



SOCIETY OF ACTUARIES

Article from:

ARCH 2014.1 Proceedings

July 31-August 3, 2013

- Focus on DC pension plans:
 - ▶ Quickly expanding,
 - ▶ Easier and cheaper to administer,
 - ▶ More transparent and flexible so they can capture individuals' needs.
- However,
 - ▶ If too much flexibility (e.g. U.S.), the participants do not know how to manage their saving and investment decisions.
 - ▶ If too little flexibility (e.g. Denmark), the product is generic and does not capture the individuals' needs.

- **Asset allocation, payout profile and level of death benefit** capture the individual's personal and economical characteristics:
 - ▶ current wealth, expected lifetime salary progression, mandatory and voluntary pension contributions, expected state retirement pension, risk preferences, choice of assets, health condition and bequest motive.
- Combine two optimization approaches:
 - ▶ Multistage stochastic programming (MSP)
 - ▶ Stochastic optimal control (dynamic programming, DP).

- **Asset allocation, payout profile and level of death benefit** capture the individual's personal and economical characteristics:
 - ▶ current wealth, expected lifetime salary progression, mandatory and voluntary pension contributions, expected state retirement pension, risk preferences, choice of assets, health condition and bequest motive.

- Combine two optimization approaches:
 - ▶ Multistage stochastic programming (MSP)
 - ▶ Stochastic optimal control (dynamic programming, DP).

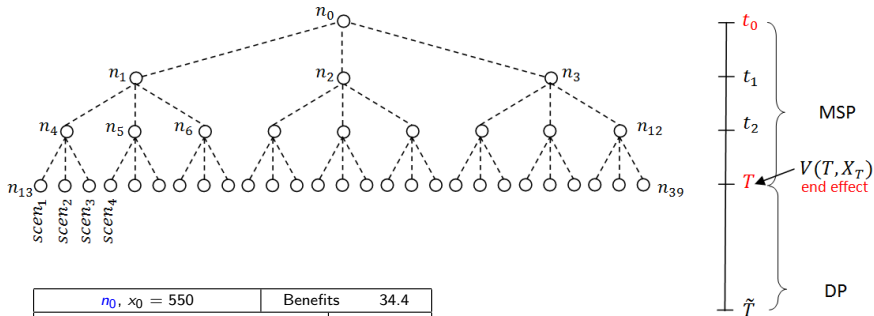
stochastic optimal control (DP) - explicit solutions

- ✓ ideal framework - produce an optimal policy that is easy to understand and implement
- ✗ explicit solution may not exist
- ✗ difficult to solve when dealing with details

stochastic programming (MSP) - optimization software

- ✓ general purpose decision model with an objective function that can take a wide variety of forms
- ✓ can address realistic considerations, such as transaction costs
- ✓ can deal with details
- ✗ difficult to understand the solution
- ✗ problem size grows quickly as a function of number of periods and scenarios
- ✗ challenge to select a representative set of scenarios for the model

Combined MSP and DP approach



$n_0, x_0 = 550$		Benefits	34.4
Purchases		Sales	Allocation
Cash			
Bonds	300.6		0.58
Dom. Stocks	177.3		0.34
Int. Stocks	37.7		0.08

n_1		Benefits			31.6
Purchases		Sales	Allocation	Returns	
Cash				0.030	
Bonds		98.8	0.49	-0.039	
Dom. Stocks	8.3		0.44	-0.093	
Int. Stocks		4.4	0.07	-0.169	

Maximize the expected utility of total retirement benefits and bequest given uncertain lifetime,

$$\begin{aligned} & \max \sum_{s=\max(t_0, T_R)}^{T-1} \sum_{n \in \mathcal{N}_s} s p_x u(s, B_{s,n}^{tot}) \cdot prob_n \\ & + \sum_{s=t_0}^{T-1} \sum_{n \in \mathcal{N}_s} s p_x q_{x+s} K u(s, I_{s,n}^{tot}) \cdot prob_n \\ & + T p_x \sum_{n \in \mathcal{N}_T} V\left(T, \sum_i X_{i,T,n}^{\rightarrow}\right) \cdot prob_n \end{aligned}$$

Parameters:

T_R	retirement time,
T	end of decision horizon and beginning of DP,
$t p_x$	probability of surviving to age $x + t$ given alive at age x ,
q_x	mort. rate for an x -year old,
$prob_n$	probability of being in node n ,
K	weight on bequest motive.

Variables:

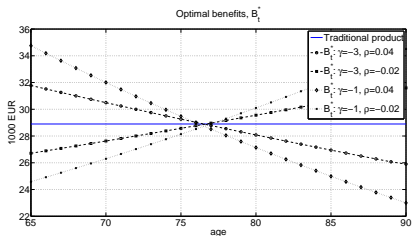
$B_{t,n}^{tot}$	total benefits at time t , node n ,
$I_{t,n}^{tot}$	bequest at time t , node n ,
$X_{i,t,n}^{\rightarrow}$	amount allocated to asset i , period t , node n .

Richard, S. F. (1975),
Optimal consumption, portfolio and life insurance rules for an uncertain lived individual in a continuous time model.
Journal of Financial Economics, 2(2):187–203.

Conclusions I

- Equally fair payout profiles given CRRA utility:

$$u(t, B_t) = \frac{1}{\gamma} w_t^{1-\gamma} B_t^\gamma, \quad w_t = e^{-1/(1-\gamma)\rho t}$$



Sensitivity to risk aversion $1 - \gamma$
and impatience (time preference) factor ρ .

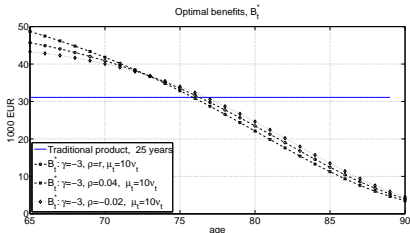
$$\bar{a}_{y+t}^* = \int_t^{\tilde{T}} e^{-\int_t^s (\bar{r} + \bar{\mu}_\tau) d\tau} ds,$$

$$B_t^* = \frac{X_t}{\bar{a}_{y+t}^*},$$

$$\bar{r} = \frac{1}{1-\gamma} \rho - \frac{\gamma}{1-\gamma} r$$

$$\bar{\mu}_\tau = \underbrace{\frac{1}{1-\gamma} \mu_\tau}_{subj.} - \underbrace{\frac{\gamma}{1-\gamma} \nu_\tau}_{obj.}$$

Savings upon retirement $X_{T_R} = 550,000$ EUR, $b_{T_R}^{state} = 0$, risk-free investment, no insurance.



Subjective mortality rate $\mu_t = 10\nu_t$:
30% chances to survive until age 75,
<1% chance to survive until age 85.

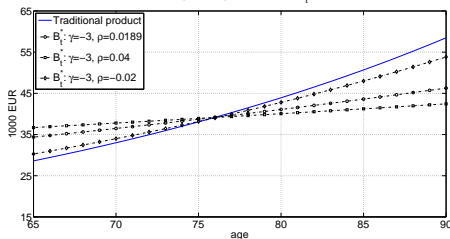
Conclusions II

- More aggressive investment strategy and higher benefits given state retirement pension b_{TR}^{state}

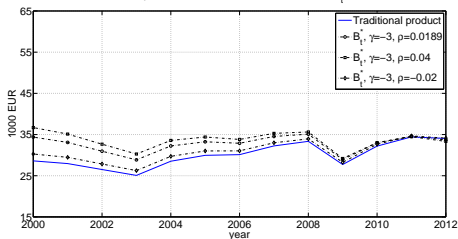
Expected asset allocation \ Age	$b_{TR}^{state} = 0$		$b_{TR}^{state} = 5$				
	65-90	65	70	75	80	85	90
Cash	20%	4%	5%	6%	7%	7%	7%
Bonds	44	53	52	52	51	51	51
Dom. Stocks	25	30	30	29	29	29	29
Int. Stocks	11	13	13	13	13	13	13

Expected benefits \ Age	65	70	75	80	85	90
Benefits B_t^* , $b_{TR}^{state} = 0$	32,7	34,8	36,9	39,1	41,5	44,1
Benefits B_t^* , $b_{TR}^{state} = 5$	34,4	36,5	38,7	41,1	43,6	46,3

Expected optimal benefits, B_t^*



Optimal benefits based on historical data, B_t^*

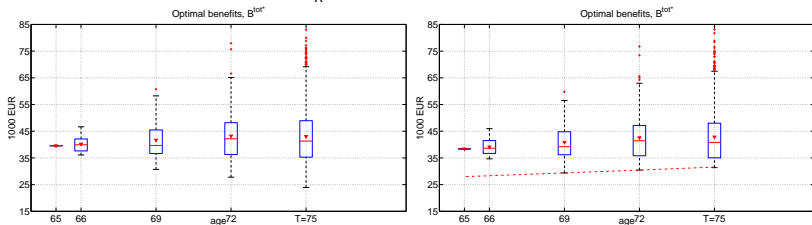


Left plot: expected optimal benefits. Right plot: optimal benefits based on historical returns: 3-m U.S. T-Bills, Barclays Agg. Bond, S&P500, MSCI EAFE.

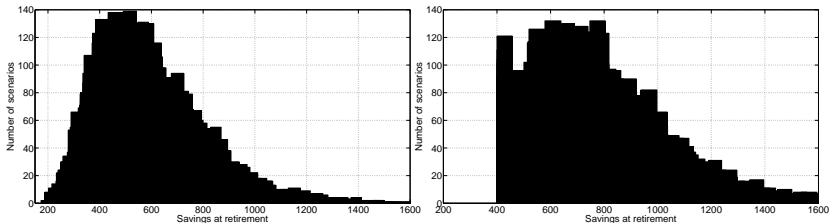
Conclusions III

- Possible to adjust the investment strategy such that $B_t^{tot*} \geq b_t^{min}$
- Possible to adjust the investment strategy such that $\sum_i X_{i,t,n}^{\rightarrow} \geq x_t^{min}$

(a) immediate annuity, $age_0 = 65$, $x_0 = 550$, $b_{TR}^{state} = 5$



(b) deferred annuity, $age_0 = 45$, $x_0 = 130$, $l_0 = 50$, $p^{fixed} = 15\%$, $p^{vol} = 10\%$ (right plot only), $b_{TR}^{state} = 5$, $ins_0^{fixed} = 150$

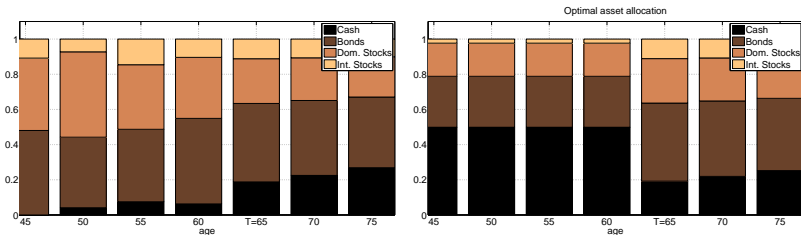


- Possible to include individual's preferences on portfolio composition,

$$X_{i,t,n} \geq d_i \sum_i X_{i,t,n}, \quad X_{i,t,n} \leq u_i \sum_i X_{i,t,n}$$

e.g. $d_{bonds} = 50\%$ and $u_{bonds} = 70\%$.

- Though any additional constraints lead to a suboptimal solution (\implies lower or more volatile benefits).
- Optimal investment vs. optimal fixed-mix portfolio:



Deferred life annuity. 20% lower expected benefits given the same risk level.

Left: optimal investment, $E[B_t^{tot*}] = 46,200$ EUR. Right: fixed-mix portfolio, $E[B_t^{tot*}] = 37,700$ EUR.



Høyland, K., Kaut, M., and Wallace, S. W. (2003).
A Heuristic for Moment-Matching Scenario Generation.
Computational Optimization and Applications, 24(2-3):169–185.



Kim, W. C., Mulvey, J. M., Simsek, K. D., and Kim, M. J. (2012).
Stochastic Programming. Applications in Finance, Energy, Planning and Logistics, chapter
Papers in Finance: Longevity risk management for individual investors.
World Scientific Series in Finance: Volume 4.



Konicz, A. K., Pisinger, D., Rasmussen, K. M., and Steffensen, M. (2013).
A combined stochastic programming and optimal control approach to personal finance and
pensions.
http://www.staff.dtu.dk/agko/Research/~media/agko/konicz_combined.ashx.



Milevsky, M. A. and Huang, H. (2011).
Spending retirement on planet Vulcan: The impact of longevity risk aversion on optimal
withdrawal rates.
Financial Analysts Journal, 67(2):45–58.



Mulvey, J. M., Simsek, K. D., Zhang, Z., Fabozzi, F. J., and Pauling, W. R. (2008).
Assisting defined-benefit pension plans.
Operations research, 56(5):1066–1078.



Richard, S. F. (1975).
Optimal consumption, portfolio and life insurance rules for an uncertain lived individual in
a continuous time model.
Journal of Financial Economics, 2(2):187–203.

Appendix

Budget equation while the person is alive, $t \in \{t_0, \dots, T-1\}$, $n \in \mathcal{N}_t$:

$$B_{t,n} \mathbf{1}_{\{t \geq T_R\}} + \nu_t l_{t,n}^{tot} + \sum_i X_{i,t,n}^{buy} = P_{t,n}^{tot} \mathbf{1}_{\{t < T_R\}} + \sum_i X_{i,t,n}^{sell} + \nu_t \sum_i X_{i,t,n}^{\rightarrow}$$

Value of the savings at the beginning of period t :

before rebalancing in asset i , $t \in \{t_0, \dots, T\}$, $n \in \mathcal{N}_t$, $i \in \mathcal{A}$,

$$X_{i,t,n}^{\rightarrow} = x_{i,0} \mathbf{1}_{\{t=t_0\}} + (1 + r_{i,t,n}) X_{i,t^-,n} \mathbf{1}_{\{t > t_0\}},$$

after rebalancing in asset i , $t \in \{t_0, \dots, T-1\}$, $n \in \mathcal{N}_t$, $i \in \mathcal{A}$,

$$X_{i,t,n} = X_{i,t,n}^{\rightarrow} + X_{i,t,n}^{buy} - X_{i,t,n}^{sell}$$

Purchases and sales, $t \in \{t_0, \dots, T-1\}$, $n \in \mathcal{N}_t$, $i \in \mathcal{A}$,

$$X_{i,t,n}^{buy} \geq 0, X_{i,t,n}^{sell} \geq 0.$$

Premiums, $t \in \{t_0, \dots, T-1\}$, $n \in \mathcal{N}_t$,

$$P_{t,n}^{\text{tot}} = P_{t,n} + p^{\text{fixed}} l_t,$$

$$P_{t,n} \leq p^{\text{vol}} l_t,$$

Benefits, $t \in \{t_0, \dots, T-1\}$, $n \in \mathcal{N}_t$,

$$B_{t,n}^{\text{tot}} = B_{t,n} + b_t^{\text{state}},$$

$$B_{t,n}^{\text{tot}} \geq b_t^{\text{min}},$$

Insurance, $t \in \{t_0, \dots, T-1\}$, $n \in \mathcal{N}_t$,

$$l_{t,n}^{\text{tot}} = l_{t,n} + \text{ins}_t^{\text{fixed}},$$

$$l_{t,n} \geq \text{ins}^{\text{min}} \sum_i X_{i,t,n}^{\rightarrow},$$

Portfolio composition, $t \in \{t_0, \dots, T-1\}$, $n \in \mathcal{N}_t$, $i \in \mathcal{A}$,

$$X_{i,t,n} \leq u_i \sum_i X_{i,t,n}, \quad X_{i,t,n} \geq d_i \sum_i X_{i,t,n},$$

Minimum savings, $t \in \{t_1, \dots, T\}$, $n \in \mathcal{N}_t$,

$$\sum_i X_{i,t,n}^{\rightarrow} \geq x_t^{\text{min}}.$$

- DP - very specific and simplified model: power utility, risk-free asset, risky assets following GBM, Gompertz-Makeham mortality rate model, deterministic labor income and state retirement pension, no constraints on portfolio composition and no constraints on the size of savings or benefits.

Utility:

$$u(t, B_t) = \frac{1}{\gamma} w_t^{1-\gamma} B_t^\gamma, \quad w_t = e^{-1/(1-\gamma)\rho t}$$

Optimal value function (**end effect**):

$$V(t, x) = \frac{1}{\gamma} f_t^{1-\gamma} (x + g_t)^\gamma$$

Optimal controls:

$$\text{benefits: } B_t^* = \frac{w_t}{f_t} (X_t + g_t) - b_t^{\text{state}}$$

$$\text{sum insured: } I_t^{\text{tot}*} = \left(K \frac{\mu_t}{\nu_t} \right)^{1/(1-\gamma)} \frac{w_t}{f_t} (X_t + g_t)$$

$$\text{proportion in risky assets: } \pi_t^* = \frac{\alpha - r}{\sigma^2(1-\gamma)} \frac{X_t + g_t}{X_t}$$

- g_t - present value of future cashflows (labor income, retirement state pension, insurance price)
- f_t - optimal life annuity