

Population Psychometrics

Geographical, temporal and demographic structure

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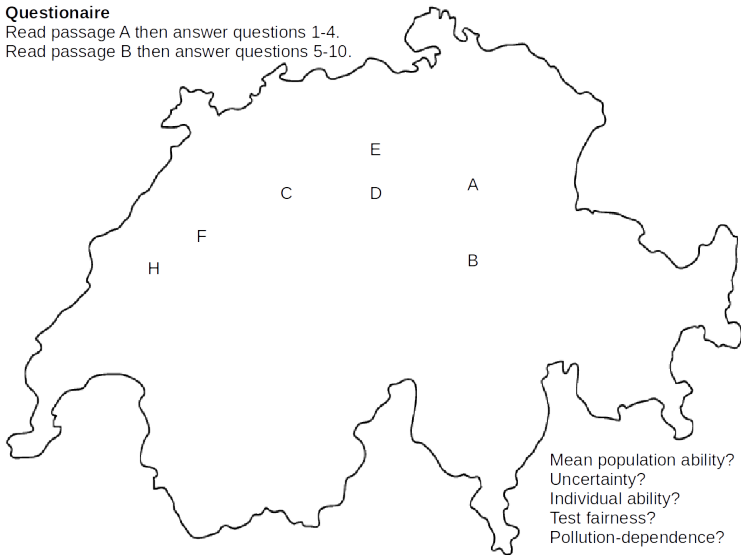
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Population psychometrics

Questionnaire

Read passage A then answer questions 1-4.

Read passage B then answer questions 5-10.



Mean population ability?
Uncertainty?
Individual ability?
Test fairness?
Pollution-dependence?

Population psychometrics

$$Y_{ijs} = I(Y_{ijs}^* > 0)$$

$$Y_{ijs}^* = \beta_{0js} + \beta_{ijs} + \epsilon_{ijs}$$

$$\beta_{0js} = \lambda_{00} + U_{0js}$$

$$\beta_{ijs} = \lambda_{i0}$$

$$U_{0js} = V_s + S_j$$

- ▶ Stein
- ▶ Kriging
- ▶ Simpson
- ▶ Pearl
- ▶ Fisher

Identifiability constraints, ϵ_{ijs} iid logistic (no LD)

$\beta_{ijs} = \lambda_{i0}$ (no random or fixed DIF)

Population psychometrics

$$Y_{ijs} = I(Y_{ijs}^* > 0)$$

$$Y_{ijs}^* = \beta_{0js} + \beta_{ijs} + \epsilon_{ijs}$$

$$\beta_{0js} = \lambda_{00} + U_{0js}$$

$$\beta_{ijs} = \lambda_{i0} + W_{ijs}$$

$$U_{0js} = V_s + S_j$$

- ▶ Stein
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MMSE and regularization
Between-subject variability in DIF.

Population psychometrics

$$Y_{ijs} = I(Y_{ijs}^* > 0)$$

$$Y_{ijs}^* = \beta_{0js} + \beta_{ijs} + \epsilon_{ijs}$$

$$\beta_{0js} = \lambda_{00} + U_{0js}$$

$$\beta_{ijs} = \lambda_{i0} + W_{ijs}$$

$$U_{0js} = V(s_j) + S_j$$

- ▶ Stein
- ▶ Krige
- ▶ Simpson
- ▶ Pearl
- ▶ Fisher

$$V(s) \sim \text{Process}(\mu, C).$$

Item recommendation.

Population psychometrics

$$Y_{ijs} = I(Y_{ijs}^* > 0)$$

$$Y_{ijs}^* = \beta_{0js} + \beta_{ijs} + \epsilon_{ijs}$$

$$\beta_{0js} = \lambda_{00} + \lambda_{01}X_{js} + U_{0js}$$

$$\beta_{ijs} = \lambda_{i0}$$

$$U_{0js} = V_k + S_j$$

- ▶ Stein
- ▶ Krige
- ▶ Simpson
- ▶ Pearl
- ▶ Fisher

"Exogeneity" LD: $U_{0js} \perp\!\!\!\perp X_{js}, X_{js} \neq f(V_k)$.

Graphical identifiability criteria/stratified randomization.

Conclusion: Dependence misspecification

- ▶ Over-fit λ (underestimated s.e. via local dependence within testlet, subject, region), but applies to spatial/temporal dependence too!
- ▶ Biased λ (Simpson)
- ▶ Overfit β (relative to MMSE James-Stein)
- ▶ Forgo β prediction/generalization!

Population psychometrics: Dependence mis-specification

- ▶ Questions