

# Seminar in Statistics: Mixed-effects Models

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## 1 Linear Mixed-Effects Models

### 1. Motivation and Introduction (Jürg)

Introducing mixed-effects models by examples. Pinheiro und Bates (2000) ch. 1, Bates (2010) ch. 1-4, Bates (2009) ch. 1-3,5.

### 2. The Linear Mixed-Effects Probability Model (Manuel)

Formulation of the model and estimation for known  $\theta$ . Bates (2010) 1.4.1, 5.1 - 5.4, (maybe) 5.6: Definitions, the conditional distribution, integrating  $h(u)$  in the linear mixed model, determining the PLS solutions, (maybe) the fill reducing permutation, (maybe) step by step evaluation of the profiled deviance, determining  $r_\theta^2$  and  $\hat{\beta}_\theta$ .

### 3. Optimization Algorithms (Jürg)

Present the three general types of algorithm: EM, Newton-Raphson, Fisher-Scoring. Demidenko (2004) ch. 2.1, 2.2, 2.5, 2.8-2.15, 13.3 and Pinheiro und Bates (2000) chapter 2.2.8.

### 4. Hypothesis Tests, Confidence Intervals (Manuel)

Bates (2010) 1.5, 1.6: Assessing the variability of parameter estimates, Assessing the Random Effects. (See Demidenko (2004) 3.4 and 3.5 for additional information.) Discuss some examples of Bates (2010) ch. 2 and 3. Give contrast to the methods used in other software packages (B.T. West (2007) 2.6, 3.11.6, 3.11.10: approximate F distribution, degrees of freedom)

### 5. LMMs in Practice (Jürg)

Present the complete analysis of several data examples. Pinheiro und Bates (2000) ch. 3-5, Bates (2010) ch. 1-4, B.T. West (2007) ch. 1-7.

### 6. Prediction of New Observations (Manuel)

Prediction of new observations in contrast to prediction of random effects. Principles of prediction: Welham u. a. (2004). (Further Resources: Vidoni (2006) and Jiang (2007).)

## 2 Nonlinear Mixed-Effects Models

### 7. Overview and Motivation: Introduction to NLS Models (Jürg)

Ruckstuhl (2006), Bates und Watts (1988) ch. 2

### 8. Theory: NLMMs (Jürg)

Pinheiro und Bates (2000) ch. 7, maybe Bates (2010)

### 9. Fitting Nonlinear Mixed-Effects Models (Jürg)

Pinheiro und Bates (2000) ch. 6 and 8, maybe Bates (2010)

### 3 Generalized Mixed-Effects Models

10. **Overview and Motivation: Introduction to GLM Models (Manuel)**  
Stahel (2009) ch 13, Collett (2002) ch 3
11. **Theory: GLMMs (Manuel)**  
Bates (2010) 5.7, Collett (2002) ch 8, Demidenko (2004) ch 7.
12. **GLMMs in Practice (Manuel)**  
Present the complete analysis of one or more examples. Bates (2010) and Collett (2002).

#### Remark:

In order to run the R-code in Bates (2010), you require the packages `lme4a` and `Matrix`, loaded by

```
install.packages("lme4a", repos="http://R-Forge.R-project.org")
install.packages("Matrix", repos="http://R-Forge.R-project.org")
```

## References

- [Bates 2009] BATES, D.: *Linear mixed model implementation in lme4*. URL <http://stat.ethz.ch/CRAN/web/packages/lme4/vignettes/Implementation.pdf>, 2009. – vignettes of lme4
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- [Bates und Watts 1988] BATES, Douglas M. ; WATTS, Donald G.: *Nonlinear regression analysis and its applications*. New York : Wiley, 1988 (Wiley Series in Probability and Mathematical Statistics)
- [B.T. West 2007] B.T. WEST, A.T. G.: *Linear Mixed Models - A Practical Guide Using Statistical Software*. Chapman & Hall/CRC, 2007
- [Collett 2002] COLLETT, D.: *Modelling binary data*. CRC Pr I Llc, 2002
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- [Ruckstuhl 2006] RUCKSTUHL, A.: *Einführung in die nichtlineare Regression*. 2006. – Lecture Notes
- [Stahel 2009] STAHEL, W.: *Verallgemeinerte lineare Regression*. 2009
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- [Welham u. a. 2004] WELHAM, S. ; CULLIS, B. ; GOGEL, B. ; GILMOUR, A. ; THOMPSON, R.: Prediction in linear mixed models. In: *Australian & New Zealand Journal of Statistics* 46 (2004), Nr. 3, S. 325–347