

DEPARTMENT:

Statistics

FACULTY SPONSOR:

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PROJECT TITLE:

Kaplan-Meier Survival Curves in Three Samples

Motivating Question

Can we estimate three survival curves and uphold stochastic ordering?

Introduction

The Kaplan-Meier (KM) Estimator is the most well-known survival estimator in survival analysis; however, using data from a Stanford University study in 1977 comparing degree 1 and degree 2 Carcinoma Cancer patients, there is a violation of an assumption called stochastic ordering. We expect a degree 1 Carcinoma Cancer patient to live longer than a degree 2 patient due to the severity of the disease. We will look at an estimator by Rojo (2004) to force stochastic ordering as we evaluate the Carcinoma data as well as a theoretical three-sample case.

Definitions

• **Cumulative Distributive Function (CDF):** the probability that the variable takes a value less than or equal to t, time:

$$F(t) \leq P(X \leq t)$$

For a continuous distribution, this can be expressed mathematically as:

$$F(t) = \int_{-\infty}^t f(x) dx$$

• **Survival Function and the Kaplan-Meier:**

- The survival function, $S(t) = 1 - F(t)$.
The survival function looks at the "Probability of surviving beyond time t".

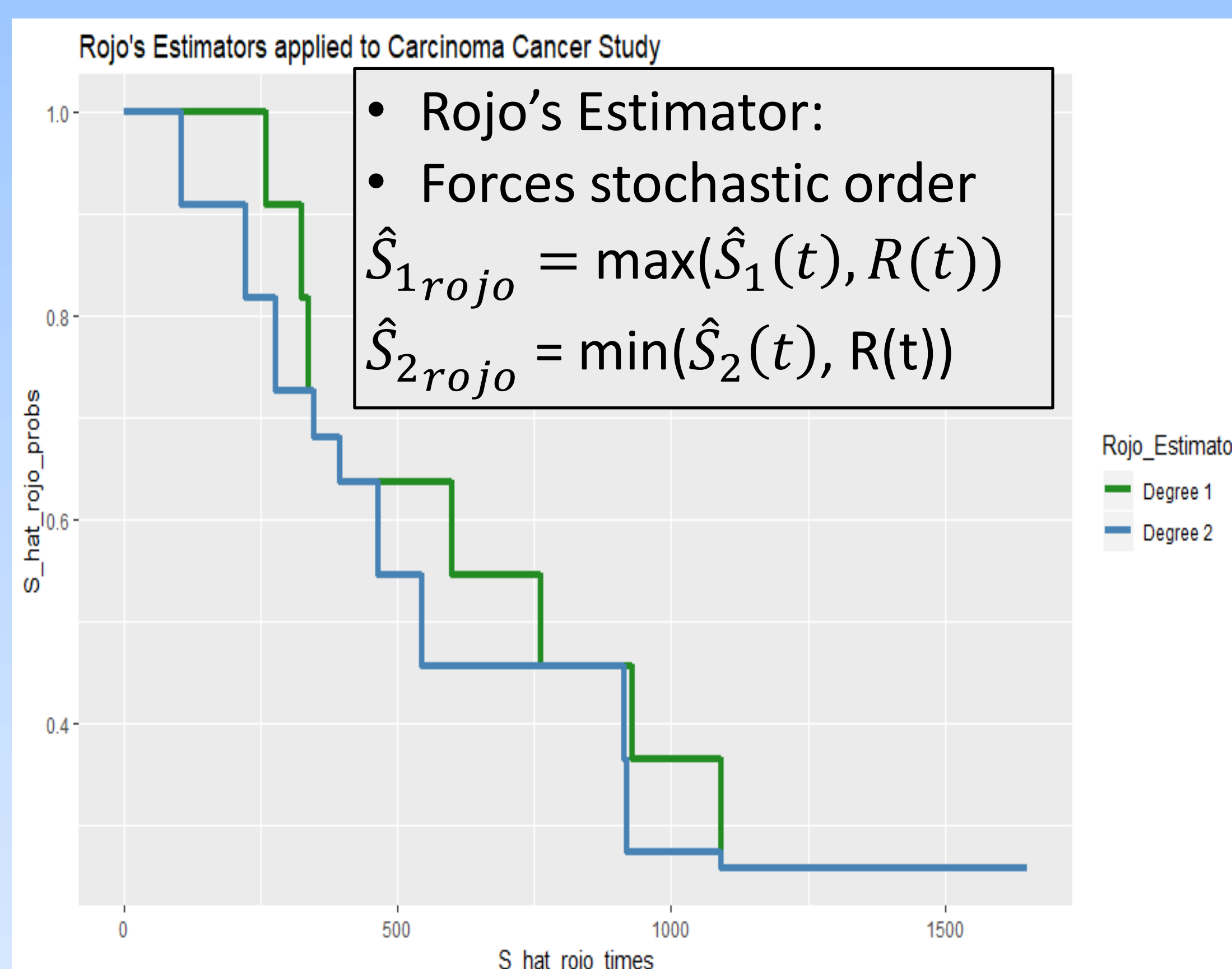
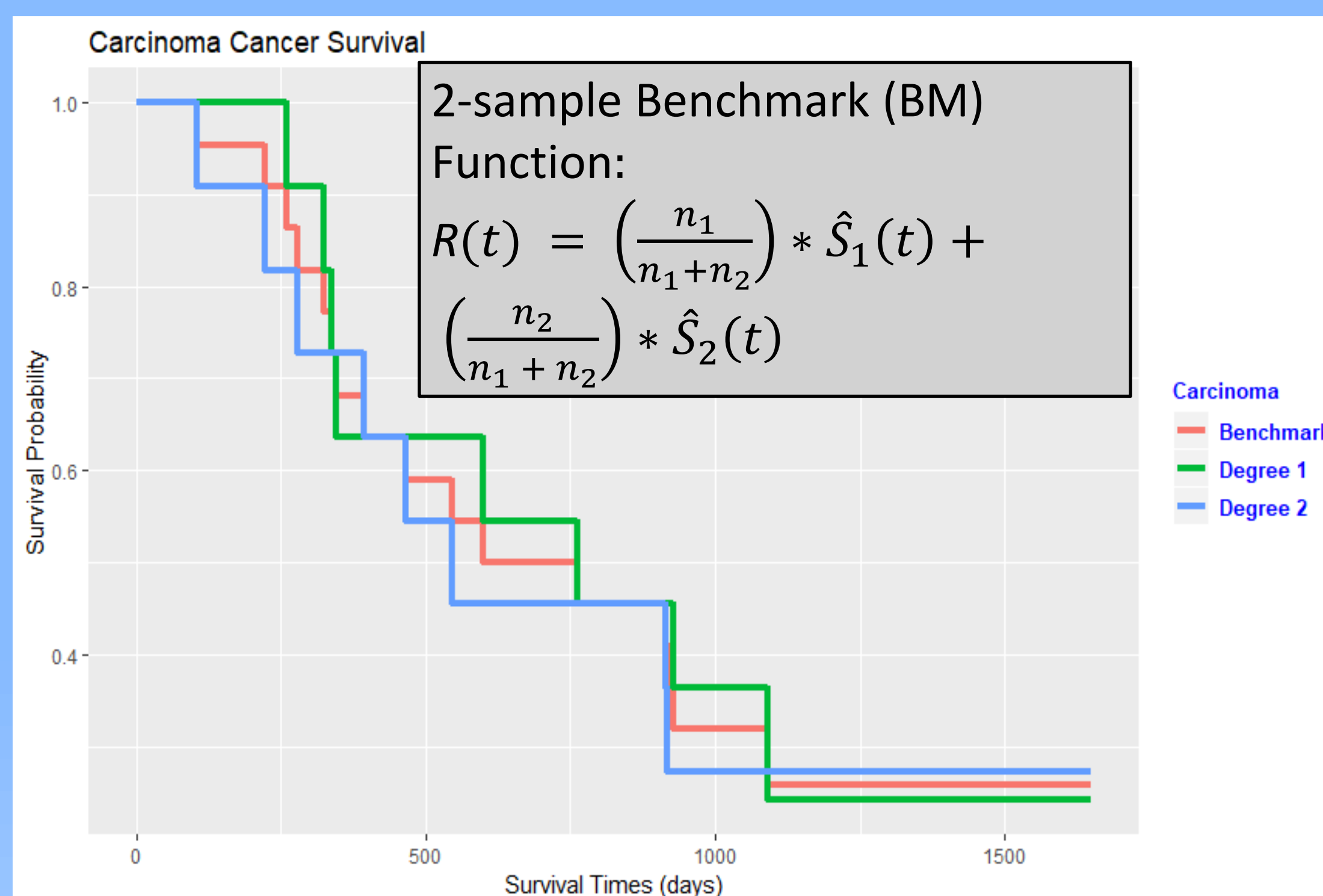
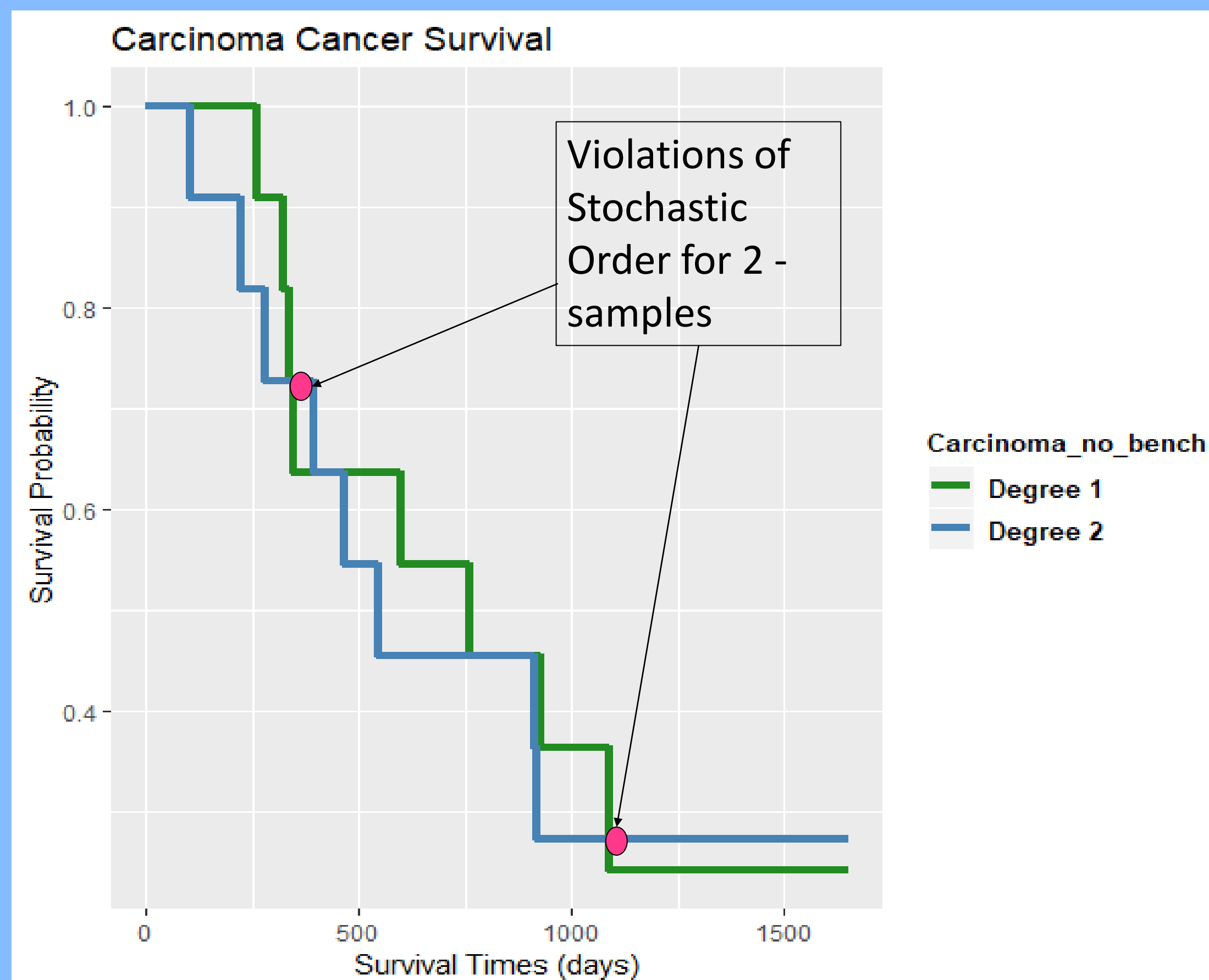
Let t_j = times of death; d_j = deaths at time t_j ; n_j = number of participants remaining in the study at time t_j .

For $t \in [t_j, t_{j+1})$, $j = 1, 2, 3, \dots$, we have...

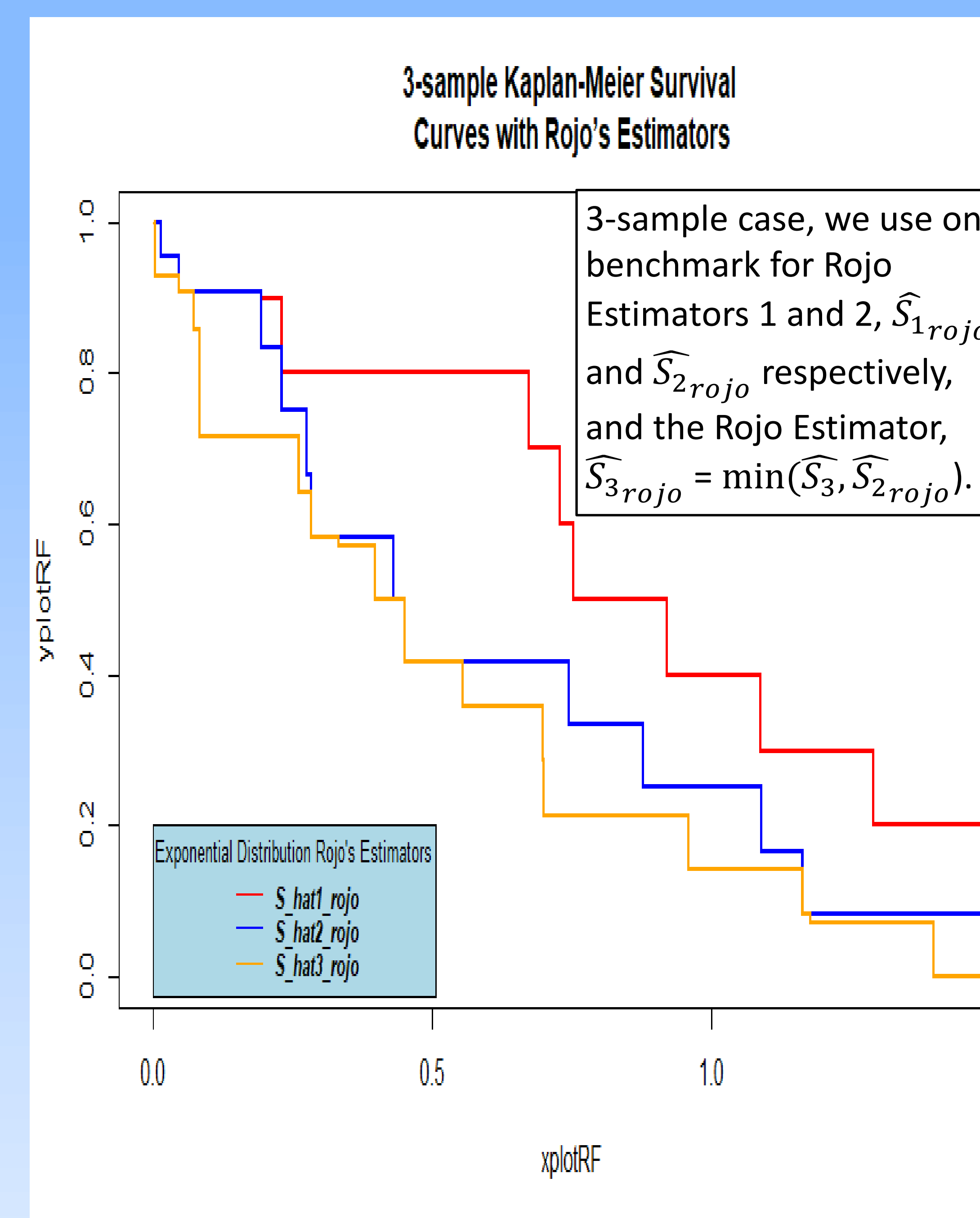
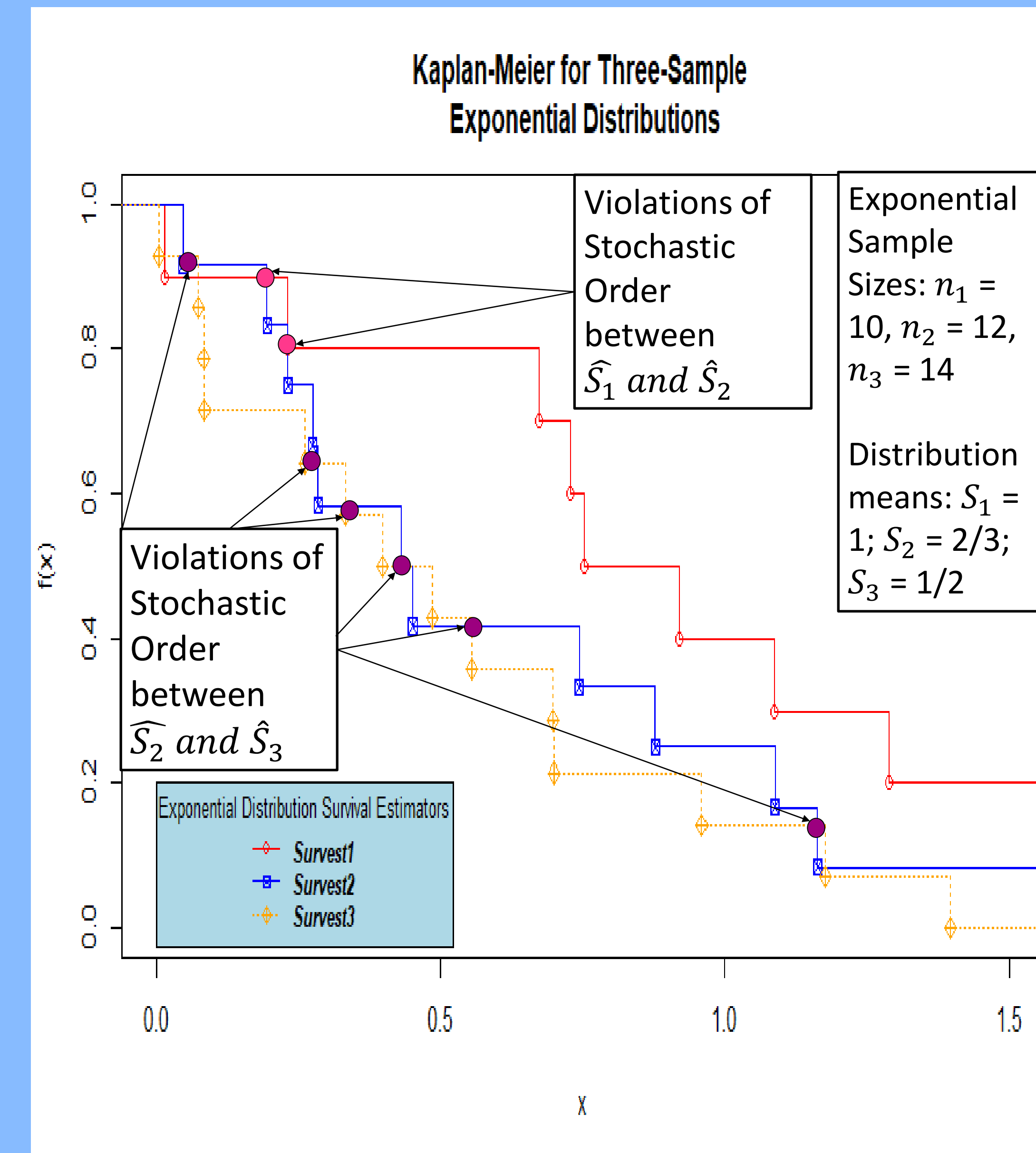
Kaplan-Meier Estimator: $\hat{S}(t) = \prod_{i=1}^j \left(1 - \frac{d_i}{n_i}\right)$.

• **Stochastic Ordering:** Let $X_1(t) \sim F_1(t)$ and $X_2(t) \sim F_2(t)$ and $F_1(t) \leq F_2(t)$ for all t. In terms of respective survival functions: $S_2(t) \leq S_1(t)$ for all t.

Carcinoma Cancer Patients – 2 sample Kaplan-Meier Survival Curves



3-sample Exponential Kaplan-Meier Survival Curves



Future Statistical Research and Conclusion

Conclusions:

- We were successfully able to estimate three survival curves that uphold Stochastic order, where \hat{S}_1 and \hat{S}_2 by the benchmark to set Rojo's Estimators.
- We achieved getting \hat{S}_{3rojo} by taking the $\min(\hat{S}_{2rojo}, \hat{S}_3)$ where \hat{S}_3 is the Kaplan - Meier survival curve.

Future Research:

- We can find the Benchmark (weighted average) between \hat{S}_{2rojo} and \hat{S}_{3rojo} instead and then find the \hat{S}_1 $\max(\hat{S}_{1rojo}, \hat{S}_1)$ where \hat{S}_1 is the Kaplan - Meier survival estimator.
- Finding the bias, mean squared error, and root mean squared errors for the three-sample case sampling from various distributions such as Weibull and Gamma. This can be done for the technique when the benchmark is between \hat{S}_1 and \hat{S}_2 , as well as the case when the benchmark is found between \hat{S}_2 and \hat{S}_3 .
- Apply similar model to up and coming data on CO-vid 19.

Acknowledgments

The preliminary work was supported through NSA grant number H98230-19-1-0016 and NSF grant DMS-1731082, to Dr. Javier Rojo PI, through the RUSIS @ Oregon State University during an REU in the Summer of 2019. Additionally, I would like to thank Dr. Rojo for the inspiration of this project and Dr. Friedman for the opportunity to further my research in Survival Analysis and I would also like to thank Dr. Ott for advising the research within this project! Also, thank you to Dr. King for helping with the legends of the graphs in ggplot.

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