#### Overview

National Chung Cheng University

# Turning Output of Item Response Theory Data Analysis into Graphs with R

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- Motivation
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- Graphical methods for item response theory
- ► Why R?
- Two examples
- ► Conclusions

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#### Motivation

## Why Should IRT Data Be Visually Inspected?

- In IRT data analysis, person-item maps, response-characteristic curves and residual plots should be routinely inspected.
- The graphical capabilities of IRT software packages are, unfortunately, quite poor.

- ► To detect important features in the data
- To compare expected and observed patterns
- ► To check model assumptions

#### Three Graphs in IRT Data Analysis

# Why R?

- ► Person-item maps
  - Compare items and persons on the ability continuum
- ► Item characteristic curves (ICCs)
  - Fit expected item response functions to observations
- Residual plots
  - Screen item or person fits

- ▶ R has excellent graphical capabilities.
- R is a well developed, simple and effective programming language.
- ► R is freely available.

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## Two Examples

#### Dichotomous Responses

- Euclidean Geometry: A Rasch model (Rasch, 1960) for dichotomous responses.
- Extramarital & premarital Sex: A Partial Credit model (Master, 1982) for polytomous responses.

- A sample of 150 individuals answered 9 items from a General Certificate of Education O-level mathematics paper.
- The Rasch model accounts for a student's response to an item by the difference between the student's ability and the difficulty level of the item.

#### Person-Item Map

- Item difficulty estimates and predicted person abilities are displayed on a single continuum (latent trait).
- ▶ BILOG-MG was used to extract model parameter estimates.

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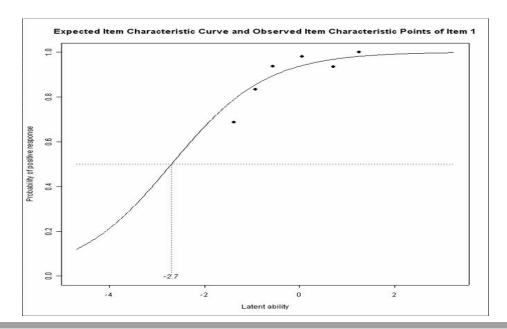
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Item Characteristic Curves

 Fit the expected (cumulative) item characteristic functions to observed responses.

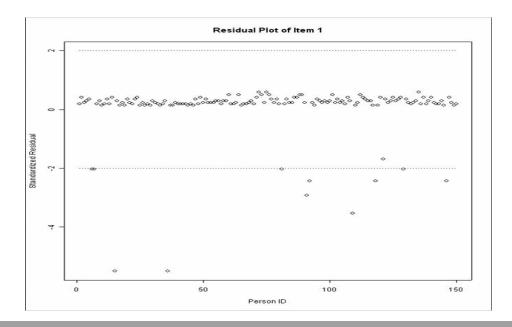


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### Residual Plots

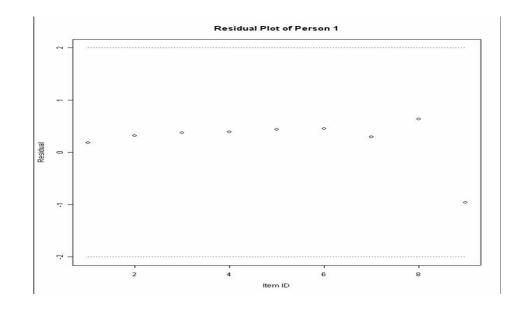
 To verify whether or not an item (or a person) fit the model's expectation.



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#### Polytomous Responses

- As part of the 1989 General Social Survey, subjects were asked to indicate their opinion on
  - 1. early teens (age 14-16) having sexual relations before marriage
  - 2. a man and a woman having sexual relations before marriage
  - 3. a married person having sexual relations with someone other than the marriage partner

using a 4-point scale.

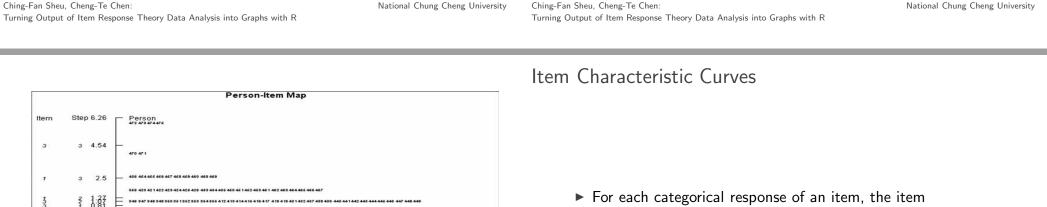
## The Partial Credit Model

Person-Item Map

- ▶ The model extends the Rasch model to account for polytomous responses.
- ▶ The probability of a response to an item belonging to a particular category depends on the person's ability and the thresholds of that item.
- ► Three thresholds (cut-points) are needed to transit from the first category to the last on a 4-point scale.
- ▶ WINSTEPS is used to extract parameter estimates of the model.

46 148 147 148 149 160 161 162 163 164 166 168 167 168 169 180 18 1 182 183 184 186 188 187 188 189 170 17 1367 368 36

Item step numbers are added next to the item difficulty estimates.



▶ For each categorical response of an item, the item characteristic curves are displayed along with observed item response.

30

2

2

2

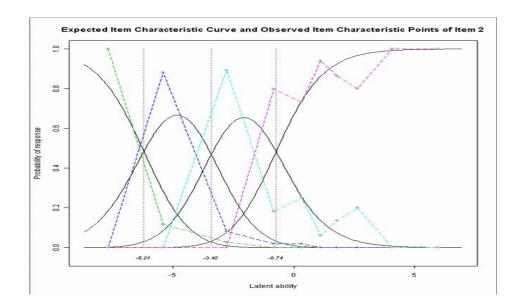
1 0.18

3 -0.74

2 -3.42

1 -6.21

-8 88

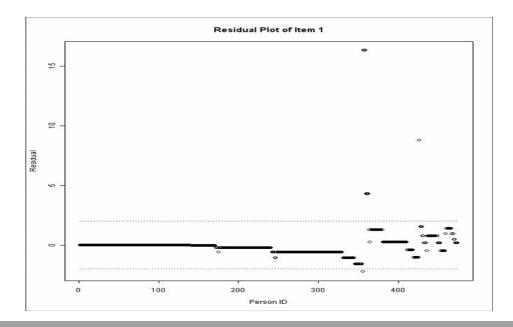


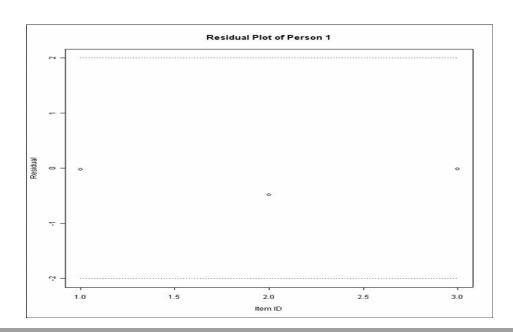
## Residual Plots

 To verify whether or not an item (or a person) fits the model's expectation.

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### Conclusions

## Thank you!

- We implement in R three graphs: person-item maps, item characteristic curves, and residual plots using numerical output of common IRT packages.
- The R scripts can readily be adapted for analysis with other IRT models.
- ► A more complete IRT analysis can be accomplished with the help of other R packages, such as *nlme*.

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