

# **Optimal Layers for Catastrophe Reinsurance**

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# Preliminaries - 1

- The reinsurance transaction generally
- Seeks to balance many factors:
  - Risk appetite of management
  - Market appetite for risk
  - Recent catastrophe experience (of reinsurer)
  - Recent catastrophe experience (of reinsured)
  - Underlying rate adequacy (primary rates)
  - Historical reinsurer/reinsured relationship
  - Costs and benefits
  - And many other factors

## Preliminaries - 2

- Usually a reinsurance broker is involved
- The process easily is more art than science
- Some strange combinations of factors are brought together seemingly mysteriously on the way to a final catastrophe reinsurance arrangement
- Decision-making is generally based on the idea that a reinsurance transaction is evaluated on its own (irrespective of the underlying business)
- This paper attempts to improve on this condition

## Preliminaries - 3

Two ideas are advanced in this paper:

1. We propose that the reinsurance decision incorporate the risk characteristics of the underlying book of business
2. We propose the optimization (at least the technical optimization) decision be based on maximizing downside risk-adjusted profit.

# Preliminaries - 4

## Input items

- 1 Loss ratio distribution (expected) of the reinsured book of business
- 2 Price quotes obtained for various combinations of reinsurance retentions and participations
- 3 Distribution of the number of catastrophes
- 4 Distribution of amount of gross loss arising from a catastrophe event

# Preliminaries - 5

## Process

- 1 Fit a distribution to reinsurance prices at various coverage/participation levels
- 2 Create the convolution distribution that combines the distributions of (a) loss ratio of the primary business, (b) the reinsurance layers and prices, (c) the number of catastrophe events, and (d) amount of gross/net loss arising from a catastrophe event (thus the distribution of risk adjusted underwriting profit)

# Preliminaries - 6

## Output

A probability distribution of various risk-adjusted profit rates (with associated statistics, including the associated semi-variance), at different risk-appetite assumptions

# Agenda

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- Introduction
- Optimal reinsurance: academics
- Optimal reinsurance: RAROC
- Optimal reinsurance: our method
- A case study
- Conclusions
- Q&A



# 1. Introduction

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Reinsurance decision is a balance between cost and benefit

- Cost : reinsurance premium – loss recovered
- Benefit : risk reduction
  - Stable income stream over time
  - Protection against extreme events
  - Reduce likelihood of a rating downgrade

# 1. Introduction

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## How to measure risk reduction

- Variance and standard deviation
  - Not downside risk measures
  - Desirable swings are also treated as risk
- VaR (Value-at-Risk), TVaR, XTVaR
  - VaR: predetermined percentile point. PML (probable maximum loss per event) is a VaR measure at event level
  - TVaR: expected value when loss > VAR
  - XTVaR: TVaR-mean

# 1. Introduction

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## How to measure risk reduction

- Lower partial moment and downside variance

$$LPM(L | T, k) = \int_{T}^{\infty} (L - T)^k dF(L)$$

- L is the amount of gross loss

- T is the maximum acceptable losses, the benchmark for “downside”

- k is the risk perception parameter to large losses, the higher the k, the stronger risk aversion to large losses

- When k=1 and T is the 99th percentile of loss, LPM is equal to 0.01\*VaR

- When K=2 and T is the mean, LPM is semi-variance

- When K=2 and T is the target, LPM is downside variance

## 2. Optimal reinsurance: academics

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- Froot, K. A., 2007, “Risk Management, Capital Budgeting, and Capital Structure Policy for Insurers and Reinsurers,” *Journal of Risk and Insurance* 74, pp. 273—299.
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- Gajek, L., and D. Zagrodny, 2000, “Optimal Reinsurance Under General Risk Measures”, *Insurance: Mathematics and Economics*, 34, 227-240.
- Lane, M. N., 2000, “Pricing Risk Transfer Functions”, *ASTIN Bulletin* 30(2), 259-293.
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## 2. Optimal reinsurance: academics

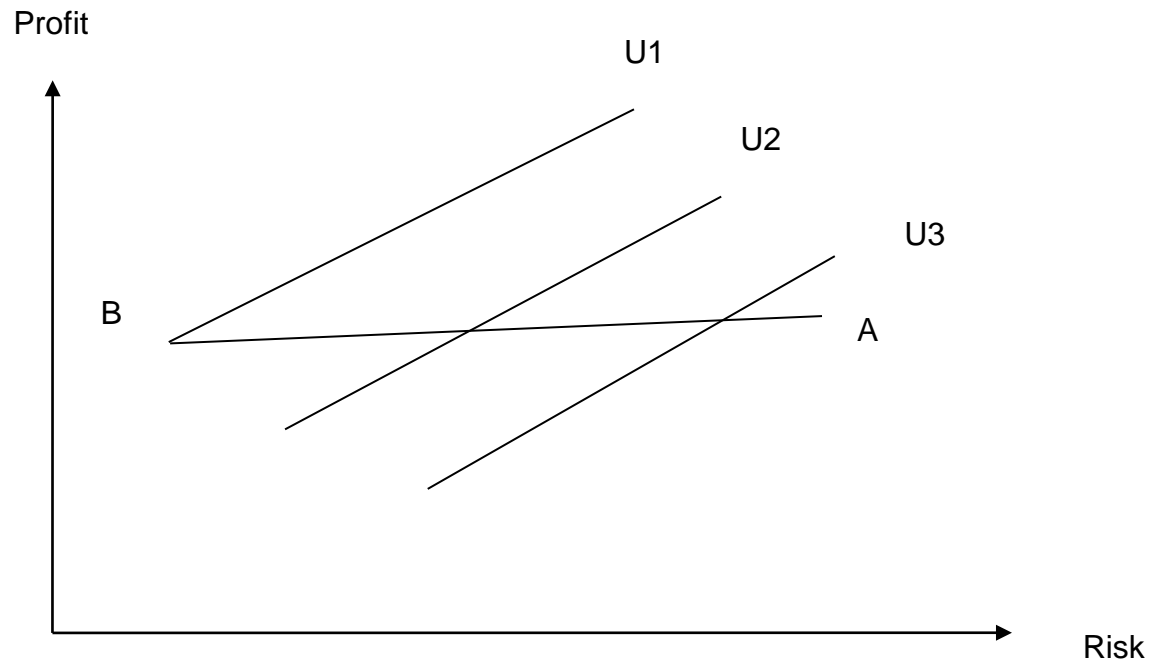
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- Cat reinsurance has zero correlation with market index, and therefore zero beta in CAPM.
- Because of zero beta, reinsurance premium should be a dollar-to-dollar trade of loss recovered.
- Reinsurance reduces risk at zero cost. Therefore optimizing profit/risk tradeoff implies minimizing risk
  - buy largest possible protection without budget constraints
  - buy highest possible retention with budget constraints

## 2. Optimal reinsurance: academics

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### Academic Assumption



## 2. Optimal reinsurance: academics

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Those studies do not help practitioners

- Reinsurance is costly.
  - Reinsurers need to hold a large amount of capital and require a market return on such a capital.
  - Reinsurance premium/Loss recovered can be over 10 in reality
- No reinsurers can fully diversify away cat risk
- Only consider the risk side of equation and ignore cost side.

# 3. Optimal reinsurance: RAROC

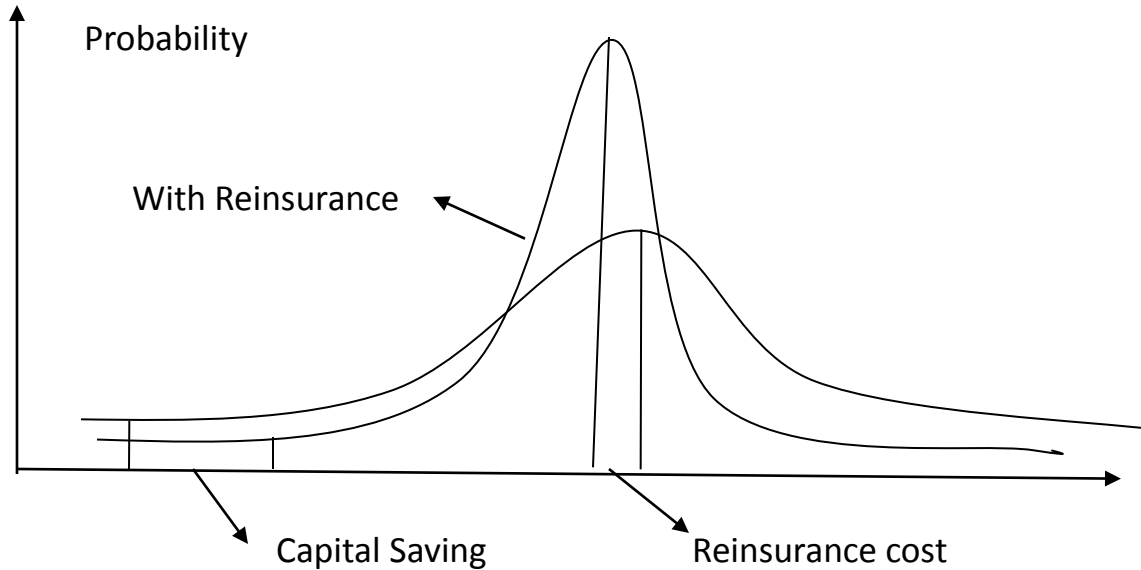
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RAROC (Risk-adjusted return on capital) approach is popular in practice

- Economic capital (EC) covers extreme loss scenarios
- Reinsurance cost = reinsurance premium – expected recovery
- Capital Saving = EC w/o reinsurance – EC w reinsurance
- $RAROC = \text{Expected Profit} / \text{Economic Capital}$
- Cost of Risk Capital (CORC) = Reinsurance cost / Capital Saving
- CORC and RAROC balance profit (numerator) and risk (denominator)



# 3. Optimal reinsurance: RAROC



- No universal definition of economic capital
- Use VaR or TVaR to measure risk
  - Only consider extreme scenarios.
  - Linear risk perception.

## 4. Optimal Reinsurance: DRAP Approach

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Downside Risk-adjusted Profit (DRAP)

$$DRAP = Mean(r) - \theta * LPM(r | T, k)$$

$$LPM(r | T, k) = \int_{-\infty}^T (T - r)^k dF(r)$$

- $r$  is underwriting profit rate
- $\theta$  is the risk aversion coefficient
- $T$  is the bench mark for downside
- $k$  measures the increasing risk perception toward large losses

# 4. Optimal Reinsurance: DRAP Approach

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## Loss Recovery

$$G(x_i, R, L) = \begin{cases} 0 & \text{if } x_i \leq R \\ (x_i - R) * \phi & \text{if } R < x_i \leq R + L \\ L * \phi & \text{if } x_i > R + L \end{cases}$$

- R is retention
- L is the limit
- $\phi$  is the coverage percentage
- $x_i$  is cat loss from the  $i$ th event

## 4. Optimal Reinsurance: DRAP Approach

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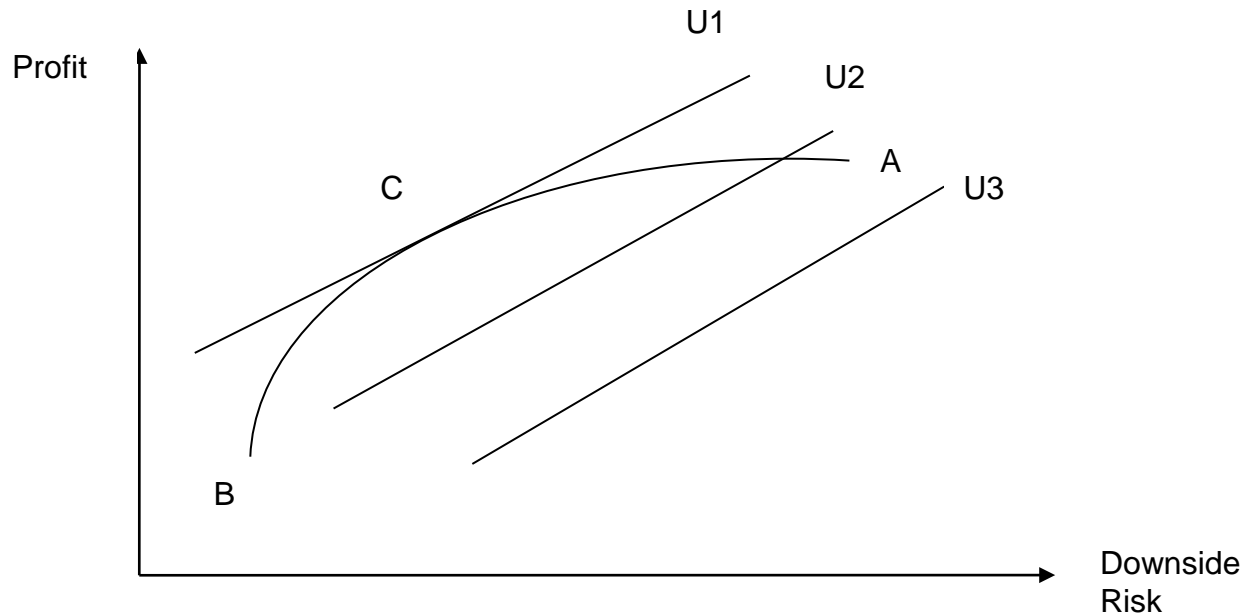
Underwriting profit

$$r = 1 - \frac{EXP + Y + RP(R, L)}{EP} - \frac{\sum_{i=1}^N x_i - G(x_i, R, L) + RI(x_i, R, L)}{EP}$$

- EP: gross earned premium
- EXP: expense
- Y non cat losses
- RP(R, L): reinsurance premium
- RI (xi, R, L): reinstatement premium
- N: number of cat events

# 4. Optimal Reinsurance: DRAP Approach

$$\underset{R,L}{Max} \quad Mean(r) - \theta * LPM(r | T, k)$$



AB is efficient frontier

U1, U2, U3 are utility curves

C is the optimal reinsurance that maximizes DRAP

## 4. Optimal Reinsurance: DRAP Approach

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Advantages over conventional mean-variance studies in academic studies:

- An ERM approach.
  - Considers both catastrophe and non-catastrophe losses simultaneously
  - Overall profitability impacts layer selection. High profitability enhances an insurer's ability to retain more cat risk.
- Use a downside risk measure (LPM) other than two-sided risk measure (variance)

## 4. Optimal Reinsurance: DRAP Approach

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### Theta estimations

$$DRAP = Mean(r) - \theta * LPM(r | T, k)$$

- Theta may not be constant by size of loss
- Theta is time variant
- Theta varies by individual institution
- How much management is willing to pay to mitigate risk?
- How much do investors require to take the risk?
  - index risk premium = index return – risk free rate
  - Insurance risk premium = insurance return-risk free rate
  - cat risk premium= cat bond yield- expected loss-risk free rate

## 4. Optimal Reinsurance: DRAP Approach

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### K and T estimations

$$LPM(r | T, k) = \int_{-\infty}^T (T - r)^k dF(r)$$

- k may not be constant by the size of loss
  - For smaller loss, loss perception is close to 1, k=1; for severe loss, k>1
  - Academic tradition: k=2
- T is the bench mark for “downside”
  - Zero: underwriting loss is risk
  - Zero ROE: underwriting loss larger than investment income is risk
  - Large negative: severe loss is treated as risk



# 5. Case Study

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A hypothetical company

- Gross earned premium from all lines: 10 billion
- Expense ratio: 33%
- Lognormal non-cat loss from actual data  
mean=5.91 billion; std=402 million
- Lognormal cat loss estimated from AIR data
  - mean # of event=39.7; std=4.45
  - mean loss from an event=10.02 million; std=50.77 million
  - total annual cat loss mean=398 million; std=323 million

# 5. Case Study

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- $K=2$
- $T=0\%$
- Theta is tested at 16.71, 22.28, and 27.85, which represents that primary insurer would like to pay 30%, 40%, and 50% of gross profit to hedge downside risk, respectively.
- UW profit without Insurance is 3.92%
- Variance 0.263%
- Downside variance is 0.07% ( $T=0\%$ )
- Probability of underwriting loss is 18.41%
- Probability of severe loss ( $<-15\%$ ) is 0.48%

## 5. Case Study

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### Reinsurance quotes (million)

| Retention | Upper Bound<br>of Layer | Reinsurance<br>Limit | Reinsurance<br>Price | Rate-on-line |
|-----------|-------------------------|----------------------|----------------------|--------------|
| 305       | 420                     | 115                  | 20.8                 | 18.09%       |
| 420       | 610                     | 190                  | 21.7                 | 11.42%       |
| 610       | 915                     | 305                  | 19.8                 | 6.50%        |
| 610       | 1,030                   | 420                  | 25.2                 | 5.99%        |
| 1,030     | 1,800                   | 770                  | 28.7                 | 3.72%        |
| 1,800     | 3,050                   | 1,250                | 39.1                 | 3.13%        |

# 5. Case Study

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## Recoveries and penetrations by layers

| Retention<br>(million) | Upper Limit<br>(million) | Mean      | Standard<br>Deviation | Recovery/reinsur<br>ance Premium | Penetration<br>Probability |
|------------------------|--------------------------|-----------|-----------------------|----------------------------------|----------------------------|
| 305                    | 420                      | 8,859,074 | 29,491,239            | 42.59%                           | 10.18%                     |
| 420                    | 610                      | 8,045,968 | 35,917,439            | 37.08%                           | 6.04%                      |
| 610                    | 915                      | 6,496,494 | 41,009,356            | 32.81%                           | 3.15%                      |
| 610                    | 1,030                    | 7,923,052 | 51,899,244            | 31.44%                           | 3.15%                      |
| 1,030                  | 1,800                    | 4,858,545 | 55,432,115            | 16.93%                           | 1.11%                      |
| 1,800                  | 3,050                    | 2,573,573 | 48,827,021            | 6.58%                            | 0.40%                      |

# 5. Case Study

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## Reinsurance Price Curve Fitting

- $(x_1, x_2)$  represents reinsurance layer
- $f(x)$  represent rate-on-line

$$p(x_1, x_2) = \int_{x_1}^{x_2} f(x) dx$$

- Add quadratic term. Logarithm, and inverse term to reflect nonlinear relations

$$f(x) = \beta_0 + \beta_1 x + \beta_2 x^2 + \beta_3 \log(x) + \beta_4 x^{-1}$$

$$p(x_1, x_2) = \beta_0(x_2 - x_1) + \frac{1}{2}\beta_1(x_2^2 - x_1^2) + \frac{1}{3}\beta_2(x_2^3 - x_1^3) \\ + \beta_3(x_2 \log(x_2) - x_1 \log(x_1)) + \beta_4(\log(x_2) - \log(x_1))$$

# 5. Case Study

## Reinsurance Price Fitting

| Retention | Upper Bound of Layer | Reinsurance Limit | Reinsurance Price | Rate-on-line | Fitted rate | Fitted Rate-on-line |
|-----------|----------------------|-------------------|-------------------|--------------|-------------|---------------------|
| 305       | 420                  | 115               | 20.8              | 18.09%       | 20.84       | 18.12%              |
| 420       | 610                  | 190               | 21.7              | 11.42%       | 21.69       | 11.41%              |
| 610       | 915                  | 305               | 19.8              | 6.50%        | 19.87       | 6.51%               |
| 610       | 1,030                | 420               | 25.2              | 5.99%        | 25.18       | 6.00%               |
| 1,030     | 1,800                | 770               | 28.7              | 3.72%        | 28.73       | 3.73%               |
| 1,800     | 3,050                | 1,250             | 39.1              | 3.13%        | 39.10       | 3.13%               |
| 305       | 610                  | 305               | 42.5              | 13.93%       | 42.52       | 13.94%              |
| 305       | 915                  | 610               | 62.3              | 10.22%       | 62.39       | 10.23%              |
| 305       | 1,030                | 725               | 67.7              | 9.33%        | 67.70       | 9.34%               |
| 305       | 1,800                | 1,495             | 96.5              | 6.45%        | 96.43       | 6.45%               |
| 305       | 3,050                | 2,745             | 135.6             | 4.94%        | 135.53      | 4.94%               |
| 420       | 915                  | 495               | 41.5              | 8.39%        | 41.55       | 8.39%               |
| 420       | 1,030                | 610               | 46.9              | 7.68%        | 46.87       | 7.68%               |
| 420       | 1,800                | 1,380             | 75.6              | 5.47%        | 75.60       | 5.48%               |
| 420       | 3,050                | 2,630             | 114.7             | 4.36%        | 114.69      | 4.36%               |
| 610       | 1,800                | 1,190             | 53.9              | 4.53%        | 53.91       | 4.53%               |
| 610       | 3,050                | 2,440             | 93                | 3.81%        | 93.01       | 3.81%               |
| 915       | 1,030                | 115               | 5.3               | 4.64%        | 5.32        | 4.62%               |
| 915       | 1,800                | 885               | 34                | 3.85%        | 34.04       | 3.85%               |
| 915       | 3,050                | 2,135             | 73.1              | 3.42%        | 73.14       | 3.43%               |
| 1,030     | 3,050                | 2,020             | 67.8              | 3.36%        | 67.83       | 3.36%               |

# 5. Case Study

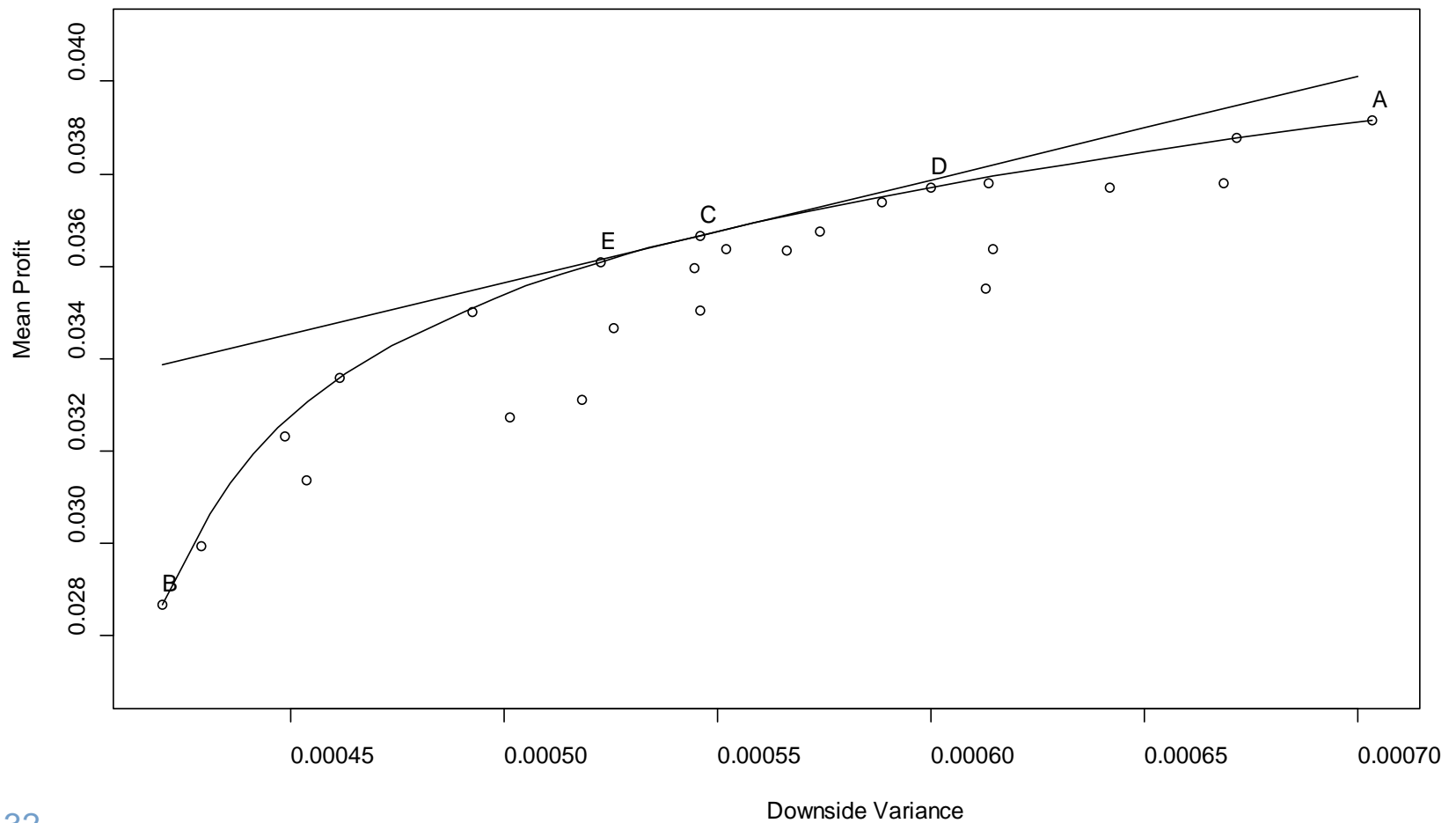
## Performance of Reinsurance Layers $\theta=22.28$

| Retention<br>(million) | Upper Limit<br>(million) | Prob $r < 0$ | Prob $r < -15\%$ | Mean   | Variance | Downside<br>Variance | Risk-adjusted<br>Profit |
|------------------------|--------------------------|--------------|------------------|--------|----------|----------------------|-------------------------|
| No Reinsurance         |                          | 18.41%       | 0.48%            | 3.916% | 0.263%   | 0.070%               | 2.350%                  |
| 305                    | 420                      | 19.02%       | 0.42%            | 3.781% | 0.253%   | 0.067%               | 2.291%                  |
| 420                    | 610                      | 19.17%       | 0.35%            | 3.771% | 0.249%   | 0.064%               | 2.341%                  |
| 610                    | 915                      | 19.31%       | 0.30%            | 3.779% | 0.247%   | 0.061%               | 2.412%                  |
| 610                    | 1030                     | 19.53%       | 0.27%            | 3.739% | 0.243%   | 0.059%               | 2.428%                  |
| 1030                   | 1800                     | 19.95%       | 0.26%            | 3.676% | 0.243%   | 0.057%               | 2.397%                  |
| 1800                   | 3050                     | 20.44%       | 0.41%            | 3.551% | 0.247%   | 0.061%               | 2.186%                  |
| 305                    | 610                      | 19.63%       | 0.33%            | 3.637% | 0.241%   | 0.061%               | 2.268%                  |
| 305                    | 915                      | 20.50%       | 0.25%            | 3.503% | 0.228%   | 0.055%               | 2.287%                  |
| 305                    | 1,030                    | 20.76%       | 0.22%            | 3.465% | 0.224%   | 0.053%               | 2.293%                  |
| 305                    | 1,800                    | 22.31%       | 0.13%            | 3.231% | 0.210%   | 0.045%               | 2.231%                  |
| 305                    | 3,050                    | 24.77%       | 0.04%            | 2.869% | 0.200%   | 0.042%               | 1.934%                  |
| 420                    | 915                      | 19.85%       | 0.25%            | 3.634% | 0.235%   | 0.057%               | 2.373%                  |
| 420                    | 1,030                    | 20.06%       | 0.22%            | 3.595% | 0.232%   | 0.054%               | 2.382%                  |
| 420                    | 1,800                    | 21.79%       | 0.14%            | 3.358% | 0.216%   | 0.046%               | 2.330%                  |
| 420                    | 3,050                    | 24.25%       | 0.05%            | 2.995% | 0.206%   | 0.043%               | 2.038%                  |
| 610                    | 1,800                    | 21.05%       | 0.16%            | 3.500% | 0.226%   | 0.049%               | 2.402%                  |
| 610                    | 3,050                    | 23.35%       | 0.11%            | 3.135% | 0.215%   | 0.045%               | 2.124%                  |
| 915                    | 1,030                    | 18.63%       | 0.40%            | 3.877% | 0.258%   | 0.067%               | 2.380%                  |
| 915                    | 1,800                    | 20.14%       | 0.21%            | 3.637% | 0.239%   | 0.055%               | 2.407%                  |
| 915                    | 3,050                    | 22.44%       | 0.17%            | 3.272% | 0.226%   | 0.050%               | 2.155%                  |
| 1030                   | 3050                     | 22.15%       | 0.20%            | 3.311% | 0.230%   | 0.052%               | 2.156%                  |
| 680                    | 1390                     | 20.00%       | 0.21%            | 3.667% | 0.237%   | 0.055%               | 2.451%                  |

# 5. Case Study

## Efficient Frontier

Figure 3: Reinsurance Efficient Frontier





## 5. Case Study

- Optimal Reinsurance Layers  $\theta = 16.71, 22.28, 27.85$

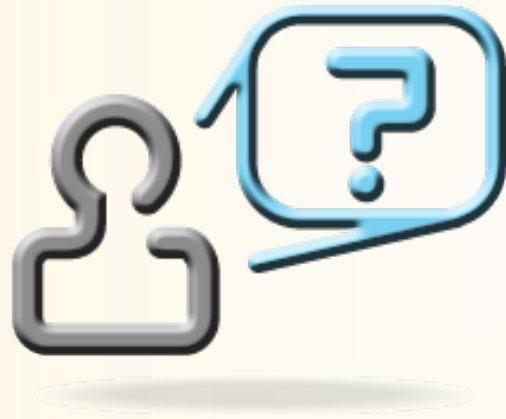
| Theta | Retention<br>(million) | Upper<br>Limit<br>(million) | Mean   | Downside<br>Variance | Risk-<br>Adjusted<br>Profit<br>$\theta=16.71$ | Risk-<br>Adjusted<br>Profit<br>$\theta=22.28$ | Risk-<br>Adjusted<br>Profit<br>$\theta=27.85$ |
|-------|------------------------|-----------------------------|--------|----------------------|---|---|---|
| 16.71 | 795                    | 1220                        | 3.771% | 0.060%               | <u>2.768%</u>                                 | 2.434%  | 2.100%  |
| 22.28 | 680                    | 1390                        | 3.667% | 0.055%               | 2.755%  | <u>2.451%</u>                                 | 2.147%  |
| 27.85 | 615                    | 1460                        | 3.610% | 0.052%               | 2.736%  | 2.445%  | <u>2.154%</u>                                 |

- If the overall profit rate increases 2% and  $\theta$  remains at 22.28, the optimal layers becomes (740, 1420)

## 6. Conclusions

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- The overall profitability (both cat and non-cat losses) impacts optimal insurance decision
- Risk appetites are difficult to measure by a single parameter.
- DRAP captures risk appetites comprehensively through  $\theta$  (risk aversion coefficient),  $T$  (downside bench mark), and moment  $k$  (increasingly perception of risk arising from large loss)
- DRAP provides an alternative approach to calculate optimal layers.



**Q & A**

