Market based tools for managing the life insurance company

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Abstract

In this paper we present an approach to market based valuation of life insurance policies, in the spirit of the NUMAT proposed by Hans Bühlmann (2002) in an editorial in the ASTIN Bulletin. We have experienced the valuation method for more than one decade, both as a pricing procedure applied to policy portfolios of leading insurance companies, and by including the valuation principles into several actuarial teaching activities.

Our interest is mainly focused here on participating policies that in Italy are characterized by contractually binding profit sharing rules. The problem of the fair valuation of the liabilities generated to the insurer by these contracts can be conveniently addressed using the methods of contingent claims pricing. These allow to price correctly the options embedded into the policies and to implement consistent plans of asset-liability management. The approach also provides a market based measurement of the value of business in force for outstanding policy portfolios and consistent assessments of the financial risk based capitals.

1 A NUMAT system from Italy

In line with the suggestions expressed by Hans Bühlmann in the proposal of the NUMAT approach (Bühlmann, 2002) and also in the discussion of the article by Aase and Persson (Bühlmann, 2003a), we describe here our experience in applying and teaching the financial approach in valuation of life insurance policies in Italy.

Our approach has been focused on two main issues:

- providing a mark-to-market (fair) valuation of the outstanding liabilities of an insurance company, jointly with the appropriate measures of sensitivity to financial risk factors, e.g. interest rate risk, that are essential for implementing a consistent plan of asset-liability management;
- derive a more reliable measure of the value embedded in business in force (VBIF), including a mark-to-market valuation of the financial options embedded into the policies.

It is worth mentioning that when applied to a single policy at the issue date the approach also provides a fair methodology for profit testing. Another important by-product is the derivation of the financial components of the risk based capital of the outstanding portfolio. This is typically done by properly stressing the risk factors of the valuation model and then repeating the pricing procedure under the "worst case scenario".

Virtually all life insurance policies in Italy provide benefits which are explicitly linked to the return of a reference fund, in which the technical reserves must be invested. This kind of profit sharing mechanism is not discretionary for the insurer, but rather it is one of the terms of the contract. Using the language of the option pricing theory, the financial component of a policy can thus be considered as a derivative contract having the reference fund as the underlying asset. Therefore it is natural to perform the financial valuation of both the assets (the reference fund) and the liabilities (the promised benefits) using an appropriate stochastic pricing model based on the no-arbitrage principle.

In 1993-94 we applied for the first time this methodology to the valuation of a portfolio of participating policies issued by INA (Istituto Nazionale delle Assicurazioni), the so-called "3/N" policies. These policies were annual premium endowments having premiums and benefits linked both to the reference fund return and to the consumer price index. The pricing of 3/N policies was performed using an extended Cox-Ingersoll-Ross model, including both real and nominal interest rates. As it usually happens, the indexation rule was rather complex and Monte Carlo procedures were used to implement the no-arbitrage valuation. One of the main goals was to verify if the amount of (inflation) indexed bonds held by the insurer into the reference fund was properly calibrated in order to hedge the inflation risk generated by the 3/N liabilities. We found that the index-linked bonds were overweighted in the investment portfolio ¹.

The teaching activity on these issues started in 1991 at the Scuola Normale Superiore di Pisa and at the Istituto Italiano degli Attuari². The topics included both the theoretical foundations of the approach and the analysis of case studies, supported by explicit software procedures. The courses have been organized for the needs of the actuarial professionals, but a few places were offered on a no cost basis to academic institutions.

In July 2002, we presented the approach at the Summer School of the Groupe Consultatif Actuariel Europeen, in Milan. The lecture notes of the course (De Felice, Moriconi, 2002b) are available on the website www.GCActuaries.org/events.html.

The valuation methodology has been coded in a software application, enforced by a corresponding database, forming the implementation of what today would be called a NUMAT-based system.

Early versions of this system were installed at SAI in 1997, in order to design pension plans with minimum guarantees; successively the system was enhanced and extended to all the outstanding policy portfolios of all the companies of the SAI Group, and finally of the Fondiaria-SAI Group. The system is applied both to the asset-liability management and to the control of the evolution of the embedded value and the cost of the minimum guarantees options. In 1999 the system has also been adopted by all the companies of Gruppo Reale Mutua Assicurazioni and by Cisalpina Previdenza and Roma Vita (at present merged in Fineco Vita).

Alleanza Assicurazioni is also using the system since 2000. The valuation procedures are running with monthly frequency and are used for providing management indications to the investment department and for monitoring the VBIF. The deeper understanding of

¹The results of this study were presented in the talk "Valuation of Index-Linked Life Insurance Policies with Minimum Guarantees by Stochastic Models for Real and Nominal Interest Rates" at the Conference on *Recent Advances in Mathematical Finance*, Cortona, May 29-June 3, 1994.

 $^{^{2}}$ Courses have been held on Interest rate risk control and CIR model (1991-92); Asset-liability management in life insurance (1995-96); Management of pension funds (1997); Embedded value calculation in life insurance (2001-02).

the price determinants of the embedded options has stimulated the construction of new life products having a reduced cost of the minimum guarantees. These new policies have been recently issued on the market.

RAS Group adopted the methodology in 2001 in order to measure the risk based capital of the outstanding portfolios. In this case we extended the system to non-life portfolios. The embedded value measurement and the pricing of the embedded options were obtained as by-product of the risk capital valuation. Indications provided by the valuation procedures stimulated a re-styling process of the policies.

From the point of view of NUMAT approach it is important to stress that the system is employed in educational activities within the above companies.

In the rest of the paper we provide an illustration of our approach to the market based valuation of life insurance policies. To simplify the exposition we mainly refer to the simple case of pure endowment profit sharing policies. However the pricing model we specify is suited for providing a unified valuation of both the outstanding liabilities of a general policy portfolio and the assets of the fund where the earned premiums are invested.

2 The valuation framework

2.1 A simplified contract

To understand the valuation framework it suffices to illustrate our procedure with the simple case of a single premium pure endowment insurance contract, written at time 0 for a life with age x, with term T years and initial sum insured C_0 . Assume that the policy is a participating one, or "with profit", in which the benefit C_T that will be paid by the insurer if the policyholder is alive at time T is determined by incrementing each year the sum insured by a fraction β of the interest earned by the insurer on the investment of the premium ³.

Let F_t be the market value at time t of the fund where the premium is invested. The rate of return earned by the fund in year [t-1, t] is:

$$I_t := \frac{F_t}{F_{t-1}} - 1\,; \tag{1}$$

obviously I_t is a random variable which can also assume negative values. Let us assume that the basic actuarial calculations are performed at the technical interest rate i. The Italian system for profit sharing policies then provides that if $I_t > i$ a portion of the extra earned interest is credited to the insured by an increase of the sum insured. A typical interest crediting mechanism is obtained by readjusting the benefit at the end of the year t with the rule:

$$C_t = C_{t-1} (1 + \rho_t), \quad t = 1, 2, \dots, T,$$
(2)

where the readjustment rate is defined as:

$$\rho_t := \frac{\max\left\{\beta I_t, \, i\right\} - i}{1 + i}\,; \tag{3}$$

 $^{^{3}}$ We refer to the case of a participating policy since this seems to provide the most challenging application of the NUMAT method. For unit-linked and index-linked policies the market based valuation approach appears to be natural (and probably unavoidable). A detailed example of NUMAT valuation of a participating whole life insurance contract can be found in Pacati (2003).

here $\beta \in (0,1)$ is the so called "participation coefficient". Both the technical rate *i* and the β coefficient are contractually specified, that is fixed at time zero.

The quantity βI_t in expression (3) represents the portion of the fund return which is credited to the policyholder (by increasing the sum assured); the remaining portion $(1 - \beta) I_t$ is retained by the insurer and determines his investment gain. The floor rate *i* guarantees to the policyholder that the sum insured cannot decrease; thus the insurer must guarantee the readjusted benefit C_t even if the reference fund does not realize the technical rate *i* in year *t*.

Under this profit sharing rule, the final benefit is given by:

$$C_T = C_0 \Phi_T \,,$$

where the readjustment factor Φ_T is defined as:

$$\Phi_T := \prod_{t=1}^T (1+\rho_t) = (1+i)^{-T} \prod_{t=1}^T (1+\max\left\{\beta I_t, i\right\}).$$
(4)

Let $\mathcal{E}(x,T)$ denote the event "the life insured aged x is alive at time T", and let $\mathbb{I}_{\mathcal{E}(x,T)}$ denote the indicator function of $\mathcal{E}(x,T)$. The liability Y_T of the insurer at time T is given by:

$$Y_T = C_0 \Phi_T \mathbb{I}_{\mathcal{E}(x,T)}; \tag{5}$$

hence the random payoff Y_T is affected by both financial and "technical" (actuarial) uncertainty.

2.2 Linear valuation

We assume that all the random variables concerning the valuation problem are defined on a probability space (Ω, \mathcal{A}, P) , where P is the probability measure we assume to describe all random movements in time (natural probability measure). In order to model financial and technical uncertainty, we also assume that two sub- σ -algebras can be defined: \mathcal{F} , containing the financial events, and \mathcal{T} , which contains the technical events. Correspondingly, we also consider the two filtrations:

$$\mathcal{F}_0 \subset \mathcal{F}_1 \subset \cdots \subset \mathcal{F}_t \subset \cdots \subset \mathcal{F}; \qquad \mathcal{T}_0 \subset \mathcal{T}_1 \subset \cdots \subset \mathcal{T}_t \subset \cdots \subset \mathcal{T}.$$

By definition, Φ_T is \mathcal{F}_T -measurable and $\mathbb{I}_{\mathcal{E}(x,T)}$ is \mathcal{T}_T -measurable.

We are interested in assigning a value at time t to the random variable Y_T payable at time T. We call this map the Valuation Functional, denoted by $V(t; Y_T)$. Again it suffices here to explain our procedure, if we show how to find $V(0; Y_T)$ (valuation at the beginning of the policy).

The functional $V(0; Y_T)$ should avoid riskless arbitrage opportunities; hence it must have the following representation:

$$V(0;Y_T) = \mathbf{E}^P[\pi_T Y_T], \qquad (6)$$

where \mathbf{E}^{P} is the conditional expectation, given \mathcal{A}_{0} , under the natural measure P and π_{T} (the "state-price deflator") is a strictly positive \mathcal{A}_{T} -measurable random variable ⁴. This

$$V(0;Y_T) = \int_{-\infty}^{\infty} \pi_T(y) Y_T(y) f_T(y) dy = \int_{-\infty}^{\infty} Y_T(y) \psi_T(y) dy,$$

⁴If $f_T(y)$ is the probability density function of Y_T , we can also write:

result is a central one in the theory of arbitrage pricing (see e.g. Duffie (1992)). It can also be derived by the Riesz representation theorem if the linearity of the Valuation Functional V is required (see also Bühlmann (1995)).

We assume independence between financial and technical uncertainty; more precisely, we assume that \mathcal{F} and \mathcal{T} are independent and that the deflator π_T can be expressed as the product of two strictly positive random variables:

$$\pi_T = \varphi_T \,\chi_T \,, \tag{7}$$

where φ_T , the financial deflator, is \mathcal{F}_T -measurable and χ_T , the technical deflator, is \mathcal{T}_T -measurable ⁵. Under this assumption the following factorization holds:

$$V(0; Y_T) = C_0 \mathbf{E}^P \big[\varphi_T \Phi_T \big] \mathbf{E}^P \big[\chi_T \mathbb{I}_{\mathcal{E}(x,T)} \big].$$
(8)

2.3 Financial component

We can interpret the readjustment factor Φ_T as the stochastic payoff of an indexed Zero-Coupon Bond (ZCB), called U, maturing at time T. The reference index of U is the annual return I_t of the investment fund and the indexation rule is specified by the definition (4). By the separation property (8) the value of this indexed ZCB at time zero is equal to:

$$u(0,T) := V(0;\Phi_T) = \mathbf{E}^P[\varphi_T \,\Phi_T].$$
(9)

It is important to distinguish (9) from a usual non-indexed ZCB with deterministic payoff $\mathbf{1}_T$ (one unit of cash at time T), for which we have:

$$v(0,T) := V(0;\mathbf{1}_T) = \mathbf{E}^P[\varphi_T].$$
(10)

Assuming the financial market to be complete the payoff Φ_T (and of course also $\mathbf{1}_T$) can be replicated by a suitable trading strategy and the price u(0,T) must be equal to the market price of this strategy, independently of the probability assessment and the risk aversion of the insurer. It is well-known that in this case there exists a unique equivalent probability measure Q such that:

$$\mathbf{E}^{P}[\varphi_{T} \Phi_{T}] = \mathbf{E}^{Q} \left[e^{-\int_{0}^{T} r_{t} dt} \Phi_{T} \right], \qquad (11)$$

where \mathbf{E}^Q is the expectation taken with respect to the Q measure and r_t is the stochastic force of interest (the so-called "spot rate") prevailing on the market at time t for riskless (i.e. not defaultable) investments. The Q measure is also referred to as the risk-neutral measure, since the price of $V(0; \Phi_T)$ can be expressed as the expectation, under Q, of the terminal payoff Φ_T discounted with the stochastic discount factor $\exp(-\int_0^T r_t dt)$. In other words, one can "neutralize" the risk premia contained in the deflator φ_T using the Q measure instead of the natural measure P.

where $\psi_T(y) := \pi_T(y) f_T(y)$ is the so-called state-price density.

⁵In more general situations the policy can be also surrendered. In this case the independence assumption in general is too strong, since the option to early redeem the contract can be exercised by the policyholder based on financial market events. However, for policies where early redemption is strongly penalized it could be never optimal to exercise the surrender option. In these cases redemptions seems to be essentially driven by the evolution of personal consumption plans and one can retain the independence assumption, modelling surrenders as "technical" events, described by experience-based elimination tables.

2.4 Technical component

For the technical component of the valuation problem, we look at:

$$V\left(0; \mathbb{I}_{\mathcal{E}(x,T)}\right) := \mathbf{E}^{P}\left[\chi_{T} \,\mathbb{I}_{\mathcal{E}(x,T)}\right],\tag{12}$$

as the time zero value of $\mathbb{I}_{\mathcal{E}(x,T)}$. It is natural to assume:

$$V(0;\mathbf{1}_T) = 1, \tag{13}$$

which implicitly states that no discounting effect is involved in this valuation, the "price of time" being completely taken into account by the financial component of the pricing procedure ⁶. A crucial point now is that usually the technical "payoff" $\mathbb{I}_{\mathcal{E}(x,T)}$ cannot be replicated by traded contracts. Hence the complete market assumption is not fulfilled and the price $V(0; \mathbb{I}_{\mathcal{E}(x,T)})$ cannot be determined by observing the market ⁷. However, since the assumption (13) implies the norming condition $\mathbf{E}^{P}[\chi_{T}] = 1$, we can write:

$$V\left(0; \mathbb{I}_{\mathcal{E}(x,T)}\right) = \mathbf{E}^{D}\left[\mathbb{I}_{\mathcal{E}(x,T)}\right], \qquad (14)$$

where D is a transformed probability measure defined by $dD = \chi_T dP$. The use of an "adjusted" probability measure to preserve price additivity was suggested by Venter (1991). The idea has been developed by Wang (1996, 2000, 2002) who proposed a number of "distortion" functions of the P measure providing desirable properties of the price functional.

Once the D measure has been chosen by the insurer, the quantity:

$$\overline{\overline{C}}_0 := C_0 \mathbf{E}^D \left[\mathbb{I}_{\mathcal{E}(x,T)} \right] \,,$$

can be considered as a definition of the certainty equivalent, at time T, of the random amount $C_0 \mathbb{I}_{\mathcal{E}(x,T)}$. As the P measure represents the natural probability assessment of the insurer, the difference:

$$C_0 \left\{ \mathbf{E}^D \left[\mathbb{I}_{\mathcal{E}(x,T)} \right] - \mathbf{E}^P \left[\mathbb{I}_{\mathcal{E}(x,T)} \right] \right\} ,$$

expresses the risk loading (at time T) required for bearing the survival risk. For the relations between this approach and the expected utility theory see Wang (1996).

⁶In a more formal setting we could define two different valuation functionals:

$$V^F(0;\Phi_T) := \mathbf{E}^P[\varphi_T \, \Phi_T], \quad V^T \quad 0; \mathbb{I}_{\mathcal{E}(x,T)} \quad := \mathbf{E}^P \quad \chi_T \, \mathbb{I}_{\mathcal{E}(x,T)} \quad :$$

and express the factorization property (8) as:

$$V(0; Y_T) = C_0 V^F(0; \Phi_T) V^T \quad 0; \mathbb{I}_{\mathcal{E}(x,T)}$$

In this framework it would be natural to consider the discounting effect to be taken into account in the V^F component by definition. Hence condition (13), which should be written as $V^T(0; \mathbb{I}_{\Omega}) = 1$, would follow as a consequence of the no-arbitrage assumption.

⁷Even if the reinsurance markets can not be considered as being purely competitive, some useful indications for a market based assessment of $V(0; \mathbb{I}_{\mathcal{E}(x,T)})$ could however be obtained by observing the current prices of reinsurance treaties for mortality risk.

2.5 The numeraire

Under this set of assumptions, the time zero price of the random benefit Y_T can be given as:

$$V(0;Y_T) = C_0 \mathbf{E}^Q \left[e^{-\int_0^T r_t \, dt} \Phi_T \right] \mathbf{E}^D \left[\mathbb{I}_{\mathcal{E}(x,T)} \right] \,. \tag{15}$$

The technical expectation can be expressed by the usual actuarial notation, that is:

$$\mathbf{E}^{D}\left[\mathbb{I}_{\mathcal{E}(x,T)}\right] = {}_{T}p_{x}\,,\tag{16}$$

where the probability $_Tp_x$ is computed using suitable mortality tables. The risk-neutral expectation provides the price of the indexed ZCB U:

$$u(0,T) = \mathbf{E}^Q \left[e^{-\int_0^T r_t \, dt} \, \Phi_T \right] \,. \tag{17}$$

Then the expression (15) can be written as:

$$V(0;Y_T) = C_0 u(0,T) {}_T p_x.$$
(18)

The structure of this expression is similar to the expression of the technical reserve R_0 of the policy at time zero; in the traditional framework we have:

$$R_0 = C_0 (1+i)^{-T} {}_T p_x , \qquad (19)$$

where *i* is the technical rate and $_Tp_x$ is computed using "first order" mortality tables. It is however clear that (18) and (19) represent very different valuation approaches; in particular, u(0,T) can be interpreted as a market based discount factor, as opposed to the contractual discount factor $(1 + i)^{-T}$.

The expression (18) makes also clear that the financial component of this valuation approach is – using Bühlmann's terminology – a numeraire approach; we can consider the benefit Y_T provided by the participating pure endowment policy as expressed in "units" of the indexed ZCB U; the current price of the benefit is given by $\overline{\overline{C}}_0 := C_0 T p_x$ times the current market price u(0,T) of the unit.

One can also define:

$$V^*(0; Y_T) := \frac{V(0; Y_T)}{u(0, T)}, \qquad (20)$$

where $V^* = \overline{\overline{C}}_0$ is the relative price of Y_T with respect to U, that is the price of Y_T measured in units of U rather than in Euros. In financial economics, expressing the price by V^* instead of V is usually referred to as a "change of numeraire".

As a particular case, one can consider a non participating policy, where $C_T = C_0$ (i.e. $\Phi_T = \mathbf{1}_T$); now one has:

$$V(0;Y_T) = C_0 v(0,T) {}_T p_x, \qquad (21)$$

where:

$$v(0,T) := \mathbf{E}^Q \left[e^{-\int_0^T r_t \, dt} \right] \,, \tag{22}$$

is the risk free discount factor prevailing on the financial market at time zero for the maturity T; that is the current price of the default free unit discount bond maturing at time T ($B_0(T)$ in the Aase-Persson (2003) notation).

3 Fair valuation, VBIF and embedded options

If we are able to determine the market value u(0,T) of the unit, expression (18) provides a market based valuation of the outstanding liabilities generated by the policy, what is usually said a *fair valuation*⁸. Since u(0,T) must be typically derived using an appropriate stochastic pricing model, we usually refer to $V_0 := V(0; Y_T)$ as the *stochastic reserve*, as opposed to the traditional reserve R_0 given by (19).

3.1 Value of Business in Force: the stochastic reserve approach

Under the assumption of complete financial market, the payoff C_T can be replicated by a trading strategy and the amount $C_0 u(0,T)$ represents the market price at time zero of the equivalent portfolio, that is of the the dynamic portfolio of traded securities which replicates the stochastic benefit C_T . Therefore, assuming that the mortality risk can be "diversified away" in a large portfolio, the stochastic reserve V_0 represents the market price at time zero of the portfolio which replicates the stochastic liability Y_T of the insurer. It is then natural to define the time zero value E_0 of the business in force (the so called VBIF, net of expenses, administrative costs and taxes), as the difference:

$$E_0 := R_0 - V_0 \,. \tag{23}$$

The interpretation of this expression is straightforward. The technical reserve R_0 is the capital required at time zero to the insurer in order to issue the policy ⁹, while V_0 is the investment actually needed at time zero to meet the future liabilities. The difference $E_0 = R_0 - V_0$, which usually should be positive, is not immediately available to the insurer, but will be progressively delivered in the future as profits emerging during the life of the policy; however the present value of these profits, by arbitrage, must be equal to E_0 .

This method for determining E_0 can be called the "stochastic reserve approach". Usual decompositions of VBIF, e.g. separation between investment component and mortality component, can be recovered under this method by using different specifications of the probability $_Tp_x$ in (18). We considered here VBIF at time zero only for illustration; all the definitions can be immediately extended at any time t during the life of the policy, as illustrated in section (5.4).

3.2 The annual profits approach

The standard method for measuring VBIF is an "annual profits approach". The method is based on typical recursive relations for the technical reserve which allows to define an annual sequence of expected technical gains \overline{G}_t during all the life of the policy (a typical

⁸The International Accounting Standards Committee (IASC) in the Insurance Issues Paper (November 1999) defines the fair value as: "The amount for which an asset could be exchanged, or a liability settled, between knowledgeable, willing parties in an arm's-length transaction." A similar definition is adopted by the Financial Accounting Standard Board (FASB) in a Preliminary Views document (December, 1999): "Fair value is an estimate of the price an entity would have realized if it had sold an asset or paid if it had been relieved of a liability on the reporting date in an arm's-length exchange motivated by normal business considerations. That is, it is an estimate of an exit price determined by market interactions." By acknowledging these positions, the CAS Fair Value Task Force defined fair value as: "the market value, if a sufficiently active market exists, OR an estimated market value, otherwise."

⁹We do not consider here the capital requirements given by the regulatory solvency margin.

expression of this is known as the Homans formula). The cash-flow \overline{G}_t can be considered as the expected annual profit to the insurer provided by the policy at the end of year t and the VBIF is obtained as the present value of this cash-flow stream, derived under "Risk Adjusted Discounting" (RAD), that is by using a risk adjusted discount rate appropriate to the riskiness of the cash-flows. It is also usual a decomposition of VBIF based on the definition of investment gains and mortality gains.

It can be easily proven (De Felice-Moriconi (2002b, p. 94)) that under the no-arbitrage assumption in perfect markets the annual profits approach is equivalent to the stochastic reserve approach, provided that the traditional method is applied in a market based framework. This means that the expected annual gains must be derived under the risk-neutral measure Q and then discounted at the risk free market rate. As we know, this approach correctly takes into account risk premia, and avoids arbitrage opportunities if the value E_0 is used as a market price. In principle, the RAD method is not inconsistent with the no-arbitrage approach; the Capital Asset Pricing Model, for example, prescribes – once the riskiness of the cash flow to be discounted has been correctly measured –, the correct risk adjusted discount rate which provides a market based, and arbitrage-free, valuation. However, in the applications the RAD approach suffers of the high degree of subjectivity involved in the practical assessment of both the expected cash-flows and the risk adjusted rate ¹⁰.

One can have even more important problems with the RAD method when option-like payoffs are considered, as it happens in our life insurance applications. Usually the RAD method is applied as a single-scenario method; that is a single assumption is made on the future path of the returns from the investment of the reserve. This scenario of returns can be interpreted as the expected evolution of future return; the expected investment gains are determined by inputing these returns into the recursive equation. In typical situations the options embedded into the life insurance policies are out-of-the-money, that is the minimum guaranteed annual return (usually the technical interest rate i) is below the level of the assumed scenario returns; therefore the embedded options never goes in-the-money and the cost of the minimum annual guarantees is zero.

A comparison between VBIF computed on a sample portfolio by the stochastic reserve approach and by the RAD method under scenario is provided in De Felice-Moriconi (2002b, p. 106).

3.3 The embedded options

In order to measure the cost of the minimum guarantees embedded in the insurance contract, one can compare the value of the policy with the "base value" of the policy, that is the value of an analogous policy without any guarantee. Let us define the "base readjustment rate" as:

$$\rho_t^B := \frac{\beta I_t - i}{1+i} \,,$$

¹⁰This difficulty is explicitly recognized by many scholars. Referring to the problem of properly specifying the exact evolution over time of the discounted expected value representation, Dybvig-Ross (1987, p. 104) argue that "This difficulty is usually overlooked in capital budgeting applications, which is probably not so bad, given the imprecision of our estimates of risk premia and future cash flows". Le Roy (1987, p. 948) observes that when the net present value principle is applied in incomplete markets under uncertainty "even if all agents agree about the probability distribution of the returns on a project, unanimity may break down".

and the "base readjustment factor" as:

$$\Phi_T^B := \prod_{t=1}^T \left(1 + \rho_t^B \right) = (1+i)^{-T} \prod_{t=1}^T \left(1 + \beta I_t \right)$$

Obviously $\Phi_T^B \leq \Phi_T$.

Under the market based approach, the "base value" of the contract is given by:

$$B_0 := C_0 V\left(0; \Phi_T^B\right) {}_T p_x \,, \tag{24}$$

where:

$$V\left(0;\Phi_{T}^{B}\right) = \mathbf{E}^{Q}\left[e^{-\int_{0}^{T}r_{t}\,dt}\,\Phi_{T}^{B}\right]\,.$$
(25)

Thus the value of the guarantee can be defined as:

$$Put_{0} := V_{0} - B_{0} = C_{0} \left[V(0; \Phi_{T}) - V(0; \Phi_{T}^{B}) \right] {}_{T}p_{x}.$$
(26)

The Put₀ value can be defined as the price of a put option because a contract with payoff $[\Phi_T - \Phi_T^B]^+ = \Phi_T - \Phi_T^B$ gives the right to the holder to exchange the result Φ_T^B of an unguaranteed contract with the result of the guaranteed one if the return I_t realized by the reference fund will not be greater than i/β over each year of the contract. Given that the minimum return i is guaranteed in each year and is "consolidated" for the successive years, this kind of option is a "ratchet-type" (or "cliquet") option. Of course, the price Put₀ of this option is usually much greater than the price of a corresponding "maturity option", that is an option with (unit) minimum guaranteed amount $(1 + i)^T$ at time T (for some numerical examples, see De Felice-Moriconi (2002b, pp. 61-62)).

The expression:

$$V_0 = B_0 + \operatorname{Put}_0,$$
 (27)

can be referred to as the put decomposition of the contract. One can also define the "call decomposition" as:

$$V_0 = G_0 + \operatorname{Call}_0, \qquad (28)$$

where $G_0 := C_0 v(0, T)_T p_x$ is the value of the minimum guaranteed terminal benefit (which is obtained for $\Phi = 1$), and:

$$Call_0 := V_0 - G_0 = C_0 \left[u(0, T) - v(0, T) \right]_T p_x, \qquad (29)$$

represents the price of the ratchet call option giving to the holder the right to participate to the investment returns if the result will be greater than the minimum guaranteed result. We observe that in Bühlmann's terminology, G_0 is the value of the VaPo (see Bühlmann (2003b), Baumgartner-Bühlmann-Koller (2004)).

4 Determining the valuation factor or "pricing the unit"

4.1 Extracting information from the market

The central problem under the NUMAT approach is the pricing of the unit U, that is the market based determination of the price $u(0,T) = V(0;\Phi_T)$; since:

$$V(0;C_T) = C_0 u(0,T), \qquad (30)$$

u(0,T) represents the appropriate valuation factor for the random benefit $C_T = C_0 \Phi_T$.

We observed that for non participating policies, that is when $\Phi_T = 1$, the valuation factor reduces to v(0,T), that is it is equal to the current price of the default free unit ZCB with maturity T. In this case the determination of the market price does not pose any serious problem. In fact the determination of v(0,T) for maturity $T \leq 30$ years is an ordinary job for the financial operators. Currently swap rates w_T for maturity up to 30 years are daily quoted on the interest rate swap market (e.g. Euribor); as it is wellknown, w_T represents the T-years par-yield, that is the level of the annual coupon of a unit straight bond which is quoted at par (i.e. has price 1):

$$w_T = \frac{1 - v(0, T)}{\sum_{t=1}^T v(0, t)}.$$

Therefore, if one can observe the current values of w_T for T = 1, 2, ..., 30, one can immediately derive the zero-coupon term structure v(0,T) for $T = 1, 2, ..., 30^{-11}$. The method is referred to as a "bootstrapping procedure", but it consists in nothing else than solving the linear system:

$$w_T \sum_{t=1}^{T-1} v(0,t) + (1+w_T) v(0,T) = 1, \quad T = 1, 2, \dots, 30.$$
(31)

In the trivial case of $\Phi_T = 1$ we can directly extract from the market the information needed for the valuation, and the explicit determination of the risk-neutral measure Q in (22) is not required.

Things are not so simple for a participating policy since, given the complexity of the interest crediting mechanism given by (2) and (3), the readjustment factor Φ_T represents the payoff of a security, the unit, which is not effectively traded. However, for the complete market assumption, this unit is a redundant security and can be priced via equation (17) using a suitable stochastic model calibrated on the market data.

To illustrate this crucial point, let us assume for the moment that the reference fund Funderlying the policy is composed only of interest rate sensitive contracts (e.g. government bonds), so that the factor Φ_T is affected only by interest rate risk. In this case a stochastic model for interest rates is sufficient for pricing the unit. For simplicity sake, assume a typical one-factor Markov model having the spot rate r_t as the state variable; hence, a complete identification of the model will require the specification of a parameter vector \mathbf{p} determining the conditional probability distribution of the spot rate process, and a parameter vector \mathbf{r} representing the structure of the risk premia (the "term premia") prevailing on the interest rate market. Clearly, the parameters \mathbf{p} determine the (financial component of) the probability measure P; however the risk-neutral valuation rule (17)

¹¹The maturities effectively quoted are T = 1 to 10, 12, 15, 20, 25, 30; usually the annual sequence of the swap rates is completed by some kind of interpolation.

prescribes the prices as being determined only by the risk adjusted measure Q. This probability measure will be identified by a new parameter vector $\hat{\mathbf{p}}$ whose components will be some function of the components of \mathbf{p} and \mathbf{r} . In general the knowledge of \mathbf{p} and \mathbf{r} separately cannot be inferred from the knowledge of the risk adjusted parameter vector $\hat{\mathbf{p}}$; however only $\hat{\mathbf{p}}$ is needed for pricing purposes.

Suppose that the model provides an explicit formula for the price of an interest rate sensitive security, e.g. for the price v(0,T) of the unit ZCB; for a fixed maturity T the bond price will be a function only of the risk adjusted parameters $\hat{\mathbf{p}}$:

$$v(0,T) = v(0,T;\widehat{\mathbf{p}})$$

Thus we can identify the risk-neutral measure Q by a calibration procedure consisting in estimating the parameters $\hat{\mathbf{p}}$ which provide a best fitting between model prices and observed prices. For example we can extract the information contained in the current structure of the interest rate swap w_T by minimizing over the set of the possible values for $\hat{\mathbf{p}}$ the sum of squared errors:

$$\Sigma^{2} := \sum_{T=1}^{30} \left[W_{T}(\widehat{\mathbf{p}}) - 1 \right]^{2}, \qquad (32)$$

where:

$$W_T(\hat{\mathbf{p}}) := w_T \sum_{t=1}^{T-1} v(0,t;\hat{\mathbf{p}}) + (1+w_T) v(0,T;\hat{\mathbf{p}}),$$

is the model price of a T-years unit straight bond with coupons equal to w_T .

4.2 Specification of the valuation model

Typically the reference funds backing life insurance liabilities contain both bonds and stocks (at least); thus in order to model properly the yearly returns I_t which determine the readjustment of the contractual benefits we have to model both interest rate and stock market risk ¹².

In many applications we adopt a two-factor diffusion model obtained by joining a one-factor Cox-Ingersoll-Ross (CIR) model for the interest rate risk and a Black-Scholes (BS) model for the stock market risk; the two sources of uncertainty are correlated. For liabilities providing also inflation protection a three-factor model, obtained by properly extending the CIR component in order to include both real and nominal interest rates (see Moriconi 1994, 1995), is employed.

4.2.1 Interest rate uncertainty

The single source of uncertainty is the spot rate r_t , which is a diffusion process described by the stochastic differential equation:

$$dr_t = f^r(r_t, t) \, dt + g^r(r_t, t) \, dZ_t^r \,, \tag{33}$$

¹²As a general consistency rule, assets and liabilities must be valued under the same market model; thus the valuation model must have at least as many risk factors as are required to price the asset portfolio. Of course, additional factors are needed if the liabilities are also linked to some exogenous market index; for example, if the policy also provides some kind of inflation protection of benefits, the valuation model for the liabilities must include an additional source of uncertainty for the real interest rate risk, independently of inflation linked bonds are held in the reference fund.

where Z_t^r is a standard Brownian motion. In the CIR model the drift function is chosen as:

$$f^r(r_t, t) := \alpha (\gamma - r_t), \quad \alpha, \gamma > 0,$$

and the diffusion function is defined by:

$$g^r(r_t,t) := \rho \sqrt{r_t}, \quad \rho > 0.$$

Thus it is assumed a mean-reverting drift, with long term rate γ and speed of adjustment α , and a "square root" diffusion, with volatility parameter ρ . As it is well-known, this "mean-reverting square-root" process implies a non-central chi-squared transition density for r_t (Feller, 1951).

The Vasicek model (and its usual extensions) is more simple than the CIR model and is widely used for pricing interest rate derivatives. Since this model assumes a normal transition distribution, it assigns positive probability to negative values of the spot rate; for long maturities this can have relevant effects, producing discount factors greater than one. Therefore the Vasicek model appears inadequate to life insurance applications. The CIR model seems to offer a good trade-off between economic consistency and mathematical tractability.

In the CIR model the preferences prevailing on the market (the market price of interest rate risk) are specified by the function:

$$h^r(r_t,t) := \pi \frac{\sqrt{r_t}}{\rho}, \quad \pi \in \mathbb{R};$$

hence the parameter vector for the risk premia is simply $\mathbf{r} = \{\pi\}$. Under the CIR approach – which is a general equilibrium approach – it is shown that this form of the preference function avoids riskless arbitrage.

4.2.2 Stock price uncertainty

Also for the stock market we assume a single source of uncertainty, expressed by the stock index S_t ; the diffusion process for the stock index is given by the stochastic differential equation:

$$dS_t = f^S(S_t, t) \, dt + g^S(S_t, t) \, dZ_t^S \,, \tag{34}$$

where Z_t^S is a standard Brownian motion with the property:

$$\mathbf{Cov}_t[dZ_t^r, \, dZ_t^S] = \eta \, dt \,, \quad \eta \in \mathbb{R} \,.$$

Since we assume a BS-type model, we specify f^S and g^S as:

$$f^S(S_t,t) := \mu S_t, \quad \mu \in \mathbb{R}$$

and:

$$g^S(S_t, t) := \sigma S_t \,, \quad \sigma > 0$$

Thus we have a geometric Brownian motion, with instantaneous expected return μ and volatility σ , which implies a lognormal transition density for S_t .

To prevent arbitrage, the market price of risk for the stock market has the classical form:

$$h^{S}(S_{t},t) := \frac{\mu - r_{t}}{\sigma}; \qquad (35)$$

thus no additional parameter is needed in order to specify the preferences in this case 13 .

4.2.3 The valuation equation

By the Markov property, the time t price of any security is a function of the state variables; in particular, for the unit price we have:

$$u(t,T) = u(r_t, S_t, t;T), \quad 0 \le t \le T.$$
 (36)

Under the usual perfect market conditions the no-arbitrage principle, via the hedging argument, leads to the general valuation equation:

$$\frac{1}{2} (g^r)^2 \frac{\partial^2 u}{\partial r^2} + \frac{1}{2} (g^S)^2 \frac{\partial^2 u}{\partial S^2} + \eta g^r g^S \frac{\partial^2 u}{\partial r \partial S}
+ (f^r + g^r h^r) \frac{\partial u}{\partial r} + (f^S + g^S h^S) \frac{\partial u}{\partial S} + \frac{\partial u}{\partial t} = r u.$$
(37)

This equation must be solved under the appropriate boundary conditions, including, for the unit price, the terminal condition:

$$u(T,T) = \Phi_T \,. \tag{38}$$

As it is well-known, the no-arbitrage assumption requires the existence of an equivalent martingale measure Q such that the discounted price process:

$$u(t,T) e^{-\int_0^t r_\tau \, d\tau}, \quad 0 \le t \le T,$$

is a martingale with respect to Q. Under this martingale property the solution of the valuation equation under condition (38) has the integral expression:

$$u(t,T) := V(t;\Phi_T) = \mathbf{E}_t^Q \left[e^{-\int_t^T r_z \, dz} \, \Phi_T \right], \qquad (39)$$

also known as Feynman-Kac representation. For t = 0 this gives expression (17).

4.2.4 Identifying the risk-neutral measure

By our choice of the functions f^r, g^r, f^S and g^S and of the correlation between the sources of uncertainty, the parameter vector related to the P measure is:

$$\mathbf{p} = \{\alpha, \gamma, \rho, \mu, \sigma, \eta\}, \qquad (40)$$

while the parameter vector for the risk premia is simply $\mathbf{r} = \{\pi\}$. By inspection of the valuation equation (37) one observes that the coefficients of the first order derivatives with

¹³In the usual formulations of the BS model no assumption on the risk premia is made at this stage, since relation (35) will be obtained as a consequence of the hedging argument which leads to the valuation equation. For the sake of exposition we prefer to state this property here.

respect to r and S are not expressed by the "natural" drift functions f^r and f^S , but are given by the modified functions:

$$\widehat{f}^r := f^r + h^r g^r = \alpha(\gamma - r_t) + \pi r_t = \alpha \gamma - (\alpha - \pi) r_t, \qquad (41)$$

and:

$$\hat{f}^S := f^S + h^S g^S = r_t S_t \,. \tag{42}$$

These are the risk adjusted drifts 14 which determine the form of the risk-neutral measure Q; the risk adjusted parameter vector is given by:

$$\widehat{\mathbf{p}} = \{\widehat{\alpha}, \widehat{\gamma}, \rho, \sigma, \eta\}, \qquad (43)$$

where $\hat{\alpha} := \alpha - \pi$ and $\hat{\gamma} := \alpha \gamma$. Any solution of the valuation equation will be a function of this set of parameters and any calibration of the model to the observed prices will be performed by optimally choosing these parameters. The estimation of the effective mean reverting parameters for r_t and the instantaneous expected return for S_t is not needed for pricing purposes, since their value has no effect on the prices.

4.2.5 Measures of financial risk

Since the price u(t,T) is a function of the state variable r_t and S_t , it is natural to express the risk inherent to these sources of uncertainty as a sensitivity measure. For the interest rate risk it is usual to define:

$$\Omega^{r}(\Phi_{T}) := -\frac{\partial u(0,T)}{u(0,T)\,\partial r}\,;\tag{44}$$

for the particular case of the deterministic unit ZCB we define:

$$\omega(T) := -\frac{\partial v(0,T)}{v(0,T)\,\partial r}\,.\tag{45}$$

The "stochastic duration" $D(\Phi_T)$ is defined as the maturity of the deterministic ZCB with the same risk of Φ_T ; hence:

$$D(\Phi_T) := \omega^{-1}(\Omega^r) \,. \tag{46}$$

Because of the mean reversion effect the function $\omega(T)$ is bounded; hence for high values of Ω^r , that is for contracts with strong interest rate risk, the stochastic duration $D(\Phi_T)$ could also not exist. Of course this is not a problem for controlling interest rate risk since one can directly use the sensitivity Ω^r as a measure of risk. In our applications the stochastic duration $D(\Phi_T)$ usually is well defined and is typically shorter than the maturity T of the policy ¹⁵.

¹⁴The valuation equation (37) can be easily recognized as the backward Kolmogoroff equation for the bivariate diffusion $\{r_t, S_t\}$ with drifts \hat{f}^r and \hat{f}^S , with diffusion coefficients g^r and g^r , correlation η and "killing rate function" r_t (see Karlin-Taylor (1981, pp. 222-224)).

¹⁵Usually it turns out that the interest rate sensitivity (and the stochastic duration) of a participating policy is considerably lower than the sensitivity of a corresponding non participating policy. This self-immunization property is essentially similar to the analogous property displayed by floating rate notes, having interest rate sensitivity similar to short term bonds, despite their mid/long maturity (De Felice-Moriconi-Salvemini (1993, pp. 137-138)). This is an important result since it suggests that the traditional duration mismatching between assets and liabilities in life insurance can be strongly reduced (in terms of sensitivity) for portfolios of participating policies. Values of the stochastic duration for an outstanding policy portfolio, as well as applications to asset-liability management are reported in De Felice-Moriconi (2002b, p. 86, pp. 90-91).

The sensitivity of price to stock market risk has a similar definition:

$$\Omega^{S}(\Phi_{T}) := \frac{\partial u(0,T)}{u(0,T)\,\partial S}\,;\tag{47}$$

the derivative with respect to S is well-known as the Delta of the contract:

$$Delta := \frac{\partial u(0,T)}{\partial S} \,. \tag{48}$$

Of course, for $\Phi_T = 1$ one has $\Omega^S = 0$ since v(0,T) is independent of S.

4.2.6 Risk Based Capital

The NUMAT approach also provides a straightforward methodology for determining levels of absorbed capital, which are risk measures currently used in strategic planning and in solvency rating problems. Consider a portfolio of contracts with stochastic reserve V_0 at time zero. For a given risk factor, the risk based capital, or economic capital, of the portfolio is the maximum unexpected loss in portfolio's value, in a time period θ with probability ε , caused by an adverse movement of the risk factor. While the definition is quite similar to the well-known Value-at-Risk (VaR) definition, here the values of the parameters θ and ε are essentially different. Usually in risk capital definitions the time period θ is equal to 1 year (the usual accounting horizon), which is longer than the typical "unwinding periods". Moreover, since the risk capital can be interpreted as the adequate cushion for the insurance company to maintain a given credit rating, ε is chosen as the typical figure of the one-year default probability corresponding to this rating; for companies interested in strong credit quality this probability can be very low.

Let us refer to a "portfolio" consisting only of our pure endowment policy with terminal benefit $C_T = C_0 \Phi_T$; the portfolio value at time zero is:

$$V_0 := C_0 V(0; \Phi_T) = C_0 u(0, T)_T p_x.$$

As concerning the financial risk, under the two-factor model:

$$u(0,T) = u(r_0, S_0, 0;T), \qquad (49)$$

and one has the risk capital K^r induced by r_t (the interest rate risk capital) and the risk capital K^S induced by S_t (the stock price risk capital). Since the valuation factor is usually monotonic both with respect to r and S, the risk capitals K^r and K^S can be directly obtained from percentiles of the probability distributions of r and S ("underlying percentile method").

The function u is usually monotonic decreasing with respect to r, hence interest rate risk capital can be defined as:

$$K^r := v(0,\theta) \,_1 p_x \, C_0 \left[u(\overline{r}_{\theta}, \overline{S}_{\theta}, \theta; T) - u(r^*_{\theta}, \overline{S}_{\theta}, \theta; T) \right] \, \mathbf{E}^P[_{T-1}p_{x+1}],$$

where $\overline{r}_{\theta} := \mathbf{E}^{P}[r_{\theta}]$ and $\overline{S}_{\theta} := \mathbf{E}^{P}[S_{\theta}]$ is the expected value at time zero of the spot rate and of the stock price, respectively, at the end of the period θ , and r_{θ}^{*} is the "underlying percentile", defined by $\mathbf{P}(r_{\theta} \leq r_{\theta}^{*}|r_{0}) = 1 - \varepsilon$. Similarly, since u is monotonic increasing with respect to S, the stock market risk capital can be given by:

$$K^{S} := v(0,\theta) {}_{1}p_{x} C_{0} \left[u(\overline{r}_{\theta}, \overline{S}_{\theta}, \theta; T) - u(\overline{r}_{\theta}, S_{\theta}^{*}, \theta; T) \right] \mathbf{E}^{P}[_{T-1}p_{x+1}],$$

where S_{θ}^* is implicitly defined by $\mathbf{P}(S_{\theta} > S_{\theta}^* | S_0) = 1 - \varepsilon$.

It is worthwhile to observe that the probability measure to be used in these computations is the natural measure P; thus some amount of subjectivity is necessarily involved, since P cannot be estimated on the market and some parameters of the distributions must be specified based on personal beliefs (or however using additional estimations). For the stock market component the parameter μ of the lognormal distribution for S must be fixed; as concerning the interest rate component, the most straightforward way for determining the parameters of the non-central chi-squared distribution of r consists in fixing exogenously the value of the long term interest rate γ and then deriving the mean-reversion coefficient as $\alpha = \hat{\gamma}/\gamma$.

Mortality risk capital K^M can be derived by similar computations, based on a properly defined worst case for $_Tp_x$. This requires, of course, to specify a model for mortality risk; however, given our independence assumptions, the financial risk capitals K^r and K^S will not be affected by stressed mortality scenarios ¹⁶.

5 Applying the valuation model

5.1 Some calibration details

The parameters $\hat{\alpha}, \hat{\gamma}$ and ρ of the CIR component of the valuation model can be estimated by calibration on the market of the interest rate sensitive securities. Since the CIR model provides an explicit formula for v(t,T) (Cox-Ingersoll-Ross (1985), p. 393), the calibration can be made on the current cross section of swap rates by performing the nonlinear regression (32) described in section 4.1. However under the CIR model it can happen that different sets of parameters are found having very similar levels of Σ^2 but different values for the volatility parameter ρ . While the use of these different parameter sets produces similar prices for linear products (that is for products which can be expressed as static portfolios of unit ZCBs), different values of ρ can produce important discrepancies in the valuation of contracts with non linear payoff, as the options embedded in our life insurance liabilities. In order to overcome this difficulty, one can extend the set of market data by including also prices of interest rate options in the estimation procedure. In our applications we usually perform the calibration of the CIR model using both the swap rates and a set of quoted prices for interest rate caps and floors, that can be easily done given that explicit formulae for the price of these derivatives are available using the CIR model. The method usually produces values of ρ which explain fairly well the observed option prices while maintaining a good fitting with the observed yield curve.

¹⁶Economic capitals for technical risks can be particularly high in non-life insurance, where the determination of the ultimate reserves and the premium rating are exposed to large estimation errors. For an application of the stochastic chain-ladder method to the determination of the reserve risk capital and of the premium risk capital in P&C insurance see De Felice-Moriconi (2003).

The remaining parameters σ and η have in some sense a more strategic nature and can be exogenously specified. Usually we assume for σ the same value of the historical volatility of the stock component of the reference fund. For the correlation coefficient η we adopt figures derived by classical econometric studies on the Italian market (a slightly negative value is usually assumed); however for typical values of the other parameters the value of η seems to have a weak influence on the valuation procedure.

5.2 Numerical computation

Given the complexity of the profit sharing rule, the valuation factor u(0, T) must be derived by the valuation equation using numerical methods. We usually compute the risk neutral expectation (17) using Monte Carlo simulations for the bivariate process $\{r_t, S_t\}$. Properly incrementing the starting values r_0 and S_0 of the Monte Carlo recursions we also obtain numerical derivatives of the price, which provide the relevant financial risk measures, and worst case valuations for risk capital computations.

5.3 Defining the underlying of the policy

A critical point for determining the price V_0 of the insurance contract is the determination of the characteristics of the stochastic process representing the market value of the reference fund, which in turns determines the annual return I_t , that is the "index" underlying the policy.

Since the fund can be composed by bonds and equities, one possibility is to assume:

$$F_t := \alpha S_t + (1 - \alpha) W_t, \quad 0 \le \alpha \le 1,$$
(50)

where S_t is a stock index, W_t is a bond index and α is here a constant fixed at time zero ¹⁷.

The stock index process is modelled as a geometric Brownian motion, as was implicitly assumed by adopting the BS model for the stock price component of the valuation model. The bond index W_t must be chosen as similar as possible to the results of a trading strategy which is considered feasible by the fund manager; hence its characterization requires additional assumptions.

A possible choice is to model W_t as the cumulated results of a buy-and-sell strategy, with a fixed trading horizon Δt , of coupon bonds with a fixed Macaulay duration $D^{\text{MC}} \geq \Delta t$. The valuation procedure is performed by simulating the trading strategy under the CIR model. The results significantly depend on the assumptions on D^{MC} and Δt . For a short-term roll-over strategy (e.g. $\Delta t = D^{\text{MC}} = 3$ months), W_t displays smooth sample paths with high dispersion in the long run. On the other hand, for a buy-and-sell strategy of coupon bonds with mid/long duration ($\Delta t = 3$ months, $D^{\text{MC}} = 4, 10$ years), the sample paths display greater local volatility, but a reduced long-run dispersion.

Even if this effect could be enhanced by the strong degree of mean reversion displayed by the one-factor CIR model, it should be noted that this behavior is consistent with important empirical findings, as the evidence that short-term rates are more volatile than long-term rates.

An illustration of different investment strategies and of their effect on the cost of the embedded put options can be found in De Felice-Moriconi (2002b, pp. 60-62, 64-65).

¹⁷Maintaining α constant is known as a "constant mix" investment strategy (Perold-Sharpe, 1988).

5.4 Valuation during the life of the policy

In the NUMAT approach the changes in market conditions have straightforward effects on the valuation during the life of the policy. In order to illustrate these effects we need to better specify our notation and slightly extend some definitions. We shall denote by tthe current calendar date and by T the calendar date at which the policy matures; hence if τ denotes the current age of the policy, the issue date is $t - \tau$ and the term of the policy at issue is $n = T + \tau$. The current readjusted value of the sum insured is:

$$C_t = C_0 \prod_{k=t-\tau+1}^{\iota} (1+\rho_k),$$

where ρ_k is the readjustment rate in year k defined by (3). Since C_t is known at time t, we define the stochastic component of the readjustment factor as:

$$\Phi_{t,T} := \prod_{k=t+1}^{T} (1+\rho_k) \,. \tag{51}$$

The corresponding valuation factor at time t will be given by:

$$u(t,T) := V(t;\Phi_{t,T}) = \mathbf{E}_t^Q \left[e^{-\int_t^T r_s \, ds} \, \Phi_{t,T} \right], \qquad (52)$$

which extends the definition (17). The definition of the stochastic reserve V_t and of the VBIF E_t at time t is straightforward ¹⁸.

In order to illustrate the financial market effects we simulated the valuation during the life of a policy over an historical period starting from the beginning of the 1990's. An efficient secondary market for Italian government bonds (the MTS market) was opened only on Jan 02, 1990; thus any valuation performed at preceding dates would pose serious problems for the model calibration given the low quality of the available data.

In our simulation we considered a single premium pure endowment contract written on Dec 29, 1989 on a life aged x = 40 years, with initial sum insured $C_0 = 100$ and term n = 20 years (hence T = Dec 29, 2009). We chose a technical interest rate i = 3%and a participation coefficient $\beta = 80\%$. The equity component of the reference fund was $\alpha = 10\%$ and the volatility was $\sigma = 20\%$. The investment strategy of the bond component of the reference fund was specified as a buy-and-sell strategy of coupon bonds with Macaulay duration $D^{\text{MC}} = 4$ years with trading period $\Delta t = 1$ month.

We performed the valuation at the issue date and on each year-end until Dec 31, 2003, calibrating the risk-neutral parameters of the CIR model on the current market data ¹⁹. The survival probabilities $T_{-t}p_{x+\tau}$ were computed using the SIM81 mortality tables at all the valuation dates t^{20} .

¹⁸A notation more in line with the actuarial tradition would probably be given by defining $u^{(\tau)}(t,T)$ as the valuation factor at date τ of a policy with term T years (at issue) and current age t. For the policies considered here the valuation factor is independent of the age of the policy, hence our definitions allow to use a simplified notation. More importantly, we prefer to denote the calendar time by t in order to stress the central role of the current date in any marked based valuation; the resulting definitions are more consistent with the interpretation of the policy as a financial product.

¹⁹For the valuation at the issue date we effectively used market data as of Jan 9, 1990, since prices quoted in the first week of MTS's operation were probably not fully reliable.

²⁰SIM81 are mortality tables for the general male population, published by ISTAT (Istituto Italiano di Statistica) in 1986.

The results of the valuations are reported in table 1. For each valuation date t, it is reported the technical reserve:

$$R_t := C_t \ (1+i)^{-(T-t)} \ _{T-t} p_{x+\tau} \,, \tag{53}$$

the stochastic reserve:

$$V_t := C_t \ u(t,T) \ _{T-t} p_{x+\tau} ,$$

and the corresponding VBIF $E_t := R_t - V_t$. Since both R_t and V_t are computed using the SIM81 mortality tables, E_t does not include mortality gain and must be thus considered here as the value of only the investment gains. The base value B_t defined by (24) and the value of the embedded put $P_t := V_t - B_t$ are also reported. $E_t \%$ is the VBIF as a percentage of the technical reserve R_t ; $P_t \%$ is the put value in percent of the stochastic reserve V_t . In principle, the scale of R_t and V_t should be readjusted in each year by the current value of the insured capital C_t . Since we are mainly interested in the difference between R_t and V_t , we maintained the initial scale of C_0 , thus avoiding arbitrary and irrelevant assumptions on the C_t sample path.

The results are also reported in figure 1 which illustrates the evolution of R_t (solid line), V_t (the solid line with bullets) and B_t (dashed line with circles).

The time evolution of the stochastic reserve is strongly dependent on the historical trend of the bond market. The yield curve was very high in the early 1990's but during the years of the convergence to Euro the Italian bond market experienced a continuous decrease of interest rates. Accordingly, the policy was very profitable at the issuance, when the (financial) embedded value was 40.4% of the initial reserve and the cost of minimum guarantee was negligeable, the embedded put being far out-of-the-money. Due to the fall in market rates, the put value raised at the 13.5% of the stochastic reserve at the end of 1998, causing a negative value of the VBIF ²¹. One can observe that a model unable to capture the value of the embedded option would have produced a value of V_t close to the base value, so no deficit situation would have been emerged in this example. It is also worthwhile to observe that the variability of the stochastic reserve V_t is largely due to the variability of the option component.

5.5 Issuing policies under different market conditions

The effects of the current financial market conditions on the policy valuation can be also illustrated by considering the issuance of the same policies at different calendar dates. Let us consider single premium pure endowment contracts with term n years, technical interest rate i = 3% and participation coefficient $\beta = 80\%$. We assume again an equity component of the reference fund $\alpha = 10\%$ with a volatility $\sigma = 20\%$ and a buy-and-sell strategy for the bond component with $D^{MC} = 4$ years and trading period $\Delta t = 1$ month. We assume to have issued these policies for term n = 1, 2, ..., 20 years, at different historical dates t. For simplicity, we consider only the financial component of the policies, assuming $_n p_x = 1$ for all t.

²¹In many cases the value of the reference fund F_t is defined by accounting rules allowing "frozen" assets to be valued by an amortization rule which produces "off-market" prices. This can allow the fund manager to perform some kind of intertemporal smoothing of the returns I_t and to spread an annual deficit over more than one year.

val. date	T-t	R_t	V_t	E_t	$E_t\%$	B_t	P_t	$P_t\%$
Dec 29, 1989	20	47.88	28.54	19.34	40.40	28.39	0.15	0.51
Dec 31, 1990	19	50.13	30.89	19.25	38.40	30.76	0.13	0.42
Dec 31, 1991	18	52.40	35.35	17.05	32.53	35.19	0.16	0.45
Dec 31, 1992	17	54.70	37.25	17.45	31.91	37.14	0.10	0.28
Dec 31, 1993	16	57.04	45.40	11.65	20.41	43.89	1.51	3.31
Dec 30, 1994	15	59.41	43.33	16.08	27.07	42.77	0.56	1.29
Dec 29, 1995	14	61.81	47.57	14.24	23.04	47.12	0.45	0.95
Dec 31, 1996	13	64.25	55.88	8.36	13.02	53.21	2.67	4.78
Dec 31, 1997	12	66.71	64.06	2.65	3.98	58.57	5.49	8.57
Dec 30, 1998	11	69.21	73.13	-3.92	-5.66	63.26	9.87	13.50
Dec 30, 1999	10	71.75	69.42	2.34	3.25	64.38	5.04	7.26
Dec 29, 2000	9	74.33	71.34	2.99	4.02	67.72	3.62	5.08
Dec 28, 2001	8	76.96	74.15	2.81	3.65	71.05	3.11	4.19
Dec 31, 2002	7	79.64	79.87	-0.22	-0.28	75.08	4.79	5.99
Dec 31, 2003	6	82.38	83.00	-0.62	-0.76	78.61	4.39	5.29

Table 1. Valuation during the life of the policy

Figure 1. Time evolution of reserves



For each valuation date t we calibrated the CIR model on the current market data and then computed the valuation factors:

$$u(t,t+n) := V(t;\Phi_{t,t+n}) = \mathbf{E}_t^Q \left[e^{-\int_t^{t+n} r_s \, ds} \, \Phi_{t,t+n} \right], \quad n = 1, 2, \dots, 20.$$

For illustration purposes, we also computed the "term structure" of the valuation rates, defined by:

$$j(t,t+n) := \left[\frac{1}{u(t,t+n)}\right]^{\frac{1}{n}} - 1, \quad n = 1, 2, \dots, 20.$$

This valuation term structure can be compared with the term structure of the interest rates currently prevailing on the market, which is given by:

$$i(t,t+n) := \left[\frac{1}{v(t,t+n)}\right]^{\frac{1}{n}} - 1, \quad n = 1, 2, \dots, 20$$

where, as usual, v(t,T) is the market price at the date t of a unit ZCB maturing at time T.

We performed the valuation for three different dates:

- $\cdot t =$ Jan 09, 1990, a week after the MTS market was opened;
- $\cdot t = \text{Dec } 30, 1998$, when the convergence process to Euro was completed;
- $\cdot t = \text{Dec } 31, 2003.$

In table 2 are plotted, for each of the three issue dates t, the term structure of the valuation rates j(t, t+n) with solid line and the term structure of market interest rates i(t, t+n) with dashed line. The flat curve corresponding to the technical rate i = 3% is also reported with dotted line.

The results can be commented by similar arguments as in the previous example. At the beginning of 1990 (first figure) the market yield curve was at a very high level, ranging from 14% for n = 1 to 15.5% for n = 20 years; as compared with these market returns, the 3% technical rate was decidedly low, implying an high level of the investment gains and a low cost of the embedded put options. These effects are summarized by the difference between the *j* curve and the 3% flat line; this gap is the counterpart, in the interest rate language, of the VBIF, given by $E_t = R_t - V_t$: the higher the difference j(t, t+n) - i for a currently issued policy with term *n*, the higher the corresponding E_t .

In the years 1995-98 the decrease of interest rates was quite dramatic. As illustrated in the second figure of table 1, at the end of 1998 the market rates were ranging from 3% for n = 1 to 5.4% for n = 20 years. Issuing the policies in this market environment would imply a negative value of E_t , since the embedded put options would be near at-the-money and the valuation rates would result to be lower than the 3% level for all the maturities.

The market yield curve was not very different at the end of 2003 (see the third figure). However the situation for the policies as issued at this date would be slightly better; this is essentially due to a volatility effect, since the volatility curve estimated on the market resulted to be lower than the corresponding curve estimated at the end of 1998.

5.6 Portfolio valuations

When a real portfolio of outstanding policies has to be analyzed, the situation is obviously much more complex than in the simple examples just considered. An important portion





issue date: Jan 09, 1990











of the policies in force is usually given by participating contracts with constant annual premiums. In these cases the readjustment rule (2) for the benefits must be only partially applied since only the excess return on the investment of the saving premium can be credited to the policyholder. Therefore, the valuation factors at time t will be functions $u^{(x,\tau)}(t,T)$ also depending on the age x of the life insured and on the current age τ of the policy. Moreover, in many policies benefits payable in case of death are different from benefits payable if the insured is alive; this requires the computation of separated streams of valuation factors.

However, like for the simple pure endowment policy we can pursue the same approach for any policy of life assurance. It is sufficient to decompose the policy into single premium components with benefits (for survival and/or death and/or other causes) at single time points. For these components we have the liabilities:

$$Y_T := C_T \mathbb{I}_{\mathcal{G}(x,T)},$$

where C_T is the sum to be eventually paid at time T and \mathcal{G} denotes the exit due to survival, death or other cause. Under the assumption of complete market, the stochastic payoff C_T can be replicated by a trading strategy with market price at time t equal to $C_t u^{(x,\tau)}(t,T)$, where C_t is the current value of the benefit. The same approach must be applied to a premium to be paid at time T; of course for constant, i.e. non readjusted, premiums the appropriate valuation factor will be given simply by v(t,T).

In our framework, under the assumption of independence between financial and technical uncertainty, the fair value at time t of Y_T is given by:

$$V_t := V(t; Y_T) = C_t \ u^{(x,\tau)}(t,T) \ \mathbf{E}_t^D[\mathbb{I}_{\mathcal{G}(x,T)}],$$
(54)

where the D measure discussed in section 2.4 should reflect any technical risk loading. This expression generalizes (18). Summing over all components of all policies in force in the outstanding portfolio we obtain the total net fair value V_t^{Tot} of benefits and premiums, that is the stochastic reserve at time t. Extending the definitions in section (3.1), the total VBIF at time t is given by $E_t^{Tot} := R_t^{Tot} - V_t^{Tot}$, where R_t^{Tot} is the technical reserve of the portfolio.

In practical applications we usually avoid to perform the valuation using a representative portfolio composed by a reduced number of "model points", since this can produce a number of approximations not easily controllable. Thus the number of valuation factors to be calculated can be very high. Since the Monte Carlo computation of the valuation factors is time consuming, it is required that the calculation procedures are properly optimized.

As concerning portfolios of unit-linked policies, the market based valuation is straightforward. Some computational problems can arise in the valuation of the embedded options for policies with maturity guarantees. Many recently issued index-linked policies are backed by a specified security, typically a "structured bond". Usually these securities have a very complex payoff, possibly containing exotic options; moreover it can happen that their price is quoted on a non efficient market. Thus an appropriate pricing model is needed in order to control possible deviations of the quoted price from the fair value of this product.

6 Managing the valuation variability

The high time variability is obviously a natural characteristics of any market based valuation. This is of course a consequence of a more detailed and up-to-date information and is not a problem per se, but rather an advantage of the mark-to-market approach.

When purely financial products are concerned (as well as many types of index-linked life insurance policies), the timeliness in pricing is crucial, since, given the high liquidity of the markets, any mispricing can expose the issuer to riskless arbitrage; moreover, the issued contract must be immediately hedged at the current market conditions. For traditional life insurance products this problems seems to be not so relevant and a continuous stream of market informations can be considered excessive, or useless, for premium calculation.

Also accounting procedures do not benefit from strongly time-dependent valuation methods; in this kind of applications an important issue is the comparability of the valuation results between different firms. The problem of an increase in volatility of earnings in the accounting reports has widely been recognized, also in the perspective of the new International Accounting Standards (IAS) (see e.g. Morgan Stanley, 2002); these difficulties could be probably overcome by defining some standardized rules for providing an intertemporal smoothing of the operating results.

However, having a better information cannot be a problem; the real issue is how to organize and how to correctly use this information. As pointed out by Bühlmann (2003a), this is particularly true for some applications, as the embedded value measurement. In this case a more detailed analysis of the results given by the market based valuations can provide a better understanding of the value creation mechanisms.

As an example, let us slightly extend our notation of stochastic reserve, by defining:

$$V_t^{(s)} := V^{(s)}(t; Y_T), \quad t, s \le T,$$
(55)

as the value of Y_T at time t computed under the market conditions prevailing at time s; that is $V_t^{(s)}$ is the value of the policy with remaining term T-t derived using the parameter vector $\hat{\mathbf{p}}$ calibrated on the market data at time s. Of course $V_t^{(t)} = V_t$. Referring to a time interval $[t, t + \Delta t]$, one can consider the decomposition:

$$\Delta V_t := V_{t+\Delta t} - V_t = \Delta V_t^A + \Delta V_t^M, \quad 0 \le t, \ t + \Delta t \le T,$$
(56)

where:

• $\Delta V_t^A := V_{t+\Delta t}^{(t)} - V_t$ is the change in value due to the aging of the policy, independently of changes in market conditions,

and:

• $\Delta V_t^M := V_{t+\Delta t} - V_{t+\Delta t}^{(t)}$ is the change in value caused only by the market movements.

This expression suggests an analogous decomposition for the "embedded value earnings":

$$\Delta E_t := E_{t+\Delta t} - E_t = (R_{t+\Delta t} - V_{t+\Delta t}) - (R_t - V_t), \qquad (57)$$

since the change $R_{t+\Delta t} - R_t$ is unaffected by market movements. For more details see De Felice-Moriconi (2002a).

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