

# Decumulation of Retirement Savings: *Are Modern Tontines the Solution?*<sup>1</sup>

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<sup>1</sup>Gold Open Access: *“Optimal performance of a tontine overlay subject to withdrawal constraints,”* ASTIN Bulletin (2024)

# Motivation

Defined Benefit Plans (DB) are disappearing

→ Corporations/governments no longer willing to take risk of DB plans

Recent survey<sup>2</sup> P7 countries<sup>3</sup>

- Defined Contribution (DC)<sup>4</sup> plan assets: 55% of all pension assets
- Some examples
  - Australia 87% DC
  - US 65% DC
  - Canada 43% DC
  - ...
  - Japan 5% DC

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Netherlands → *Collective* DC plan (2027)<sup>5</sup>

<sup>2</sup>Thinking Ahead Institute (2023)

<sup>3</sup>Australia, Canada, Japan, Netherlands, Switzerland, UK, US

<sup>4</sup>DC plan: retiree takes on all investment risk

<sup>5</sup>See “*Can DC participants trust the competence of Dutch pension funds,*” working paper, Georgetown University

# The retiree dilemma (Defined Contribution (DC))

A retiree with savings in a DC plan<sup>6 7</sup> has to decide on

- An investment strategy (stocks vs. bonds)
- A decumulation schedule

The retiree now has two major sources of risk

- Investment risk
- Longevity risk (running out of cash before death)

William Sharpe (Nobel Laureate in Economics) calls this

*“The nastiest hardest problem in finance”*

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<sup>6</sup>In a DC plan, the retiree is responsible for investment/decumulation

<sup>7</sup>RRSP (Canada), SIPP (UK), 401(k)(US), Super Fund (Australia)

# The Four per Cent Rule

Based on rolling 30-year historical periods, Bengen (1994) showed:

A retiree who

- Invested in a portfolio of 50% bonds, 50% stocks (US), rebalanced annually
- Withdrew 4% of initial capital (adjusted for inflation) annually
  - Would never have run out of cash, over any rolling 30-year period (from 1926)

Criticism

- Simplistic asset allocation strategy
- Simplistic withdrawal strategy
- Rolling 30 year periods contain large overlaps
  - Underestimates risk of portfolio depletion

## Bengen rule

*“Play the long game. A retirement income plan should be based on planning to live, not planning to die. A long life will be expensive to support, and it should take precedence over death planning.” Pfau (2018)*

Note that Bengen rule is based on assumption that 65-year old will live to be 95

- Should we mortality weight the cash flows (as in an annuity)?
- Example: median life expectancy of 65-year old male  $\simeq$  87.
  - Effectively, mortality weighting will weight minimum cash flow of 87-year old by  $1/2$
  - If I am 87, and alive, I need 100% of my minimum cash flows
  - If I am dead, I need zero dollars
- We will consider an individual investor, not averaging over a population
  - 30 year retirement, no mortality weighting
  - Consistent with Bengen approach

# Fear of running out of cash

Recent survey<sup>8</sup>

- Majority of pre-retirees fear exhausting their savings in retirement more than death

In Canada, a 65-year old male

- Probability of 0.13 of living to be 95
- Probability of 0.02 of living to be 100

Conservative strategy:

→ Assume 30 year retirement (as in Bengen (1994)).

Other assets can be used to hedge extreme longevity<sup>9</sup>

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<sup>8</sup>2017 Allianz Generations Ahead Study - Quick Facts #1. (2017), Allianz

<sup>9</sup>Real estate

# Objective of this talk

Determine a decumulation strategy which has

- Variable withdrawals (minimum and maximum constraints)
- Minimizes risk of portfolio depletion
- Maximizes total expected withdrawals
- Allows for dynamic, non-deterministic asset allocation
- Pool longevity risk using a Modern Tontine overlay

We will treat this as a problem in optimal stochastic control

## Modern Tontines (Individual Tontine Account)

DC members make irrevocable investment in a pooled fund

- If the member dies during a year, their assets distributed to the other members as longevity credits
- The sharing rule is actuarially fair, i.e. expected gain from participating is zero
  - If you are older or have more assets
    - You get a larger share of longevity credits

Advantage:

- Transparent, peer-to-peer risk sharing: DeFi<sup>10</sup>
- Can decide your own investment strategy
- Expected withdrawals larger than a conventional TradFi<sup>11</sup> product
  - Retiree bears investment risk, systematic mortality risk
  - Assets forfeited on death (as in conventional DB plan, annuity)

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<sup>10</sup>Decentralized Finance

<sup>11</sup>Traditional Finance

## Mortality Credits: Example

CPM2014 Life table: theoretical longevity credit

- Yearly credit for 76-year old male: 2%
- Yearly credit for 86-year old male: 8%
- Yearly credit for 96-year old male: 33%

Example:

- 85 year-old, living member of pool on January 1, 2024
- Total wealth  $W$  in account (December 31, 2024)
- If he is still alive on January 1, 2025 (now 86 year old)
  - He will earn longevity credit of  $0.08W$

Theoretical credit depends only on

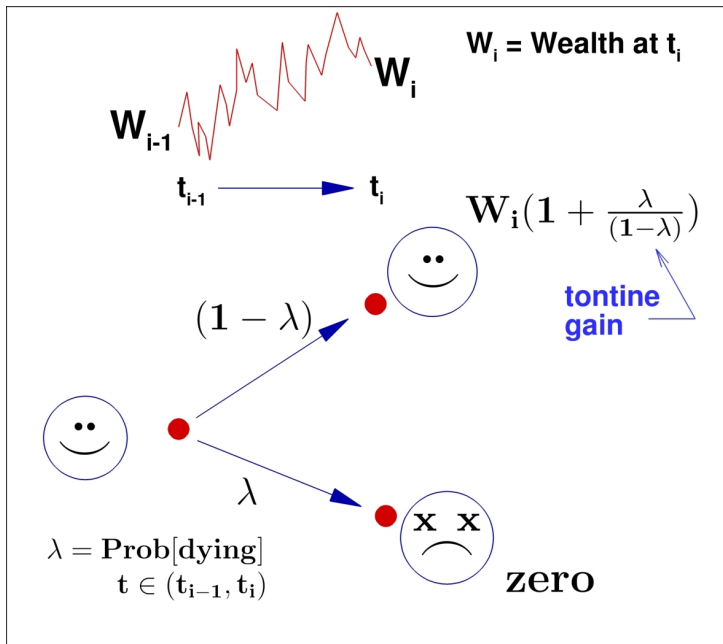
- Your age and your account balance

Does not depend on how anyone else invests, their age, or their account balances!<sup>12</sup>.

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<sup>12</sup>This is a counterintuitive result, see R. Fullmer, Tontines: a practitioner's guide, CFA Institute (2019), and references therein

## Tontines at a glance



## How does this work in practice?

Define for each year:

$$\left\{ \begin{array}{l} \text{Group} \\ \text{Gain} \end{array} \right\} = G = \frac{\text{Total actual assets forfeited due to deaths in pool}}{\text{Total expected longevity credits for survivors}}$$

$$\begin{aligned} & \text{Actual longevity credit for each investor} \\ & = \text{Theoretical Credit} \times G \end{aligned}$$

This ensures that total longevity credits handed out

→ Equals total assets forfeited

Can show that  $E[G] = 1$ ,  $\text{Var}[G] \rightarrow 0$  if

- Pool is sufficiently large
- Diversity condition holds <sup>13</sup>

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<sup>13</sup>The expected total longevity credits must be large compared to any members expected credit. Simulations: perpetual pool size  $\simeq$  5,000-15,000.

# Formulation

Investor has access to two funds

- A broad stock market index fund
  - *Amount* in stock index  $S_t$
- A constant maturity bond index fund
  - *Amount* in bond index  $B_t$

$$\text{Total Wealth } W_t = S_t + B_t \quad (1)$$

Model the returns of both indexes

- Parametric, jump diffusion
- Non-zero stock-bond correlation
- Fit parameters to market data 1926:1-2020:12  
↔ All returns adjusted for inflation

## Notation

Withdraw/rebalance at discrete times  $t_i \in [0, T]$

The investor has two controls at each rebalancing time

$q_i$  = Amount of withdrawal

$p_i$  = Fraction in stocks after withdrawal

$$\begin{aligned} W_i^- &= \text{wealth after tontine gains and fees} \\ &\quad \text{before withdrawals} \\ &= \underbrace{(S_i^- + B_i^-)}_{\text{Before gains/fees}} \underbrace{(1 + \text{tontine gain})(1 - \text{fees})}_{\text{tontine gains and fees}} \end{aligned}$$

At  $t_i^+$ , the investor withdraws  $q_i$

$$W_i^+ = W_i^- - q_i$$

# Rebalancing

Recall that

$W_i^-$  = wealth after tontine gains and fees  
before withdrawals

$W_i^+$  = wealth after withdrawals

Then, the investor rebalances the portfolio

$$S_i^+ = p_i W_i^+$$

$$B_i^+ = (1 - p_i) W_i^+$$

# Controls

## Constraints on controls

$q_i \in [q_{\min}, q_{\max}]$  ; withdrawal amount

$p_i \in [0, 1]$  ; fraction in stocks

$\Rightarrow$  no shorting, no leverage

## Set of controls

$$\mathcal{P} = \{ (q_i(\cdot), p_i(\cdot)) : i = 0, \dots, M \} \quad (2)$$

## Reward and Risk

**Reward:** Expected total (real) withdrawals (EW)

$$\text{EW} = E \left[ \overbrace{\sum_i q_i}^{\text{total withdrawals}} \right]$$

$E[\cdot] = \text{Expectation}$

**Risk measure:** Expected Shortfall  $ES$

$$ES(5\%) \equiv \left\{ \text{Mean of worst 5\% of } W_T \right\}$$

$W_T = \text{terminal wealth at } t = T$

ES defined in terms of final wealth, *not losses*<sup>14</sup>

→ Larger is better

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<sup>14</sup>ES is basically the negative of CVAR

# Objective Function

Multi-objective problem  $\rightarrow$  scalarization approach for Pareto points

Find controls  $\mathcal{P}$  which maximize (scalarization parameter  $\kappa > 0$ )<sup>15</sup>

$$\sup_{\mathcal{P}} \left\{ EW + \kappa ES \right\}$$
$$\sup_{\mathcal{P}} \left\{ \overbrace{E_{\mathcal{P}} \left[ \sum_i q_i \right]}^{\text{total withdrawals}} + \kappa \left( \overbrace{\frac{E_{\mathcal{P}} [W_T \mathbf{1}_{W_T \leq W^*}]}{.05}}^{\text{mean worst 5\% outcomes}} \right) \right\}$$

s.t.  $Prob[W_T \leq W^*] = .05$

Varying  $\kappa$  traces out the efficient frontier in the  $(EW, ES)$  plane

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<sup>15</sup> $E_{\mathcal{P}}[\cdot] \equiv$  expectation under control  $\mathcal{P}$ .

## EW-ES Objective Function

Given an expectation under control  $E_{\mathcal{P}}[\cdot]$  (Rockafellar and Uryasev, 2000 )

$$\begin{aligned} \text{ES}_{5\%} &= \sup_{W^*} E_{\mathcal{P}} \left[ G(W_T, W^*) \right] \\ G(W_T, W^*) &= \left( W^* + \frac{1}{.05} [\min(W_T - W^*, 0)] \right) \end{aligned}$$

Reformulate objective function:

$$\sup_{\mathcal{P}} \sup_{W^*} E_{\mathcal{P}} \left\{ \overbrace{\sum_i q_i}^{\text{total withdrawals}} + \kappa \overbrace{G(W_T, W^*)}^{\text{mean worst 5\% } W_T} \right\}$$

Under above assumptions: can show that<sup>16</sup>

$$q_i = q_i(W_i^-) \quad ; \quad p_i = p_i(W_i^+)$$

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<sup>16</sup> $q_i$  withdrawal,  $p_i$  fraction in stocks,  $W^\pm$  wealth before/after withdrawals

# Time Consistency

The EW-ES objective function is not formally *time consistent*

Time inconsistency

⇒ Investor has incentive to deviate from initial optimal policy at later times

EW-ES policy computed at time zero

↔ Pre-commitment policy

## Induced time consistent policy

At  $t_0$  we compute the pre-commitment EW-ES control

- For  $t > t_0$  we assume that the investor follows the *induced time consistent* control (Strub et al (2019))
- This control is identical to the pre-commitment control at  $t_0$
- No incentive to deviate from this control at  $t > t_0$

Induced time consistent control determined from (fixed  $W^*$ )

$$\sup_{\mathcal{P}} E_{\mathcal{P}} \left\{ \sum_i q_i + \kappa G(W_T, W^*) \right\}$$

$W^*$  from pre-commitment solution at time zero

Alternative: equilibrium mean-ES control

↔ Does not actually control tail risk! (Forsyth(2020)) <sup>17</sup>

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<sup>17</sup>For more discussion of time consistency, induced time consistency, pre-commitment, see Bjork et al (2021), Vigna (2020, 2022), Strub et al (2019), Forsyth (2020)

## Scenario: all amounts indexed to inflation

- DC account at  $t = 0$  (age 65) \$1,000K (one million)
  - Minimum withdrawal from DC account \$40K per year<sup>18</sup>
  - Maximum withdrawal from DC \$80K per year
  - Fees: 50bps per year
- No shorting, no leverage, annual rebalancing
- Investment Horizon:  $T = 30$  years, i.e. from age 65 to 95
  - ↪ Tontine gains: CPM 2014 mortality table
- Assume pool is very large, diverse so that
  - ↪ Group Gain  $G \equiv 1$
- Retiree owns mortgage-free real estate worth \$400K
  - ↪ Hedge of last resort (reverse mortgage)

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<sup>18</sup>Never less than Bengen rule:  $40K/1000K = 4\%$

## Scenario II

Why do we include real estate in the scenario?

Since  $q_{\min} = 40K$  per year,  $W_t$  can become negative

- When  $W_t < 0$ , assume retiree is borrowing, using a reverse mortgage<sup>19</sup>
  - Reverse mortgages allow borrowing of 50% of home value
  - In our case: \$200K
- Once  $W_t < 0$ 
  - All stocks are liquidated
  - Debt accumulates at borrowing rate
- If  $W_T > 0$ , then real-estate is a bequest
- Real estate is a hedge of last resort: not fungible with other wealth
  - This mental bucketing of real estate is a well-known behavioral finance result.<sup>20</sup>

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<sup>19</sup>See Pfeiffer et al, Journal of Financial Planning (2013)

<sup>20</sup>I also observe this with my fellow retirees: real-estate is a separate bucket

# Numerical Method I

Pre-commitment control at  $t_0$  (same as induced time consistent control)

Interchange  $\sup \sup(\dots)$

$$\sup_{W^*} \overbrace{\sup_{\mathcal{P}} E_{\mathcal{P}} \left\{ \sum_i q_i + \kappa G(W_T, W^*) \right\}}^{\text{Solve using Dynamic Programming (fixed } W^*)}$$

*maximize over  $W^*$*

Solve inner DP problem using PIDE methods

# Numerical Method II

Inner maximization: dynamic programming

- Conditional expectations at  $t_i^+$ 
  - Solve linear 2-d PIDE
  - Use  $\epsilon$ -monotone Fourier method (Forsyth and Labahn (2019))
- Optimal controls at each rebalancing time
  - Discretize controls
  - Find maximum by exhaustive search
- Guaranteed to converge to the solution as discretization parameters  $\rightarrow 0$

Outer maximization over  $W^*$

- Discretize  $W^*$ , use coarse PIDE grid
  - $\rightarrow$  Find optimal  $W^*$  by exhaustive search
- Use coarse grid  $W^*$  as starting point for 1-d optimization on finer grids

# Data

## Center for Research in Security Prices (CRSP) US

- Cap weighted index, all stocks on all major US exchanges  
1926:1-2020:12
- US 30-day T-bill<sup>21</sup>
- Monthly data, inflation adjusted by CPI

## Synthetic Market

- Stock/bond returns driven by parametric jump-diffusion model, calibrated to data
- Optimal controls computed in the *synthetic* market

## Historical market

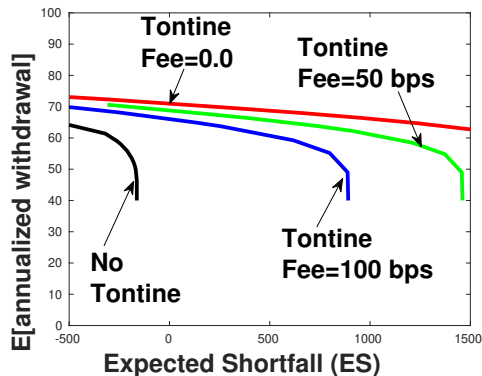
- Stock/bond returns from stationary block bootstrap resampling of actual data<sup>22</sup>
- No assumptions about stock/bond processes
- Used to test control robustness computed in the synthetic market

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<sup>21</sup>Slightly better results with 10 year Treasuries

<sup>22</sup>Dichtl et al (2016, Appl. Econ.), Anarkulova et al (JFE,2022)

## Synthetic Market Results (parametric model)



Efficient frontier: fixed ES  
↔ Largest possible expected withdrawal  
↔ Pareto optimal points

- Farther to right is better
- Farther up is better

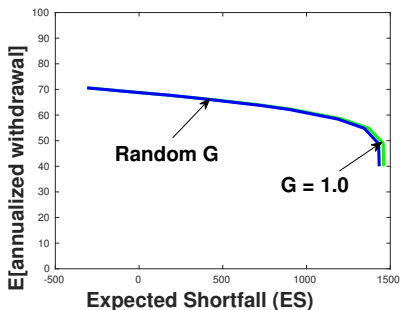
Base case fee 50bps

X-axis: expected shortfall (larger better)

Y-axis: Expected annualized withdrawal (larger better)

No Tontine: Optimal strategy, no Tontine overlay

## Effect of Random G



Compute control with  $G \equiv 1$   
 $\leftrightarrow$  Test with random G (Monte Carlo simulation)

Random G: simulation of pool with 15K members

Fit to normal distribution with  
 $E[G] = 1$  ,  $std[G] = 0.1^a$

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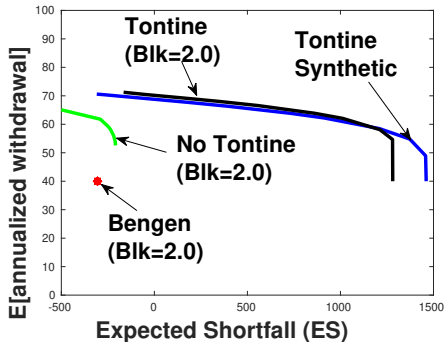
<sup>a</sup>Fullmer and Sabin (2019) CFA white paper

$$\text{Actual Mortality Credit} = \text{Theoretical Credit} \times \underbrace{G}_{\text{Group Gain}}$$

### Random G Statistics

- Different ages, genders, investment strategies
- Perpetual pool, random initial wealth

# Efficient Frontier: Historical Market (bootstrap resampling)



**Synthetic:** Control computed using parametric model

**Blk = 2.0:** Control tested on block bootstrap resampled historical data

↪ Blocksize = 2yrs

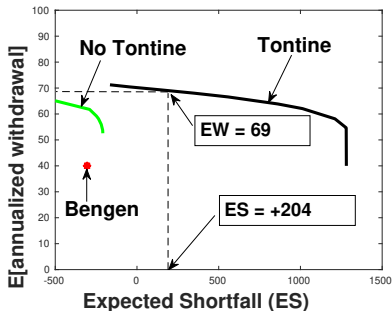
↪ Out-of-sample test

**Bengen:** 4% rule

**No Tontine:** Optimal strategy, no Tontine overlay

- X-axis: expected shortfall (larger better)
- Y-axis: Expected annualized withdrawal (larger better)

# How bad is the Bengen 4% rule? (Bootstrap simulations)



## Bengen:

↪  $EW = +40K/\text{year}^a$

↪ Expected shortfall = -303K !

## Tontine:

↪  $EW = +69K/\text{year}$

↪ Expected shortfall = +204K

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<sup>a</sup>EW = Expected annualized Withdrawals

- Tontine:  $(EW, ES) = (69, +204)$

- Never withdraws less than Bengen

- Expected withdrawals 6.9%/year<sup>23</sup>

- $ES = +204K$  at age 95

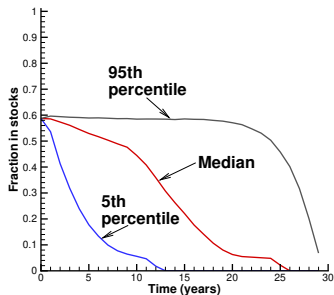
- Mortality credit for 95 year old:  $\simeq 33\%$  per year!

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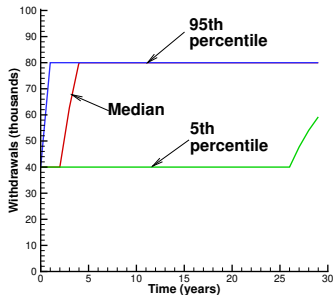
<sup>23</sup>6.9% of initial capital, adjusted for inflation.

Point on Frontier:  $(EW, ES) = (69K/\text{year}, +204)$

Percentiles: fraction in equities



Percentiles: withdrawals

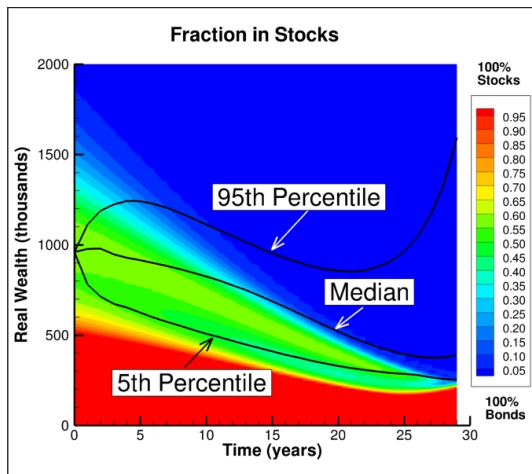


→  $ES \simeq +204$

→ 5th percentile wealth at  $t = 30 \simeq +300K$

→ Average withdrawal  $\simeq 69K/\text{year}$

# Asset Allocation Heat Map



Point on Frontier:  
(EW,ES) = (69K/year,  
+204K)

Blue: 100% bonds  
Red: 100% stocks

Optimal fraction in  
stocks

Function of observed  
wealth, time

- Over 30 years

→ Fraction in stocks  $\leq 0.60$  with 95% probability

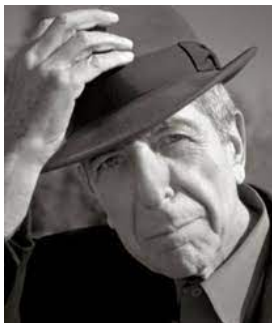
# Conclusions

- Tontine overlay: peer to peer longevity risk sharing
  - Investment/withdrawal strategy entirely under retiree's control
- Significantly larger expected withdrawals compared to industry standard (Bengen)
  - ⇒ Significantly smaller probability of running out of cash
- Bootstrap resampling
  - ⇒ controls are robust
- Tontine provider has no risk
  - Fees can be very low
- But there is no free lunch
  - “If you want more money when you are alive, you have to give up some when you are dead.” (Moshe Milevsky)*

## A thought about life

To paraphrase Leonard Cohen<sup>24</sup>

*"The problem with turning 70, is that I can no longer think of myself as a young man."*



- When I first heard this, I thought this was ridiculous
  - Of course, a 70-year old is a very old man
- Now, I understand exactly what Leonard was saying

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<sup>24</sup>Famous Canadian songwriter/singer, perhaps best known for *"Hallelujah."*