



# Statistical Competencies for Clinical & Translational Science: Evolution in Action

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# Introduction

- CTS is a relatively new discipline
  - Competencies in flux
- Competencies serve to define the discipline
  - Program evaluation
  - Learner evaluation
    - Self-assessment
    - Validated instruments
  - Provide guidance regarding training
    - Statistics is too big to teach everything

# Overview

- Refining the competencies
- Assessing the competencies
- Assessing CTS learners
- Consensus on the competencies

# Refining the Competencies

Enders (2011) “Evaluating mastery of biostatistics for medical researchers: need for a new assessment tool.” *Clinical and Translational Science*, Dec 2011; 4(6): 448–454.

# Who Are CTS Learners?

- CTS learners are typically not statisticians
  - Similar to Public Health students
  - Graduate level
- Variety of learner goals
  - Read the literature
  - Co-I; co-author
  - PI; first or last author
- Variety of learning modalities
  - Traditional graduate level coursework
  - CME or other on-demand access

# CTS Statistics Competencies (2009)

Describe the basic principles and practical importance of random variation, systematic error, sampling error, measurement error, hypothesis testing, type I and type II errors, and confidence limits

Compute sample size, power, and precision for comparisons of two independent samples with respect to continuous and binary outcomes

Explain the uses, importance, and limitations of early stopping rules in clinical trials

Scrutinize the assumptions behind different statistical methods and their corresponding limitations

Generate simple descriptive and inferential statistics that fit the study design chosen and answer research question

Describe the uses of meta-analytic methods

# Statistics-Related Competencies

## Sources of Error

- Describe the concepts and implications of reliability and validity of study measurements
- Evaluate the reliability and validity of measures
  - Assess sources of bias and variation in published studies.
  - Assess threats to study validity (bias) including problems with sampling, recruitment, randomization, and comparability of study groups

## Scientific Communication

- Communicate clinical and translational research findings to difference groups of individuals, including colleagues, students, the lay public, and the media
- Write summaries of scientific information for use in the development of clinical health care policy

## Study Design

- Propose study designs for addressing a clinical or translational research question

Workgroup CECC. Core Competencies in Clinical and Translational Science for Master's Candidates. [http://www.ctsaweb.org/index.cfm?fuseaction=committee.viewCommittee&com\\_ID=5](http://www.ctsaweb.org/index.cfm?fuseaction=committee.viewCommittee&com_ID=5)

# Other Sources of Competencies

- Calhoun et al. Development of a Core Competency Model for the **Master of Public Health** Degree.  
*American Journal of Public Health*. 2008; 98(9):10.
- Moher et al. **CONSORT** 2010 Explanation and Elaboration: updated guidelines for reporting parallel group randomised trials.  
*BMJ*. 2010; 340:c869, 1–28.
- Des Jarlais et al. Improving the reporting quality of nonrandomized evaluations of behavioral and public health interventions: the **TREND** statement.  
*Am J Public Health*. 2004; 94(3):361–366.
- Vandembroucke et al. Strengthening the Reporting of Observational Studies in Epidemiology (**STROBE**): explanation and elaboration.  
*PLoS medicine*. 2007; 4(10):e297.



# Why Public Health?

- Public Health graduate students are nonstatisticians in a medical field
- They will use statistics to read and publish in the medical research literature
- Competencies were compared, condensed, and extended in Enders (2011)

# Competency Comparison

| Clinical and Translational Science   | Public Health   | Guidelines                          |
|--|---|-------------------------------------|
| <p>Assess sources of <b>bias</b> and variation in published studies</p> <p>Assess threats to study validity (bias) including problems with sampling, recruitment, randomization, and comparability of study groups</p> |   | <p>CONSORT<br/>TREND<br/>STROBE</p> |
| <p>Propose <b>study designs</b> for addressing a clinical or translational research question</p>   |   | <p>STROBE</p>                       |
| <p>Describe the <b>basic principles</b> and practical importance of random variation, systematic error, sampling error, measurement error, hypothesis testing, type I and type II errors, and confidence limits</p>    | <p>Describe the <b>basic concepts</b> of probability, random variation, and commonly used statistical probability distributions</p> |                                     |
| <p>Compute <b>sample size, power,</b> and precision for comparisons of two independent samples with respect to continuous and binary outcomes</p>  |   | <p>CONSORT<br/>TREND<br/>STROBE</p> |

# Competency Comparison

| Clinical and Translational Science   | Public Health   | Guidelines       |
|--|---|------------------|
| Explain the uses, importance, and limitations of early <b>stopping rules</b> in clinical trials            |   | CONSORT<br>TREND |
| Describe the concepts and implications of <b>reliability and validity</b> of study measurements            | Calculate <b>basic epidemiologic measures</b>   | TREND            |
| Evaluate the reliability and validity of measures  | Draw appropriate inferences from epidemiologic data   |                  |
| <b>Scrutinize the assumptions</b> behind different statistical methods and their corresponding limitations | Describe preferred methodologic alternatives to commonly used statistical methods when <b>assumptions are not met</b> |                  |

# Competency Comparison

| Clinical and Translational Science  | Public Health  | Guidelines                 |
|---|--|----------------------------|
|   | Distinguish among the different <b>measurement scales and the implications for selection of statistical methods</b> to be used on the basis of these distinctions  |                            |
| Generate simple descriptive and <b>inferential statistics</b> that fit the study design chosen and answer research question | Apply <b>descriptive techniques</b> commonly used to summarize public health data<br><br>Apply <b>common statistical methods</b> for inference<br><br>Apply descriptive and inferential methodologies according to the type of study design for answering a particular research question | CONSORT<br>TREND<br>STROBE |
| Describe the uses of <b>meta-analytic methods</b>   |  |                            |

# Competency Comparison

| Clinical and Translational Research  | Public Health   | Guidelines                          |
|--|---|-------------------------------------|
| <p><b>Communicate</b> clinical and translational research findings to difference groups of individuals, including colleagues, students, the lay public, and the media</p> <p>Write summaries of scientific information for use in the development of clinical health care policy</p> | <p><b>Interpret results</b> of statistical analyses found in public health studies</p> <p>Develop written and oral presentations on the basis of statistical analyses for both public health professionals and educated lay audiences</p> | <p>CONSORT<br/>TREND<br/>STROBE</p> |

# Competencies Added from Guidelines

| Competency  | Guidelines                 |
|---|----------------------------|
| Describe size of the effect with a measure of precision   | CONSORT<br>TREND<br>STROBE |
| Describe the study sample, including sampling methods, the amount and type of missing data, and the implications for generalizability | TREND<br>STROBE            |
| Interpret results in light of multiple comparisons  | CONSORT<br>TREND<br>STROBE |
| Identify inferential methods appropriate for clustered, matched, paired, or longitudinal studies                                      | TREND<br>STROBE            |
| Describe adjusted inferential methods appropriate for the study design, including examination of interaction                          | CONSORT<br>TREND<br>STROBE |
| Describe statistical methods appropriate to address loss to followup  | STROBE                     |

# Assessing the Competencies

Oster R, et al (In Press) “Assessing statistical competencies in clinical and translational science education: one size does not fit all.” Clinical and Translational Science, In Press

# BERD Education Working Group

- Goal: assess need for training in each competency
- Methods: 18 BERD members surveyed for training needed (high/some/none) by trainee type
- Trainees categorized by background (**no research experience**/reader/research experience) and intended role (**reader/co-I/PI**)
- Asked for missing competencies



# Competencies Added by Reviewers

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## Competency

Describe statistical methods appropriate to address **loss to follow-up**

Understand the reasons for performing research that is **reproducible** from data collection through publication of results

Understand appropriate methods for **data presentation**, especially effective statistical graphs and tables

Characterization of **diagnostic testing**, including sensitivity, specificity, and ROC curves

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Describe appropriate **data quality and data management** procedures

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# Division of the Competencies

- Based on predicted **high need for training for future PIs**
  - **Fundamental**  $\geq 70\%$  high need for training
  - **Intermediate** 60%-69% high need for training
  - **Specialized**  $< 60\%$  high need for training
- Cutoffs assigned post hoc

# Fundamental Competencies

## Goal: PI

Assess sources of bias and variation

Propose study designs

Communicate research findings

Understand the reasons for performing reproducible research

Describe basic statistical principles and their practical importance

Describe concepts and implications of reliability and validity

Describe the study sample, including sampling methods

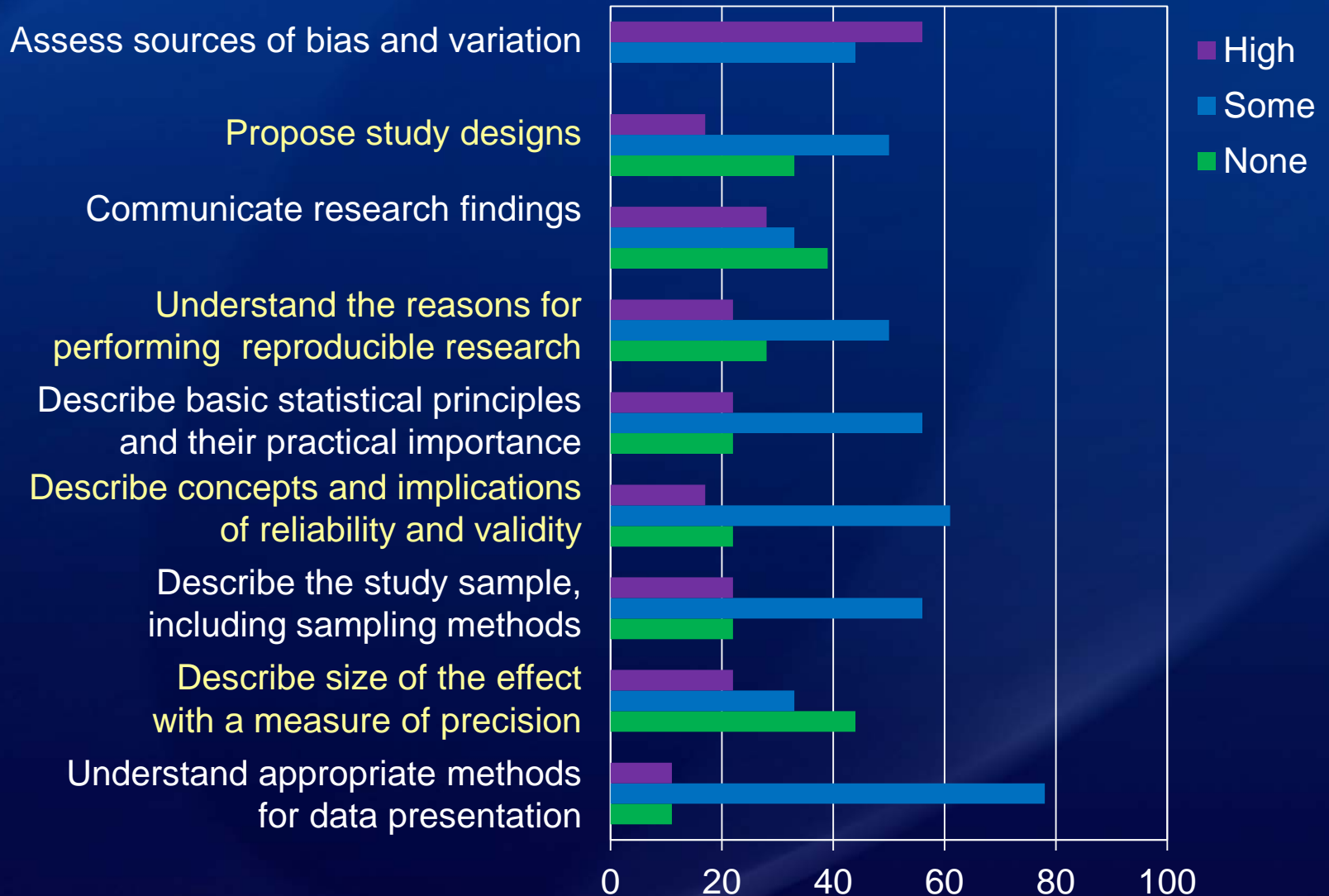
Describe size of the effect with a measure of precision

Understand appropriate methods for data presentation



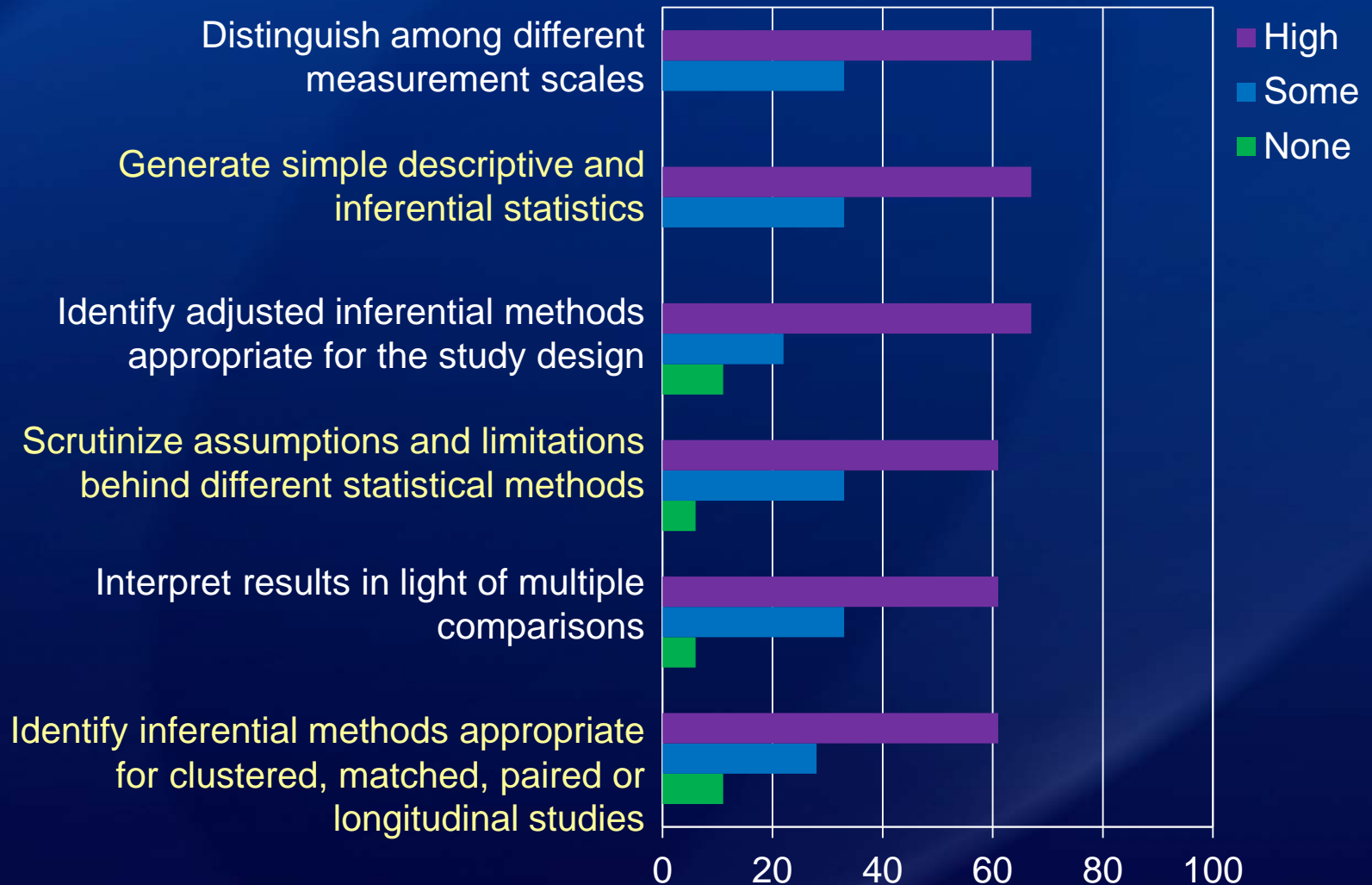
# Fundamental Competencies

## Goal: Informed Reader



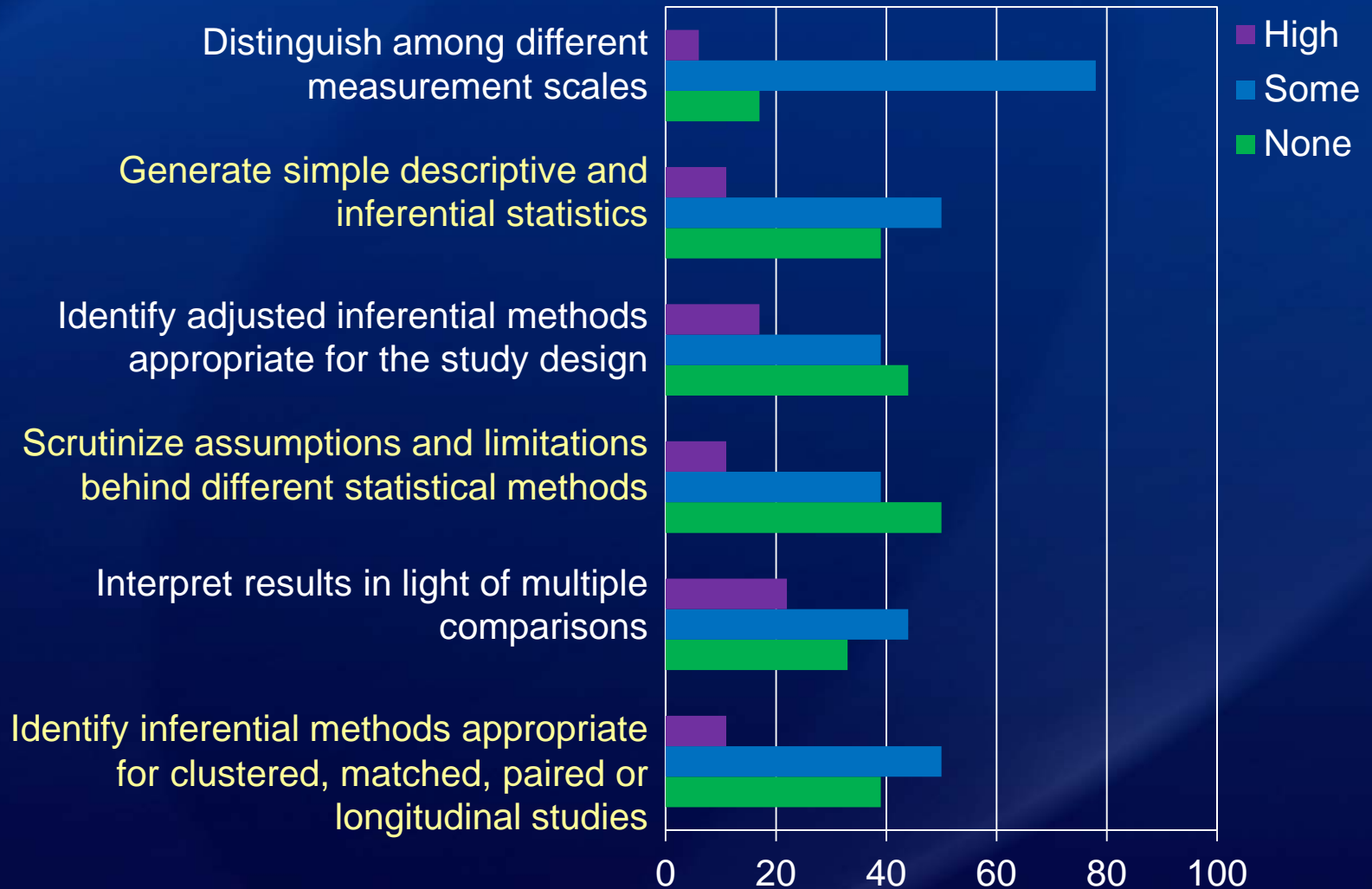
# Intermediate Competencies

## Goal: PI



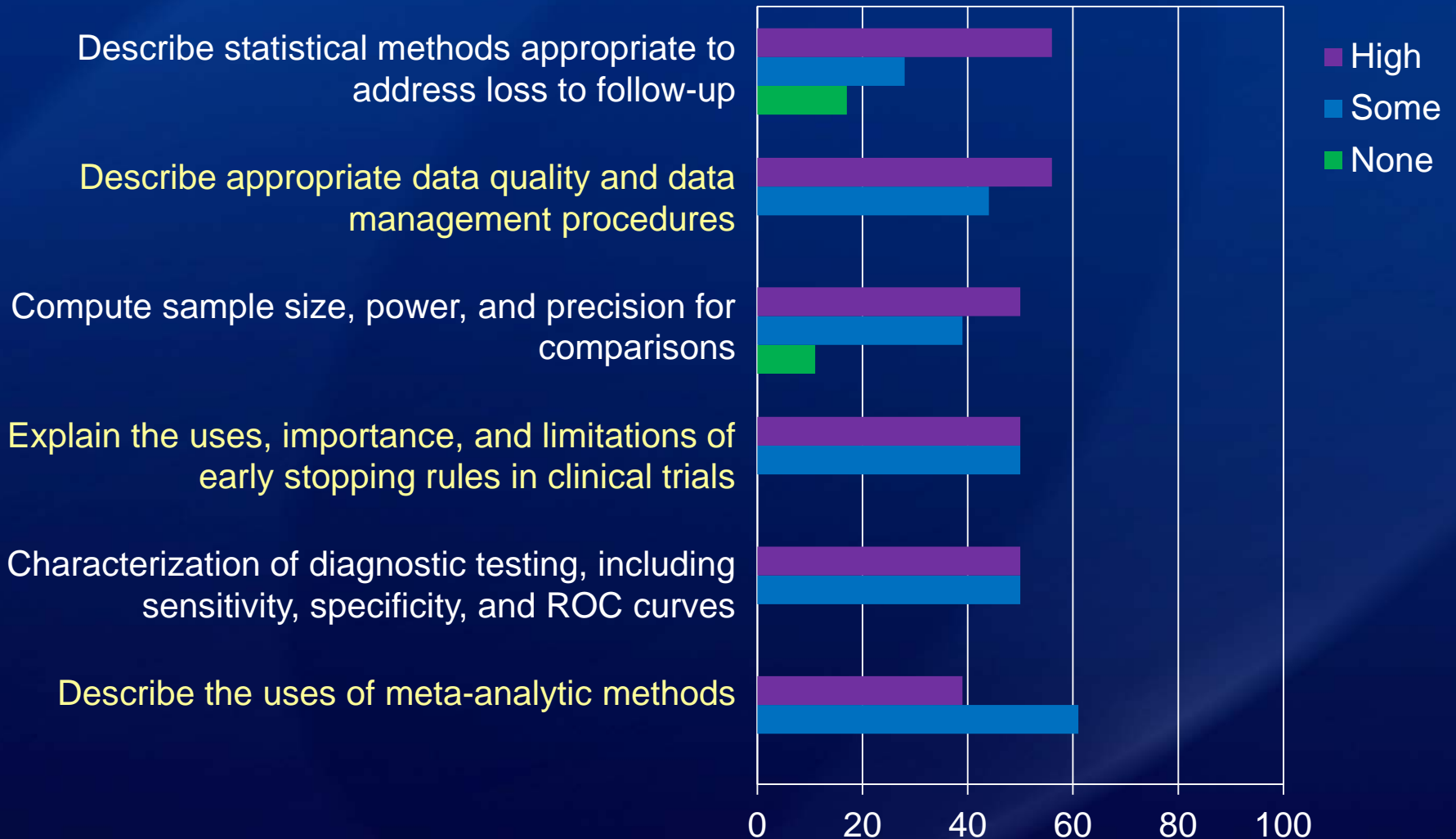
# Intermediate Competencies

## Goal: Informed Reader



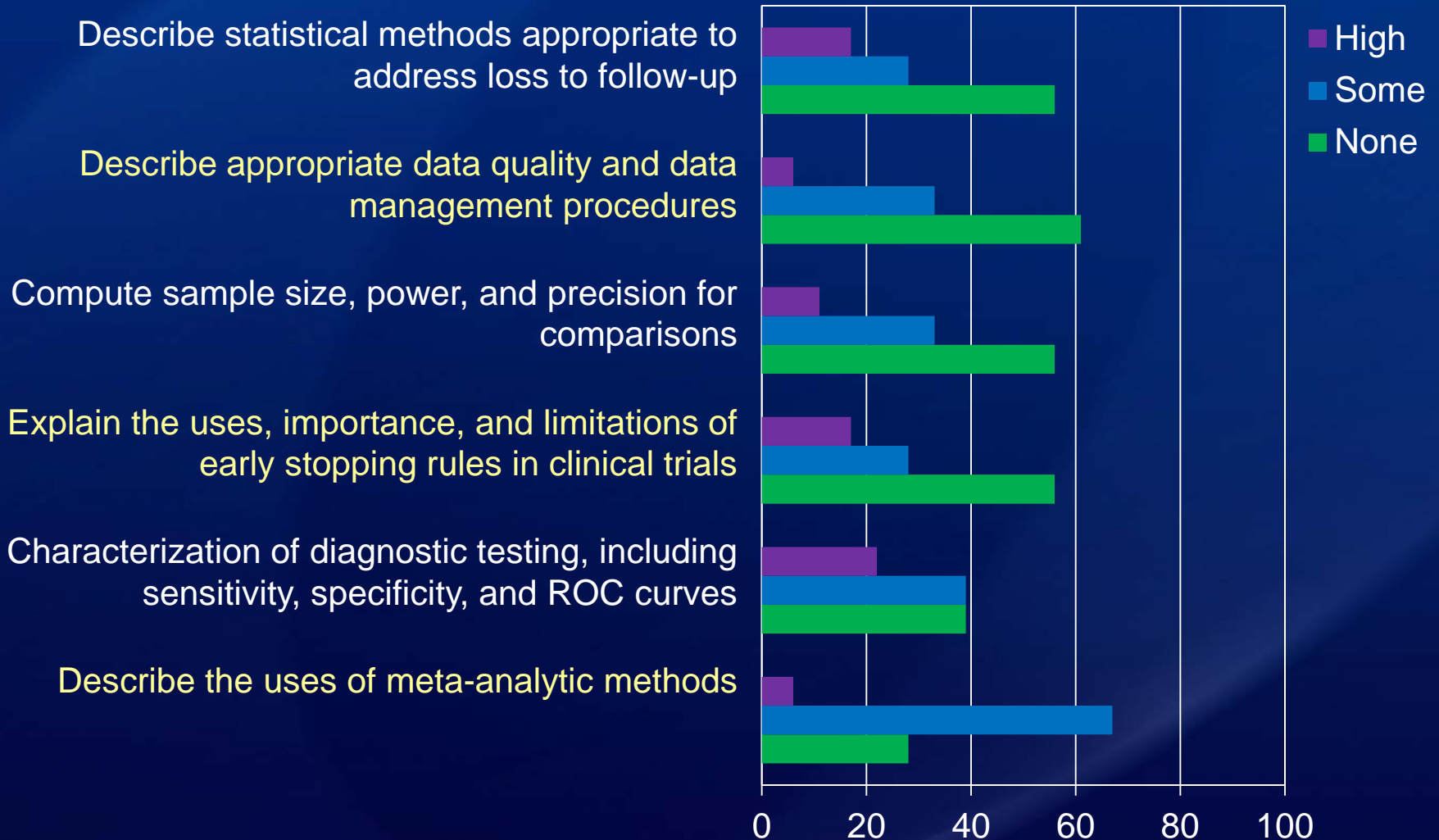
# Specialized Competencies

## Goal: PI



# Specialized Competencies

## Goal: Informed Reader





# Suggested Modifications

- Comments on the competencies suggested wording changes
  - Critical verb often proposed to change level of competency
- Example [**proposed modification**]
  - **Propose [Assess]** study designs for addressing a clinical or translational research question
- Modifications have not yet been assessed

# Summary of Competency Assessment

- Strengths
  - First assessment of competencies
  - Added competencies
  - Considered learner's background and role
- Limitations
  - N of 18
  - Cutoffs for competency types determined post hoc
  - Survey did not use terms “specialized” and “fundamental”

# Assessing CTS Learners

Enders F. (2013) “Do Clinical and Translational Science Graduate Students Understand Linear Regression? Development and Early Validation of the REGRESS Quiz.” *Clinical and Translational Science*, 2013 Dec;6(6):444-51.

Kidwell K, Enders F (In Press) “Initial External Validation of REGRESS in Public Health Graduate Students.” *Clinical and Translational Science*, In Press.

# Related Work: Assessment Tools for CTS

- In order to evaluate learner competency, validated measures will be needed
- Such instruments need to be:
  - Linked to CTS statistical competencies
  - Normed for CTS learners
  - Relatively quick to complete

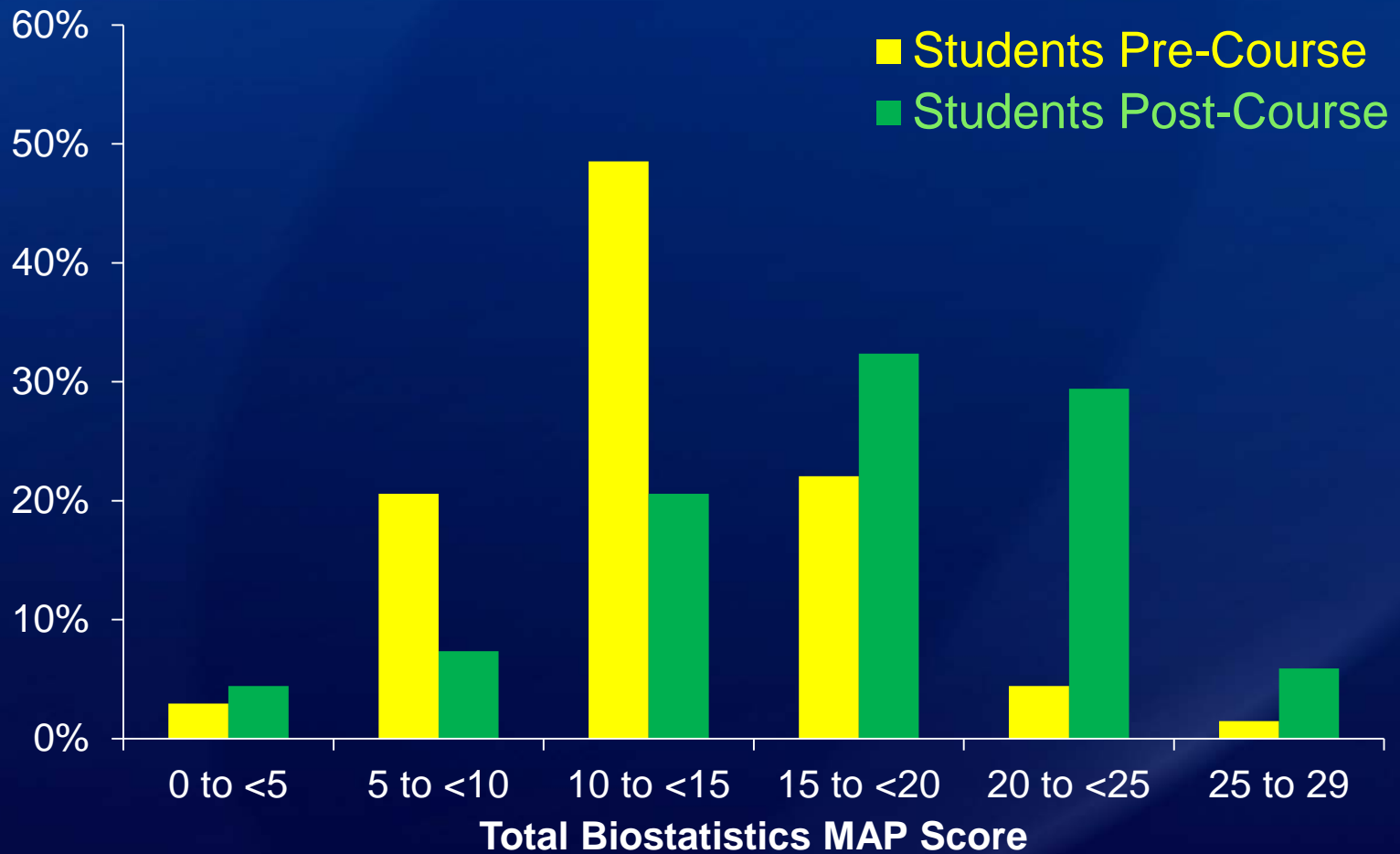
# Assessment Instruments: Existing tools

- Windish (2007)
  - Well validated
  - For physicians reading the literature
- delMas (2007) CAOS test
  - Well validated
  - For undergraduates after 1<sup>st</sup> stat course
- For others, see Enders (2011)

# Assessment Instruments: New Tools

- Biostatistics Mastery Assessment of Proficiency (Biostatistics MAP)
  - Aligned with first course in biostatistics
  - Univariate and bivariate methods
- Global Regression Expectations in Statistics (REGRESS)
  - Aligned with training on linear regression
  - Simple & multiple regression models

# Biostatistics MAP



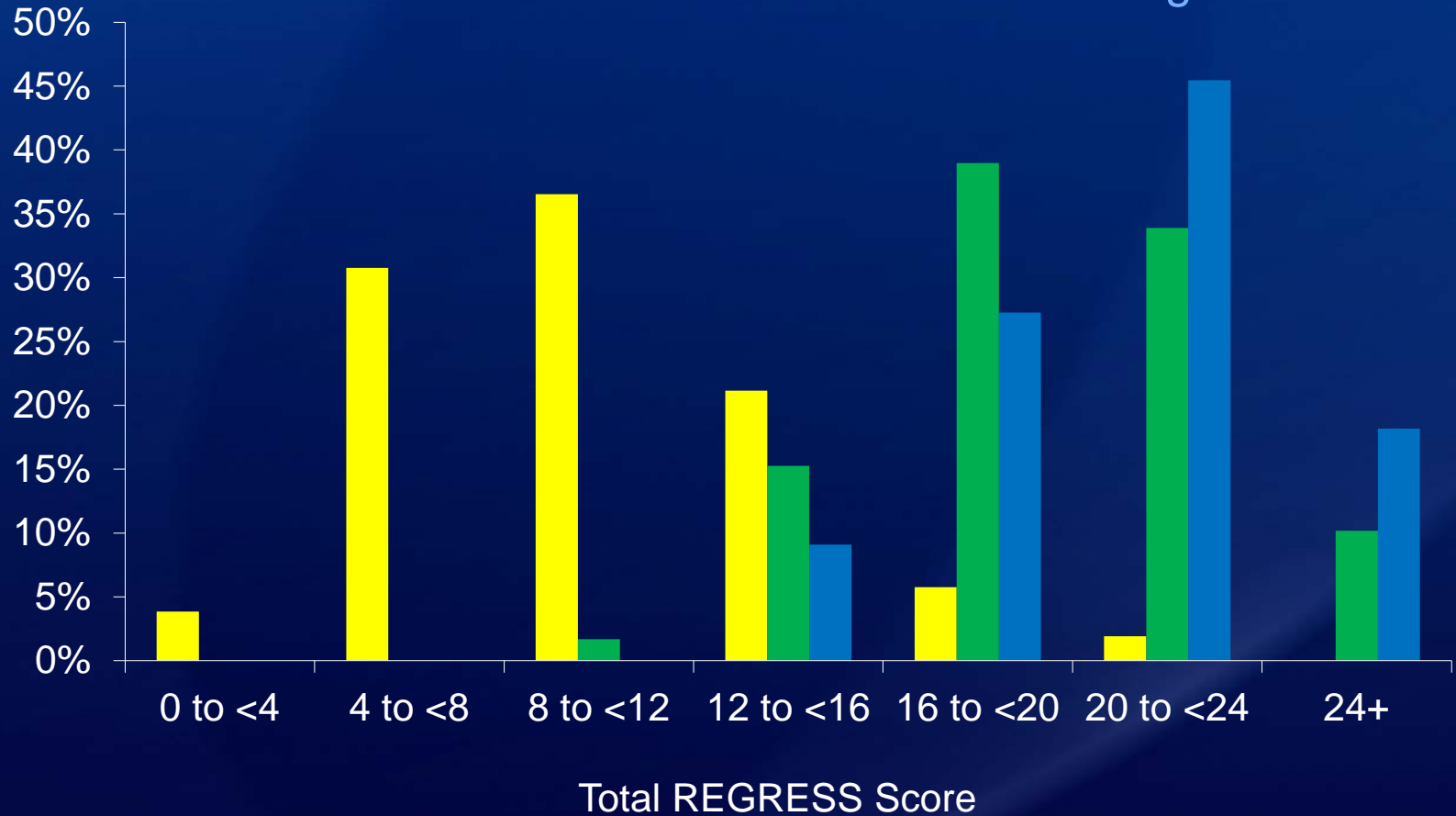
# Biostatistics MAP

|  | Student<br>Pre-course<br>N=68 | Student<br>Post-course<br>N=68 | Post-course-<br>Pre-course<br>N=68 | p-value          |
|--|-------------------------------|--------------------------------|------------------------------------|------------------|
| <b>Total Score (of 30)</b>               | <b>12 (1-25)</b>              | <b>18 (0-29)</b>               | <b>4 (-10 to 15)</b>               | <b>&lt;0.001</b> |
| <b>Domains</b>                           | Median<br>(range)             | Median<br>(range)              | Median<br>(range)                  |                  |
| <b>Definitions</b> (of 3)                | 1 (0-3)                       | 2 (0-3)                        | 0 (-3 to 2)                        | 0.043            |
| <b>Study Design</b> (of 3)               | 1 (0-3)                       | 2 (0-3)                        | 0 (-1 to 3)                        | <0.001           |
| <b>Choice of Method</b> (of 7)           | 3 (0-7)                       | 5 (0-7)                        | 1 (-5 to 7)                        | <0.001           |
| <b>Application</b> (of 6)                | 3 (0-6)                       | 4 (0-6)                        | 1 (-2 to 6)                        | <0.001           |
| <b>Interpretation</b> (of 8)             | 3 (0-7)                       | 5 (0-8)                        | 2 (-4 to 5)                        | <0.001           |
| <b>Assumptions</b> (of 3)                | 1 (0-3)                       | 1 (0-3)                        | 0 (-2 to 2)                        | 0.019            |
| <b>Topics</b>                            |                               |                                |                                    |                  |
| General (of 8)                           | 4 (0-8)                       | 5 (0-8)                        | 1 (-6 to 5)                        | <0.001           |
| Categorical Outcome (of 8)               | 4 (0-8)                       | 5 (0-8)                        | 1 (-3 to 5)                        | <0.001           |
| Continuous Outcome (of 8)                | 3 (0-7)                       | 5 (0-8)                        | 1.5 (-3 to 6)                      | <0.001           |
| Time to Event Outcome (of 2)             | 0 (0-2)                       | 0 (0-2)                        | 0 (-1 to 2)                        | 0.123            |
| Diagnostic Testing &<br>Agreement (of 4) | 2 (0-4)                       | 3 (0-4)                        | 1 (-3 to 3)                        | 0.010            |



# REGRESS: Internal Validation

- Students Pre-Course
- Students Post-Course
- Practicing Statisticians



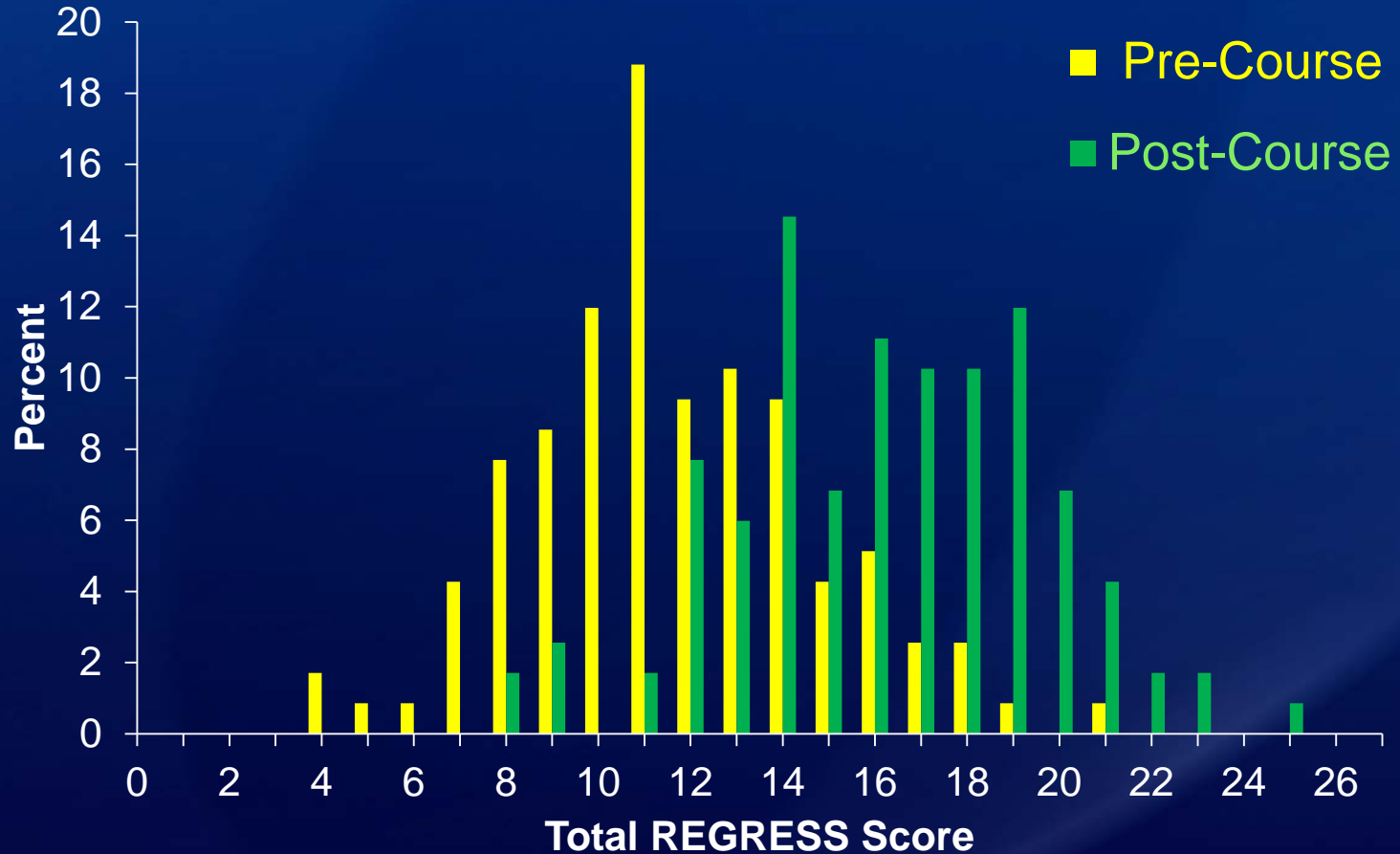
# REGRESS

|   | Mayo<br>pre-<br>course<br>N=52 | Mayo<br>post-<br>course<br>N=59 | p-value          | Practicing<br>Statisticians<br>N=22 | p-value<br>vs. pre | p-value<br>vs. post |
|---|--------------------------------|---------------------------------|------------------|-------------------------------------|--------------------|---------------------|
| <b>Summary Scores</b>                                     | Mean<br>(SD)                   | Mean<br>(SD)                    |                  | Mean<br>(SD)                        |                    |                     |
| <b>REGRESS Score (of 27)</b>                              | <b>9.3 (4.3)</b>               | <b>19.0 (3.5)</b>               | <b>&lt;0.001</b> | <b>20.1 (3.5)</b>                   | <b>&lt;0.001</b>   | <b>0.21</b>         |
| <b>SLR Score (of 11)</b>                                  | <b>6.3 (2.5)</b>               | <b>8.3 (1.6)</b>                | <b>&lt;0.001</b> | <b>9.8 (1.2)</b>                    | <b>&lt;0.001</b>   | <b>&lt;0.001</b>    |
| <b>Domains</b>  | Median<br>(range)              | Median<br>(range)               |                  | Median<br>(range)                   |                    |                     |
| <b>Interpreting &amp; Using SLR<br/>Equation (of 8)</b>   | <b>4 (0-8)</b>                 | <b>6 (3-8)</b>                  | <b>&lt;0.001</b> | <b>7 (5-8)</b>                      | <b>&lt;0.001</b>   | <b>0.001</b>        |
| <b>Interpreting &amp; Using MLR<br/>Equation (of 4)</b>   | <b>1 (0-4)</b>                 | <b>3 (0-4)</b>                  | <b>&lt;0.001</b> | <b>3 (2-4)</b>                      | <b>&lt;0.001</b>   | <b>0.37</b>         |
| <b>Modeling &amp; Statistical<br/>Significance (of 4)</b> | <b>2 (0-4)</b>                 | <b>3 (2-4)</b>                  | <b>&lt;0.001</b> | <b>3 (2-4)</b>                      | <b>&lt;0.001</b>   | <b>0.86</b>         |
| <b>Assessing Assumptions (of 4)</b>                       | <b>1 (0-4)</b>                 | <b>2 (1-4)</b>                  | <b>&lt;0.001</b> | <b>2 (0-4)</b>                      | <b>&lt;0.001</b>   | <b>0.84</b>         |
| <b>Confounding &amp; Colinearity (of 4)</b>               | <b>0 (0-3)</b>                 | <b>3 (0-4)</b>                  | <b>&lt;0.001</b> | <b>3 (0-4)</b>                      | <b>&lt;0.001</b>   | <b>0.53</b>         |
| <b>Interaction (of 3)</b>                                 | <b>0 (0-3)</b>                 | <b>2 (0-3)</b>                  | <b>&lt;0.001</b> | <b>2 (0-3)</b>                      | <b>&lt;0.001</b>   | <b>0.82</b>         |

# REGRESS: Initial External Validation

| REGRESS Scores (out of 27)      | N  | Mean (SD)  | P-value |
|---------------------------------|----|------------|---------|
| <b>Pre-Course</b>               |    |            |         |
| University of Michigan Students | 52 | 11.3 (2.8) |         |
| Mayo Students                   | 52 | 9.3 (4.3)  | 0.018   |
| <b>Post-Course</b>              |    |            |         |
| University of Michigan Students | 52 | 15.2 (3.1) |         |
| Mayo Students                   | 59 | 19.0 (3.5) | <0.0001 |
| Statisticians                   | 22 | 20.1 (3.5) | <0.0001 |

# REGRESS: Initial External Validation



# REGRESS: Initial External Validation

|  | Pre-course          | Post-Course         | Pre vs. Post      |
|--|---------------------|---------------------|-------------------|
| Summary                                      | Mean (SD)           | Mean (SD)           | P-value           |
| <b>REGRESS (out of 27)</b>                   | <b>11.29 (2.84)</b> | <b>15.17 (3.05)</b> | <b>&lt;0.0001</b> |
| SLR Score (out of 11)                        | 7.37 (1.46)         | 7.92 (1.61)         | 0.0145            |
| Domain                                       | Median (range)      | Median (range)      |                   |
| Interpreting and Using SLR Equation (of 8)   | 5.0 (2-7)           | 5.5 (2-8)           | 0.0054            |
| Interpreting and using MLR Equation (of 4)   | 1.5 (0-4)           | 2.0 (0-4)           | <0.0001           |
| Modeling and Statistical Significance (of 4) | 2.0 (0-4)           | 3.0 (1-4)           | <0.0001           |
| Assessing Assumptions (of 4)                 | 1.0 (0-3)           | 2.0 (0-4)           | 0.0052            |
| Confounding and Colinearity (of 4)           | 1.0 (0-3)           | 2.0 (0-4)           | <0.0001           |
| Interaction (of 3)                           | 1.0 (0-2)           | 1.0 (0-3)           | 0.0007            |

# Assessment Instruments: Current Status

- Biostatistics Mastery Assessment of Proficiency (Biostatistics MAP)
  - Internal validation done
- Global Regression Expectations in Statistics (REGRESS)
  - Internal validation done (Enders, 2013)
  - 1<sup>st</sup> external validation done (Kidwell, 2014)
  - Currently creating next version
  - Planning a larger external validation for 2014-2015

# Consensus on the Competencies

# CTS Statistics Competencies (2011)

## Four Competencies Added by CTSA Consortium

Describe the role that biostatistics serves in biomedical and public health research.

Defend the significance of data and safety monitoring plans.

Collaborate with biostatisticians in the design, conduct, and analyses of clinical and translational research.

Evaluate computer output containing the results of statistical procedures and graphics.



## Next Steps

- Update CTS competencies for statistics
  - Modify further?
  - Get buy-in from CTSA PIs
- Assess which competencies are taught to whom
  - For which competencies would Consortium-wide training materials be helpful?
- Update instruments/items to better reflect CTS competencies

# Survey of ACTStat Attendees

- Consensus among statisticians
  - Preferred wording
  - Additions
  - Exclusions
- Competency level
  - Fundamental – Specialized

# ACTS Survey

- Competencies

- Which wording do you prefer?
- Should this competency be excluded?
- Specialized = 1
  - Only advanced learners in some areas need to achieve these competencies
- Fundamental = 9
  - Every CTS learner needs to achieve these competencies

- What's missing?

- Propose additional statistical competencies for CTS learners



# Questions & Discussion