



# Optimal Risk Classification and Underwriting Risk for Substandard Annuities

September 7, 2009

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## Agenda

- Introduction
- The model framework
  - Basic model
  - Optimal risk classification
  - Optimal risk classification and costs of underwriting risk
- Market entry barriers and advantages
- Summary

# Introduction

## Motivation

- Substandard annuities offer increased pension payments for individuals with below-average life expectancy
  - Surprisingly rare except for in the U.K. market
  - Risk classification generally increases profitability (see Doherty, 1981), e.g., non-life
  - Private pensions for person's with impaired health
  - Reluctance of insurance companies to offer substandard annuity products

# Introduction

## Motivation

- Selling substandard annuities is a challenging task:
  - Establish classification system based on insured's life expectancy
  - Adequate underwriting guidelines are necessary

Underwriting criteria: medical conditions or lifestyle factors

- Include classification costs when pricing the contract
- Demand for product is determined by annuity amount

# Introduction

## Motivation

- Aim of this paper:
  - Comprehensive analysis with respect to substandard annuities
  - Combine two strands of literature: substandard annuities and risk classification
  - Develop a model to determine optimal profit-maximizing risk classification system for substandard annuities
  - Crucial: account for classification costs and underwriting risk
  - For (prospective) providers and standard insurers

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# The Model Framework

## Basic Model

- General population of potential risks with average population mortality
- Mortality heterogeneity in the general population considered by means of a frailty model
- Individual probabilities of death by application of a stochastic frailty factor to the population mortality table

$$q_x(d) = \begin{cases} d \cdot q'_x, & d \cdot q'_x < 1 \\ 1, & x = \min \left[ \tilde{x} \in \{0, \dots, \omega\} : d \cdot q'_{\tilde{x}} \geq 1 \right] \\ 0, & \text{otherwise} \end{cases} \quad \text{for } x \in \{0, \dots, \omega\}$$

# The Model Framework

## Basic Model

- Frailty factor specifies individual's state of health
- Frailty distribution represents distribution of different states of health (different life expectancies) in the general population

Non-negative

Continuous

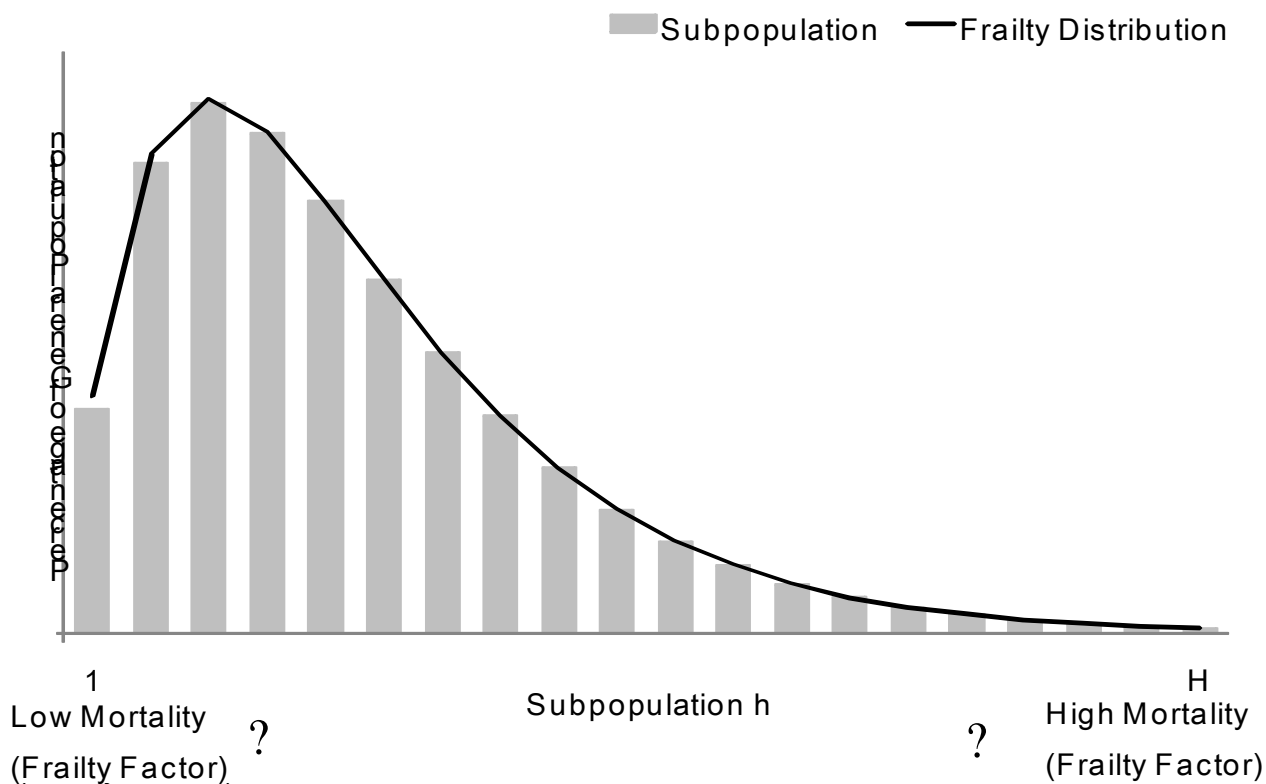
Flat at 0, right-skewed

Expected value of 1



# The Model Framework

## Basic Model

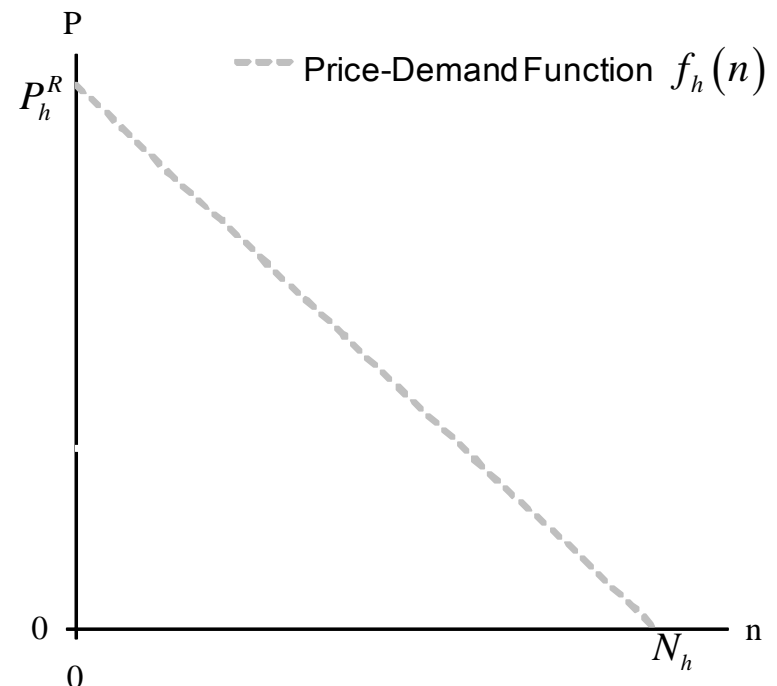


- $H$  different subpopulations with differing mortality level

# The Model Framework

## Basic Model

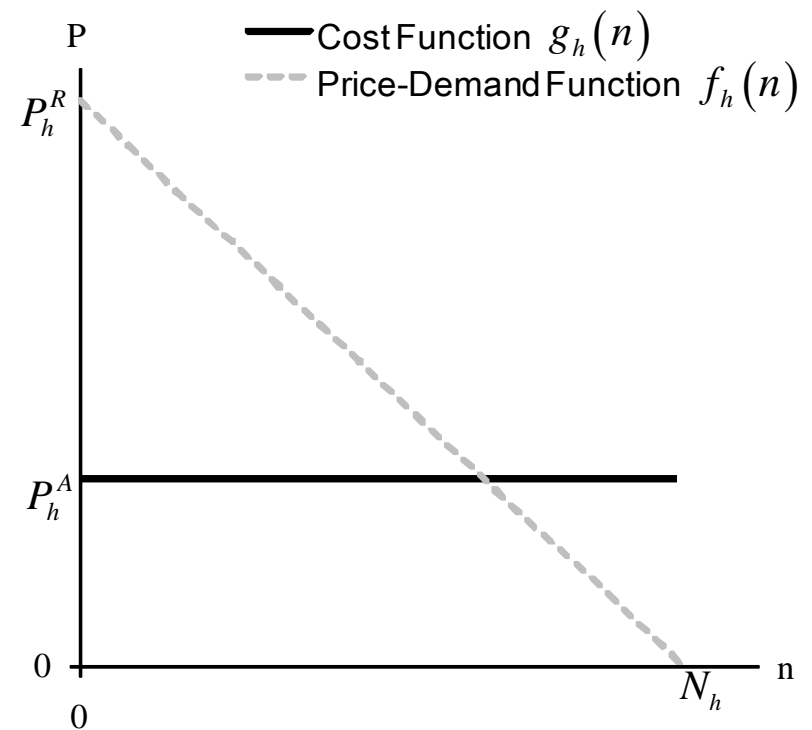
- Characteristics of subpopulation  $h, h=1, \dots, H$ 
  - Number of risks  $N_h$
  - Price-demand function  $f_h(n)$ 
    - Monotonously decreasing
    - Reservation price  $P_h^R$  decreases with increasing  $h$ :
 
$$P_1^R > P_2^R > \dots > P_H^R$$
    - $f_h(N_h) = 0$



## The Model Framework

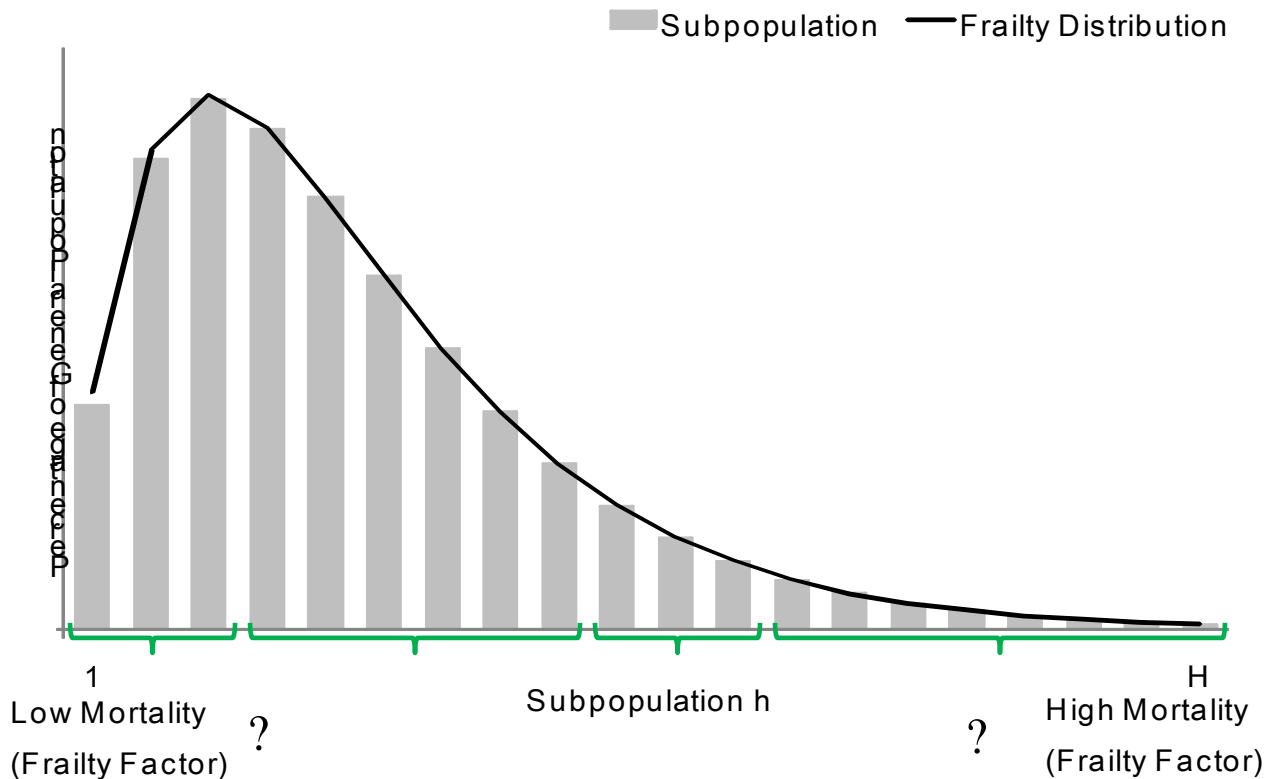
### Basic Model

- Cost function  $g_h(n) = P_h^A$
- Actuarial premium for covering the cost of (one unit of) annuity insurance for the average potential insured in subpopulation  $h$ )
- Depending on the average frailty factor  $\bar{d}_h$



# The Model Framework

## Optimal Risk Classification

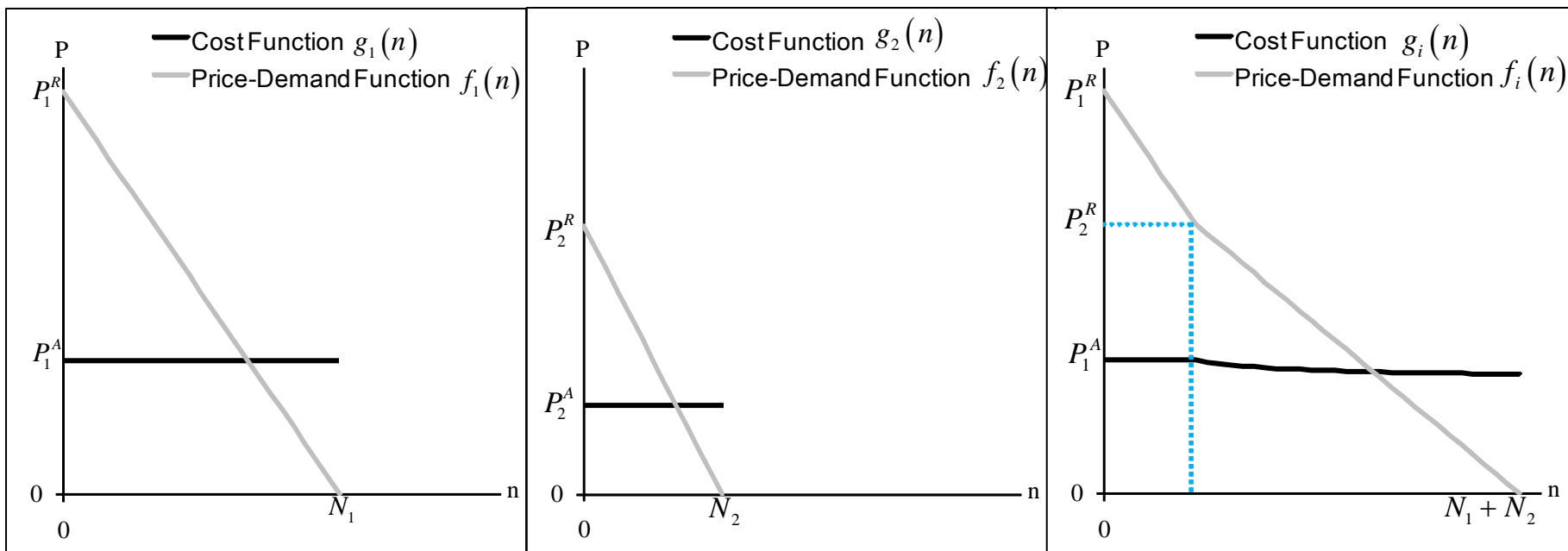


- $l_m$  risk classes  $i=1, \dots, l_m$  in classification system  $m$
- $M$  set of all possible classification systems  $m$

# The Model Framework

## Optimal Risk Classification

- Aggregate cost and price-demand function in risk class  $i$  consisting of 2 subpopulations



## The Model Framework

### Optimal Risk Classification

- Aggregate cost and price-demand function in risk class  $i$ , general formulas

$$f_i(n) = f_i(f_i^{-1}(P_i)) = f_i\left(\sum_{s=1}^{\nu} f_s^{-1}(P_i)\right)$$

$$g_i(n) = \frac{1}{n} \sum_{s=1}^{\nu} f_s^{-1}(f_i(n)) \cdot g_s(f_i(n)) = \frac{1}{n} \sum_{s=1}^{\nu} f_s^{-1}(P_i) \cdot g_s(P_i) = \frac{1}{n} \sum_{s=1}^{\nu} n_s \cdot P_s^A$$

$$\text{if } n \in I_{\nu} = \begin{cases} \left[ \sum_{s=1}^{\nu} f_s^{-1}(P_{\nu}^R), \sum_{s=1}^{\nu+1} f_s^{-1}(P_{\nu+1}^R) \right) & \text{for } \nu = 1, \dots, S_i - 1 \\ \left[ \sum_{s=1}^{\nu} f_s^{-1}(P_{\nu}^R), N_i \right] & \text{for } \nu = S_i. \end{cases}$$

## The Model Framework

### Optimal Risk Classification

- Profit in risk class  $i$

$$\Pi_i(n) = E_i(n) - C_i(n) = n \cdot f_i(n) - n \cdot g_i(n), n = 1, \dots, N_i$$

- Classification costs  $k(I_m - 1)$
- Total profit from classification system  $m$

$$\Pi(n_1, \dots, n_{I_m}) = \sum_{i=1}^{I_m} \Pi_i(n_i) - k(I_m - 1)$$

- Optimization problem

$$\max_{m \in M} \max_{\{(n_1, \dots, n_{I_m})\}} \Pi(n_1, \dots, n_{I_m})$$

# The Model Framework

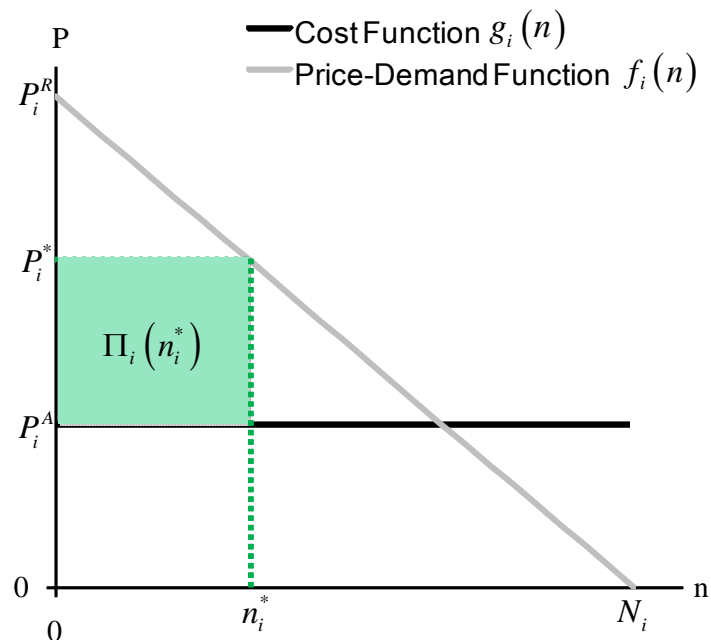
## Optimal Risk Classification

- Maximization in recurrent steps:

Find optimal price-demand combinations for each risk class  $i$  within each classification system  $m \in M$

$$n_i^{v*} = \operatorname{argmax}_{n_i^v \in I_v, v=1, \dots, S_i} \Pi_i(n_i^v)$$

$$m^* = \operatorname{argmax}_{m \in M} \Pi(n_1, \dots, n_{I_m})$$



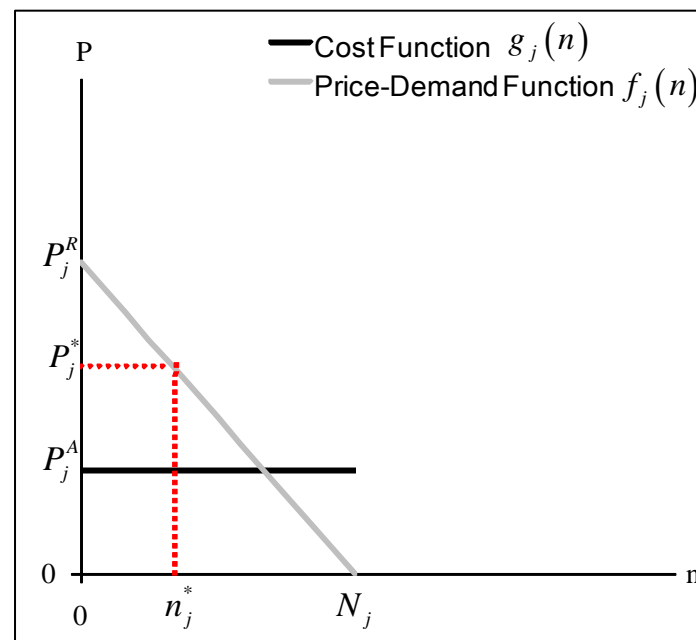
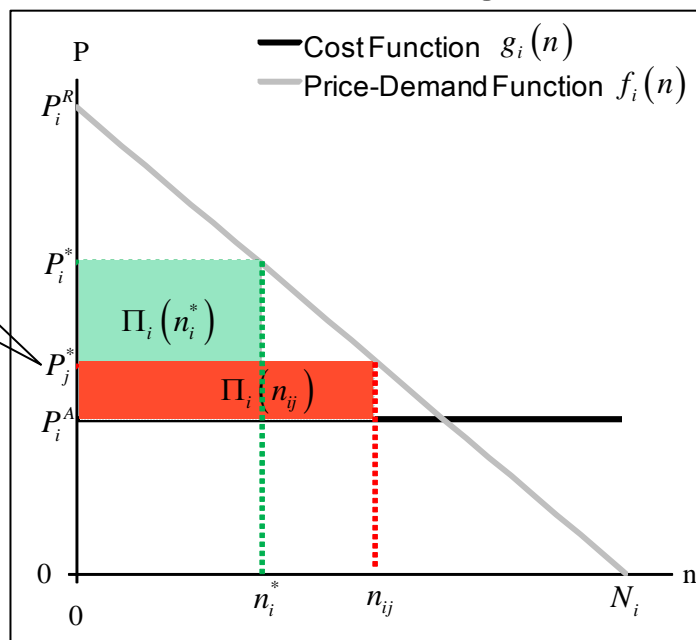


# The Model Framework

## Optimal Risk Classification & Costs of Underwriting Risk

- Underwriting risk is one of the main reasons why insurers are reluctant to engage in risk classification
- Ex.: Effect of underwriting errors for two risk classes

Underestimate true cost of insurance



## The Model Framework

### Optimal Risk Classification & Costs of Underwriting Risk

- Expected profit in risk class  $i$ , given probability  $p_{ij}$  of wrongly classifying (risk class  $j$  instead of  $i$ )

$$\tilde{\Pi}_i = \sum_{j \geq i} p_{ij} \Pi_i(n_{ij})$$

- Error probability depends on classification system:
  - Larger number of risk classes
    - => smaller differences between risk classes
    - => higher error probabilities for adjacent classes, but smaller effects of wrong classification
- Extended optimization problem:  $m^{**} = \operatorname{argmax}_{m \in M} \tilde{\Pi}(n_1, \dots, n_{l_m})$

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## Market entry barriers and advantages

- Market entry barriers
  - Classification costs
  - Underwriting risk
  - Market very competitive
  - Competition by other financial products
  - Low market awareness requires strong distribution system
  - Attractive and innovative product design needed
  - Impact on existing portfolios

## Market entry barriers and advantages

- Advantages
  - Huge market potential
  - Attractive for new market players
  - Possibility to reach broader population or niche markets
  - Early involvement prevents defensive reactions
  - Benefit of competitive advantage
  - Avoidance of adverse selection problems

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## Summary

- Propose a model for a risk classification system in a mortality heterogeneous general population
  - Solve for optimal number and size of risk classes
  - Profit-maximizing price-demand combination in each risk class
  - Extension: account for costs of underwriting risk in optimization
- Discuss market entry barriers and advantages
- In summary: Risk classification in annuity markets
  - ...not only increases profitability of insurance companies
  - ...but also benefits society at large, since formerly uninsurable persons gain access to private pensions



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**Optimal Risk Classification and  
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**Thank you very much for your attention!**

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