



convex risk

A Modern Approach to Pricing For Risk

Stephen J Mildenhall

Liberty Mutual Capital Modeling Forum | November 9, 2021

Wiley Series in Probability and Statistics

PRICING INSURANCE RISK

THEORY AND PRACTICE

STEPHEN J. MILDENHALL
JOHN A. MAJOR

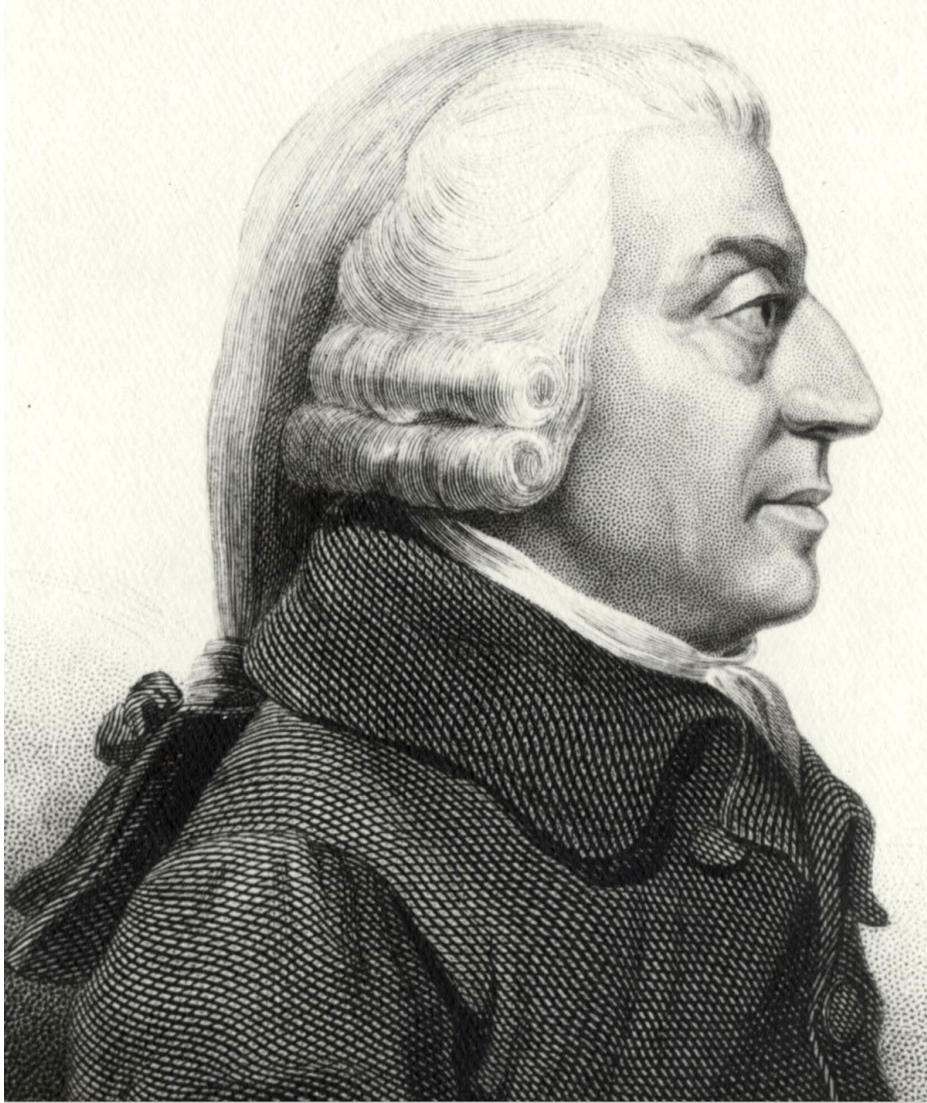
$$\begin{aligned}\bar{P}(a) &= \int_0^a g(S(x)) dx \\ &= xg(S(x)) \Big|_0^a + \int_0^a xg'(S(x)) dF(x) \\ &= \int_0^a xg'(S(x)) dF(x) + ag(S(a)) \\ &= E[(X \wedge a)g'(S(X))]\end{aligned}$$

$$\begin{aligned}D^0 \rho_X(X_i) &:= E[X_i \tilde{Z}^X] \\ D^1 \rho_{X,\tilde{X}}(X_i) &:= E[X_i Z_{\tilde{X}}]\end{aligned}$$

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Avoid
Arbitrary
Assumptions



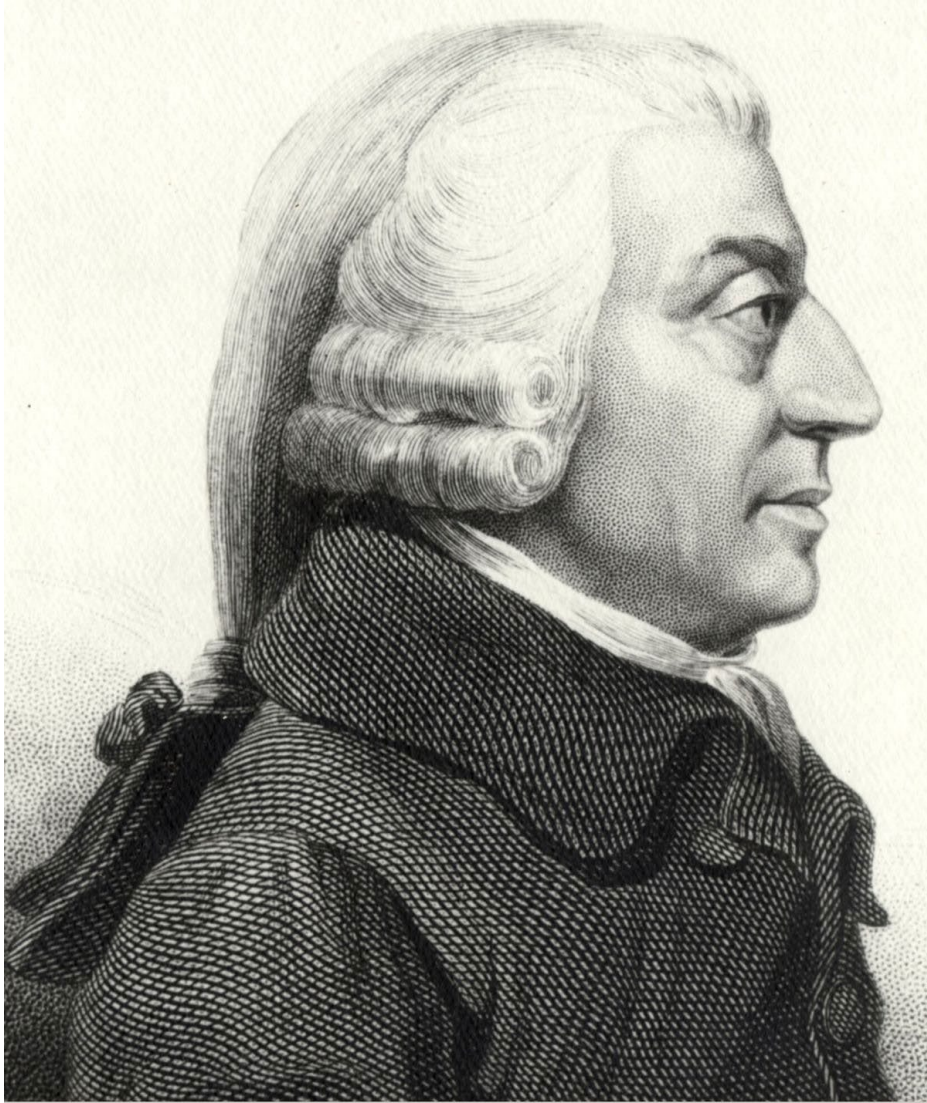
THE WEALTH OF NATIONS

ADAM SMITH

CLASSICBOOKS

In order to make insurance a trade at all, the common premium must be sufficient to compensate the common losses, to pay the expense of management, and to afford such a profit as might have been drawn from an equal capital employed in any common trade.

Book 1, Ch X, Part I, 5th Edition, 1789



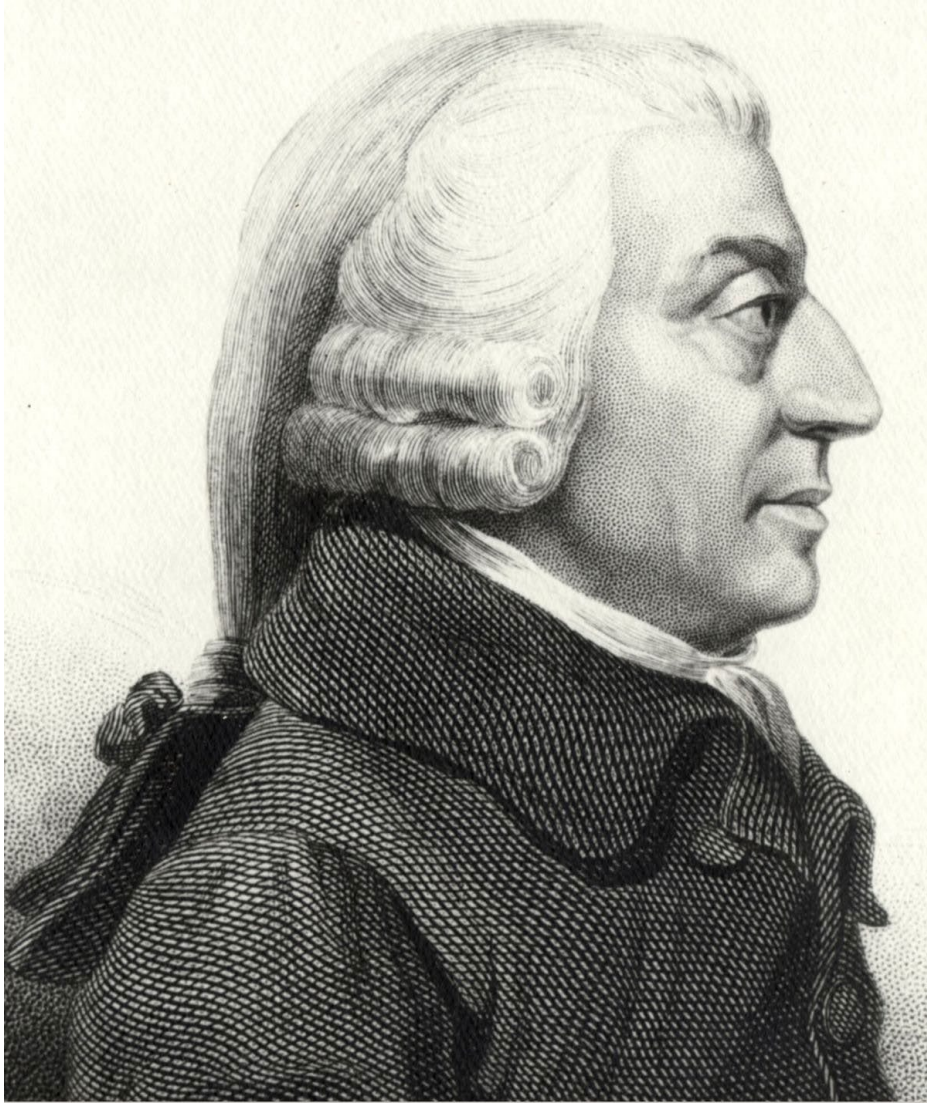
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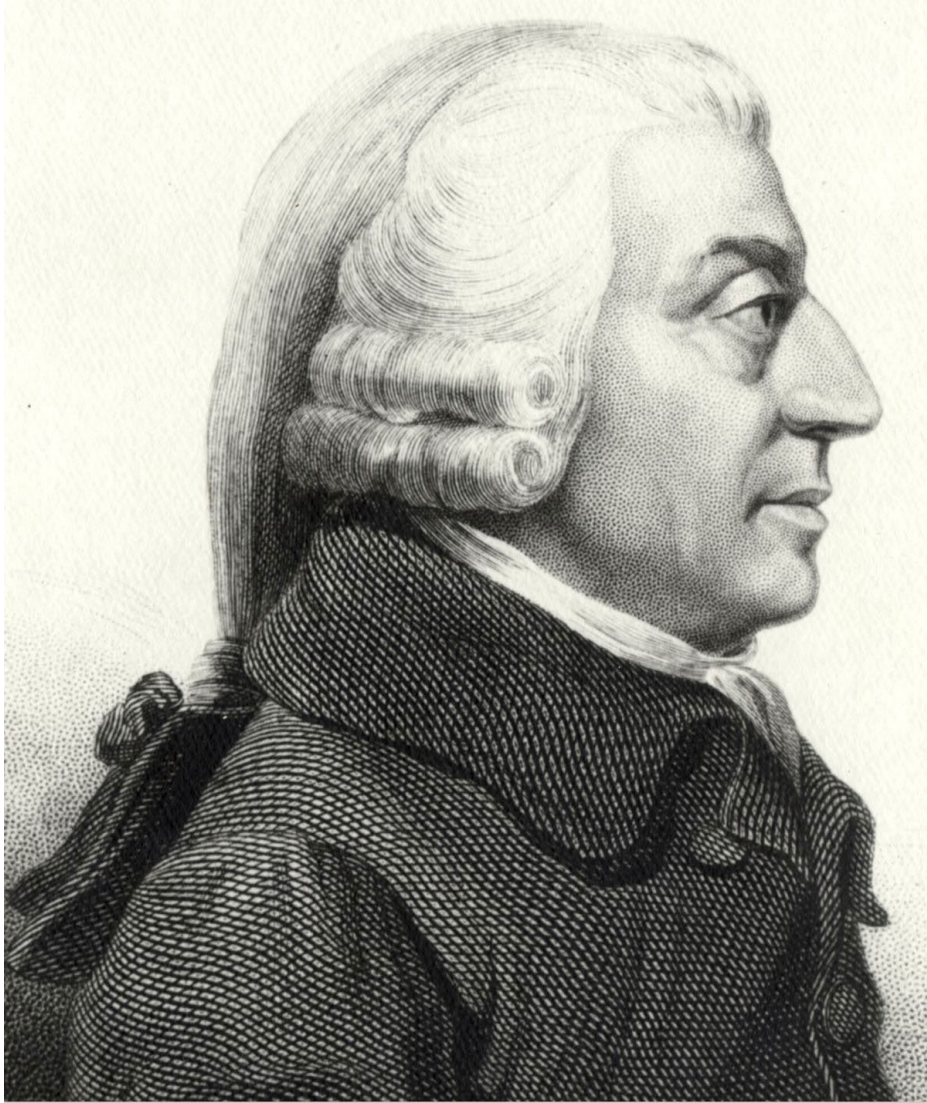
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C L A S S I C B O O K S

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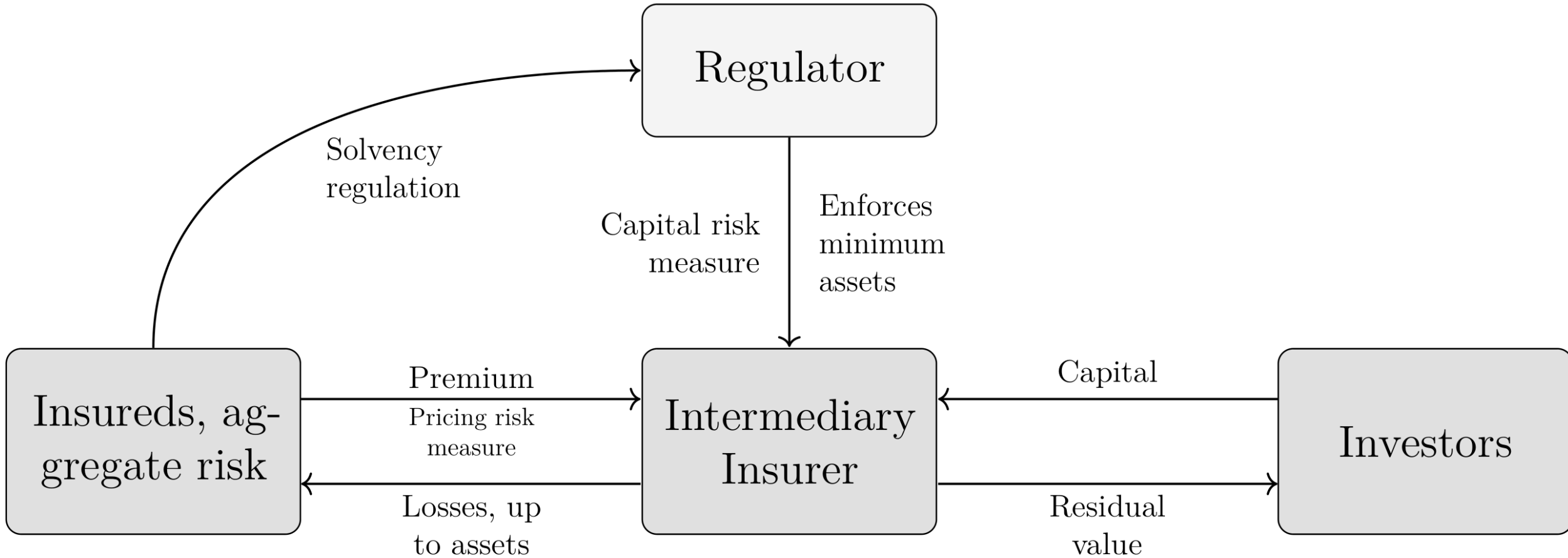
$$\text{Margin} = (\$ \text{ Amount of Capital}) \times (\text{Cost} / \$)$$

Two perspectives on Cost / \$

1. User → Cost of Capital
2. Provider → Target Return
or Target **Risk** Return



Whose opinions matter?





Avoid Arbitrary Assumptions

▪ Portfolio pricing

- Regulator [customers, rating agency, market norms] determines total **amount** of capital
- Investors determine **cost** of capital
- Mutuals: policyholder funds like (lower-cost) equity

▪ Price allocation to units

- Marginal Euler allocation
- [Decomposition, co-TVaR, co-measure] **natural** allocation
- Generally the same!
- Both depend on an unspecified aggregate **pricing functional**



Portfolio Regulatory Capital Standards

- **Proxy one-year aggregate VaR**
- Agg VaR = expected + Occ VaR
- Factor based RBC + cat charge + diversification
- Challenging technical properties
- No one cares about your internal capital model
- They care a lot about your assessment of catastrophe risk
- Management should focus on **confidence in pricing**



Finance 101 fails: price and motivation

- $H(\text{ot}) =$ pays 1 if average temperature in August is above 90°F
- Objective probability of loss = p
- Premium “functional” $P(H)$
- Underwriter wants **positive** margin, $P(H) > p$
- $C(\text{old}) = 1 - H$, pays 1 if average temperature below 90°F
- Objective probability of loss = $1 - p$
- Since $1 = H + C$, no-arbitrage & an **additive** functional implies $P(1) = 1 = P(H) + P(C)$
- \rightarrow Cold has **negative** margin



Additive pricing and no arbitrage

- Writing H and C creates a riskless portfolio $H + C = 1$, value 1
- **Insured** initiated
 - Write H for $A(H)$
- **Insurer** initiated
 - Write C for $B(C)$
 - Creates hedge portfolio
 - Need to find buyer
 - Market for lemons
- $A(H)$ has a positive margin
- $B(C)$ has a negative margin because buyer skeptical
- No arbitrage: $A(H) + B(C) = 1$



The Bid-Ask Spread for a Security/Policy X

- Transaction: if I sell X to you and...

$$\text{Ask}(X) = -\text{Bid}(-X)$$

– if you want to buy X , then you pay my **asking price**

- Sell X (insured initiated): $A(X)$

– if I want to sell X , then I receive your **bid price**

- Sell $-X$ (insurer initiated): $B(-X)$

Motivation alters price

- Hedged portfolio $X - X \equiv 0$ must have value 0 by no arbitrage

Bid \leq Ask

- $A(X) + B(-X) = 0$

- $\rightarrow A(X) = -B(-X)$



The Bid-Ask Spread for Insurers



- Insureds want to **buy** insurance
- Insurers want to **sell** securities
- Pay **asking** price
- Receive **bidding** price

Insurers pool and transform **bought** policies into **sold** securities...motivation alters price



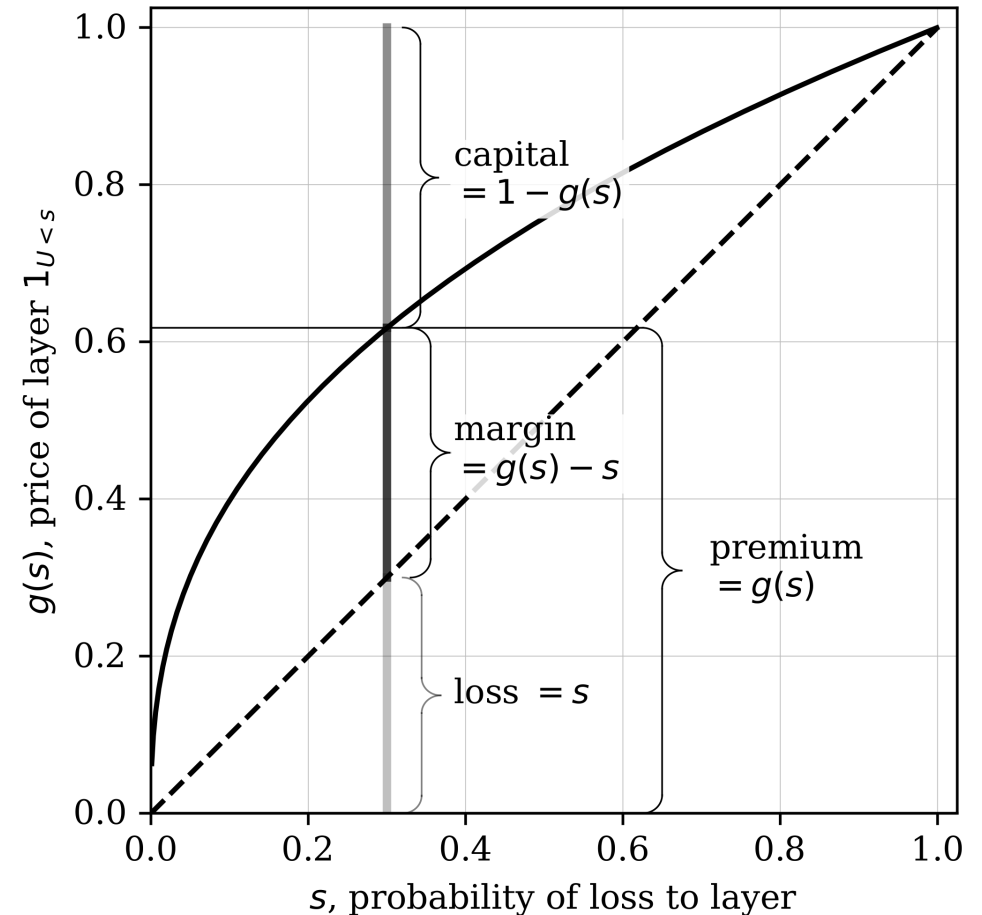
Bernoulli Risks: The Fundamental Atoms of Risk

- **Bernoulli risk** (security)
 $X = \text{Ber}(p)$ pays \$1, probability p
- Premium **law invariant**
- Insurer asks premium $A(X) = g(p)$ to write $\text{Ber}(p)$, depends only on p
- Insurer supported by assets 1
- Insurer raises capital by selling residual $1 - X = \text{Ber}(1 - p)$
- Investors bid $B(1 - X)$ for residual
- $$\begin{aligned} B(1 - X) &= 1 + B(-X) \\ &= 1 - A(X) \\ &= 1 - g(p) \end{aligned}$$
- sale of residual funds assets of 1



The Premium and Capital Functionals

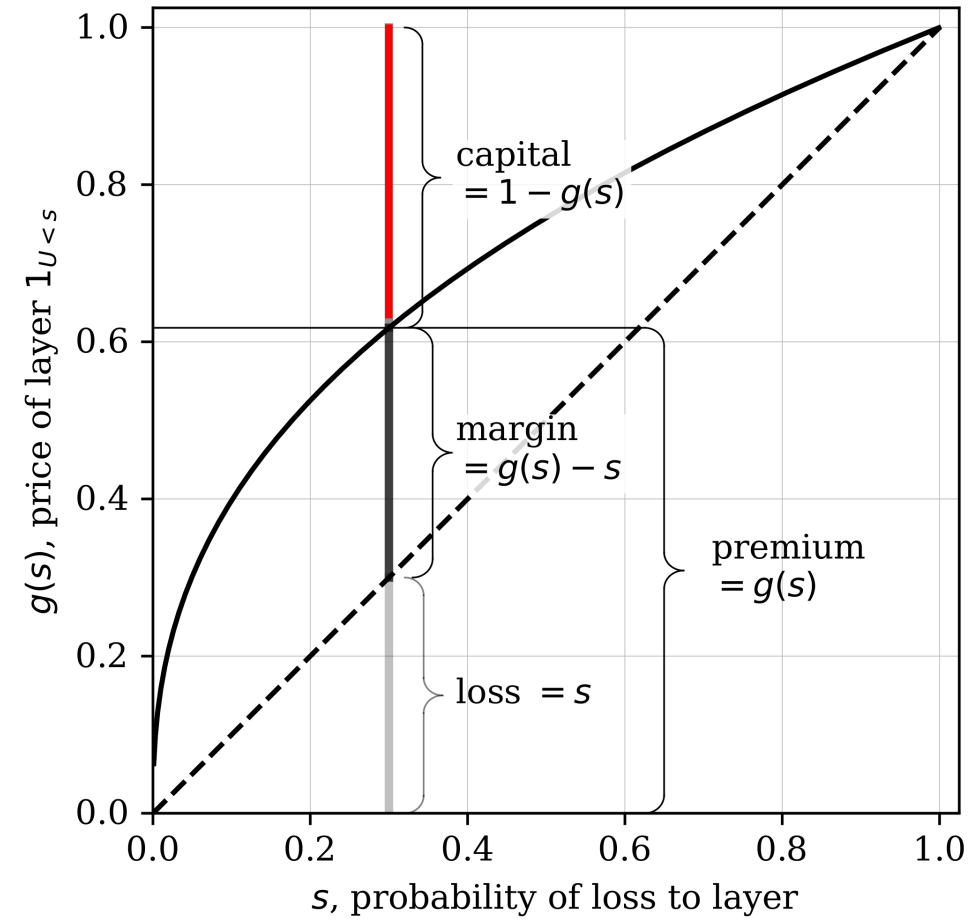
- **Law invariant** assumption
- $s = 1 - p$
- Premium = $A(X) = g(s)$
- Capital = $B(1 - X) = 1 - g(s)$
- Single **distortion function** g determines A and B
- Credit yield curve



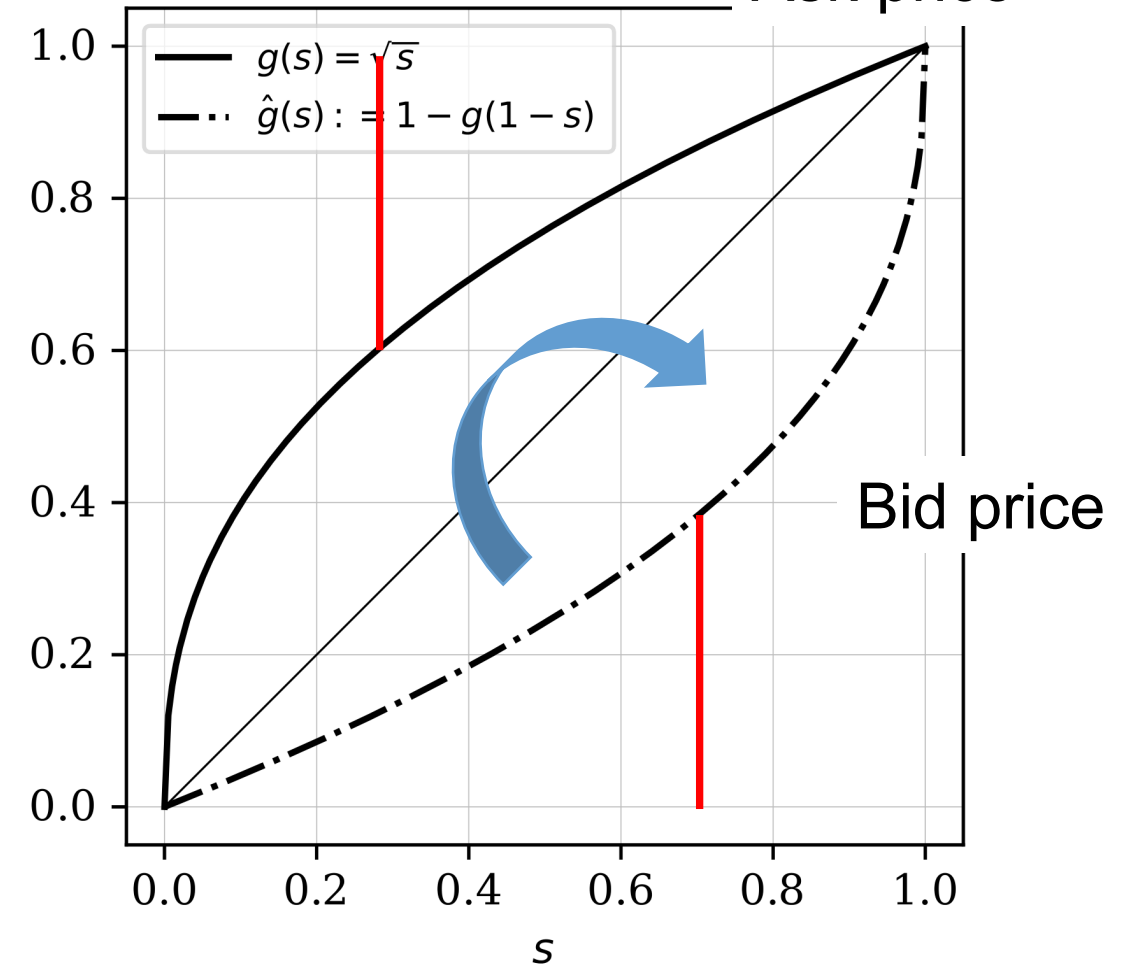


The Premium and Capital Functionals

Ask price



Ask price





The Story So Far...

- **One** pricing functional for **all** contingent cash flows, but **two** viewpoints
 - Ask price $A(X)$ applies to bought (re)insurance policies, premium
 - Bid price $B(X) = -A(-X)$ applies to sold insurer securities, capital
- Spread allows for underwriter skepticism: Hot/Cold policies both have margins
- Law invariant: price of $\text{Ber}(p)$ only depends on p
- Translation invariance: $A(X + c) = A(X) + c$ for constant c



Next: Price Realistic Portfolio using Bernoulli Risks

- Add-up layer price density
- But $A(\cdot)$ is not additive for all risks...bid-ask spread
- Assume price **additive** for risks that do not diversify against one-another
 - VaR capital adds up
- Comonotonic random variables
 - $X = f(Z)$
 - $Y = g(Z)$
 - f, g increasing functions
- Example: two different layers on the same risk

...with these combined assumptions, price of risk equals sum of prices of its Bernoulli layer parts



Pricing Realistic Portfolio from Bernoulli Risks

- $1_{X>x}$ is a Bernoulli risk random variable, with $p = S(x) := \Pr(X>x)$
- $1_{X>x}(\omega) = 1$ if $X(\omega) > x$
- All $1_{X>x}$ are comonotonic
- $X = \int 1_{X>x} dx$
- Assume ask price functional A is law invariant, comonotonic additive, coherent

Derive price using

- $A(X) = \int A(1_{X>x}) dx$
- $A(1_{X>x}) = g(S(x))$
- $A(X) = \int g(S(x)) dx$



Determining the pricing function g

- Three kinds of insurer capital
 - Equity: lowest priority, quota share residual value
 - Debt: tranching, AA, A, BBB,...
 - Reinsurance
 - Catastrophe
 - Aggregate
 - All other

- **Capital structure determines g**

...capital structure plus capital standard determines portfolio price

Adam Smith suggests...

Margin = (\$ Amount of Capital) x (Cost / \$)

By Unit = (\$ Allocated Capital) x (Cost / \$)

Focus on
**capital
allocation**

Hard:
**assume
constant**



Allocate directly using premium functional

Marginal, Euler allocation

- Blessed by economics 101

Natural (e.g., co-TVaR) allocation

- Blessed by finance, risk-adj probs

Good news: under general assumptions marginal and natural are the same by **Delbaen's Theorem**

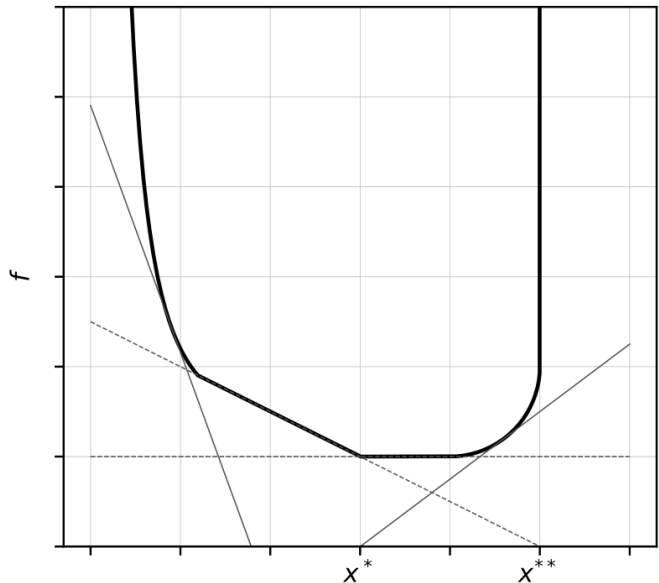
E.g., holds iff all total loss outcomes distinct (no ties)
→ unique ordering of events



Bad News:

General assumptions do not hold under **limited liability**

- Marginal methods fail because risk measure is not differentiable
- Ordering problem



- Natural allocation not unique
- **Linear Natural Allocation**
Average over all natural allocations
= marginal over all orderings

- Allocation always satisfies
 $B(X_j) \leq \text{allocation} \leq A(X_j)$
- If units are independent
 $E(X_j) \leq \text{allocation} \leq A(X_j)$



Conclusions

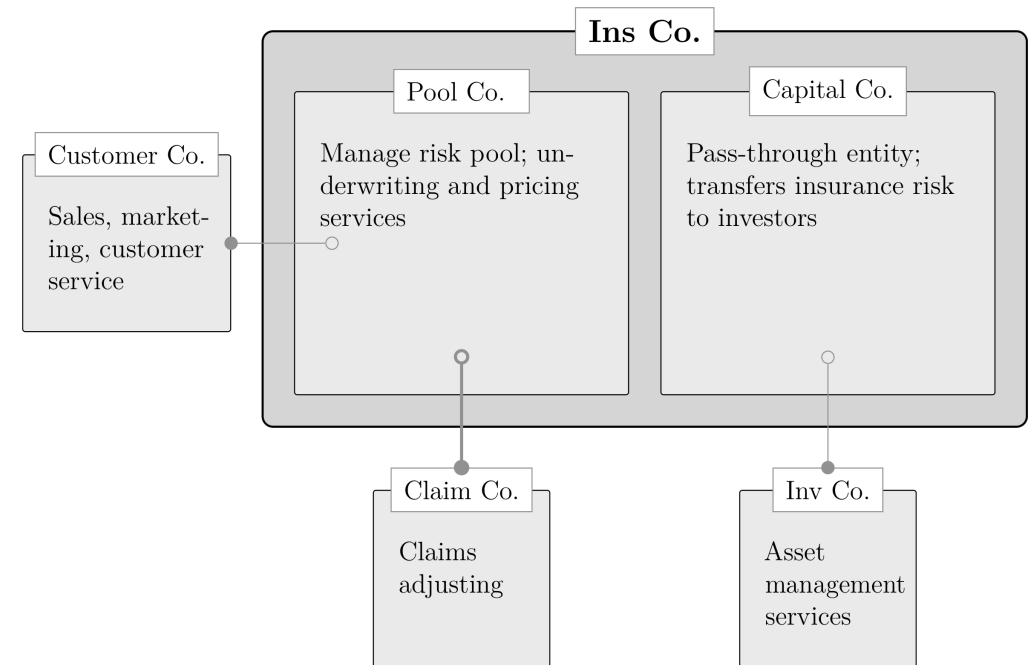
- Calibrate g function to capital structure
- Use binding capital constraint to determine total capital
- Use linear natural allocation to price by unit
- Buying motivation matters!
- Focus on **pricing confidence** and communicating it to investors / owners



Appendix: Why a return only to capital?

- Capital = all investments made by firm
- Commission includes margin paid to Customer Co. capital
- Fee-for-service options: TPA, MGA
- **Focus: pure “risk premium” net of expenses**

Insurance Company Functions





Contact Information



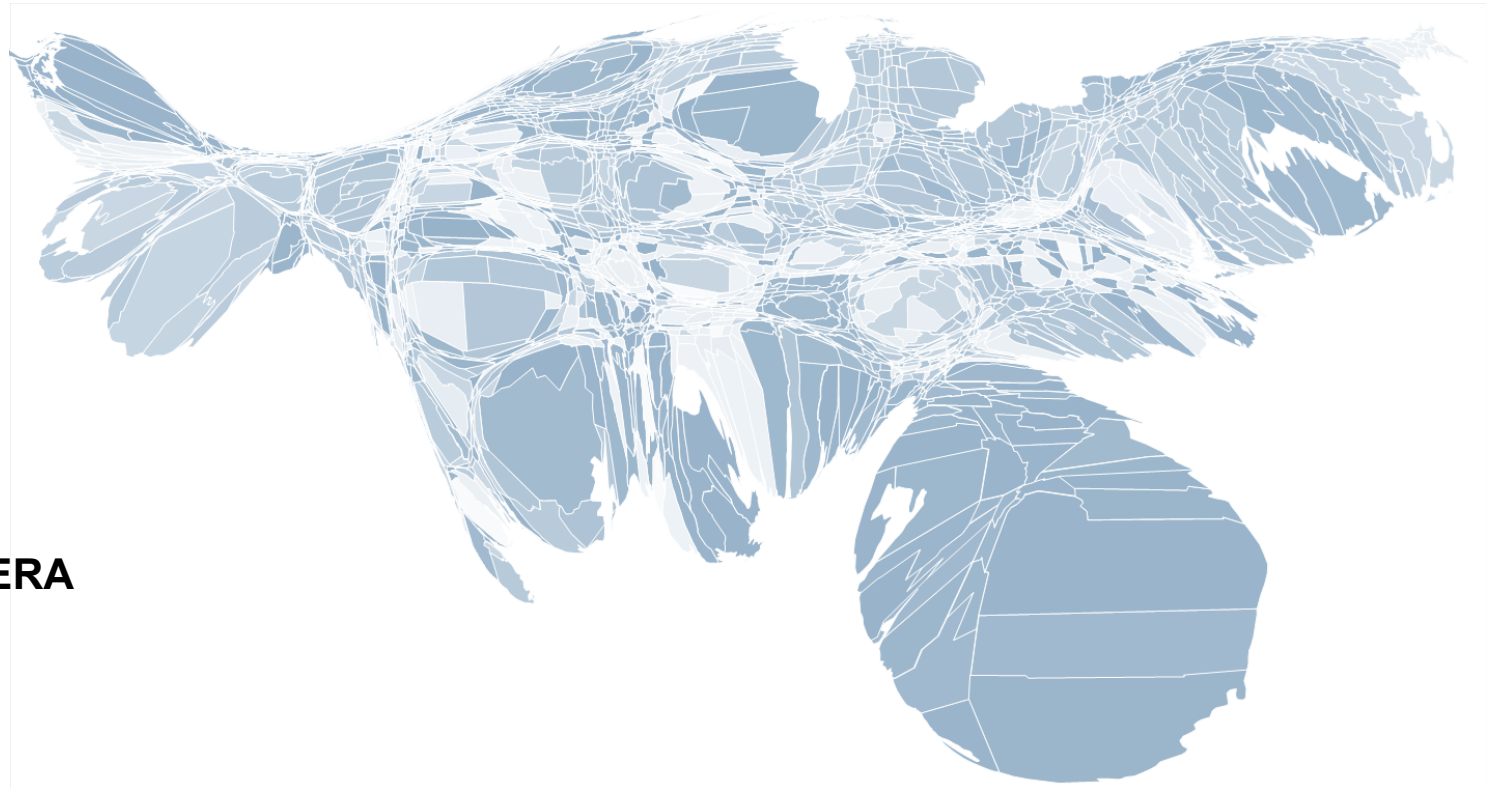
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Graphic note: County size scaled to RMS loss estimates for hurricane, earthquake and severe weather using Gastner & Newman algorithm