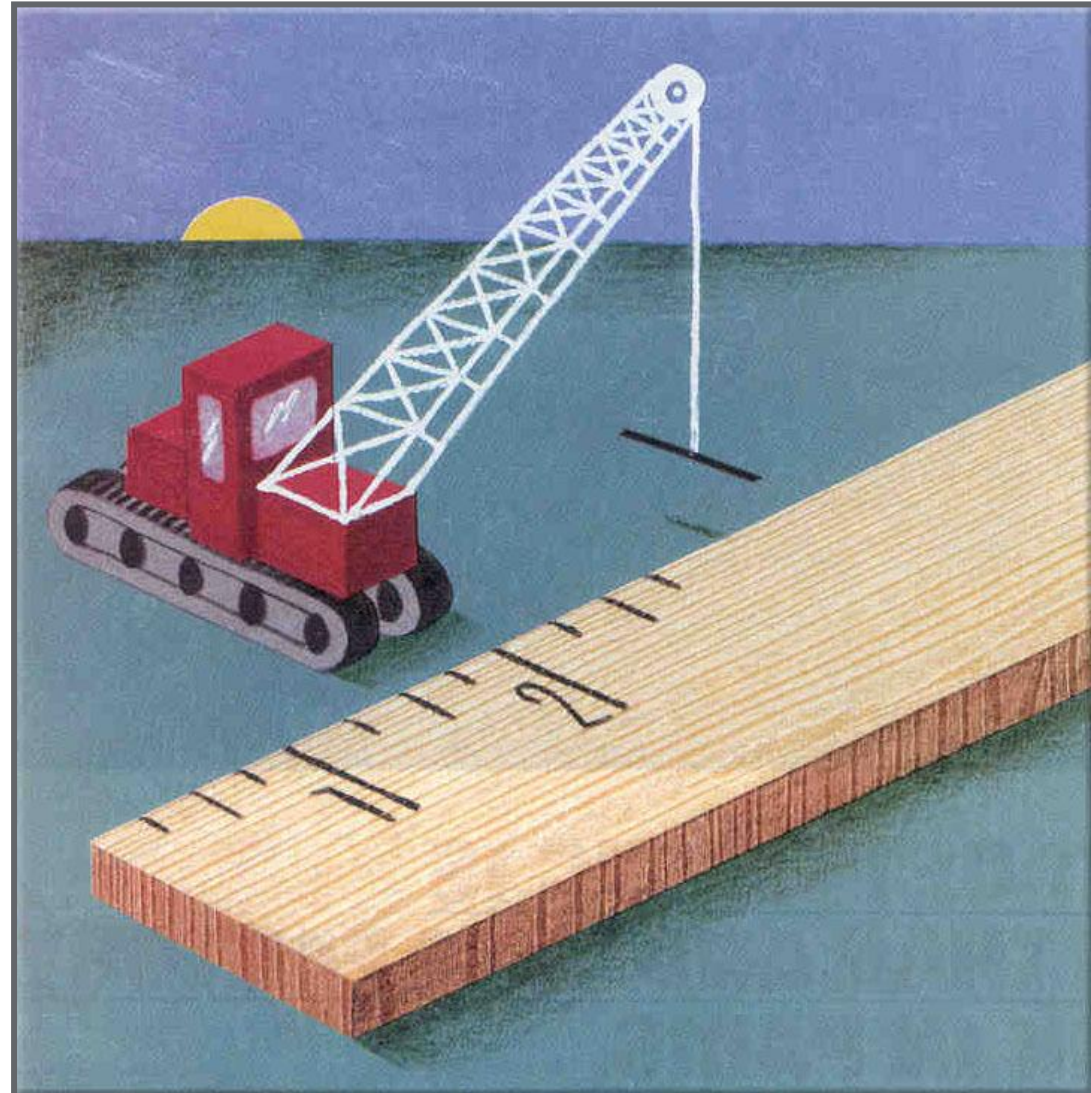




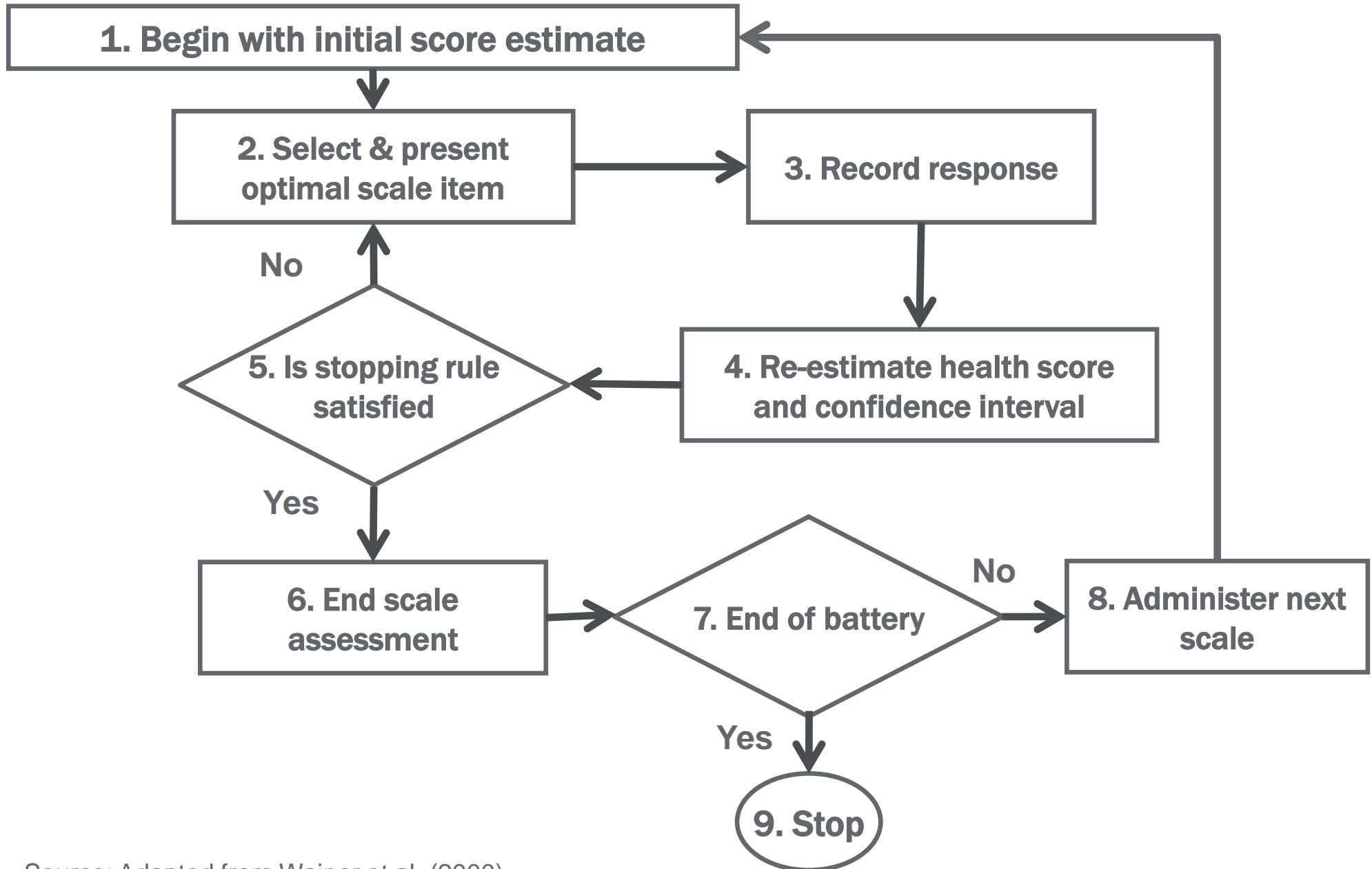
Tailored Instruments: Item Banking and Computerized Adaptive Assessment



Jakob Bue Bjorner, Optum PatientInsights / University of Copenhagen

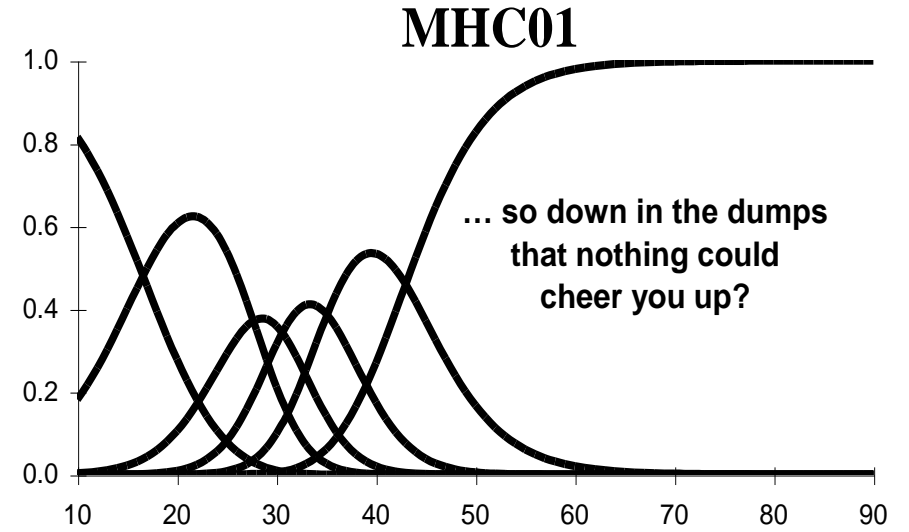
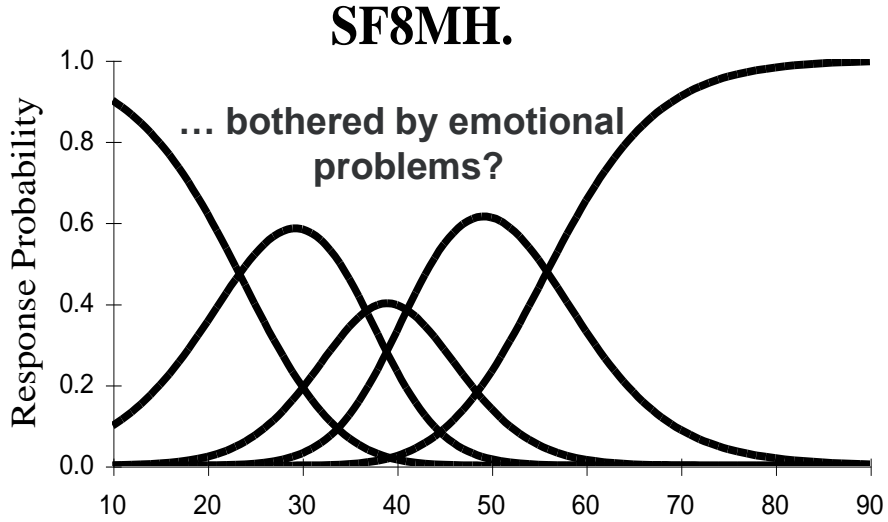
2nd Symposium on IRT in Health Measurement, University of Twente 17/9/2013

Logic of Computerized Adaptive Testing

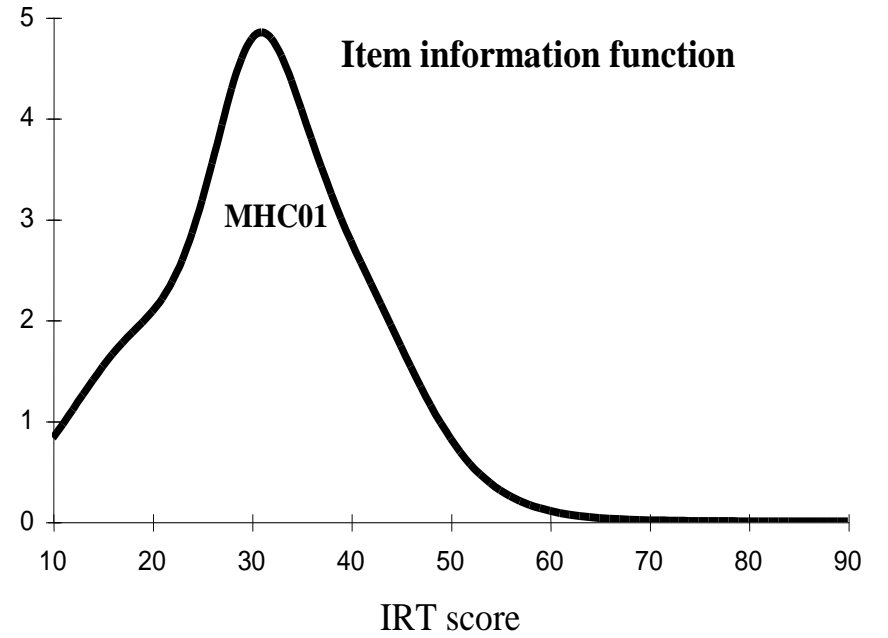
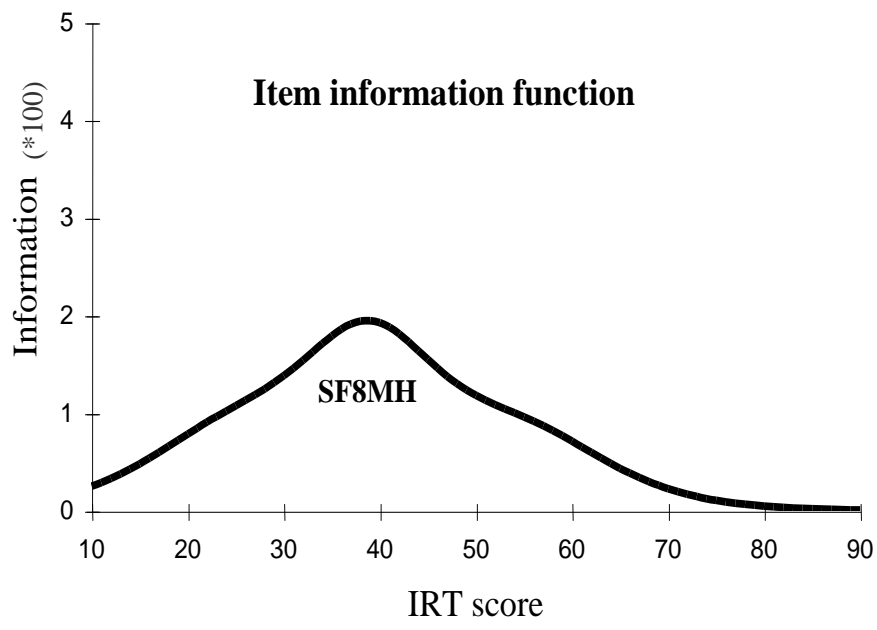


Source: Adapted from Wainer et al. (2000)

Item Information

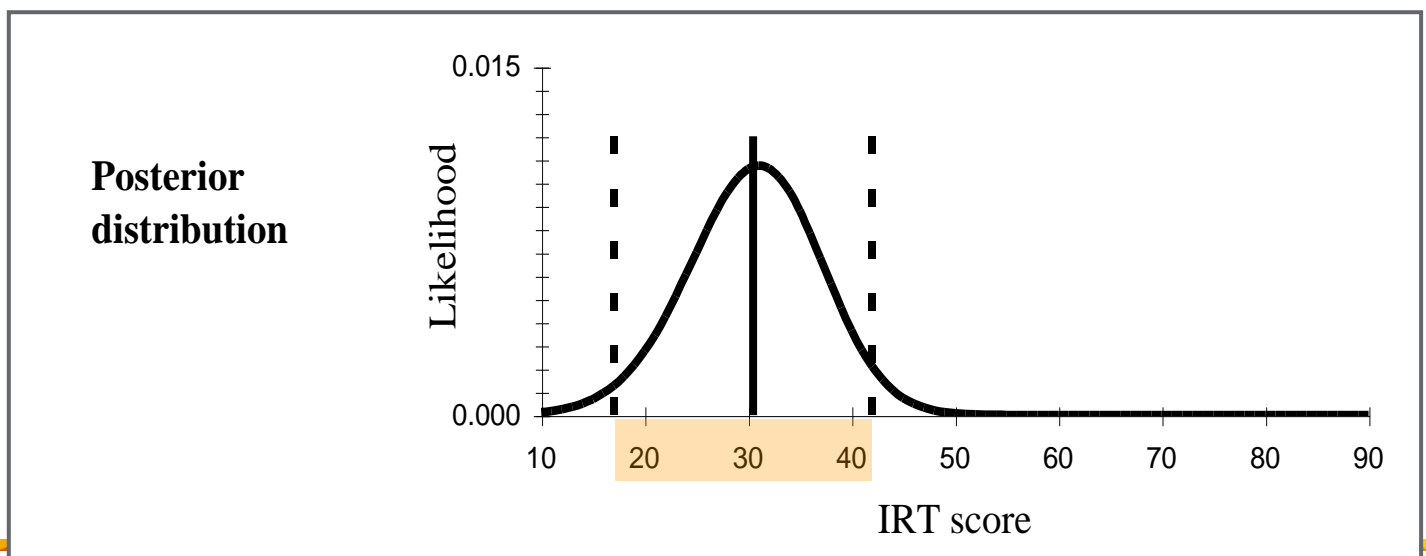
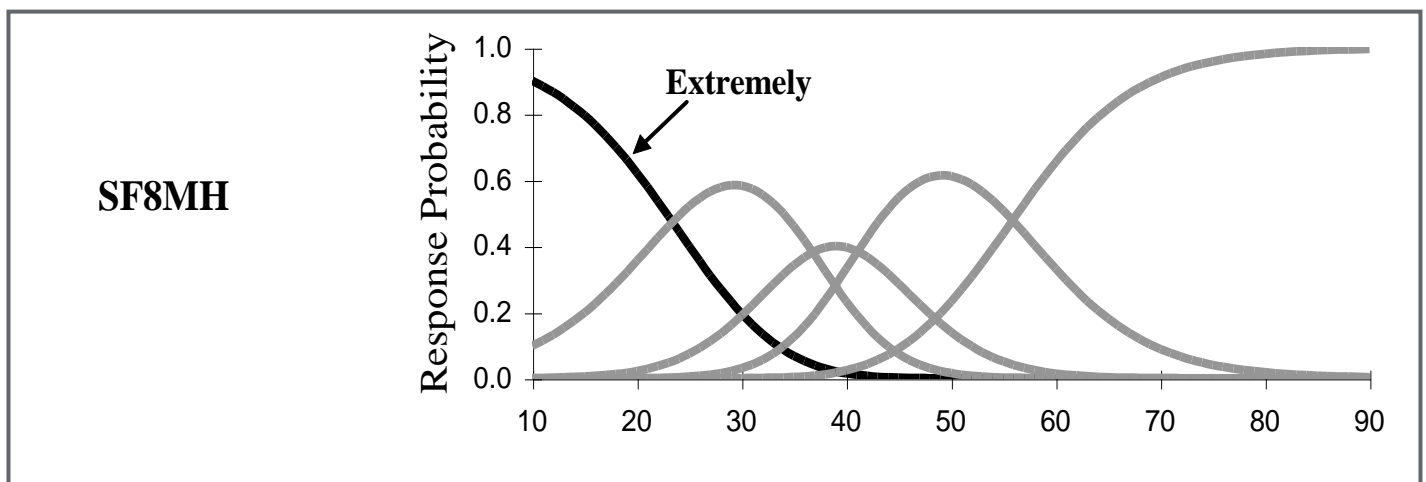
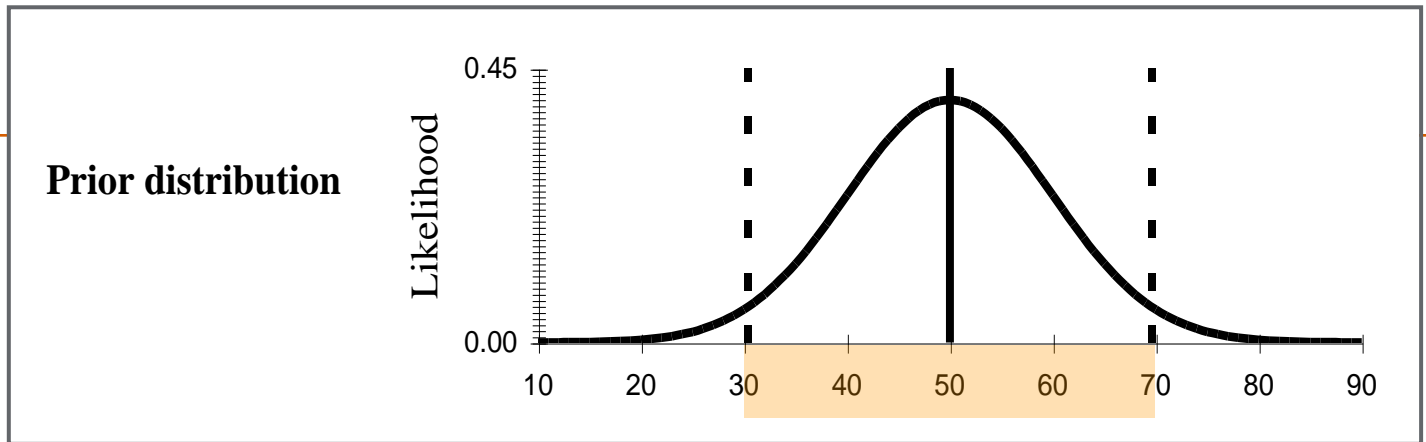


$$I_i(\theta) = a_i^2 \left[\sum_{k=0}^{m_i} k^2 P_{ik}(\theta) - \left(\sum_{k=0}^{m_i} k P_{ik}(\theta) \right)^2 \right] = a_i^2 \text{var}(X_i)$$



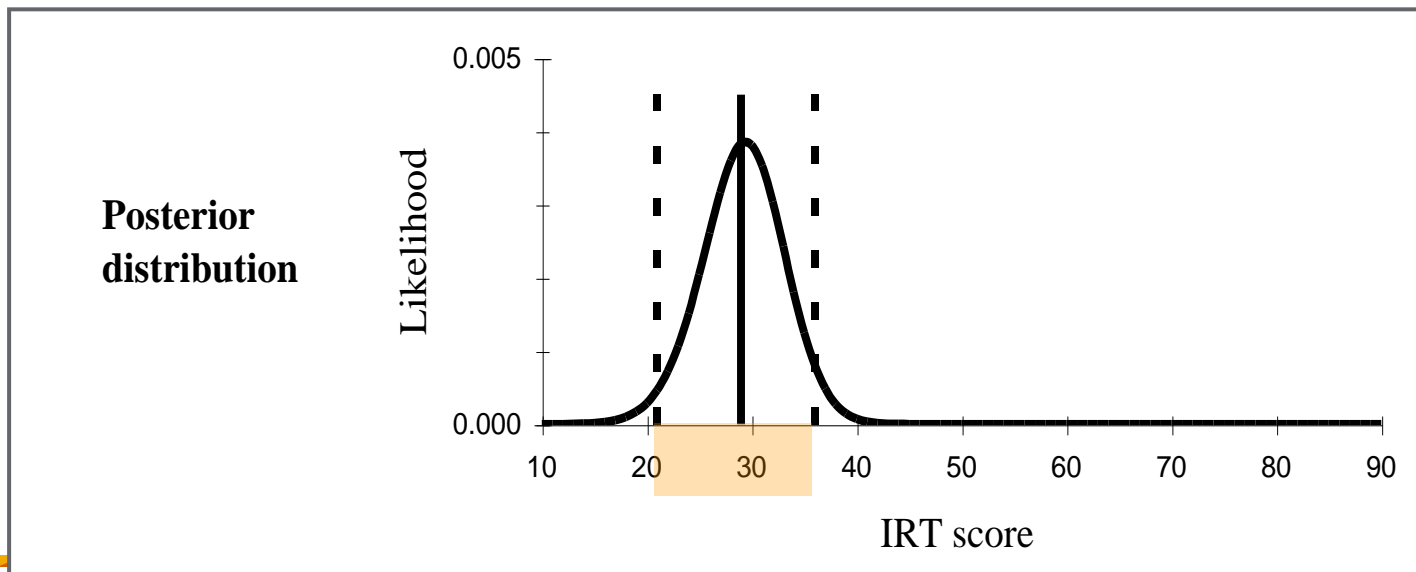
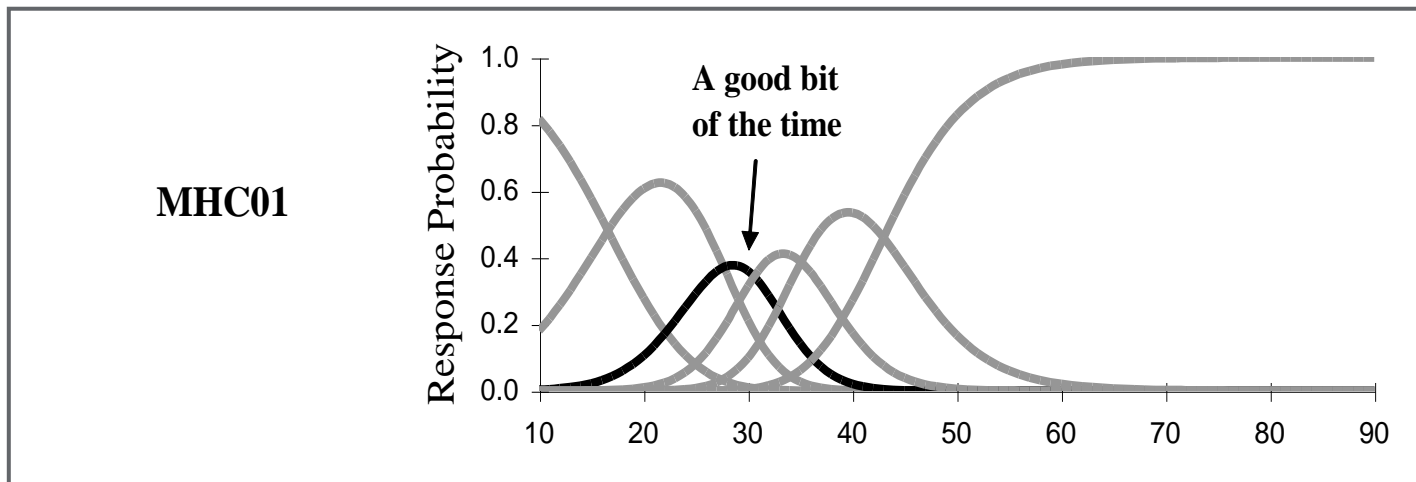
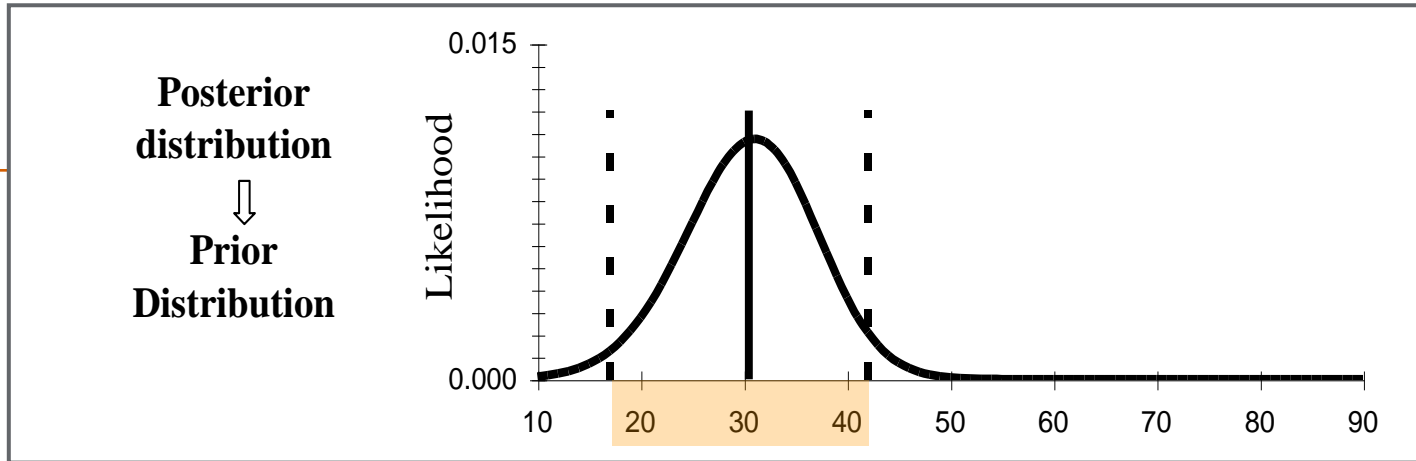
IRT Scoring in a CAT

(EAP Approach)



IRT Scoring in a CAT

(EAP Approach)



Steps to Build an IRT based CAT

- 1. Definition of the Construct**
- 2. Data collection**
- 3. Evaluation of Dimensionality**
- 4. Evaluation of Item Properties**
- 5. Test for Differential Item functioning**
- 6. Evaluation of Measurement Precision**
- 7. Choosing methods of administration**
- 8. Deciding on CAT algorithms**



US-National Institutes of Health (NIH)



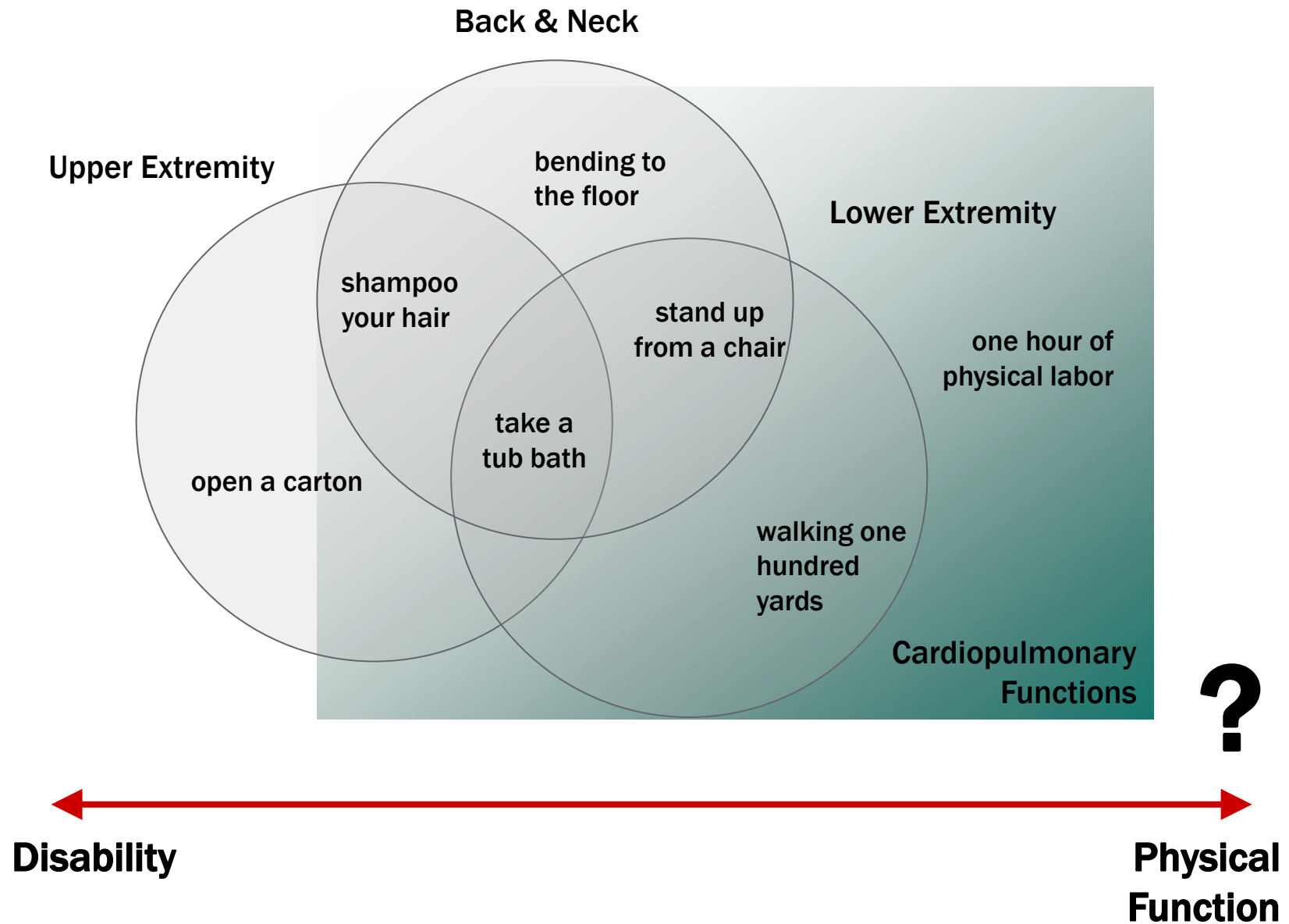
Generic Health Related Quality of Life - like SF-36

**Key-Road-Initiative
“Re-engineering the
Clinical Research Enterprises”
2004-2009+**

n=21.133 participants

<http://www.nihpromis.org/>

Physical Function



Sampling strategies – “total sample”

	Item 1	Item 2	Item 3	...					Item 112
Person 1									
Person 2									
Person 3									
...									
...									
Person 500									

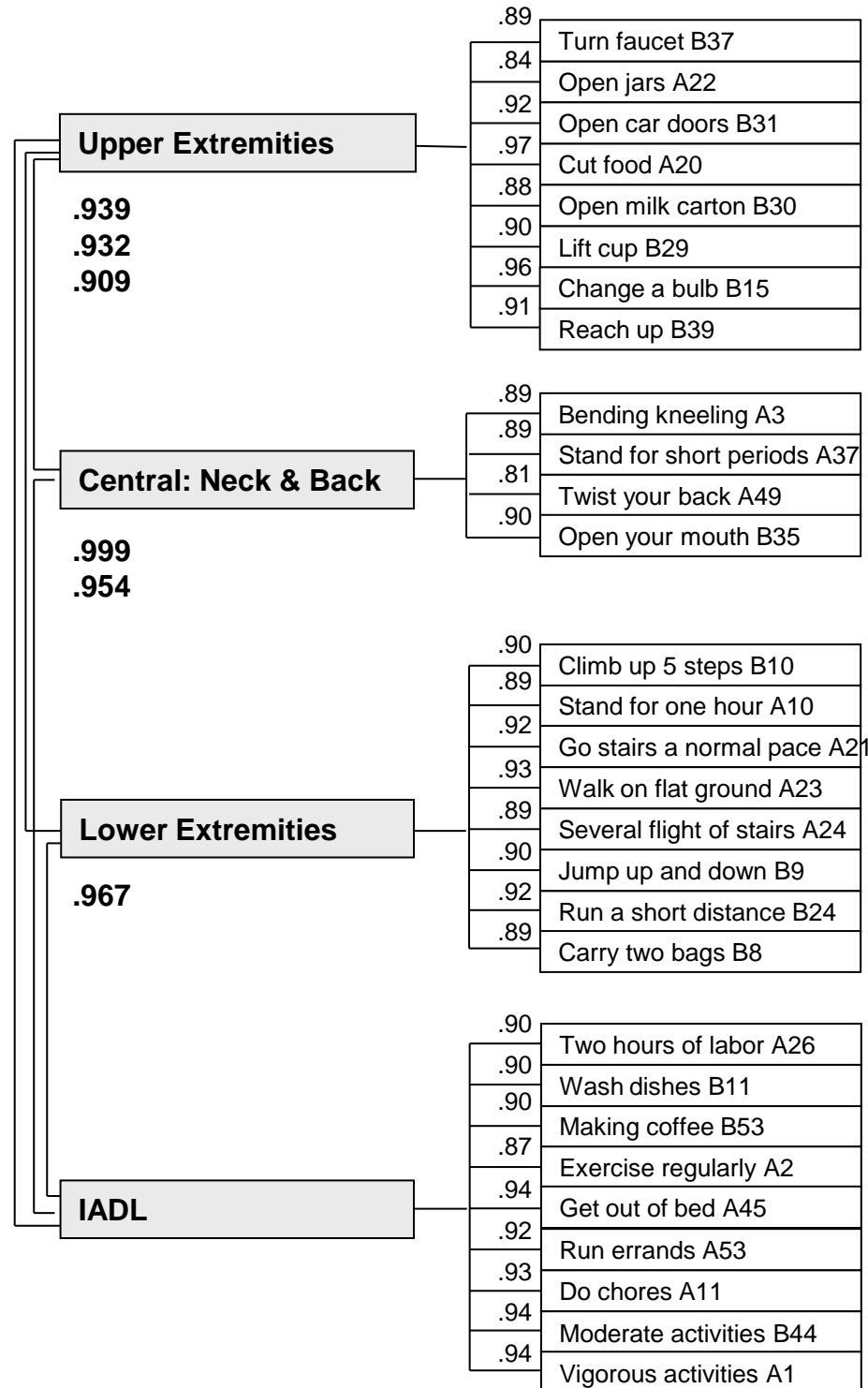
PF Categories

CFA

n=502 General Population

RMSEA 0.083

CFI .959



**examples
out of 112 items**

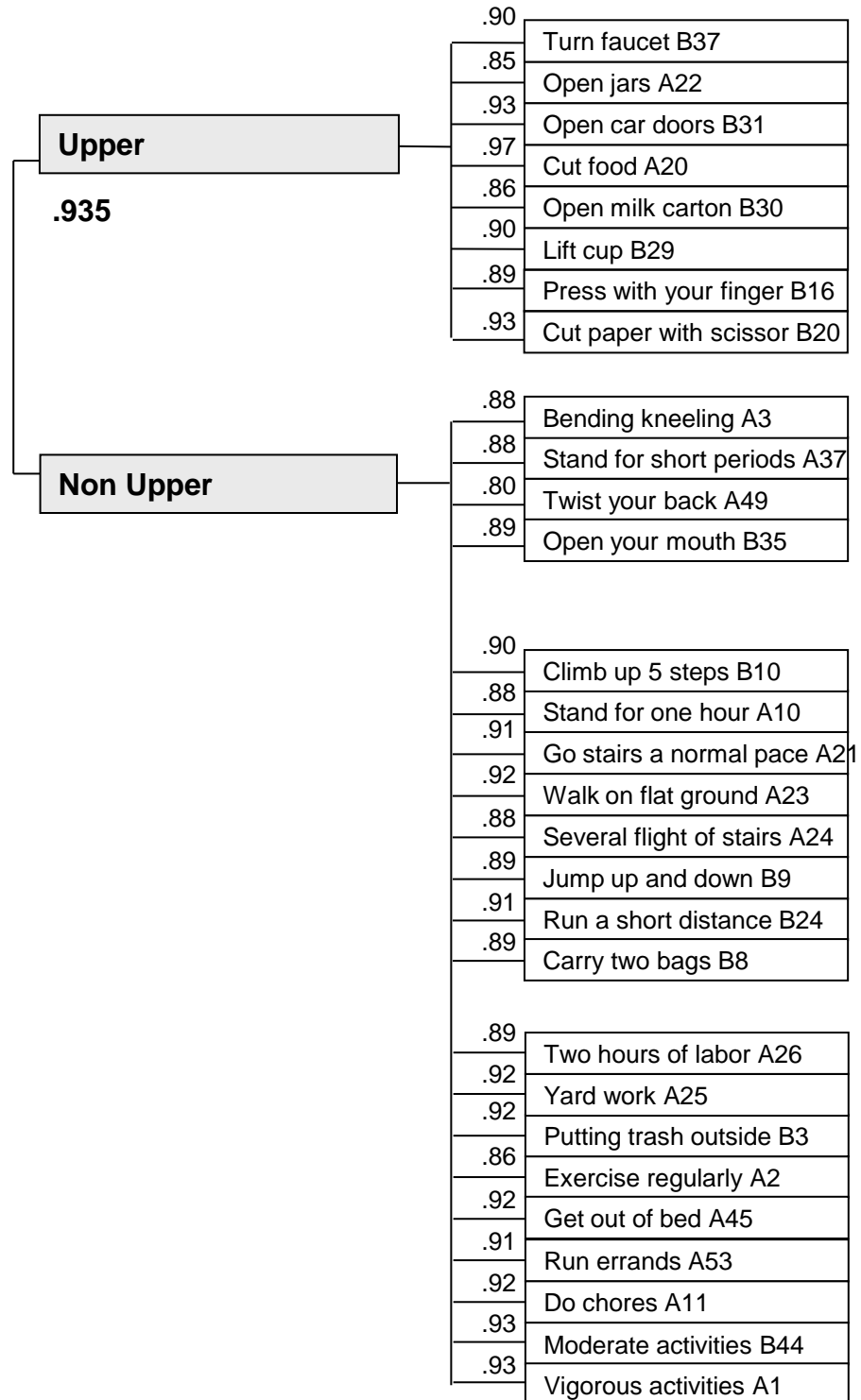
PF Categories

CFA

n=502 General Population

RMSEA 0.088

CFI .954



**examples
out of 112 items**

PF Categories

CFA

n=502 General Population

RMSEA 0.094

CFI .952

Physical Function

.88	Turn faucet B37
.82	Open jars A22
.91	Open car doors B31
.95	Cut food A20
.87	Open milk carton B30
.89	Lift cup B29
.94	Change a bulb B15
.88	Reach up B39
.87	Bending kneeling A3
.89	Stand for short periods A37
.79	Twist your back A49
.87	Open your mouth B35
.90	Climb up 5 steps B10
.88	Stand for one hour A10
.91	Go stairs a normal pace A21
.92	Walk on flat ground A23
.88	Several flight of stairs A24
.89	Jump up and down B9
.91	Run a short distance B24
.88	Carry two bags B8
.89	Two hours of labor A26
.88	Wash dishes B11
.87	Making coffee B53
.86	Exercise regularly A2
.91	Get out of bed A45
.91	Run errands A53
.92	Do chores A11
.93	Moderate activities B44
.93	Vigorous activities A1

examples
out of 112 items

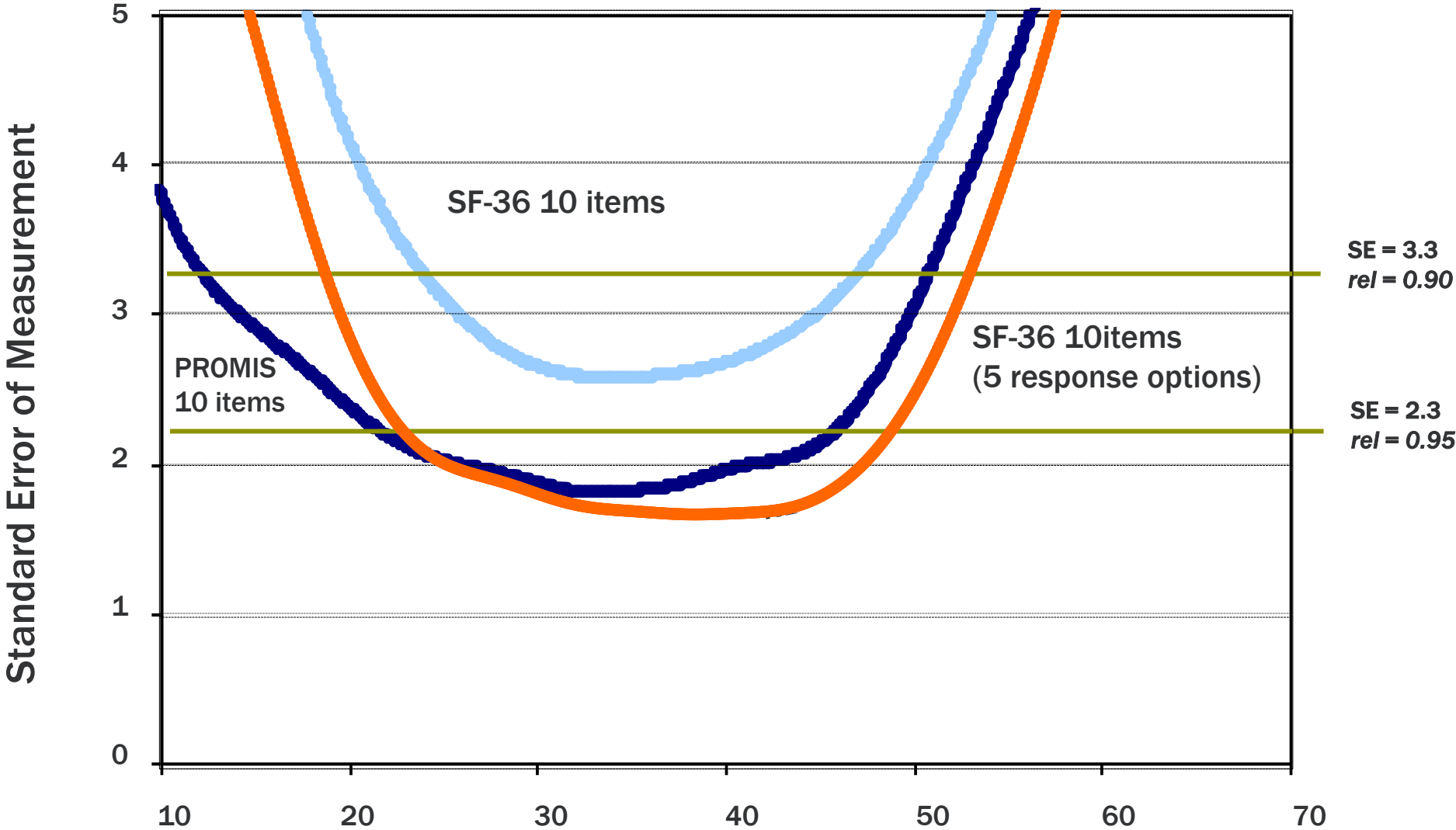
Evaluation of Item Properties

- Is the item a good measure of the domain in question?
 - Does the item fit the IRT model?
 - Does the item provide sufficient information (is the IRT discrimination parameter high)?
 - Is the item unique (i.e. not too similar to other items – no local dependence between pairs of items)?
- Are the item properties robust across population subgroups?
 - Lack of Differential Item Function (DIF)

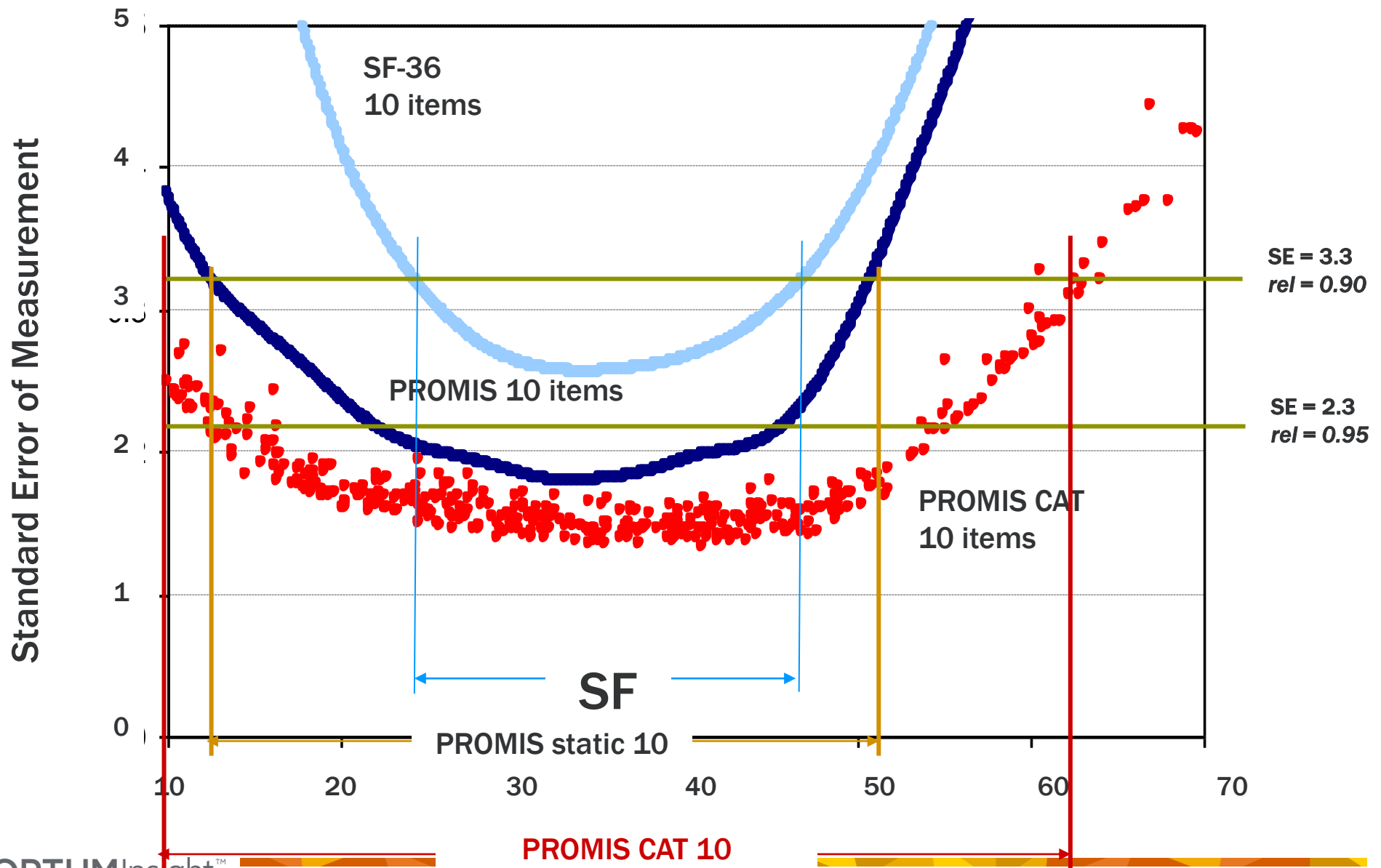
Description of Item Properties

Item Label and Stem	a priori dom.	skewness	corr. to global item	CFA	DIF	slope	step1	step2	step3	step4	Fit G2	I _{max} at 0	CAT util. %
C46 Are you able to transfer from a bed to a chair and back?	Lower	-3.63	0.75	0.89		3.61	15.2	20.7	26.7	34.4		1.31 14.6	0.4 24.0
B26 Are you able to shampoo your hair?	Up	-6.00	0.74	0.88		3.52	18.7	21.5	27.2	32.7		2.82 17.8	0.2 15.7
A56 Are you able to get in and out of a car?	Cent.	-2.19	0.75	0.88		3.24	13.6	22.5	30.0	38.9	0.01 0.77 0.03	2.33 20.4	0.0 5.6
A16 Are you able to dress yourself. including tying shoelaces and doing buttons?	Upper	-3.36	0.71	0.92	0.04 sex	3.31	18.1	24.4	30.7	37.5		2.7 20.7	0.0 0.0
A11 Are you able to do chores such as vacuuming or yard work?	IADL	-1.67	0.81	0.93		4.72	30.1	34.7	39.1	45.8		5.58 32.9	45.7 75.0
B22 Are you able to hold a plate full of food?	Upper	-4.86	0.76	0.91	0.03 edu	3.31	15.7	22.6	27.4	34.3		2.41 22.0	0.0 0.0
C12 Does your health now limit you in doing two hours of physical labor?	IADL	-0.71	0.77	0.91		4.49	35.8	40.9	46.3	50.9		5.2 46.1	59.8 31.7
A01 Does your health now limit you in doing vigorous activities. such as running, lifting heavy objects, participating in strenuous sports?	IADL	0.11	0.76	0.94	0.03 age 0.04 dis	2.99	38.2	45.0	51.7	56.5	0.02 0.00 0.01	2.68 52.2	39.3 0.6

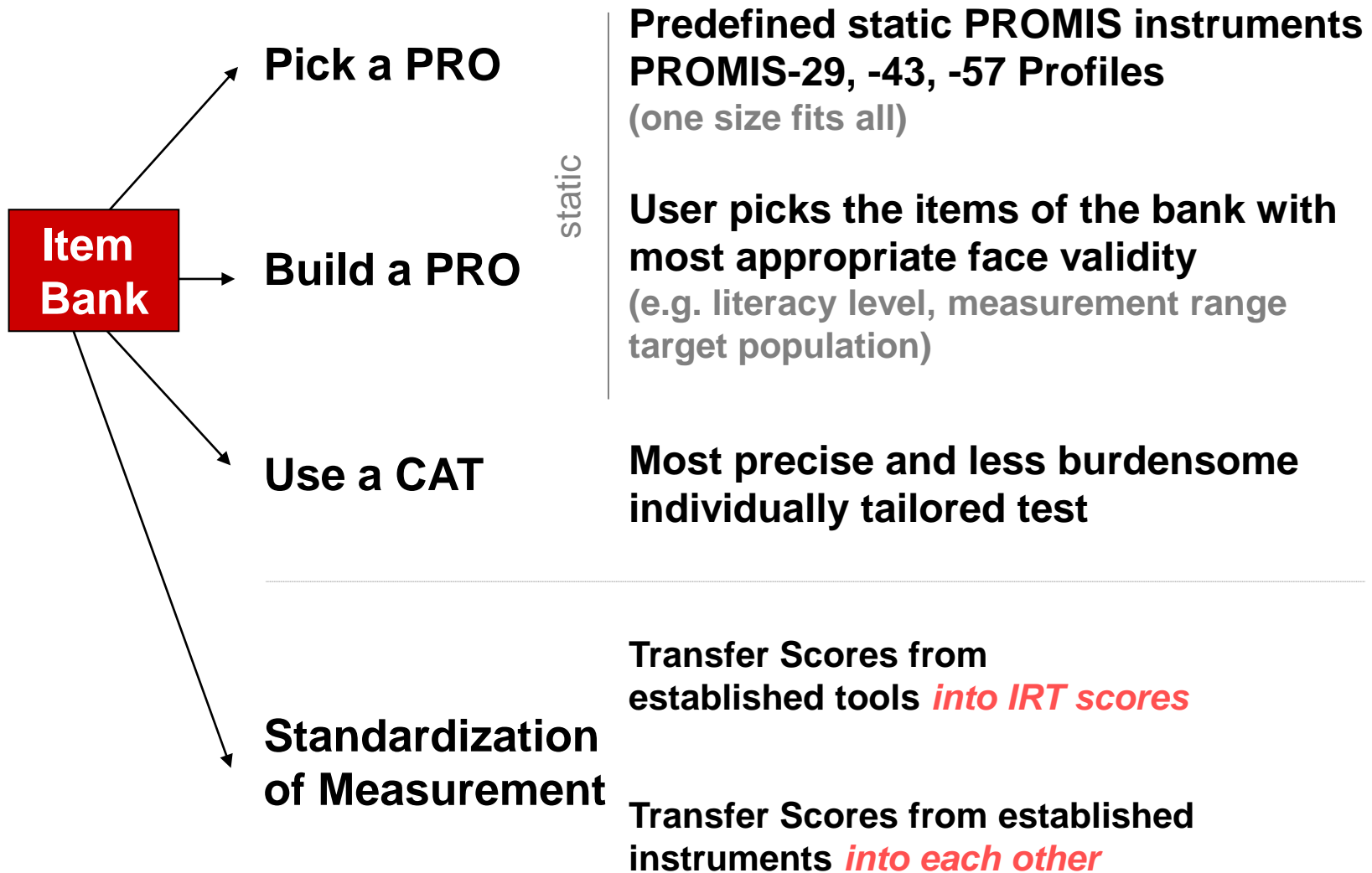
PROMIS PF-Static Form 10



Measurement Precision and Range



PROMIS Tools



Summary

- CAT instruments can provide more precise measurement without increased respondent burden
- Item banks have been created by several research groups, including PROMIS, QualityMetric/Optum PatientInsights, the EORTC Quality of Life Study Group, the Charite Hospital
- CAT is also available through several groups
- Evaluations show feasibility of CAT in research and clinical practice
- Item banks enable a flexible measurement strategy using either:
 - Standard fixed forms
 - Adapted fixed forms
 - CAT

Remaining opportunities and challenges

- Developing systems for updating item parameters – using data from patients
- Improved statistical methods for analyzing data from item banks
- Optimize CAT algorithms for longitudinal studies



Thank you