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Abstract

Pension funds and life insurers offering annuities hold long term liabilities linked to longevity. Risk management of life annuity portfolios aims to immunize or hedge both interest rate and mortality risks. Standard fixed interest duration-convexity hedging must be adapted to allow for both interest rate and longevity risk. We develop an immunization approach along with a delta-gamma based approach allowing for both risks incorporating models for mortality and interest rate risk. The immunization and hedge effectiveness of fixed-income coupon bonds, annuity bonds, as well as longevity bonds, is compared and assessed using simulations of portfolio surplus outcomes for an annuity portfolio. Fixed-income annuity bonds can more effectively match cash flows and provide additional hedge effectiveness over coupon bonds. Longevity bonds, including deferred longevity bonds, reduce risk significantly compared to coupon and annuity bonds, reflecting the long duration of the typical life annuity and the exposure to longevity risk. Longevity bonds are shown to be effective in immunizing surplus over short and long horizons. Delta gamma hedging is shown to only be effective over short horizons.

Keywords: immunization, hedging, delta, gamma, longevity bond

JEL Classification: G11, G22, C61
PRELIMINARY WORKING PAPER

1 Introduction

Interest rate risk immunization has a long tradition in the optimal selection of portfolios of bonds to match insurance liabilities in both the actuarial and the financial literature. The classical approach to interest rate immunization of an insurer's liabilities is Redington's theory of immunization which is based on a deterministic shock to a flat yield curve (Redington, 1952). Fisher and Weil (1971) extended the analysis to a non-flat yield curve. Extensions of interest rate immunization to multiple liabilities and non-constant shocks as well as the application of linear programming techniques to select immunized bond portfolios are presented in Shiu (1987, 1988, 1990).

Immunization has been applied to mortality risk. Tsai and Chung (2013) and Lin and Tsai (2013) derive duration and convexities for a range of life annuity and life insurance product portfolios. They then construct portfolios of life annuity and life insurance products that immunize mortality risk, a form of natural hedging. They consider alternative duration and convexity matching strategies with differing assumptions for mortality shocks. Lin and Tsai (2013) use Value-at-Risk measures for the time zero surplus and the Lee-Carter model to assess the effectiveness of the immunization strategies. They consider instantaneous proportional and parallel shifts in the one-year survival probability (p_x) and the one-year death probability (q_x). Tsai and Chung (2013) apply a linear hazard transformation to mortality immunization allowing a proportional and parallel shift in mortality rates. Only mortality shocks and portfolios of life annuity and life insurance products are considered.

Luciano et al. (2012) develop delta-gamma hedging for annuity providers allowing for both stochastic interest rates and stochastic mortality rates. They use zero coupon bonds and zero coupon survival bonds as the assets in the hedging strategies and pure endowment contracts as the liability. Using delta and gamma risk measures based on their stochastic interest rate and mortality models, they select portfolios that have zero delta and zero gamma for both mortality and financial risk.

We consider the immunization of a life annuity portfolio and the extension of linear programming approaches to the selection of fixed-income and longevity bonds. Both duration and convexity matching approaches as well as delta-gamma hedging with stochastic interest rate and mortality models are considered and compared. We consider traditional immunization approaches using duration and convexity and delta-gamma hedging when both interest rate and longevity risk are to be hedged. We use simulation and value-at-risk for the portfolio surplus to evaluate the effectiveness of the immunization and hedging strategies. We implement immunization and delta-gamma hedging for an asset portfolio consisting of fixed-income coupon and annuity bonds as well as longevity linked bonds.

The main results are that longevity bonds are very effective in immunizing longevity risk. Only a small number of both short and long maturity longevity bonds are required to immunize life annuity liabilities. Annuity bonds better match the expected cash flows of life annuity liabilities over coupon bonds, but longevity bonds better manage the risk. Over short horizons both immunization and delta-gamma hedging are effective in selecting bond portfolios for life annuities. Over longer horizons, immunization is more effective. Delta-gamma hedging is based on stochastic models for both interest rate and mortality risk and is less robust to these underlying risks over longer horizons as compared to

immunization.

This paper is structured as follows: Section 2 describes the modelling framework for the underlying mortality model and interest rate model respectively. Section 3 outlines the construction of portfolios including derivation of pricing, delta, gamma, duration and convexity results. Section 4 provides details of the bond portfolios used in the immunization and hedging based on both available and hypothetical bonds. Section 5 presents the linear program used for selecting the immunization bond portfolios and compares the cash flows of the annuity liability with the bond portfolios. Section 6 presents the linear program used for the delta-gamma hedging strategies and compares the cash flows for the bond portfolios with the annuity liability. Section 7 uses the stochastic models to compare the hedge performance of the immunization and hedging bond portfolios. Section 8 concludes the paper.

2 Stochastic Models and Calibration

Traditional immunization approaches are based on deterministic shocks to yield curves. Delta-gamma hedging takes into account the stochastic nature of the underlying risks. In order to evaluate these different approaches, we use stochastic mortality and interest rate models. The models are used to derive pricing formulae as well as to quantify measures of mortality and interest rate risk for a life annuity portfolio. They allow us to compare delta-gamma hedging strategies with immunization strategies. We use the models to compare the hedge effectiveness by simulating the surplus of a life annuity fund with asset portfolios selected using both immunization and delta-gamma hedging.

The risk factors in the interest rate model are assumed to be independent of those in the mortality model. We use Australian mortality and interest rate data to calibrate the models. Australian mortality and interest rate experience is representative of many developed economics. Australia has a well developed bond market including coupon bonds and annuity bonds.

2.1 Mortality Model

The mortality model is a two-factor Gaussian stochastic Makeham model based on Schrager (2006). This has been used in a number of studies of longevity risk. The model is affine and gives closed form solutions for survival probabilities. The mortality intensity is given by:

$$\mu_x(t) = Y_1(t) + Y_2(t)c^x \quad (2.1)$$

where $Y_1(t)$ and $Y_2(t)$ are the base and age-dependent mortality risk factors respectively. The stochastic differential equations for the mortality risk factors are:

$$dY_i(t) = -a_i Y_i(t)dt + \sigma_i dW_i^{\mathbb{Q}}(t) \text{ , for } i = 1, 2 \quad (2.2)$$

where $Y_i(0) = \bar{Y}_i$ for $i = 1, 2$; $a_i > 0$ and $\sigma_i \geq 0$; $dW_1^{\mathbb{Q}}(t)dW_2^{\mathbb{Q}}(t) = 0$ and we assume the two mortality factors are independent, consistent with the assumption made in Biffis (2005), Blackburn and Sherris (2013) and Wong et al. (2013).

Pricing longevity bonds and life annuities requires the mortality dynamics under a risk-neutral measure \mathbb{Q} . The longevity risk market is not liquid enough to calibrate risk premiums so these are assumed zero and we use the real world measure \mathbb{P} for pricing and risk measures. This is the assumption made by others including Luciano et al. (2012).

Based on the affine framework, the forward survival probability is

$$S(x, t, T) = \mathbb{E}_t^{\mathbb{Q}}[e^{-\int_t^T \mu_x(u)du}] = e^{C(x,t,T) - D_1(x,t,T)Y_1(t) - D_2(x,t,T)Y_2(t)} \quad (2.3)$$

where $C(x, t, T)$, $D_1(x, t, T)$ and $D_2(x, t, T)$ are of the forms:

$$C(x, t, T) = \frac{\sigma_1^2}{2a_1^3} \left[a_1(T-t) - 2(1 - e^{-a_1(T-t)}) + \frac{1}{2}(1 - e^{-2a_1(T-t)}) \right] + \frac{\sigma_2^2 c^{2(x+t)}}{2(a_2 - \log(c))^3} \\ \times \left[(a_2 - \log(c))(T-t) - 2(1 - e^{-(a_2 - \log(c))(T-t)}) + \frac{1}{2}(1 - e^{-2(a_2 - \log(c))(T-t)}) \right] \quad (2.4)$$

$$D_1(x, t, T) = \frac{1 - e^{-a_1(T-t)}}{a_1} \quad (2.5)$$

$$D_2(x, t, T) = c^{x+t} \frac{1 - e^{-(a_2 - \log(c))(T-t)}}{a_2 - \log(c)} \quad (2.6)$$

with boundary conditions $C(x, T, T) = 0$, $D_1(x, T, T) = 0$ and $D_2(x, T, T) = 0$.

The mortality model is calibrated to Australian Mortality Data for males aged 50 – 100 and years 1960 – 2009 obtained from the Human Mortality Database (2014). We used the estimation methods in Koopman and Durbin (2000) and Wong et al. (2013) based on the Kalman filter. The calibrated parameters for the mortality model are shown in Table 2.1.

Figure 2.1 shows the historical mortality rate with the projected mortality rates from the calibrated model. Mean absolute relative error (MARE) range between 4% and 18% for the fitted ages from 50 to 100, similar to Schrage's results when calibrated to Dutch mortality data.

Table 2.1: Parameters of the Calibrated Mortality Model - Australian Population Males Aged 50 to 100 for years 1960 to 2009

Parameter	Estimate	Standard Error
a_1	0.00621	1.48e-04
a_2	0.000742	1.93e-05
σ_1	0.000204	5.92e-07
σ_2	0.0000148	7.79e-09
c	1.092	6.19e-06

Historical and Projected Mortality Rate Data for Australian Population 1960–2050 Ages 50–100

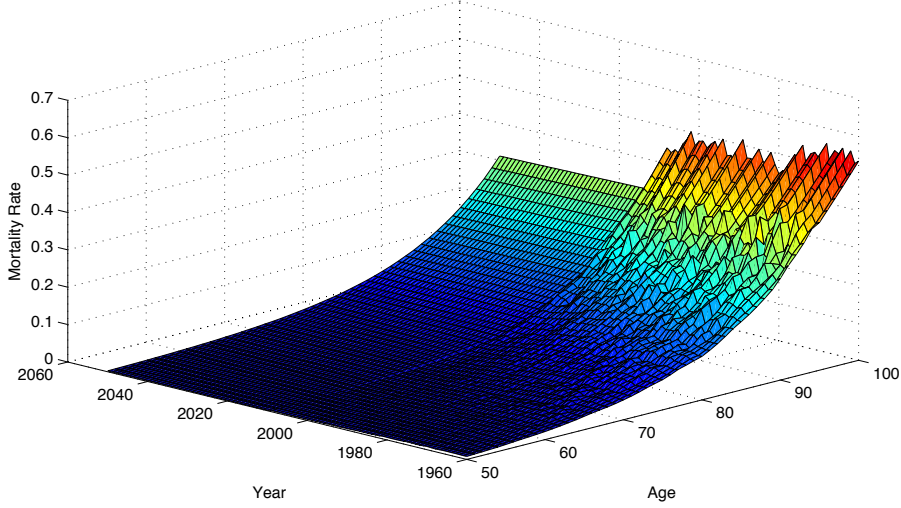


Figure 2.1: Historical (1960 – 2009) and Projected (2010 – 2050) Mortality Rates for Australian Population Males Aged 50 – 100

2.2 Interest Rate Model

The instantaneous interest rate $r(t)$ is modelled as a single-factor Cox-Ingersoll-Ross (CIR) process with its dynamics under the risk neutral \mathbb{Q} measure given by:

$$dr(t) = \kappa_r(\theta_r - r(t))dt + \sigma_r\sqrt{r(t)}dW_r^{\mathbb{Q}}(t) \quad (2.7)$$

where $\kappa_r > 0$ is the speed of mean reversion of $r(t)$, $\theta_r > 0$ is the long-run mean of $r(t)$, $\sigma_r \geq 0$ is the volatility of the short rate process, and $2\kappa_r\theta_r \geq \sigma_r^2$ needs to be satisfied to ensure the process is positive (Cox et al., 1985).

The dynamics of the interest rate under the \mathbb{P} measure is given by:

$$dr(t) = \bar{\kappa}_r(\bar{\theta}_r - r(t))dt + \sigma_r\sqrt{r(t)}dW_r(t) \quad (2.8)$$

$$= \bar{\kappa}_r(\bar{\theta}_r - r(t))dt + \sigma_r\sqrt{r(t)}\left(dW_r^{\mathbb{Q}}(t) - \lambda_r(t, r(t))dt\right) \quad (2.9)$$

where

$$\lambda'_r = \frac{\sigma_r\lambda_r(t, r(t))}{\sqrt{r(t)}} \quad (2.10)$$

$$\kappa_r = \bar{\kappa}_r + \lambda'_r \quad (2.11)$$

$$\theta_r = \frac{\bar{\kappa}_r\bar{\theta}_r}{\bar{\kappa}_r + \lambda'_r} \quad (2.12)$$

$\lambda_r(t, r(t))$ is the market premium of interest rate risk and we assume $\lambda_r(t, r(t))$ to be a function of $\sqrt{r(t)}$ so that λ'_r is a constant.

The forward zero coupon bond price is given by:

$$B(t, T) = \mathbb{E}_t^{\mathbb{Q}}[e^{-\int_t^T r(u)du}] = e^{C_r(t, T) - D_r(t, T)r(t)} \quad (2.13)$$

where $C_r(t, T)$ and $D_r(t, T)$ are given by:

$$C_r(t, T) = \frac{2\kappa_r\theta_r}{\sigma_r^2} \log \left[\frac{2\gamma_r e^{\frac{(\gamma_r + \kappa_r)(T-t)}{2}}}{(\gamma_r + \kappa_r)(e^{\gamma_r(T-t)} - 1) + 2\gamma_r} \right] \quad (2.14)$$

$$D_r(t, T) = \frac{2(e^{\gamma_r(T-t)} - 1)}{(\gamma_r + \kappa_r)(e^{\gamma_r(T-t)} - 1) + 2\gamma_r} \quad (2.15)$$

with

$$\gamma_r = \sqrt{\kappa_r^2 + 2\sigma_r^2} \quad (2.16)$$

with boundary conditions $C_r(T, T) = 0$ and $D_r(T, T) = 0$.

The CIR interest model parameters are estimated from zero-coupon bond yield data for 40 different maturities (3, 6, 9, ..., 117, 120 months) using daily data from 4 January 1993 to 31 July 2014 along with daily short rate data. The zero-coupon bond yield and short rate data were obtained from the Reserve Bank of Australia.

The estimation technique is adopted from Rogers and Stummer (2000) and Kladiivko (2007). It uses the General Method of Moments (GMM) approach with $M + 2$ moment conditions. M is the number of different maturities for the zero coupon bond data, in our case $M = 40$. The first M moments fit the yield curve allowing estimation of the implied market interest rate risk premium. The last 2 moments fit the time series data of short rates and match the mean and variance of the real world CIR interest rate process. This calibration method estimates the model parameters as well as the market risk premium using both yield curve and short rate data. The parameter estimates are consistent when we fit the model to data for different time periods using the GMM. Fitting the model only to the yield curve data results in unreasonable estimates for the parameters.

The calibrated parameters of the interest model are shown in Table 2.2.

Table 2.2: Parameters of the Calibrated Interest Rate Model - Australian Interest Rate Data 4 January 1993 to 31 July 2014

Parameter ¹	Estimate	Standard Error
$\bar{\kappa}_r$	0.445	0.0022
$\bar{\theta}_r$	0.0523	0.0012
σ_r	0.0414	0.0013
λ_r	-0.111	0.0022

The model parameters imply an Australian long-term interest rate of approximately 5.2%. The parameters under the \mathbb{Q} measure are $\kappa_r = 0.334$ and $\theta_r = 0.0697$. The standard errors for the parameter estimates are derived using numerical approximation of the asymptotic variance matrix as in Mátyás (1999).

Figure 2.2 shows the 50-year yield curve used for product pricing.

¹ $\bar{\kappa}_r$ and $\bar{\theta}_r$ are parameters under \mathbb{P} measure.

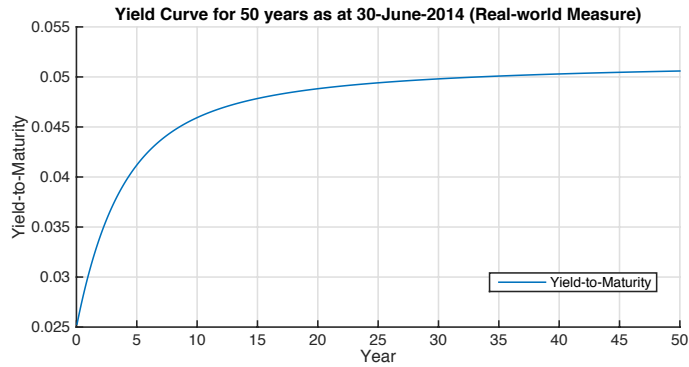


Figure 2.2: Yield Curve for 50 years as at 30 June 2014

3 Life Annuity Immunization

We consider the immunization and hedging strategy from the perspective of an annuity provider issuing whole-life annuities with level monthly payments to males aged 65 at 30 June 2014. All life annuities are single premium and the insurer invests these premiums into fixed-income securities and longevity-linked securities. Our focus is on interest rate and longevity risk and we do not include idiosyncratic mortality risk or basis risk.

We use linear programming to solve for the optimal bond portfolio allocation. The linear programming approach of Shiu (1988) and Panjer et al. (1997) is extended by considering both interest rate and mortality risk. We take into consideration a wide range of different fixed-income securities and select the optimal portfolios from these. We select portfolios from more than 60 coupon bonds and annuity bonds, including maturities and securities available in the market, along with hypothetical longevity bonds. The details of the bonds are covered in Section 4. We assume all securities are non-callable, and default free. Credit risk is assumed fully hedged and does not impact the interest rate or longevity risk analysis.

The initial number of policyholders is 100, the coupon bonds have a face value of 100 and the payment amount for the annuity bonds and the longevity bonds is \$1. These values are used for convenience and are in effect arbitrary. The important determinant of the bond portfolios selected is the weights in each of the assets.

3.1 Duration, Convexity, Delta and Gamma

For the immunization we adapt the Fisher-Weil cash flow duration and Fisher-Weil convexity measures to longevity linked cash flows. We also use delta and gamma. These are defined in Tables 3.1, 3.2 and 3.3 for the asset and liability cash flows. Table 3.1 gives the Fisher-Weil duration and convexity measures along with the delta and gamma definitions used for the assets.

Table 3.1: Fisher-Weil Duration and Convexity, Delta and Gamma

$\tilde{\mathcal{D}} = \frac{\mathcal{D}}{P}$	$\tilde{\Delta}_{Y_1(t)} = \frac{\Delta_{Y_1(t)}}{P}$	$\tilde{\Delta}_{Y_2(t)} = \frac{\Delta_{Y_2(t)}}{P}$	$\tilde{\Delta}_{r(t)} = \frac{\Delta_{r(t)}}{P}$
$\tilde{\mathcal{C}} = \frac{\mathcal{C}}{P}$	$\tilde{\Gamma}_{Y_1(t)} = \frac{\Gamma_{Y_1(t)}}{P}$	$\tilde{\Gamma}_{Y_2(t)} = \frac{\Gamma_{Y_2(t)}}{P}$	$\tilde{\Gamma}_{r(t)} = \frac{\Gamma_{r(t)}}{P}$

Table 3.2 gives the formulae used for cash flow prices, dollar duration and dollar convexity of assets and liabilities used in Table 3.1. To indicate whether we use interest only bond cash flows or mortality dependent cash flows we use the index k for fixed-income securities and j for longevity-linked securities.

Table 3.2: Fisher-Weil Dollar Duration and Convexity for Asset and Liability Cash Flows

Fixed-income Securities (k)	Longevity-linked Securities (j)	Liabilities
$a_k = \sum_{t \geq 1} A_{k,t} \cdot B(0, t)$	$a_j = \sum_{t \geq 1} A_{j,t} \cdot S_x(0, t)B(0, t)$	$l = \sum_{t \geq 1} L_t \cdot S_x(0, t)B(0, t)$
$\mathcal{D}[a_k] = \sum_{t \geq 1} A_{k,t} \cdot t \cdot B(0, t)$	$\mathcal{D}[a_j] = \sum_{t \geq 1} A_{j,t} \cdot t \cdot S_x(0, t)B(0, t)$	$\mathcal{D}[l] = \sum_{t \geq 1} L_t \cdot t \cdot S_x(0, t)B(0, t)$
$\mathcal{C}[a_k] = \sum_{t \geq 1} A_{k,t} \cdot t^2 \cdot B(0, t)$	$\mathcal{C}[a_j] = \sum_{t \geq 1} A_{j,t} \cdot t^2 \cdot S_x(0, t)B(0, t)$	$\mathcal{C}[l] = \sum_{t \geq 1} L_t \cdot t^2 \cdot S_x(0, t)B(0, t)$

$B(0, t)$ denotes the time-0 zero coupon bond price with maturity value of 1 at time t , and $S_x(0, t)$ the risk-neutral survival probability for a cohort age x to survive t years from time-0. $A_{k,t}$ is the cash flow at time t for a fixed-income cash flow. $A_{j,t}$ is the cash flow at time t for a survival dependent cash flow. L_t is the liability cash flow at time t .

Table 3.3 gives the delta and gamma sensitivities for the factors in the stochastic mortality and interest rate models. There are two factors in the mortality model and hence a delta and gamma for each factor is required.

Table 3.3: Delta and Gamma for Asset and Liability Cash Flows

Fixed-income Securities (k)	Longevity-linked Securities (j)	Liabilities
$a_k = \sum_{t \geq 1} A_{k,t} \cdot B(0, t)$	$a_j = \sum_{t \geq 1} A_{j,t} \cdot S_x(0, t)B(0, t)$	$l = \sum_{t \geq 1} L_t \cdot S_x(0, t)B(0, t)$
$\Delta_{r(t)}[a_k] = \frac{\partial[\sum_{t \geq 1} A_{k,t} \cdot B(0, t)]}{\partial r(t)}$	$\Delta_{r(t)}[a_j] = \frac{\partial[\sum_{t \geq 1} A_{j,t} \cdot S_x(0, t)B(0, t)]}{\partial r(t)}$	$\Delta_{r(t)}[l] = \frac{\partial[\sum_{t \geq 1} L_t \cdot S_x(0, t)B(0, t)]}{\partial r(t)}$
$\Gamma_{r(t)}[a_k] = \frac{\partial^2[\sum_{t \geq 1} A_{k,t} \cdot B(0, t)]}{\partial (r(t))^2}$	$\Gamma_{r(t)}[a_j] = \frac{\partial^2[\sum_{t \geq 1} A_{j,t} \cdot S_x(0, t)B(0, t)]}{\partial (r(t))^2}$	$\Gamma_{r(t)}[l] = \frac{\partial^2[\sum_{t \geq 1} L_t \cdot S_x(0, t)B(0, t)]}{\partial (r(t))^2}$
-	$\Delta_{Y_1(t)}[a_j] = \frac{\partial[\sum_{t \geq 1} A_{j,t} \cdot S_x(0, t)B(0, t)]}{\partial Y_1(t)}$	$\Delta_{Y_1(t)}[l] = \frac{\partial[\sum_{t \geq 1} L_t \cdot S_x(0, t)B(0, t)]}{\partial Y_1(t)}$
-	$\Gamma_{Y_1(t)}[a_j] = \frac{\partial^2[\sum_{t \geq 1} A_{j,t} \cdot S_x(0, t)B(0, t)]}{\partial (Y_1(t))^2}$	$\Gamma_{Y_1(t)}[l] = \frac{\partial^2[\sum_{t \geq 1} L_t \cdot S_x(0, t)B(0, t)]}{\partial (Y_1(t))^2}$
-	$\Delta_{Y_2(t)}[a_j] = \frac{\partial[\sum_{t \geq 1} A_{j,t} \cdot S_x(0, t)B(0, t)]}{\partial Y_2(t)}$	$\Delta_{Y_2(t)}[l] = \frac{\partial[\sum_{t \geq 1} L_t \cdot S_x(0, t)B(0, t)]}{\partial Y_2(t)}$
-	$\Gamma_{Y_2(t)}[a_j] = \frac{\partial^2[\sum_{t \geq 1} A_{j,t} \cdot S_x(0, t)B(0, t)]}{\partial (Y_2(t))^2}$	$\Gamma_{Y_2(t)}[l] = \frac{\partial^2[\sum_{t \geq 1} L_t \cdot S_x(0, t)B(0, t)]}{\partial (Y_2(t))^2}$

3.2 Whole-life Annuities

To consider the life annuity, the time- t value of a whole-life annuity is denoted by $WA_x(t, \infty, r, \mu_x)$. We can write its value as the sum of a series of pure endowments $PE_x(t, T_i, r, \mu_x)$ with maturities from $t + 1$ to ∞ . The value of the whole-life annuity at time- t can be expressed as:

$$WA_x(t, \infty, r, \mu_x) = \mathbb{1}_{\tau \geq t} \sum_{T_i=t+1}^{\infty} PE_x(t, T_i, r, \mu_x) \quad (3.1)$$

$$= \mathbb{1}_{\tau \geq t} \mathbb{E}_t^Q \left[\sum_{T_i=t+1}^{\infty} L_{T_i} \times e^{-\int_t^{T_i} (r(u) + \mu_x(u)) du} \right] \quad (3.2)$$

$$= \mathbb{1}_{\tau \geq t} \sum_{T_i=t+1}^{\infty} L_{T_i} \times e^{C(x,t,T_i) - D_1(x,t,T_i)Y_1(t) - D_2(x,t,T_i)Y_2(t)} \times e^{C_r(t,T_i) - D_r(t,T_i)r(t)} \quad (3.3)$$

where $\mathbb{1}_{\tau \geq t}$ is an indicator function for the alive status of the policyholder, and τ is the time of death.

The Fisher-Weil dollar duration and convexity of $WA_x(t, \infty, r, \mu_x)$ are then given by:

$$\mathcal{D}[WA_x(t, \infty, r, \mu_x)] = \sum_{T_i=t+1}^{\infty} (T_i - t) \times PE_x(t, T_i, r, \mu_x) \quad (3.4)$$

$$\mathcal{C}[WA_x(t, \infty, r, \mu_x)] = \sum_{T_i=t+1}^{\infty} (T_i - t)^2 \times PE_x(t, T_i, r, \mu_x) \quad (3.5)$$

The delta and gamma of $WA_x(t, \infty, r, \mu_x)$ with respect to the mortality factors $Y_1(t)$ and $Y_2(t)$ and the interest rate $r(t)$ are given by:

$$\Delta_{Y_1(t)}[WA_x(t, \infty, r, \mu_x)] = - \sum_{T_i=t+1}^{\infty} D_1(x, t, T_i) \times PE_x(t, T_i, r, \mu_x) \quad (3.6)$$

$$\Delta_{Y_2(t)}[WA_x(t, \infty, r, \mu_x)] = - \sum_{T_i=t+1}^{\infty} D_2(x, t, T_i) \times PE_x(t, T_i, r, \mu_x) \quad (3.7)$$

$$\Delta_{r(t)}[WA_x(t, \infty, r, \mu_x)] = - \sum_{T_i=t+1}^{\infty} D_r(t, T_i) \times PE_x(t, T_i, r, \mu_x) \quad (3.8)$$

$$\Gamma_{Y_1(t)}[WA_x(t, \infty, r, \mu_x)] = \sum_{T_i=t+1}^{\infty} (D_1(x, t, T_i))^2 \times PE_x(t, T_i, r, \mu_x) \quad (3.9)$$

$$\Gamma_{Y_2(t)}[WA_x(t, \infty, r, \mu_x)] = \sum_{T_i=t+1}^{\infty} (D_2(x, t, T_i))^2 \times PE_x(t, T_i, r, \mu_x) \quad (3.10)$$

$$\Gamma_{r(t)}[WA_x(t, \infty, r, \mu_x)] = \sum_{T_i=t+1}^{\infty} (D_r(t, T_i))^2 \times PE_x(t, T_i, r, \mu_x) \quad (3.11)$$

3.3 Fixed-income Securities: Coupon Bonds and Annuity Bonds

A fixed-income coupon bond with price $CB(t, T, T_m, r)$ consists of a sum of zero coupon bonds with prices $ZCB(t, T_i, r)$ and maturities from T to T_m . The time- t price is:

$$CB(t, T, T_m, r) = \mathbb{E}^Q \left[\sum_{T_i=T}^{T_m} A_{T_i} \times e^{-\int_t^{T_i} r(u) du} \right] \quad (3.12)$$

$$= \sum_{T_i=T}^{T_m} A_{T_i} \times e^{C_r(t, T_i) - D_r(t, T_i)r(t)} = \sum_{T_i=T}^{T_m} ZCB(t, T_i, r) \quad (3.13)$$

The Fisher-Weil dollar duration and convexity are:

$$\mathcal{D}[CB(t, T, T_m, r)] = \sum_{T_i=T}^{T_m} (T_i - t) \times ZCB(t, T_i, r) \quad (3.14)$$

$$\mathcal{C}[CB(t, T, T_m, r)] = \sum_{T_i=T}^{T_m} (T_i - t)^2 \times ZCB(t, T_i, r) \quad (3.15)$$

The delta and gamma for the risk factors are:

$$\Delta_{r(t)}[CB(t, T, T_m, r)] = - \sum_{T_i=T}^{T_m} D_r(t, T_i) \times ZCB(t, T_i, r) \quad (3.16)$$

$$\Delta_{Y_1(t)}[CB(t, T, T_m, r)] = \Delta_{Y_2(t)}[CB(t, T, T_m, r)] = 0 \quad (3.17)$$

$$\Gamma_{r(t)}[CB(t, T, T_m, r)] = \sum_{T_i=T}^{T_m} (D_r(t, T_i))^2 \times ZCB(t, T_i, r) \quad (3.18)$$

$$\Gamma_{Y_1(t)}[CB(t, T, T_m, r)] = \Gamma_{Y_2(t)}[CB(t, T, T_m, r)] = 0 \quad (3.19)$$

$$\mathcal{D}[CB(t, T, T_m, r)] = \sum_{T_i=T}^{T_m} (T_i - t) \times ZCB(t, T_i, r) \quad (3.20)$$

$$\mathcal{C}[CB(t, T, T_m, r)] = \sum_{T_i=T}^{T_m} (T_i - t)^2 \times ZCB(t, T_i, r) \quad (3.21)$$

For the annuity bond value, $AB(t, T, T_m, r)$, Fisher-Weil dollar duration, convexity, delta and gamma, the cash flow at time t , A_{T_i} , is adjusted. For coupon bonds the cash flows are the coupon payments before maturity and a coupon payment and the principal repayment at maturity. For the annuity bond, each cash flow is a level amount. The two types of bond have quite different cash flow profiles as well as duration and convexity.

3.4 Longevity-linked Securities: Longevity Bonds

For the longevity bonds, $LB_x(t, T, T_m, r, \mu_x)$ is used to denote the time- t value of a longevity bond consisting of a series of zero coupon longevity bonds with values $ZCLB_x(t, T_i, r, \nu_x)$

for maturities from T to T_m . The cash flows of the longevity bonds are linked to survival indices based on a reference cohort for the Australian population. To focus on longevity risk, we assume there is no basis risk and the annuity fund experience is the same as that of the Australian population. The time- t value of a longevity bond can be expressed as (Menoncin, 2008):

$$LB_x(t, T, T_m, r, \mu_x) = \mathbb{E}_t^Q \left[\sum_{T_i=T}^{T_m} n_t \times H_{T_i} \times e^{-\int_t^{T_i} (r(u) + \nu_x(u)) du} \right] \quad (3.22)$$

$$= \sum_{T_i=T}^{T_m} n_t \times H_{T_i} \times e^{C(x,t,T_i) - D_1(x,t,T_i)Y_1(t) - D_2(x,t,T_i)Y_2(t)} \times e^{C_r(t,T_i) - D_r(t,T_i)r(t)} \quad (3.23)$$

$$= \sum_{T_i=T}^{T_m} ZCLB_x(t, T_i, r, \mu_x) \quad (3.24)$$

where n_t is the number of survivors of the population at time- t and H_{T_i} is the coupon amount made at time- T_i for each survivor.

The dollar duration and convexity of $LB_x(t, T, T_m, r, \mu_x)$ are given by:

$$\mathcal{D}[LB_x(t, T, T_m, r, \mu_x)] = \sum_{T_i=T}^{T_m} (T_i - t) \times ZCLB_x(t, T_i, r, \mu_x) \quad (3.25)$$

$$\mathcal{C}[LB_x(t, T, T_m, r, \mu_x)] = \sum_{T_i=T}^{T_m} (T_i - t)^2 \times ZCLB_x(t, T_i, r, \mu_x) \quad (3.26)$$

The delta and gamma of $LB_x(t, T, T_m, r, \mu_x)$ with respect to the two mortality factors $Y_1(t)$ and $Y_2(t)$ and the interest rate $r(t)$ are given by:

$$\Delta_{Y_1(t)}[LB_x(t, T, T_m, r, \mu_x)] = - \sum_{T_i=T}^{T_m} D_1(x, t, T_i) \times ZCLB_x(t, T_i, r, \mu_x) \quad (3.27)$$

$$\Delta_{Y_2(t)}[LB_x(t, T, T_m, r, \mu_x)] = - \sum_{T_i=T}^{T_m} D_2(x, t, T_i) \times ZCLB_x(t, T_i, r, \mu_x) \quad (3.28)$$

$$\Delta_{r(t)}[LB_x(t, T, T_m, r, \mu_x)] = - \sum_{T_i=T}^{T_m} D_r(t, T_i) \times ZCLB_x(t, T_i, r, \mu_x) \quad (3.29)$$

$$\Gamma_{Y_1(t)}[LB_x(t, T, T_m, r, \mu_x)] = \sum_{T_i=T}^{T_m} (D_1(x, t, T_i))^2 \times ZCLB_x(t, T_i, r, \mu_x) \quad (3.30)$$

$$\Gamma_{Y_2(t)}[LB_x(t, T, T_m, r, \mu_x)] = \sum_{T_i=T}^{T_m} (D_2(x, t, T_i))^2 \times ZCLB_x(t, T_i, r, \mu_x) \quad (3.31)$$

$$\Gamma_{r(t)}[LB_x(t, T, T_m, r, \mu_x)] = \sum_{T_i=T}^{T_m} (D_r(t, T_i))^2 \times ZCLB_x(t, T_i, r, \mu_x) \quad (3.32)$$

4 Bond Markets - Coupon, Annuity and Longevity Bonds

The bonds used for selecting the immunization and hedging portfolios are based on coupon and annuity bonds available in the Australian market as well as hypothetical annuity and longevity bonds. We present the details on the bonds including coupon and other cash flow information, bond prices determined using the models in the paper, the modified Fisher-Weil duration and convexity, as well as the modified delta and gamma. The bonds considered have a wide range of maturities and cash flow structures including both coupon and annuity bonds. Frequency of cash flows payments includes annual, semi-annual, quarterly and monthly.

In practice coupon bonds are used to match or immunize the cash flows for life annuities. Initially only coupon bonds are considered using Fisher-Weil dollar durations and convexity and then delta-gamma hedging with our mortality and interest rate models. Since annuity bonds are also available, although of shorter terms, we then consider selecting bond portfolios from all of the annuity bonds with the inclusion of the hypothetical longer term annuity bonds.

Longevity bonds are not available and so we consider selecting the bond portfolio from hypothetical longevity bonds. These hypothetical bonds have a range of maturities. Finally we consider both coupon bonds and annuity bonds along with the longevity bonds.

Table 4.1 shows the details for the annuity liability of the portfolio. This is a whole-life annuity with monthly payments to males currently aged 65.

Tables 4.2 to 4.5 give details for all the fixed-income securities we consider in the analysis.

The Government coupon bonds are all products available in the market. They have semi-annual coupon frequency.

The coupon bonds based on the FIIG securities are hypothetical coupon paying bonds with quarterly frequency based on the maturity of these securities.

The Waratah annuity bonds are fixed rate annuity bonds with monthly payments available in the market.

The annuity bonds based on the FIIG securities are hypothetical annuity bonds with maturities corresponding to securities in this market and with quarterly annuity payments.

Tables 4.6 provides details of the hypothetical longevity bonds considered. We use maturities ranging from 5 to 50 years for these bonds. The values are based on the expected survival probabilities from the stochastic mortality model. We assume the longevity bond will be issued to a cohort of males currently age 65. The initial population is 100 and the coupon amount for all the longevity bonds are \$1. The frequency of payment is assumed to be annual with the longevity index updated on a yearly basis.

4.1 Life Annuity

Code	Maturity	TTM	Freq	Price	$\tilde{\Delta}_{Y_1(t)}$	$\tilde{\Delta}_{Y_2(t)}$	$\tilde{\Delta}_{r(t)}$	$\tilde{\Gamma}_{Y_1(t)}$	$\tilde{\Gamma}_{Y_2(t)}$	$\tilde{\Gamma}_{r(t)}$	$\tilde{\mathcal{D}}$	$\tilde{\mathcal{C}}$
IA-WL	∞	∞	12	127.67	-7.79	-5.08E+03	-2.27	98.20	7.85E+07	5.78	8.12	109.23

Table 4.1: These are details of the life annuity with monthly payments. The deltas with respect to the mortality risk factors are negative. Increases in these factors produce lower survival probabilities used for the discount factors and hence lower annuity values. The interest rate delta is also negative. Increases in the short rate produce lower zero coupon bond prices and hence lower annuity values. For a 65 year old the Fisher-Weil duration is 8.12 years. Interest rate sensitivity for the stochastic interest rate model is lower than the Fisher-Weil duration. The delta for the mortality risk factor $Y_1(t)$ is of a similar magnitude as the duration, with opposite sign. $Y_1(t)$ reflects the level of mortality, whereas $Y_2(t)$ captures the impact of age.

4.2 List of Government Coupon Bonds

Code	Sector	Coupon	Maturity	TTM	FV	Freq	Price	$\tilde{\Delta}_{r(t)}$	$\tilde{\Gamma}_{r(t)}$	$\tilde{\mathcal{D}}$	$\tilde{\mathcal{C}}$
GSBS-CB-14	Government	4.50 %	21/10/2014	0.31	100	2	101.39	-0.29	0.09	0.31	0.10
GSBS-CB-15	Government	4.75 %	21/10/2015	1.31	100	2	102.65	-1.03	1.08	1.28	1.65
GSBM-CB-17	Government	4.25 %	21/07/2017	3.06	100	2	102.05	-1.79	3.35	2.85	8.53
GSBA-CB-18	Government	5.50 %	21/01/2018	3.56	100	2	106.13	-1.90	3.83	3.21	11.10
GSBS-CB-18	Government	3.25 %	21/10/2018	4.31	100	2	95.33	-2.15	4.77	4.02	16.93
GSBG-CB-23	Government	5.50 %	21/04/2023	8.81	100	2	101.44	-2.47	6.49	6.99	56.56
GSBG-CB-24	Government	2.75 %	21/04/2024	9.82	100	2	79.06	-2.62	7.16	8.39	77.99
GSBG-CB-25	Government	3.25 %	21/04/2025	10.82	100	2	80.99	-2.60	7.13	8.85	89.19
GSBG-CB-26	Government	4.25 %	21/04/2026	11.82	100	2	88.01	-2.56	6.97	9.04	96.85
GSBG-CB-27	Government	4.75 %	21/04/2027	12.82	100	2	91.41	-2.54	6.91	9.35	106.67
GSBG-CB-29	Government	3.25 %	21/04/2029	14.82	100	2	74.11	-2.61	7.22	11.04	147.40
GSBG-CB-33	Government	4.50 %	21/04/2033	18.82	100	2	83.37	-2.55	6.94	11.82	186.06
GSBG-CB-15	Government	6.25 %	15/04/2015	0.79	100	2	103.77	-0.68	0.47	0.78	0.61
GSBK-CB-16	Government	4.75 %	15/06/2016	1.96	100	2	102.13	-1.39	1.97	1.89	3.66
GSBC-CB-17	Government	6.00 %	15/02/2017	2.63	100	2	107.13	-1.63	2.77	2.43	6.23
GSBE-CB-19	Government	5.25 %	15/03/2019	4.71	100	2	103.81	-2.15	4.88	4.17	18.85
GSBG-CB-20	Government	4.50 %	15/04/2020	5.80	100	2	98.56	-2.33	5.68	5.10	28.25
GSBI-CB-21	Government	5.75 %	15/05/2021	6.88	100	2	104.08	-2.38	6.01	5.74	36.91
GSBM-CB-22	Government	5.75 %	15/07/2022	8.05	100	2	105.28	-2.40	6.22	6.38	47.39

Table 4.2: These are semi-annual coupon paying bonds available in the bond market. Codes used are those for the ASX. Maturities range up to 18.8 years and Fisher-Weil durations range up to 11.82 years with the longest duration exceeding that of the life annuity. The interest rate deltas range up to 2.62 and are all similar for bonds maturing longer than 4 years. Fisher-Weil convexity varies much more than interest rate gamma across the maturity range of the bonds.

4.3 List of Coupon Bonds based on securities offered on FIIG

Code	Sector	Coupon	Maturity	TTM	FV	Freq	Price	$\tilde{\Delta}_{r(t)}$	$\tilde{\Gamma}_{r(t)}$	\tilde{D}	\tilde{C}
ACG-CB-15	Government	4.00 %	20/08/2015	1.14	100	4	101.26	-0.93	0.87	1.12	1.26
ACG-CB-20	Government	4.00 %	20/08/2020	6.15	100	4	95.06	-2.38	5.91	5.42	31.87
ACG-CB-22	Government	1.25 %	21/02/2022	7.65	100	4	74.54	-2.63	7.08	7.21	54.15
ACG-CB-25	Government	3.00 %	20/09/2025	11.23	100	4	77.73	-2.63	7.23	9.22	96.65
ACG-CB-30	Government	2.50 %	20/09/2030	16.24	100	4	63.77	-2.65	7.40	12.31	181.46
SAFA-CB-15	Semi-govern	4.00 %	20/08/2015	1.14	100	4	101.26	-0.93	0.87	1.12	1.26
TCV-CB-20	Semi-govern	4.00 %	15/08/2020	6.13	100	4	95.13	-2.37	5.90	5.40	31.72
ACT-CB-30	Semi-govern	3.50 %	17/06/2030	15.98	100	4	74.83	-2.60	7.16	11.41	161.28
QTC-CB-30	Semi-govern	2.75 %	20/08/2030	16.15	100	4	66.80	-2.63	7.31	12.01	174.92
NSWTC-CB-20	Semi-govern	3.75 %	20/11/2020	6.40	100	4	93.20	-2.41	6.07	5.65	34.59
NSWTC-CB-25	Semi-govern	2.75 %	20/11/2025	11.40	100	4	75.47	-2.63	7.28	9.41	100.52
NSWTC-CB-35	Semi-govern	2.50 %	20/11/2035	21.41	100	4	56.85	-2.61	7.25	14.30	265.62
ELECTRANET-CB-15	Infrastructure	5.21 %	20/08/2015	1.14	100	4	102.74	-0.92	0.86	1.11	1.25
LANECOVE-CB-20	Infrastructure	4.50 %	9/09/2020	6.20	100	4	97.46	-2.37	5.88	5.40	31.89
SYDAIR-CB-20	Infrastructure	3.76 %	20/11/2020	6.40	100	4	93.25	-2.41	6.07	5.64	34.58
SYDAIR-CB-30	Infrastructure	3.12 %	20/11/2030	16.40	100	4	70.42	-2.61	7.21	11.82	172.67
RABO-CB-20	ADI-IB	1.51 %	28/08/2020	6.17	100	4	81.37	-2.50	6.36	5.85	35.42
CBA-CB-20	ADI-Major Bank	3.60 %	20/11/2020	6.40	100	4	92.35	-2.41	6.09	5.67	34.79
ALE-CB-23	Other Financials	3.40 %	20/11/2023	9.40	100	4	84.89	-2.57	6.94	7.86	69.45
ENVESTRA-CB-25	Energy	3.04 %	20/08/2025	11.15	100	4	78.49	-2.61	7.19	9.12	94.87

Table 4.3: These are hypothetical coupon paying bonds with coupons and maturities corresponding to index linked bonds available on the FIIG web site. We do not include inflation in the analysis so we have used these as hypothetical coupon paying bonds with quarterly frequency. These hypothetical bonds have longer duration compared to the Government Coupon bonds. They also have quarterly coupon cash flows.

4.4 List of Waratah Annuity Bonds offered by the NSW Government

Code	Sector	Annuity Payment	Maturity	TTM	Freq	No. of Payment	Price	$\tilde{\Delta}_{r(t)}$	$\tilde{\Gamma}_{r(t)}$	\tilde{D}	\tilde{C}
NSWWAB1-AB-21	Semi-govern	1.00	15/10/2021	7.30	12	111	74.60	-1.79	3.77	3.43	16.17
NSWWAB2-AB-21	Semi-govern	1.00	15/10/2021	7.30	12	108	74.60	-1.79	3.77	3.43	16.17
NSWWAB3-AB-22	Semi-govern	1.00	15/01/2022	7.55	12	108	76.62	-1.81	3.86	3.54	17.22
NSWWAB4-AB-22	Semi-govern	1.00	15/04/2022	7.80	12	108	78.60	-1.83	3.95	3.64	18.28
NSWWAB5-AB-22	Semi-govern	1.00	15/07/2022	8.05	12	108	80.56	-1.86	4.04	3.75	19.38
NSWWAB6-AB-22	Semi-govern	1.00	15/10/2022	8.30	12	108	82.48	-1.88	4.13	3.85	20.50
NSWWAB7-AB-23	Semi-govern	1.00	15/01/2023	8.55	12	108	84.36	-1.90	4.21	3.95	21.64
NSWWAB8-AB-23	Semi-govern	1.00	15/04/2023	8.80	12	108	86.22	-1.92	4.29	4.06	22.81
NSWWAB9-AB-23	Semi-govern	1.00	15/07/2023	9.05	12	108	87.05	-1.96	4.41	4.20	24.28
NSWWAB10-AB-23	Semi-govern	1.00	15/07/2023	9.05	12	105	84.06	-2.02	4.57	4.35	25.14

Table 4.4: These are annuity bonds with monthly payments. Terms to maturity are relatively short compared to the coupon paying bonds with a maximum of around 9 years. Fisher-Weil durations are between 3 and 5 years. Interest rate deltas do not vary much. Similar comments apply to interest rate gamma and Fisher-Weil convexity. Since the life annuity is assumed to have monthly payments these annuity bonds have the potential to better match the cash flows for the liability but suffer from having short maturities.

4.5 List of Hypothetical Annuity Bonds based on securities offered on FIIG

Code	Sector	Annuity Payment	Maturity	TTM	Freq	No. of Payment	Price	$\tilde{\Delta}_{r(t)}$	$\tilde{\Gamma}_{r(t)}$	$\tilde{\mathcal{D}}$	$\tilde{\mathcal{C}}$
MPC-AB-25	Infrastructure	1.00	31/12/2025	11.51	4	46	34.49	-2.11	5.05	5.23	37.95
MPC-AB-33	Infrastructure	1.00	31/12/2033	19.52	4	78	46.99	-2.33	5.99	7.90	91.30
CIVICNEXUS-AB-32	Infrastructure	1.00	15/09/2032	18.22	4	73	45.57	-2.30	5.87	7.48	81.61
PHF-AB-29	Other Financials	1.00	15/09/2029	15.22	4	61	41.31	-2.23	5.58	6.52	60.83
PJS-AB-30	Other Financials	1.00	15/06/2030	15.97	4	64	42.46	-2.25	5.67	6.77	65.88
Novacare-AB-33	Other Financials	1.00	15/04/2033	18.81	4	76	46.97	-2.28	5.83	7.55	84.60
Praeco-AB-20	Other Corporate	1.00	15/08/2020	6.13	4	25	21.82	-1.66	3.31	2.96	11.98
Boral-AB-20	Other Corporate	1.00	16/11/2020	6.39	4	26	22.54	-1.70	3.43	3.07	12.92
WYUNA-AB-22	Other Corporate	1.00	30/03/2022	7.75	4	31	12.58	-1.84	3.95	3.61	17.69
JEM(CCV)-AB-22	Other Corporate	1.00	15/06/2022	7.96	4	32	26.52	-1.88	4.09	3.79	19.62
JEM-AB-35	Other Corporate	1.00	28/06/2035	21.01	4	84	48.67	-2.35	6.08	8.32	102.30
JEM(NSWSch)-AB-31	Other Corporate	1.00	28/02/2031	16.68	4	67	43.66	-2.26	5.72	6.98	70.48
JEM(NSWSch)-AB-35	Other Corporate	1.00	28/11/2035	21.43	4	86	49.44	-2.34	6.06	8.38	104.73
ANU-AB-29	Other Corporate	1.00	7/10/2029	15.28	4	62	42.16	-2.20	5.49	6.43	60.14

Table 4.5: These are hypothetical annuity bonds with maturities corresponding to index linked bonds available on FIIG. We do not include inflation in the analysis so we have used these as hypothetical annuity bonds with quarterly frequency. Terms to maturity are longer than for the Waratah annuity bonds. We do not adjust pricing for credit risk.

4.6 List of Assumed Longevity Bonds

Code	Maturity	TTM	Freq	Price	$\tilde{\Delta}_{Y_1(t)}$	$\tilde{\Delta}_{Y_2(t)}$	$\tilde{\Delta}_{r(t)}$	$\tilde{\Gamma}_{Y_1(t)}$	$\tilde{\Gamma}_{Y_2(t)}$	$\tilde{\Gamma}_{r(t)}$	$\tilde{\mathcal{D}}$	$\tilde{\mathcal{C}}$
LB65-19	30/06/2019	5	1	420.94	-2.83	-1.00E+03	-1.71	9.92	1.31E+06	3.23	2.86	10.17
LB65-24	30/06/2024	10	1	699.86	-4.74	-1.96E+03	-2.11	29.81	5.66E+06	4.89	4.83	31.23
LB65-29	30/06/2029	15	1	866.81	-6.19	-2.94E+03	-2.26	53.41	1.45E+07	5.58	6.36	57.03
LB65-34	30/06/2034	20	1	956.71	-7.18	-3.86E+03	-2.33	74.98	2.88E+07	5.87	7.43	81.38
LB65-39	30/06/2039	25	1	998.30	-7.77	-4.59E+03	-2.35	90.50	4.70E+07	5.98	8.07	99.45
LB65-44	30/06/2044	30	1	1,013.60	-8.03	-5.05E+03	-2.36	98.84	6.47E+07	6.03	8.36	109.46
LB65-49	30/06/2049	35	1	1,017.70	-8.12	-5.24E+03	-2.36	101.87	7.64E+07	6.04	8.46	113.21
LB65-54	30/06/2054	40	1	1,018.40	-8.13	-5.30E+03	-2.36	102.52	8.10E+07	6.04	8.48	114.03
LB65-59	30/06/2059	45	1	1,018.40	-8.13	-5.30E+03	-2.36	102.58	8.19E+07	6.04	8.48	114.11
LB65-64	30/06/2064	50	1	1,018.40	-8.13	-5.30E+03	-2.36	102.59	8.20E+07	6.04	8.48	114.12

Table 4.6: These longevity bonds are hypothetical bonds with maturities at 5 year intervals up to a maximum of 50 years. They are based on a cohort aged 65 at issue. Fisher-Weil durations at the longer maturities do not vary much with a maximum of 8.48 years. The interest rate deltas also show very little variation with maturity. The deltas for $Y_1(t)$ in the mortality model are of a similar magnitude to the Fisher-Weil durations. The gammas for $Y_1(t)$ are of a similar magnitude to the convexity. The deltas for the $Y_2(t)$ are larger and reflect the impact of age.

5 Duration-Convexity Immunization

Bonds are selected to immunize the liability using a linear program, including both fixed-income and longevity linked securities. We follow Panjer et al. (1997) and take into account the mean-absolute deviation of the net cash flows. The approach matches the Fisher-Weil dollar durations and minimizes portfolio risk arising from convexity. The linear program is as follows:

$$C[a] = \max_{w_k, w_j} \left\{ \sum_k w_k \cdot C[a_k] + \sum_j w_j \cdot C[a_j] \right\} \quad (5.1)$$

subject to

$$\sum_{t>0} n_t(t-h)^+ \leq 0, \text{ for all positive } h \quad (5.2)$$

$$n_t = \sum_k w_k \cdot A_{k,t} \cdot B(0, t) + \sum_j w_j \cdot A_{j,t} \cdot S_x(0, t)B(0, t) - L_t \cdot S_x(0, t)B(0, t) \quad (5.3)$$

$$S_0 = \sum_{t \geq 1} n_t = 0 \quad (5.4)$$

$$D[S_0] = \sum_k w_k \cdot D[a_k] + \sum_j w_j \cdot D[a_j] - D[l] = 0 \quad (5.5)$$

Equation (5.1) is the objective for selecting the portfolio in fixed-income and longevity bonds. In this case we maximize the convexity of the asset portfolio. This is because the mean-absolute deviation constraint in Equation (5.2) is only met for negative values. There were no feasible solutions for the portfolios when the convexity constraint was minimized with Equation (5.2) as a non negative constraint. The details of this approach are found in Panjer et al. (1997). Equation (5.3) defines the value of the net cash flows and Equation (5.4) gives the surplus. Equation (5.5) requires a match of the Fisher-Weil dollar durations of the assets and liability.

All allocations are determined as proportions of the liability value with

$$W_k = \frac{w_k \cdot \sum_{t>0} A_{k,t} \cdot B(0, t)}{\sum_j w_k \cdot \sum_{t>0} A_{k,t} \cdot B(0, t)} \quad (5.6)$$

$$W_j = \frac{w_j \cdot \sum_{t>0} A_{j,t} \cdot S_x(0, t)B(0, t)}{\sum_j w_j \cdot \sum_{t>0} A_{j,t} \cdot S_x(0, t)B(0, t)} \quad (5.7)$$

$$\sum_k W_k + \sum_j W_j = 1 \quad (5.8)$$

Equations (5.6) and (5.7) express the units of fixed-income assets (w_k) and longevity bond assets (w_j) as a proportion of the total asset fund (W_k and W_j). The proportions invested in all assets sum to 1 so that premiums are fully invested in assets.

5.1 Immunization Portfolio Results

Table 5.1 gives details of the bonds selected for the immunized portfolios. For coupon only bonds the portfolio selected includes a range of maturities in order to ensure the mean-absolute deviation constraint is met. This provides a closer match of the coupon bond cash flows to the expected life annuity cash flows. The bonds include both semi-annual and quarterly coupon bonds. There is 24% of the portfolio in the longest maturity bond, NSWTC-CB-35.

The annuity bonds required to immunize the life annuity are fewer than for the coupon bonds. None of the Waratah Annuity bonds are included since they are not of sufficiently long maturity to allow matching the life annuity duration or convexity. The immunized portfolio of annuity bonds has 94% in the hypothetical annuity bond with duration 8.38 and convexity 104.73, 1% in the hypothetical annuity bond with duration 8.32 and convexity 102.30 along with 5% in the hypothetical annuity bond with duration 2.96 and convexity 11.98. The portfolio includes the two longest maturity annuity bonds with maturities of approximately 21 years.

For the longevity bonds, 86% is invested in a 45 year bond with duration 8.48 and convexity 114.11, 8% in a 50 year bond with similar duration and convexity along with 6% in a 5 year bond with duration 2.86 and convexity 10.17. The portfolio includes both the shortest and the longest maturity longevity bonds. This reflects the objective of minimizing risk by matching the duration of the bond portfolio with the liability but also by including the impact of convexity.

Including both coupon bonds and longevity bonds or annuity bonds and longevity bonds produces little change in the portfolio selected compared with the longevity bond portfolio. Longevity bonds are the ideal form of bond to immunize the life annuity liability expected cash flows. If these are available in the market then other more traditional bonds are not required for immunization.

Since the driving factors in selecting bonds using immunization are the Fisher-Weil dollar duration and convexity, along with the mean-absolute deviation constraint, longevity bonds are shown to be very effective in immunizing a life annuity portfolio. It is interesting to consider why these bonds are not available in the market. One factor is the limited market for life annuities in most countries, including Australia. Also the availability of reinsurance and the use of natural hedging of longevity risk with life insurance business means that these forms of risk management dominate. We expect that as the life annuity market grows and as pension funds increasingly look to investment markets to manage longevity risk, longevity bonds will be issued.

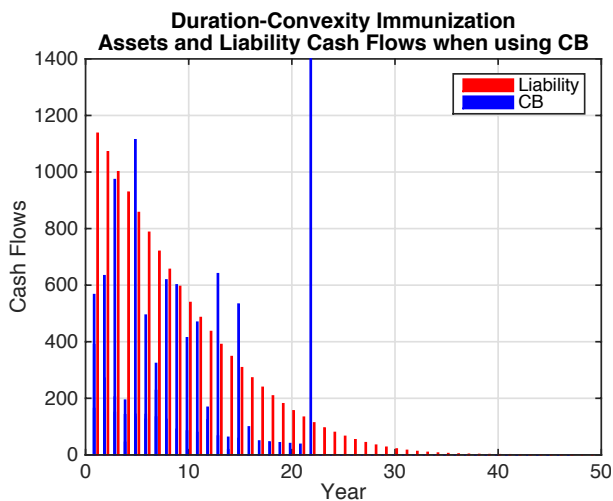
Table 5.1: Bond Portfolios to Immunize a Life Annuity Issued to 65 year olds

Bond	Weight	Bond	Weight
<i>Only Coupon Bonds</i>			
GSBS-CB-14	0.03	GSBK-CB-16	0.01
GSBS-CB-15	0.04	GSBC-CB-17	0.08
GSBS-CB-18	0.09	GSBE-CB-19	0.01
GSBG-CB-23	0.06	GSBG-CB-20	0.05
GSBG-CB-24	0.04	GSBI-CB-21	0.03
GSBG-CB-25	0.05	ACG-CB-22	0.05
GSBG-CB-26	0.01	ACT-CB-30	0.01
GSBG-CB-27	0.09	NSWTC-CB-25	0.01
GSBG-CB-29	0.07	NSWTC-CB-35	0.24
GSBG-CB-15	0.02	SYDAIR-CB-20	0.02
<i>Only Annuity Bonds</i>			
Praeco-AB-20	0.05	JEM(NSWSch)-AB-35	0.94
JEM-AB-35	0.01	-	-
<i>Only Longevity Bonds</i>			
LB65-19	0.06	LB65-64	0.08
LB65-59	0.86	-	-
<i>Coupon Bonds and Longevity Bonds</i>			
GSBS-CB-14	0.04	LB65-64	0.08
LB65-59	0.87	-	-
<i>Annuity Bonds and Longevity Bonds</i>			
LB65-19	0.06	LB65-64	0.08
LB65-59	0.86	-	-

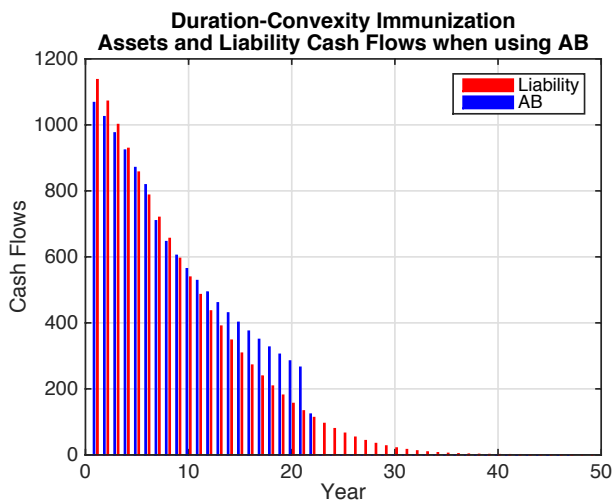
Figure 5.1 shows the cash flows for the immunized bond portfolios along with the expected liability cash flow. The annuity bonds provide a closer cash flow match than for the coupon bonds. Between years 10 and 20 the cash flows on the annuity bonds exceed the expected liability payments allowing a build up in surplus which is then used to meet the longer term liability cash flows that exceed the term of the longest annuity bonds. The longevity bond portfolio provides an even better cash flow match.

From a visual inspection of the figures, annuity bonds provide a good match but are limited by the term of the longest annuity bond available, which is a hypothetical annuity bond. Longevity bonds provide what appears to be a very effective cash flow match.

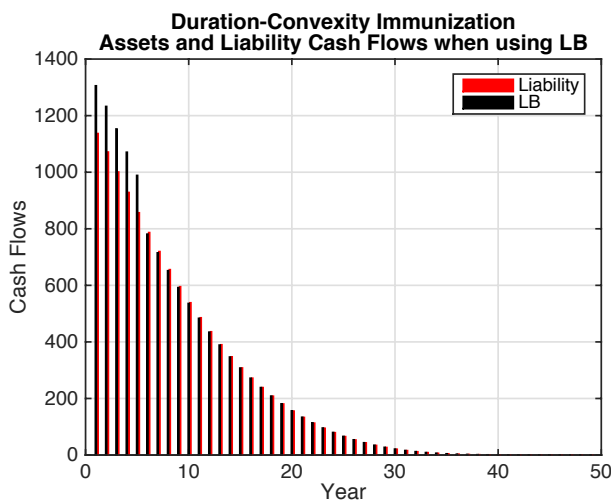
Figure 5.1: Asset and Liability Cash Flows - Immunization



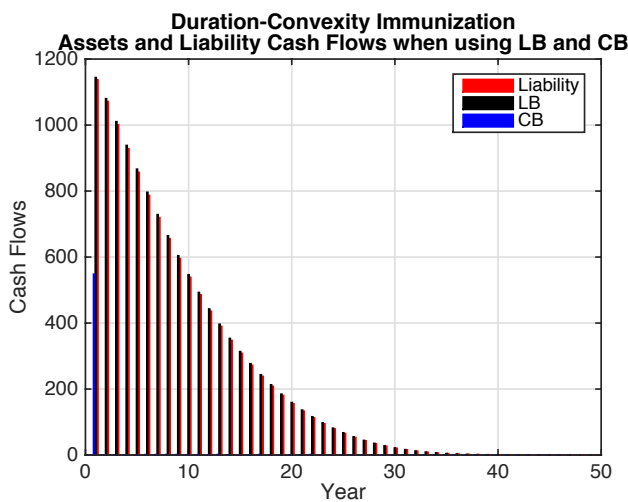
(a) Only Coupon Bonds



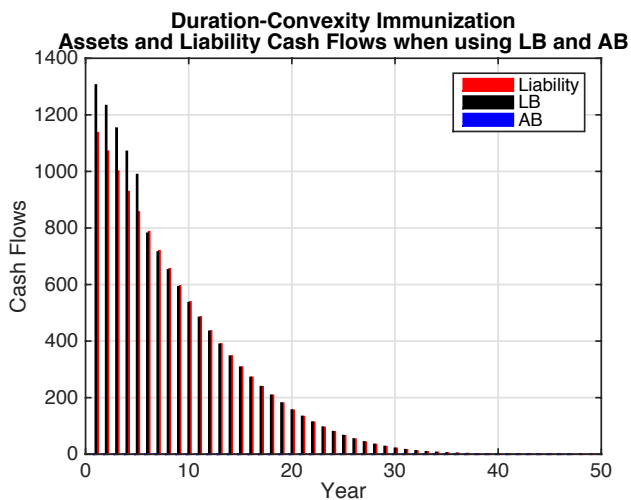
(b) Only Annuity Bonds



(c) Only Longevity Bonds



(d) Coupon Bonds and Longevity Bonds



(e) Coupon Bonds and Longevity Bonds

6 Delta-gamma Hedging

Immunitization using Fisher-Weil dollar duration and convexity considers expected cash flows and average time to receipt of cash flows incorporating mortality into the discount factor used for valuation. This approach does not allow for interest rate and mortality rate risks to be separately hedged. Delta-gamma hedging allows explicit recognition of the impact of both interest rate and mortality risks. We use a linear programming approach with delta and gamma risk factors in order to select bond portfolios that have the same deltas for interest rate and mortality risk as the liability. At the same time we minimize the gamma of the asset portfolio in order to minimize both interest rate and mortality risk. The linear program used is as follows:

$$\Gamma[a] = \min_{w_k, w_j} K \times \left[\sum_k w_k \cdot \left\{ \sigma_r^2 \cdot \Gamma_{r(t)}[a_k] \right\} + \sum_j w_j \cdot \left\{ \sigma_r^2 \cdot \Gamma_{r(t)}[a_j] + \sigma_1^2 \cdot \Gamma_{Y_1(t)}[a_j] + \sigma_2^2 \cdot \Gamma_{Y_2(t)}[a_j] \right\} \right] \quad (6.1)$$

subject to

$$n_t = \sum_k w_k \cdot A_{k,t} \cdot B(0, t) + \sum_j w_j \cdot A_{j,t} \cdot S_x(0, t)B(0, t) - L_t \cdot S_x(0, t)B(0, t) \quad (6.2)$$

$$S_0 = \sum_{t \geq 1} n_t = 0 \quad (6.3)$$

$$\Delta_{r(t)}[S_0] = \sum_k w_k \cdot \Delta_{r(t)}[a_k] + \sum_j w_j \cdot \Delta_{r(t)}[a_j] - \Delta_{r(t)}[l] = 0 \quad (6.4)$$

$$\Delta_{Y_1(t)}[S_0] = \sum_j w_j \cdot \Delta_{Y_1(t)}[a_j] - \Delta_{Y_1(t)}[l] = 0 \quad (6.5)$$

$$\Delta_{Y_2(t)}[S_0] = \sum_j w_j \cdot \Delta_{Y_2(t)}[a_j] - \Delta_{Y_2(t)}[l] = 0 \quad (6.6)$$

The bond portfolio is selected to minimise portfolio gamma in Equation (6.1). The objective used is the sum of the gamma values for each factor multiplied by the factor variances. Since the impact of gamma on the value of the portfolio is multiplied by the factor variance, we weight by the variance. This also gives more weight to the more volatile risk factors. We multiply the objective by $K = 10^5$ to reduce numerical problems with minimising the objective since it can take small values when multiplied by the variances. The first summation term is for the fixed-income securities and the second summation term is for the longevity bonds, where both interest rate and mortality risk are included.

Equations (6.2) and (6.3) ensure the matching of the values of the assets and the liability. Equations (6.4) to (6.6) match the deltas of the assets and liabilities. The linear program is formulated in terms of w_k and w_j along with the dollar values of the deltas and gammas. Thus the solution for the w_k and w_j are in terms of units of the bonds based on the price

of the bond. This is converted into a percentage of the liability so that the asset portfolio in terms of the proportion of the liability becomes

$$W_k = \frac{w_k \cdot \sum_{t>0} A_{k,t} \cdot B(0, t)}{\sum_k w_k \cdot \sum_{t>0} A_{k,t} \cdot B(0, t)} \quad (6.7)$$

$$W_j = \frac{w_j \cdot \sum_{t>0} A_{j,t} \cdot S_x(0, t) B(0, t)}{\sum_j w_j \cdot \sum_{t>0} A_{j,t} \cdot S_x(0, t) B(0, t)} \quad (6.8)$$

$$\sum_k W_k + \sum_j W_j = 1 \quad (6.9)$$

Equations (6.7) and (6.8) express the units of fixed-income assets (w_k) and longevity bond assets (w_j) as a proportion of the total asset fund (W_k and W_j). The proportions invested in all assets are required to sum to 1 so that premiums are fully invested in assets.

6.1 Hedge Portfolio Results

Table 6.1 shows the delta-gamma hedging portfolios of bonds for the different groups of bonds. The interest rate delta of the liability is -2.27 and the interest rate gamma is 5.78. The delta for the first risk factor of mortality, $Y_1(t)$, is -7.79 and the gamma for this factor is 98.20.

Bond	Weight	Bond	Weight
<i>Only Coupon Bonds</i>			
GSBS-CB-18	0.65	RABO-CB-20	0.35
<i>Only Annuity Bonds</i>			
NSWWAB10-AB-23	0.24	JEM-AB-35	0.76
<i>Only Longevity Bonds</i>			
LB65-19	0.22	LB65-34	-1.34
LB65-24	-0.12	LB65-39	2.23
<i>Coupon Bonds and Longevity Bonds</i>			
GSBG-CB-15	0.02	LB65-34	-1.44
LB65-19	0.13	LB65-39	2.28
<i>Annuity Bonds and Longevity Bonds</i>			
LB65-19	0.22	LB65-34	-1.34
LB65-24	-0.12	LB65-39	2.23

Table 6.1: Bond Portfolios to Delta-Gamma Hedge a Life Annuity Issued to 65 year olds

For coupon bonds the portfolio selected has 65% in a bond with interest rate delta of -2.15, and interest rate gamma of 4.77, along with 35% in a bond with interest rate delta of -2.50 and interest rate gamma of 6.36. Only two bonds are required for the hedging

with only one risk factor to hedge. The hedging is based on the dollar sensitivities so that the relative prices of the bonds and the liability are taken into account in the portfolio.

For the annuity bonds the portfolio selected has 24% in the Waratah annuity bond with monthly cash flows, an interest rate delta of -2.02 and an interest rate gamma of 4.57, along with 76% in the hypothetical annuity bond with quarterly cash flows, a maturity of 21 years, interest rate delta -2.35 and interest rate gamma of 6.08. These are the longest maturity annuity bonds for each of these bond types.

When considering only the longevity bonds, the portfolio requires a short position of 12% of the liability value in the 10 year maturity bond, a short position of 134% in the 20 year longevity bond and long positions in the 5 and 25 year bonds of 22% and 223% respectively. The portfolio requires short selling of longevity bonds to match the liability. This portfolio includes a combination of a short position in the 20 year longevity bond along with a long position in the 25 year longevity bond. This is equivalent to a position in a 20 year deferred, 5 year maturity longevity bond. The selected portfolio has an interest rate delta of -2.27 and an interest rate gamma 5.65. The portfolio delta for the mortality risk factor $Y_1(t)$ is -7.79 and the portfolio gamma for this risk factor is 100.35.

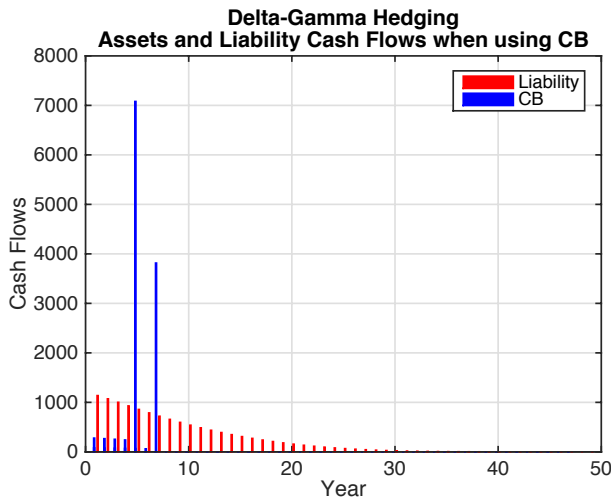
When both coupon bonds and annuity bonds are added to the longevity bonds in the portfolio, there is little difference from the case with only longevity bonds. The portfolio consists of a small component of coupon bonds but no additional annuity bonds are included.

Figure 6.1 shows the cash flows for the bond portfolios selected with delta-gamma hedging allowing for both mortality and interest rate risk. The coupon bonds have shorter maturities than for the Fisher-Weil duration-convexity immunization portfolio. This reflects the lower sensitivities to maturity for the interest rate deltas for the interest rate risk model.

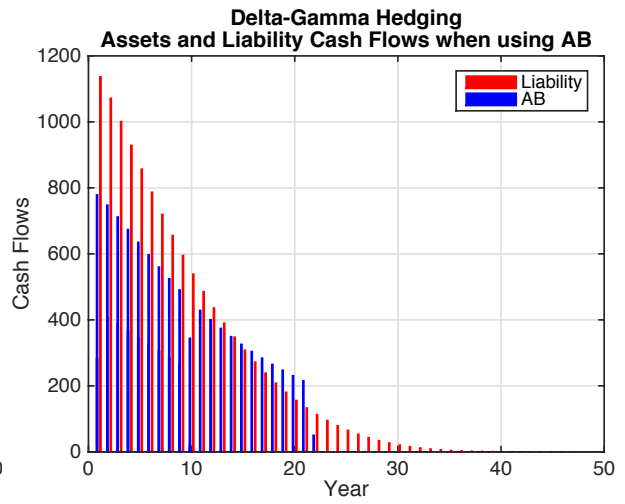
The liability cash flows are not well matched by the coupon bonds. The annuity bonds provide an improved cash flow match over coupon bonds in a similar way as in the Fisher-Weil duration-convexity immunization. However the liability cash flows exceed the annuity bond cash flows early on and the reverse is the case after the longest maturity annuity bond matures. Including the longevity bonds improves the cash flow match to the liability compared to the coupon and annuity bond cases.

The figures show a similar situation to the immunization case. In general the cash flow match is not as good for the delta-gamma hedge. The delta and gamma values are quite different from the duration and convexity risk measures used in immunization. The result is that for the coupon bonds, the duration of the delta-gamma hedge portfolio is much lower than for the immunization portfolio. However for the longevity bonds, the duration and convexity are much closer to those of the immunization portfolio.

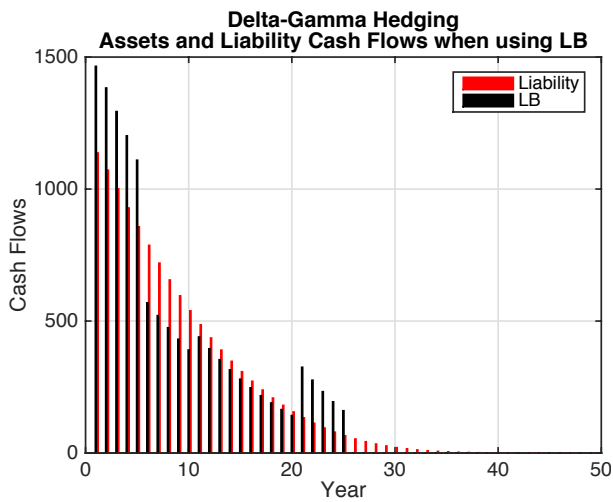
Figure 6.1: Asset and Liability Cash Flows - Hedging



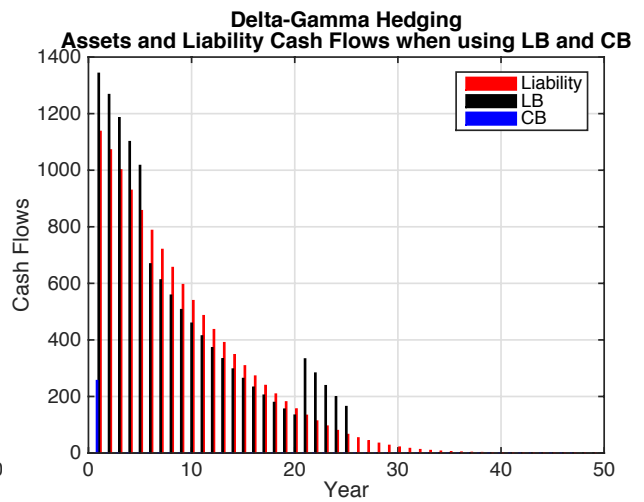
(a) Only Coupon Bonds



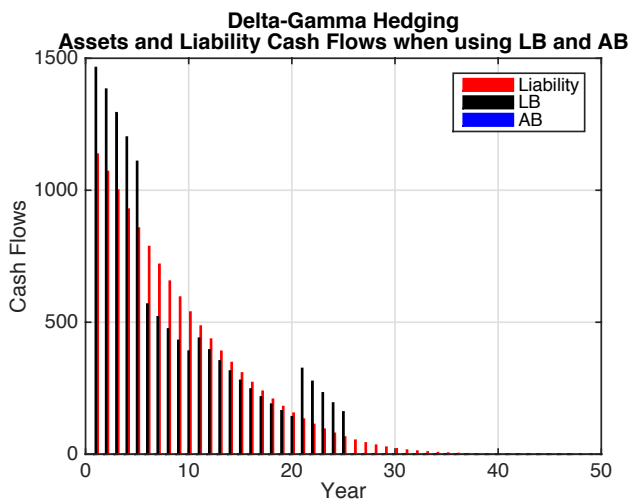
(b) Only Annuity Bonds



(c) Only Longevity Bonds



(d) Coupon Bonds and Longevity Bonds



(e) Coupon Bonds and Longevity Bonds

7 Stochastic Assessment of Liability Hedging

Using both traditional immunization and delta-gamma hedging produces differences in the selected bond portfolios. The cash flow match varies depending on which bonds are included in the selected portfolios. In order to assess the differences between the different approaches and resulting portfolios, we use the stochastic interest rate and mortality models to simulate the distribution of the surplus at future time points. This distribution provides a more realistic assessment of the immunization and hedging effectiveness of the different bond portfolios. To do this we generate the surplus at future horizons of 1, 10 and 50 years, the terminal date for the annuity portfolio, to assess the short, medium and long term hedging performance.

7.1 Surplus Analysis

Immunization and hedging strategies require re-balancing of the bond portfolio through time. We allow for this to some extent by assuming reinvestment of cash flows in zero coupon bonds maturing on the horizon date used for the surplus. This reduces the reinvestment risk arising from future interest rates. Figure 7.1 illustrates the process used to determine the distribution of the surplus for the time horizon of 10 years. Similar calculations are used for the surplus at $t = 1$ and 50.

Cash flows prior to the time horizon are accumulated assuming reinvestment in zero-coupon bonds maturing at time 10. All future cash flows occurring after the time horizon are revalued at time 10 using the simulated interest and mortality model values at time 10.

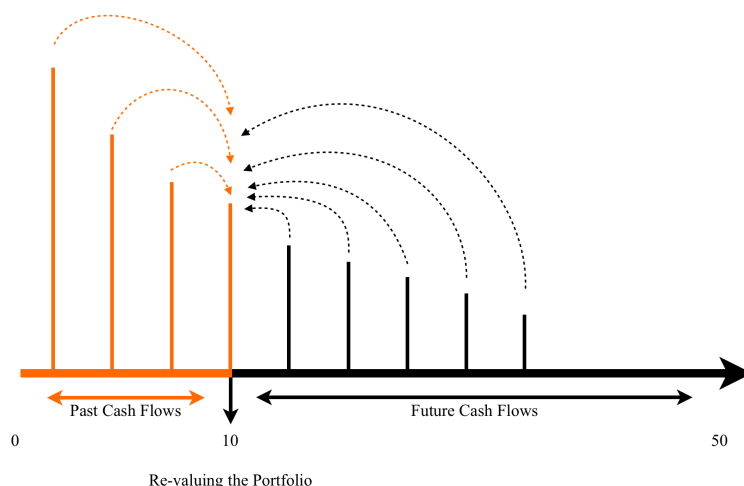


Figure 7.1: Illustration of Simulation for the Portfolio Surplus

The portfolio surplus at time 10 is determined as the value of the assets minus the value

of the liabilities:

$$S_{10} = \sum_k w_k V_{10}[a_k] + \sum_j w_j V_{10}[a_j] - V_{10}[l] \quad (7.1)$$

where w_k and w_j are the number of units of fixed-income and longevity-linked bonds respectively. The portfolio surplus is thus the sum of the net accumulated cash flows and the net expected value of the future cash flows at time 10.

These values for the fixed-income assets (k), longevity-linked assets (j), and annuity liability at time 10 are determined using:

$$V_{10}[a_k] = \sum_{t \geq 1}^{10} \frac{A_{k,t}}{B(t, 10)} + \sum_{t > 10}^{\infty} A_{k,t} \times B(10, t) \quad (7.2)$$

$$V_{10}[a_j] = \sum_{t \geq 1}^{10} \frac{A_{j,t} \times \mathring{S}_x(0, t)}{B(t, 10)} + \sum_{t > 10}^{\infty} A_{j,t} \times \mathring{S}_x(0, 10) \times S_{x+10}(0, t - 10) \times B(10, t) \quad (7.3)$$

$$V_{10}[l] = \sum_{t \geq 1}^{10} \frac{L_t \times \mathring{S}_x(0, t)}{B(t, 10)} + \sum_{t > 10}^{\infty} L_t \times \mathring{S}_x(0, 10) \times S_{x+10}(0, t - 10) \times B(10, t) \quad (7.4)$$

where for $t \leq 10$,

$$B(t, 10) = e^{C_{r(t,10)} - D_{r(t,10)}r(t)} \quad (7.5)$$

is the zero-coupon bond price at time t maturing at time 10 and $r(t)$ is the simulated interest rate at time t , and for $t > 10$,

$$B(10, t) = e^{C_{r(10,t)} - D_{r(10,t)}r(10)} \quad (7.6)$$

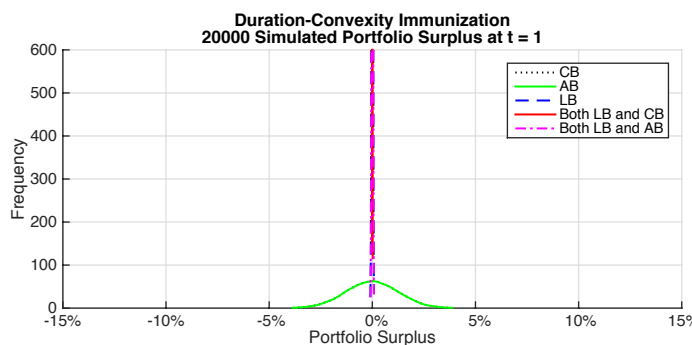
is the zero-coupon bond price at time -10 maturing at time t and $r(10)$ is the simulated interest rate at time 10.

For $t \leq 10$, $\mathring{S}_x(0, t)$ and $\mathring{S}_x(0, 10)$ are the simulated survival probabilities, and for $t > 10$,

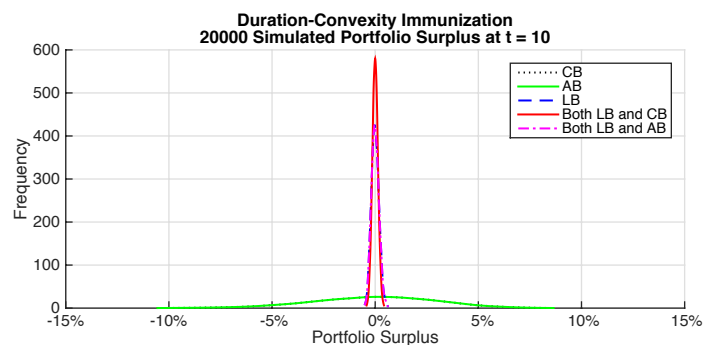
$$S_{x+10}(0, t - 10) = e^{C^{(x+10,0,t-10)} - D_1(x+10,0,t-10)Y_1(10) - D_2(x+10,0,t-10)Y_2(10)} \quad (7.7)$$

is the projected survival probability at time 10 for age $x + 10$ over $t - 10$ years. $Y_1(10)$ and $Y_2(10)$ are the simulated mortality factors at time 10.

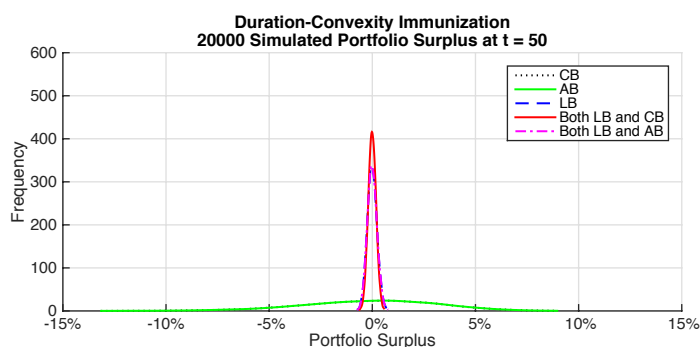
Figure 7.2: Surplus Distribution - Immunization



(a) Time horizon - 1 year



(b) Time horizon - 10 years



(c) Time horizon - 50 years

Figure 7.2 gives plots of the surplus for the different time horizons for the immunization portfolios. Each sub-figure shows a comparison of the surplus distribution for the different immunized bond portfolios. The improvement in the surplus distribution when longevity bonds are included is dramatic regardless of the time horizon. There is little difference between the coupon and annuity bonds. Although the annuity bonds appear to provide a better cash flow match, there is little difference in the surplus distribution. In practice the annuity bonds require fewer bonds to be held and will require less re-balancing than for the coupon bonds.

Table 7.1 gives summary statistics for the surplus distributions showing the mean, standard deviation, value at risk (VaR) and expected shortfall (ES) at the 0.5% probability level for the immunization portfolios. VaR is a quantile measure that represents the worst expected loss over the given time period at confidence level α and Expected Shortfall (ES) reflects the losses in the tail of the distribution. The confidence level used reflects the Solvency II risk levels of 1 in 200. These are expressed as a percentage of the initial liability value.

The mean surplus is approximately zero as expected. All the risk measures demonstrate the improvement from including longevity bonds in the portfolio. Even if interest rate risk is immunized, the 1 in 200 loss could be as high as 10% over a 10 year horizon and 10% over the full time horizon for the life annuity. Longevity bonds allow this risk to be reduced to less than 0.5% over a 10 year horizon and less than 0.6% over the full time

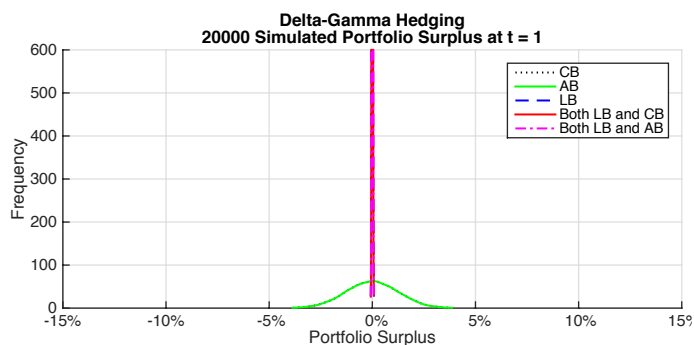
horizon.

Measure	CB	AB	LB	LB & CB	LB & AB
<i>Time Horizon 1 year</i>					
<i>Mean</i>	-0.0183%	-0.0187%	-0.0008%	-0.0002%	-0.0008%
<i>SE(Mean)</i>	0.0090%	0.0090%	0.0002%	0.0000%	0.0002%
<i>SD</i>	1.28%	1.28%	0.03%	0.01%	0.03%
<i>SE(SD)</i>	0.01%	0.01%	0.00%	0.00%	0.00%
<i>VaR_{0.5%}</i>	-3.32%	-3.31%	-0.08%	-0.02%	-0.08%
<i>SE(VaR_{0.5%})</i>	0.03%	0.04%	0.00%	0.00%	0.00%
<i>ES_{0.5%}</i>	-3.73%	-3.74%	-0.09%	-0.02%	-0.09%
<i>SE(ES_{0.5%})</i>	0.08%	0.08%	0.01%	0.00%	0.01%
<i>Time Horizon 10 year</i>					
<i>Mean</i>	-0.0591%	-0.0597%	0.0016%	-0.0017%	0.0016%
<i>SE(Mean)</i>	0.0218%	0.0218%	0.0013%	0.0010%	0.0013%
<i>SD</i>	3.08%	3.08%	0.19%	0.14%	0.19%
<i>SE(SD)</i>	0.02%	0.02%	0.00%	0.00%	0.00%
<i>VaR_{0.5%}</i>	-8.90%	-8.93%	-0.45%	-0.35%	-0.45%
<i>SE(VaR_{0.5%})</i>	0.11%	0.13%	0.00%	0.00%	0.00%
<i>ES_{0.5%}</i>	-10.13%	-10.12%	-0.49%	-0.40%	-0.49%
<i>SE(ES_{0.5%})</i>	0.17%	0.16%	0.02%	0.02%	0.02%
<i>Time Horizon 50 year</i>					
<i>Mean</i>	-0.1377%	-0.1280%	-0.0079%	-0.0083%	-0.0079%
<i>SE(Mean)</i>	0.0242%	0.0241%	0.0017%	0.0014%	0.0017%
<i>SD</i>	3.42%	3.41%	0.25%	0.20%	0.25%
<i>SE(SD)</i>	0.02%	0.02%	0.00%	0.00%	0.00%
<i>VaR_{0.5%}</i>	-10.55%	-10.44%	-0.60%	-0.51%	-0.60%
<i>SE(VaR_{0.5%})</i>	0.20%	0.19%	0.01%	0.01%	0.01%
<i>ES_{0.5%}</i>	-12.63%	-12.61%	-0.90%	-0.78%	-0.90%
<i>SE(ES_{0.5%})</i>	0.27%	0.27%	0.10%	0.10%	0.10%

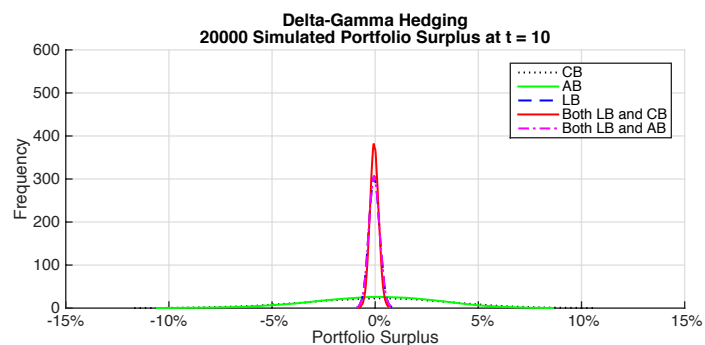
Table 7.1: Summary Statistics for Surplus - Immunization

Figure 7.3 shows plots of the surplus for the varying time horizons for the different delta-gamma hedged bond portfolios. The benefits of holding longevity bonds are again very noticeable with significant reductions in the variability in surplus over all horizons compared to portfolios without longevity bonds. Although results are broadly similar to those for the immunization portfolios there are some noticeable differences. The coupon bond portfolio has more variability than the annuity bond portfolio over medium and long horizons. The portfolios that include longevity bonds have more variability than for the immunized portfolios.

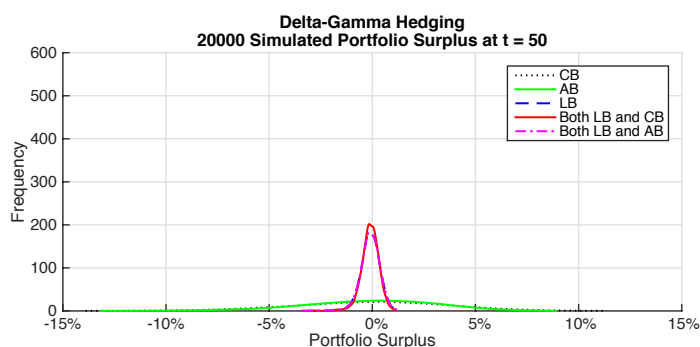
Figure 7.3: Surplus Distribution - Delta-Gamma hedging



(a) Time horizon - 1 year



(b) Time horizon - 10 years



(c) Time horizon - 50 years

Table 7.2 gives summary statistics for the surplus distributions for the delta-gamma hedging. For the coupon and annuity bond portfolios the risk measures are relatively large for all horizons.

All of the risk measures show significant reductions when longevity bonds are included. These reductions are not as great for the long horizon of 50 years compared to the short and medium term horizons.

There is very little difference when coupon bonds and annuity bonds are included in the portfolio along with the longevity bonds, as compared to including only longevity bonds.

Measure	CB	AB	LB	LB & CB	LB & AB
<i>Time Horizon 1 year</i>					
<i>Mean</i>	-0.0179%	-0.0181%	-0.0038%	-0.0038%	-0.0038%
<i>SE(Mean)</i>	0.0090%	0.0090%	0.0002%	0.0002%	0.0002%
<i>SD</i>	1.28%	1.28%	0.02%	0.02%	0.02%
<i>SE(SD)</i>	0.01%	0.01%	0.00%	0.00%	0.00%
<i>VaR_{0.5%}</i>	-3.33%	-3.32%	-0.06%	-0.06%	-0.06%
<i>SE(VaR_{0.5%})</i>	0.04%	0.03%	0.00%	0.00%	0.00%
<i>ES_{0.5%}</i>	-3.74%	-3.74%	-0.07%	-0.07%	-0.07%
<i>SE(ES_{0.5%})</i>	0.08%	0.08%	0.01%	0.01%	0.01%
<i>Time Horizon 10 year</i>					
<i>Mean</i>	0.0225%	-0.0473%	-0.0449%	-0.0439%	-0.0449%
<i>SE(Mean)</i>	0.0251%	0.0218%	0.0019%	0.0015%	0.0019%
<i>SD</i>	3.55%	3.08%	0.26%	0.22%	0.26%
<i>SE(SD)</i>	0.03%	0.02%	0.00%	0.00%	0.00%
<i>VaR_{0.5%}</i>	-9.65%	-8.90%	-0.73%	-0.62%	-0.73%
<i>SE(VaR_{0.5%})</i>	0.12%	0.12%	0.01%	0.01%	0.01%
<i>ES_{0.5%}</i>	-11.07%	-10.15%	-0.87%	-0.78%	-0.87%
<i>SE(ES_{0.5%})</i>	0.18%	0.17%	0.04%	0.05%	0.04%
<i>Time Horizon 50 year</i>					
<i>Mean</i>	-0.1397%	-0.1324%	-0.1148%	-0.1134%	-0.1148%
<i>SE(Mean)</i>	0.0275%	0.0241%	0.0037%	0.0035%	0.0037%
<i>SD</i>	3.89%	3.41%	0.52%	0.49%	0.52%
<i>SE(SD)</i>	0.03%	0.02%	0.00%	0.00%	0.00%
<i>VaR_{0.5%}</i>	-11.39%	-10.43%	-1.97%	-1.96%	-1.97%
<i>SE(VaR_{0.5%})</i>	0.20%	0.16%	0.05%	0.06%	0.05%
<i>ES_{0.5%}</i>	-13.43%	-12.65%	-3.34%	-3.32%	-3.34%
<i>SE(ES_{0.5%})</i>	0.27%	0.28%	0.23%	0.23%	0.23%

Table 7.2: Summary Statistics for Surplus - Delta-Gamma Hedging

7.2 Portfolio Hedge Effectiveness

Although there are clear benefits demonstrated from holding longevity bonds, in order to assess the significance of this improvement we consider three measures of the relative hedge effectiveness of the different portfolios. They are the standard deviation reduction ratio $HE(\sigma)$ used in Lin and Tsai (2013), the Value at Risk reduction ratio $HE(VaR_\alpha)$, and the expected shortfall reduction ratio $HE(ES_\alpha)$ used in Ngai and Sherris (2011). These measures are defined in Table 7.3.

Table 7.3: Risk Reduction Measures

Volatility	Value-at-Risk	Expected Shortfall
$HE(\sigma) = \frac{\sigma(S_t) - \sigma(S_t^*)}{\sigma(S_t)}$	$HE(VaR_\alpha) = \frac{VaR_\alpha(S_t) - VaR_\alpha(S_t^*)}{VaR_\alpha(S_t)}$	$HE(ES_\alpha) = \frac{ES_\alpha(S_t) - ES_\alpha(S_t^*)}{ES_\alpha(S_t)}$
-	$VaR_\alpha = \sup\{l : Pr(S_t < l) \leq \alpha\}$	$ES_\alpha = \frac{1}{\alpha} \int_0^\alpha VaR_u(S_t) du$

To interpret the risk reduction measures, a negative figure indicates the former strategy with surplus S_t performs better than the latter strategy with surplus S_t^* and vice versa.

Measure	t=1	t=10	t=50
<i>Delta-Gamma Hedging: AB compared to CB</i>			
$HE(\sigma)$	0 %	-13 %	-13 %
$HE(VaR_{0.5\%})$	-0 %	-8 %	-8 %
$HE(ES_{0.5\%})$	-0 %	-8 %	-6 %
<i>Immunization: AB compared to CB</i>			
$HE(\sigma)$	2 %	1 %	-7 %
$HE(VaR_{0.5\%})$	0 %	0 %	-0 %
$HE(ES_{0.5\%})$	-0 %	0 %	-1 %
<i>Delta-Gamma Hedging: LB compared to CB</i>			
$HE(\sigma)$	-98 %	-93 %	-87 %
$HE(VaR_{0.5\%})$	-98 %	-92 %	-83 %
$HE(ES_{0.5\%})$	-98 %	-92 %	-75 %
<i>Immunization: LB compared to CB</i>			
$HE(\sigma)$	-98 %	-94 %	-93 %
$HE(VaR_{0.5\%})$	-98 %	-95 %	-94 %
$HE(ES_{0.5\%})$	-98 %	-95 %	-93 %
<i>Delta-Gamma Hedging: CB and LB compared to only CB</i>			
$HE(\sigma)$	-98 %	-94 %	-87 %
$HE(VaR_{0.5\%})$	-98 %	-94 %	-83 %
$HE(ES_{0.5\%})$	-98 %	-93 %	-75 %
<i>Immunization: CB and LB compared to only CB</i>			
$HE(\sigma)$	-100 %	-96 %	-94 %
$HE(VaR_{0.5\%})$	-100 %	-96 %	-95 %
$HE(ES_{0.5\%})$	-100 %	-96 %	-94 %
<i>Delta-Gamma Hedging: AB and LB compared to only CB</i>			
$HE(\sigma)$	-98 %	-93 %	-87 %
$HE(VaR_{0.5\%})$	-98 %	-92 %	-83 %
$HE(ES_{0.5\%})$	-98 %	-92 %	-75 %
<i>Immunization: AB and LB compared to only CB</i>			
$HE(\sigma)$	-98 %	-94 %	-93 %
$HE(VaR_{0.5\%})$	-98 %	-95 %	-94 %
$HE(ES_{0.5\%})$	-98 %	-95 %	-93 %

Table 7.4: Risk Reduction Measures - Comparison of Bond Portfolios

Table 7.4 shows the risk reductions at $t = 1$, $t = 10$ and $t = 50$. Annuity bonds provide improved hedging compared to coupon bonds, especially over longer horizons. Longevity bonds produce significant risk reductions regardless of the horizon used for the surplus when compared to using only coupon bonds. The reduction is almost complete and highlights the significance of longevity risk in life annuity portfolios that cannot be immunized or hedged with fixed-income securities. The reduction is not as great over the longer horizon when using delta-gamma hedging.

Measure	t=1	t=10	t=50
<i>Using CB: Delta-Gamma Hedging compared to Immunization</i>			
$HE(\sigma)$	- 0 %	15 %	14 %
$HE(VaR_{0.5\%})$	0 %	8 %	8 %
$HE(ES_{0.5\%})$	0 %	9 %	6 %
<i>Using AB: Delta-Gamma Hedging compared to Immunization</i>			
$HE(\sigma)$	-0 %	0 %	0 %
$HE(VaR_{0.5\%})$	0 %	-0 %	-0 %
$HE(ES_{0.5\%})$	0 %	0 %	0 %
<i>Using LB: Delta-Gamma Hedging compared to Immunization</i>			
$HE(\sigma)$	-13 %	41 %	113 %
$HE(VaR_{0.5\%})$	-20 %	62 %	228 %
$HE(ES_{0.5\%})$	-20 %	77 %	272 %
<i>Using CB and LB: Delta-Gamma Hedging compared to Immunization</i>			
$HE(\sigma)$	292 %	57 %	146 %
$HE(VaR_{0.5\%})$	289 %	77 %	288 %
$HE(ES_{0.5\%})$	304 %	95 %	327 %
<i>Using AB and LB: Delta-Gamma Hedging compared to Immunization</i>			
$HE(\sigma)$	-13 %	41 %	113 %
$HE(VaR_{0.5\%})$	-20 %	62 %	228 %
$HE(ES_{0.5\%})$	-20 %	77 %	272 %

Table 7.5: Risk Reduction Measures - Comparison of Bond Selection Methods

Table 7.5 compares the risk reductions for delta-gamma hedging portfolios with the immunization portfolios. For the coupon portfolios, immunization is more effective in risk reduction than is delta-gamma hedging. For annuity bonds there is little difference between the two approaches regardless of the horizon used.

For the longevity bonds, delta-gamma hedging portfolios are more effective over shorter horizons than immunization but significantly worse in effectiveness over medium and longer horizons. The combination of short and long positions in the longevity bonds with delta-gamma hedging is only more effective over short horizons. There is a need for re-balancing of the delta-gamma bonds portfolio over short horizons.

Including coupon bonds along with longevity bonds produces delta-gamma hedging portfolios that are considerably less effective than the immunized portfolios. This reflects the

inclusion of short positions in the delta-gamma longevity bond portfolios that resemble deferred longevity bonds. Since these are selected to hedge the delta and gamma, based on the stochastic model used, they do not provide the cash flow hedge that immunization does.

8 Conclusions

This paper presents an extensive analysis of bond portfolio selection for immunizing and hedging the life annuity liabilities of a life annuity provider. The paper assesses both Fisher-Weil immunization as well as delta-gamma hedging using stochastic models for both interest rate risk and mortality risk. The portfolios considered include coupon bonds, annuity bonds and longevity bonds.

We show how Fisher-Weil immunization can be used to immunize both interest rate and mortality risk. We extend a linear-programming approach used for interest rate immunization to selecting coupon, annuity and longevity bonds to immunize a life annuity portfolio. We use a linear programming approach for delta-gamma hedging and allow for both interest rate and mortality risk.

We show that annuity bonds provide better cash flow matching than coupon bonds, although the annuity bonds available in the Australian market do not have a long enough term to maturity to immunize a life annuity portfolio. Annuity bonds provide a better cash flow match to the life annuity liability, with improved immunization effectiveness compared with coupon bonds over short horizons.

For the delta-gamma hedging portfolio with longevity bonds, a short position in a shorter term bond and a long position in a longer term bond is required. This is the equivalent of a deferred longevity bond. Although this portfolio performs well over the short horizon, it does not perform well compared to the immunized portfolio over medium or long horizons. This highlights the need for re-balancing of the delta-gamma hedging portfolio as the underlying risk factors evolve.

The portfolios selected, regardless of method, all demonstrate that longevity bonds are valuable in immunizing or hedging longevity risk in life annuities. They provide a better cash flow match in the case of immunization and have much reduced risk in the surplus distribution at short, medium and long horizons.

Longevity bonds are not available in the Australian market or in other bond markets. We have shown the clear benefits that these bonds bring to the risk management of a life annuity provider. As a result we expect that as the life annuity market develops these bonds should be in increasing demand by insurers.

Our analysis uses Australia bonds as well as stochastic models calibrated to Australian interest rate and mortality data. Most developed economies have similar bond markets as well as interest rate and mortality experience as has Australia. As a result our analysis has direct application to any economy considering the types of bonds that should be offered

in order to better manage the risks of long term pension and annuity portfolios.

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