



#### **The Context**

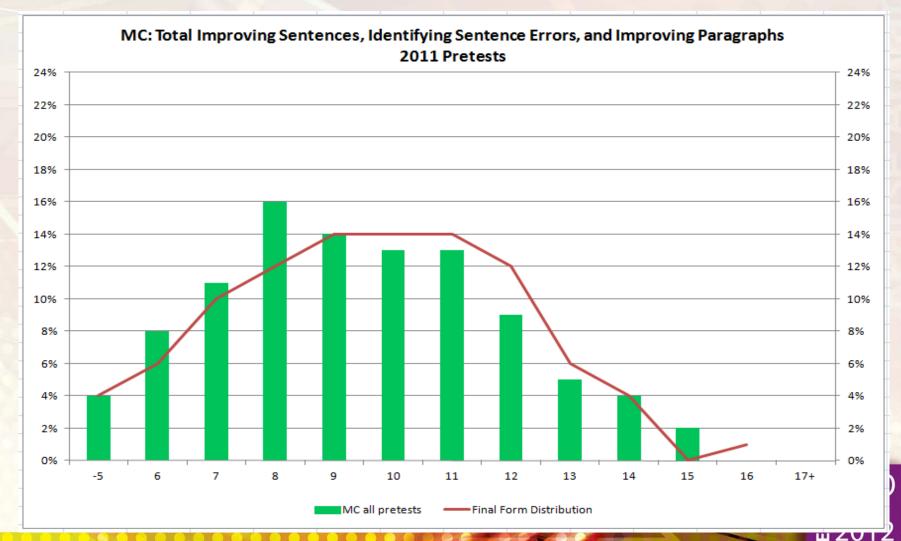
- High stakes assessment program
  - Multiple test administrations a year
  - Extensive item pools are required
- o Extensive item development processes
  - item creation & review
  - item pretesting
- Significant labor cost
- Need for increased efficiency and improved quality



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# Snapshot of SAT Writing item pool compared to test difficulty distribution









# Multiple Projects covering different perspectives

- Mathematics development of automated item generation protocols with Mark Gierl
- Critical Reading Application of Assessment Engineering principles with Ric Luecht
- Writing Application of Principled Assessment design with internal staff





- o Principled assessment design:
  - Clearly defined measurement constructs and test purpose
  - Having an item attribute taxonomy and item models to describe how item attributes, components, and features interact to drive item difficulty
  - Develop a taxonomy of item attributes and item models
    - o create detailed test specifications
    - o guide item development
    - o guide form assembly





# Principled Assessment Design: Expected Outcomes

- Items are tightly anchored in test specifications, definition of construct, and purpose of test
- Item writers have better understanding on what drives item difficulty
- Item writers should be able to create a greater percentage of items that pass pretesting that address shallow areas in item pools





# **Pilot Project: Two Phases**

#### Phase 1 – Analysis of current item pool

- Performance of current pretest items
- Ability to predict item difficulty

#### Phase 2 – Development of item models

- Systematic review by SMEs
- Identification of key item characteristics
- Evaluate ability to predict item difficulty





### Phase 1 – Current item pools

 Acceptance rates of pretested SAT Writing items, disaggregated by estimated difficulty levels

	# of items	Acceptable	Do Not use	Review
Total	490	82.4%	10.6%	6.9%
Difficult Estimation				
Easy	115	90.4%	9.6%	0.0%
Medium	178	84.3%	9.6%	6.2%
Hard	105	77.1%	18.1%	4.8%



# Phase 1 – Current item pools

 Distribution of difficulty level for pretested SAT Writing items, disaggregated by estimated difficulty level

			Actual Difficulty		
	# of items	Mean (SD) Equated Delta	Easy	Medium	Hard
Total	490	10.3 (2.5)	23.7%	46.5%	29.8%
Difficult Estimation					
Easy	115	9.0 (2.0)	40.9%	47.0%	12.2%
Medium	178	10.2 (2.3)	24.7%	45.5%	29.8%
Hard	105	11.9 (2.5)	10.5%	40.0%	49.5%

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# Phase 2: Development of item models

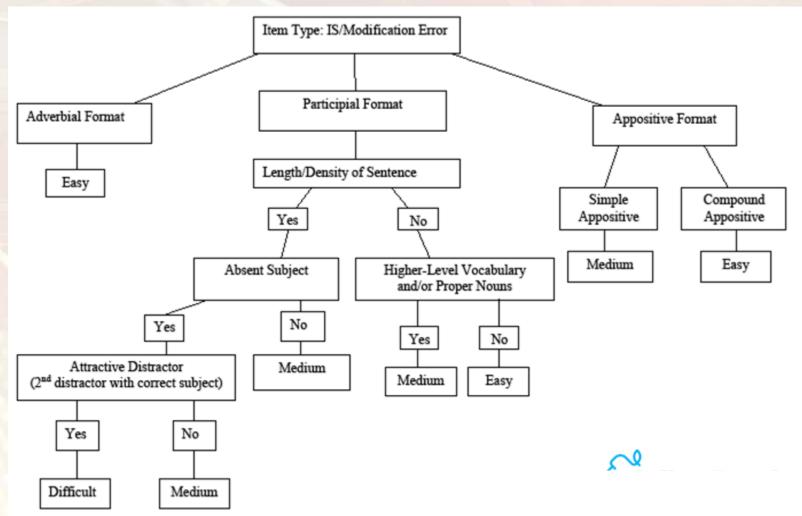
#### Our ELA content specialists:

- Identified common features and attributes hypothesized to drive item difficulty for a sample of items.
- Developed a theoretical model of how features and attributes interact & result in the level of difficulty.
- Reviewed 29 items & used the model to predict item difficulty.
- Consistency of predictions between specialists was evaluated.
- Accuracy of model based predictions were compared to subjective predictions already available





### Pilot Project: Item model









Finding its way through sediment on the sea floor, the 400-700 whiskers on a walrus' snout are used to sense the presence of clams and other invertebrates on which it feeds

- A) the 400-700 whiskers on a walrus' snout are used
- B) the walrus uses the 400-700 whiskers on its snout
- C) walruses use the 400-700 whiskers on their snout
- D) a walrus' snout, having 400-700 whiskers, is used
- E) the snout of walruses use 400-700 whiskers



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Finding its way through sediment on the sea floor, the 400-700 whiskers on a walrus' snout are used to sense the presence of clams and other invertebrates on which it feeds

Item Type: Improving Sentences
Modification error

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Item Type: Improving Sentences
Modification error

What is the format of the item?





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Item Type: Improving Sentences
Modification error

What is the format of the item?

The introductory clause is a participial phrase.





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Item Type: Improving Sentences
Modification error

Participial format







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Item Type: Improving Sentences
Modification error

Participial format

Is the stem lengthy or dense?



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Item Type: Improving Sentences
Modification error

Participial format

Is the stem lengthy or dense?

Yes. Prepositional phrases add to the density of the stem.







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Modification error

Participial format

Length/Density of Sentence - Yes









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Item Type: Improving Sentences

Modification error

Participial format

Length/Density of Sentence - Yes

Is the subject absent?





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Item Type: Improving Sentences
Modification error

Participial format

Length/Density of Sentence - Yes

Is the subject absent?

Yes. The intended subject "walrus" does not appear in the sentence as a noun. Students must form the intended subject from the possessive "walrus' snout."



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Item Type: Improving Sentences
Modification error

Participial format

Length/Density of Sentence - Yes

Absent Subject / Yes



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Item Type: Improving Sentences Modification error Participial format Length/Density of Sentence - Yes Absent Subject / Yes How attractive are the distractors?







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Item Type: Improving Sentences Modification error Participial format Length/Density of Sentence - Yes Absent Subject / Yes How attractive are the distractors?

None of the distractors start with the correct modified noun/subject "walrus."



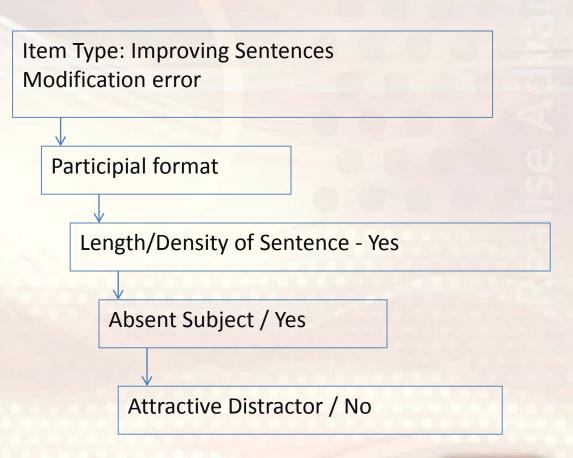






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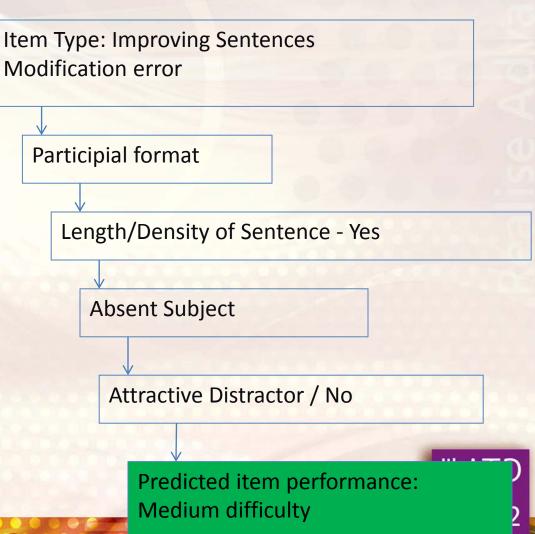


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# **Predictions of item difficulty**

 Traditional item difficulty estimates and actual item difficulty classifications

		Actual Difficulty levels		
	# of items	Easy	Medium	Hard
Traditional Difficulty Estimates				
Easy	2	0.0%	100.0%	0.0%
Medium	22	18.2%	68.2%	13.6%
Hard	5	0.0%	60.0%	40.0%



# Predictions of item difficulty

 Model based item difficulty estimates and actual item difficulty classifications

		Actual Difficulty levels		
	# of items	Easy	Medium	Hard
Model-Based Difficulty Estimates				
Easy	10	20.0%	70.0%	10.0%
Medium	17	5.9%	70.6%	23.5%
Hard	2	50.0%	50.0%	0.0%







### **Predictions of item difficulty**

- Model based estimates do not appear to be any more accurate than the traditional difficulty estimates
  - Traditional 68% of medium predictions were accurate
  - Model based 70% of medium predictions were accurate
- Model based predictions were more likely to predict easy difficulty levels
  - 10 items predicted to be easy from the model based, as compared to only 5 in the traditional estimates



## Some positive impacts

- Greater understanding of the items investigated
- Reviewers felt more qualified to conduct further reviews of these item types
- More qualified to try to build models for other item types
- Gained valuable insight to be used in the review of items with students





#### Some next steps

- Focus groups and "think alouds" with students
- Revise model based upon initial findings and information gained from student interviews
- Attempt to build other item models within SAT Writing
- Attempt to build models with other content areas (Reading and Mathematics)



#### Thank You!

Please Complete Your Evaluation and Hand to the Session Coordinator.

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