



# Risk Management of Investment Guarantees in Life Insurance

Kobus Bekker\* & Jan Dhaene#

\* ABSA Life, South Africa

# KU Leuven, Belgium

# Outline



- Investment Guarantees
- Risk management considerations
- Conditional lower bound approximation
- Asset-based charges
- Hedging

# Investment Guarantees



## Brief background to VA & UL business

<b>Tax</b>	Deferred annuities served as tax-deferred vehicle with pure risk benefits, e.g. endowment with fixed benefits.
<b>Investment Upside</b>	Policyholders became more aware of investment potential and demanded more investment upside exposure and investment choice.
<b>Marketability</b>	Guarantees were offered to transfer downside risk back to insurers and to improve the marketability of VA / UL products
<b>Mispricing</b>	Guarantees that were considered to be far OTM were offered at very low and sometimes without charges in early days.  Risk management considerations not integral to pricing and product development.

# Investment Guarantees



## Types of Investment Guarantees

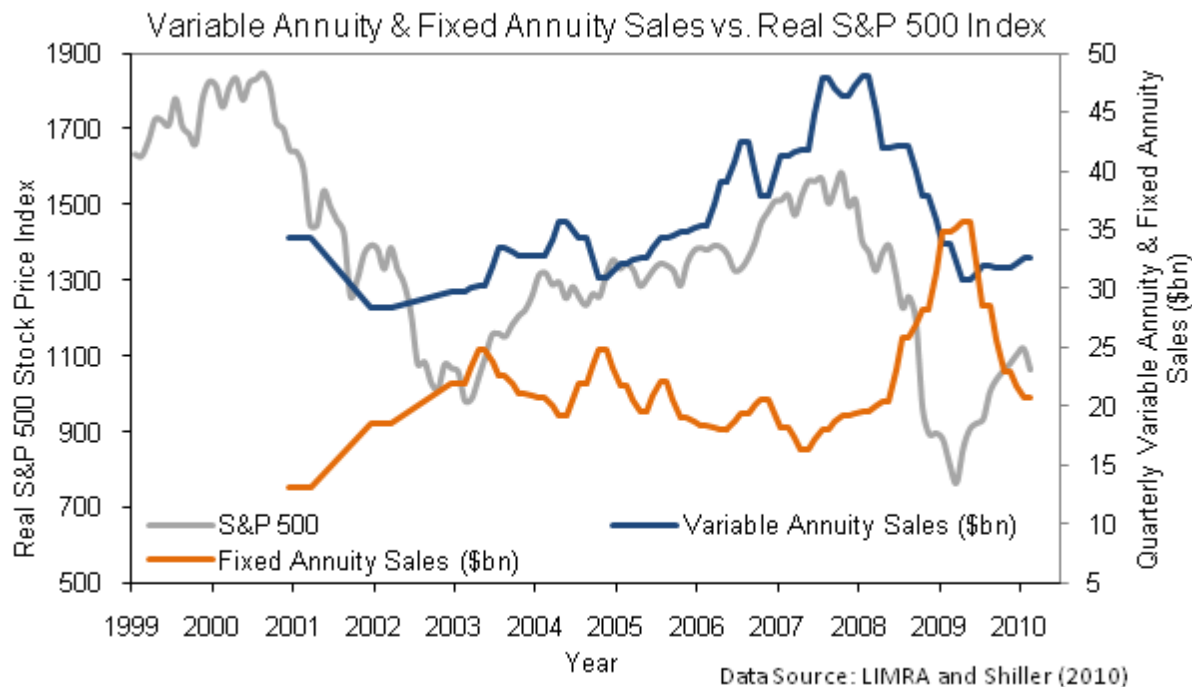
<b>GMDB (1980)</b>	Guarantees a minimum amount payable on death
<b>GMIB / GAO (1996)</b>	Guarantees a minimum rate of interest at conversion of a lump sum to an immediate annuity
<b>GMMB / GMAB (2002)</b>	Guarantees a minimum amount payable at maturity or at fixed intervals over the policy term
<b>GMWB (2002)</b>	Guarantees withdrawals to at least the value of the original premium over a specified term
<b>GLWB (2004)</b>	Guarantees a percentage withdrawal over the remaining lifetime of the policyholder

# Investment Guarantees



## Policyholder preferences and the market

- VA sales positively correlated, while fixed annuity sales negatively correlated
- Policyholders buy VAs at market highs and fixed annuities at market lows

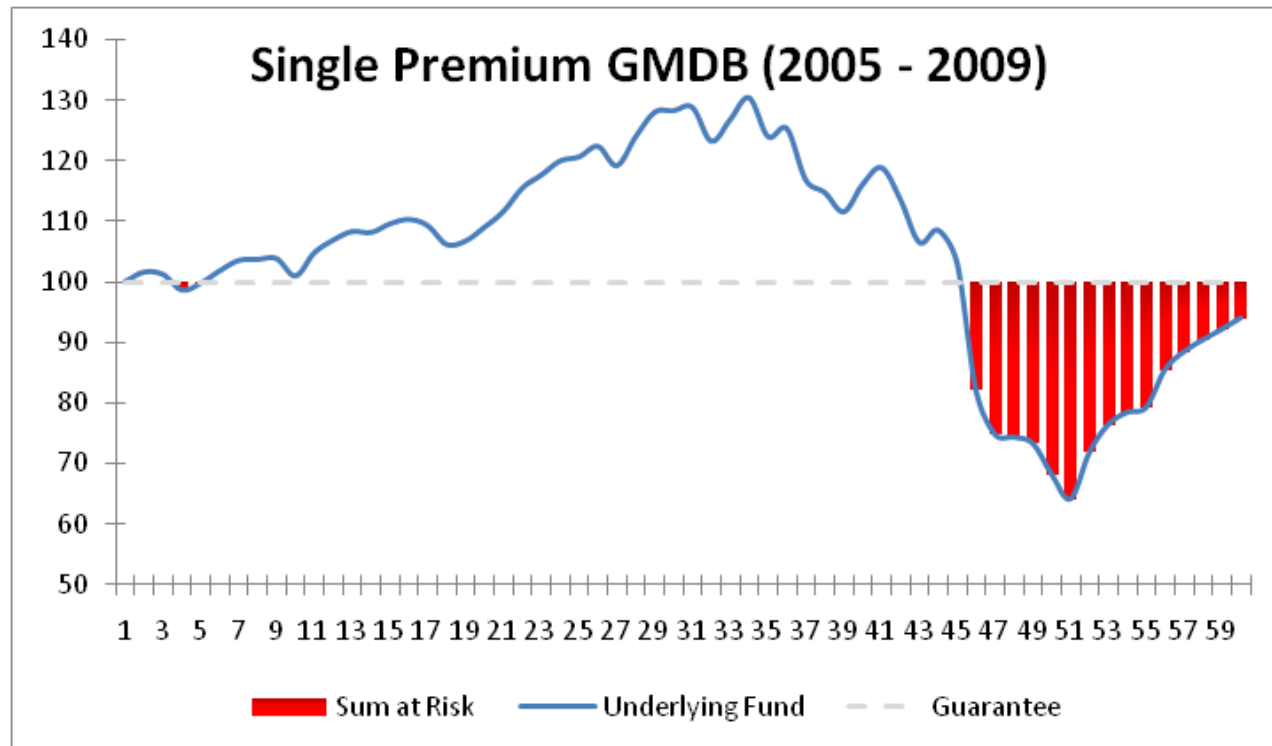


# Investment Guarantees



## S&P 500 Examples: Single Premium GMDB

- GMDB guarantees ROC - single premium of 100 over 5 years
- No tax, fees or other deductions considered

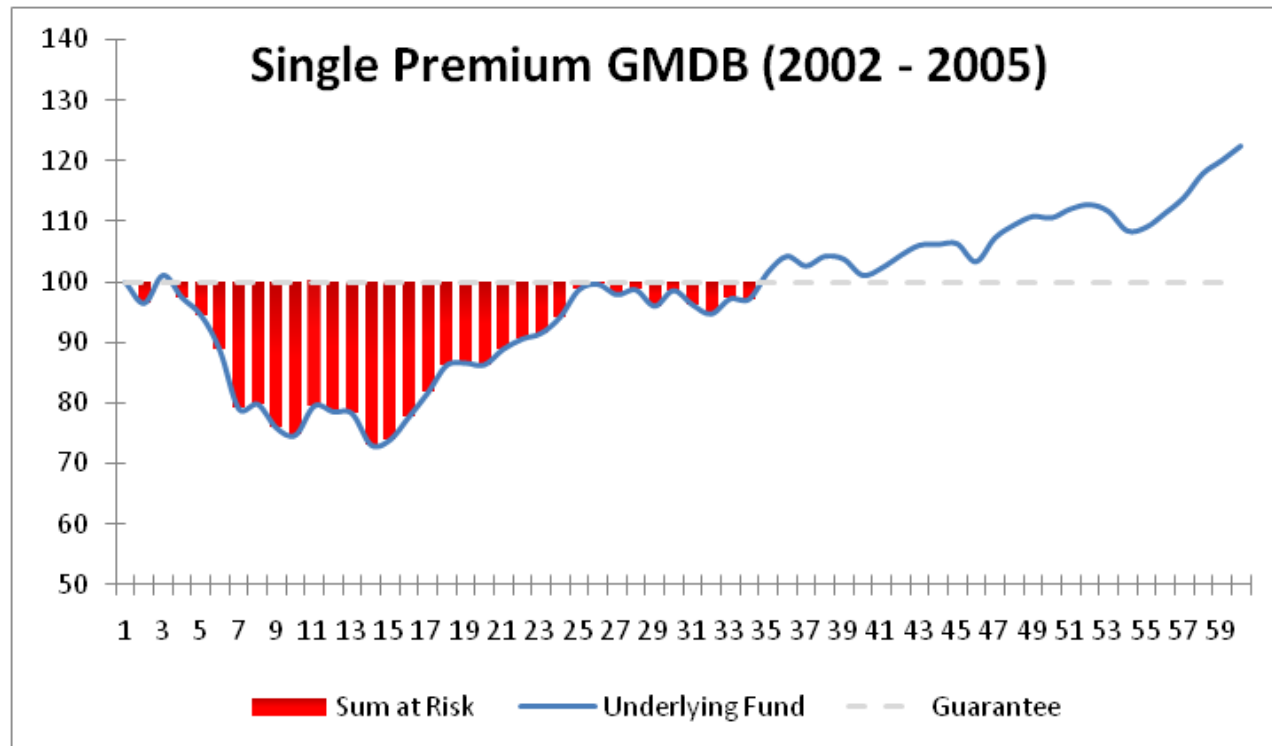


# Investment Guarantees



## S&P 500 Examples: Single Premium GMDB

- Guarantee very sensitive to initial value of the underlying fund
- Phasing-in of single premiums can mitigate risk

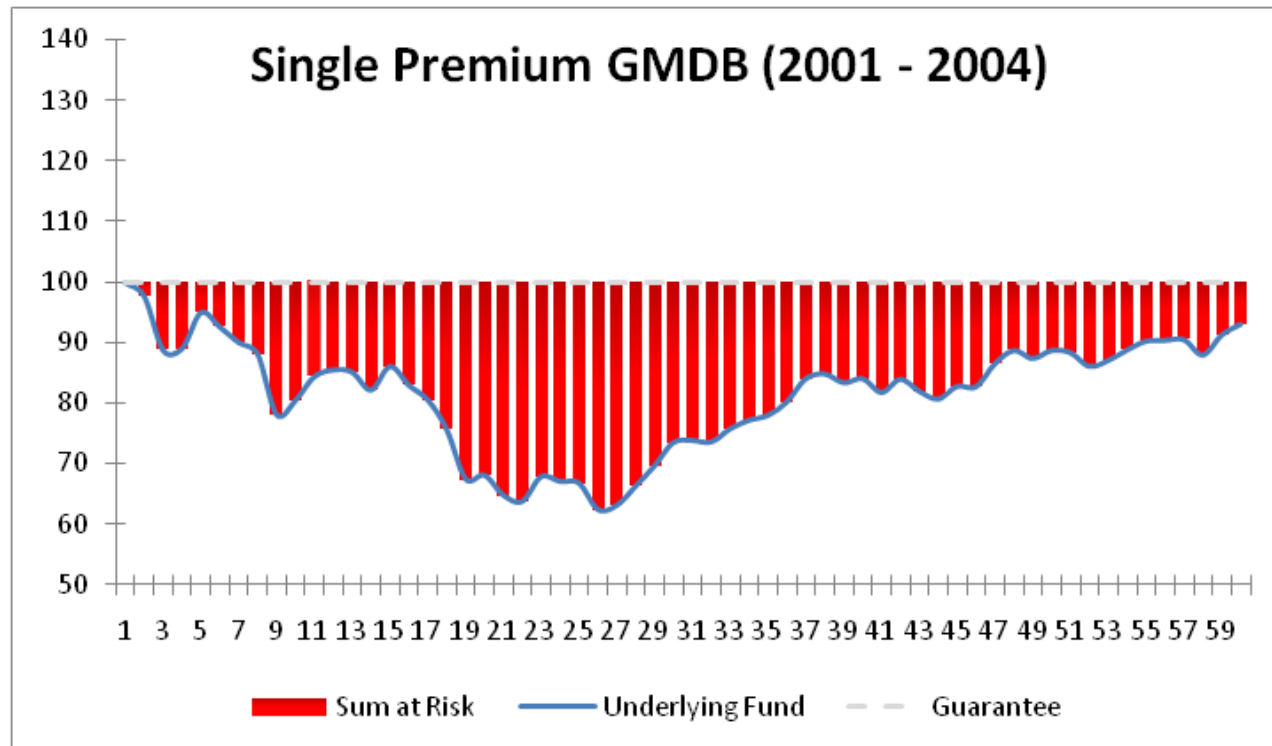


# Investment Guarantees



## S&P 500 Examples: Single Premium GMDB

- One year difference (one year earlier) can lead to drastically different results!

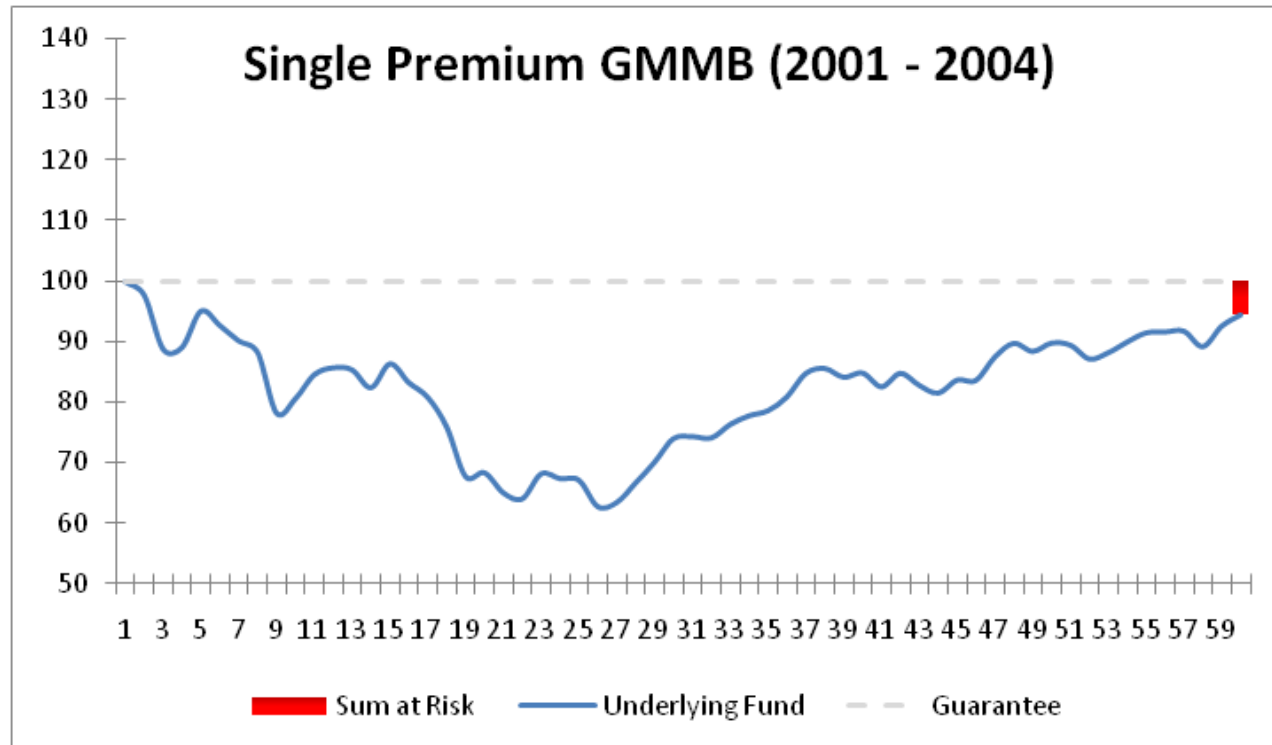


# Investment Guarantees



## S&P 500 Examples: Single Premium GMMB

- GMMB guarantees ROC – single premium after 5 years

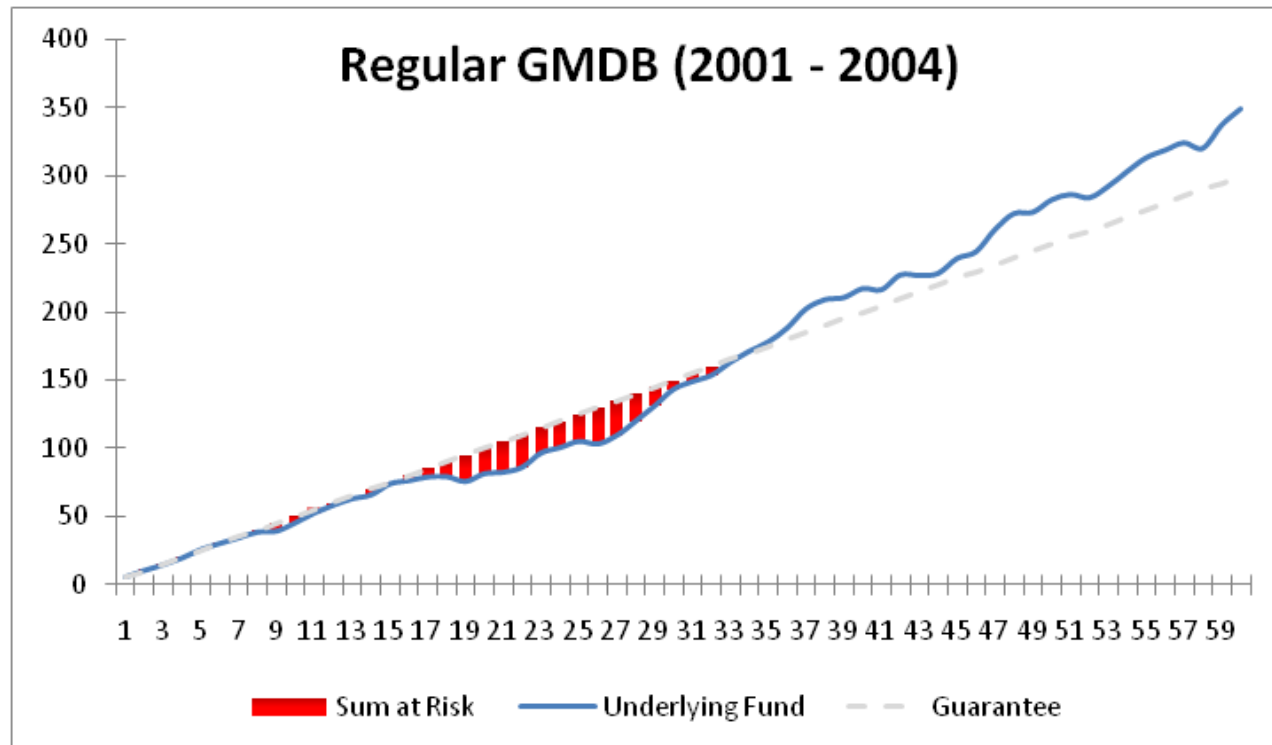


# Investment Guarantees



## S&P 500 Examples: Regular Premium GMDB

- GMDB guarantees ROC – regular premium of 5 over 5 years
- Dollar cost-averaging significantly reduces risk (cf. phasing-in of single premium)

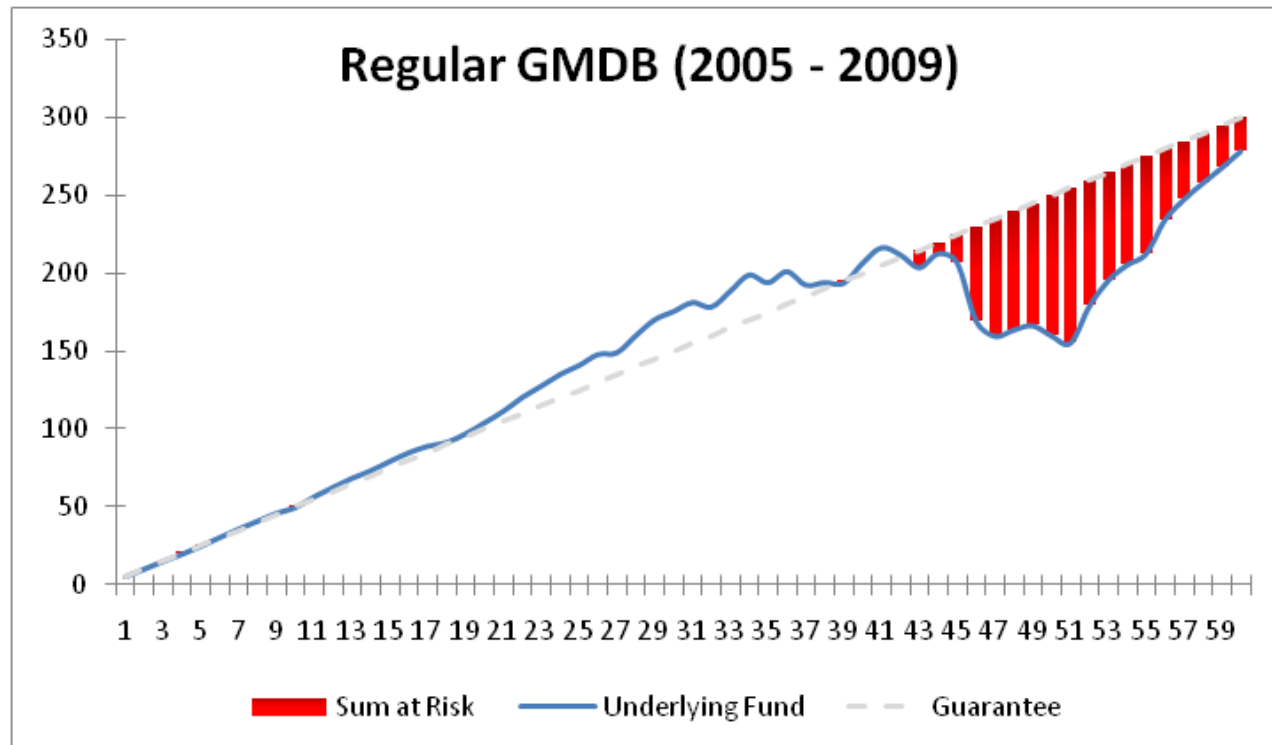


# Investment Guarantees



## S&P 500 Examples: Regular Premium GMDB

- Unfortunately, crises do happen (quite regularly!)
- Risk mitigating strategies such as hedging necessary

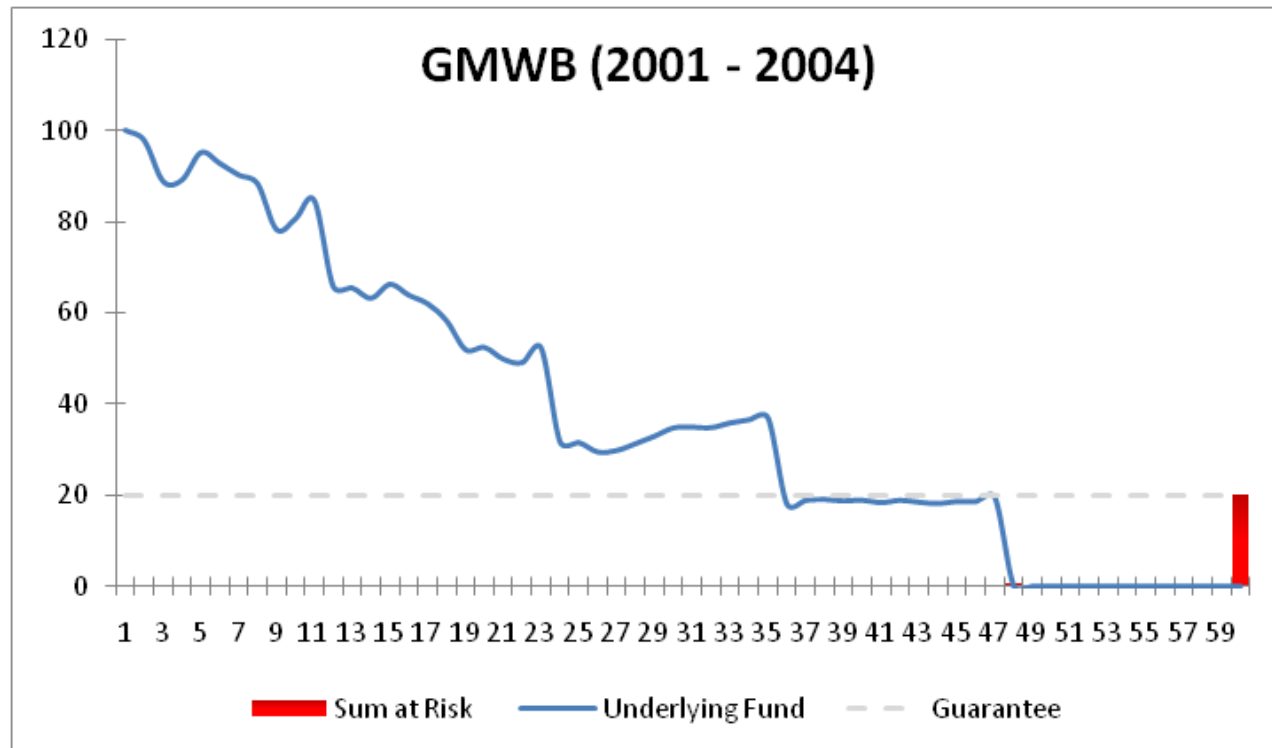


# Investment Guarantees



## S&P 500 Examples: GMWB

- GMWB guarantees 20% withdrawals for annually for 5 years
- Absorbing barrier at zero



# Risk Management Considerations



## Some key challenges

### Dependency

Guarantees of individual policies largely dependent, i.e. should one guarantee bite, others will probably follow

### Combined Market

Real world independence *not* necessarily maintained under change of measure from physical probability  $P$  to equivalent martingale measure  $Q$ .

Even more complex issue if combined market consist of policyholder preferences, e.g. GMWB

### Initial Strain

Typically, guarantee charges are asset-based, i.e. the initial value needed to set up a replicating portfolio is recouped over time.

### Complexity

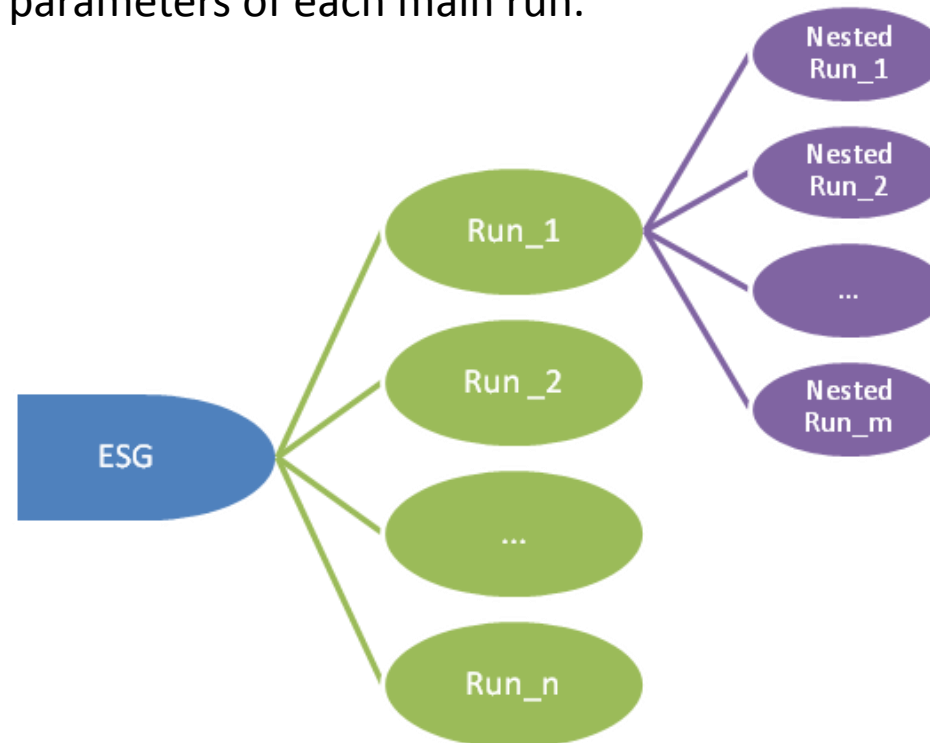
Nested runs needed to determine value of guarantee in scenario-based valuation

# Risk Management Considerations



## ESG valuation of investment guarantees

- Investment guarantee value needs to be solved via nested simulation runs based on the economic parameters of each main run.

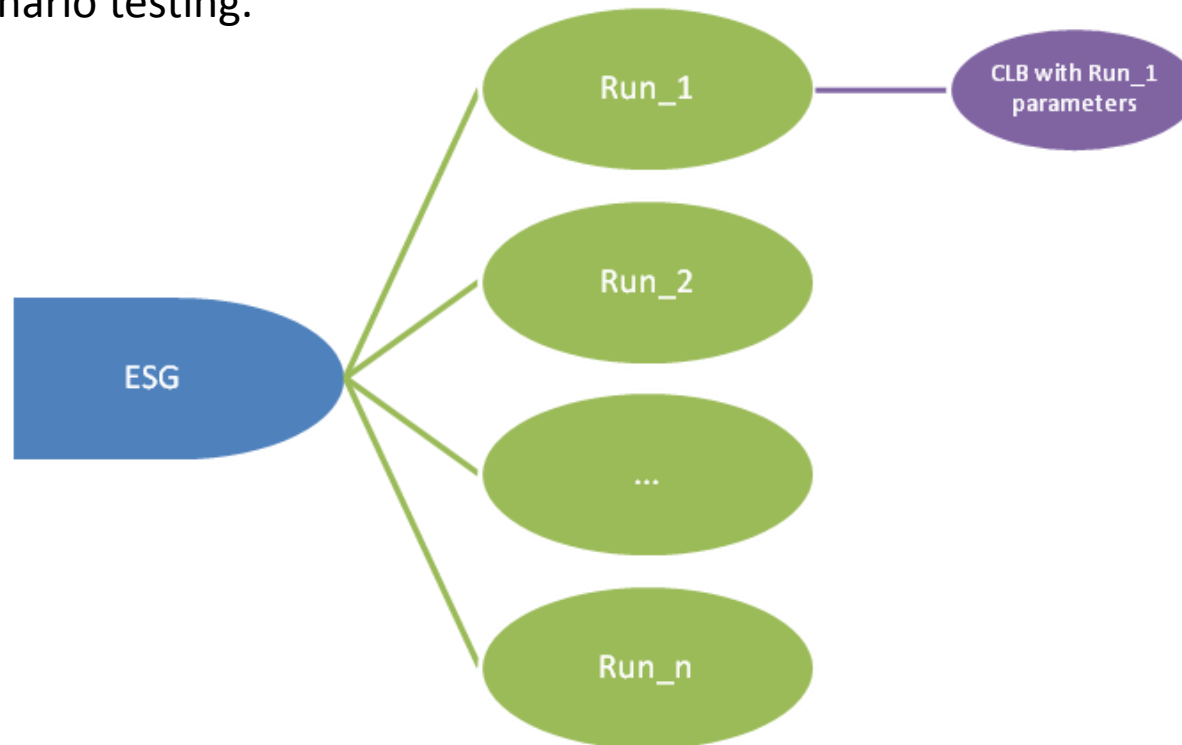


# Risk Management Considerations



## ESG valuation of investment guarantees

- Instead, an approximation (CLB) can be used for interim valuations and economic capital scenario testing.



# Risk Management Considerations



## Complexity of guarantees

- Single premium contracts allow a simple application of financial economics, e.g. a GMMB without mortality – a ROC guarantee of the invested premium at policy maturity  $n$ :

$$B_n = \max \left( \pi_0^{(s)} \frac{F_n}{F_0}, b_n \right)$$

- Regular premiums complicate the application of financial economics, even in a simplified setting.

$$B_n = \max \left( \sum_{k=0}^{n-1} \pi_k^{(s)} \frac{F_n}{F_k}, b_n \right)$$

# Risk Management Considerations



## Embedded arithmetic Asian options

**No analytical solution** Several approximations available, e.g. based on geometric Asian options, but no analytical solutions – even in simplified settings.

**Conditional lower bound** Dhaene et al. (2002) derived accurate bounds for arithmetic Asian options in Black-Scholes-Merton setting.

The conditional lower bound proved exceptionally accurate and will be used as an approximation.

**Further outline** Conditional lower bound (CLB) is derived for simple GMMB and GMDB products.

Asset-based charges are determined for these products.

CLB will be used for possible hedging strategy.

# Conditional Lower Bound (CLB)



## Steps in deriving CLB

### Conditional Lower Bound (CLB)

The CLB is stochastic lower bound to true fund value:

$$V_n^{-(l)} = \sum_{k=0}^{n-1} \pi_k^{(s)} E \left[ \frac{F_n}{F_k} \mid \Lambda \right] \leq_{cx} V_n = \sum_{k=0}^{n-1} \pi_k^{(s)} \frac{F_n}{F_k}$$

### Optimise the CLB

The CLB is maximised by maximising its variance.

### Value of embedded options

Value of embedded options can then be found by exploiting the fact that the expectation is a sum of functions of the same r.v.  $Z$ , i.e.

$$V_n^{-(l)} = \sum_{k=0}^{n-1} \pi_k^{(s)} e^{\left( \delta - \frac{1}{2} \sigma^2 r_k^2 \right) (n-k) + \sigma r_k \sqrt{n-k} Z}$$

# Conditional Lower Bound (CLB)



## Comonotonicity as a tool

- One condition for a random vector  $\underline{X}$  to be comonotonic is if there exist a random variable  $Z$  and non-decreasing functions  $f_i$  such that:

$$\underline{X} =_d \left( f_1(Z), f_2(Z), \dots, f_n(Z) \right)$$

- In the case of a comonotonic sum  $S^c$ , we have that the stop-loss premiums of the sum is equal to the sum of the comonotonic components  $X_i$ :

$$E \left[ \left( S^c - d \right)_+ \right] = \sum_{i=1}^n E \left[ \left( X_i - d_i \right)_+ \right]$$

where

$$d_i = F_{X_i}^{-1} \left( F_{S^c} (d) \right)$$

# Conditional Lower Bound (CLB)



## Determining the value of the embedded call option

- The value of the embedded call option payoff is :

$$\begin{aligned}
 & E \left[ \left( V_n^{-(l)} - b_n \right)_+ \right] \\
 &= \sum_{k=0}^{n-1} \pi_k^{(s)} e^{\delta(n-k)} \Phi \left[ \sigma r_k \sqrt{n-k} - \Phi^{-1} \left( F_{V_n^{-(l)}}(b_n) \right) \right] \\
 &\quad - b_n \left( 1 - F_{V_n^{-(l)}}(b_n) \right)
 \end{aligned}$$

where

$$\sum_{k=0}^{n-1} \pi_k^{(s)} e^{\left( \delta - \frac{1}{2} \sigma^2 r_k^2 \right) (n-k) + \sigma r_k \sqrt{n-k}} \Phi^{-1} \left( F_{V_n^{-(l)}}(b_n) \right) - b_n = 0$$

# Conditional Lower Bound (CLB)



## Determining the value of the embedded put option

- Similarly, the value of the put option payoff is :

$$\begin{aligned}
 & E \left[ \left( b_n - V_n^{-(l)} \right)_+ \right] \\
 &= - \sum_{k=0}^{n-1} \pi_k^{(s)} e^{\delta(n-k)} \Phi \left[ -\sigma r_k \sqrt{n-k} + \Phi^{-1} \left( F_{V_n^{-(l)}}(b_n) \right) \right] \\
 & \quad + b_n F_{V_n^{-(l)}}(b_n)
 \end{aligned}$$

where as before

$$\sum_{k=0}^{n-1} \pi_k^{(s)} e^{\left( \delta - \frac{1}{2} \sigma^2 r_k^2 \right) (n-k) + \sigma r_k \sqrt{n-k}} \Phi^{-1} \left( F_{V_n^{-(l)}}(b_n) \right) - b_n = 0$$

# Conditional Lower Bound (CLB)



## Determining the value of the GMMB & GMDB (put option)

- We can use the previous results for the GMMB case:

$$P_0 = {}_n P_x e^{-\delta n} E \left[ \left( b_n - V_n^{-l} \right)_+ \right]$$

- For the GMDB case, we have:

$$P_0 = \sum_{k=0}^{n-1} {}_k P_x q_{x+k} e^{-\delta(k+1)} E \left[ \left( b_{k+1} - V_{k+1}^{-l} \right)_+ \right]$$

# Conditional Lower Bound (CLB)



## Accuracy of the conditional lower bound

- Consider again the pure financial contract that guarantees ROC at maturity.
- Monte Carlo (MC) estimates and their standard errors (s.e.) were computed as “true” values for differing values of the risk-free rate and  $\sigma = 20\%$ :

	Guarantee	CLB	MC	s.e.
$\delta=1\%$	500	1.9299	2.0269	0.00191
	750	31.1708	31.3591	0.00872
	1000	120.7156	120.8753	0.01294
	1250	266.7567	266.8974	0.00837
	1500	449.5724	449.7517	0.00658
$\delta=5\%$	500	0.2899	0.3191	0.00061
	750	7.6583	7.7911	0.00368
	1000	39.3632	39.5205	0.00924
	1250	104.2183	104.3376	0.01103
	1500	198.393	198.5049	0.00816
$\delta=10\%$	500	0.0178	0.0218	0.00012
	750	0.9215	0.9665	0.00105
	1000	7.0577	7.1558	0.00343
	1250	24.3875	24.5078	0.00643
	1500	56.0633	56.1616	0.00947

# Conditional Lower Bound (CLB)



## Accuracy of the conditional lower bound (cnt'd)

- Consider again the pure financial contract that guarantees ROC at maturity.
- Monte Carlo (MC) estimates and their standard errors (s.e.) were computed as “true” values for differing values of volatility and  $\delta = 5\%$ :

	Guarantee	CLB	MC	s.e.
$\sigma=20\%$	500	0.2899	0.3191	0.00061
	750	7.6583	7.7911	0.00368
	1000	39.3632	39.5205	0.00924
	1250	104.2183	104.3376	0.01103
	1500	198.393	198.5049	0.00816
$\sigma=30\%$	500	4.6067	4.9362	0.00299
	750	30.2476	30.7541	0.00824
	1000	84.6857	85.1418	0.01132
	1250	164.6151	164.9986	0.01243
	1500	264.0077	264.3668	0.00794
$\sigma=40\%$	500	15.6902	16.722	0.00561
	750	60.3649	61.5619	0.01058
	1000	131.4565	132.5241	0.01172
	1250	222.2414	223.1759	0.01005
	1500	327.2443	328.0961	0.00796

# Conditional Lower Bound (CLB)



## Accuracy of the conditional lower bound - GMMB

- Consider now a GMMB that guarantees ROC at maturity.
- Values compared to a pure endowment (absolute upper bound)

Risk-free Rate	Guarantee	Volatility			Pure Endowment
		$\sigma=20\%$	$\sigma=30\%$	$\sigma=40\%$	
$\delta=1\%$	50%	1.92602	14.25033	36.38255	451.51378
	75%	31.10845	76.21130	125.15746	677.27067
	100%	120.47413	189.48745	255.44786	903.02756
	125%	266.22310	340.61672	413.57425	1128.78445
	150%	448.67315	516.84348	590.24730	1354.54135
$\delta=5\%$	50%	0.28930	4.59746	15.65882	302.65874
	75%	7.64299	30.18714	60.24417	453.98811
	100%	39.28447	84.51634	131.19351	605.31748
	125%	104.00982	164.28582	221.79691	756.64685
	150%	197.99618	263.47966	326.58979	907.97622
$\delta=10\%$	50%	0.01779	0.93749	4.96337	183.57180
	75%	0.91966	8.15758	22.27280	275.35771
	100%	7.04358	26.95710	53.07222	367.14361
	125%	24.33875	58.58643	95.34859	458.92951
	150%	55.95119	101.86759	146.77681	550.71541

# Conditional Lower Bound (CLB)



## Accuracy of the conditional lower bound - GMDB

- Consider now a GMDB that guarantees ROC at death.
- Values compared to a term life contract (absolute upper bound)

Risk-free Rate	Guarantee	Volatility			Term Life Benefit
		$\sigma=20\%$	$\sigma=30\%$	$\sigma=40\%$	
$\delta=1\%$	50%	0.00117	0.01055	0.02975	0.53091
	75%	0.02652	0.06959	0.11833	0.79636
	100%	0.12424	0.19430	0.26201	1.06180
	125%	0.29966	0.37195	0.44508	1.32730
	150%	0.52294	0.58396	0.65421	1.59270
$\delta=5\%$	50%	0.00020	0.00384	0.01436	0.40142
	75%	0.00790	0.03203	0.06497	0.60213
	100%	0.05105	0.10244	0.15504	0.80284
	125%	0.14871	0.21352	0.27642	1.00350
	150%	0.29074	0.35470	0.42017	1.20430
$\delta=10\%$	50%	0.00002	0.00097	0.00548	0.28707
	75%	0.00143	0.01128	0.02968	0.43060
	100%	0.01481	0.04367	0.07855	0.57414
	125%	0.05646	0.10254	0.14973	0.71767
	150%	0.12967	0.18433	0.23837	0.86121

# Asset-Based Charges

## Fair value approach

- The asset-based charge for the guarantee can be solved for by equating the present value of the benefits to the present value of the contributions.
- For the pure financial contract, we therefore have:

$$\begin{aligned} \sum_{k=0}^{n-1} \pi_k^{(s)} e^{-\delta k} &= e^{-\delta n} E \left[ \max \left( V_n^{-(l)}, b_n \right) \right] \\ &= e^{-\delta n} E \left[ V_n^{-(l)} \right] + P_0 \end{aligned}$$

where

$$\begin{aligned} P_0 &= - \sum_{k=0}^{n-1} \pi_k^{(s)} e^{-\delta k} (1-e)^{n-k} \Phi \left[ -\sigma r_k \sqrt{n-k} + \Phi^{-1} \left( F_{V_n^{-(l)}}(b_n) \right) \right] \\ &\quad + e^{-\delta n} b_n F_{V_n^{-(l)}}(b_n) \end{aligned}$$

# Asset-Based Charges



## Fair value approach – GMMB & GMDB

- Similarly, we can solve the asset-based charges for the GMMB:

$$\sum_{k=0}^{n-1} {}_k p_x \pi_k^{(s)} e^{-\delta k} = {}_n p_x e^{-\delta n} E \left[ \max \left( V_n^{-l}, b_n \right) \right]$$

- For the GMDB, we have:

$$\sum_{k=0}^{n-1} {}_k p_x \pi_k^{(s)} e^{-\delta k} = \sum_{k=0}^{n-1} {}_k p_x q_{x+k} e^{-\delta(k+1)} E \left[ \max \left( V_{k+1}^{-l}, b_{k+1} \right) \right]$$

# Asset-Based Charges



## Numerical Example

- Consider again the pure financial contract that guarantees ROC at death - annual premium of 100 over 10 years.
- Values computed for differing values of the risk-free rate and volatility.

	Guarantee	$\sigma=20\%$	$\sigma=30\%$	$\sigma=40\%$
$\delta=1\%$	500	0.3664	2.8282	7.5429
	750	6.9304	18.7686	32.8233
	1000	51.1506	86.564	120.8808
$\delta=5\%$	500	0.06095	0.9881	3.4656
	750	1.6931	7.187	15.1582
	1000	10.5377	25.1368	41.4655
	1250	48.1448	81.8928	114.5406
$\delta=10\%$	500	0.00425	0.2254	1.2115
	750	0.2218	2.0356	5.7732
	1000	1.7803	7.3267	15.2321
	1250	6.9371	18.4198	31.8342
	1500	20.2496	40.713	61.8769

# Hedging

## Mitigating risk through hedging

### Some possible solutions

- Reinsurance (limited)
- Structured solutions
- Super-hedging
- Risk-minimising strategies

### Static or Dynamic?

Only 1 out of 16 responded utilised a pure static hedging approach according to a Milliman survey (2008).

Other respondents used dynamic strategies or a combination.

### Greeks

The three main Greeks on which respondents to the Milliman survey focused were delta, rho and vega.

### Further outline

The CLB is used to calculate Greeks for the GMMB and GMDB products.

Greeks of CLB approximation facilitate reasonableness checks to more complex scenario based models.



# Hedging

## Calculating the Greeks

- The delta can be analytically determined.
- The delta of the embedded put option for the pure financial contract is given by:

$$\Delta_t = \frac{\partial P_t}{\partial F(t)}$$

$$= - \sum_{k=0}^{\lceil t \rceil - 1} \frac{\pi_k^{(s)}}{F(k)} \Phi \left[ -\sigma r_t \sqrt{n-t} + \Phi^{-1} \left( F_{V_n^{-(l)}}(b_n) \right) \right]$$

where  $t$  is the time of valuation such that  $0 \leq t \leq n$ .

# Hedging

## Calculating the Greeks – GMMB & GMDB

- The delta of the embedded put option for the GMMB is given by:

$$\Delta_t = \frac{\partial P_t}{\partial F(t)} {}_tP_x P_t$$

- The delta of the embedded put option for the GMDB is given by:

$$\Delta_t = \frac{\partial P_t^{j+1}}{\partial F(t)} \sum_{j=\lceil t \rceil - 1}^{n-1} {}_jP_{x+t} {}_jQ_{x+t+j} P_t^{j+1}$$

# Hedging

## Calculating the Greeks



- The other Greeks can be easily determined by the centre differencing approach, i.e. the rho is given by:

$$\rho_t = \frac{\partial P_t}{\partial \delta} \approx \frac{P_t(\delta + \Delta\delta) - P_t(\delta - \Delta\delta)}{2\Delta\delta}$$

and the vega is given by:

$$\text{Vega}_t = \frac{\partial P_t}{\partial \sigma} \approx \frac{P_t(\sigma + \Delta\sigma) - P_t(\sigma - \Delta\sigma)}{2\Delta\sigma}$$

- Higher order Greeks such as gamma, and other sensitivity measures can be determined in a similar way.

# Hedging

## Illustrative Example



### Pure Financial Contract

Guarantees ROC at maturity

A payment of 1 is made monthly, i.e.  $ROC = 60$ .

### Monthly Rebalancing

Each month, the delta is held in the underlying fund and the remainder in the risk-free bond.

### Parameters

Assume a risk-free rate of 5% and volatility of 20%.

### MC paths

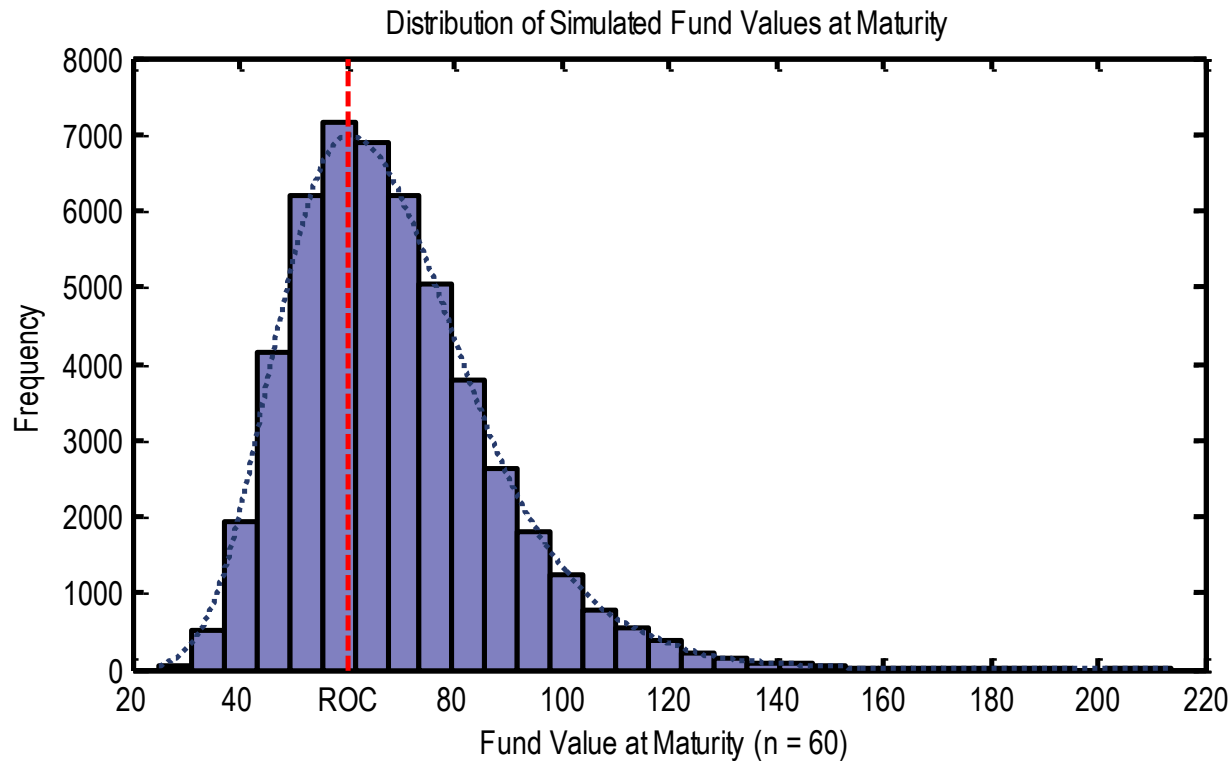
Single Monte Carlo simulation paths were used to assess the delta hedging strategy.

# Hedging

## Illustrative Example Results



- The distribution of the fund value at maturity is as follows:

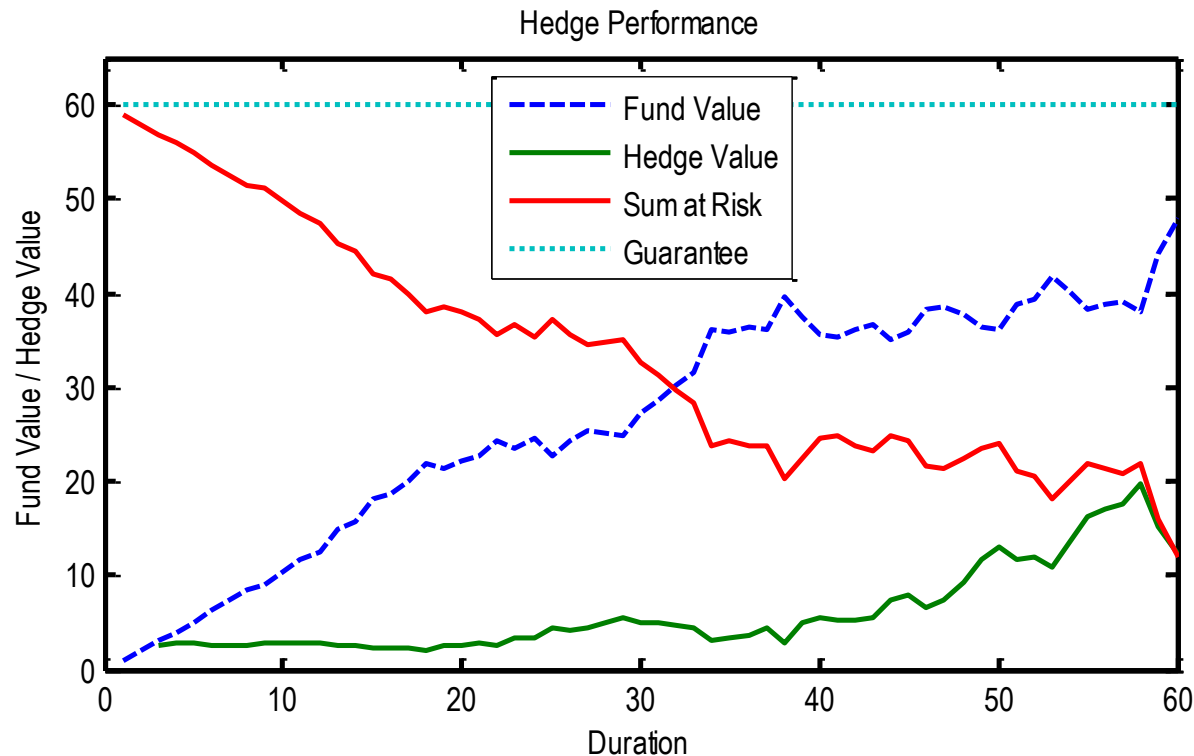


# Hedging

## Illustrative Example Results



- In the event of poor market performance, a likely delta hedging strategy might resemble the following:

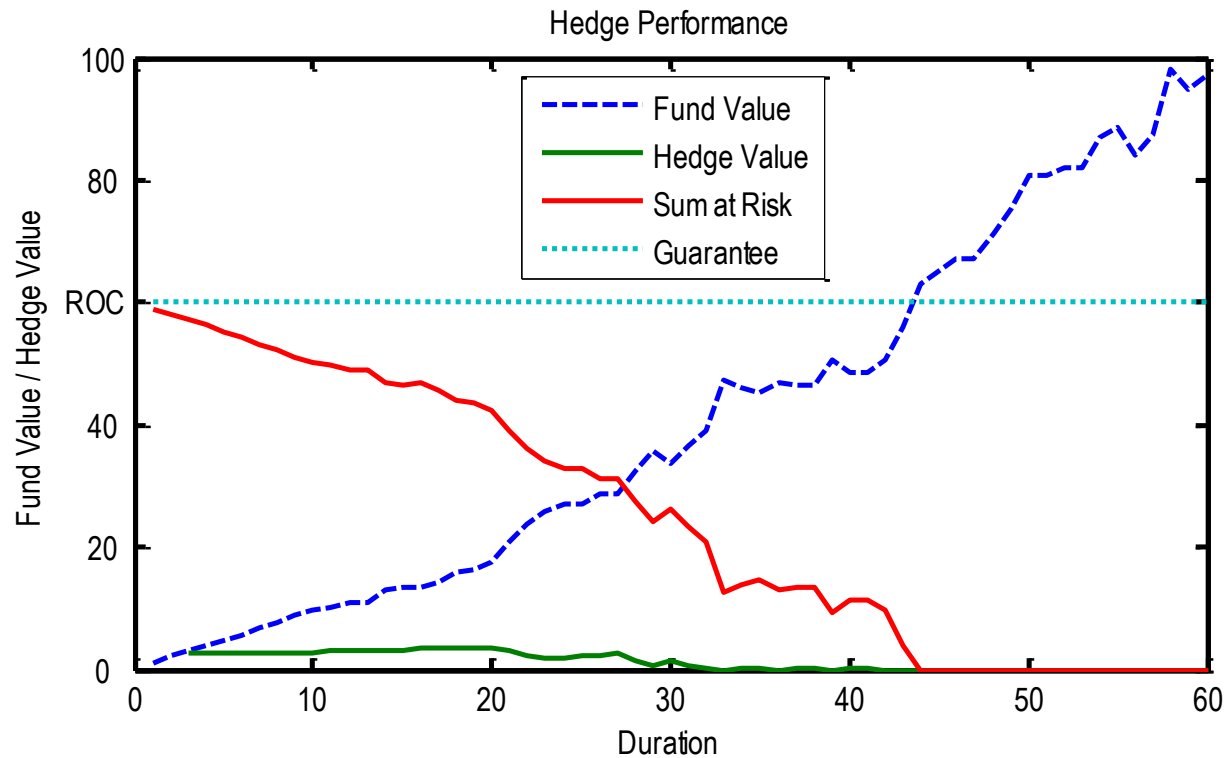


# Hedging

## Illustrative Example Results



- In the event of good market performance, a likely delta hedging strategy might resemble the following:



# Conclusions



## **Integrated risk management**

Risk management should be a first consideration in product development, i.e.

IF YOU CAN'T MANAGE IT, DON'T SELL IT.

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## **CLB a complement**

The CLB could act as a pragmatic complement to existing, more resource intensive, risk management processes in:

- Pricing
  - Reserving, and
  - Hedging
-

# Contact Details



- Kobus Bekker  
ABSA Life  
South Africa  
[kobus.bekker2@absa.co.za](mailto:kobus.bekker2@absa.co.za)
  
- Jan Dhaene  
Katholieke Universiteit Leuven  
Belgium  
[Jan.Dhaene@econ.kuleuven.be](mailto:Jan.Dhaene@econ.kuleuven.be)

# Good luck Bafana Bafana!

