

# Effect of sample design and loss of follow-up on parameters estimation of a longitudinal study

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# Sample Design in Survey Research and Longitudinal Studies

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- ▶ Complex sample design to optimize the sample size
- ▶ How to consider it in the analysis?
  - ▶ No doubt related to descriptive parameters
  - ▶ We are far from an agreement about the better strategy when adjusting an association model
- ▶ Longitudinal models → another problem: losses

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## The Longitudinal Study of Adult Health - ELSA Brasil

- ▶ Multicenter cohort study
- ▶ fifteen thousand civil servants
- ▶ six academic institutions in the South, Southeast and Northeast Brazil
- ▶ includes men and women aged 35 to 74 years old
- ▶ uses a multi-disciplinary approach to assess risk of chronic diseases and their determinants in the cohort

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# Motivation- ELSA

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- ▶ Reference population has three strata:
  - ▶ professional
  - ▶ technical
  - ▶ administrative
- ▶ The strata are related to the socioeconomic position  
⇒ The strata are related to the outcomes.
- ▶ The strata are not self-weighted

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# The Simulation Exercise

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In this study we simulated a dataset based on ELSA population, to estimate the potential bias of ignoring the sampling design in a few different scenarios, based on effect measures of three exposure variables .

We will call them *smoking* , *hypertension* and *access (to health system)*.

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# The Simulation Exercise

- ▶ 52,750 observations
- ▶ number of people in each stratum → given by the number given by the academic institutions
- ▶ indicator of smoking for each individual in the population
- ▶ smoking prevalence for each working situation → based on similar population (Pró-saúde/UERJ project )
- ▶ indicator of hypertension for each individual in the population
- ▶ hypertension prevalence for each working and smoking situation given by Pró-saúde

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- ▶ indicator of access to health system
  - ▶ related to strata
  - ▶ not related to smoking
- ▶ time to myocardial infarction based on Spanish data
- ▶ time data → Weibull distribution
- ▶ 2,000 samples, with 15,000 individuals
- ▶ two schemes simple and not self-weighted design

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# Scenarios

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We proposed four different scenarios

Table: Parameters used to simulate the datasets

Scenario	Smoking	Administrative	Technical	Hypertension	Access
1	2.00	3.00	1.50	0.00	0.00
2	$3Adm + 2Tech + 1.5Prof$	3.00	1.50	0.00	0.00
3	2.00	3.00	1.50	1.50	0.00
4	2.00	3.00	1.50	0.00	1.50

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We analyzed all samples supposing that the true model was the additive model with *smoking* and *strata*, that is, the one given by scenario 1

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# What we expected...

- ▶ scenario 1 → no design effect
- ▶ scenario 2 → expected design effect
- ▶ scenario 3 → expected design effect
- ▶ scenario 4 → We are not sure

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We also simulated the loss of follow up  
considering all the scenarios.

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We also simulated the loss of follow up  
considering all the scenarios.  
We considered 2 schemes of losses:

# Schemes of losses

- ▶ Scheme 1: random loss 15%
- ▶ Scheme 2: differential loss
  - ▶ Professional: 8%
  - ▶ Technical : 12 %
  - ▶ Administrative: 20 %

We expected to find design effect in both schemes

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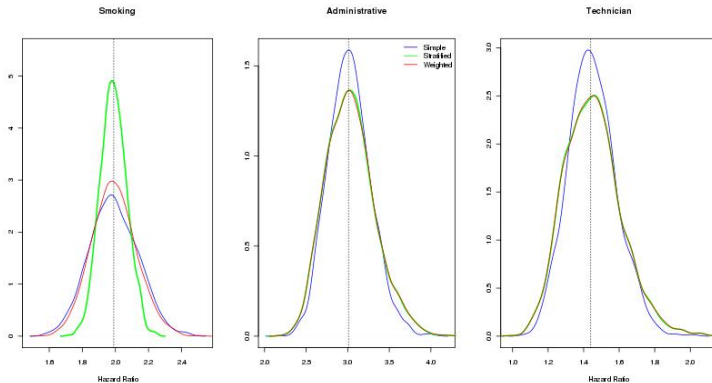
# Right Model

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If you adjust the right model, sample plan doesn't matter



$2^* \text{Smoking} + 3^* \text{Administrative} + 1.5^* \text{Technician}$

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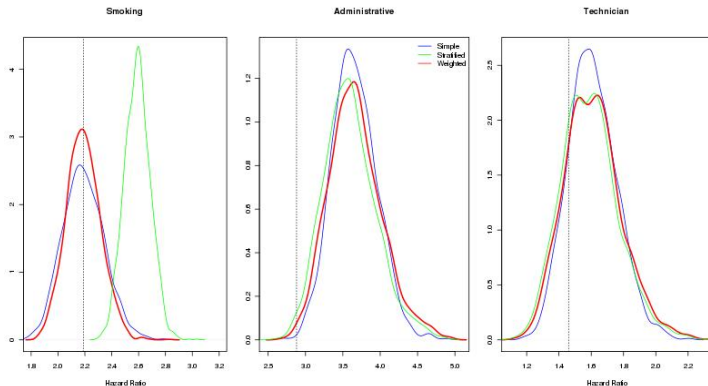
# Omitted Interaction

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If you have interaction and you don't consider it in your model, then the sample plan is very important



$3 * \text{Smoking} * \text{Administrative} + 2 * \text{Smoking} * \text{Technician} + 1.5 * \text{Smoking} * \text{Professional} + 3 * \text{Administrative} + 1.5 * \text{Technician}$  - Interactions Omitted

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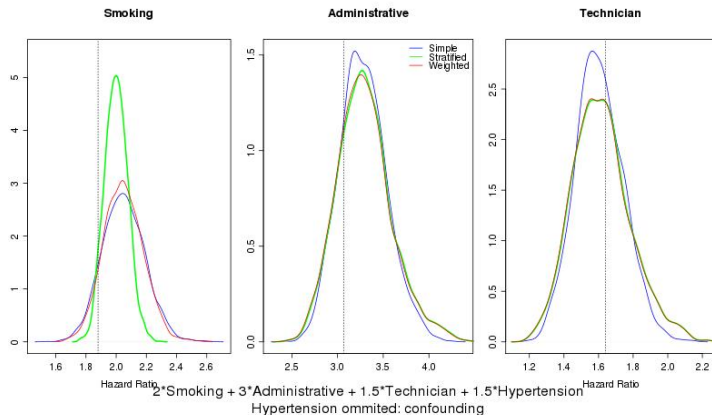


# Omitted covariate associated with the risk factor

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If you omit a covariate associated with the risk factor it seems that the sample plan is irrelevant. You always fail!



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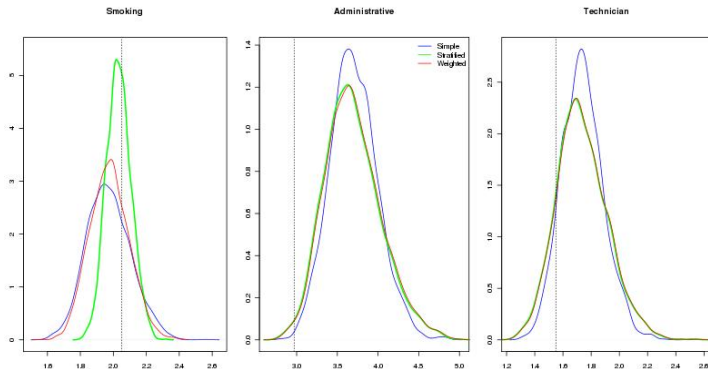
# Omitted covariate not related to the risk factor

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If you omit a covariate not related to the risk factor it seems that the stratified plan does a better job



$2 * \text{Smoking} + 3 * \text{Administrative} + 1.5 * \text{Technician} + 0.4 * \text{Omitted} * \text{Administrative} + 0.6 * \text{Omitted} * \text{Technician} + 0.8 * \text{Omitted} * \text{Professional}$   
Omitted

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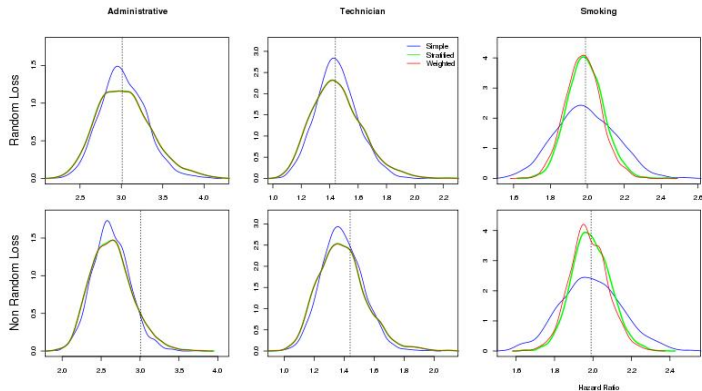
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# Loss - Right Model

If you adjust the right model, you don't have bias, even if you have loss



$$2 * \text{Smoking} + 3 * \text{Administrative} + 1.5 * \text{Technician}$$

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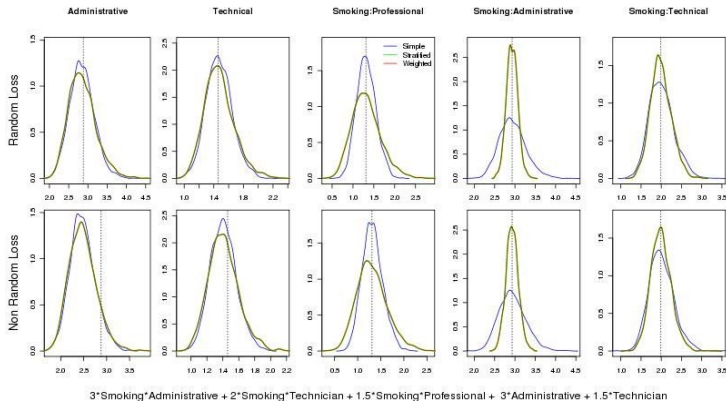
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# Loss - Scenario 2 - Right Model

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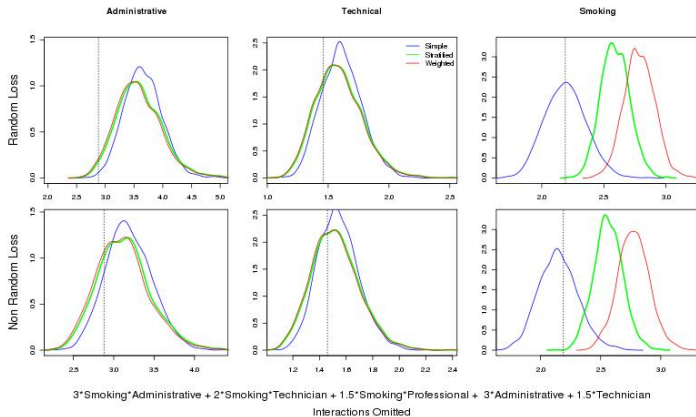
# Loss - Scenario 2 -Omitted Interaction

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If you have loss, even if you weigh the sample, you get biased results



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Which strategy is the best?

- ▶ There isn't one strategy that is always the best
- ▶ It depends on the situation
- ▶ The stratified sampling gives the least MSE in a lot of situations
- ▶ It seems that the stratified sampling is less robust
- ▶ If you have loss  $\rightarrow$  use a proper model to analyse the data

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