## SDA 2019 — Assignment 5

For these exercises you can use the function **bootstrap** on the Canvas page (see Assignment 4). The R-function quantile( $\mathbf{x}, \alpha$ ) gives the  $\alpha$ -quantile of values in the vector  $\mathbf{x}$ . For the parameter  $\alpha$ , either a single value or a vector  $(\alpha_1, \alpha_2, \ldots, \alpha_k)$  can be inserted into the function quantile.

Make a concise report of all your answers in one single PDF file, with only relevant R code in an appendix. It is important to make clear in your answers <u>how</u> you have solved the questions. Graphs should look neat (label the axes, give titles, use correct dimensions etc.). Multiple graphs can be put into one figure using the command par(mfrow=c(k,1)), see help(par). Sometimes there might be additional information on what exactly has to be handed in. Read the file AssignmentFormat.pdf on Canvas carefully.

*Note:* If it is not specified which bootstrap estimator to use, take the empirical and not the parametric one.

Exercise 5.1 Read Examples 3.4 and 4.4 in the syllabus about data on  $\beta$ -thromboglobulin levels which can be loaded by the R-code in thromboglobulin.txt<sup>1</sup>. You can select e.g. the PRRP data using R-command thromboglobulin\$PRRP or thromboglobulin[[1]]. Or use attach(thromboglobulin) so that the variables PRRP, SDRP and CTRP are defined, see help(attach).

- a. Determine a 95%-bootstrap confidence interval for the expectation of the underlying distribution of PRRP. Take B sufficiently large.
- b. Determine a 95%-bootstrap confidence interval for the median of the underlying distribution of PRRP. Take B sufficiently large.
- c. Compare the answers of parts a and b. Which estimator of location do you prefer and why?
- d. Determine a 95%-bootstrap confidence interval for the difference in mean between the two groups SDRP and PRRP. What can you conclude from this interval about the difference in mean of the two underlying distributions? (Note that this is a two sample problem, like in Example 4.4.)

**Hand in:** the computed intervals and your answers to parts c and d.

<sup>&</sup>lt;sup>1</sup>For importing the data use the command source("thromboglobulin.txt").

## Exercise 5.2

This exercise illustrates an example where the bootstrap does not work very well. Before you make this exercise, first read Section 4.5 of the syllabus.

Consider  $X_1, \ldots, X_n$ , a sample from the uniform distribution on  $[0, \theta]$  with  $\theta > 0$  unknown. The estimator  $T_n = \frac{n+1}{n} X_{(n)}$  is an unbiased estimator of the unknown  $\theta$ . Note that  $X_{(n)} = \max_i X_i$ .

- a. Generate a sample of size 50 from the uniform distribution on [0,1]. Compute, using the empirical bootstrap method, an estimate of the variance of  $T_n$ . Take B = 1000 bootstrap samples.
- b. Repeat the whole procedure in part a. a few times (taking a new initial sample of size 50 each time) and compare the obtained estimates with the theoretical value for the variance of  $T_n$  (see e.g. the syllabus of the lecture Statistics).
- c. Explain how the *parametric* bootstrap method can be used in this case. Perform this parametric bootstrap procedure to obtain again an estimate for the variance of  $T_n$ . Take B = 1000 bootstrap samples. Also repeat this whole procedure a few times.
- d. Which of the two bootstrap methods, the empirical or the parametric, works better in this case? Can you explain why?

**Hand in:** your results of parts a, b, and c, and your answer to part d.