



Part 9: Linearised Rasch Models - The restricted LLTM

The 'L' Models:

- Linear Logistic Test Model (LLTM)
- Linear Partial Credit Model (LPCM)
- Linear Rating Scale Model (LRSM)
- Linear Logistic Model with Relaxed Assumptions (LLRA)



Linear Logistic Test Model (LLTM)

LLTM is a linearised version of the RM

item parameters β_i , ($i = 1, \dots, k$) are decomposed into a weighted sum of so called "basic parameters", η_j , ($j = 1, \dots, p$)

$$P(X_{vi} = 1) = \frac{\exp(\theta_v - \beta_i)}{1 + \exp(\theta_v - \beta_i)}$$

with

$$\beta_i = \sum_{j=1}^p w_{ij} \eta_j \quad i = 1, \dots, k.$$

η_j are the basic parameters of the LLTM
 w_{ij} are fixed weights ('item-specific covariates')



LLTM

general idea: reparameterisation of the item parameters

generalises the RM in two ways:

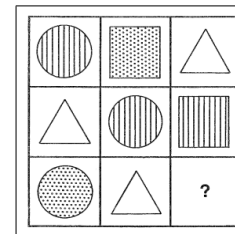
- **Item Structure Model (1)** (Scheiblechner, 1972)
 (more restrictive than RM)
 - evaluate components of items
 - construction of adaptive tests
 - tailored testing
- **Repeated Measurement Model (2)** (Fischer, 1972)
 (extending the RM)
 - measuring change on latent dimension
 - specification of groups possible
 - experimental designs



LLTM (1) - Item Structure Model

Items are composed of different components
 ('item specific' covariates)

Example: Item Bank Construction (Hornke & Habon, 1986)
 in the context of research on cognitive operations

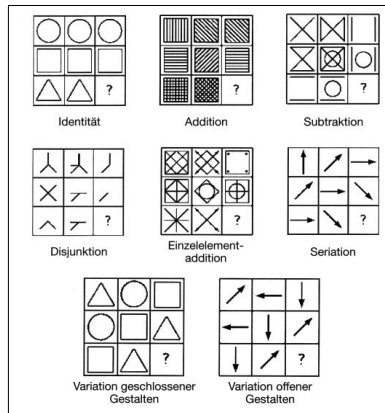


Item is composed of
 3 structural components

difficulty of the components
 makes up the difficulty of the
 item



LLTM (1) - Test construction



Components are:

- Operations (see left)
- Relations:
 - by row
 - by column
 - both
 (see the upper three items)
- these two may be
 - separated
 - integrated
 - embedded



LLTM (1) - Test construction

the designmatrix could be:

$$\begin{array}{cccc}
 & \eta_1 & \eta_2 & \dots & \eta_p \\
 \beta_1 & 1 & 0 & \dots & 0 \\
 \beta_2 & 0 & 1 & \dots & 0 \\
 \vdots & \vdots & \vdots & \ddots & \vdots \\
 \beta_k & 1 & 0 & \dots & 1
 \end{array}$$

β_i represent the items

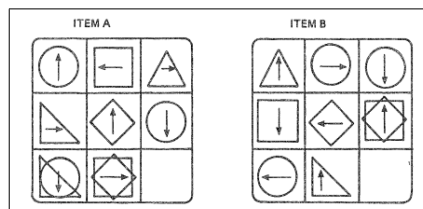
η_1, \dots, η_p represent the components which make up the items

two models are estimated: RM(β) and LLTM(β)
 first the RM evaluated using various test procedures
 if the RM holds, the corresponding LLTM is estimated and tested against the RM



LLTM (1) - Test construction

Item Difficulties calculated from Operation Difficulty Estimates



$$\hat{\beta}_A = SC + IS + SE + 2C = -0.51 + 0.76 - 0.20 + 0.08 \cdot 2 = 0.21$$

$$\hat{\beta}_B = SC + IS + SE + 2C = -0.51 + 0.76 - 0.20 - 0.23 \cdot 2 = -0.41$$

can be used to predict item difficulties for individual testing



LLTM (1) - in eRm

this is an example from the eRm help file for LLTM()

```

> data(lltmdat2)
> W <- matrix(c(1, 2, 1, 3, 2, 2, 2, 1, 1, 1), ncol = 2)
> rownames(W) <- paste("Item", 1:nrow(W), sep = "")
> colnames(W) <- c("CovA", "CovB")
    
```

W is a design matrix, here the entries are numerical

```

> W
      CovA CovB
Item1    1    2
Item2    2    2
Item3    1    1
Item4    3    1
Item5    2    1
    
```

**LLTM (1) - in eRm**

fit a RM and an LLTM

```
> res1 <- RM(lltmdat2)
> res2 <- LLTM(lltmdat2, W = W)
> print(res2)
```

Results of LLTM estimation:

Call: LLTM(X = lltmdat2, W = W)

Conditional log-likelihood: -31.65225

Number of iterations: 7

Number of parameters: 2

Basic Parameters eta:

| | CovA | CovB |
|----------|-------------|-----------|
| Estimate | -0.09775528 | 0.1141153 |
| Std.Err | 0.31296155 | 0.4779270 |

**LLTM (1) - in eRm**

assuming the RM holds, is the reparameterisation permissible?

```
> devdiff <- 2 * (res1$loglik - res2$loglik)
> dfdiff <- res1$npar - res2$npar
> pval <- 1 - pchisq(devdiff, dfdiff)
> cat("Deviance Difference: ", devdiff, "df: ", dfdiff, "p-value: ",
+     pval, "\n")
```

Deviance Difference: 1.048847 df: 2 p-value: 0.5918966