

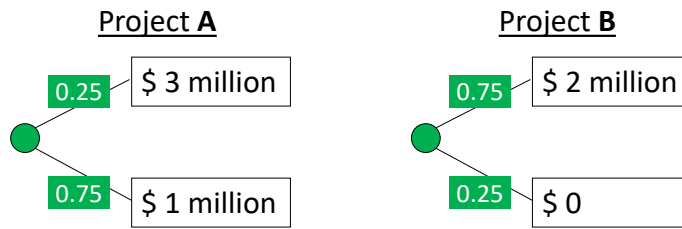


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Risk and Risk Tolerance in Decision Making

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Expected Value does not reflect Risk Preferences



- Expected Values of **A** and **B** are the same.
- Variance of **A** and **B** is the same.
- Still, we are not indifferent between **A** and **B**...
- How much would you pay/ask for switching from **B** to **A**?

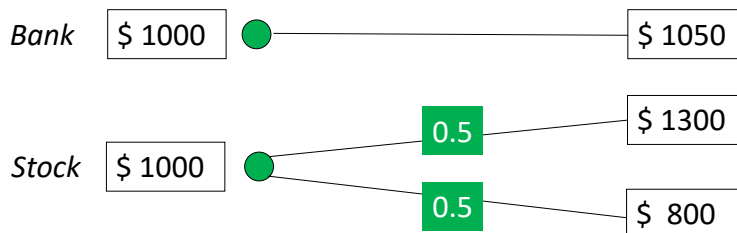
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Expected Value vs. Risk

Two investments of \$1000:

- Savings account with annual yield of 5%
- Stock with a 50:50 chance of \$1300 (+30%) or \$800 *(−20%) in a year



- Expected returns are identical:
 - Savings account = 5%
 - Stock = $0.5 \times 30\% + 0.5 \times (-20\%) = 5\%$
- Which would you prefer?
- In general, for the same expected return, investors prefer more reliable, less uncertain → they will require a **higher return** for a **riskier** asset

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Risk Tolerance in Decisions Involving Risk

- What is Risk Tolerance (or Risk Aversion)?
- How do we use Risk Tolerance to prescribe decisions?
- How do we measure a person's Risk Tolerance?

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What is Risk Tolerance (or Risk Aversion)?

- ❑ A coefficient that measures an individual's willingness to accept a quantifiable risk
- ❑ If Person 1 has higher risk tolerance than Person 2, then Person 1 will accept all the risks that Person 2 accepts
- ❑ A person's Risk-Tolerance coefficient is derived from the individual's **utility function** for wealth, an abstract measure of economic well-being
- ❑ Risk-Tolerance and Risk-Aversion: simply reciprocal of each other
 - α = Risk-Aversion coefficient
 - $\tau = 1/\alpha$ = Risk-Tolerance coefficient

Formal definition: $\alpha(x) = -\frac{u''(x)}{u'(x)}$ where u is the utility function,
 x is the payoff (e.g., \$)

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“Mathematicians evaluate money in proportion to its quantity, while people with common sense in proportion to the usage that they can make of it.”

Gabriel Cramer (1704-1752)

Swiss mathematician

Correspondence with Nicolas Bernoulli, 1728

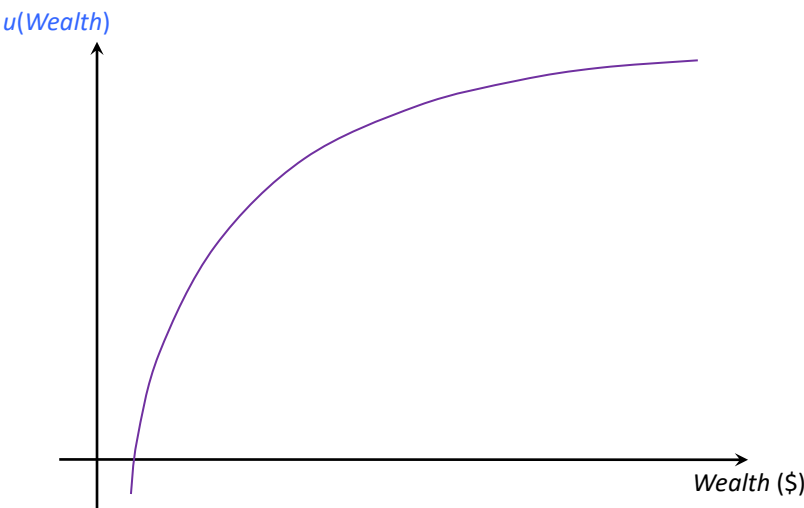
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Utility of Wealth: typically, concave (diminishing marginal utility)



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The shape of the utility function determines Risk Attitudes

Risk Averse



A **downside** change in payoff carries **more weight** than the same-size upside

For any gamble:

$$CE < EV$$

Risk Neutral



Downside and upside changes in payoff have the **same weight**

For any gamble:

$$CE = EV$$

Risk Seeking



An **upside** change in payoff has **more weight** than the same-size downside

For any gamble:

$$CE > EV$$

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Utility Functions: Some Common Mathematical Forms

- **Exponential**

$$u(x) = 1 - e^{-x/\tau}$$

τ is the **Risk Tolerance** coefficient
 $1/\tau$ is the **Risk Aversion** coefficient

- **Power**

$$u(x) = \frac{(x + w)^\alpha}{\alpha} \quad \text{for } x \geq -w$$

- **Logarithm**

$$u(x) = \text{Ln}(x + w) \quad \text{for } x > -w$$

- **Others...**

Quadratic, Linear + Exponential, etc...

Inspecting Excel graphs...

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Risk Tolerance of the Exponential Utility Function

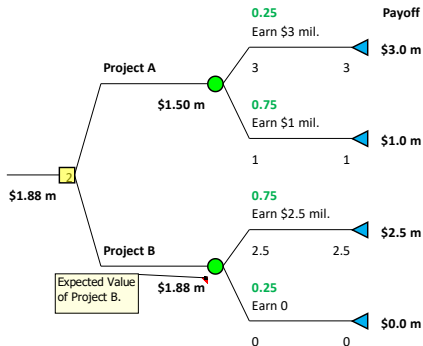
- The **exponential utility function**: $u(x) = 1 - e^{-x/\tau}$
- Has **desirable mathematical properties** for prescriptive analysis
- We can ignore background wealth, reason on gains & losses
- The **Risk Tolerance coefficient** is the parameter τ , a constant
- τ is in the same units as x , the payoff
- Lower value of τ means less risk tolerant, or more risk averse
- Built into *TreePlan* software: ready-made formulas to calculate EU and CE

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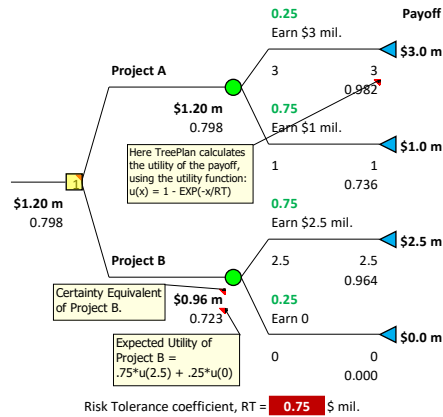
How do we use Risk Tolerance to prescribe decisions?

Decision tree with Expected Values



Under EV, Project B is the best choice

Decision tree with Risk Tolerance



Under EU, Project A is the best choice

See separate instructions for how to incorporate Risk Tolerance in TreePlan.

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Certainty Equivalent: a sure thing equal to a gamble

Definition CE = the risk-free amount, C , that is worth exactly as much as the Gamble X

$$u(C) = E[u(X)] \Rightarrow C = u^{-1}(E[u(X)])$$

The math formulas for this are built into decision tree software

Interpretations

- CE measures the value of a gamble, in the same units as the payoffs, a risk-free cash equivalent of the gamble.
- A higher CE is preferred!
- The individual is indifferent between having CE for sure or taking the Gamble
- CE is the minimum selling price of the Gamble (lowest payment the decider would accept in exchange for giving up the gamble)

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Direct Formula for CE of Bell-shaped Distributions

If a **gamble** has a **bell-shaped** distribution
and the **utility** function is **exponential**,
then the **CE of the gamble** can be approximated as:

$$CE = EV - \sigma^2 / (2\tau)$$

where: EV = Expected Value of the gamble (the Mean)
 σ^2 = Variance of gamble
 τ = Decision maker's Risk Tolerance coefficient

- ✓ Formula is exact if the gamble has a Normal distribution
- ✓ Approximates well if distribution is bell shaped
- ✓ Approximates well if risk is small relative to risk tolerance ($\sigma \ll \tau$)

Very practical, because the Mean and Variance of a random variable can be easily calculated or estimated by MC simulation.

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How do we measure a person's Risk Tolerance?

Risk Tolerance/Expected Utility analysis: solidly grounded on *Rational Choice Theory*, the **gold-standard** for decision-making under risk.

Yet...

Measuring Risk Tolerance is probably the thorniest part of all this:

- ❑ Financial institutions and fiduciaries use questionnaires to assess risk tolerance. Those produce a rough score with *limited predictive and prescriptive validity*.
- ❑ A person's choices may not all be consistent with one stable risk tolerance, making it *elusive to measure*.
- ❑ People's responses to risk situations are a mix of economic and psychological factors, *fraught with bias and error*.
- ❑ People find it *difficult to answer* questions that probe their risk tolerance.

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Corporate Risk Tolerance

- Risk aversion is a concern in few, **high-stake** decisions
- Some **rules of thumb** for setting the Risk-Tolerance coefficient: [*]
 - For companies taking moderate risks, set: $\tau \approx \text{Net Income}$ [1]
 - For large, diversified firms, set: $\tau \approx 1/6 \times \text{Firm's Equity}$ [2]
 - For oil exploration units, set: $\tau \approx 1/4 \times \text{Unit's Annual Budget}$ [3]
- The **same Risk Tolerance** should be used throughout the company
- Because the Certainty Equivalent of a **risky NPV** accounts for the idiosyncratic risk of the project, the discount rate should not be risk-adjusted for calculating NPV (otherwise you will double-count risk: once with discounting, then again with CE)

[*] based on empirical studies with senior management and business unit managers

[1] McNamee, P. & J. Celona 1990. *Decision Analysis with Supertree* (2nd ed), The Scientific Press: San Francisco, p. 122.

[2] Howard, R. A. 1988. Decision Analysis: Practice and Promise. *Management Science*, **34**, 679-695.

[3] Walls, M. R., T. Morahan & J. S. Dyer 1995. Decision Analysis of Exploration Opportunities in the Onshore US at Phillips Petroleum Company. *Interfaces*, **25**, 39-56.

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So, what's your Risk Tolerance?

Some ways to assess your risk-tolerance coefficient (τ):

- ☐ Subjectively estimate your certainty equivalent(s) for some gamble(s) that are representative of the risky decisions you face. Then solve for the value of τ that best fits your certainty equivalents. (Can use Solver for this! ☺)
- ☐ You have a one-time opportunity to invest in a start-up that has 2/3 chance to make you a multi-billionaire, and 1/3 chance to lose all the money invested. Ask yourself: What is the largest amount, M , of my own money that I would be willing to put in it? Then, your $\tau \approx M$.
- ☐ What is your discretionary wealth, W_d ? You could take your $\tau \approx W_d$.

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Risk and Risk Attitude - Summary

- ❑ Expected Value does **not account for risk** in decisions, because it weighs upside (gains) and downside (losses) equally, linearly.
- ❑ To reflect the risk and risk preferences, we evaluate gambles using the decision maker's **risk tolerance**.
- ❑ The Risk Tolerance coefficient is derived from the decision maker's utility for money. The **utility function** measures relative preferences for payoffs; if concave, it will weigh downside variations in payoffs more heavily than upside variations of the same magnitude.
- ❑ A gamble is evaluated by its **Expected Utility (EU)**, the expected value of *utility* scores. From EU, we can calculate the **Certainty Equivalent (CE)** of the gamble: CE is the **risk-adjusted** value of the gamble.
- ❑ Decision rule: select alternatives with **highest CE** (same as **highest EU**).
- ❑ Risk Aversion has far-reaching implications for economic decisions, notably in insurance, investment, financial risk management, diversification, ...

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