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# Estimating Benchmarks for Precursor Reading Skills Using Reading Comprehension

February 25-26, 2025

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# Background

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- The Technical Advisory Group (TAG) recommended using only **reading comprehension (RC)** to report on indicator 4.1.1a and proposed setting the RC benchmark at 60% or 80% of the total RC score.
- TAG suggested that low-and middle-income (LMI) countries report on the percentages of students mastering the precursor skills to provide insights into early literacy development.
- These data will help LMI countries understand where students are on the path to achieving the RC benchmark.
- The purpose of this study was to explore a method for estimating precursor skill benchmarks that align with reading development theory and are psychometrically defensible.

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# Methods

## Data

### USAID: Early Grade Reading Assessment (EGRA) – Grade 2

	Country 4 Lang: Arabic	Country 6 Lang: Arabic	Country 13 Lang: Chitonga	Ghana Lang: English
Sample size	6867	2738	1024	3767
Subtasks	Listening comprehension (5) Letter sound (100) Syllable sound (100) Invented word (50) Oral reading fluency (42) Reading comprehension (5)	Listening comprehension (4) Syllable segmentation (10) Letter sound (100) Invented word (50) Oral reading fluency (76) Reading comprehension (7)	Listening comprehension (5) Letter sound (100) Syllable sound (100) Invented word (50) Oral reading fluency (56) Reading comprehension (5)	Listening comprehension (5) Letter sound (100) Invented word (50) Oral reading fluency (60) Reading comprehension (5)

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# Reading Construct and Psychometric Properties

# Reading Construct and Psychometric Properties

## Factor Analysis

	USAID Country 4 Arabic Grade 2	USAID Country 6 Arabic Grade 2	USAID Country 13 Chitonga Grade 2	USAID Ghana English Grade 2
<b>Eigen Value</b>	<b>4.41</b>	<b>3.38</b>	<b>3.96</b>	<b>3.22</b>
Listening Comprehension	0.48	0.45	0.32	0.63
Letter Sound	0.64		0.73	0.76
Syllable Sound	0.88		0.92	
Invented Word	0.87	0.85	0.94	0.84
Oral Reading Fluency	0.92	0.91	0.93	0.91
Reading Comprehension	0.85	0.83	0.85	0.84
Silent Reading Comprehension	0.81			

# Reading Construct and Psychometric Properties

## Item-Total Correlation

	USAID Country 4 Arabic Grade 2	USAID Country 6 Arabic Grade 2	USAID Country 13 Chitonga Grade 2	USAID Ghana English Grade 2
Oral Reading Fluency (timed task)	0.84	0.91	0.89	0.92
Reading Comprehension Item 1	0.41	0.47	0.48	0.55
Reading Comprehension Item 2	0.32	0.42	0.61	0.60
Reading Comprehension Item 3	0.12	0.19	0.46	0.43
Reading Comprehension Item 4	0.20	0.33	-0.03	0.39
Reading Comprehension Item 5	0.21	-0.03	-0.27	0.25
Reading Comprehension Item 6		0.27		
Reading Comprehension Item 7		0.20		



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# Item Response Theory (IRT) Based Test Characteristic Curve (TCC) Mapping

## Item Response Theory (IRT) Based Test Characteristic Curve (TCC) Mapping

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- **Step 1:** Develop a one-parameter item response theory (IRT)-based reading scale that integrates all subtasks assessing foundational reading skills, including phonological awareness, alphabetic principle, language comprehension, decoding, and reading comprehension.
- **Step 2:** Generate test characteristic curves (TCCs) for reading comprehension and other subtasks.
- **Step 3:** Estimate the test information function (TIF) and standard error (SE) curve for each subtask separately.
- **Step 4:** Set the reading comprehension benchmark at an 60% or 80% score point, equivalent to correctly answering 3 or 4 out of 5 reading comprehension items assessing the retrieval of explicit information.

## Item Response Theory (IRT) Based Test Characteristic Curve (TCC) Mapping

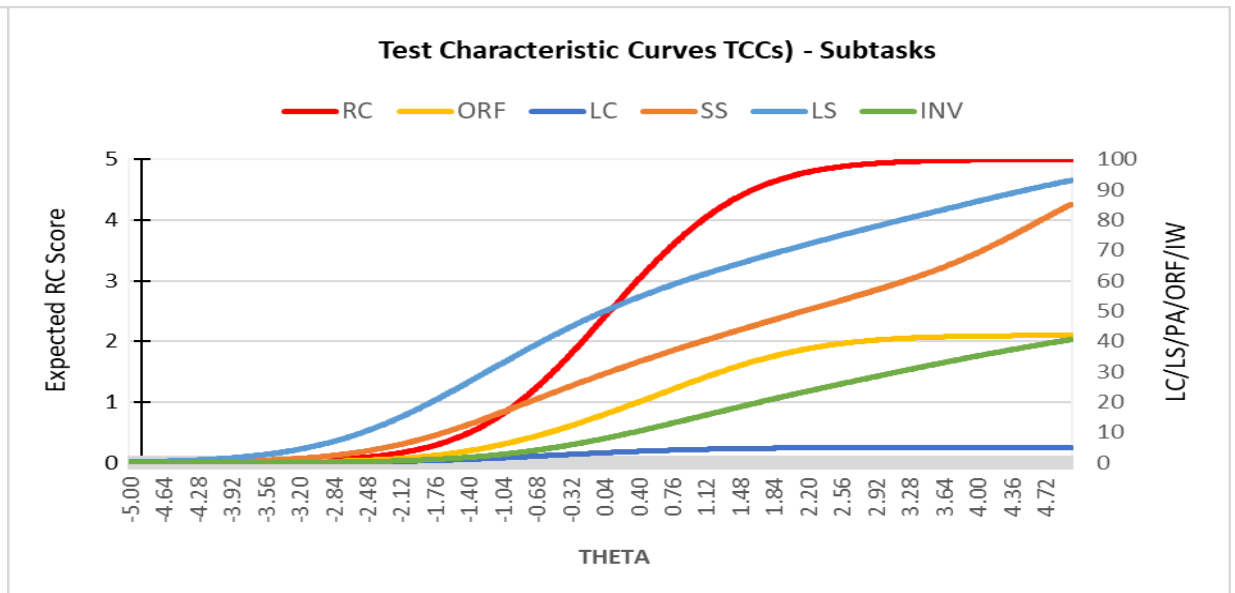
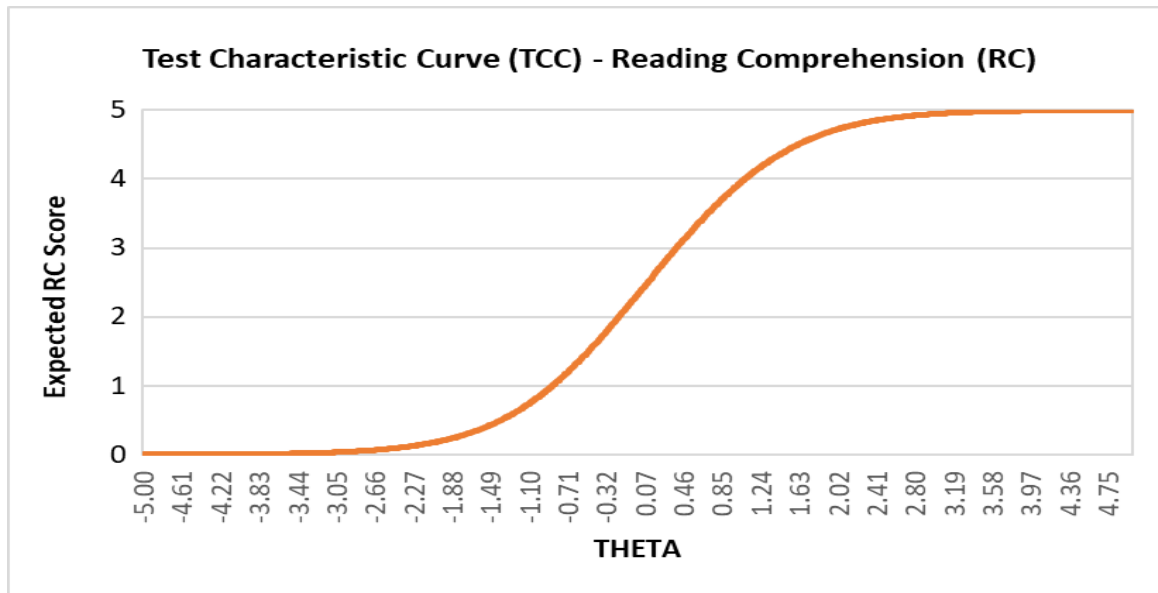
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- **Step 5:** Convert the benchmarks of answering 3 and 4 out of 5 reading comprehension items into IRT-based theta reading scores ( $\Theta_{RC}$ ) and calculate standard errors of the corresponding theta value for each subtask.
- **Step 6:** Estimate benchmarks in expected score scale for other subtasks using the combined TCC mapping.

DRAFT

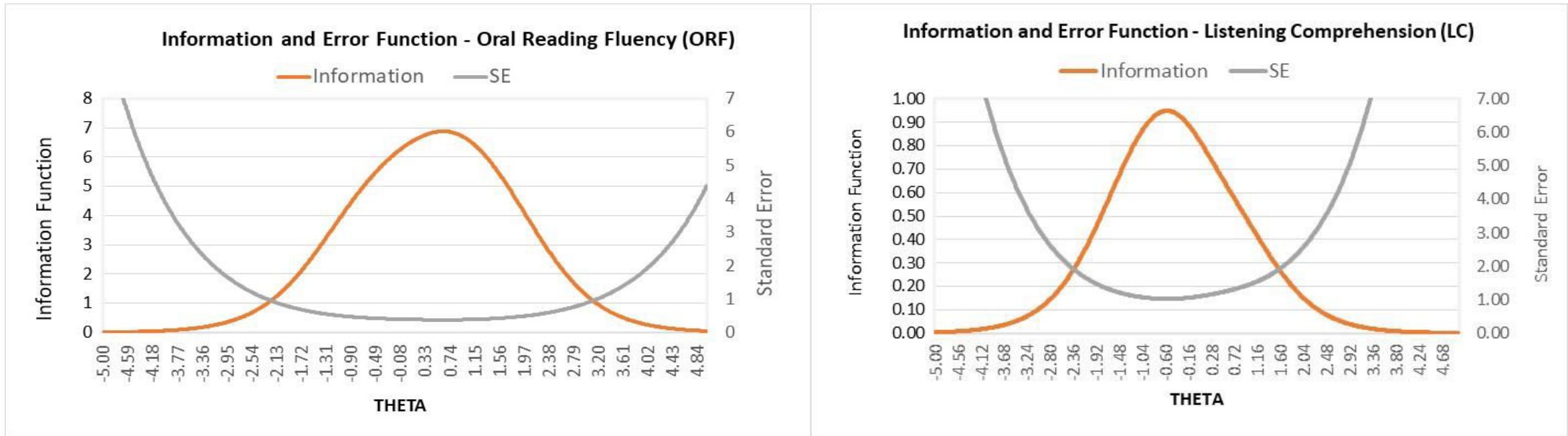
# Item Response Theory (IRT) Based Test Characteristic Curve (TCC) Mapping

Steps 1-2: Develop a one-parameter IRT-based reading scale through concurrent calibration and generate test characteristics curves (TCCs)



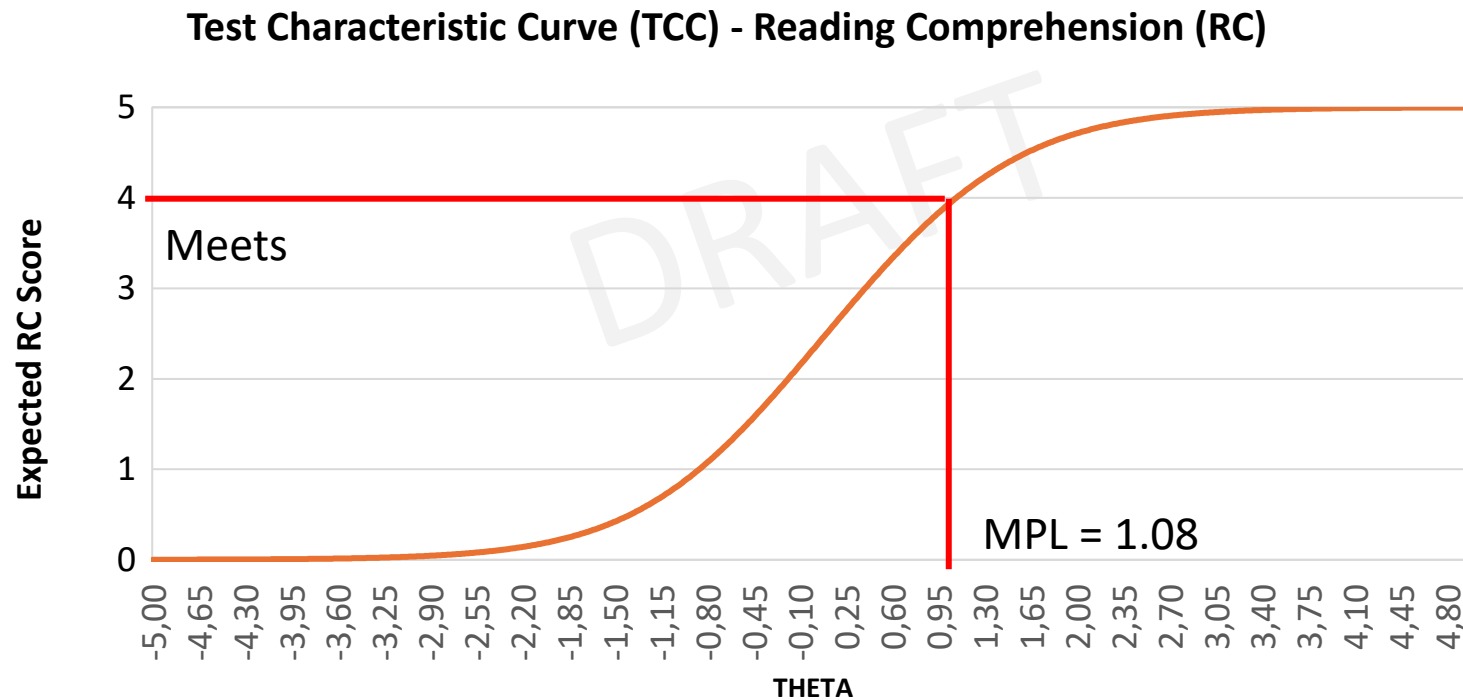
# Item Response Theory (IRT) Based Test Characteristic Curve (TCC) Mapping

Step 3: Estimate test information function (TIF) and standard error (SE) curves for each subtask separately



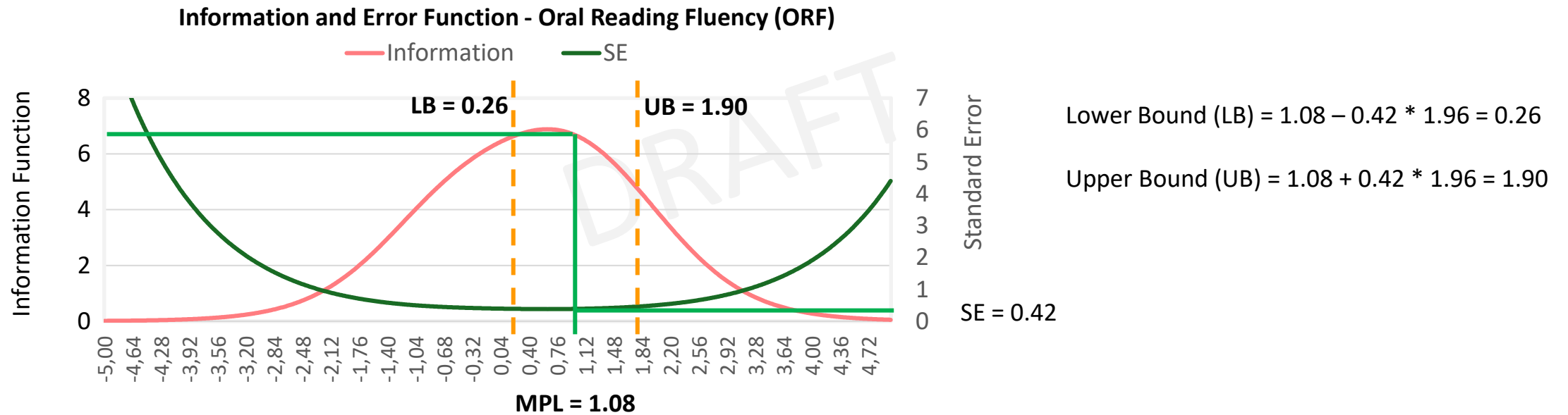
# Item Response Theory (IRT) Based Test Characteristic Curve (TCC) Mapping

Steps 4-5: Convert the benchmarks of answering 4 out of 5 reading comprehension items into IRT-based theta reading scores



# Item Response Theory (IRT) Based Test Characteristic Curve (TCC) Mapping

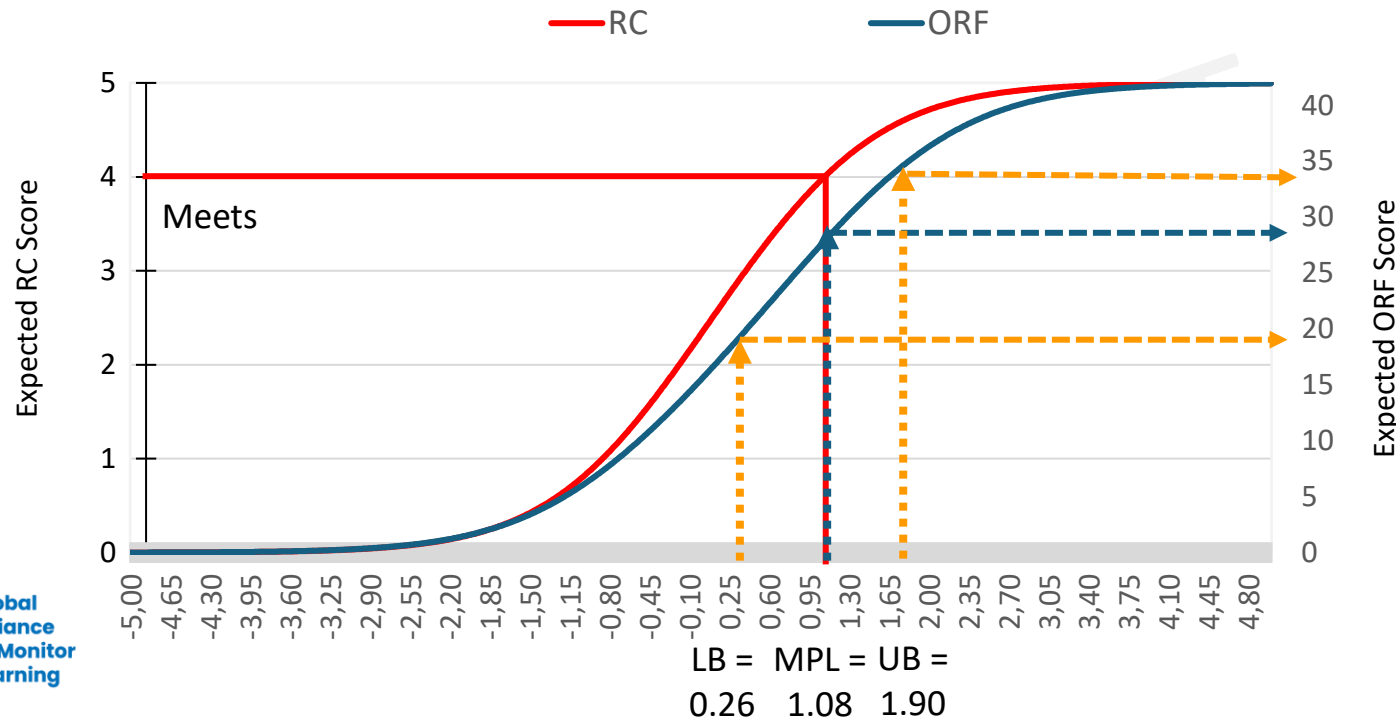
Steps 4-5: Convert the benchmarks of answering 4 out of 5 reading comprehension items into IRT-based theta reading scores



# Item Response Theory (IRT) Based Test Characteristic Curve (TCC) Mapping

Step 6: Estimate benchmarks on raw score scale for other subtasks through TCC mapping.

Test Characteristic Curves (TCCs) – RC and ORF



## ORF Benchmark

MPL (ORF) = 27 CWPM

Lower Bound (ORF) = 19 CWPM

Upper Bound (ORF) = 34 CWPM



## Item Response Theory (IRT) Based Test Characteristic Curve (TCC) Mapping

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Step 6: Estimate benchmarks on raw score scale for other subtasks through TCC mapping.

Meets : RC

4 RC → MPL = 1.08 → 27 Correct Words Per Minute (ORF)  
→ 19 Correct Words Per Minute (LB-ORF)  
→ 34 Correct Words Per Minute (UB-ORF)

# Item Response Theory (IRT) Based Test Characteristic Curve (TCC) Mapping

## Results

Assessment (Grade 2)	Subtask	Item	LCI	MPL	UCI	CI
<b>80% Reading Comprehension</b>						
USAID Country 4 Arabic	Oral Reading Fluency	42	19	27	34	15
USAID Country 6 Arabic	Oral Reading Fluency	76	38	46	46	8
USAID Country 13 Chitonga	Oral Reading Fluency	56	19	26	29	10
USAID Ghana English	Oral Reading Fluency	60	45	54	54	10
<b>60% Reading Comprehension</b>						
USAID Country 4 Arabic	Oral Reading Fluency	42	12	20	28	16
USAID Country 6 Arabic	Oral Reading Fluency	76	29	36	44	15
USAID Country 13 Chitonga	Oral Reading Fluency	56	9	16	23	14
USAID Ghana English	Oral Reading Fluency	60	39	49	54	15

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# Generalized Linear Mixed Model (GLMM)

## Generalized Linear Mixed Model (GLMM)

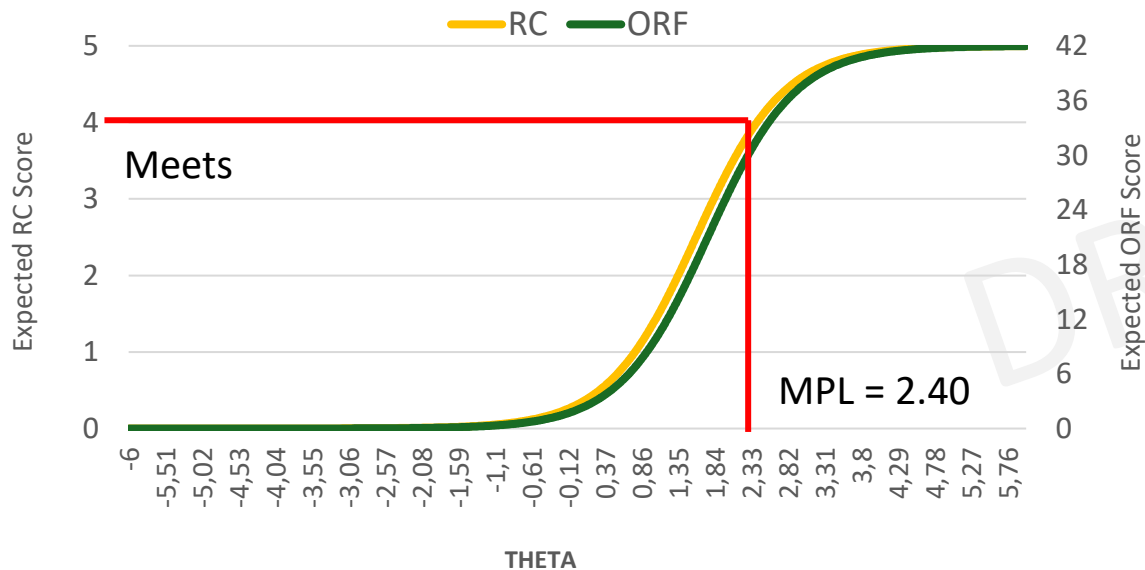
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- GLMM approach used subtask score (number of words read correctly) as opposed to item level (correct/incorrect) data to estimate benchmarks.
- Expected accuracy score for each subtask is calculated by  $E[U_{ij}] = n_i \cdot P(U_{ij})$
- $U_{ij}$  is a proportion of correct responses on subtask  $i$  for person  $j$ .  
and  $n_i$  is the total possible score on subtask  $i$ .
- $P(U_{ij})$  is calculated based on the Rasch model:

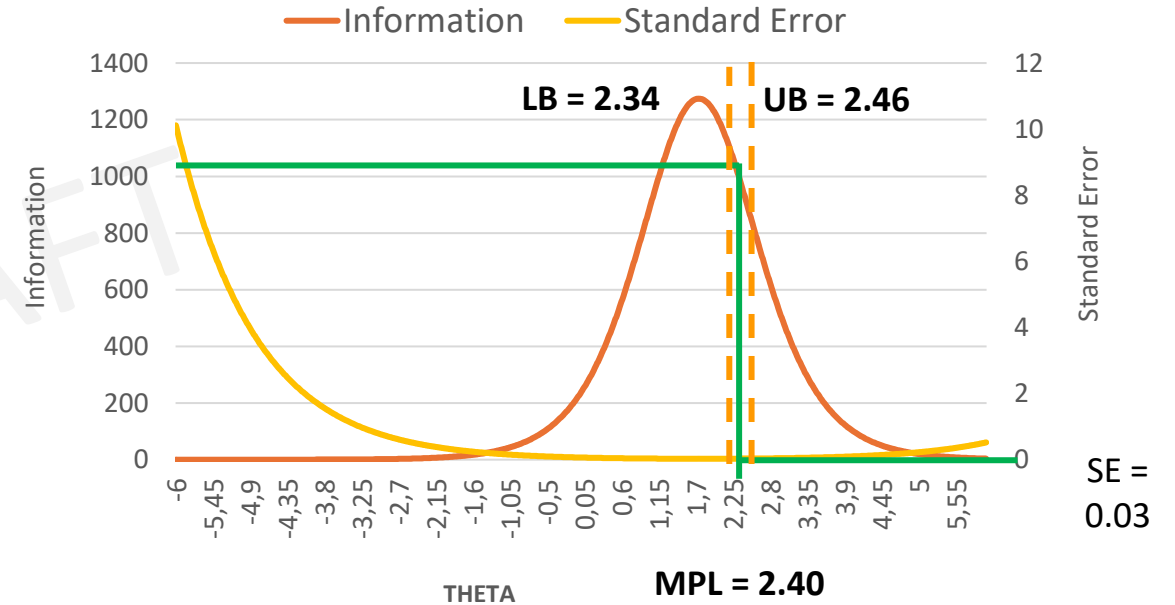
$$P(U_{ij}) = \frac{e^{1.7(\theta_{ij} - b_i)}}{1 + e^{1.7(\theta_{ij} - b_i)}}$$

# Generalized Linear Mixed Model (GLMM) Results

Test Characteristics Curves (TCC) - RC and ORF



Test Information and Standard Error - ORF

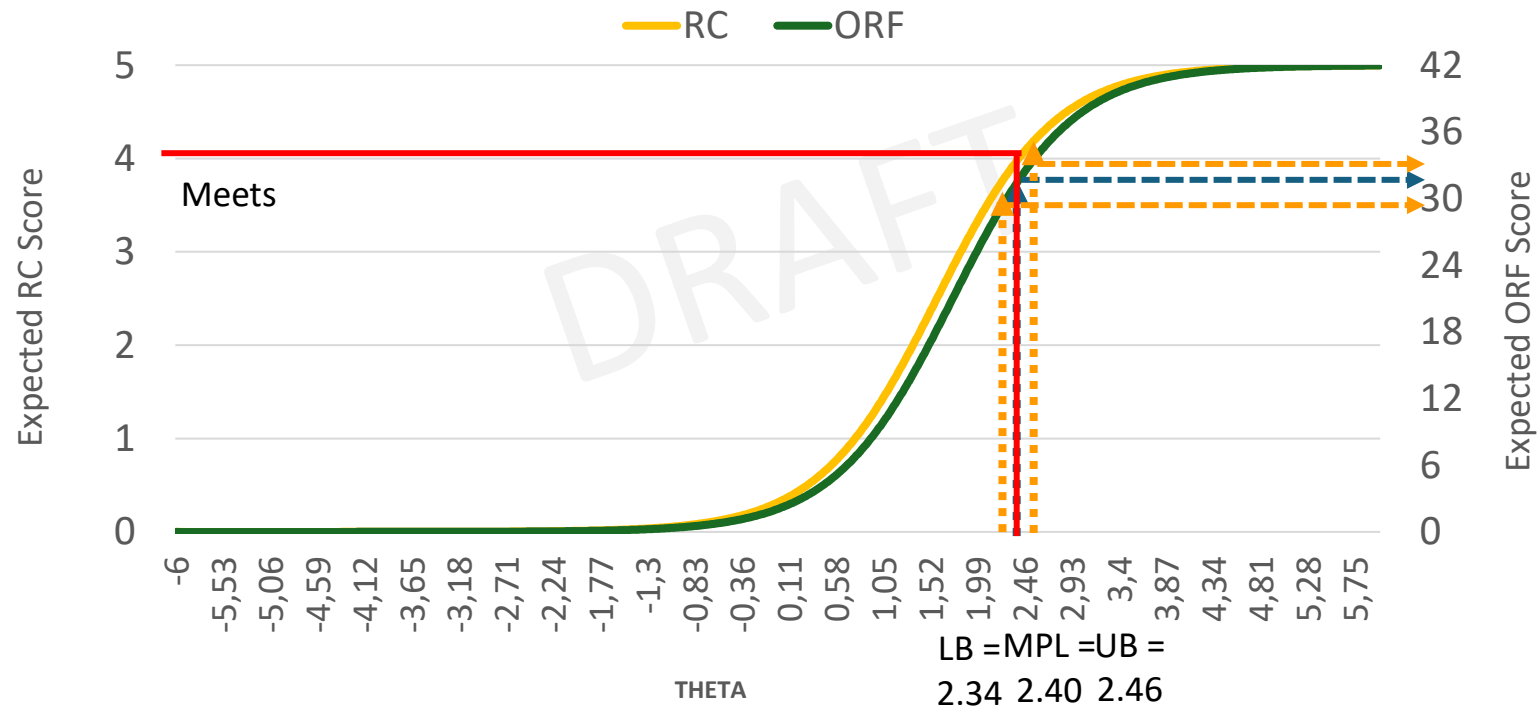


$$\text{Lower Bound (LB)} = 2.40 - 0.029 * 1.96 = 2.34$$

$$\text{Upper Bound (UB)} = 2.40 + 0.029 * 1.96 = 2.46$$

# Generalized Linear Mixed Model (GLMM) Results

Test Characteristics Curves (TCC) - RC and ORF



## Generalized Linear Mixed Model (GLMM) Results

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Meets : RC

4 RC



MPL = **2.40**



**32** Correct Words Per Minute (ORF)



**31** Correct Words Per Minute (LB-ORF)



**32** Correct Words Per Minute (UB-ORF)

## Generalized Linear Mixed Model (GLMM) Results

Assessment (Grade 2)	Subtask	Item	LCI	MPL	UCI	CI
<b>80% Reading Comprehension</b>						
USAID Country 4 Arabic	Oral Reading Fluency	42	31	32	32	1
USAID Country 6 Arabic	Oral Reading Fluency	76	55	56	57	2
USAID Country 13 Chitonga	Oral Reading Fluency	56	19	19	20	1
USAID Ghana English	Oral Reading Fluency	60	54	54	55	1
<b>60% Reading Comprehension</b>						
USAID Country 4 Arabic	Oral Reading Fluency	42	21	22	23	2
USAID Country 6 Arabic	Oral Reading Fluency	76	29	29	30	1
USAID Country 13 Chitonga	Oral Reading Fluency	56	9	9	10	1
USAID Ghana English	Oral Reading Fluency	60	46	47	48	2



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# Classical Test Theory (CTT) Based Raw Score Approach

## Classical Test Theory (CTT) Based Raw Score Approach

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- Benchmark for each subtask was calculated based on average performance among students with reading comprehension scores equal to the target or threshold.
- Standard error for each subtask was calculated as:
  - $SE(\text{Subtask}) = \text{Standard Deviation of Subtask Score} / \text{SQRT}(\text{Number of Students} - 1)$

## Classical Test Theory (CTT) Based Raw Score Approach

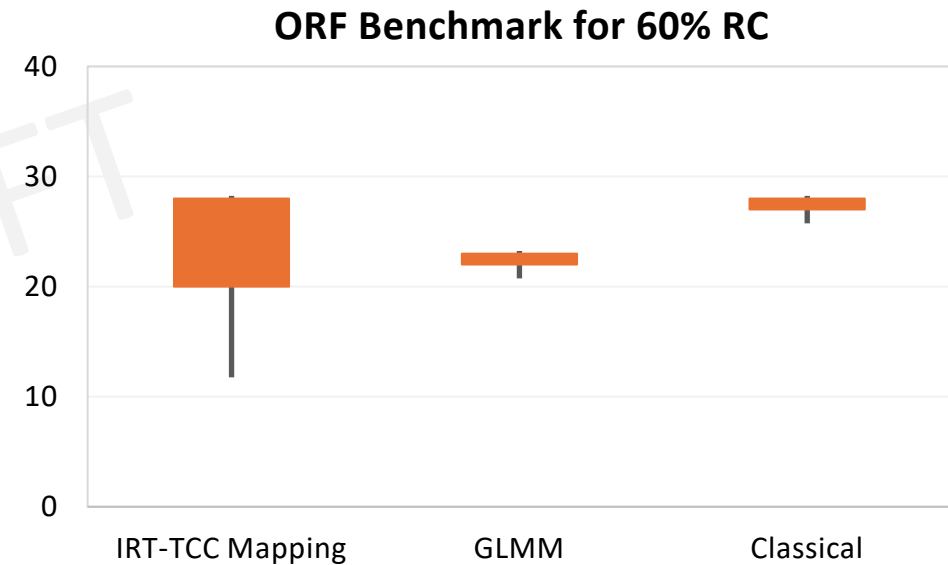
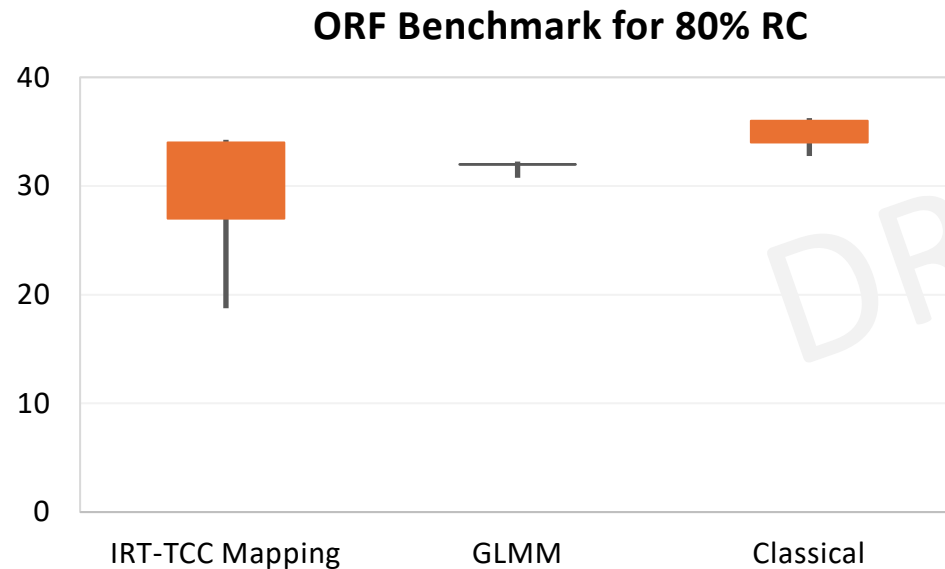
Assessment (Grade 2)	Subtask	Item	LCI	MPL	UCI	CI
<b>80% Reading Comprehension</b>						
USAID Country 4 Arabic	Oral Reading Fluency	42	33	34	36	3
USAID Country 6 Arabic	Oral Reading Fluency	76	67	77	87	20
USAID Country 13 Chitonga	Oral Reading Fluency	56	31	33	35	4
USAID Ghana English	Oral Reading Fluency	60	68	77	87	19
<b>60% Reading Comprehension</b>						
USAID Country 4 Arabic	Oral Reading Fluency	42	26	27	28	2
USAID Country 6 Arabic	Oral Reading Fluency	76	52	57	62	10
USAID Country 13 Chitonga	Oral Reading Fluency	56	24	26	27	3
USAID Ghana English	Oral Reading Fluency	60	45	52	59	14

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# Comparison of Three Methods

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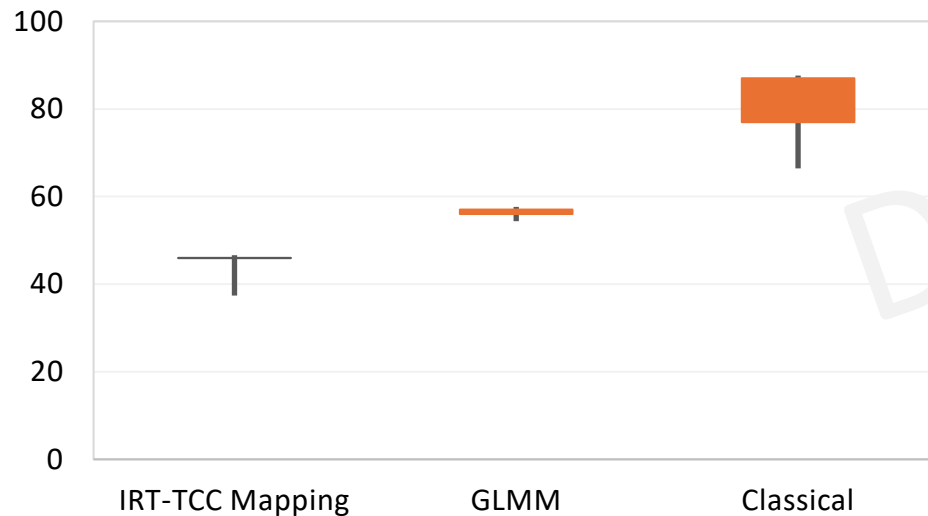
## Country 4 Arabic Language



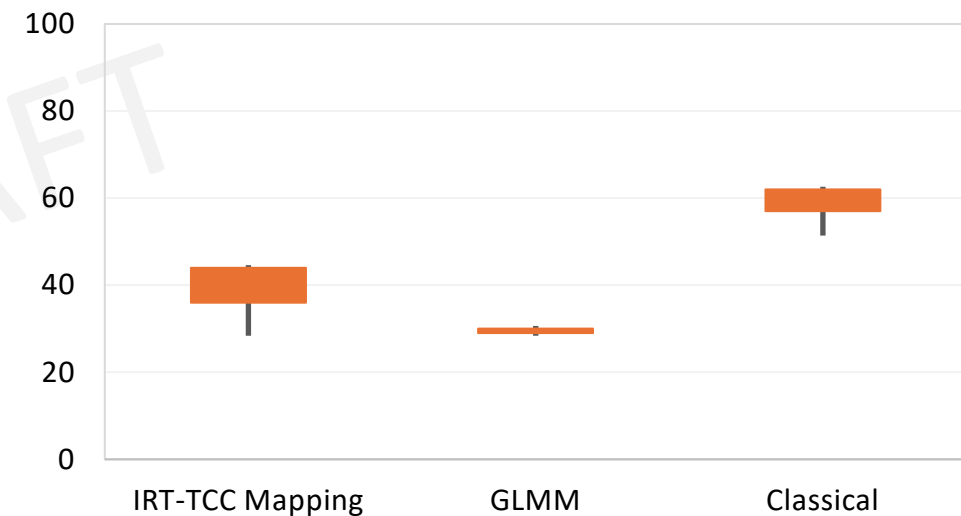
# Comparison of Three Methods

## Country 6 Arabic Language

ORF Benchmark for 80% RC



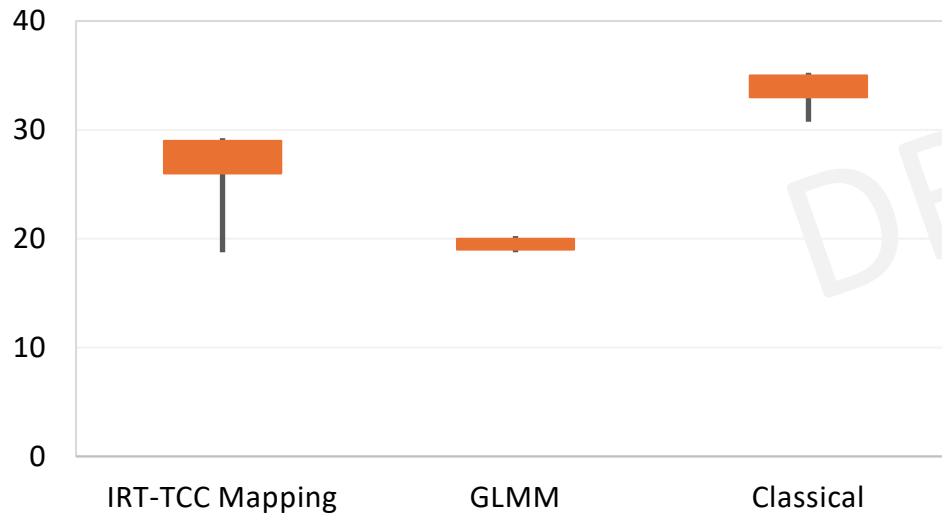
ORF Benchmark for 60% RC



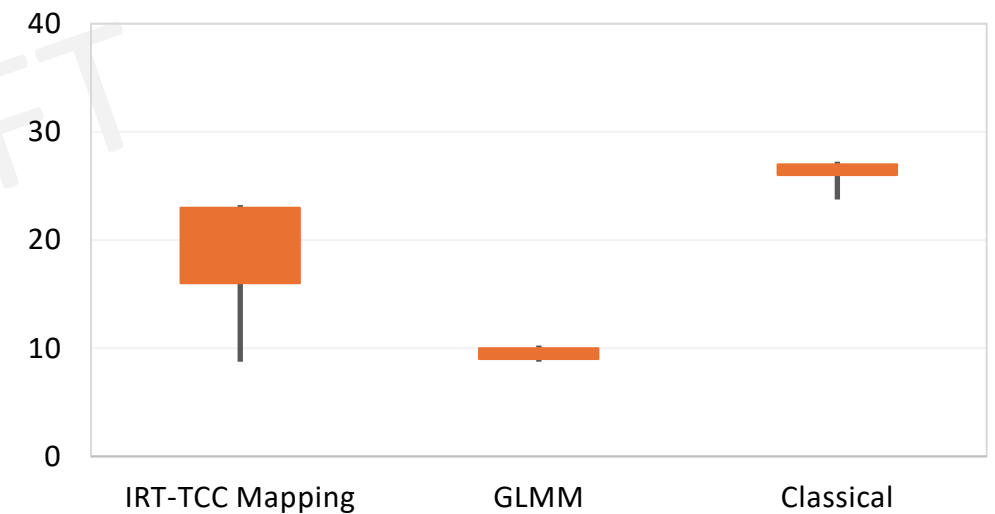
## Comparison of Three Methods

### Country 13 Chitonga Language

ORF Benchmark for 80% RC



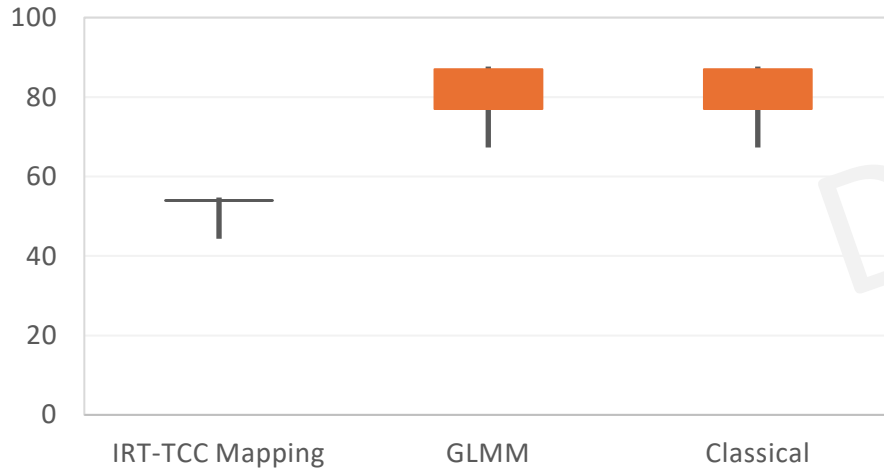
ORF Benchmark for 60% RC



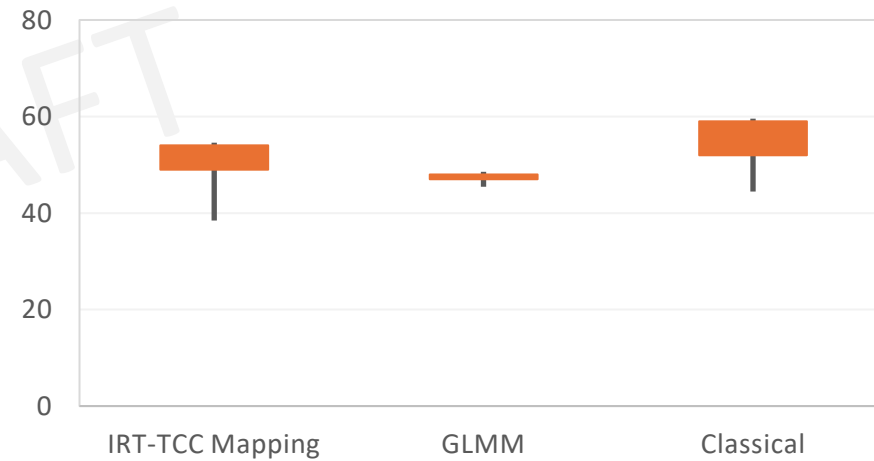
# Comparison of Three Methods

## Ghana English Language

ORF Benchmark for 80% RC



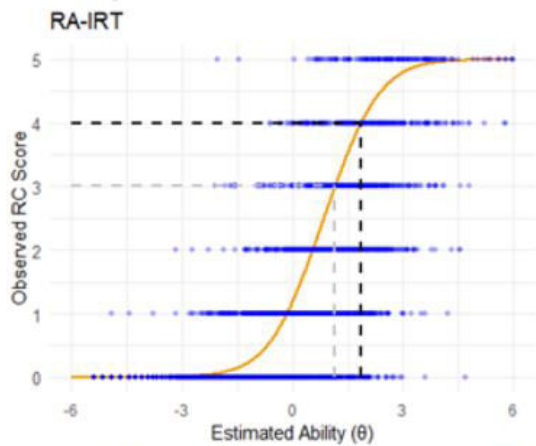
ORF Benchmark for 60% RC



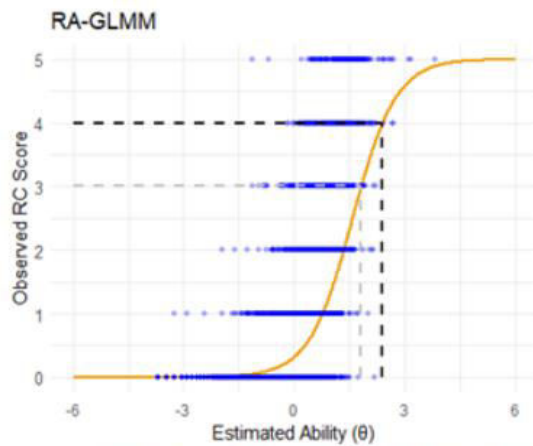


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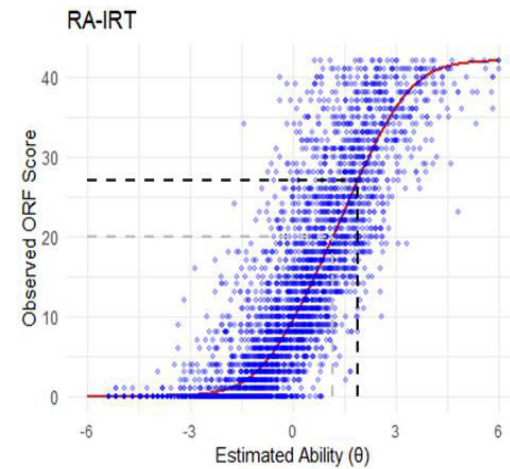
## Country 4 Arabic Language



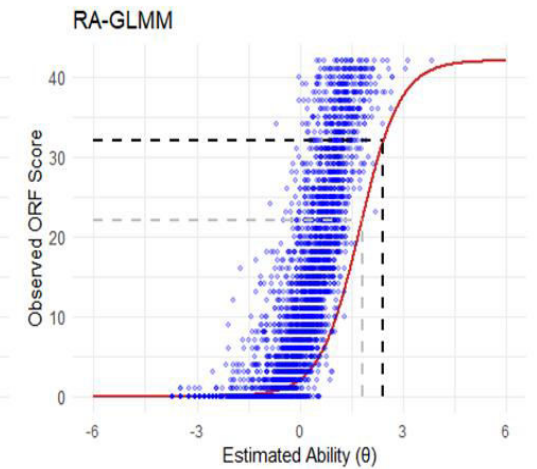
Solid orange line: TCC; Blue circles: Est. Ability vs. Obs. Score; Dashed gray line: 60% RCBM, Dashed black line: 80% RCBM;



Solid orange line: TCC; Blue circles: Est. Ability vs. Obs. Score; Dashed gray line: 60% RCBM, Dashed black line: 80% RCBM;



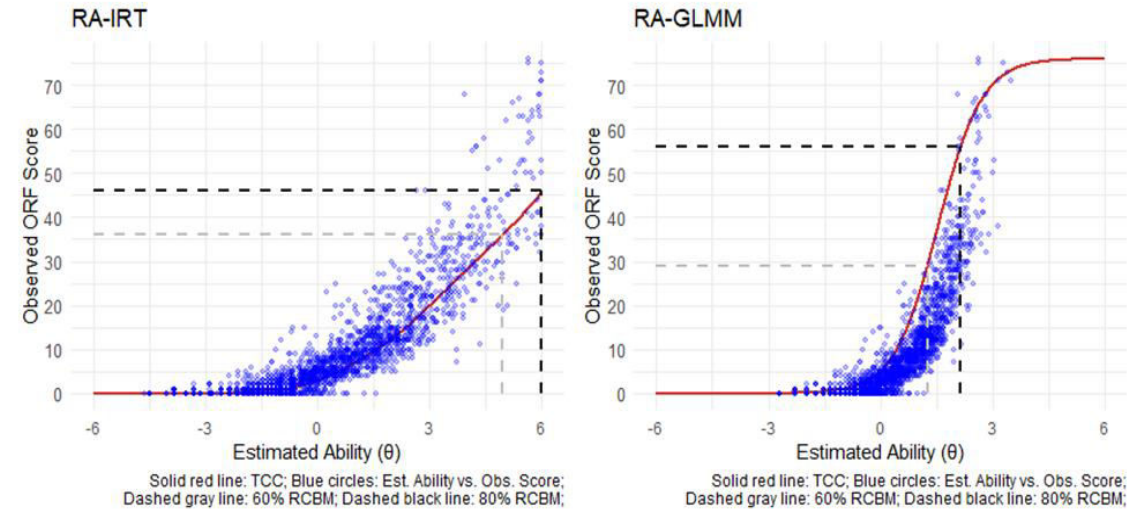
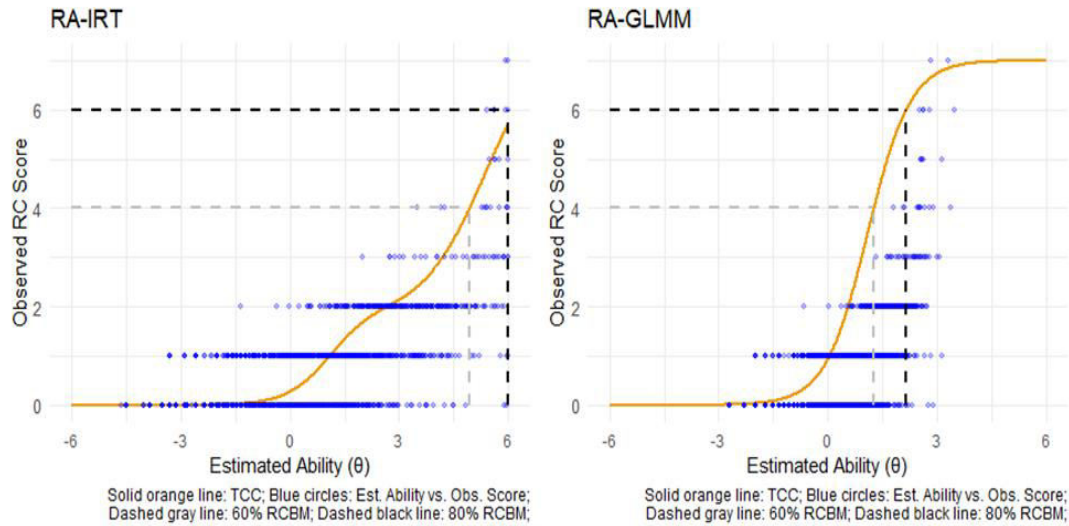
Solid red line: TCC; Blue circles: Est. Ability vs. Obs. Score; Dashed gray line: 60% RCBM, Dashed black line: 80% RCBM;



Solid red line: TCC; Blue circles: Est. Ability vs. Obs. Score; Dashed gray line: 60% RCBM, Dashed black line: 80% RCBM;

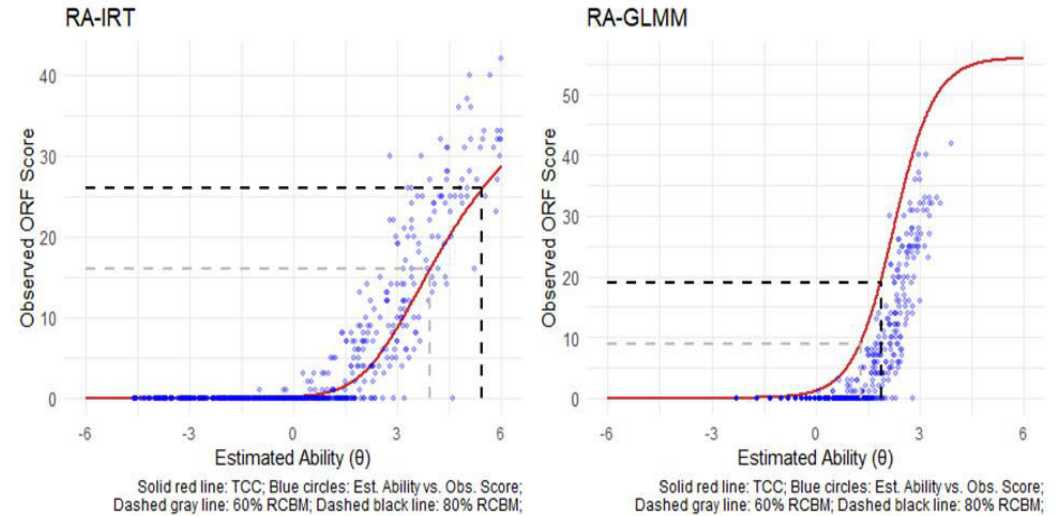
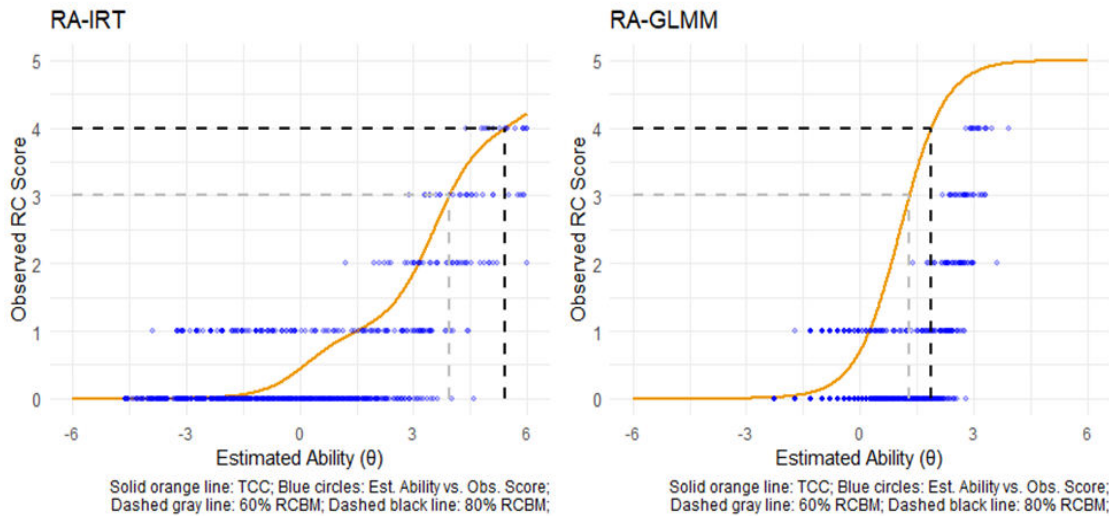
# Comparison of Three Methods

## Country 6 Arabic Language



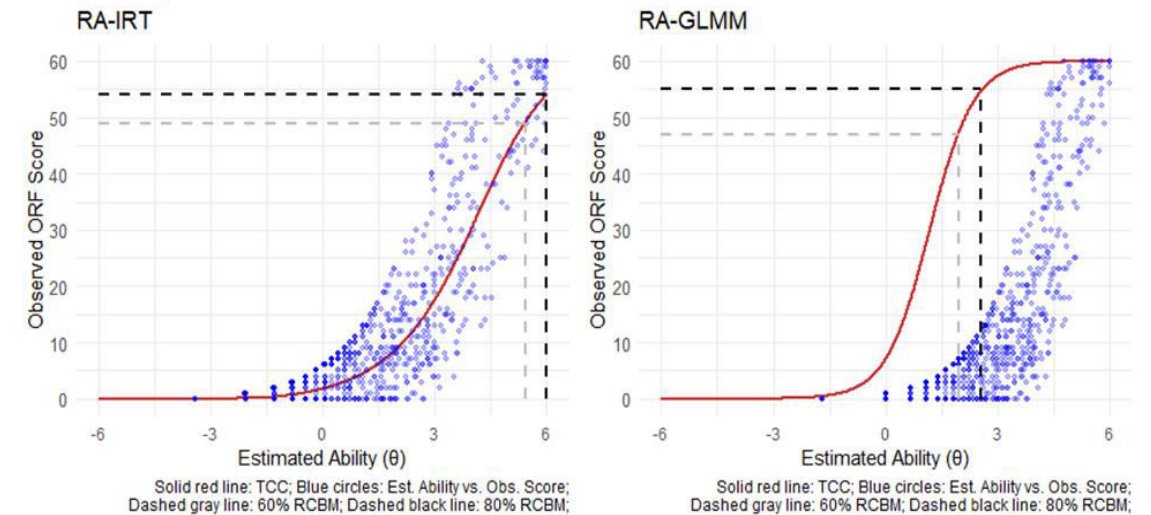
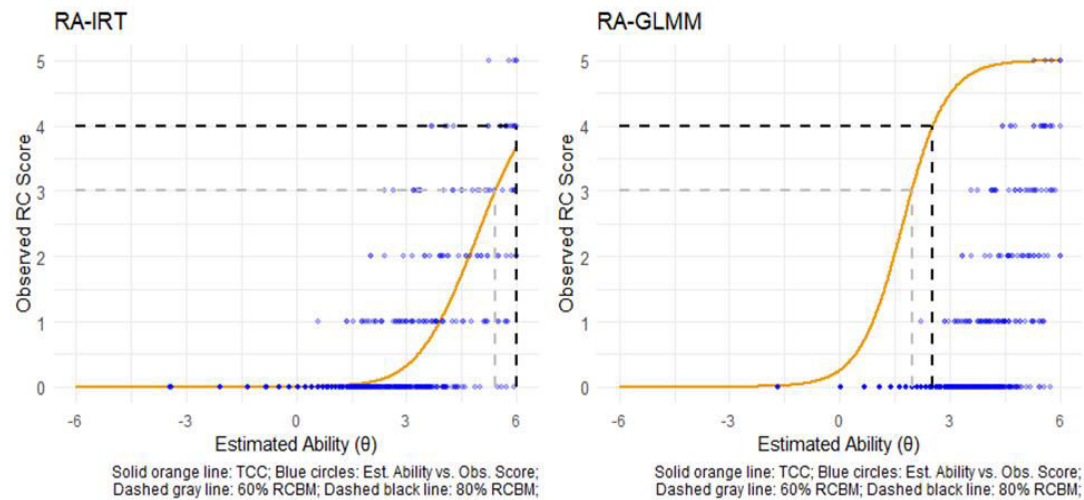
# Comparison of Three Methods

## Country 13 Chitonga Language



# Comparison of Three Methods

## Ghana English Language



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# Conclusions

## Conclusions

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- The IRT-based TCC mapping is an effective and reliable method for setting benchmarks.
- It provides a more precise understanding of student ability by accounting for item difficulty while offering a unified measure of ability across various skills, including comprehension and precursor skills, on the same latent scale.
- It consistently demonstrates a stronger model fit to the data, effectively capturing patterns.
- GLMM and classical approaches offer computational efficiency but fail to capture differences between test items.
- These approaches exhibit a lack of model fit to the data, a pattern observed consistently across all subtasks.

## Conclusions

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- Despite its advantages, the IRT based TCC mapping method has a wider confidence interval compared to GLMM and the classical approach.
- Further refinements are needed to improve the precision of estimated benchmarks.
- The IRT based TCC mapping method shows strong potential for assessments measuring both fluency and accuracy (e.g., India FLS) or those required by UIS for 4.1.1a reporting.
- To further assess its robustness and generalizability, the analysis should be replicated with additional datasets measuring both accuracy and fluency.
- Facilitate a stronger dialogue or discussion between psychometricians and reading science experts to validate benchmarks.



# THANK YOU

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