

Book Review:
“Survival Analysis Using SAS”, 2nd
Edition, by Paul D. Allison

Reviewed by
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Highly Regarded Reference

- "Allison gives, in my opinion, the best discussion I have seen of the tests done by the STRATA and TEST statements in PROC LIFETEST."
Paul T. Savarese, Sr. Technical Support Statistician, SAS Institute
- Many references to the Allison book in the University of Michigan CSCAR course, "Applied Survival Analysis and Reliability Analysis" by Brenda Gillespie and Ananda Sen.
- Supplementary text book for BioStat 675 (Survival Analysis) at the UM School of Public Health.

Syllabus for BioStat 675

- Introduction to survival data; Censoring and Truncation (Ch 1, 2)
- Distributional characteristics of survival times (Ch 2)
- **Cure models, residual survival function (not in Allison book)**
- Life table, the Kaplan Meier, and Nelson-Aalen estimates (Ch 3)
- Two- and k-sample hypothesis tests (Ch 3)
- Parametric survival models (Ch 4)
- Cox regression model, partial likelihood (Ch 5)
- Time-dependent covariates, model diagnostics (Ch 5)
- **Counting processes (some discussion in Allison, but not at theoretical level of BioStat 675)**
- Competing risks (Ch 6)
- Additional topic in Allison (Ch 8: Heterogeneity of Variance, Repeated Events). This was on the advanced topics (if time available) for my course.



Ch 2: Basic Concepts of Survival Analysis

- **Good examples of censoring.**
- Right censoring: $T > c$.
- Example: Age of death ≥ 50 ; $c = 50$.

- Left censoring: $T < c$.
- Example: Age of onset of disease. If exact age of onset is unknown, set $c =$ age of entry into study and consider the observation to be left censored.

- Interval censoring is another type of censoring, $a < T < b$.

- Procs LifeTest and LifeReg can handle right, left, or interval censoring.
- However, Proc PHReg can only handle right censoring.
- Right censoring is most common in survival analysis.



Ch 2: Fundamental Formulas

- $F(t) = \text{CDF (Cumulative Distribution Function)} = \text{Pr}(T \leq t)$
- $S(t) = \text{Survival Function} = 1 - F(t) = \text{Pr}(T > t)$.
- $f(t) = \text{pdf (probability density function)} = -dS(t)/dt$.
- $h(t) - \text{Hazard Function} = f(t)/S(t) = -d(\ln(S(t)))/dt$.
- $\Lambda(t) = \text{Cumulative Hazard Function}$

$$\Lambda(t) = \int_0^t \lambda(u) du = -\ln(S(t))$$

$$S(t) = \exp(-\Lambda(t))$$



Ch 3: Proc LifeTest

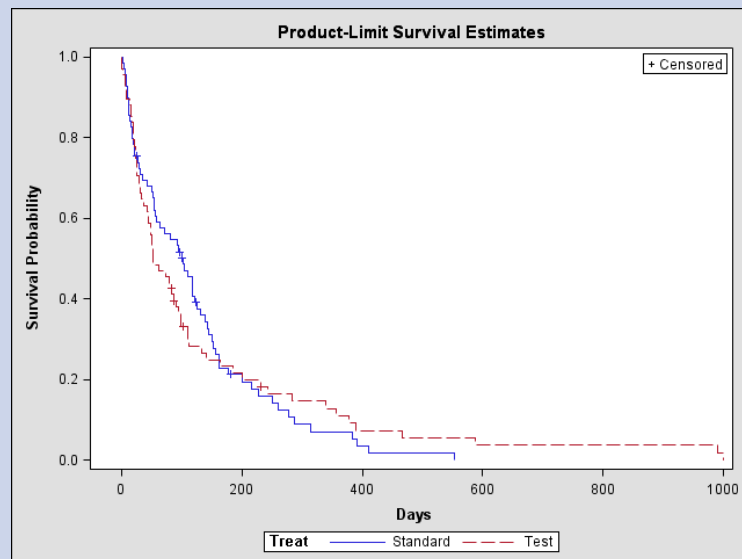
- Estimating and comparing survival curves
- Clear Presentation of formulas for survival functions.

Kaplan – Meier Method	Life Table/ Actuarial Method
$\hat{S}(t) = \prod_{j:t_j \leq t} \left[1 - \frac{d_j}{n_j} \right]$	$\hat{S}(t) = \prod_{j:t_j \leq t} \left[1 - \frac{d_j}{\left(n_j - \frac{c_j}{2} \right)} \right]$

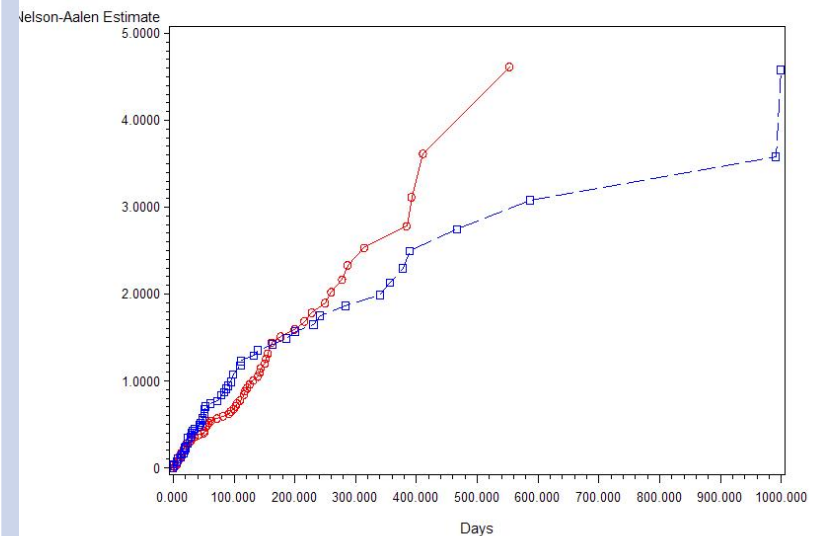
- Wilcoxon and Log Rank tests for equality of survival curves.
- Graphics options in Proc LifeTest.

Ch 3: Proc LifeTest Survival and Cumulative Hazard Plots

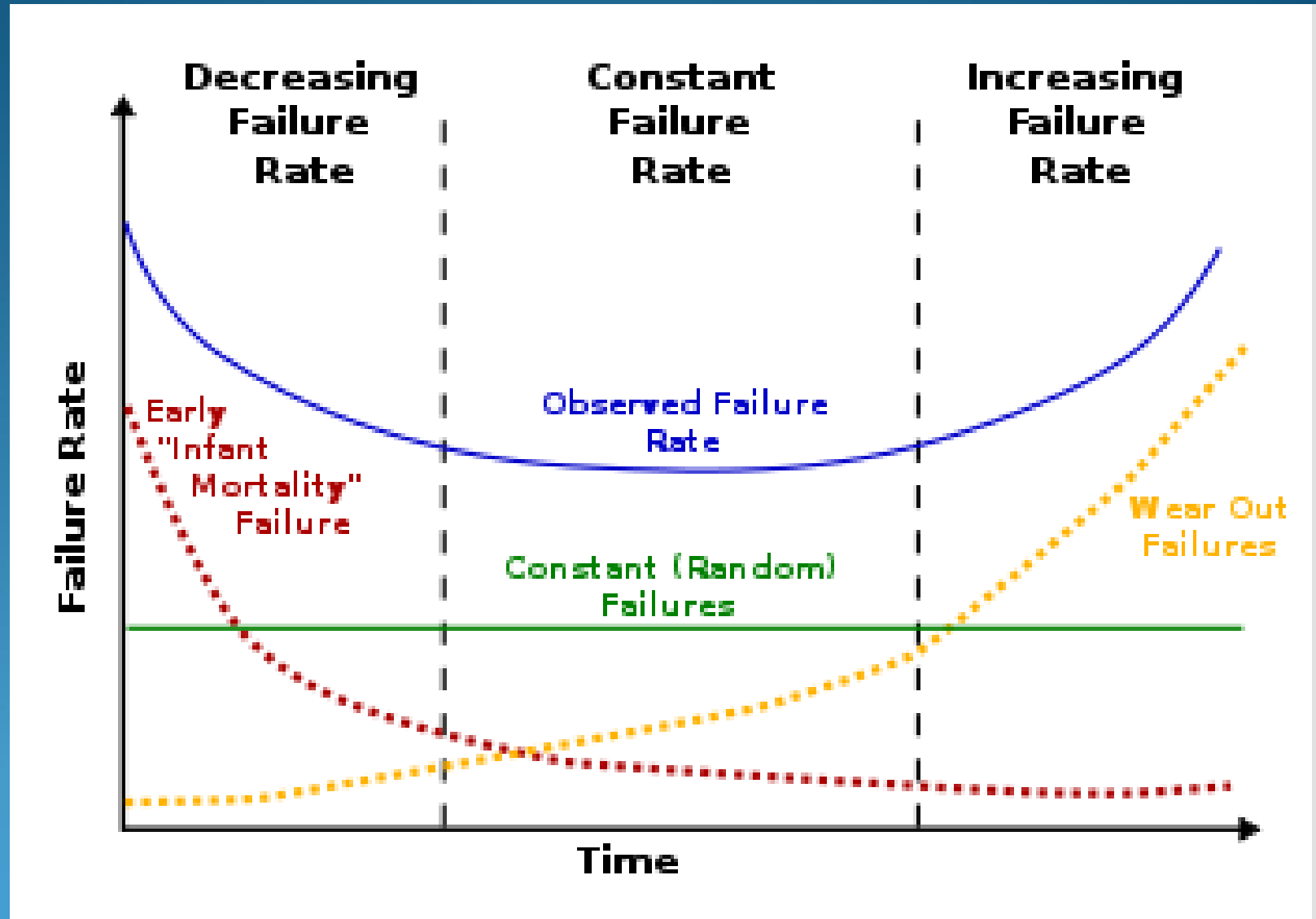
Kaplan-Meier Survival Plot

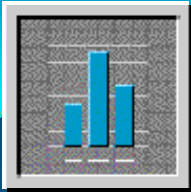


Cumulative Hazard Plot



Weibull Regression – Bathtub Curve



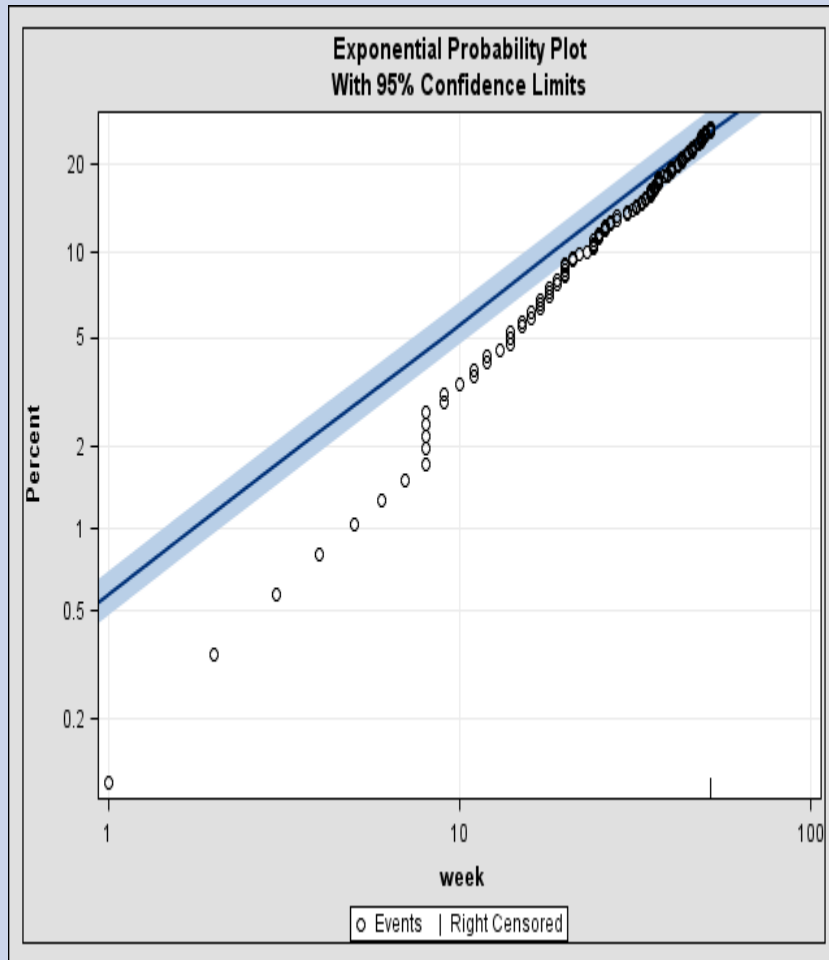


Ch 4: Parametric Regression (Proc LifeReg)

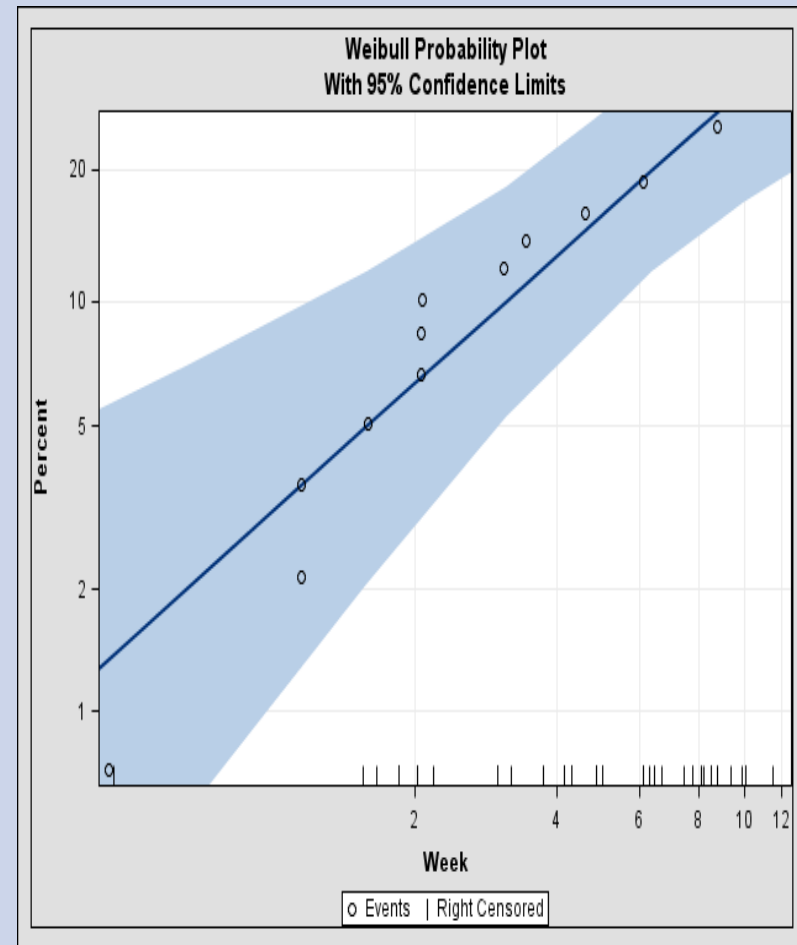
- Clear presentation of the theory.
- Accelerated Failure Time Model. Example: 1 dog-year = 7 human years. $S_{\text{human}}(t) = S_{\text{dog}}(\Phi t)$, $\Phi = 7$.
- Clear Presentation of formulas, especially liked the table on page 77 of the distribution of residuals, depending on the distribution of time.
- Good examples of SAS code, including the ProbPlot statement for checking the fit of the model. Model $Y = X1 X2 X3$; ProbPlot;
- Derivation of maximum likelihood equations.
- Conversion of model coefficients between Weibull and Proportional Hazards models, p. 80.

Ch 4 Proc LifeReg Diagnostic Plots Using "ProbPlot," From Allison's Book, pp. 101 - 103

Exponential Model



Weibull Model

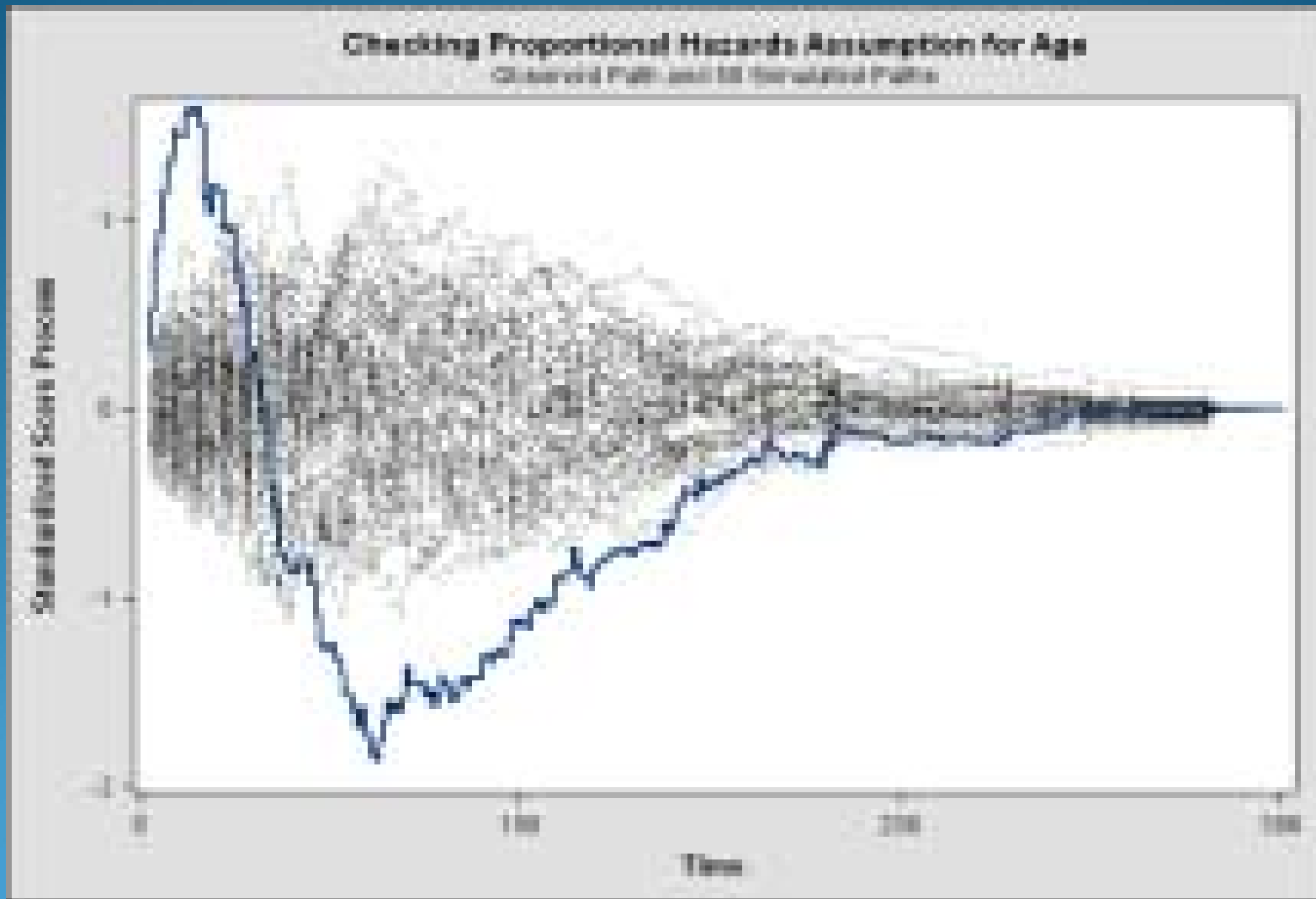




Ch 5: Proportional Hazards Reg (Proc PHReg)

- Clear explanation of proportion hazards model. Made point that the model is popular because no assumption of the shape of the survival function is required and time-dependant covariates can be included in the model.
- $\lambda(t) = \lambda_0(t)\exp(\beta_1X_1 + \beta_2X_2 + \dots + \beta_mX_m)$
- To compare the hazard ratio between X_2 at $a+1$ to a , the expression for the hazard ratio will be $\exp(\beta_2)$.
- Sections on partial likelihood, time dependent covariates, stratification.
- Discussion of checking residuals includes using the Assess statement for individual covariates.
- Although he mentioned checking the overall residuals for the model, no example of smoothed Martingale residuals.

Ch 5: Example of Diagnostic Plot for Covariate (Age)





Summary

- Allison's book closely, but does not exactly follow the syllabus for a masters level survival analysis course.
- The book provides material for more than a one-semester course and covers advanced topics, such as models with heterogenous variance and Bayesian methodology.
- The sections on theory are clear and concise, and useful for a text book supplement.
- Many excellent, practical examples of SAS code.
- Agree with SAS Institute and UM CSCAR that the book is a useful reference for anyone doing survival analysis with SAS, whether student, researcher, or applied statistician.



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