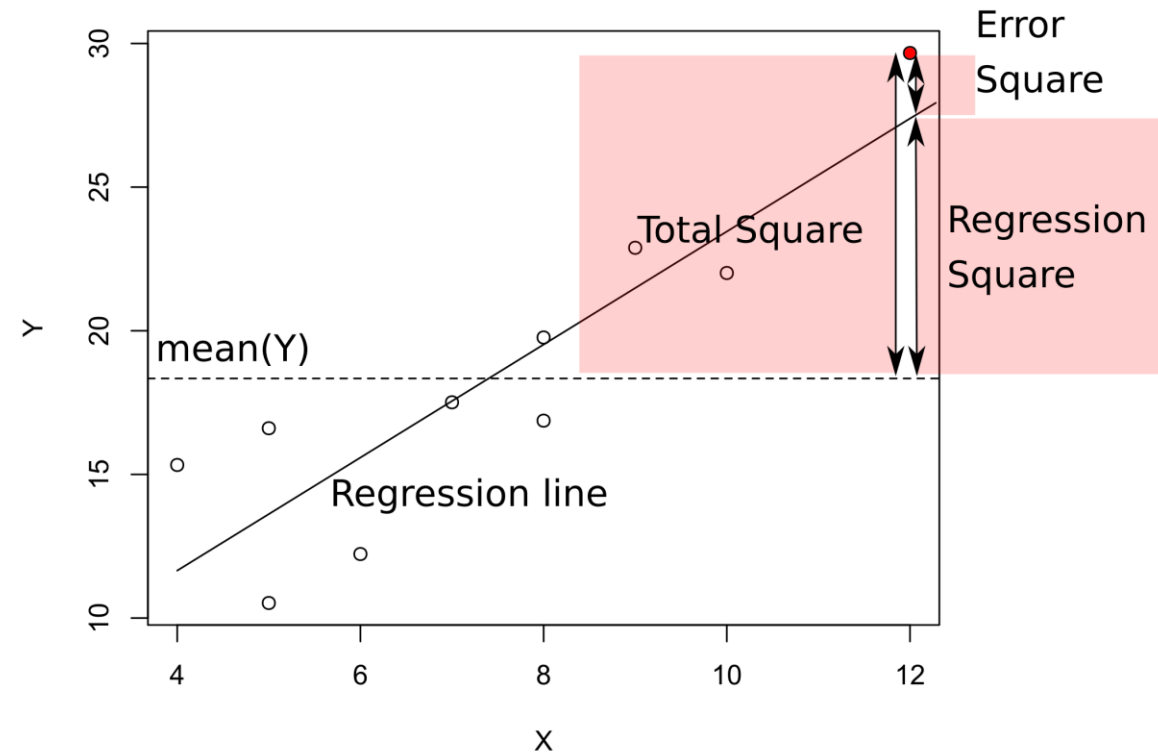


Chapter 9
Linear regression
Correlation

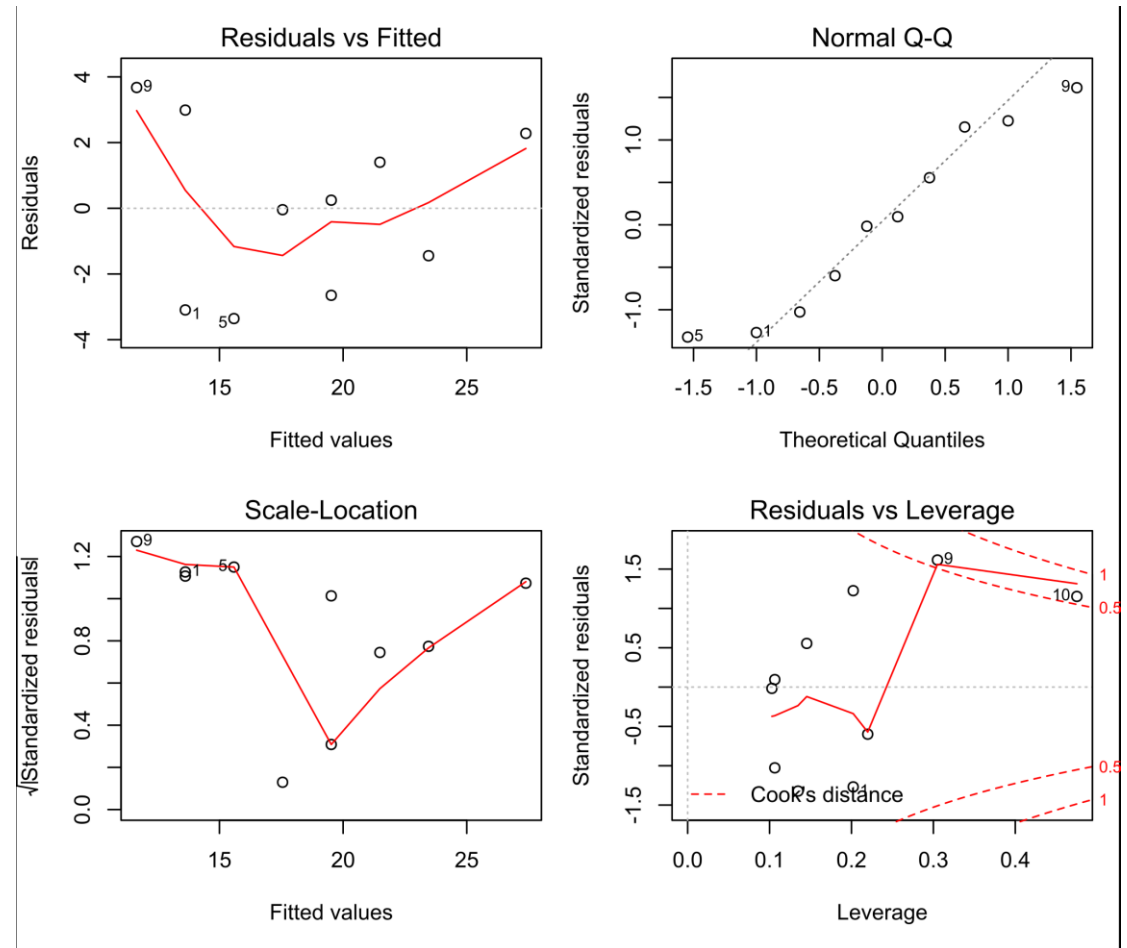
Linear regression

- Describes asymmetric dependence of two quantitative variables
 - Response variable depends on predictor(s)
- General formula: $Y = a + bX + \varepsilon$
 - Y = response
 - X = predictor
 - **a = intercept**
 - **b = slope**
 - ε = residuals (error)
- Decomposition of total Sum Sq. into Regression Sum Sq. and Error Sum. Sq. as in ANOVA
- Significance testing by F-test
 - $F_{DF_{\text{regr}}, DF_{\text{error}}} = MS_{\text{regr}} / MS_{\text{error}}$
- DF_{regr} = number of predictors (1 in simple regression)
- DF_{error} = number of observations – DF_{regr} – 1
- Coefficient of determination $R^2 = SS_{\text{regr}} / SS_{\text{total}}$
- Adjusted $R^2 = 1 - MS_{\text{error}} / MS_{\text{total}}$
 - Accounts for the estimate nature of the R^2



Regression assumptions

- Normality of residuals
- Independence between residuals and fitted values
- Linear relationship between X and Y
- Check by Regression diagnostics



Correlation

- Symmetric association between two quantitative variables
- Pearson correlation coefficient: $r = \frac{\sum_{i=1}^n (X_i - \bar{X})(Y_i - \bar{Y})}{\sqrt{\sum_{i=1}^n (X_i - \bar{X})^2 \sum_{i=1}^n (Y_i - \bar{Y})^2}}$
 - $r > 0$ (max. 1): positive correlation
 - $r < 0$ (min. -1): negative correlation
 - $r = 0$: independence
- Can be tested for significance (i.e. difference from 0) by a single sample t -test with $DF = n - 2$
- $r^2 =$ proportion of shared variability = regression R^2

Correlation and causality

- Causality = if X changes, Y also changes
- Correlation = association between two variables
 - A change caused by a manipulation in one does not imply a necessary change in the other
- Associations are mostly analyzed by regression
 - Numerical equivalence between correlation and regression
 - Significant regression does not mean causality
- Causality can only be demonstrated by **manipulative experiments!**