

# Contextual Effects

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libraries:

```
#MLM packages
library(lme4)
library(lmerTest)
```

## CONTEXTUAL ANALYSIS

This exercise is to be completed in lab and uploaded to blackboard. Complete the exercise in groups of 3.

For this part on contextual analysis, you hand in (upload to BB) a word or pdf file (no excel file) containing your answers. Please upload at the end of lab today.

We will reanalyze the exam dataset, analyzed in assignment 1, now from the perspective of contextual effects. As a reminder, the file exam.csv holds data from pupils in English Schools. The dependent variable is exam-scores, and the independent variables are reading ability (LRT, London Reading Test) and average reading ability in school (AvsLRT). In the analysis done in assignment 1, we included both reading ability and average reading ability in the school in our analysis. So, without knowing it, we already did a contextual analysis!

```
#load the data

exam <- read.csv(file = "exam.csv", header = TRUE)
head(exam)
```

1. Start with model 3: the model that includes a random intercept, the predictors at level 1 (in this case, LRT - reading ability per student), and the predictors at level 2 (in this case, AvsLRT - the average reading ability in the school). Include the predictor LRT using **grand mean centering**.

```
#grand mean centering
exam$lrt_gmc <- exam$LRTscore - mean(exam$LRTscore)

#model with fixed predictors for both levels
model_3_gmc <- lmer(Examscore~1 + lrt_gmc + AvsLRT + (1|School), REML = FALSE, data = exam)
summary(model_3_gmc)
```

- a) What does the regression coefficient for LRT represent in terms of contextual effects? The regression coefficient for LRT represents the within school effect of individual reading ability on the exam score. So with every point higher a child has on individual reading scores compared to her/his peers, the child scores 0.56 points higher on the exam score.

b) What does the regression coefficient for AvsLRT represent in terms of contextual effects?

As the individual level predictor is added grand mean centered, the regression coefficient for AvsLRT represents the difference between the within school effect of individual reading ability on the exam score and the between school effect of average reading ability on the exam score. So on top of the within effect of the individual reading score on exam, if a child is within a school that on average scores 1 point higher on reading score, the child on average gains an added 0.36 points on the exam score.

2. Suppose we want to calculate the predicted exam score for 2 children, child X and Y. We want to predict the exam score for these children under 2 scenarios: when the children would go to school A, and when the children would go to school B. We have the following information:

- Child X has score -2, so he/she has a score below average
- Child Y has score 2, so he/she has a score above average
- School A has an average of -1, so the school is below average
- School B has an average of 1, so the school is above average

What are the predicted exam scores for the two children under the two scenarios?

estimated exam scores:  $\text{intercept} + y_{10} * \text{Childscore} + y_{01} * \text{Schoolaverage} = \text{estimate}$

- child X on school A:  $0.01 + 0.56 * -2.00 + 0.36 * -1.00 = -1.46$
- child X on school B:  $0.01 + 0.56 * -2.00 + 0.36 * 1.00 = -0.75$
- child Y on school A:  $0.01 + 0.56 * 2.00 + 0.36 * -1.00 = 0.77$
- child Y on school B:  $0.01 + 0.56 * 2.00 + 0.36 * 1.00 = 1.49$



School A:

```
A_X <- 0.01 + 0.56*-2 + 0.36*-1
A_Y <- 0.01 + 0.56*2 + 0.36*-1
```

School B:

```
B_X <- 0.01 + 0.56*-2 + 0.36*1
B_Y <- 0.01 + 0.56*2 + 0.36*1
```

3. Again fit model 3 (the model that includes a random intercept, and the predictors at level 1 and 2), but this time include the predictor LRT using **cluster** mean centering (i.e., within cluster centering).

```
exam$lrt_groupmean <- ave(exam$LRTscore, exam$School)
exam$lrt_wcc <- exam$LRTscore - exam$lrt_groupmean
```

```
model_3_wcc <- lmer(Examscore~1 + lrt_wcc + AvsLRT + (1|School), REML = FALSE, data = exam)
summary(model_3_wcc)
```

a) What does the regression coefficient for LRT represent in terms of contextual effects? Interpret this coefficient.

The LRT regression coefficient represents the within effects of the model, i.e. the effect that the LRT reading score of an individual student has on their exam score. One point above the class average results in a higher predicted exam score. In this case, for every point a student scores higher on LRT, on average the predicted exam score of this student increases by 0.56 points.

- b) What does the regression coefficient for AvsLRT represent in terms of contextual effects? Interpret this coefficient.

The AvsLRT regression coefficient represents the **between effects** of the model, i.e. the effect that belonging to different schools has on the exam score of students. One point higher in average reading score results in a higher predicted (mean school) exam score. In this case, for every point a school scores higher on the AvsLRT, the predicted exam score of the average student in this class increases by 0.92 points.

4. Does the within effect differ significantly from the between effect? Interpret.

Yes, the between effect is 0.358 points larger compared to the within effect, which is statistically significant,  $t(63) = 3.250, p = .0018$ .