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## Multi-State Microeconomic Model for Pricing and Reserving a disability insurance policy over an arbitrary period

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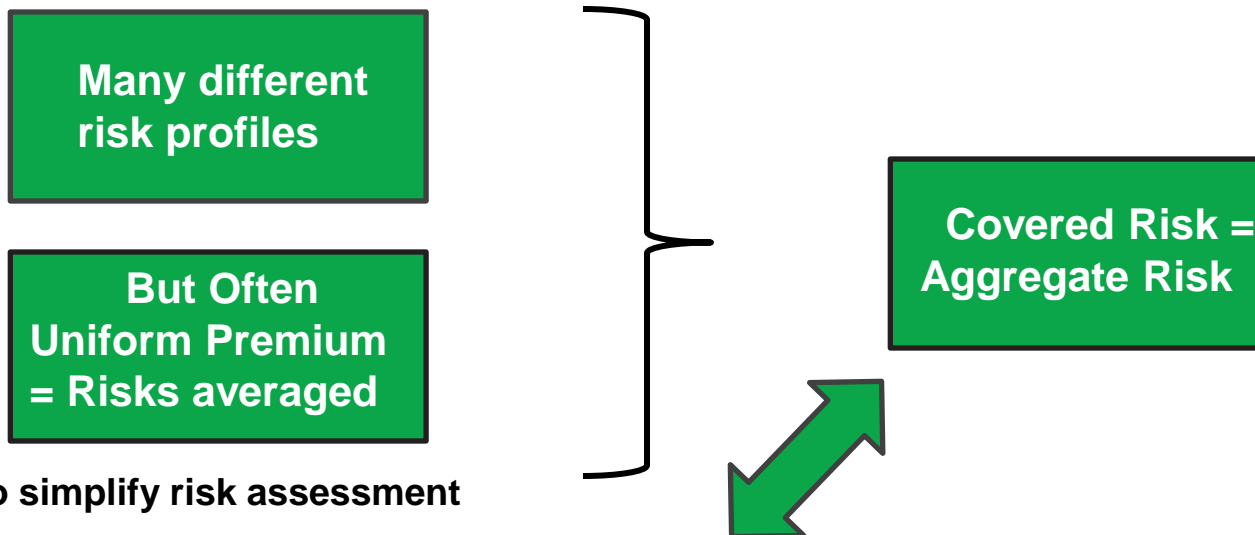
*Some key disability statistics:*

- *One disabling accident per second: US*
- *One disabling illness per 2 seconds: UK, Canada, France*



# Motivation and Setting

- The universal trigger event for Disability Insurance = the inability to work
- Compensation systems:
  - Public health insurance
  - Private health care coverage:
    - ✓ Group insurance
    - ✓ Individually purchased
- Group insurance « paradox »

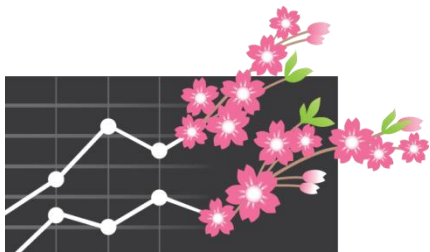


- Key idea to simplify risk assessment

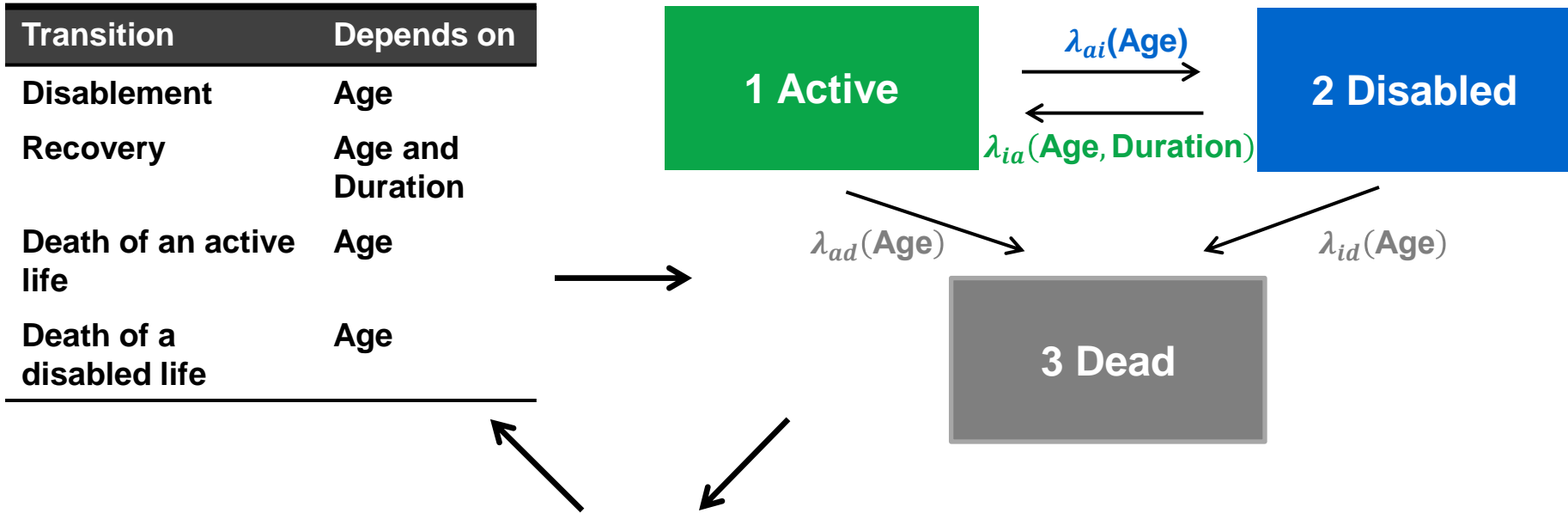
Make as if many identical individuals:  
Representative Insured (RI) Assumption



Multistate Modeling



# Overview of the Multi-State Model



Transition	Modeling	Resulting Process
Disablement	Poisson	Locally Time-Homogeneous Markov renewal
Recovery	Cox MPH	Locally Time-Homogeneous Semi-Markov
Death of an active life	Mortality Tables	Locally Time-Homogeneous Markov renewal
Death of a disabled life	Mortality Tables	Locally Time-Homogeneous Markov renewal



# Estimation and Graduation of Transition Intensities

- **Disablement**

Poisson coefficients  $\hat{\theta}$



$$\hat{\lambda}_{ai}(t|Z = z) = \exp(\hat{\theta}'z)$$

- **Recovery**

Cox Coefficients  $\hat{\beta}$   
Baseline Hazard  $\hat{\lambda}_{0,ia}(\cdot)$   
Frailty  $v$



$$\hat{\lambda}_{ia}(t|Z = z) = \hat{\lambda}_{0,ia}(t) \exp(z'\hat{\beta})v$$

- **Mortality**

Annual Mortality rates  $q_x$



$$\hat{\lambda}_{(i,a);d}(x \times 365.25) = -\frac{\ln(1-\hat{q}_x)}{365.25}$$



# Application

- **Representative insured**

- **Male**
- **25**
- **Large City**
- **Finance & Insurance**
- **\$ 65,000**

- **Main conditions**

Parameter	Value
Deferred Period	91 Days
Targeted replacement rate a	85 %
Maximum Benefit Amount	a x \$450,000
State-guaranteed minimum replacement rate	50%

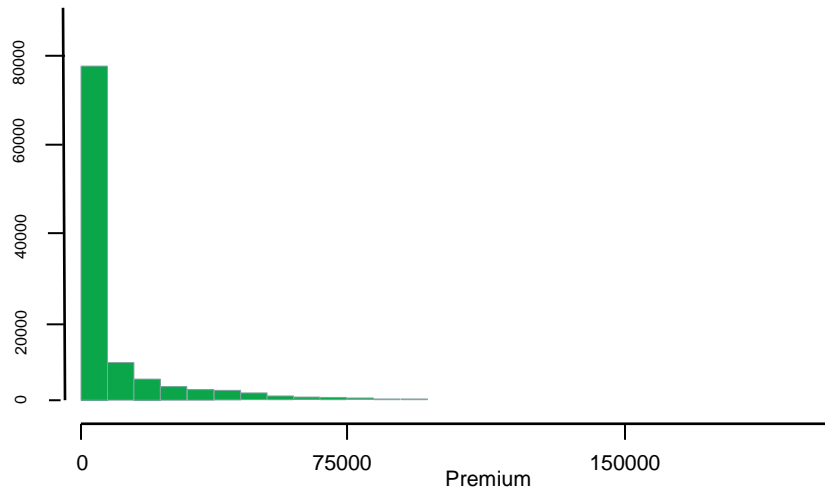
- **In the simplest case**

$$B(s, t) = a \times \text{Salary} \times (t - s)$$



# Simulation Results: Summary

## Empirical Distribution of the Discounted Cost



Statistic	Variable	
	Aggregate Duration of Disability Spells	Total Discounted Cost of DI
<b>Mean</b>	247.2	6,582.62
<b>Std Dev.</b>	205.4	14,446.32
<b>Skewness</b>	2.22	3.79
<b>Maximum</b>	2,684.3	258,342.07

Deferred Period

Coefficient of Variation > 2



# Towards a simple technical account

- Modified Standard Deviation Principle (MSDP) consistent with the assumption (RI)

➤ Aggregate Cost  $S_n$

$$\Pi(S_n) = \mathbb{E}[S_n] + \xi\sigma(S_n) \quad (\text{MSDP})$$

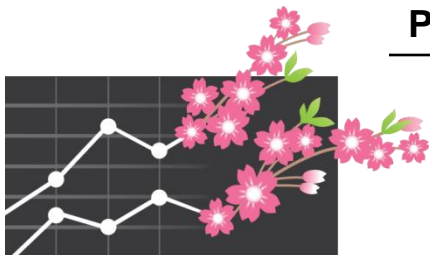
- The following convergence holds

$$S_n - \Pi(S_n) \xrightarrow{d} \mathcal{N}(-\xi, 1)$$

## Scenario :

- No waiver of premiums
- No disability > deferred period the first 2 years
- Risk horizon: retirement
- 99.5% solvency constraint

Time	$y = 0$	$y = 1^-$	$y = 2^-$
<b>Assets</b>	<b>271.25</b>	<b>279.39</b>	<b>567.16</b>
<b>Reserves</b>	<b>(117.63)</b>	<b>55.53</b>	<b>235.41</b>
<b>Claims paid</b>	<b>0</b>	<b>0</b>	<b>0</b>
<b>Profit</b>	<b>388.88</b>	<b>223.86</b>	<b>331.75</b>





# Conclusions and extensions



**(RI) assumption, although apparently rough, simplifies the Multi-State Model and facilitates risk management. We get more accurate and consistent pricing and reserving.**

- **Extensions**
  - Deviations from the rescaled limit distribution
  - Optimal Representative Insured
  - Heterogeneous insured models



# References

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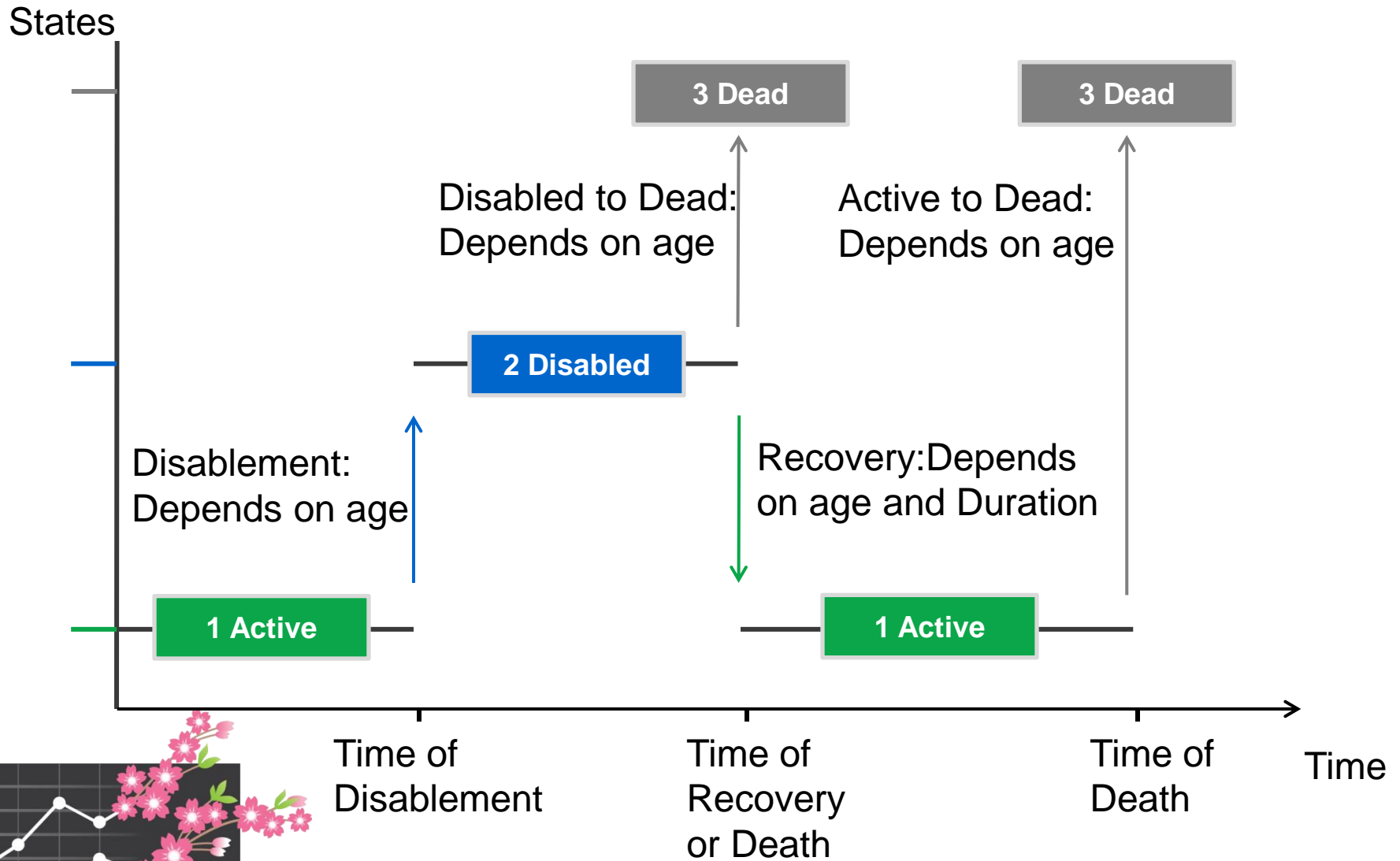
Thank you for your attention!



# Appendix



# Multi-State Model: a trajectory example



# Probabilistic Framework

- Let  $\{(X_t, D_t), t \geq 0\}$  be a bivariate process where  $X_t$  is the state occupied at time  $t$  (right-continuous paths) and  $D_t$  is the duration of stay in this state.
- Markov disablement process:** the instantaneous transition rate from the 'active' state to the 'disabled' state depends only on the age

$$\lambda_{ai}(x + t) = \lim_{\Delta t \downarrow 0} \frac{\Pr[X_{t+\Delta t} = i | X_t = a]}{\Delta t}$$

- Semi-Markov Recovery process:** depends both on the age and the duration of the current instance of disability

$$\lambda_{ia}(x + t; s) = \lim_{\Delta t \downarrow 0} \frac{\Pr[X_{t+\Delta t} = a | X_t = i, D_t = s]}{\Delta t}$$

- Mortality intensities from the disability state and from the 'active' state : equal and Markov**

$$\lambda_{id}(x + t) = \lambda_{ad}(x + t)$$



**Different assumptions drive transitions and require a modeling specific to each type of transition.**

# Reserves Dynamics

- **Thiele's differential equation for the Active Prospective Reserve**

For an insured aged  $x$  at policy issue, we have at time  $t \notin \text{Disc}(\Pi_a) = \{t_{a,0}, t_{a,1}, \dots, t_{a,q}\}$

$$dV_a(t) = r(t) V_a(t) dt + \pi_a(t) dt - \lambda_{ai}(x+t) dt (c_{ai}(t) + V_i(t, 0) - V_a(t)) + \lambda_{ad}(x+t) dt V_a(t)$$

where  $t \mapsto \Pi_a(t)$  is a right-continuous and non-decreasing premium process,

and  $t \mapsto c_{ai}(t)$  is a lump sum in case of transition to disability.

The solution is uniquely determined with the conditions

$$V_a(t_{a,j}) = V_a(t_{a,j}^-) + \Delta\Pi_a(t_{a,j}), \quad j = 0, 1, \dots, q$$

- **Thiele's differential equation for the Disabled Prospective Reserve**

For an insured aged  $x$  at policy issue, disabled at time  $t \notin \text{Disc}_s(B_i) = \{t_{i,s,0}, t_{i,s,1}, \dots, t_{i,s,q_s}\}$  with duration  $s$  since the disability onset

$$d_t V_i(t, s) = r(t) V_i(t, s) dt - d_s V_i(t, s) - b_i(t, t-s) ds - \lambda_{ia}(x+t, s) dt (V_a(t) - V_i(t, s)) + \lambda_{id}(x+t, s) dt V_i(t, s)$$

where  $(t, t-s) \mapsto B_i(t, t-s)$  is a right-continuous and non-decreasing benefit process, well-defined for  $t \geq s$ .

Again, the solution is uniquely determined with the conditions

$$V_i(t_{i,s,j}) = V_i(t_{i,s,j}^-) - \Delta B_i(t_{i,s,j}, t_{i,s,j} - s), \quad j = 0, 1, \dots, q_s$$



**Thiele's equations exhibit positive and negative contributions to the reserve, which make intuitive sense.**