

# Stability of Participation in Collective Pension Schemes

## An Option Pricing Approach

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January 27, 2015

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- Also useful system for workers who want a voluntary collective pension scheme, e.g. self-employed (*Kamerbrief SZW, Febr 2015; DNB Position Paper, Jan 2015*)
- Worldwide examples from mandatory to voluntary pension schemes:  
**The U.K.** (April 2015): withdraw pension assets at the age of 55  
**Canada** (May 2015): Minister of Finance: “*consider allowing additional voluntary contributions to the country’s mandatory Canada Pension Plan*”

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- An option-pricing approach: participants get an irreversible “exit option”
- **Goal:** providing policy recommendations for a voluntary collective pension scheme such that participants are inclined to stay
- Main contribution of this paper is to model participation decisions as an American option to explore sustainability of the pension scheme



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- Risk-neutral pricing function  $\Pi(\cdot)$  (complete market assumption)
- Source of risk: returns on investments (geometric Brownian motion)
- Regulation policy to adjust financial shocks in the funding ratio ( $F$ ):

$$E_0^{\mathbb{Q}}(F_t - \bar{F}) = \alpha^t (F_0 - \bar{F}), \quad \forall t \geq 0, \quad \alpha \in (0, 1)$$

Low  $\alpha$ : immediate recovery

High  $\alpha$ : smoothing risks by allowing funding ratio fluctuations

# Classification of Collective Pension Schemes

- The period  $t$  total correction  $\Omega_t$  follows from regulation:

$$\Omega_t = \underbrace{\int_{I_t^w} \pi_{s,t} ds}_{=(1-\omega)\Omega_t} + \underbrace{(1 - \gamma_t) \left( \Lambda_t + \int_{I_t^r} B_{s,t} ds \right)}_{=\omega\Omega_t}$$

$(1 - \omega)\Omega_t$ : part of correction achieved through recovery contributions

$\omega\Omega_t$ : part of correction achieved through adjusting indexation

Parameter:	$\omega = 0$	$\omega \in (0, 1)$	$\omega = 1$
Pension scheme:	DB ( $\gamma = 1$ )	hybrid	collective DC ( $\pi = 0$ )

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- American option: exercise at each date until retirement (applying approximation methods)
- Decision is based on full participation of current and future cohorts (optimistic beliefs)

# Benchmark Parameters

Description	Symbol	Value
Entry age	$t_0$	0
Retirement age	$t_R$	40
Age of death	$t_D$	60
Target funding ratio	$\bar{F}$	1
Risk smoothing	$\alpha$	0.5
Interest rate (risk free)	$r$	0.02
Portfolio return volatility	$\sigma$	0.15
Wage	$w$	1
Accrual rate	$\psi$	70%/ $t_R$

# Age-Dependent Contribution Pure Defined-Benefit

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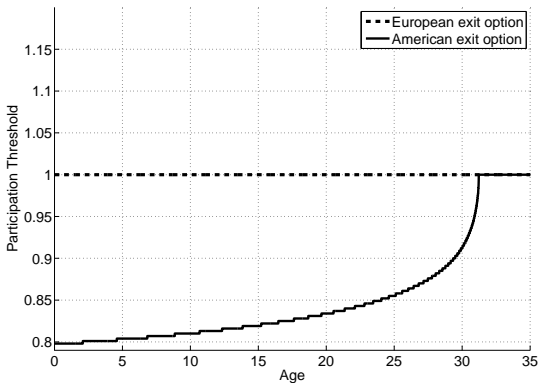
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- Finite Difference (FD) method to approximate the option value (technical details are in the paper)
- European (**American**) option: threshold = 100% (**79.8%**)

# Participation Thresholds



**Dashed line:** European option: 100% at all ages

**Solid line:** American option: 79.8% at entry

# Age-Dependent Contribution Hybrid Pension Scheme

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- Not only the pension fund's assets, but also the pension entitlements of other participants affect the participation decision
- Least Squares Monte Carlo (LSMC) method to approximate the option value based on  $10^5$  simulation runs (technical details in the paper)

$$Part_{s,t} = X_t \beta_{t-s} + \varepsilon$$

$$X_t = \left( 1, F_t, F_t^2, \max(1 - F_t, 0), L_t, L_t^2, \underbrace{F_t L_t}_{=A_t}, B_{t-10,t}, B_{t-20,t}, \dots, B_{t-50,t} \right)$$

# Example of a Hybrid Pension Scheme

	$\omega = 0.5$ (hybrid)				
Age	0	10	20	30	40
$\beta_1$	1.332	-0.903	0.180	1.803	-4.423
$\beta_F$	-1.356	0.548	-3.081	-4.612	3.411
$\beta_{F2}$	0.631	-0.341	1.416	0.768	0.328
$\beta_{\max(1-F,0)}$	-0.444	1.750	3.343	7.371	11.213
$\beta_L$	-0.016	-0.029	-0.052	-0.082	-0.058
$\beta_{L^2} * 10^6$	1.679	-0.855	4.897	16.511	-0.004
$\beta_A$	0.006	0.009	0.011	0.024	0.004
$\beta_{B_{10}}$	1.910	9.424	2.958	3.449	5.567
$\beta_{B_{20}}$	-0.041	2.598	12.531	3.886	5.998
$\beta_{B_{30}}$	1.099	2.251	6.042	15.791	7.741
$\beta_{B_{40}}$	1.740	2.626	4.480	7.770	8.066
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# Uniform Contribution Policies

## Contribution Rate

- Age-dependent (old):  $c_{t-\nu,t} = \bar{c}_\nu + \frac{1}{t_R} (1 - \omega) \Omega_t$
- Uniform (new):  $c_{t-\nu,t} = \bar{c} + \frac{1}{t_R} (1 - \omega) \Omega_t$
- $\bar{c}_\nu = \psi R_\nu$  is increasing with age  
 $\bar{c} = \frac{1}{t_R} \int_0^{t_R} \bar{c}_\nu d\nu$  is uniform across ages

# Motivation

- Replacing age-dependent (quasi actuarially fair) contribution policy by uniform contributions

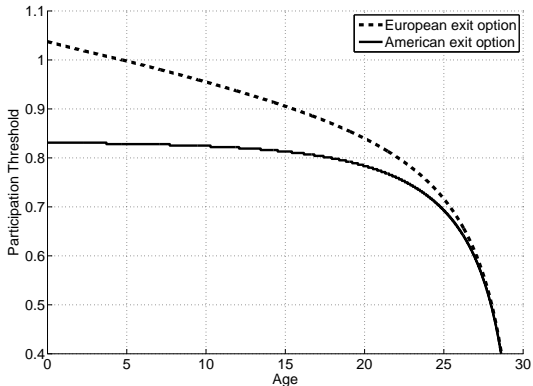
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- Common type of contributions in many collective public sector pension plans (e.g. ABP, PfZW, USS)
- Discussions on abolishing “doorsneesystematiek” in the Dutch occupational pension scheme: DNB Position Paper (January 2015), Kamerbrief SZW (July 2014), CPB Policy Letter (January 2014), AFM Position Paper (January 2015), Pensioenfederatie (December 2013)

# Participation Thresholds Pure DB



**Dashed line:** European option: 103.7% at entry

**Solid line:** American option: 83.1% at entry

# Combining Uniform and Age-Dependent

# Motivation

- Fine tuning the likelihood of participation: American option is beneficial for young, uniform policy is beneficial for old



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- Contribution policy:

$$\begin{aligned}c_{t-\nu,t} &= (1 - \zeta) \left[ \bar{c} + \frac{1}{t_R} (1 - \omega) \Omega_t \right] + \dots \\ \dots & \zeta \left[ \bar{c}_\nu + (1 - \omega) \Omega_t \frac{(\bar{c}_{t_R} - \bar{c}_\nu)^\theta}{\int_0^{t_R} (\bar{c}_{t_R} - \bar{c}_u)^\theta du} \right]\end{aligned}$$

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- Uniform:  $\zeta = 0$ ; age-dependent:  $\zeta = 1$ ; compromise:  $\zeta \in (0, 1)$

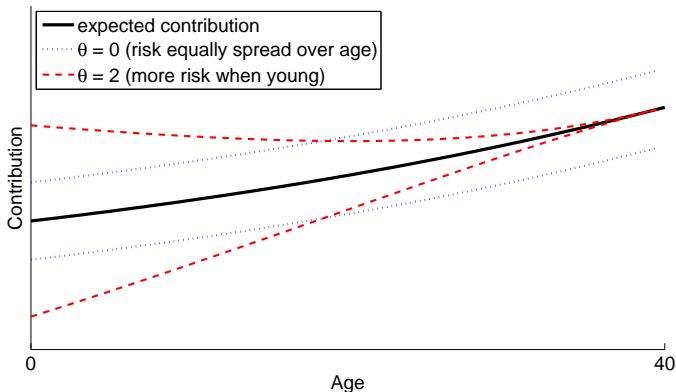
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- Uniform:  $\zeta = 0$ ; age-dependent:  $\zeta = 1$ ; compromise:  $\zeta \in (0, 1)$
- Risk equally spread over working cohorts:  $\theta = 0$   
more risk when young:  $\theta > 0$  (see next slide)

# Graphical Illustration



## Likelihood that no cohort exits

$\zeta$		$\omega = 0$ (DB)			$\omega = 0.5$ (hybrid)			$\omega = 1$ (DC)		
		0	0.5	1	0	0.5	1	0	0.5	1
$\sigma = 0\%$	$\alpha \in (0, 1)$	0	0	<b>100</b>	0	0	<b>100</b>	0	0	<b>100</b>
$\sigma = 10\%$	$\alpha = 0.25$	92.9	<b>95.5</b>	48.6	44.2	36.9	36.2	<b>36.6</b>	27.3	26.2
	$\alpha = 0.5$	89.8	93.1	48.0	45.1	38.1	37.5	36.5	26.3	25.5
	$\alpha = 0.75$	83.9	88.3	46.7	<b>45.9</b>	41.5	41.0	36.6	25.3	24.7
$\sigma = 15\%$	$\alpha = 0.25$	94.5	<b>95.7</b>	47.8	43.1	33.3	33.0	<b>29.3</b>	20.4	19.9
	$\alpha = 0.5$	91.9	93.3	46.8	<b>43.7</b>	34.4	34.2	28.6	19.4	19.0
	$\alpha = 0.75$	86.4	87.3	45.0	43.7	37.8	37.6	27.2	18.1	18.1
$\sigma = 20\%$	$\alpha = 0.25$	<b>95.5</b>	<b>95.5</b>	46.9	41.1	30.6	30.3	<b>24.3</b>	17.7	17.4
	$\alpha = 0.5$	92.7	92.7	45.6	<b>41.2</b>	31.7	31.6	23.8	17.4	17.2
	$\alpha = 0.75$	86.8	85.2	43.1	39.0	33.9	33.9	21.7	13.3	15.2

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# Additional Slides

## Related Literature

- **Benefits from collective funded pension plans:** Teulings and De Vries (2006); Ball and Mankiw (2007); Gollier (2008); Cui et al. (2011); Chen et al. (2014)
- **Conditions on voluntary participation in funded pension schemes:** Hemert (2005); Bommel (2007); Siegmann (2011); Beetsma et al. (2013); Beetsma and Romp (2013)
- **Applying option pricing theory to pensions:** Fung and Chan (1995); Blake (1998); Kocken (2006); Timmermans et al. (2011); Broeders et al. (2013)
- **American option of early retirement:** Friedman and Shen (2002); Chevalier (2006)
- **Least Squares Monte Carlo (LSMC) approach to value pension and life insurance products:** Pelsser et al. (2007); Bernard and Lemieux (2008); Cathcart and Morrison (2009); Boyer and Stentoft (2013); Chen (2015)

## Value of Participation

- Value of participation for generation  $s$  with age  $t_M$ :

$$Part_{s,s+t_M} = \underbrace{\exp[-r(t_R - t_M)] \Pi_{s+t_R}(B_{s,s+t_R})}_{\text{Discounted future retirement benefits}}$$

$$- \underbrace{E_{s+t_M}^Q \left[ \int_{t_M}^{t_R} c_{s+u} \exp[-r(u - t_M)] du \right]}_{\text{Discounted expected contribution payments}}$$

$$- \underbrace{\min(1, F_{s+t_M}) \Pi_{s+t_M}(B_{s,s+t_M})}_{\text{Value obtained from exiting}}$$

- We can algebraically derive that the participation threshold is at exactly 100%

## Participation Decision at Retirement (DB European)

- Value of participation at the age of  $t_R$ , i.e. the retirement age:

$$Part_{s,s+t_R} = \underbrace{\Pi_{s+t_R}(B_{s,s+t_R})}_{\text{PV retirement benefits}} - \underbrace{0}_{\text{Contributions}} - \underbrace{\min(1, F_{s+t_R}) \Pi_{s+t_R}(B_{s,s+t_R})}_{\text{Value obtained from exiting}}$$

$$\iff Part_{s,s+t_R} = \max(0, 1 - F_{s+t_R}) \Pi_{s+t_R}(B_{s,s+t_R})$$

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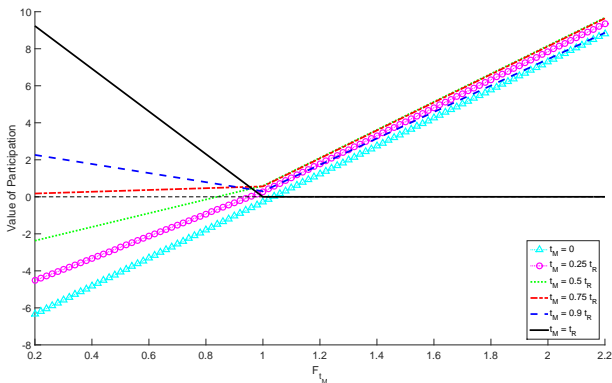
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$$\Leftrightarrow Part_{s,s+t_R} = \max(0, 1 - F_{s+t_R}) \Pi_{s+t_R}(B_{s,s+t_R})$$

- Overfunding:  $Part_{s,s+t_R} = 0$ .
- Underfunding:  $Part_{s,s+t_R} = (1 - F_{s+t_R}) \Pi_{s+t_R}(B_{s,s+t_R}) > 0$ .

# Participation Decisions (DB European)



Voluntary participation for funding ratio  $F_0 \geq 103.7\%$  at entry

# Example of a Hybrid Pension Scheme

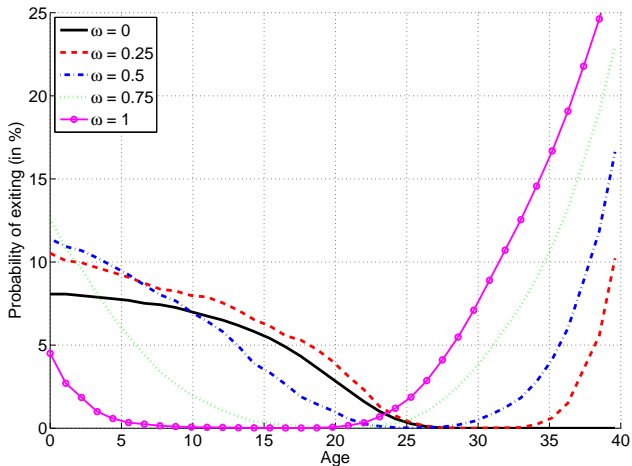
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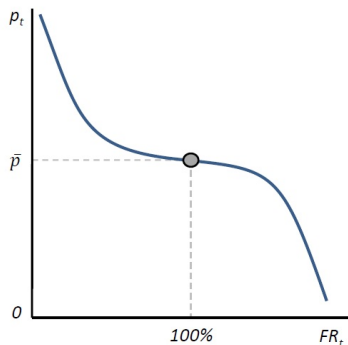
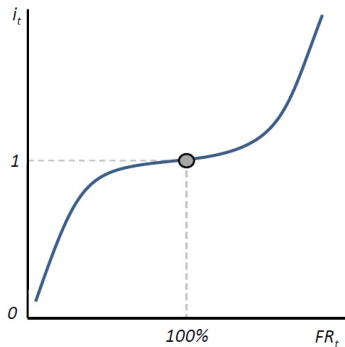
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# Exit Probabilities

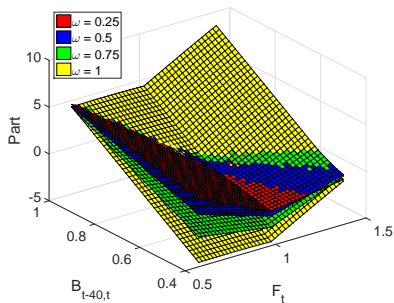
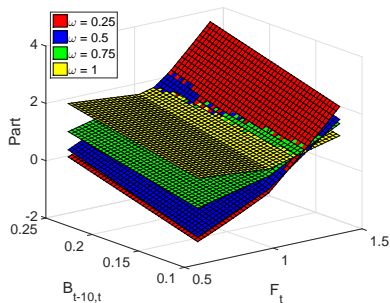


## Illustration Contribution Rate



*(i = indexation, p = contribution, FR = funding ratio)*

# Graphical Presentation (Hybrid American)



B: pension entitlements

F: funding ratio

Part: value of participation

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- At old ages and underfunding: the value of participation decreases due to reduced indexation
- Vice versa, at young ages:
  - A higher indexation rate benefits the older cohorts at the expense of the young workers, implying less room to reduce the contribution rate
- **DB pension scheme:** exiting never optimal at the retirement age  
**Hybrid and DC pension scheme:** exiting optimal for low funding rates. Also when the funding ratio is around 100% and the own pension entitlements are particularly low



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- Without risk ( $\sigma = 0$ ) only the age-dependent pension scheme survives
- With more risk ( $\sigma \uparrow$ ) the American exit option becomes more valuable, particularly for the young  $\rightarrow$  the likelihood that no cohort exits is larger when moving away from age-dependent towards the uniform pension scheme ( $\zeta \downarrow$ )

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- With more risk ( $\sigma \uparrow$ ) the American exit option becomes more valuable, particularly for the young  $\rightarrow$  the likelihood that no cohort exits is larger when moving away from age-dependent towards the uniform pension scheme ( $\zeta \downarrow$ )
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- Under the DB pension scheme, a short smoothing period is optimal, while under the hybrid pension scheme some risk smoothing might prevent old generations from exiting close before retirement

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- 7 This way, we have an approximation for the value of participation at each age  $\nu$  given some current state  $X_t$ :

$$\hat{Part}_{t-\nu,t} = X_t \hat{\beta}_\nu - \min \left( 1, \hat{F}_t \right) \Pi_t (B_{t-\nu,t}).$$

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