

# MS-C1620 Statistical Inference

## Exercise 10

### Homework exercise

To be solved at home before the exercise session.

1. a. Consider the following linear model,

$$\mathbb{E}(y_i | \mathbf{x}_i) = \beta_0 + \beta_1 \text{sex}_i + \beta_2 \text{age}_i + \beta_3 (\text{sex}_i \times \text{age}_i),$$

where  $\text{sex}_i$  is a binary variable (0 = male, 1 = female) and  $\text{age}_i$  is a continuous variable. Write down the model separately for males and females and using the two models give interpretations for the four parameters.

- b. The data set `galaxy` from the package `ElemStatLearn` contains measurements on the position and radial velocity of the galaxy NGC7531. Fitting a model with the latter as a response, we get the following model summary and residual plot. Does the model fit well? If not, what could be tried next?

```
library(ElemStatLearn)
library(car)
```

```
## Loading required package: carData
```

```
lm_galaxy <- lm(velocity ~ ., data = galaxy)
summary(lm_galaxy)
```

```
##
## Call:
## lm(formula = velocity ~ ., data = galaxy)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -80.988 -23.673   0.442  22.770  67.527
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  1589.42295    3.92939  404.496 < 2e-16 ***
## east.west      0.77410     0.31202   2.481  0.01362 *
## north.south    -3.19179     0.09697  -32.914 < 2e-16 ***
## angle          0.12454     0.04396   2.833  0.00491 **
## radial.position 0.90118     0.16042   5.618  4.23e-08 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 30.13 on 318 degrees of freedom
## Multiple R-squared:  0.8991, Adjusted R-squared:  0.8979
## F-statistic: 708.6 on 4 and 318 DF,  p-value: < 2.2e-16
```

```
vif(lm_galaxy)
```

```
##      east.west    north.south      angle radial.position
##      4.996114      1.747546      1.002817      6.118775
```

```
plot(fitted(lm_galaxy), resid(lm_galaxy), xlab = "Fitted value", ylab = "Residual")
abline(h = 0)
```



### Class exercise

To be solved at the exercise session.

1. The data set `Chirot` from the package `carData` contains statistics on the 1907 Romanian peasant rebellion. Each row of the data is a county for which the `intensity` of the rebellion has been measured, along with various socio-economic variables. Investigate using linear regression whether there is dependency between `intensity` and the explanatory variables.
- Visualize the data.
  - Fit a linear regression model to the data.
  - Assess the adequacy of the model and its assumptions through the model summary, VIFs and model diagnostics.
  - Make changes to the model, if needed.
  - Interpret the results.

2. The data set `longley` contains measurements of economic variables from the years 1947-1962. We are interested in predicting the number of people employed ( `Employed` , in thousands) using the other variables.
- Visualize the data.
  - Fit a linear regression model to the data.
  - Assess the adequacy of the model through the model summary and VIFs.
  - Make changes to the model, if needed.

3. **(Optional)** While general non-linear regression is beyond this course, fitting such models with R is quite straightforward. Try out the following code where a non-linear Generalized Additive Model (GAM) is fitted between temperature and ozone content in the `airquality` data.

```
# install.packages("mgcv")
library(mgcv)

x <- data.frame(ozone = airquality[, 1], temp = airquality[, 4])
gam_1 <- gam(temp ~ s(ozone), data = x)

plot(x, xlab = "Ozone", ylab = "Temperature")
ozone_grid <- data.frame(ozone = seq(min(x$ozone, na.rm = TRUE), max(x$ozone, na.rm = TRUE), length.out = 1000))
points(ozone_grid[, 1], predict(gam_1, ozone_grid), type = 'l')
```

Investigate especially what the final three lines do and what is the meaning of `ozone_grid` . Try also to fit a non-linear model to some other data set using the above as a template.