



SOCIETY OF
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2019 **ANNUAL
MEETING**
& EXHIBIT

October 27-30
Toronto, Canada

Session 025: Post Level Term: Lapse and Mortality Risk Considerations

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Session 25: Post Level Term: Lapse and Mortality Risk Considerations

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October 28, 2019



SOCIETY OF ACTUARIES

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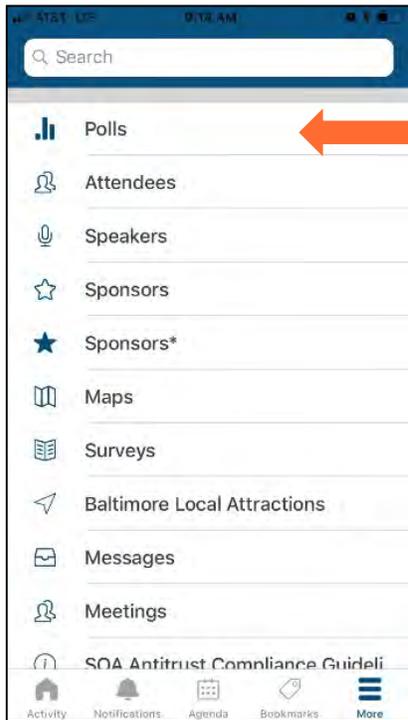
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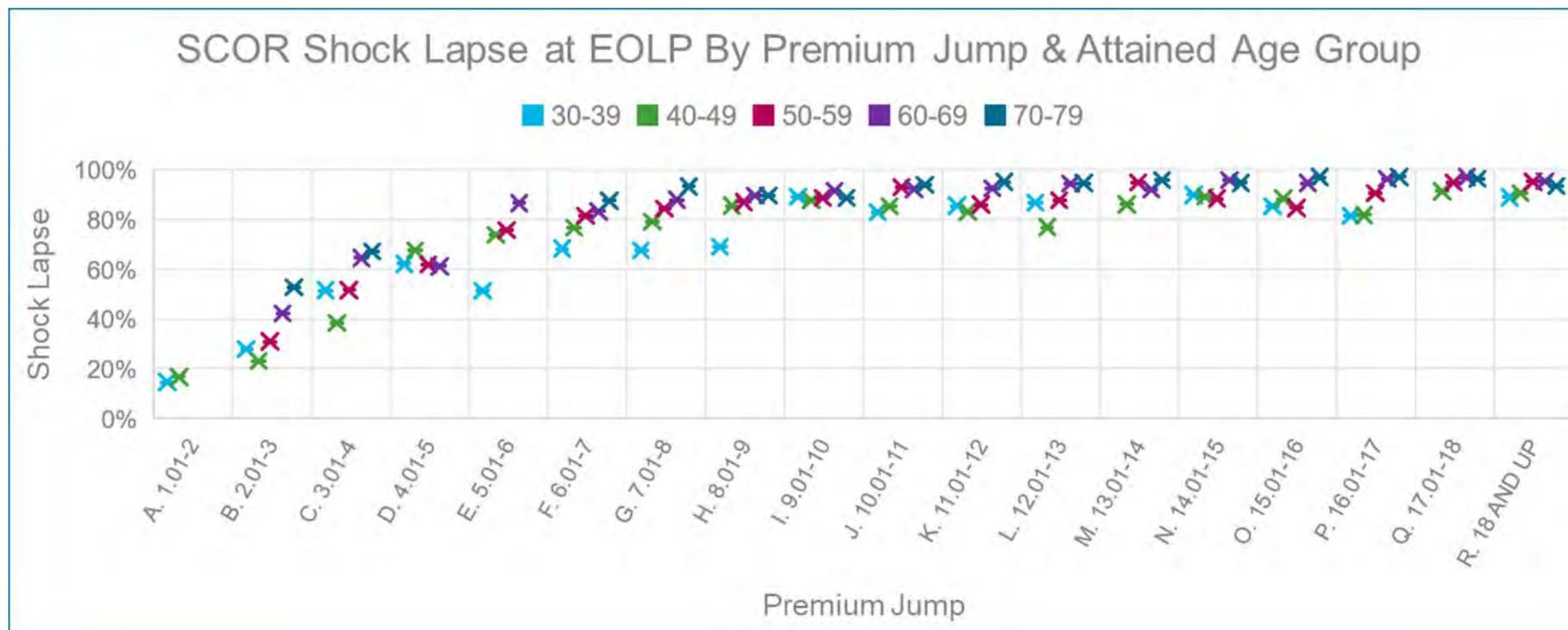
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Poll: Who's in the room?

Statistical Modelling for PLT Lapse & Mortality

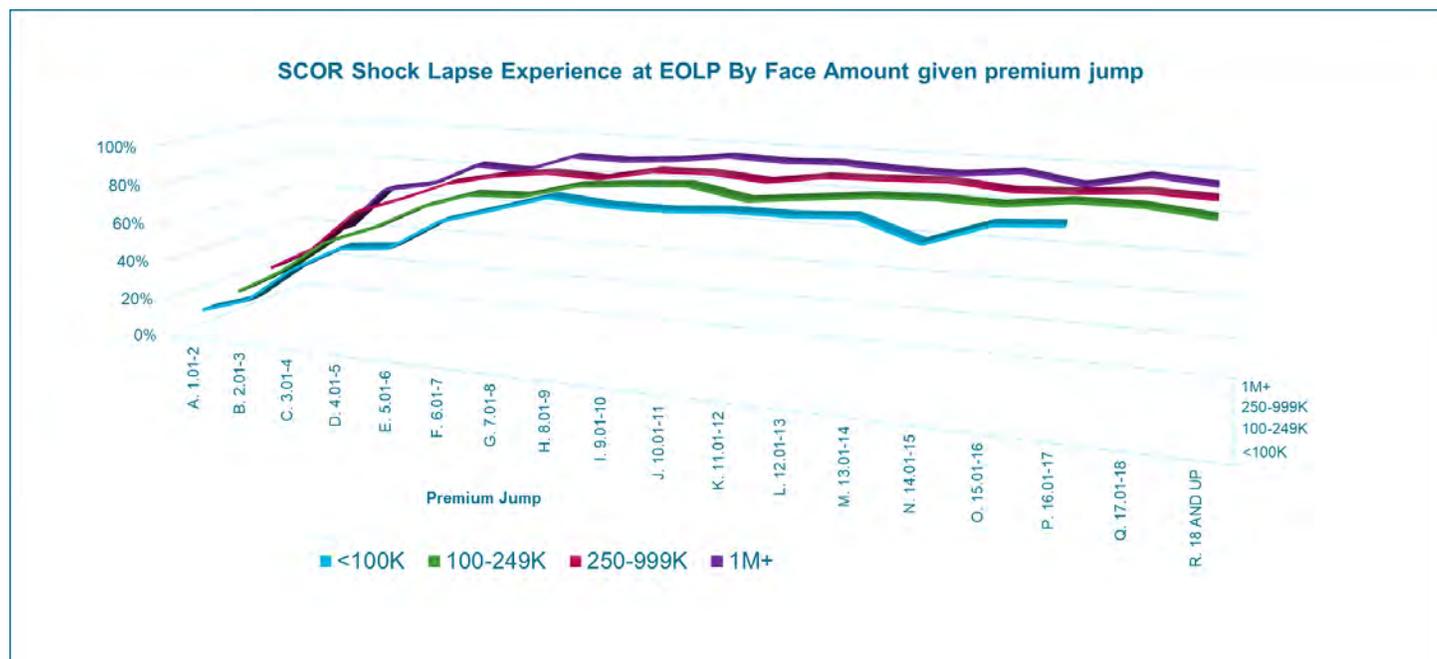
- Shock lapse modelling using GLM
- Subsequent PLT lapse modelling
- Considerations when modelling PLT Graded structures
- Advanced Analytics and alternative approaches to lapse modelling
- PLT mortality modelling

Shock lapse at end of term



- Higher shock lapse for higher premium jump
- Increasing pattern by age
- Significant age variation at lower premium jumps

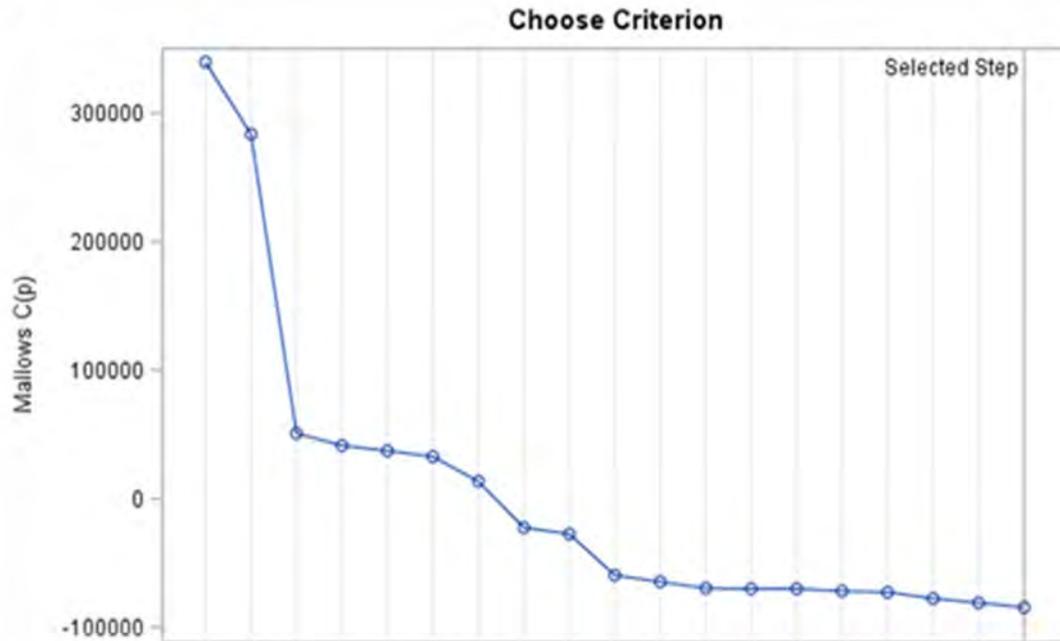
Shock lapse at end of term



- Face amount variation evident even within premium jump groups
- Higher shock lapse for higher face amount policies
- Larger dollar increase for the same relative jump

Identified potential to vary the PLT assumptions by more factors, in addition to premium jump

Shock Lapse Variable Selection



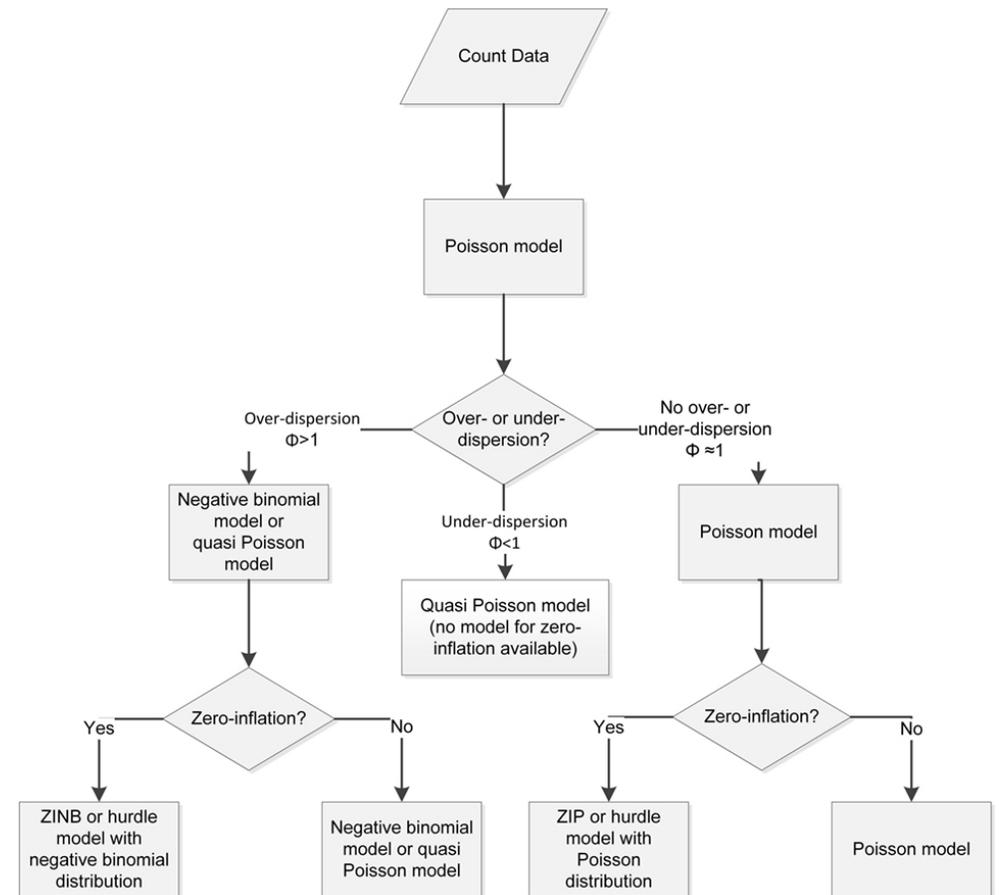
- Variable selection for “best” subset of predictors
- Mallows Cp criterion is minimized to find the most precise model
- Premium jump ratio is the most significant variable
 - Does not provide the full picture
- Also important :
 - Attained age
 - Face Amount
 - Risk Class
- Interaction terms with premium jump are considered
 - Gender is more significant as an interaction term

Interaction terms form the proxy for absolute premium jump in USD terms

Building a Predictive Model

Predictive Model for Shock Lapse at PLT

- Using shock lapse experience data on counts basis, a GLM predictive model is built
- Generalized Linear Model (GLM)
- Poisson model suitable for counts
- Overdispersion: the variance of the response variable exceeds the mean
- Quasi Poisson Regression Model is used



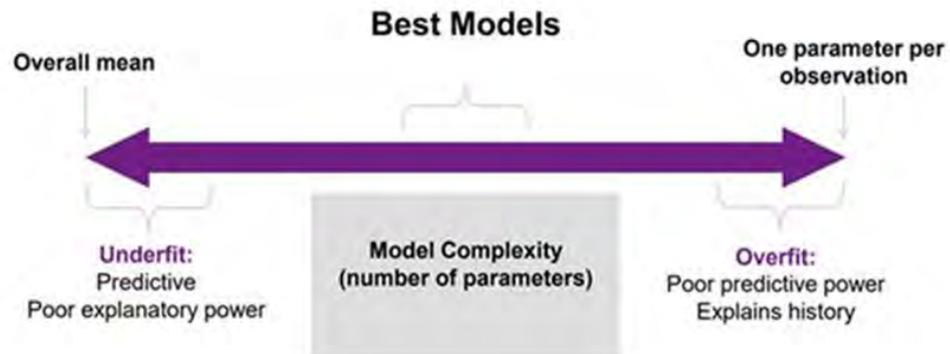
Source: A Comparative Approach to Identify an Appropriate Regression Model for Count Data:
<https://pdfs.semanticscholar.org/8ab1/829f559b869eeb48e38f15c5d94dc957a0f5.pdf>

Optimal model

Quality measures for statistical models

Model considerations

Goal is to produce predictive model without overfitting



- Consider additional variable until all shock lapse variation is explained
- Akaike information criterion (AIC) and Bayesian Information Criterion (BIC) are useful tools
 - The model with the lowest AIC/BIC is the best fit
 - If adding an additional variable does not reduce AIC/BIC, the variable does not add further explanation of the lapse rates.
- Iterations required to find the optimal model

Predictive Model – Autoregression for later durations

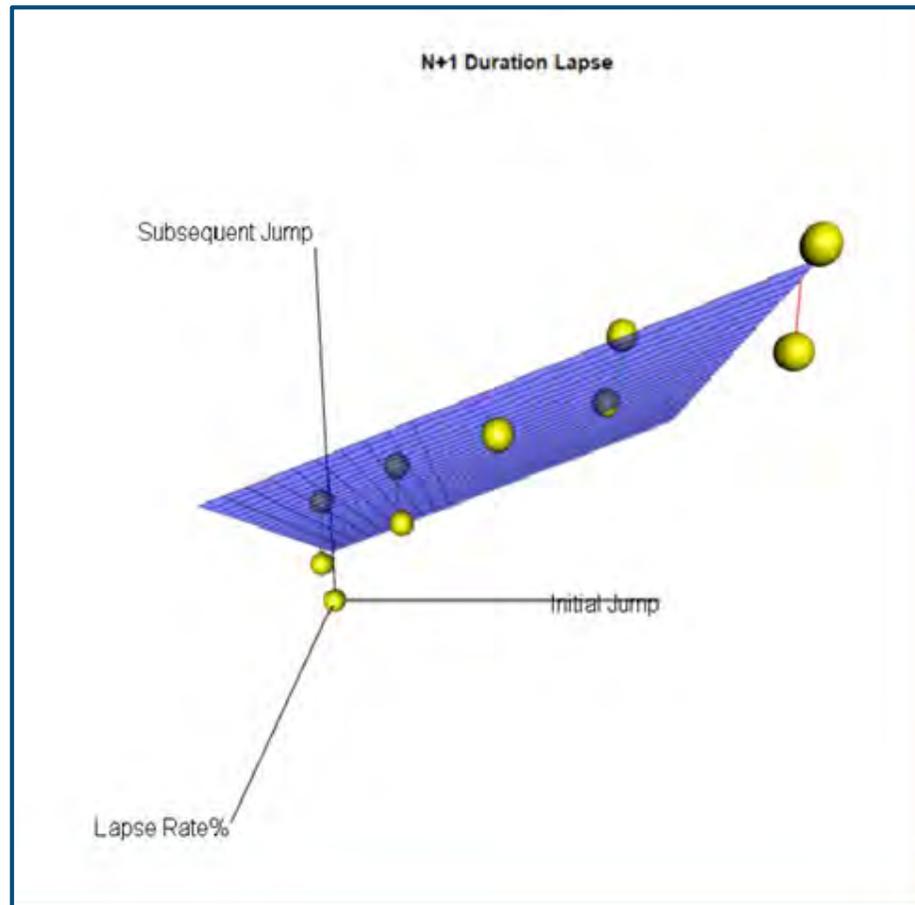
- Premium jump at end of term becomes less relevant at later durations
 - Yet initial jump still accounts for the most significant portion of premium
 - Subsequent increases are annual age-rated increases
- At later durations, credibility by premium jump bucket is reduced
 - Especially for higher premium jumps, higher initial shock lapse
- Autoregressive model was built where the initial shock lapse is an explanatory variable

AR(1) process (**AutoRegressive**):

$$X_t = \phi X_{t-1} + W_t, \quad \{W_t\} \sim WN(0, \sigma^2)$$

- The auto-regressive model predicts lapse at each subsequent duration in PLT
 - Lapse rates at N+1, N+2, etc.

Subsequent lapse rates and premium jumps



- For other structures the subsequent premium increases are more important
- For Graded PLT structures, subsequent jumps tested as an explanatory variable
- For a Graded structure the subsequent duration lapses are significant, often the lapse in the first duration in PLT (N+1) can be almost as substantial as the end of term shock lapse
- The significant subsequent premium increase is a factor but also the initial premium increase remains an important aspect.
- Shown is a snapshot of lapses in N+1 duration and how this varies by initial and subsequent jump

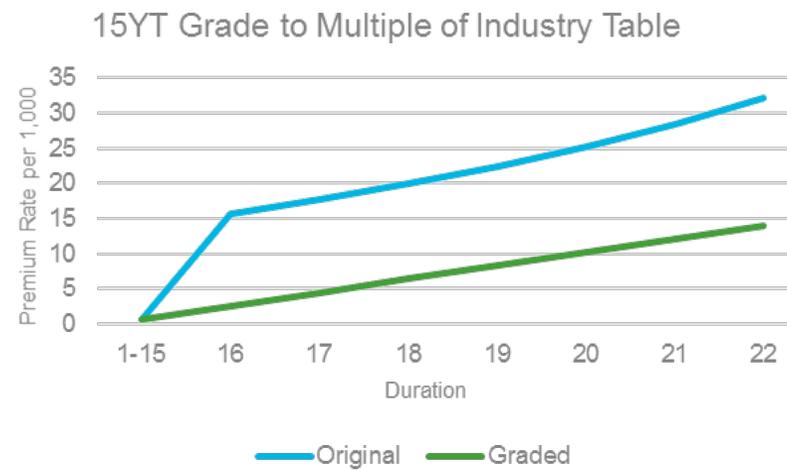
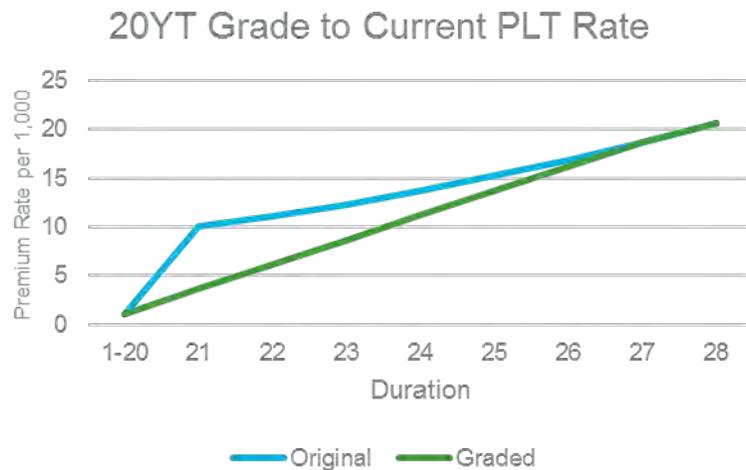
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**Poll: How would you describe your
company's PLT strategy?**

Modelling considerations for PLT Graded Structures

Switching from Jump to ART to Graded PLT



Various approaches

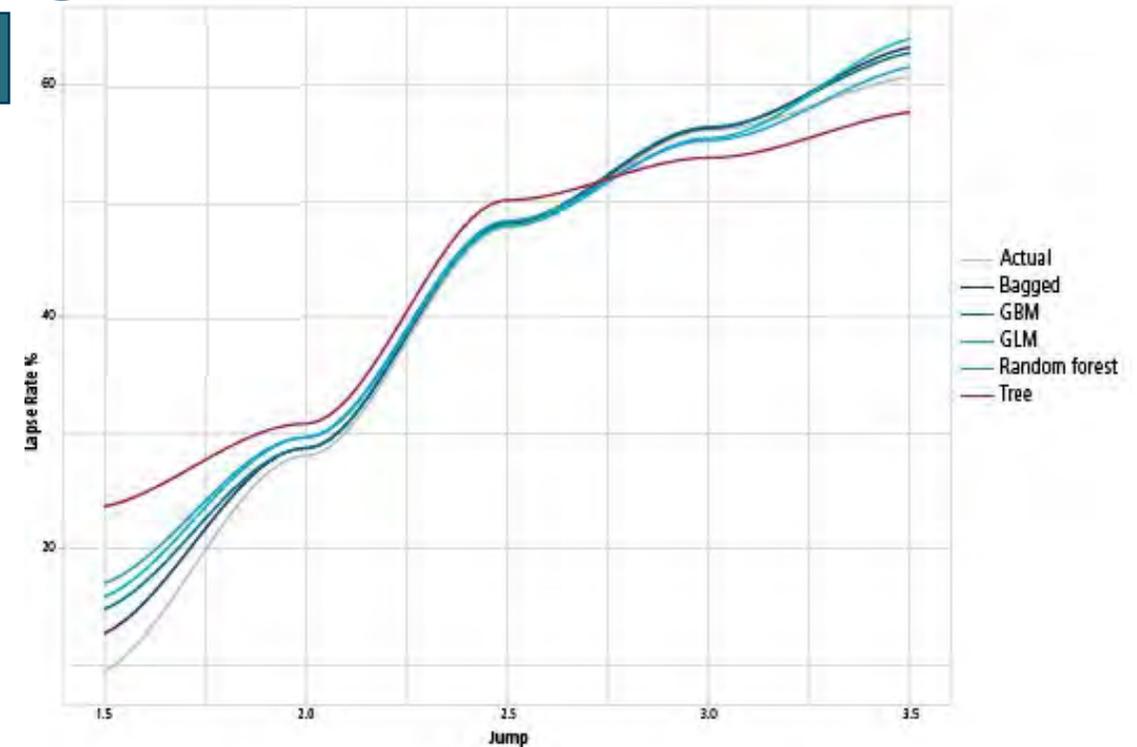
- Grading to original PLT rates
- Grade to multiple of industry table
- Number of years of grading vary 5 to 10 years
- Jump to ART PLT rates were smoker/non-smoker; Graded PLT rates vary by UW class

- All of these factors impact the initial and subsequent premium jumps
- Lapse modelling may require additional variables, e.g., subsequent premium jumps
- Reassess relative importance of other factors

More advanced analytics for Shock Lapse Modelling

Decision tree algorithms

- CART classification and regression trees
- Recursive partitioning
- Main advantage is the flow chart like structure
 - Interpretability
- Risk of overfitting/overlearning
- **Tree-based ensemble** may overcome disadvantage
 - Bagging - Bootstrap AGGREGatING
 - Random forests
 - GBM - Gradient Boosting Machine algorithm
- Interpretability is lost
 - Prediction path on a single tree is no longer possible

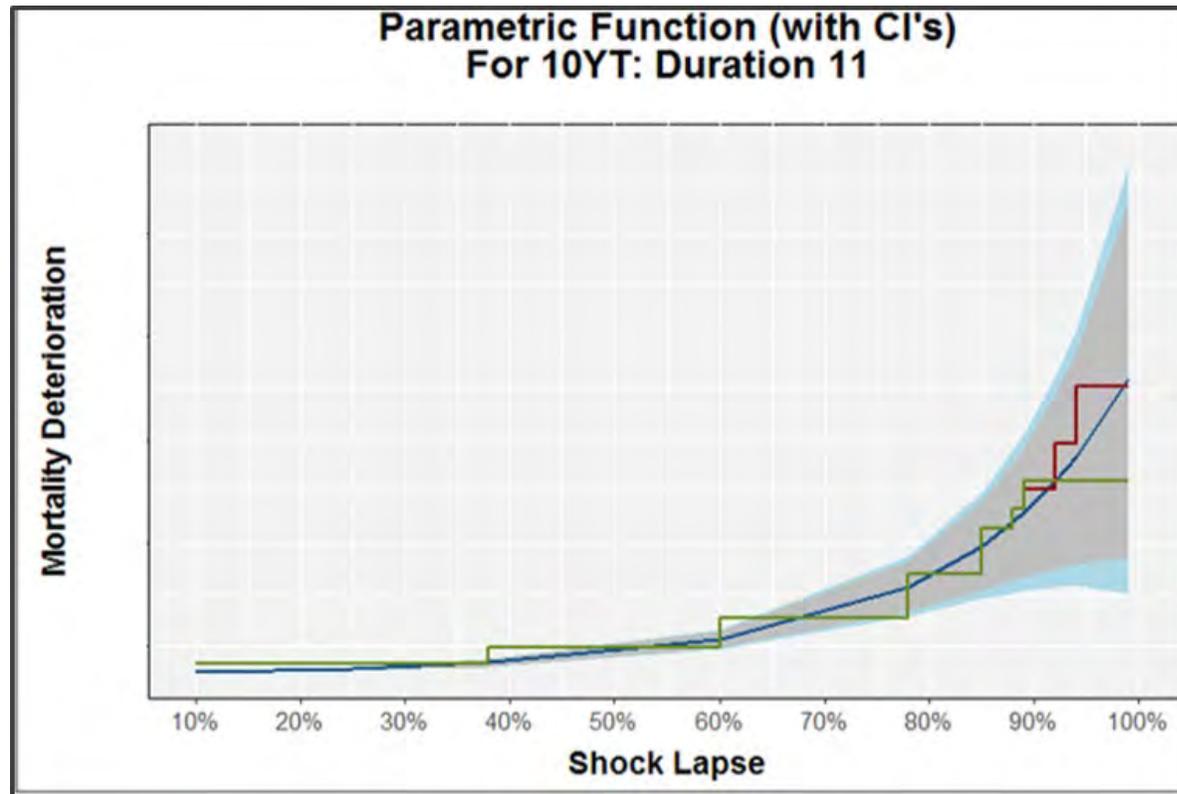


GLM and tree-based models seems to work comparably

Quantitative measures - the predictive performance and the computational time

Qualitative measures - interpretability and implementation

SCOR Mortality PLT Mortality Modelling



Difficulties with PLT mortality

- At highest shock lapses, note a wider confidence interval
 - Less claims, less credibility
- Mortality assumptions by premium jump groupings creates a stepped assumption
- Judgement required in setting the groupings
 - Does deterioration continue to step up after 90% shock lapse?
 - Green Vs Red line

Advantages of parametric function

- A continuous function – blue line example
- Links to shock lapse model

Mortality Deterioration Function Development

PLT mortality modelling & wear-off pattern

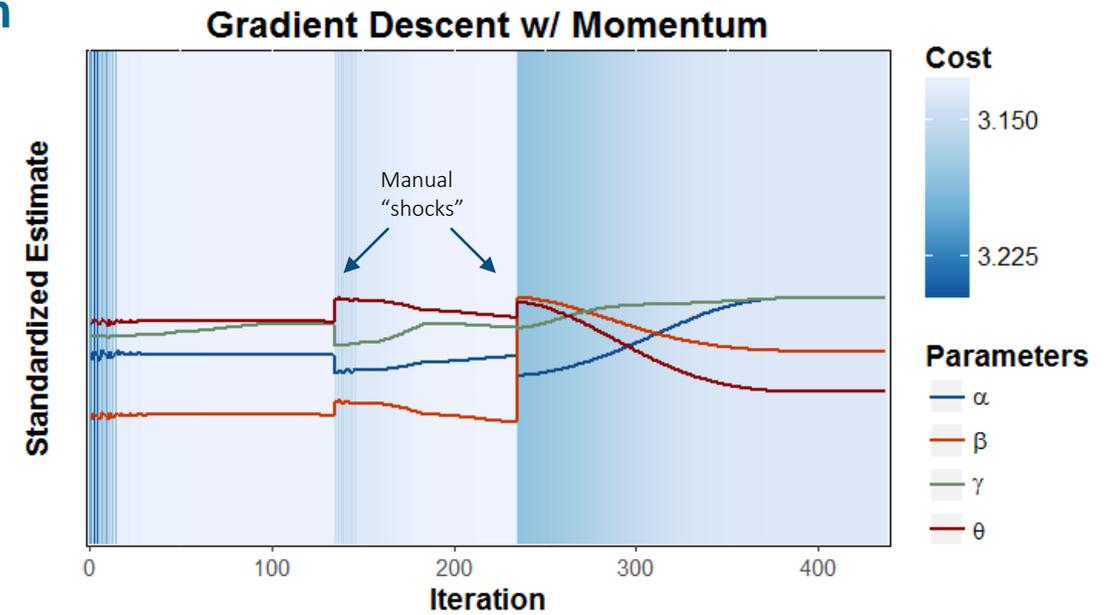
- Investigate PLT mortality by 2 variables: shock lapse rate and post level duration
- A non-linear pattern in the mortality behavior emerges
 - Traditional regression would not work

Parameter Estimation: Gradient Descent with Momentum

- Calibrated a function that fit the data using only the two input variables

Advantages:

- Strength for estimation on noisy parameter space
- Produces a continuous spectrum of outcomes
- Allows to model the fringes more accurately
- Momentum component allows the algorithm to search for multiple local minimums, an optimal parameter vector is more likely to be found



Source: <http://distill.pub/2017/momentum>

Post Level Term assumptions setting with Dukes-MacDonald

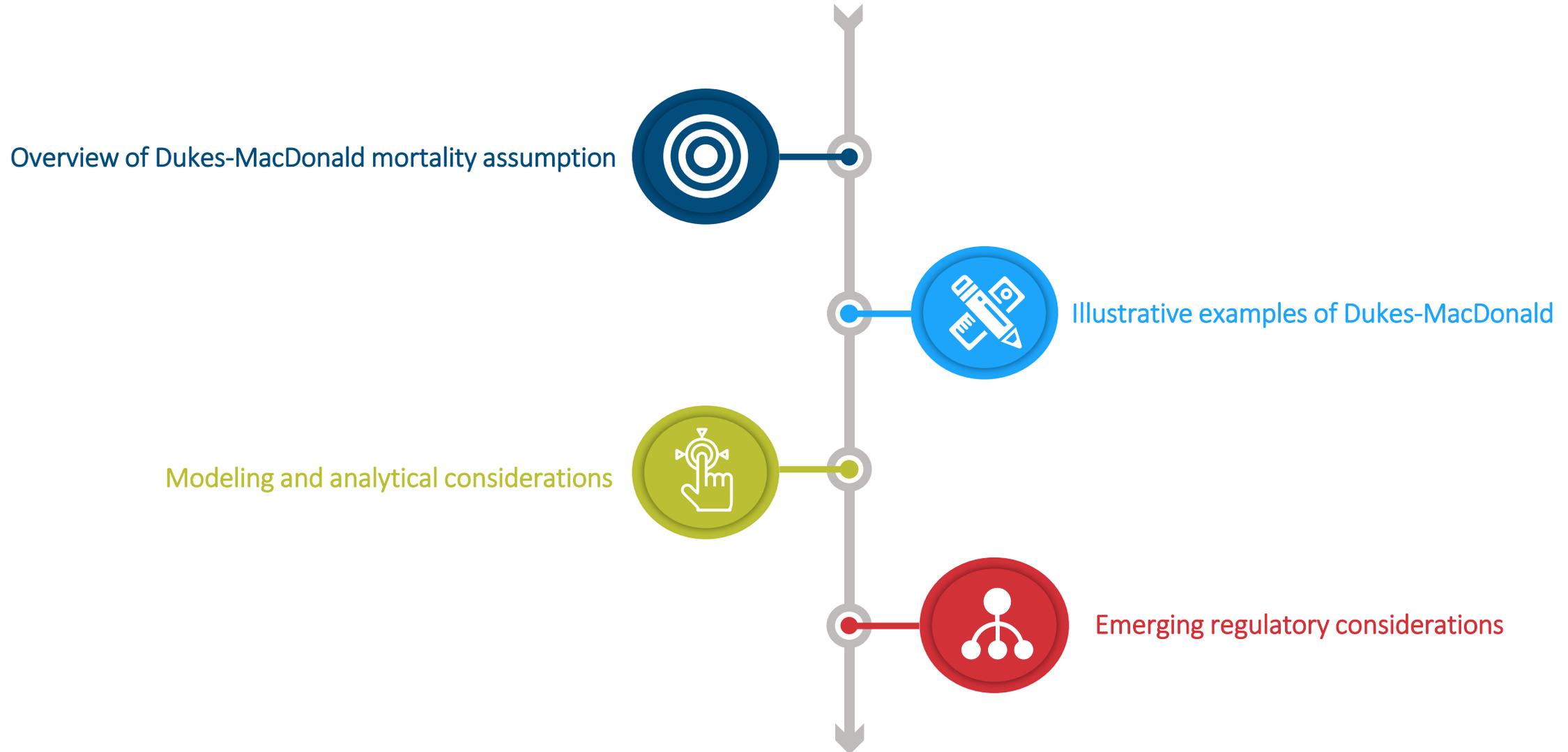
Patrick Davidson, ASA, CERA

Oliver Wyman

October 26, 2019



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Poll: Which PLT mortality deterioration methodology is used at your company?

Overview of Dukes-MacDonald mortality assumption



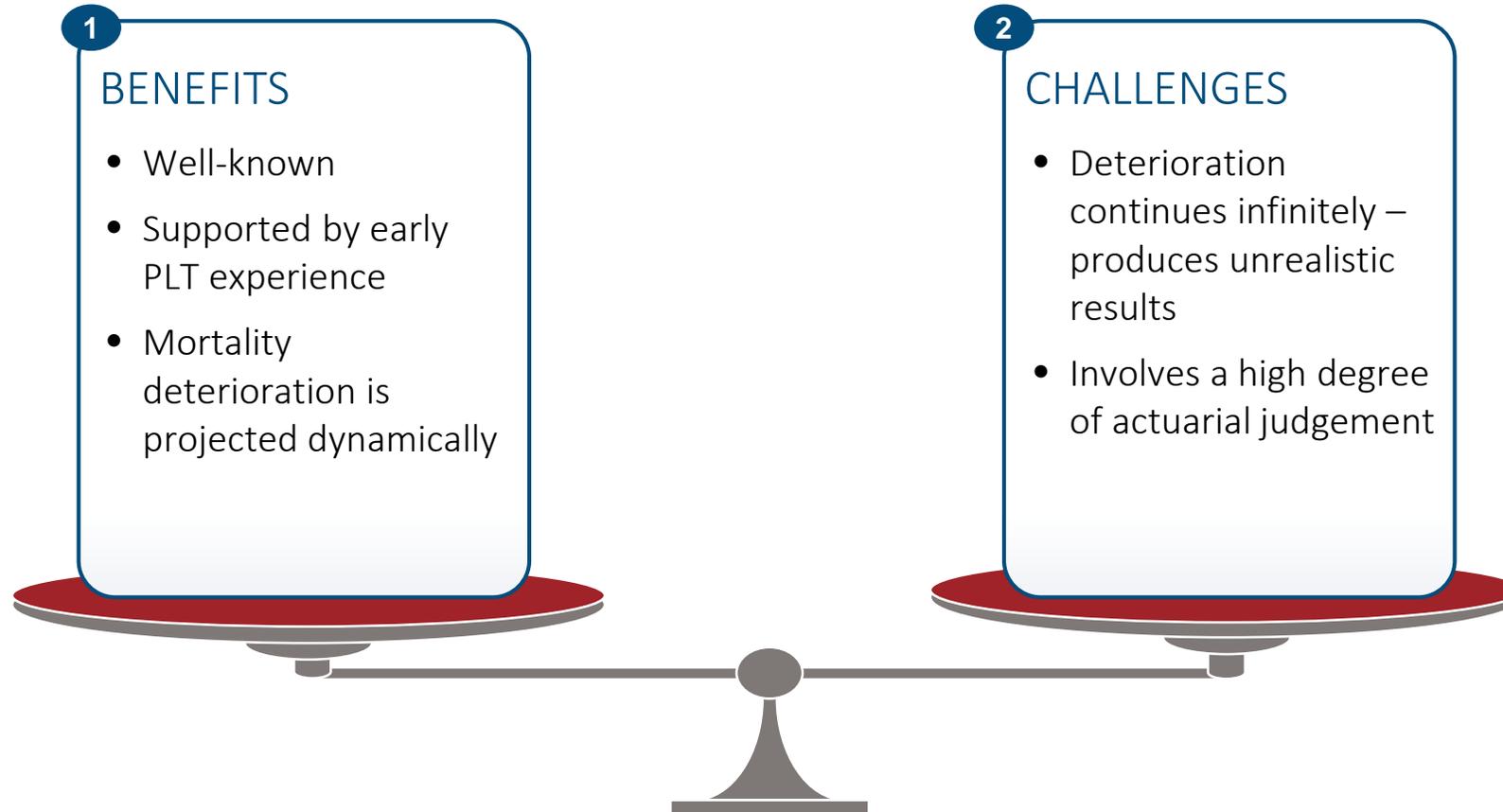
Dukes-MacDonald (D-M) mortality assumption

- Developed in 1980 by Jeffrey Dukes and Andrew M. MacDonald
- Mortality is deteriorated according to the principle of **conservation of deaths**
- Original methodology assumed that **100% of lapses** other than underlying are selective (D-M Type 1)
- Newer variations use the concept of **effectiveness**, i.e. some additional lapses are not selective (D-M Type 2)

Dukes-MacDonald framework

- Four groups of remaining lives in the PLT period:
 - Those who lapse with underlying mortality (“reverters”)
 - Those who lapse with newly select mortality (“effective lapsers”)
 - Those who lapse with average mortality (“non-effective lapsers”)
 - Ignored under Type 1 D-M
 - Those who don’t lapse (“persisters”)
- Solve for the mortality of the persisters using **conservation of deaths**
 - Affected by:
 - Size of initial shock lapse
 - Effectiveness factor
 - D-M Type 1 versus D-M Type 2

Benefits and challenges



Illustrative examples of Dukes- MacDonald mortality deterioration

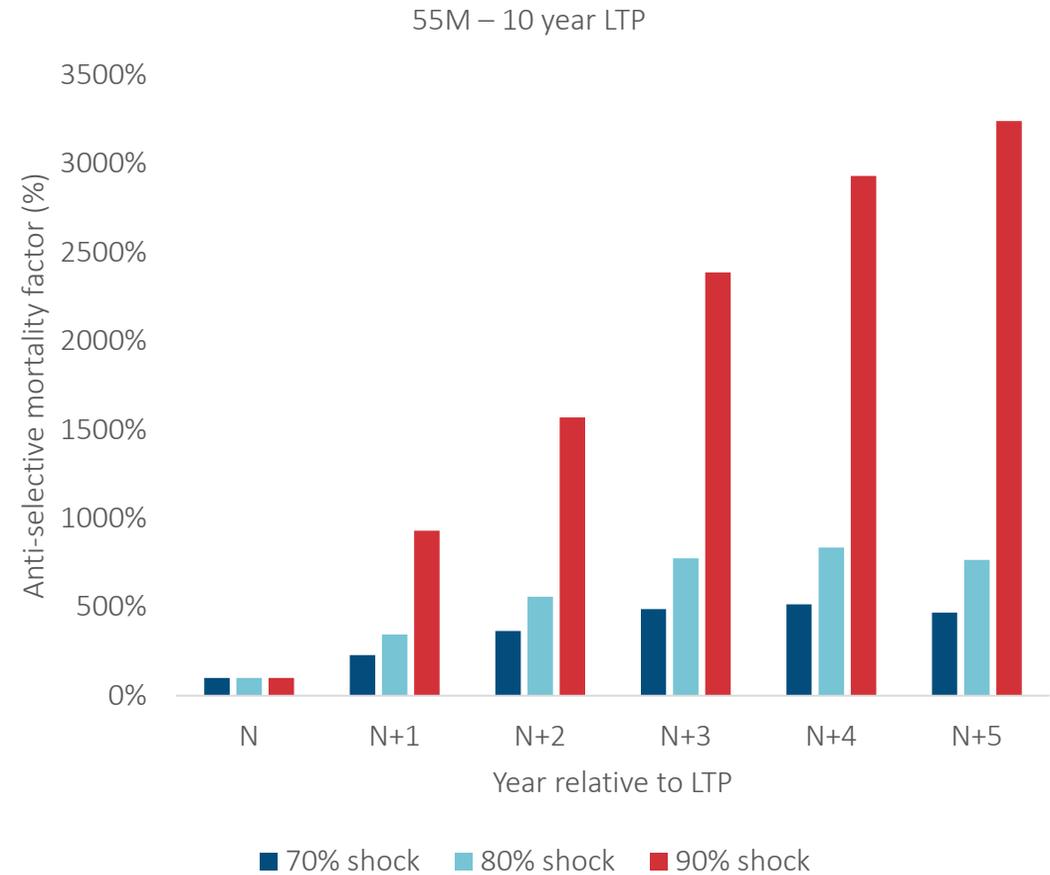


Assumptions

- 55 year old male
- 10 year LTP
- Base mortality is 100% of 2015 VBT
- Base lapse rate of 5%
- 4-year excess shock lapse pattern of 70%/50%/30%/10%
- D-M Type 1
- 70% effectiveness factor

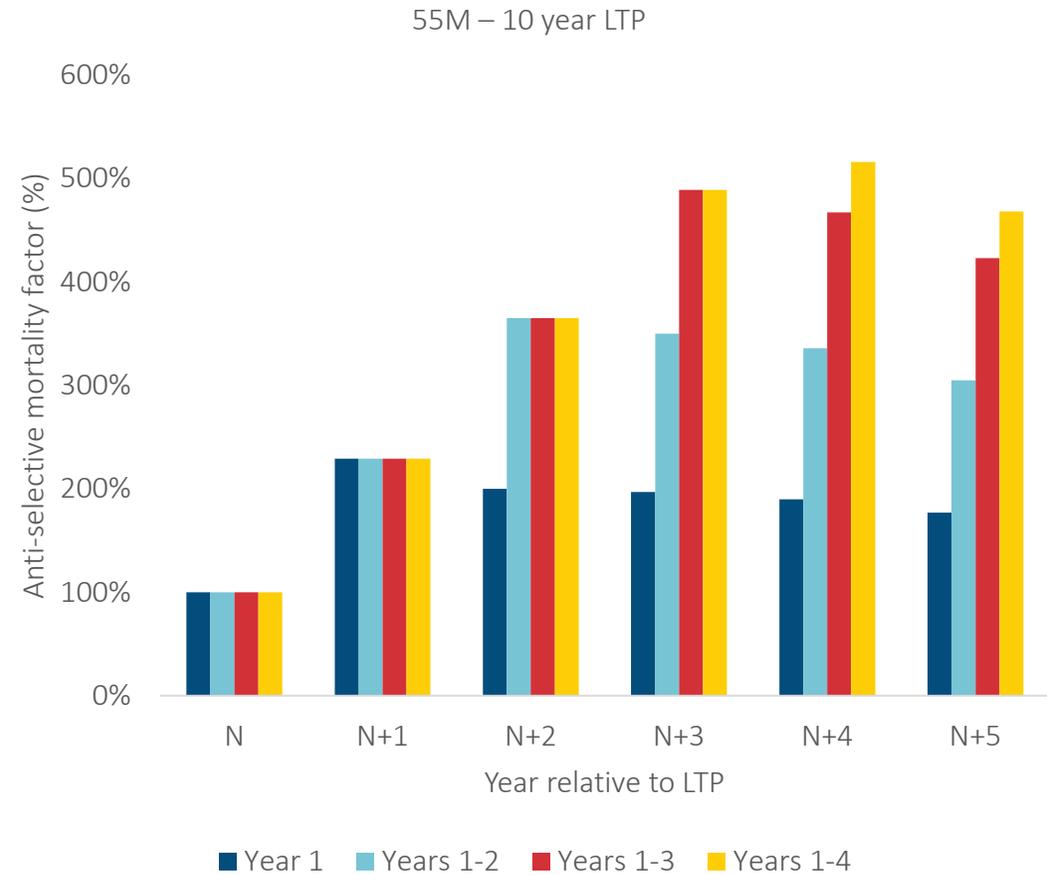
Size of shock lapse

- Mortality deterioration highly correlated with size of initial shock lapse
 - Secondary and tertiary shocks have smaller impacts
- Assumption should be set **holistically** in conjunction with size of premium jump and length of level term period



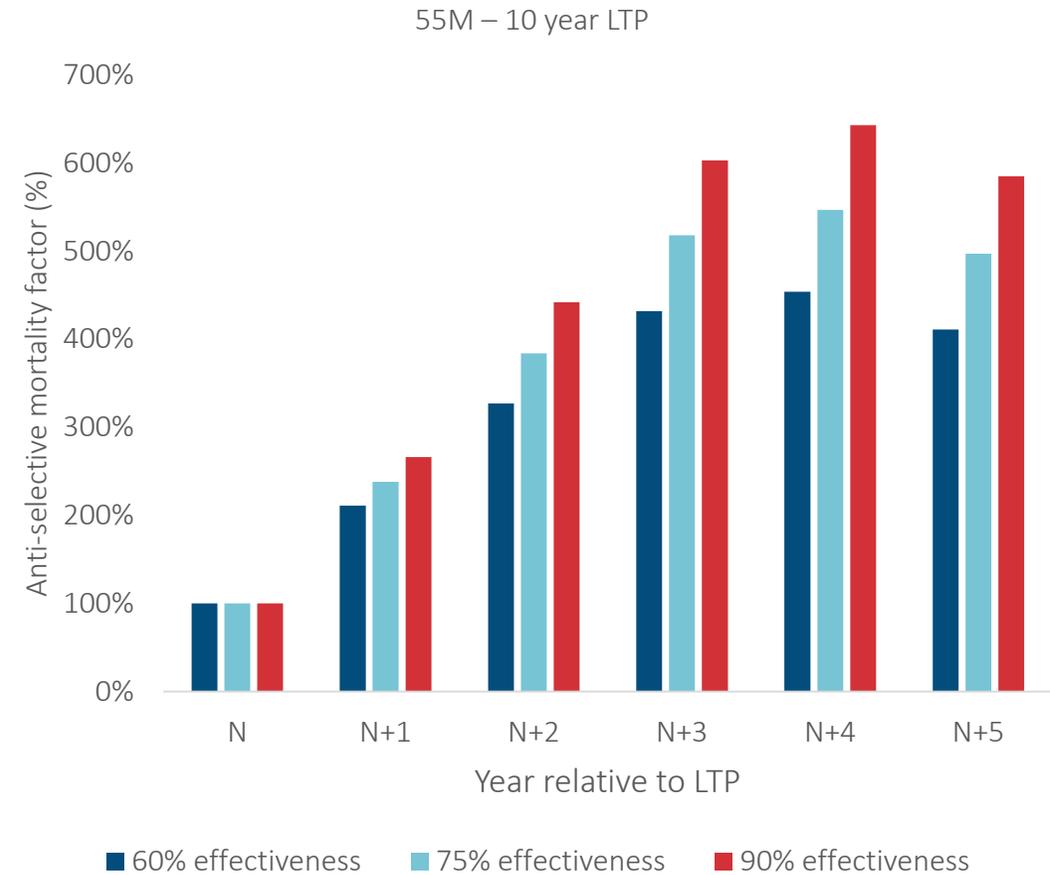
Infinite deterioration

- Caused by cumulative impact of shock lapses in PLT period
- Expected pattern is exhibited by initial shock lapse
 - Highest % difference in year $n + 1$
 - Grades down in later years
- Each future shock lapse in excess of the underlying lapse increases the amount of deterioration

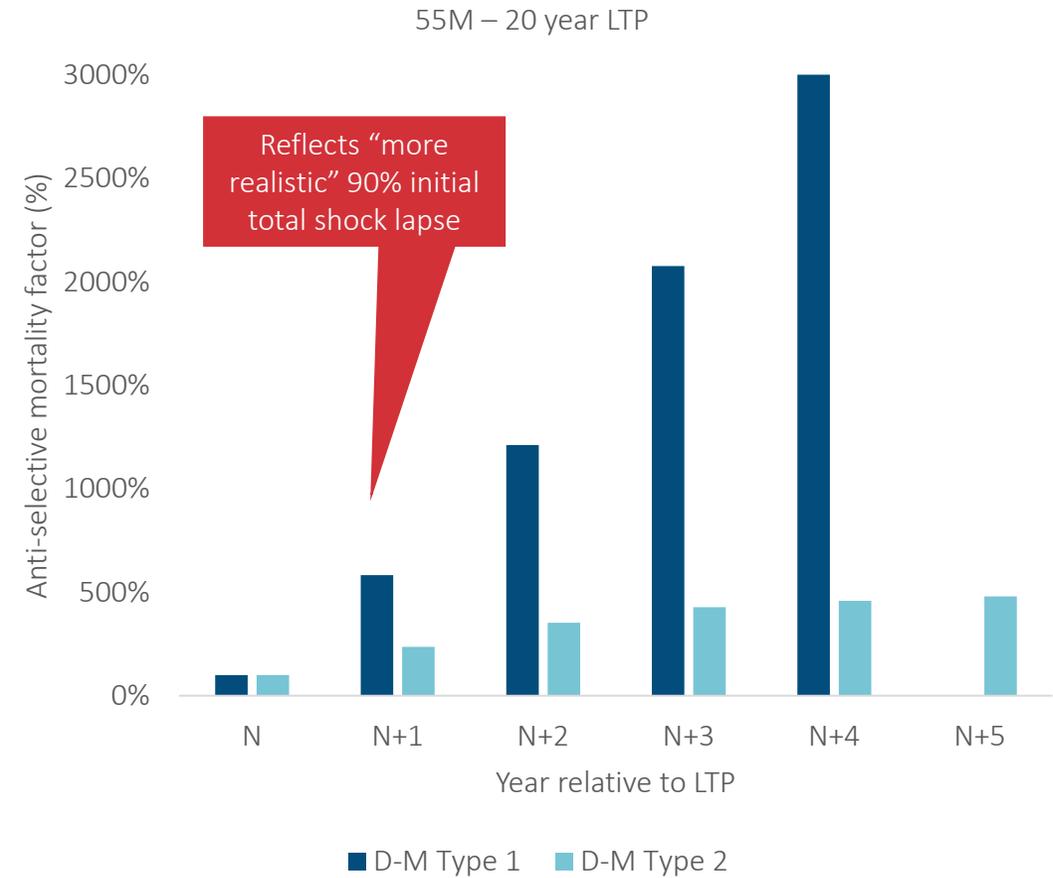
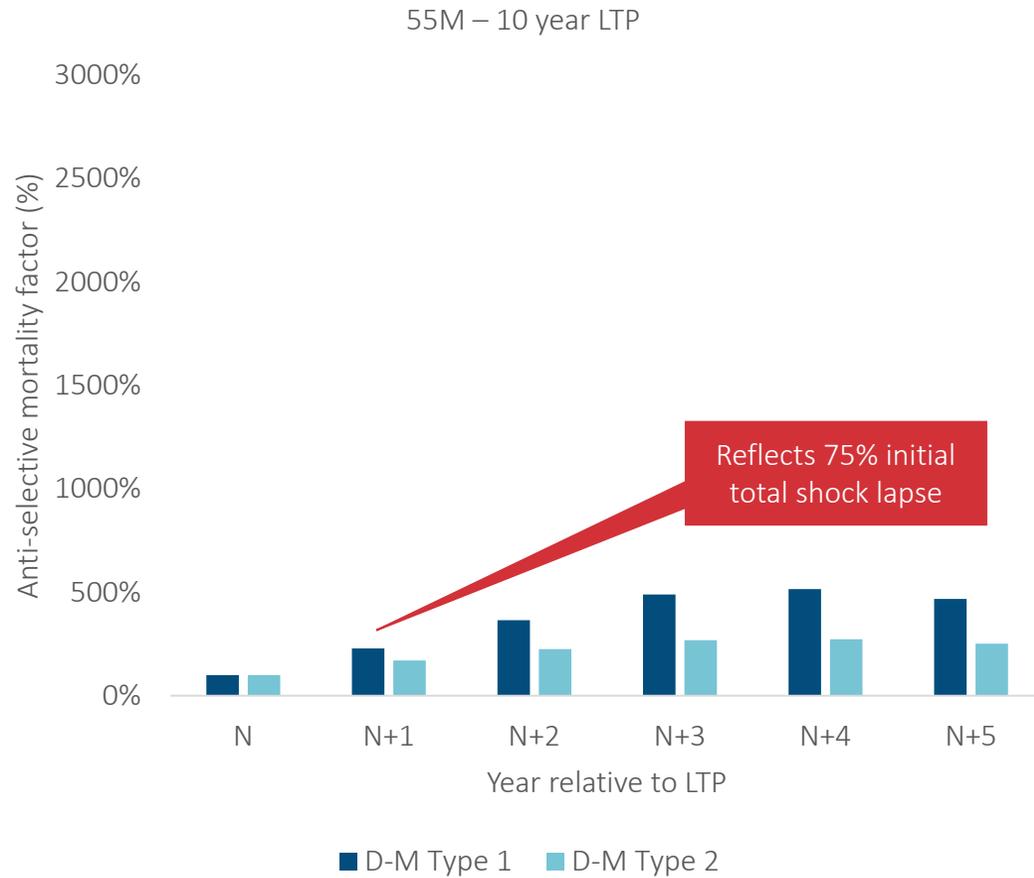


Effectiveness factor

- Factor provides implicit view on policyholder behavior
 - 100% effectiveness = all remaining policyholders are unhealthy
 - In reality, other factors contribute to policyholder persistency
 - Automatic premiums
 - Size of premium jump
 - Availability of similar products
 - Imperfect information
 - Irrational behavior



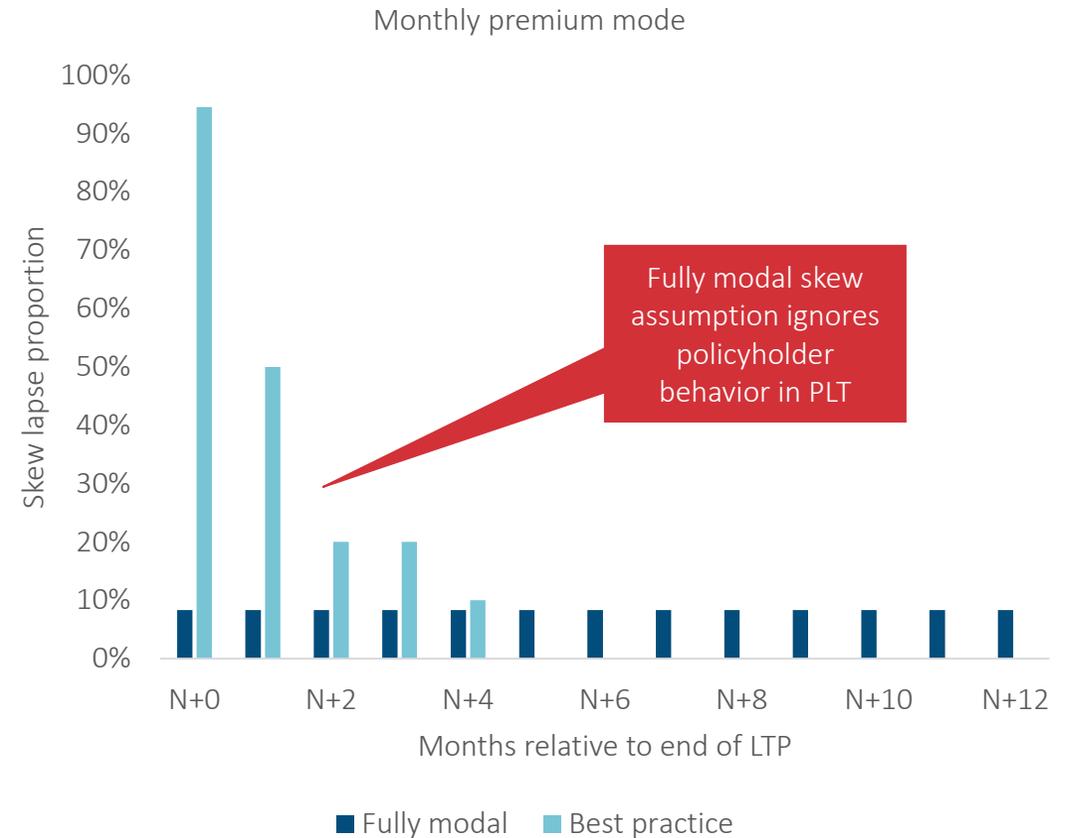
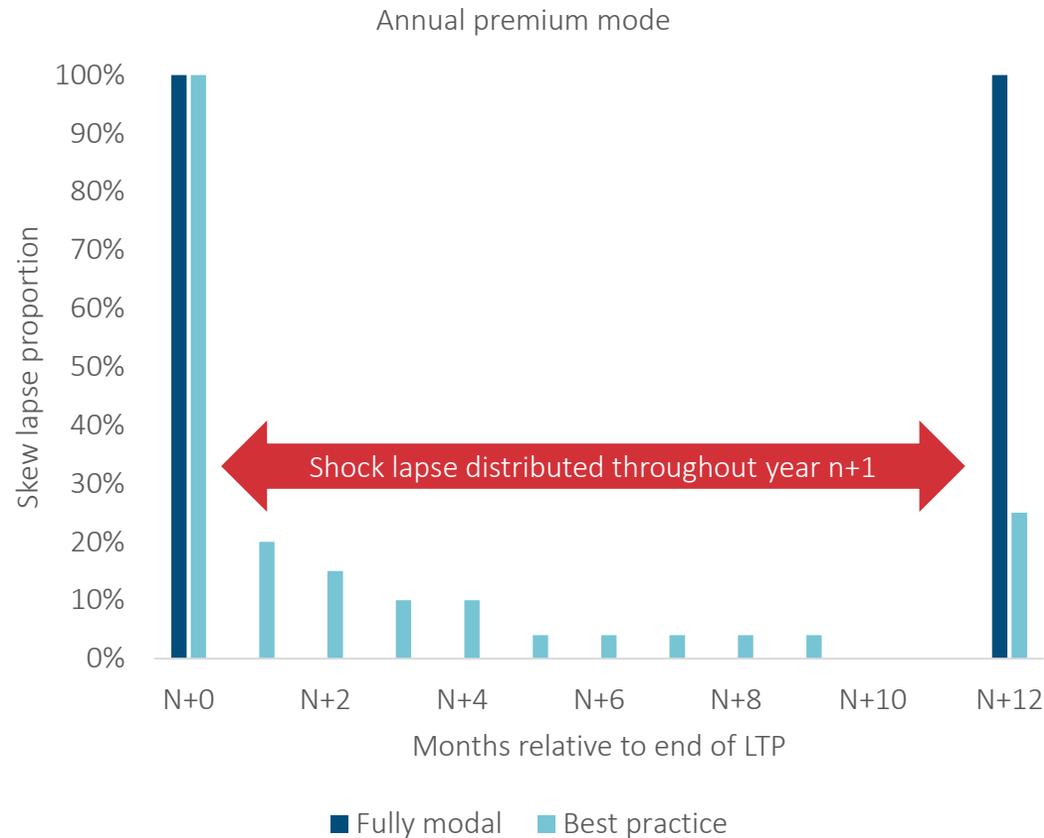
Type 1 versus Type 2 assumption



Modeling and analytical considerations



Skew lapse pattern in years 'N' and 'N+1'



Mortality deterioration in the grace period



- PLT modeling methods **were not** created with a grace period in mind
- In periods of high lapses, excess mortality during the grace period can be understated by 6-12%
 - Important for A/E analysis

$$\frac{\left[S * q_{[x+t]} + (A + U) * q'_{[x]+t} \right] * [Grace\ Period]}{365}$$

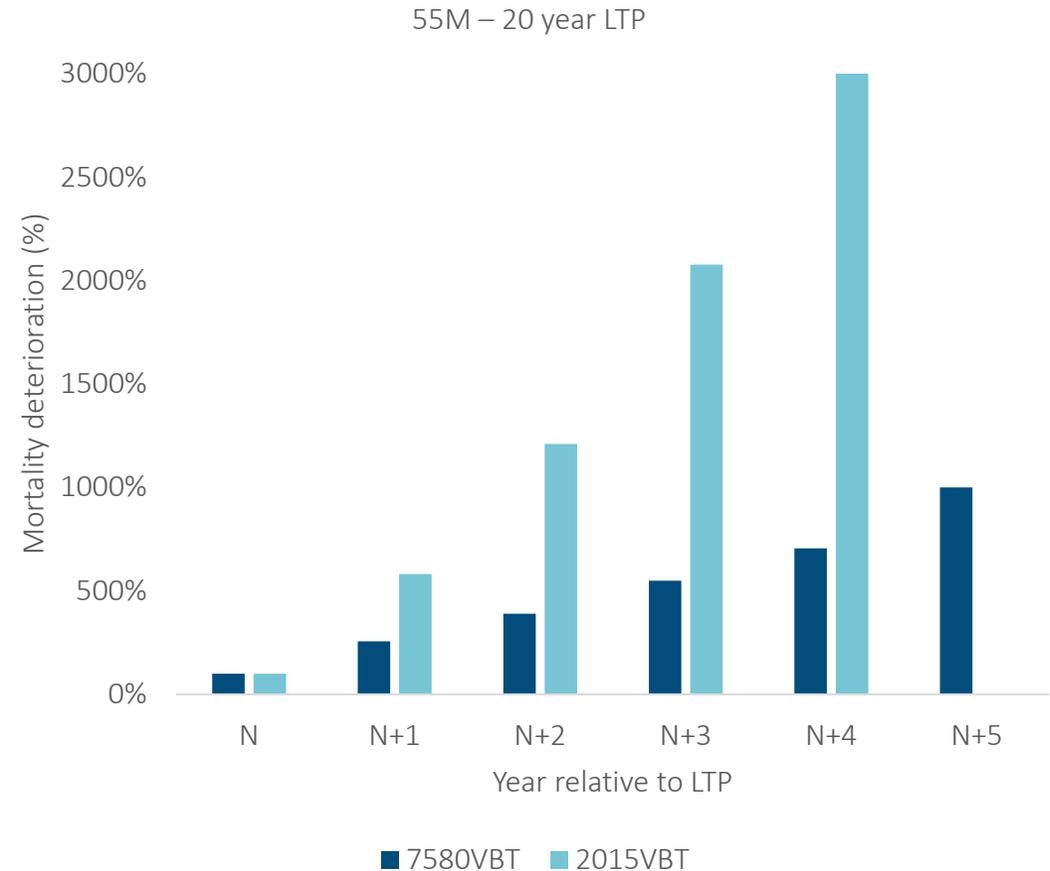
$$[1 - T]$$

Newly select lives – pricing or best estimate?

- Important to understand treatment of “compound” mortality tables within actuarial software
- Depends on view of mortality
 - Pricing – retain original underwriting multiples
 - Valuation – reflect best estimate assumptions
- Consider timing of future mortality improvement and applicability

Shape of underlying mortality table

- Level and run-off pattern of excess mortality is **highly** dependent on the shape of the underlying mortality table
 - Different select periods
 - Underlying preferred wear off
 - Old age grading



Emerging regulatory considerations



PLT assumption treatment 2020 & beyond



Principles-Based Reserving and ASU 2018-12 (LDTI) have the potential to reshape the way companies handle statutory and US GAAP reserving for Term blocks



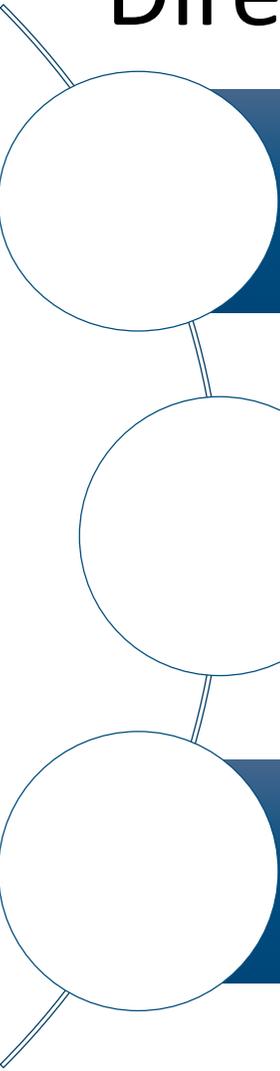
Post Level Term: Lapse and Mortality Risk Considerations

Laura Muse

October 28, 2019



Post Level Term (PLT) Direct Company Considerations - Agenda



Overview of In-force Actions

Considerations other than lapse and mortality assumptions

Currently priced products and alternative designs

Overview of Term Design & Company Action

Common design

- Level premium paid for term period (10, 15, 20 years)
- Premiums change to a Yearly Renewal Term (YRT) scale that increases annually in PLT period

10-20+ years ago

- PLT premiums were set to/close to maximum allowed
- Resulted in premium jump after level period of 20-30 x level premium
- Lower premium jump results in lower shock lapse and more value to company

Company action

- Change scales of products reaching the end of level period to more favorable premium design

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Poll: Has your company implemented a change to PLT premiums?

Identify Term Blocks for Action

Identify blocks approaching first cross-over date

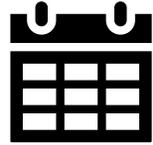
Evaluate premium jump at end of level period

Review shock lapse and resulting mortality assumptions

Model a revised scale

- Perform sensitivity tests, Evaluate several discount rates

In-Force PLT Rate Change Considerations



Timeline



Reinsurance Considerations



Administrative Systems



Communications

Reinsurance Considerations

Navigating a pool of reinsurers

Recapture and retain or Recapture and recede options

Is the change favorable to reinsurers? Invoke their support for modeling

Coinsurance vs. YRT

Financial Reinsurance/Capital solutions: are changes allowed?

Administrative Considerations

Does the cost to change administrative systems outweigh premium/mortality benefit?

- Policy administrative systems
- Reinsurance systems and treaty amendments
- Illustration systems, if illustrated

Quantify the cost into dollars and include in analysis

Communication Considerations

Messaging to Policyholders

- Do you normally notify policies at end of level period?
- Is this an illustrated policy form? If not, how do you show new scale?

Messaging to Agent

- Provide general update regarding a particular product
- Ability to provide list of impacted policies
- Orphan policies and upstream agencies

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Poll: Has your company received much feedback after implementing a change to PLT premiums?

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**Poll: Have your revised lapse assumptions
been accurate after changing the PLT
premiums?**

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Poll: Have your revised mortality assumptions been accurate after changing the PLT premiums?

New Product Pricing Considerations

Set current PLT premiums at currently assumed optimal levels

File as indeterminant premium product – can't assume policyholder behavior won't change in future

Alternative designs

- Decreasing face amount, level premiums
- Start new level premium period
- No PLT period

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Poll: How do your currently sold products compare to the design of years ago?

Conclusion

To Change or Not to Change?

- Impact of more favorable premium persistency and mortality
- IT/Implementation costs
- Communication materials or customer service support
- Impacts from unadjusted reinsurance treaties

Today's Product Development

- Improvements in modeling techniques and credible assumptions give a good starting point for future product development.
- Eliminate the need for in-force actions in the future

Questions?

