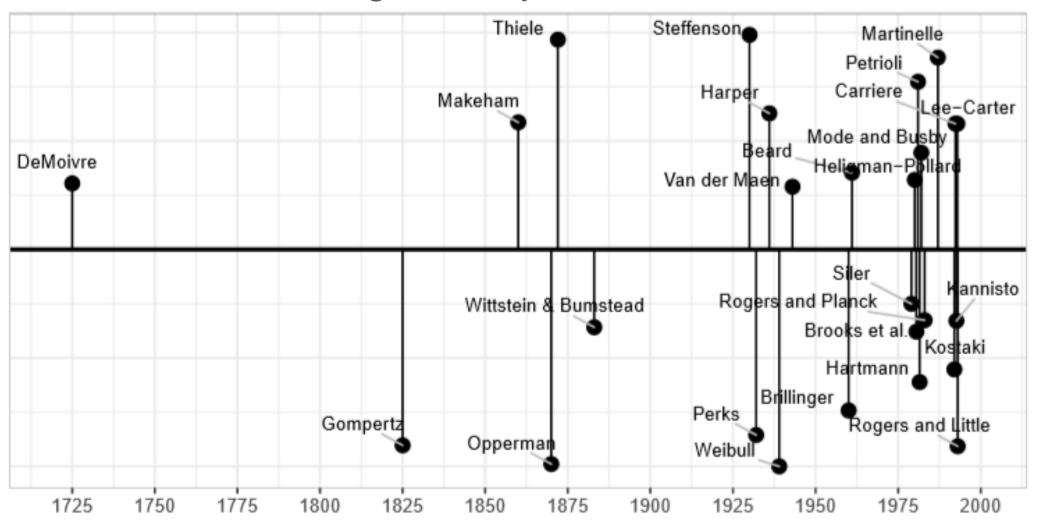
# Quantifying the Risk Corwin (Cory) Zass Founder, Principal & Consulting Actuary Actuarial Risk Management, Ltd.

- Agenda
- Short History of Modelling Mortality
- Understanding the Basics
- Transitioning, the "life table" to a "personalized" survival curve
- Life Settlement Mortality Risk Conversation



Timeline of Modeling Mortality





Author	Publication	Model
De Moivre	1725	$\mu(x) = 1/(\omega - x)$
Gompertz	1825	$\mu(x) = Ae^{Bx}$
Gompertz	_	$\mu(x) = \frac{1}{\sigma} exp\left\{\frac{x-M}{\sigma}\right\}$
Inverse-Gompertz	_	$\mu(x) = \frac{1}{\sigma} exp\left\{\frac{x-M}{\sigma}\right\} / \left(exp\left\{e^{\frac{-(x-M)}{\sigma}}\right\} - 1\right)$
Makeham	1867	$\mu(x) = Ae^{Bx} + C$
Martinelle	1987	$\mu(x) = (Ae^{Bx} + C)/(1 + De^{Bx}) + Ke^{Bx}$
Carriere	1992	$S(x) = \psi_1 S_1(x) + \psi_2 S_2(x) + \psi_3 S_3(x)$
Carriere	1992	$S(x) = \psi_1 S_1(x) + \psi_4 S_4(x) + \psi_3 S_3(x)$
Kostaki	1992	$q(x)/p(x) = A^{(x+B)^C} + De^{-E_i(\ln x - \ln F)^2} + GH^x$
Kannisto	1998	$\mu(x) = Ae^{Bx}/(1 + Ae^{Bx})$
Kannisto-Makeham	_	$\mu(x) = Ae^{Bx}/(1 + Ae^{Bx}) + C$



- Mortality Forecasting (Mathematical) Models
- Until the 1980s, relatively simple and included a fair amount of subjective judgement used to forecast qx or LE
- Last 30 years shifted to stochastic models:
  - Lee—Carter model (c1992) first extrapolative model used to predict the central mortality rates for all ages.
  - Cairns—Blake—Dowd (c2006) designed for modelling mortality at higher ages and builds on the observation that log death rates are approximately linear at ages above 40.



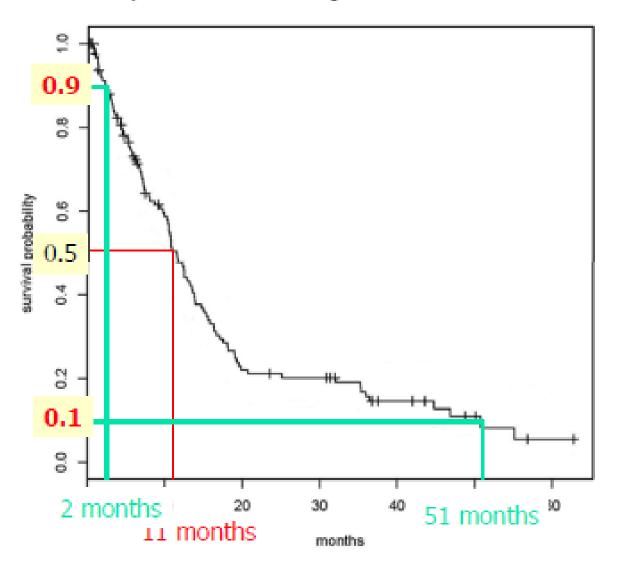
- Basics of Survival Models
- Defining the population and the "event" exposure
- Linking the results to mathematical distribution
- Survival analysis isn't just a single model.
- Many sets of tests, graphs, and models used with different data and study design situations.
- The challenge, choosing the most appropriate model after testing multiple models
- Regardless, they share a basic concept, "test how risk factors can predict the transition in morbidity severity to ultimate death"



- Evolution of Methods
- Standard models
  - Kaplan-Meier, Cox proportional hazards, Parametric, Frailty, etc.
- Artificial Intelligence (AI) based algorithms
  - Random Forest
  - Logistic Regression
  - Gradient Boosting
  - Neural
  - Others

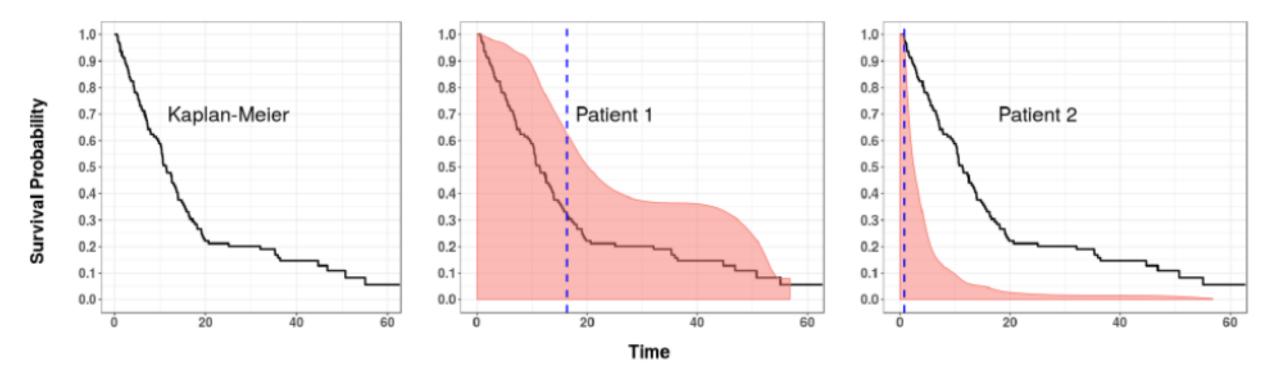


Kaplan-Meier curve for Stage 4 Stomach Cancer Patients

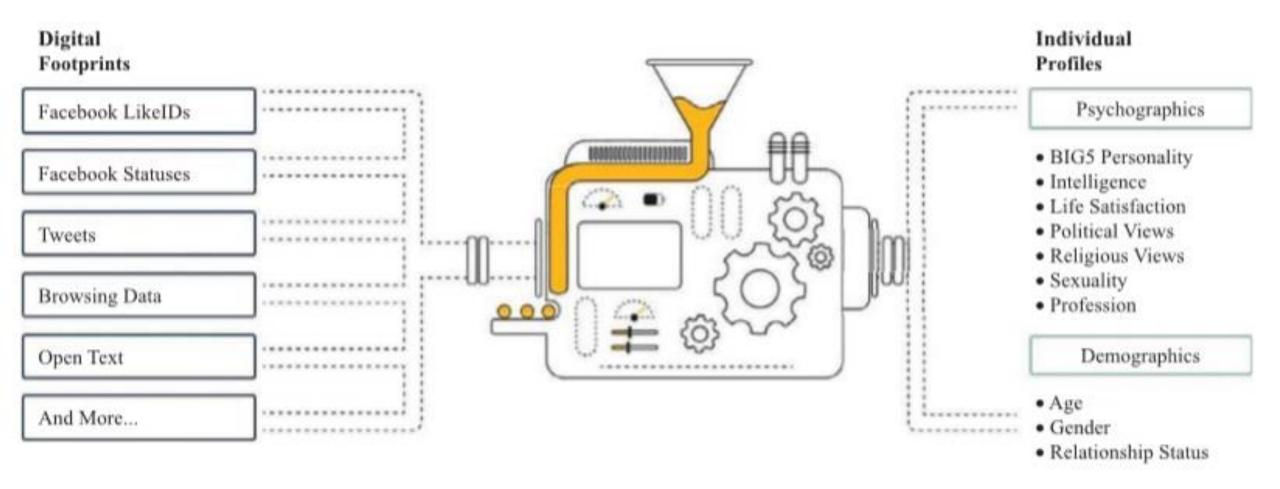


- Over 128 patients
- Median survival time:
  - 11 months
- 80% confidence interval
  - 10% to 90%
  - 2 51 months











- Basic Steps in Measuring Mortality Risk
- Data source of population/sub-population
- Common risk factor characteristics (this is what is expanding)
- Evaluate stratifications
- Count deaths & exposures
- Smooth crude results
- Evaluate "rate" metrics or use as baseline (life table)
- Result: benchmark to larger population of similar make-up



- Types of Risk
  - Pandemic risk (i.e. Spanish influenza in 1918-19)
  - Mis-estimation risk (i.e. wrong initial base (reference) table, poor model build, erroneous distribution function, etc.)
  - Trend risk (i.e. past not a predictor of the future)
  - Systematic risk (i.e. ignoring mortality improvement or 'dis'improvement)
  - Idiosyncratic risk (i.e. random fluctuation risk)
  - Others?



- Practical Concerns in Underwriting Life Settlements
  - Greater variability of actual deaths if small # of policies (LLN)
  - Dealing w/ judgement or empirical evidence of predictors
  - Sub-population not the same
  - Only use one LE u/wer's view
  - Sole reliance on the LE metric (it is the "slope"!)
  - Ignoring impact of morbidity risks increase as seniors ages
  - Early deaths implies more later deaths too ("false positives)
  - No granular A/E% regardless of 'E'



- Life Insured Survival Predictions
  - Future will leverage predictive analytics & computing power
  - Are individualized survival probabilities possible? (still can't predict "hit by the bus")
  - What to do? (i) current LE u/wers use of medical record data,
    (ii) SOA VBT (adjusted or not), (iii) deeper dive to account for individual risk factors to create adjustments, (iv) other??
  - Demand LE u/wers to do more than medical u/wing
  - Opportunity for underwriters linked to Al



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  - strategic relationships with many non-"Big 4" accounting firms
  - 75+ actuaries globally working under a subcontracting business model
  - life, annuity, health, P&C (general), retirement, pension
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