Exercise 1:

Let T denote survival time with survival function $S_T(t)$. Simulate a sample of size n = 1500 from a Cox model with hazard rate

$$h(t;x) = t \cdot \exp(0.5x) .$$

Use the inverse transform sampling method developed in exercise 5, study sheet 7. Simulate the covariate x_1 from a uniform distribution on the interval [-3,3] and the censoring times from a uniform distribution on the interval [0,6]. Plot the Cox-Snell residuals against the cumulative hazard rate to check the overall goodness-of-fit of the fitted model. For the derivation of the distribution of the Cox-Snell residuals use the distribution of $Y = -\ln(S_T(T)) \sim \mathcal{E}(\lambda = 1)$.

Exercise 2:

Simulate a sample of size n = 1500 from a Cox model with hazard rate

(a)
$$h(t;x) = t \cdot \exp(\sin(x_1) + 0.5x_2)$$
.

(b)
$$h(t;x) = t \cdot \exp(x_1^2 + 0.5x_2)$$
.

Use the inverse transform sampling method developed in exercise 5, study sheet 7. Simulate the covariate x_1 and x_2 from a uniform distribution on the interval [-3,3] and the censoring times from a uniform distribution on the interval [0,6]. Obtain the martingale residuals and deviance residuals and check whether one can use them to make conclusions about the functional form of the covariate x_1 . The loess() function can be used to smooth the residuals.

Exercise 3:

In the lectures, the martingale property has been stated as follows (see slide 7 of the set of slides "Refinements of the semiparametric proportional hazards model"):

$$E[dM(t)|\mathcal{F}_{t-}] = 0 \quad \text{for all } t . \tag{1}$$

Show that equation (1) is equivalent to

$$E[M(t)|\mathcal{F}_s] = M(s) \quad \text{for all } s < t . \tag{2}$$

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Exercise 4:

The file resmelanoma.prn that is available in the Stud.IP folder "Data" contains survival times from 30 resected melanoma patients (for a description of the data, see the file resmelanomahelp.txt). Let ageg denote the age group with ageg = 1 if age < 45 and ageg = 2 otherwise. Fit the survival times with an ageg-stratified Cox proportional hazards model with the covariates sex and treatment received.

Exercise 5:

The file prison.txt, which is available in the Stud.IP folder "Data", contains data from an experimental study of recidivism of 432 male prisoners, who were observed for a year after being released from prison.² Half of the prisoners were randomly given financial aid when they were released. The following table gives a description of the observed variables:

Variable	Description
week	week of first arrest after release, or censoring time
arrest	the event indicator, $1 = $ arrested , $0 = $ not
fin	1 = received financial aid, 0 = not
age	in years at the time of release
race	1 = black, 0 = others
wexp	1 = had full-time work experience, 0 = not
mar	1 = married, 0 = not
paro	1 = released on parole, 0 = not
prio	number of prior convictions
educ	codes 2 (grade 6 or less), 3 (grades 6 through 9), 4 (grades 10 and 11),
	5 (grade 12), or 6 (some post-secondary)
emp1 - emp52	1 = employed in the corresponding week, 0 = not

- (a) Fit a Cox model to these data. Use backward selection, which is implemented in the function stepAIC() function from the R package MASS, to find the best model according to the Akaike Information Criterion (AIC).
- (b) In the file prisonlong.txt each row corresponds to one observation per person per week. Fit a Cox model with the time-dependent variable employed to these data.
- (c) Create a variable employed.lag1 which should contain information whether the person was employed in the previous week. Again, fit a Cox model using the variable employed.lag1 instead to employed.
- (d) How could you check the assumption of proportional hazards for all the variables of the best model found in (a) using interaction terms with time of observation?

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¹Data of Table 3.1 in Lee, E. T. and Wang, J. W. (2013): Statistical Methods for Survival Data Analysis, 4th edition, Wiley.

²Rossi, P. H., Berk, R. A. and Lenihan, K. J. (1980): *Money, Work and Crime: Some Experimental Results*, New York: Academic Press.