## APTS Statistical Modelling: Practical 2

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The data in the file hip.txt (available from the APTS web site) are taken from Crowder and Hand (*Analysis of Repeated Measures*, 1990, Chapman and Hall) and can be read into R by using

Variable y represents measurements of response variable *haematocrit* on 30 patients (subj) on up to three occasions (time), one before a hip-replacement operation, and two afterwards. The age and sex (0=male, 1=female) of the patients is also recorded.

We will investigate these data using linear mixed models of the form  $y_{ij} \sim N(\mu_{ij}, \sigma^2)$  where  $y_{ij}$  is the response for subject i, time j and

$$\mu_{ij} = x_{ij}^T \beta + z_{ij}^T b_i, \quad b_i \sim N(0, \Sigma_b).$$

You should consider including age, sex and time (and possibly interactions) within  $x_{ij}$  and time within  $z_{ij}$ . We will treat time as a categorical variable.

LMMs for clustered data can be fitted in R using the lmer function from the lme4 library:

```
library(lme4)
```

## Loading required package: Matrix

For example

```
hip_lmm1 <- lmer(y ~ age + sex + factor(time) + (1 | subj), data = hip)
```

fits the model with 1, age, sex, I(time=2) and I(time=3) in  $x_{ij}$ , and just the intercept 1 in  $z_{ij}$ .

The default estimation method is REML. If you want to obtain maximum likelihood estimates (for example, for use in model comparison), they can be obtained using the additional argument REML = FALSE.

You might find some of the following functions useful – they all take an lmer fit as their first argument: summary, fitted, residuals, fixef (fixed effects estimates), ranef (random effects estimates), VarCorr (variance estimates) coef (coefficient estimates at cluster level, incorporating fixed and random effects), AIC, BIC and predict.

## Tasks

- 1. Plot the time profiles of the response variable for each subject on a single plot (as we did for the rat growth data in Example 2.4 in the lecture notes). Do you think you think it will be necessary to include a random intercept for the subject? What about a random slope for time?
- 2. Find your preferred LMM for this data.
- 3. For your preferred LMM, plot the predicted haematocrit levels for each subject against time.