## UNIVERSIDAD DE SAN ANDRÉS

Seminario del Departamento de Economía

## "Optimal annuitization policies: analysis of the options."

## Moshe Arye Milevsky

(Schulich School of Business, York University)

Miércoles 23 de agosto de 2000

## Optimal Annuitization Policies: <br> Analysis of the Options

Moshe Arye Milevsky ${ }^{1}$

## Universidad de



[^0]
# Optimal Annuitization Policies: Analysis of the Options 


#### Abstract

At, or about, the age of retirement, most individuals must decide what additional fraction of their marketable wealth, if any, should be annuitized. Annuitization means purchasing a non-refundable life annuity from an insurance company, which then guarantees a life-long consumption stream that can not be outlived. The decision of whether or not to annuitize additional liquid assets is a difficult one, since it is clearly irreversible and can prove costly with hindsight. Obviously, for a large group of people, the bulk of financial wealth is forcefully annuitized; for example company pensions and social security. For others, especially as it pertains to personal pension plans, such as $401(\mathrm{k}), 403(\mathrm{~b})$ and IRA plans as well as variable annuity contracts, there is much discretion in the matter.

The purpose of this paper is to focus on the question of when and if to annuitize. Specifically, my objective is to provide practical advice aimed at individual retirees and their advisors. My main conclusions are as follows:


1. Annuitization of assets provides unique and valuable longevity insurance and should be actively encouraged at higher ages. Standard microeconomic utility-based arguments indicate that consumers would be willing to pay a substantial 'loading' in order to gain access to a life annuity.
2. The large adverse selection costs associated with life annuities, which range from $10 \%-20 \%$, might serve as a strong deterrent to full annuitization.
3. Retirees with a (strong) bequest motive, might be inclined to self-annuitize during the early stages of retirement. Indeed, it appears that most individuals - faced with expensive annuity products can effectively 'beat' the rate of return from a fixed immediate annuity until age 75-80. I call this strategy: consume term and invest the difference.
4. Variable Immediate Annuities (VIAs) combine equity market participation together with longevity insurance. This financial product is currently under-utilized (and not available in certain jurisdictions) and can only grow in popularity.
"I advise you to go on living solely to enrage those who are paying your annuities. It is the only pleasure I have left"

Voltaire

## 1 Introduction and Objectives.

At some point during the retirement years, one must decide if to annuitize any discretionary liquid savings. The process of annuitization involves purchasing a life annuity by paying a non-refundable lump sum to an insurance company in exchange for a life-long consumption stream that can not be outlived. This decision is quite difficult since, on the one hand, the annuity will provide life long income. On the other hand, there is a serious loss of liquidity that comes with annuitization. This decision is faced by most individuals who are invested in variable annuity contracts - with the option to annuitize - as well as in 401(k), 403(b), IRA and other personal pension plans.

This paper presents a dual, and perhaps conflicting, message. On the one hand, it argues that voluntary annuitization provides invaluable longevity insurance that can not be replicated using other investment vehicles. The longevity insurance guarantees that survivors will never run out of money, no matter how long they live. However, in contrast to the invaluable protection, it is an empirical fact that most consumers are reluctant to actively purchase life annuities. Rather, they prefer to create their own consumption stream - also known as self-annuitization - even at the expense of potential reductions in their standard of living.

Indeed, Modigliani (1986), Friedman and Warshawsky (1990), Mirrer (1994) and many other academic studies have documented that very few people consciously choose to annuitize discretionary wealth. This phenomena is especially puzzling within the paradigm of the Ando and Modigliani (1963) Life Cycle Hypothesis (LCH), or Yaari (1965) under which individuals would seek to smooth their life-time consumption by annuitizing wealth. Life annuities can 'smooth' and 'guarantee' consumption for the rest of ones natural life. The most common explanation for the thin annuity market 'puzzle' is to simply abandon the strict form of the life-cycle hypothesis and declare that individuals have strong bequest motives, as Bernheim (1991) , Hurd (1989) and others have argued. Consumers with strong bequest motives are reluctant to annuitize since, in exchange for longevity insurance, there is little residual value left for the estate.

Another attempt to resolve the 'low annuitization' puzzle is to argue that even when individuals have negligible bequest motives, annuities are simply too expensive. This line of thinking was introduced by Warshawsky (1988) and Friedman and Warshawsky (1990), and lately expanded by Mitchel, Poterba, Warshawsky and Brown (1999). They show that the implied rates of return from life annuities are much lower, as a result of transaction costs or 'loads', than those available from other investment assets. (Although they also indicate that these loads have come down over time.) These loads may be partially attributable to the adverse selection implicit in the mortality tables. Nevertheless, they act to reduce the returns compared to other non annuity alternatives. Other explanations have focused on the individual's ability to pool mortality risk in large families, the lack of real (inflation protected) annuities and non-rational behavioral justifications.

In contrast to the academic literature that tries to explain or document the 'thin' annuity market, the
objective of this paper is to (i) demonstrate the important function that life annuities provide, using a simple microeconomic consumer choice model, and (ii) then help retiring individuals decide if and when to purchase (additional) life annuities. The normative advice is provided by focusing on the probability of consumption shortfall as the operative measure risk. This paper is closely related to the recent work in Milevsky (1998), where the Canadian annuity market is analyzed in great detail, vis a vis the probability of beating the return from a life annuity. The main idea behind the shortfall approach, is to compute the probability of 'beating' the rate of return from a life annuity. The higher this probability, the more it makes sense to wait before annuitizing, especially if there is a bequest motive. The reader is encouraged to consult the Milevsky (1998) paper for more details on the simulation methodology as well as the parameter estimates from a cross section of annuity prices.

This 'probability based' methodology allows one to quantify the opinion shared by most financial planners. Namely, that consumers under the age of $75-80$ should refrain from annuitizing any additional marketable wealth. The exception to this rule would be in the event that interest rates are extraordinarily high (cheap annuities) or when the consumer has private information that would lead him or her to believe that they are much healthier than the general population. The reluctance to annuitize, is further reenforced by the inability of the consumer to acquire (at a reasonable cost) real indexed annuities that protect consumption against inflation, something that (arguably) equity markets are able to do quite effectively over long horizons.

I must, however, make absolutely clear that one of the main factors driving this result is the 'spread' between the interest rate credited to the life annuity, and the rate available in the non-annuitized open market. As one can see from the actuarial model, in the event that this 'profit spread' is zero, the probability of beating the life annuity is greatly reduced.

### 1.1 Agenda

The remainder of this paper is organized as follows. Section 2 examines the theoretical benefits from annuitization in terms of the longevity insurance, mortality credits and utility welfare improvements. Section 3 looks at the question of self-annuitization and the probability of being able to replicate a life annuity stream. Section 4 concludes the paper.

## 2 Welfare Analysis: The Benefits to Annuitizing

I now provide a simple two-period example that illustrates the gains in utility from having access to a life annuity market. Assume we have $\$ 1$ which must be consumed during the next two periods. The consumption, denoted by $C_{1}$ and $C_{2}$, takes place at the end of the period. There is a $p_{1}$ probability that the individual will survive to (consume at) the end of the first period, and a $p_{2}$ probability of surviving to (consuming at) the end of the second period. The periodic interest rate is denoted by $R$. The objective is to maximize the discounted utility of consumption. To that end, I postulate logarithmic preferences. In
the absence of annuities, the objective function and budget constraints are given by:

$$
\begin{align*}
\max _{\left\{C_{1}, C_{2}\right\}} & E[U] & =\frac{p_{1}}{1+\rho} \ln \left[C_{1}\right]+\frac{p_{2}}{(1+\rho)^{2}} \ln \left[C_{2}\right],  \tag{1}\\
\text { st } & 1 & =\frac{C_{1}}{1+R}+\frac{C_{2}}{(1+R)^{2}},
\end{align*}
$$

where $\rho$ is the subjective discount rate. Clearly, this model does not incorporate any utility of bequest, since only the 'live' states are given weight in the objective function. The solution to this consumptioninvestment problem is obtained by creating the Lagrangian: ${ }^{1}$

$$
\begin{equation*}
\max _{\left\{C_{1}, C_{2}, \lambda\right\}} \quad L=\frac{p_{1}}{1+\rho} \ln \left[C_{1}\right]+\frac{p_{2}}{(1+\rho)^{2}} \ln \left[C_{2}\right]+\lambda\left(1-\frac{C_{1}}{1+R}-\frac{C_{2}}{(1+R)^{2}}\right) \tag{3}
\end{equation*}
$$

The first order condition is:

$$
\begin{array}{lccc}
\frac{\partial L}{\partial C_{1}}=\frac{p_{1}}{(1+\rho) C_{1}} & & -\frac{\lambda}{(1+R)} & =0 \\
\frac{\partial L}{\partial C_{2}}= & & \frac{p_{2}}{C_{2}(1+\rho)^{2}} & -\frac{\lambda}{(1+R)^{2}}=0  \tag{4}\\
\frac{C_{2}}{\partial \lambda}=-\frac{C_{1}}{(1+R)} & -\frac{C_{2}}{(1+R)^{2}} & +1 & =0
\end{array}
$$

Solving the system of three equations and three unknowns, I obtain the optimal values for the choice variables:

$$
\begin{equation*}
C_{1}^{*}=\frac{p_{1}(\rho R+R+\rho+1)}{p_{2}+p_{1} \rho+p_{1}}, \quad C_{2}^{*}=\frac{p_{2}\left(1+2 R+R^{2}\right)}{p_{2}+p_{1} \rho+p_{1}} \tag{5}
\end{equation*}
$$

The optimal consumption, in the absence of annuities, is given by equation (5). The ratio of consumption between period one and period two, is: $C_{1}^{*} / C_{2}^{*}=p_{1}(1+\rho) / p_{2}(1+R)$. When the subjective discount rate is equal to the interest rate $(\rho=R)$, then $C_{1}^{*} / C_{2}^{*}=p_{1} / p_{2}$, which is the ratio of the survival probabilities, and is strictly less than one. Stated differently, the individual consumes less at higher ages. In fact, this result can be generalized to a multiperiod setting. When life annuities are not available, rational utility maximizers are forced to consume less as they age, even though their time preference is equal to the market rate.

However, in the presence of an actuarially fair life annuity market, the budget constraint in equation (2) must change to reflect the probability adjusted discount factor. This greatly expands the opportunity set for the consumer, and, will increase the utility.

The optimization problem is now:

$$
\begin{align*}
& \max _{\left\{C_{1}, C_{2}\right\}} E[U]=\frac{p_{1}}{1+\rho} \ln \left[C_{1}\right]+\frac{p_{2}}{(1+\rho)^{2}} \ln \left[C_{2}\right],  \tag{6}\\
& \text { st } \\
& 1=\frac{p_{1} C_{1}}{1+R}+\frac{p_{2} C_{2}}{(1+R)^{2}}, \tag{7}
\end{align*}
$$

The Lagrangian becomes:

$$
\begin{equation*}
\max _{\left\{C_{1}, C_{2}, \lambda\right\}} \quad L=\frac{p_{1}}{1+\rho} \ln \left[C_{1}\right]+\frac{p_{2}}{(1+\rho)^{2}} \ln \left[C_{2}\right]+\lambda\left(1-\frac{p_{1} C_{1}}{(1+R)}-\frac{p_{2} C_{2}}{(1+R)^{2}}\right) \tag{8}
\end{equation*}
$$

[^1]The first order condition is:

$$
\begin{array}{llll}
\frac{\partial L}{\partial C_{1}}=\frac{p_{1}}{C_{1}(1+\rho)} & & -\frac{\lambda p_{1}}{(1+R)} & =0 \\
\frac{\partial L}{\partial C_{2}}= & & \frac{p_{2}}{C_{2}(1+\rho)^{2}} & -\frac{\lambda p_{2}}{(1+R)^{2}}=0  \tag{9}\\
\frac{\partial L}{\partial \lambda}=-\frac{p_{1} C_{1}}{(1+R)} & -\frac{p_{2} C_{2}}{(1+R)^{2}} & +1 & =0
\end{array}
$$

The optimal consumption is denoted by $C_{1}^{* *}, C_{2}^{* *}$, and is equal to:

$$
\begin{equation*}
C_{1}^{* *}=\frac{\rho R+R+\rho+1}{p_{2}+p_{1} \rho+p_{1}}, \quad C_{2}^{* *}=\frac{1+2 R+R^{2}}{p_{2}+p_{1} \rho+p_{1}} \tag{10}
\end{equation*}
$$

The important point to notice is that $C_{1}^{* *}=C_{1}^{*} / p_{1}$ and $C_{2}^{* *}=C_{2}^{*} / p_{2}$, which implies that the optimal consumption is greater in both periods, in the presence of life annuities. Specifically, at time zero, the individual would purchase a life annuity that pays $C_{1}^{* *}$ at time 1 and $C_{2}^{* *}$ at time 2 . The present value of the two life annuities - as per the budget constraint - is one dollar. In this case, the ratio of consumption between period one and period two, is: $C_{1}^{*} / C_{2}^{*}=(1+\rho) /(1+R)$. When the subjective discount rate is equal to the interest rate $(\rho=R)$, then $C_{1}^{*} / C_{2}^{*}=1$, which is the 'smoothing' effect of annuities, discussed above.

Here is an numerical example which should help illustrate the model. Let $R=\rho=10 \%$, and let $p_{1}=0.75$ and $p_{2}=0.40$. The individual has a $75 \%$ chance of surviving to the end of the first period, and a $40 \%$ chance of surviving to the end of the second period. Hence, according to equation (5), the optimal consumption is: $C_{1}^{*}=0.741$ and $C_{2}^{*}=0.395$ in the absence of annuities. The maximum utility is $E U^{*}=-0.5115$. However, in the presence of life annuities, the optimal consumption becomes $C_{1}^{* *}=0.987$ and $C_{2}^{*}=0.987$ with a maximal utility of $E U^{*}=-0.01247$, which is clearly greater than the no annuity case. To get a sense of the benefit from annuitizing, if one solves equation (8), with a budget constraint equal to 0.61 , instead of 1 , the optimal annuitized consumption would be $C_{1}^{* *}=0.603$ and $C_{2}^{*}=0.603$. In this case, the maximal utility would be the same as with the no annuity case. Stated differently, if one were to take away 0.39 from the individual, but give them access to a fairly priced life annuity, the utility would be the same. The model presented, obviously abstracts from many of the real world issues that affect the decision to annuitize. Nevertheless, I believe that the intuitive implications are worth the price in assumptions. Annuities allow individuals to consume more - than they could have otherwise - during their retirement years. In our model, a person would be willing to forgo up to $39 \%$ of their initial wealth to gain access to a fair life annuity.

## 3 Consume Term and Invest the Difference

### 3.1 Discrete Time: Deterministic Investment Returns

Given the reluctance of individuals to annuitize their liquid wealth - despite their welfare enhancing properties - in this section I intend to examine a strategy that seems to offer the best of both worlds. Specifically, I describe a strategy that attempts to replicate the income from a life annuity by self-insuring. The self-insurance is implemented early in retirement, and then, if so desired, wealth can be annuitized at
a later age. I call this strategy: consume term and invest the difference. The similarity to the well-known adage of buy term and invest the difference, will be made clear in the process.

Let us go back to basics. I will start the analysis with an intuitive discrete time example. The pricing definition of a one-dollar per year single-premium Fixed Immediate life Annuity (FIA), is:

$$
\begin{equation*}
a_{x}=(1+l)\left(\sum_{i=1}^{\infty} \frac{{ }_{i} p_{x}}{(1+R)^{i}}\right) . \tag{11}
\end{equation*}
$$

This annuity pays one dollar at the end of every year, for the rest of the annuitants life. I further assume no refunds, no certain periods and no survivor benefits. The symbol $R$ denotes the appropriate rate of interest, which is used by the insurance company to discount cash flows. The quantity ${ }_{i} p_{x}$ denotes the conditional probability that an individual aged ( $x$ ) will attain age $(x+i)$, where it is understood that ${ }_{j} p_{n}=0$ for a large enough value of $j$. The survival probabilities are taken from an annuity mortality table. The proportional insurance load $l$, incorporates all expenses, taxes, commissions and distribution fees - let alone profits - and is multiplied by the pure actuarial premium to arrive at a market price $a_{x}$. Practically speaking, the quantity $l$ is on the order of magnitude of approximately 0.15 . (Although competitive pressures seem to have reduced this in recent years.) Stated differently, the pure actuarial premium is 'grossed up' by approximately $15 \%$ to arrive at a market premium. See the work by Mitchell, Poterba, Warshawsky and Brown (1999) as well as Milevsky (1998) for a further discussion of $l$. I should emphasize that the actual magnitude of the parameters will have a large effect on the optimal time - if any - to annuitize. Clearly, the larger the load ( $l$ ), the lower are the welfare gains to annuitization. In fact, if $l$ is large enough, even in the absence of bequest motives, the optimal strategy is to avoid annuitization.

Now, let us see what happens if the retiree decides not to purchase the life annuity, but rather invest the funds in a liquid (non annuitized) account, and consume the same dollar as the annuity would have provided. Specifically, assume that the retiree, aged ( $x$ ), decides to wait for one year, and purchase the same annuity at age $(x+1)$. In order to afford the exact same life annuity stream in one year, the annual investment return, denoted by $K$, earned by the retiree, must be such that:

$$
\begin{equation*}
a_{x}(1+K)-1 \geq a_{x+1} \tag{12}
\end{equation*}
$$

In other words, the life annuity premium at age $(x)$ invested at a rate $K$, minus the one dollar consumption at the end of the year, must be greater than or equal to the market price of the annuity at age $(x+1)$. Re-arranging equation (12) in terms of the investment return $K$, the condition for beating the rate of return from the annuity, over one year, is:

$$
\begin{equation*}
K \geq K^{*}=\frac{a_{x+1}}{a_{x}}+\frac{1}{a_{x}}-1 . \tag{13}
\end{equation*}
$$

I refer to $K^{*}$ as the threshold annual investment return necessary for a successful deferral. In general, using the actuarial identity: $\left({ }_{i} p_{x+n}\right)=\left({ }_{n+i} p_{x}\right) /\left({ }_{n} p_{x}\right)$, I can re-write $a_{x+1}$ in terms of $a_{x}$, using equation (11), and then re-write the condition for beating the rate of return on the annuity, using equation (13), as:

$$
\begin{equation*}
K \geq K^{*}=\frac{1+R}{1 p_{x}}-\frac{l}{a_{x}}-1 . \tag{14}
\end{equation*}
$$

| Currently Age 65 | $\lambda(x)=\frac{1}{10.5} \exp \left\{\frac{x-88.18}{10.5}\right\}$ | $\lambda(x)=\frac{1}{8.78} \exp \left\{\frac{x-92.63}{8.78}\right\}$ |
| :---: | :---: | :---: |
| Survive to Age: | Male | Female |
| 70 | 0.935 | 0.967 |
| 75 | 0.839 | 0.912 |
| 80 | 0.705 | 0.823 |
| 85 | 0.533 | 0.686 |
| 90 | 0.339 | 0.497 |
| 95 | 0.164 | 0.281 |
| 100 | 0.023 | 0.103 |

Table 1: Survival Probability: Using Gompertz fit to IAM2000 plus Scale G
Equation (14) contains the main idea. It specifies the precise rate of return that a retiree must earn, in order to 'beat' the mortality-adjusted return from a life annuity. So long as the individual can earn at least $K^{*}$, it makes sense to self-annuitize and defer the decision until the next period. For example, when the insurance loads, in equation (14) are set equal to zero, the condition for beating the annuity is simply: $K \geq K^{*}=(1+R) /\left({ }_{1} p_{x}\right)-1$. Now, since the term $\left({ }_{1} p_{x}\right)$ is strictly less than one, the threshold return on investment $K^{*}$ - in the no load case - must be greater than the rate $R$. In the actuarial lingo, the term $\left({ }_{1} p_{x}\right)^{-1}$ is referred to as "mortality credits," because they enhance the return $R$. The lower the probability of survival, the higher the mortality credits. Also, in general, a higher insurance load tends to reduce the threshold rate $K^{*}$. Of particular interest is the fact equation (14) indicates that for a young enough individual $(x)$ and a high enough insurance load $(l)$, the investment return threshold $K^{*}$, could in theory be lower than $R$. In this case, one can beat the mortality adjusted return from the life annuity by simply investing in the exact same assets used by the insurance company to discount cash flows.

In sum, if the consumer can earn a (risk free) return of $K^{*}$, they can defer annuitization by one period - yet consume the exact same amount that a life annuity would have provided.

### 3.2 Continuous Time: Deterministic Investment Returns

With the main idea behind us, I now move to a multi-period analysis. My intention, once again, is to estimate the return required to beat the mortality-adjusted return from a life annuity. For the remainder of the paper I will consider life annuities that 'payout' - and are priced - in continuous time. To this end, one can imagine an immediate life annuity with a daily payout, although, obviously, the monthly variety is the most common. The continuity assumption, which is grounded in modern financial economic theory, simplifies the ensuing mathematics.

Using continuous compounding, the market price of a one dollar per year, life annuity, for an individual at age ( $x$ ), is:

$$
\begin{equation*}
a_{x}=(1+l) \int_{0}^{\infty} e^{-r t}{ }_{t} p_{x} d t \tag{15}
\end{equation*}
$$

This time, $r$ denotes the continuously compounded interest rate, $\left({ }_{t} p_{x}\right)$ is the conditional probability that

| Force of Mortality: Male $\frac{1}{10.5} \exp \left\{\frac{x-88.18}{10.5}\right\}$, Female: $\frac{1}{8.78} \exp \left\{\frac{x-92.63}{8.78}\right\}$ |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
| Interest Rate | Annuity Price: Male | Annuity Price: Female |  |  |
| $r=0.04$ | $a_{65}=14.426$ | $a_{75}=10.569$ | $a_{65}=16.184$ | $a_{75}=12.127$ |
| $r=0.05$ | $a_{65}=13.121$ | $a_{75}=9.848$ | $a_{65}=14.583$ | $a_{75}=11.216$ |
| $r=0.06$ | $a_{65}=11.999$ | $a_{75}=9.206$ | $a_{65}=13.222$ | $a_{75}=10.410$ |
| $r=0.07$ | $a_{65}=11.027$ | $a_{75}=8.630$ | $a_{65}=12.058$ | $a_{75}=9.693$ |
| $r=0.08$ | $a_{65}=10.180$ | $a_{75}=8.112$ | $a_{65}=11.054$ | $a_{75}=9.055$ |

Table 2: Sample Annuity Prices: Gompertz Mortality
an individual aged $(x)$ survives to age $(x+t)$ and, once again, $l$ denotes the insurance load charged. I would like to stress at this point that the 'loading' on the actuarial premium, is separate and distinct from the loading of any mortality tables. As such, the probability ( ${ }_{t} p_{x}$ ) may include it's own loading as well.

Following in the footsteps of recent work on annuity pricing by Frees, Carriere and Valdez (1996), I adopt a model of mortality using a two-parameter Gompertz ${ }^{2}$ specification. According to the mortality law proposed by Benjamin Gompertz, the force of mortality at any age $(x)$, is:

$$
\begin{equation*}
\lambda(x)=\frac{1}{b} \exp \left\{\frac{x-m}{b}\right\} \tag{16}
\end{equation*}
$$

The parameter $m$ can be thought of as a median lifetime, with $b$ as a scaling variable. In this paper I priced all annuities using the Individual Annuity Mortality (IAM) 2000 table, dynamically adjusted using scale G, published by the Society of Actuaries. Furthermore, the data was smoothed using the abovementioned Gompertz specification. The exact parameters I used throughout the paper are: $m=88.18$ and $b=10.5$ for males, with a life expectancy of 84.86 years, and $m=92.63$ and $b=8.78$ for females, with a life expectancy of 88.51 years. Table 1 provides the survival probabilities for a variety of ages.

Solving the integral in equation (15), with mortality defined by equation (29), I obtain a closed form (tractable) expression for the price of the life annuity:

$$
\begin{equation*}
a_{x}=(1+l) \frac{b \Gamma(-b r, b \lambda(x))}{\exp \{(m-x) r-b \lambda(x)\}} \tag{17}
\end{equation*}
$$

where $\Gamma(a, b)$ is the incomplete Gamma function, defined to be: $\Gamma(a, b)=\int_{b}^{\infty} e^{-t} t^{(a-1)} d t$, and is available in most mathematical software and spreadsheet packages. Despite the somewhat complex-looking expression in equation (17), it's closed-form representation allows us to price annuities using a spreadsheet and the appropriate values for $r, l, m, b$. Table 2 provides some annuity values, for the above mentioned male and female survival functions, assuming a 'load' of $l=0.10$. Recall that the annuity price is the 'cost' of obtaining $\$ 1$ per annum for life.

Notice that the price of the annuity declines in both age and the interest rate. This observation is critical to our analysis. For example, if at age 65 interest rates are at $8 \%$, and they subsequently decline

[^2]Figure 1: displays the evolution of wealth, as a function of the investment rate $k(7 \%, 8 \%, 9 \%)$, when the consumption is equal to the annuity rate.

to $4 \%$ in ten years, the price of the annuity will actually be more expensive at age 75 . Likewise in the other direction, if interest rates are currently 'low' and they move up over time, the price of the annuity will decline, with age, for two reasons.

I now return to my main objective, which is to examine the implications of deferring the decision to annuitize. In this model, an individual with marketable wealth $W_{0}=w$ at age $x$, can choose to annuitize all liquid wealth. At a rate of $a_{x}$, per annual dollar of lifetime consumption, $w$ can 'buy' $c=w / a_{x}$ dollars per year of lifetime. Alternatively, the individual can invest the $w$ in a portfolio, earning a (continuously compounded) rate of return $k$, and consuming the exact same (life annuity) amount $c$ until the individual runs out of money at some future time $t^{*}$, which may be infinite. By construction the investors wealth will obey an ordinary differential equation,

$$
W_{t}=\left\{\begin{array}{cc}
(w-c / k) e^{k t}+c / k, & \text { for all } t<t^{*}  \tag{18}\\
0, & \text { for all } t \geq t^{*}
\end{array} .\right.
$$

Intuitively, the constant multiplying the $e^{k t}$ in equation (18) will be negative whenever the annuity payment $c$ is greater than the perpetuity consumption defined by $w k$. The 'negativity' forces the exponential term to overpower $+c / k$ and $W_{t}$ will eventually hit zero. Understandably, if the return $k$ is high enough, in other words $w>c / k$, then $t^{*}=\infty$, and one can consume forever. Solving for $t^{*}$, in terms of the investment return $k$ in equation (18), and then substituting $a_{x}=w / c$ I obtain:

$$
t^{*}=\left\{\begin{array}{cl}
\frac{-\ln \left[1-a_{x} k\right]}{k}, & \text { for all } k<\left(a_{x}\right)^{-1}  \tag{19}\\
\infty, & \text { for all } k \geq\left(a_{x}\right)^{-1}
\end{array}\right.
$$

As one can see, when $k \geq\left(a_{x}\right)^{-1}$, the investor can safely beat the annuity for ever, since $t^{*}=\infty$. In contrast, when $k<\left(a_{x}\right)^{-1}$, ruin (or shortfall) is certain, conditional on being alive. The lifetime probability of consumption 'shortfall' is the probability of surviving to time $t^{*}$, which as per equation (29), is $t \cdot p_{x}$.

Figure 1 illustrates the dynamic evolution of net wealth, as per equation (18), using three different values for the parameter $k$. When $w=\$ 100,000$ with $l=0.10$ and $r=0.07$, then $a_{65}=11.027$ (male) and
the consumption rate is $c=\frac{w}{a_{65}}=\$ 9,068$, per annum. If the individual decides to consume the $\$ 9,068$, while investing at the (same) $k=0.07$ rate, then ruin will occur at time $t^{*}=21.113$ years. There is a 0 . 49 chance of being alive at that point, which implies a 0.49 probability of ruin using this strategy. This is to be expected given identical rate of investment. On the other hand, if the investment rate is $k=0.08$, then $t^{*}=26.73$. Finally, when $k=0.09, t^{*}=54.262$, and the individual is 'set' for life. ${ }^{3}$

The next question of interest becomes, at what time $s$ will the marketable wealth from equation (18) be equal to $c a_{x+s}$, the price of a continued life-time consumption stream $c$. This will be the point at which the individual should 'switch' and annuitize wealth. In other words, for the first few years the consumer can earn more than the mortality adjusted return. Eventually, the 'mortality credits' are so large that it becomes optimal to annuitize.

Mathematically, I are searching for the (waiting period) value of $s$, as an implicit function of the investment return $k$, that satisfies:

$$
\begin{array}{cc}
\max _{0 \leq s \leq \infty} & \{s\} \\
\text { st } & W_{s} / a_{x+s} \geq c \tag{20}
\end{array}
$$

Equation (20) argues that the consumer should defer annuitization until the original consumption stream is no longer affordable in the annuity market. Using equation (18) together with the obvious condition that $s^{*}$ should occur prior to ruin ( $t^{*}$ ), the 'optimal annuitization' problem can be solved to yield

$$
s^{*}=\left\{\begin{array}{ll}
\frac{1}{k} \ln \left[\frac{1 / k-a_{x+s^{*}}}{1 / k-a_{x}}\right], & \text { for all } k<\left(a_{x}\right)^{-1}  \tag{21}\\
\infty, & \text { for all } k \geq\left(a_{x}\right)^{-1}
\end{array} .\right.
$$

Now, although the critical variable $s^{*}$ appears on both sides of equation (21), solving for $s^{*}$ is quite easy with the use of a spreadsheet when the future annuity prices $a_{x+s^{*}}$ can be stated with certainty.

### 3.3 Continuous Time: Stochastic Investment Returns

Let me sum up the main point of the previous section. If the future prices of all life annuities $\left(a_{x}\right)$ and future investment returns ( $k$ ) are known with perfect certainty, the individual can consume term and invest the difference, with no risk. This is done by locating the point at which the mortality-adjusted returns can not be 'beaten'. In practice, of course, the decision to postpone the purchase of a life annuity - and the implicit formulation from the previous section - is confounded by three major source of uncertainty. There are three possible things that can go wrong with the decision to consume term and invest the difference. They are:

1. (i) stochastic investment returns,
2. (ii) stochastic interest rates and
3. (iii) stochastic mortality rates.
[^3]By stochastic investment returns, I mean, there is a chance that the rate of return $(k)$ from the portfolio will not live up to expectations. This, of course, will imply that the evolution of (non-annuitized) wealth will not obey the ordinary differential equation stipulated in equation (18).

Stochastic interest rate imply that term structure of interest rates applicable in the market - and used by the insurance company to price annuities - fluctuates over time. Thus, once again, the price of the same exact annuity in $5,10,15$ or 20 year is uncertain. Finally, even without the randomness in the discount factor, I do not know exactly what mortality table the insurance company will use when pricing the annuity in $5,10,15$ or 20 years. This is what is meant by stochastic mortality.

Therefore, in practice, I do not know with certainty whether the investor will have enough money to purchase the exact same annuity in the future.

To quantify the risk of this strategy, I constructed a Monte Carlo simulation that generates thousands of future investment and interest rate scenarios. Each of these scenarios gave rise to a probability of a successful deferral. I will now explain in detail the exact method by which the randomness was generated.

### 3.3.1 Model for Investment Returns.

I model continuously compounded investment returns, during any period in time, as normally distributed. This assumption is standard in financial economics and can be traced back to Boyle (1976) in the actuarial, risk and insurance literature, as well as Black and Scholes (1973). Consequently, in sharp contrast to the deterministic equation (18), the investors portfolio will obey a geometric Brownian motion. The parameter $\mu$ will denote the growth rate of the portfolio (akin to $k$ in the deterministic case), and the parameter $\sigma$ will denote the volatility.

### 3.3.2 Model for Interest Rates.

Similar to the model for investment returns, I assumed that the interest rate used by the insurance company to price annuities (or the valuation rate) obeys a mean reverting stochastic process. The process will have three free parameters. The first is $\bar{r}$, which denotes the long-run average level of the interest rate. The second parameter is $\gamma$, which denotes the speed of adjustment in the mean reverting prices. And the final free parameter is $\sigma_{r}$, which denotes the volatility of interest rates. This continuous-time model of interest rate behavior was originally introduced, by Cox, Ingersoll and Ross (1985) and has been applied widely in financial economics. See Chan, et. al. (1992) for a discussion of the empirical estimates. The important point to note is that our simulations will allow for future random interest rates, but the randomness will be controlled by forcing interest rates to revert to a long term level. If current rates are lower than the long-term rate $(\bar{r})$, interest rates will be expected to increase. If, on the other hand, current rates are higher than the long-term rate $(\bar{r})$, interest rates will be expected to decline. The rate at which the process moves back (reverts) to the long-term value, is controlled by $\gamma$.

### 3.3.3 Model for Future Mortality Rates.

One of the weak points in this kind of simulation analysis, is that I do not know with certainty what particular mortality table the insurance company will be using in the future. Furthermore, if, as is the
current trend, future mortality patterns continue to improve, annuity prices can only increase - even for a fixed interest rate.

To partially account for the problems in projecting future mortality trends, I have computed all annuity prices by dynamically projecting the Society of Actuaries Individual Annuity Mortality 2000 table, using $100 \%$ of the Scale G improvement factor. Essentially, this assumption implies that mortality will improve in time, but only as expected by Scale G. If indeed future mortality improves by more than expected, our annuity prices will indeed by too low. However, I do point out that the IAM 2000 was essentially constructed by projecting ahead the IAM 1983 table. So, our methodology is consistent with the practice of updating mortality tables on a periodic basis. Technically speaking, our simulation model generated an interest rate for the deferral period in question and then priced the annuity using the IAM 20XX that would be applicable at that time. ${ }^{4}$

Finally, it is important to note that the individual does not have to estimate his or her own subjective mortality rate. Our simulation provides the probability of beating the life annuity, conditional on survival.

### 3.4 Description of the Monte Carlo Simulation.

With full uncertainty in the model I can compute the probability of a successful deferral. The actual probability I are looking for can be written as:

$$
\begin{equation*}
\operatorname{Pr}\left[\frac{\widetilde{W}_{s}}{\widetilde{a}_{x+s}} \geq c\right] \tag{22}
\end{equation*}
$$

The crucial item, then, is to compute the distribution of the stochastic process $\widetilde{c}(s):=\widetilde{W}_{s} / \widetilde{a}_{x+s}$, which is the consumption attainable, at time $s$, and then compute the probability that $\widetilde{c}(s) \leq c$, the original consumption level.

I performed Monte Carlo simulations to obtain an empirical density function for values of $s=5,10,15,20$ years. In particular, for each simulation run, the algorithm generated a vector of 25,000 random numbers for $\widetilde{W}_{s}$, and a vector of 25,000 random numbers from $\widetilde{a}_{x+s}$. The procedure then took the element-by-element ratio of the two vectors to obtain 25,000 random samples from the density function $\widetilde{c}(s)$.

The program then (a) counted the number of elements in the random sample that were less than the original consumption level $c$, thus estimating $\operatorname{Pr}[\widetilde{c}(s) \leq c]$. I assumed the future evolution of interest rates will obey the interest rate dynamics with parameters $\bar{r}=0.085, \gamma=0.25$ and $\sigma_{r}=0.08$. Projecting ahead I compute the relevant interest rate, apply the relevant mortality table with a load of $l=10 \%$ to obtain an estimate for the future annuity price. Likewise, I assume that the initial wealth is invested and consumed as per the geometric Brownian motion with parameters $\mu=0.13, \sigma=0.17$ as per the Ibbotson figures for the return on a well diversified investment portfolio.

Here is a sample run. A 65 year-old male, in the year 2000, with $\$ 100,000$ in initial wealth, is contemplating buying a life annuity. The insurance company provides her with a quote of $a_{65}=\$ 11.027$ per dollar of life-time consumption. This translates into an annuitized consumption of $c=\frac{100000}{11.027}=\$ 9,068$ per year,

[^4]| Assumptions: $\mu=13 \%, \sigma=17 \%, l=10 \%$ |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | $r=5 \%$ | $r=7 \%$ | $r=9 \%$ |  |  |
| Wait | Male | Female | Male | Female | Male |
| Female |  |  |  |  |  |
| 5 yrs | $79.7 \%$ | $81.1 \%$ | $77.1 \%$ | $78.3 \%$ | $73.4 \%$ |
| $75.1 \%$ |  |  |  |  |  |
| 10 yrs | $83.4 \%$ | $86.3 \%$ | $79.5 \%$ | $81.6 \%$ | $74.2 \%$ |
| 15 yrs | $85.3 \%$ | $89.2 \%$ | $81.3 \%$ | $84.1 \%$ | $75.9 \%$ |
| 20 yrs | $85.8 \%$ | $90.1 \%$ | $83.9 \%$ | $85.3 \%$ | $77.3 \%$ |

Table 3: Simulation Results: Probability of 'Beating' the Life Annuity
which can not be outlived. Now, if the 65 year-old decides to defer annuitization while investing in -and consuming from a well balanced equity portfolio - the simulations indicate the following: If he waits for 10 years, there is a 80\% chance that he will able to purchase the same exact annuity, or better, with the remaining funds.

Moreover, the benefits of waiting are numerous. The 65 year old maintains liquidity, gains the utility of bequest and the possibility of an even greater annuity payment in the future.

After conducting a large variety of simulation runs, it appears that the probability of a successful deferral is most sensitive to (a) the current level of interest rates in the market vis a vis the risk premium, $\mu-r_{0}$, and (b) the annuity insurance load $l$. In contrast, the parameters of the interest rate process ( $\bar{r}, \gamma, \sigma_{r}$ ) have very little influence on the probability of a successful deferral. I believe this to be a direct manifestation of a 'plateau' effect. Either the individual will have many times the amount of money needed to purchase the same exact life annuity, $\widetilde{W}_{s} / \widetilde{a}_{x+s} \gg c$, or the individual will have very little funds with which to purchase the life annuity, $\widetilde{W}_{s} / \widetilde{a}_{x+s} \ll c$. Consequently, the uncertainty surrounding the future interest rates will have little effect on the probability of a successful deferral. It also appears that when interest rates are low $\left(r_{0}=5 \%\right)$ - in a mean reverting environment - the probability of a successful deferral is somewhat invariant to the composition of the investors portfolio. See Milevsky (1998) for extended restults using a variety of parameter values.

In conclusion, simulations indicate that in the current interest rate environment, a sixty five year old Female (Male) has a $85 \%$ ( $80 \%$ ) chance of being able to beat the rate of return from a life annuity until age eighty. One must remember that the above mentioned probabilities are all conditional on survival, thus, they uniformly over-estimate the unconditional probability of consumption shortfall.

### 3.4.1 Variable Immediate Annuities.

In some sense, comparing the performance of equity-based investments with fixed income products is misleading. Clearly, the reason we are able to beat the rate of return from the life annuity, is that we are investing in assets whose expected growth rate is higher than the return from (low risk) money market products. So, in some sense, one can argue that these results are driven by the long-term propensity of equity based investments, to outperform fixed income products, independently of the annuity structure. However, one must note that the equity (risky) return must do more than just 'beat' the return from fixed
income products, it must also beat the mortality credits. And indeed, our simulations indicate that this is possible up until ages 75-80.

Of course, for those who are reluctant to hold (risky) equity based investments as a substitute for the life annuity, the odds of beating the mortality credits are slim. Furthermore, if the implicit fees in the fixed immediate annuity are close to zero, the probability of 'beating' the life annuity with identical fixed income products is essentially zero as well. In other words, for the deferral strategy to make sense we must have two pre-conditions. First the fees must be 'high' enough, and second, the alternative portfolio must be tilted towards equity products.

One final note worth mentioning is that variable immediate annuities (VIAs) - which currently are not very popular or widely used in many countries - are likely to grow in stature as the current generation of equity investors realize that VIAs provide longevity insurance together with the highly cherished equity exposure. Indeed, in a related research paper by Charupat, Milevsky and Tuenter (2000) we document the substantial welfare gains that result from introducing VIAs to the market for longevity insurance. Basically, the optimal allocation within a payout annuity contract is identical to that outside of a payout annuity.

## 4 Conclusion

Life annuities provide valuable longevity insurance, that, arguably, is just as important as traditional life insurance. Obviously, very strong bequest motives combined with unfavorable product pricing can severely reduce the desirability and appeal of annuity-like products. Nevertheless, as I illustrated in Section 2, the benefits to eventual annuitization are overwhelming. With that in mind, this paper advocates a retirement strategy called: do-it-yourself and-then-switch. People who are reluctant to annuitize might consider creating their own annuity, by consuming at the same rate, so that there is a high enough probability of being able to purchase a similar product, later in retirement. This allows the individual to maintain full control of the funds and also participate in the long-term upward performance of equity markets, as convincingly argued by Jeremy Siegel (1995) in Stocks for the Long Run.

## 5 Technical Appendix

In this paper, I assume that the time-at-death random variable, denoted by $\widetilde{T}$, can be expressed in a continuous-time manner. For an individual currently aged $x$, the probability of death prior to time $t \geq 0$ (i.e., prior to age $x+t$ ) is modeled as:

$$
\begin{equation*}
\operatorname{Pr}(\widetilde{T} \leq t \mid x):=1-\left({ }_{t} p_{x}\right)=1-\exp \left\{-\int_{0}^{t} \lambda(x+s) d s\right\} \tag{23}
\end{equation*}
$$

where $\lambda(s)$ is the "force of mortality", and ${ }_{t} p_{x}$ is the conditional probability that an individual aged $x$ will survive to time $t$. The function $\lambda(s)$ can heuristically be described as the instantaneous probability of death, applicable at time $s$. Although this may not be true in general, especially for low ages, I assume that $\lambda(s)$ is a strictly positive and increasing function; i.e., $\lambda(s)>0$ and $\lambda^{\prime}(s) \geq 0$. Therefore, the function ${ }_{s} p_{x}$ is monotonically decreasing in $s$. For example, the conditional probability that an $x$-year-old individual will survive to age 60 , is clearly greater than the probability of surviving to age 61 . Also, by definition, ${ }_{0} p_{x}=1$ and ${ }_{\infty} p_{x}=0$. See the classic textbook by Bowers, et. al. (1986) for additional information on mortality functions.

Equation (23) should be interpreted as a proper cumulative distribution function (CDF), and denoted by $F(t)$, provided that $\int_{0}^{\infty} F^{\prime}(t \mid x) d t=\int_{0}^{\infty} f(t \mid x) d t=1$, where $f(t \mid x)$ is the probability density function (PDF) of the time-at-death random variable, for an individual aged $x$. This, of course, puts an additional restriction on the force of mortality $\lambda(s)$, namely:

$$
\begin{equation*}
F(\infty)=\int_{0}^{\infty} f(t \mid x) d t=\int_{0}^{\infty} \lambda(t) \exp \left\{-\int_{0}^{t} \lambda(s) d s\right\} d t=1 . \tag{24}
\end{equation*}
$$

It follows, therefore, from (23) that:

$$
\begin{equation*}
\int_{0}^{\infty}\left(t p_{x}\right) \lambda(t) d t=1 \tag{25}
\end{equation*}
$$

A simple application of the chain rule retrieves the convenient relationship:

$$
\begin{equation*}
\lambda(x+t)=\frac{f(t \mid x)}{1-F(t \mid x)} . \tag{26}
\end{equation*}
$$

Finally, the expected remaining lifetime in this framework is:

$$
\begin{equation*}
E[\widetilde{T} \mid x]=\int_{0}^{\infty} t f(t \mid x) d t:=\int_{0}^{\infty} t \lambda(x+t) \exp \left\{-\int_{0}^{t} \lambda(x+s) d s\right\} d t . \tag{27}
\end{equation*}
$$

As a special case, when $\lambda(s)$ is constant and equal to $\lambda$ for all ages and times, equation (23) leads to: $F(t \mid x)=1-e^{-\lambda t}$, and therefore $f(t \mid x)=\lambda e^{-\lambda t}$ and $E[\widetilde{T} \mid x]=1 / \lambda$. In other words, a constant $\lambda(s)=\lambda$ implies an exponential distribution of time-at-death. In this case, an individual's expected remaining lifetime is equal to the reciprocal of the force of mortality, regardless of his/her current age. Although this particular from is quite convenient to work with it obviously has the undesirable property that the probability of death is identical throughout the human lifecycle.

A more realistic continuous-time force-of-mortality assumption is the Gompertz law. The exact specification of this distribution is:

$$
\begin{equation*}
\lambda(x \mid m, b)=\frac{1}{b} \exp \{(x-m) / b\} \tag{28}
\end{equation*}
$$

Figure 2: The figure displays the force of mortality curve, starting at age 65, for males (dots) and females (solid), using the dynamically adjusted IAM2000 tables. The life expectancy for the male is 84.86 years and for the female it is 88.51 years


Accordingly, as per equation (23), the conditional probability of survival, is:

$$
\begin{equation*}
{ }_{t} p_{x}=\exp \left\{-\int_{0}^{t} \lambda(x+s) d s\right\}=\frac{\exp (\exp \{-m / b\}(1-\exp \{(x+t) / b\}))}{\exp (\exp \{-m / b\}(1-\exp \{x / b\}))} \tag{29}
\end{equation*}
$$

The parameter " $m$ " is the mode, and the parameter " $b$ " is the scale measure, of the probability distribution. The exact values of $m, b$ clearly depend on the cohort in question, as well as the type of mortality table being modeled.

For illustrative purposes, Figure 2 displays the 'force of mortality' curve - for males and females taken from the Individual Annuity Mortality (IAM) 2000 Table, provided by the Society of Actuaries. On a technical note, the data was dynamically projected using scale G and then smoothed using the abovementioned Gompertz specification. The exact parameters are: $m=88.18$ and $b=10.5$ for males, and $m=92.63$ and $b=8.78$ for females.Clearly, the force of mortality is higher, at all ages, for males compared to female.

## References

[1] A. Ando and F. Modigliani. "The Life Cycle Hypothesis of Saving". American Economic Review, 53(1):55-74, 1963.
[2] B. D. Bernheim. "How Strong Are Bequest Motives: Evidence Based on Estimates of the Demand for Life Insurance and Annuities". Journal of Political Economy, 99(5):899-927, 1991.
[3] N. Bowers, H. Gerber, J. Hickman, D. Jones, and C. Nesbit. Actuarial Mathematics. The Society of Actuaries, 1986.
[4] K. Chan, A. Karolyi, F. Longstaff, and A. Sanders. "An Empirical Comparison of Alternative Models of the Short-Term Interest Rate". The Journal of Finance, 47(3):1209-1227, July 1992.
[5] J. C. Cox, J. E. Ingersoll, and S. A. Ross. "A Theory of the Term Structure of Interest Rates". Econometrica, 53(2):385-407, March 1985.
[6] E. W. Frees, J. Carriere, and E. Valdez. "Annuity Valuation with Dependent Mortality". The Journal of Risk and Insurance, 63(2):229-261, 1996.
[7] B. M. Friedman and M. J. Warshawsky. "The Cost of Annuities: Implications for Saving Behavior and Bequests". Quarterly Journal of Economics, 105:135-154, 1990.
[8] M. D. Hurd. "Mortality Risk and Bequest". Econometrica, 57(4):779-813, July 1989.
[9] M. A. Milevsky. "Optimal Asset Allocation Towards The End of The Life Cycle: To Annuitize or Not to Annuitize?". The Journal of Risk and Insurance, 65(3):401-426, September 1998.
[10] T. W. Mirer. "The Dissaving of Annuity Wealth and Marketable Wealth In Retirement". Review of Income and Wealth, 40(1):87-97, March 1994.
[11] O. S. Mitchell, J. M. Poterba, M. J. Warshawsky, and J. Brown. "New Evidence on the Money's Worth of Individual Annuities". American Economic Review, to appear, (Working Paper 6002), 1999.
[12] J. J. Siegel. Stocks for the Long Run. Irwin Professional Publishing, Chicago, 1995.
[13] M. E. Yaari. "Uncertain Lifetime, Life Insurance and the Theory of the Consumer". Review of Economic Studies, pages 137-150, April 1965.


[^0]:    ${ }^{1}$ Finance Area Professor, Schulich School of Business, York University, 4700 Keele Street, Toronto, Ontario, Canada, M3J-1P3. Email: milevsky@yorku.ca, Tel: (416) 736-2100 ext: 66014, Fax: (416) 225-5034. This research was partially funded by a grant from the Social Sciences and Humanities Research Council of Canada, as well as a grant from TIAA-CREF (New York.) The author would like to thank Narat Charupat, Chris Robinson and Hans Tuenter for helpful comments and discussions - as well as Marina Sidelnikova, Aron Gotesman and Chris Kerr for excellent assistance - throughout the development of this research. Final Version: July 25, 2000

[^1]:    ${ }^{1}$ Of course, in this simple two period model, we do not need the Lagrangian since we can always write $C_{2}=1-C_{1}$ and convert the problem to one free variable with no constraints. But in the general $N$ period problem, this is how one would proceed.

[^2]:    ${ }^{2}$ One can "fit" the Gompertz distribution to any standard annuity table, to within 0.25 percent deviation in probability of death. Arguably, this approximation is good enough for our purposes, given the uncertainty we face in future investment returns and the analytic tractability of the Gompertz function.

[^3]:    ${ }^{3}$ Of course, the previous discussion assumes that the rate of return from the investment portfolio $(k)$ is constant. When $k$ itself is random, the probability of ruin will depend on the asset allocation within the portfolio, vis a vis the volatility of returns. See the related paper by Milevsky and Robinson (2000) for an analytic approximation to this 'ruin probability'.

[^4]:    ${ }^{4}$ For related research on how to price the uncertainty surrounding future mortality rates, please see Milevsky and Promislow (2000) .

