors who hold an increasing (decreasing) **proportion** of their wealth in risky assets as they get wealthier exhibit declining (increasing) **relative** risk aversion.

	Absolute risk aversion	Relative risk aversion
Increasing	$A'(w) > 0$	$R'(w) > 0$
Constant	$A'(w) = 0$	$R'(w) = 0$
Decreasing	$A'(w) < 0$	$R'(w) < 0$

# Utility Theory and Uncertainty

## Measuring risk aversion

- The quadratic utility function:  $U(w) = w + dw^2$

$$U'(w) = 1 + 2dw; \quad U''(w) = 2d$$

Therefore, non-satiation condition imposes  $-\infty < w < -\frac{1}{2d}$  and risk averse utility requires  $d < 0$ .

$$A(w) = \frac{-2d}{1 + 2dw} \Rightarrow A'(w) = \frac{4d^2}{(1 + 2dw)^2} > 0$$

$$R(w) = \frac{-2dw}{1 + 2dw} \Rightarrow R'(w) = \frac{-2d}{(1 + 2dw)^2} > 0$$

- The log utility function:  $U(w) = \log w$

$$U'(w) = \frac{1}{w}; \quad U''(w) = -\frac{1}{w^2}$$

Both non-satiation and risk averse utility conditions are satisfied for  $w > 0$ .

$$A(w) = \frac{1}{w} \Rightarrow A'(w) = -\frac{1}{w^2} < 0$$

$$R(w) = 1 \Rightarrow R'(w) = 0$$

→ This is consistent with an investor who keeps a constant proportion of wealth invested in risky assets as they get richer.

# Utility Theory and Uncertainty Limitations

- Need to know the precise form and shape of the individual's utility function.
- Cannot be applied separately to each of several sets of risky choices.
- May not be possible to consider a utility function for the firm.