



SOCIETY OF ACTUARIES

**ERM Symposium  
April 2009**

**R3 - Research Paper Session: Impact of  
Correlation Crises in Risk Theory**

Stephane Loisel

**Moderator/Reviewer**  
[Glenn Myers](#)

Impact of Correlation Crisis in Risk Theory  
Romain Baird, Claude Lefevre, Stephane Loisel

Discussion by  
Glenn Meyers  
Vice President and Chief Actuary  
ISO Innovative Analytics

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## The Stochastic Process

$$R(t) = u + c \cdot t - S(t)$$

$R(t)$  = Net worth (Reserve) at time  $t$

$u$  = Initial capital -  $R(0)$

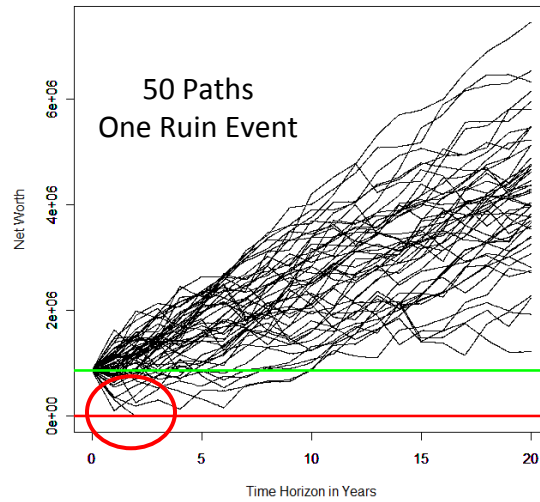
$c$  = Premium income rate

$$S(t) = \sum_{i=1}^{N(t)} X_i = \text{Total loss during period } t$$

# The Probability of Ruin

$$\Psi(u,t) = \Pr\{R(t) < 0 \text{ at any time in } (0,t)\}$$

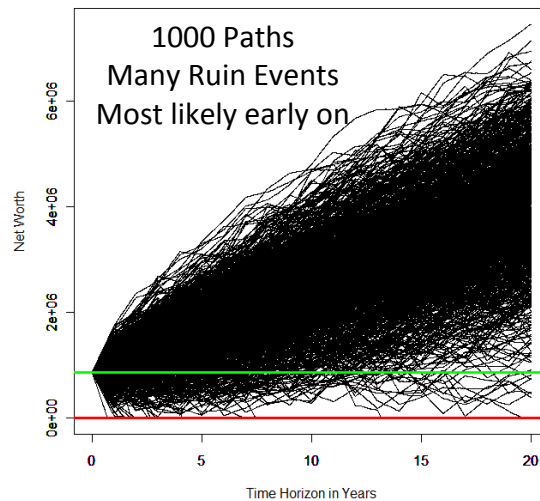
Net Worth Paths



# The Probability of Ruin

$$\Psi(u,t) = \Pr\{R(t) < 0 \text{ at any time in } (0,t)\}$$

Net Worth Paths



Time	Ruin Events
1	1
2	8
3	12
4	12
5	13
6	13
7	14
8	15
9	15
10	15
11	15
12	15
13	15
14	16
15	16
16	16
17	16
18	16
19	16
20	17

## Evolution of Ruin Theory

- Infinite time ruin theory –  $\psi(u, \infty)$
- Finite time ruin theory –  $\psi(u, t)$
- Multi-line ruin theory
  - Correlation between lines
- Analytic solutions and simulation solutions

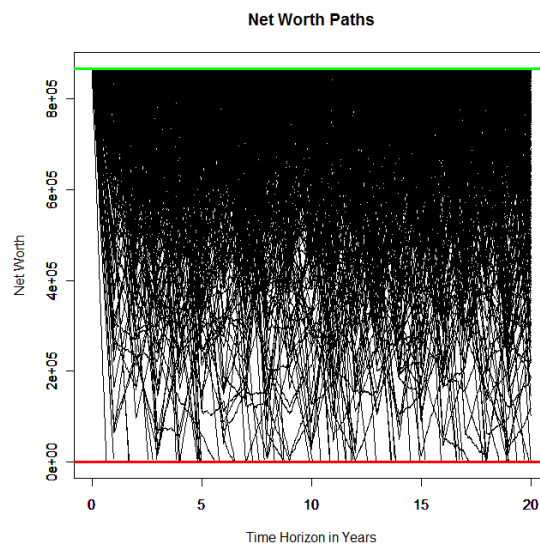
## Example of Simulation Solution

- Three lines of insurance
- Pareto claim severity distributions
- Correlated Poisson claim count distributions
  - Grand mean,  $(\lambda_1, \lambda_2, \lambda_3)$  based on exposure
  - Randomly select percentiles  $(p_1, p_2, p_3)$  from a t-copula with off-diagonal coefficient of correlation,  $\rho$  . 1 per year.
  - Multiply each  $\lambda_i$  by  $p_i^{\text{th}}$  percentile of a gamma distribution
- Simulate count, severity and add up the losses
  - 100 periods per year, 20 years, 1000 loss paths

## Control Parameters

- Profit loading in premium – 10%
  - Premium =  $E[\text{Count}] \cdot E[\text{Severity}] \cdot (1 + \text{Profit})$
- Initial capital = One half of Premium
- Return money in excess of initial capital to investors

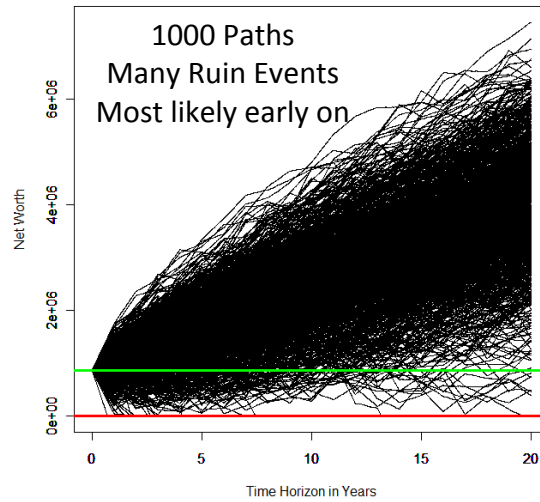
## Effect of Returning Profit to Investors



# The Probability of Ruin

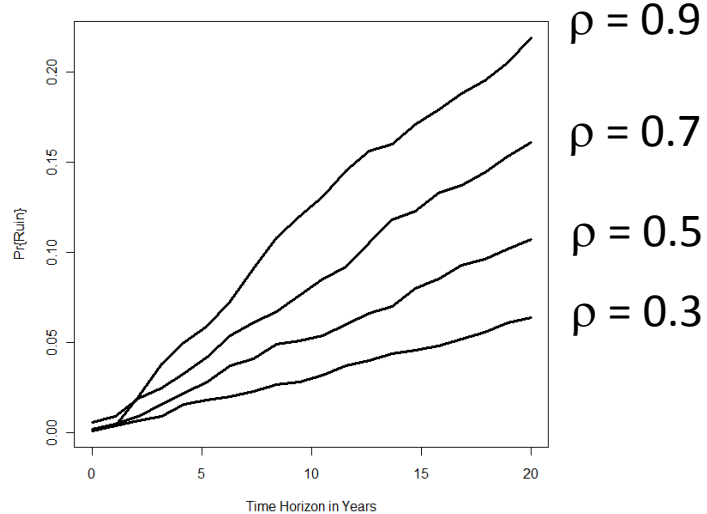
$$\Psi(u,t) = \Pr\{R(t) < 0 \text{ at any time in } (0,t)\}$$

Net Worth Paths

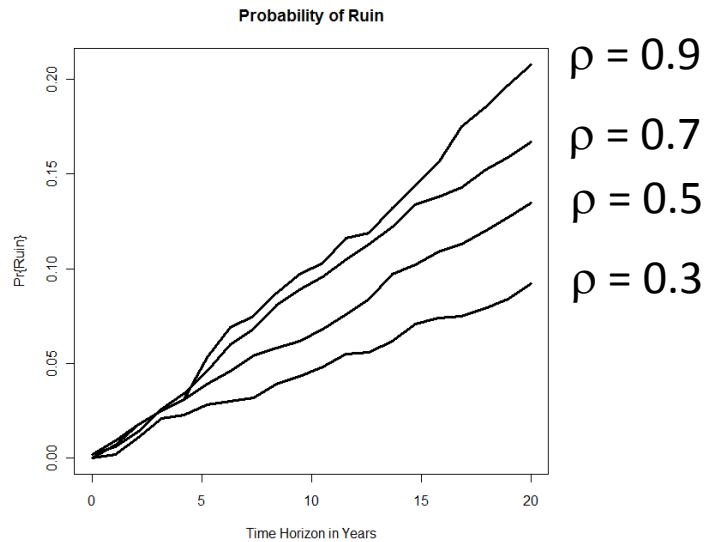


# Effect of Changing $\rho$ in t-Copula Big Insurer

Probability of Ruin



## Effect of Changing $\rho$ in t-Copula Small Insurer



## Explaining the Effect by Size of Insurer

### Parameter Risk

#### Important for Large Insurers

- Correlated Poisson claim count distributions
  - Grand mean,  $(\lambda_1, \lambda_2, \lambda_3)$  based on exposure
  - Randomly select percentiles  $(p_1, p_2, p_3)$  from a t-copula with off-diagonal coefficient of correlation,  $\rho \cdot 1$  per year.
  - Multiply each  $\lambda_i$  by  $p_i^{\text{th}}$  percentile of a gamma distribution

### Process Risk

#### More Important for Small Insurers

- Simulate count, severity and add up the losses
  - 100 periods per year, 20 years, 1000 loss paths

## Two Cultures in Ruin Theory Analytic and Simulation

- Analytic view of Simulation Culture
  - A series of one damn result after another
  - Does not reveal insight into process
- Simulation view of Analytic Culture

$$\Psi(u, t) = \sum_{r=0}^{\infty} \frac{u^r}{r!} \lim_{x \rightarrow \infty} \left( \frac{a^2 + b \pm \sqrt{b^2 - 4ac}}{r!(2a-r)!} \right)$$

- Each culture can make contributions

Analytic  $\longleftrightarrow$  Simulation  
Meyers

- Problems come in faster than analytic solutions
  - Multiple risks (including asset risk) and correlations
    - Some progress
  - Uncertainty over time – Loss Reserves
  - Changing economic conditions
  - Parameterization of models
  - Risk Measures - TVaR
  - Accounting conventions
- Can capital requirements be set with a handful of stress tests?