

Response Patterns by Introductory Physics Students on Mathematics Diagnostic Tests

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Supported in part by NSF DUE #1504986 and #1914712

Outline

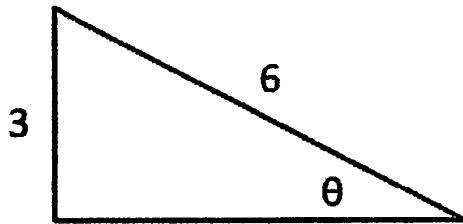
- We have explored the nature and prevalence of physics students' difficulties with elementary mathematics, using “stripped-down” problems with little or no physics context
- In collaboration with Ohio State University, we are developing and testing an online “skill-practice” tool to improve performance

Work to Date

- Administer (and analyze) written diagnostic quiz, given to > 5000 students at Tempe and Poly campuses of Arizona State University; calculators *are* allowed
- Carry out individual interviews with 75 students enrolled in those or similar courses during same period
- Comparison data: University of Colorado, algebra-based course ($N = 384$); Ohio State University, calculus- and algebra-based courses ($N > 1000$).*

*Thanks to Steve Pollock and Colin West (CU-Boulder), and Andrew Heckler and Beatriz Burrola Gabilondo (OSU)

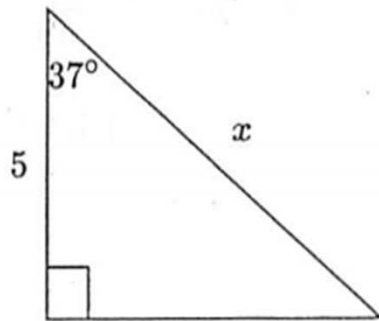
Find Unknown Angle



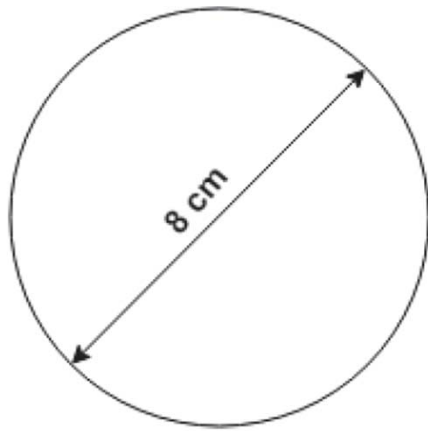
What is the value of θ ?

Find Unknown Side

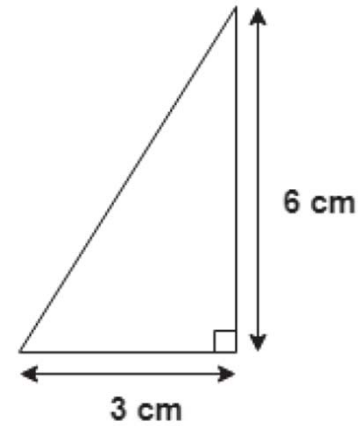
1. What is the length of side x ?



Find Area



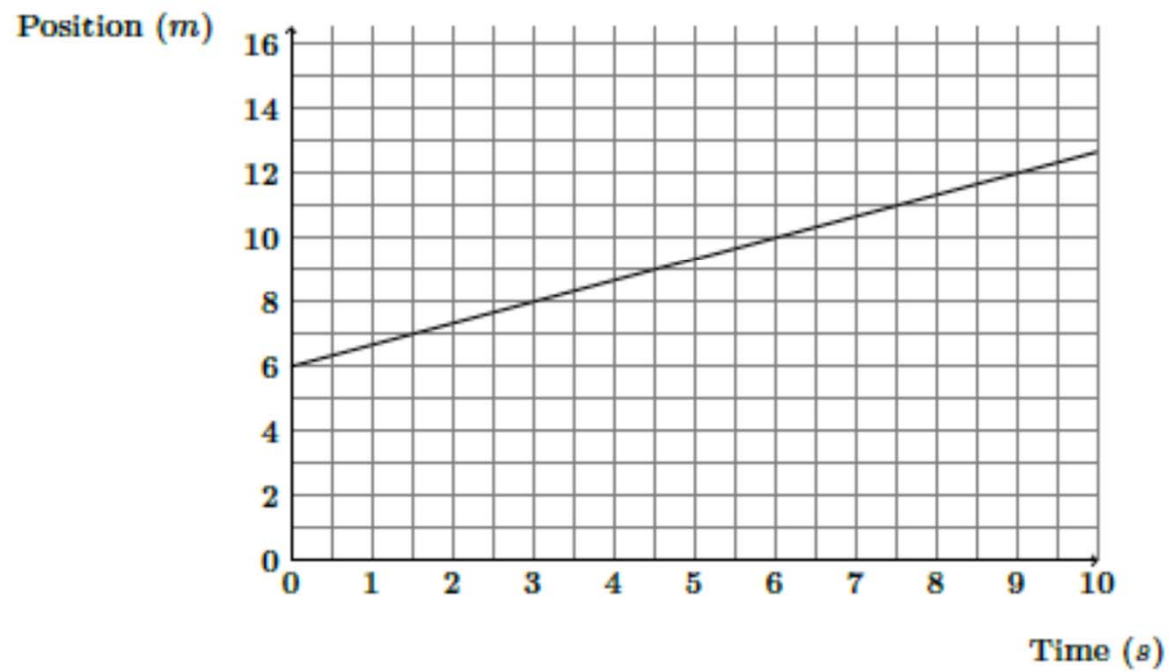
(a) Area of the circle =



(b) Area of the triangle =

Find Slope of Graph

What is the slope of the graph below?



Simultaneous Equations, Numeric Coefficients

What is the numerical value of x ?

$$0.5y = 2x$$

$$78.4 - y = 8x$$

Simultaneous Equations, Symbolic Coefficients

$$cy = dx$$

$$a - y = bx$$

$$x = ?$$

14. $v^2 = v_0^2 + 2ad$

$$v_0 = 0$$

$$a = \frac{v_1}{t_1}$$

$$v = \frac{v_1}{2}$$

$$d = ?$$

(Please clearly *circle* your answer and show all work.)

A. $d = v_1 t_1$ B. $d = \frac{v_1 t_1}{2}$ C. $d = \frac{v_1 t_1}{4}$ D. $d = \frac{v_1 t_1}{8}$ E. $d = \frac{v_1 t_1}{16}$

Symbolic Multiple-Choice Problem

4. Find the value of each of the following.

$$\cos(0^\circ) = ?$$

$$\sin(90^\circ) = ?$$

$$\tan(0^\circ) = ?$$

6. Solve for θ .

$$\gamma\theta + \eta = \lambda\theta + \omega$$

7. Solve for x .

$$ax + b = cx + d$$

$$10. 2\left(\frac{3}{4}\right) = ?$$

$$11. \frac{a/b}{c^2/d} = ?$$

$$\text{A. } \frac{ac^2}{bd} \quad \text{B. } \frac{ad}{bc^2} \quad \text{C. } \frac{bd}{ac^2} \quad \text{D. } \frac{bc^2}{ad}$$

(Some) Other Items

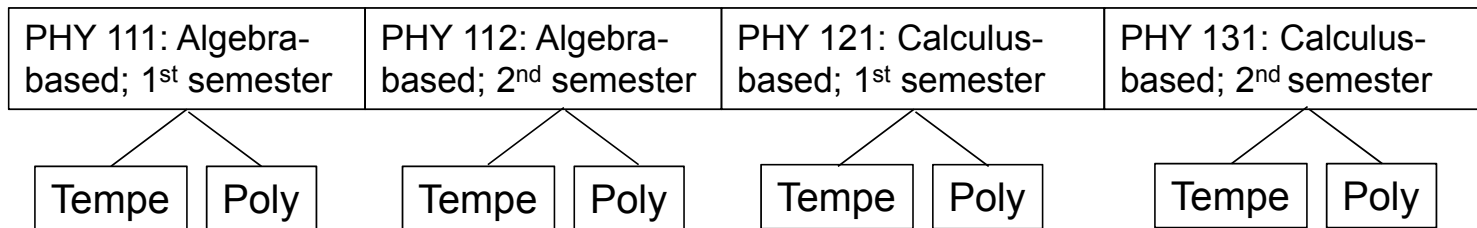
$$17. ax - dx = c$$

$$x = ?$$

Our Primary Sample Populations

PHY 111: Algebra-based; 1 st semester	PHY 112: Algebra-based; 2 nd semester	PHY 121: Calculus-based; 1 st semester	PHY 131: Calculus-based; 2 nd semester
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Our Primary Sample Populations



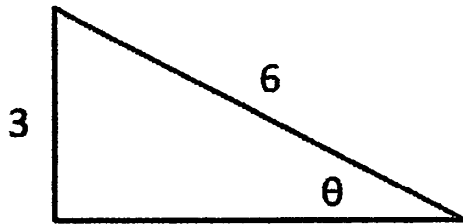
Findings

1. Difficulties with pre-college mathematical operations are widespread among students in both algebra- and calculus-based courses; average error rates range from 20-70%;
2. Results were highly consistent among four different campuses at three different state universities (ASU Tempe, ASU Poly, CU-Boulder, Ohio State U.)
3. Performance on algebraic problems using *symbols* for constant coefficients is significantly worse than on problems using numbers, for all populations;
4. Despite the great diversity of diagnostic item types, students' item responses were *highly* correlated with each other, and with *total* score on test
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5. Differences between universities were observed (e.g., CU-Boulder scored 20% higher than ASU-Tempe), but *individual* item scores co-varied consistently and predictably
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“Find Unknown Angle”

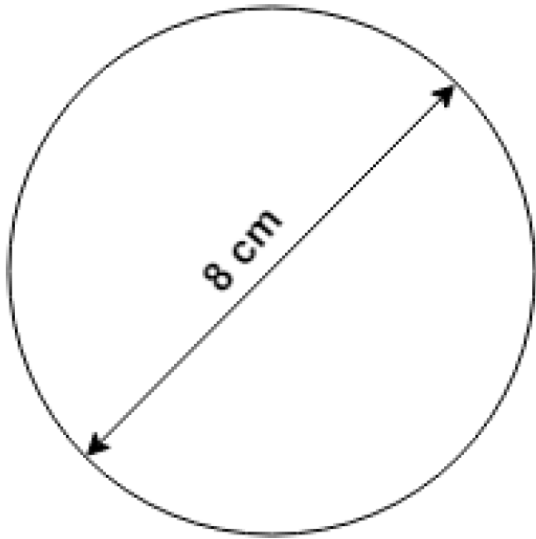


What is the value of θ ?

Algebra-based course, 2018

ASU-Poly: 35% correct ($N = 152$)

ASU-Tempe: 52% correct ($N = 533$)



Algebra- and Calculus-based courses combined, 2018

ASU-Poly: 57% correct ($N = 250$)

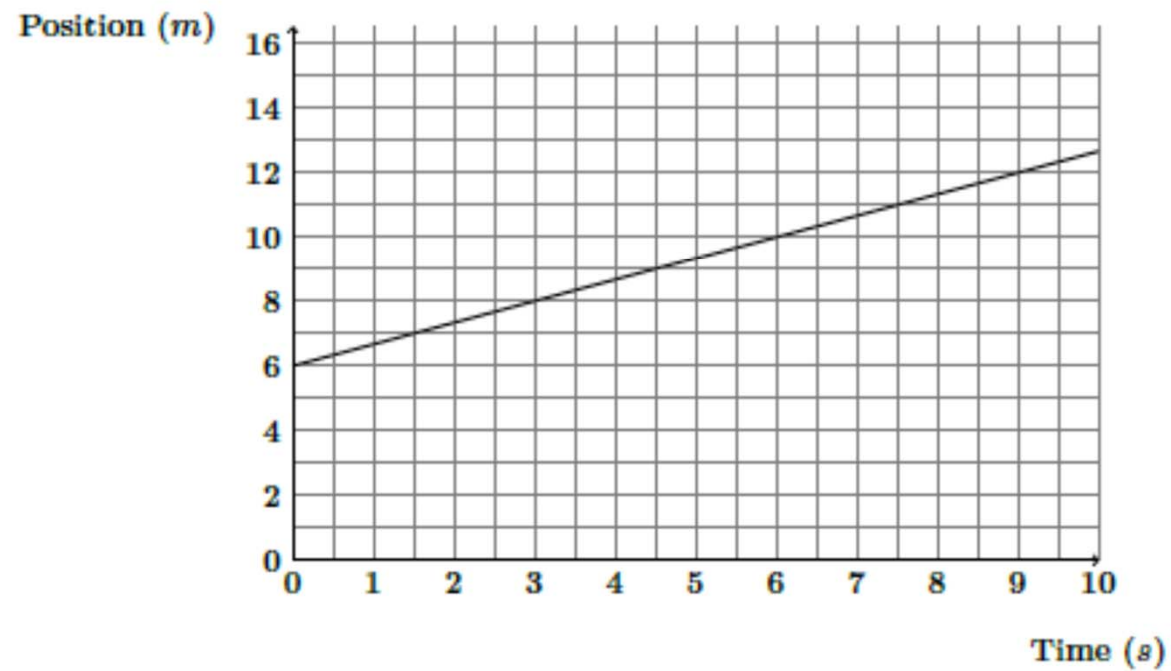
ASU-Tempe: 76% correct ($N = 1086$)

...with correct units: 29% and 45% correct, respectively

(a) Area of the circle =

All courses: 30-60% correct ($N > 2000$)

What is the slope of the graph below?



$$cy = dx$$

$$a - y = bx$$

$$x = ?$$

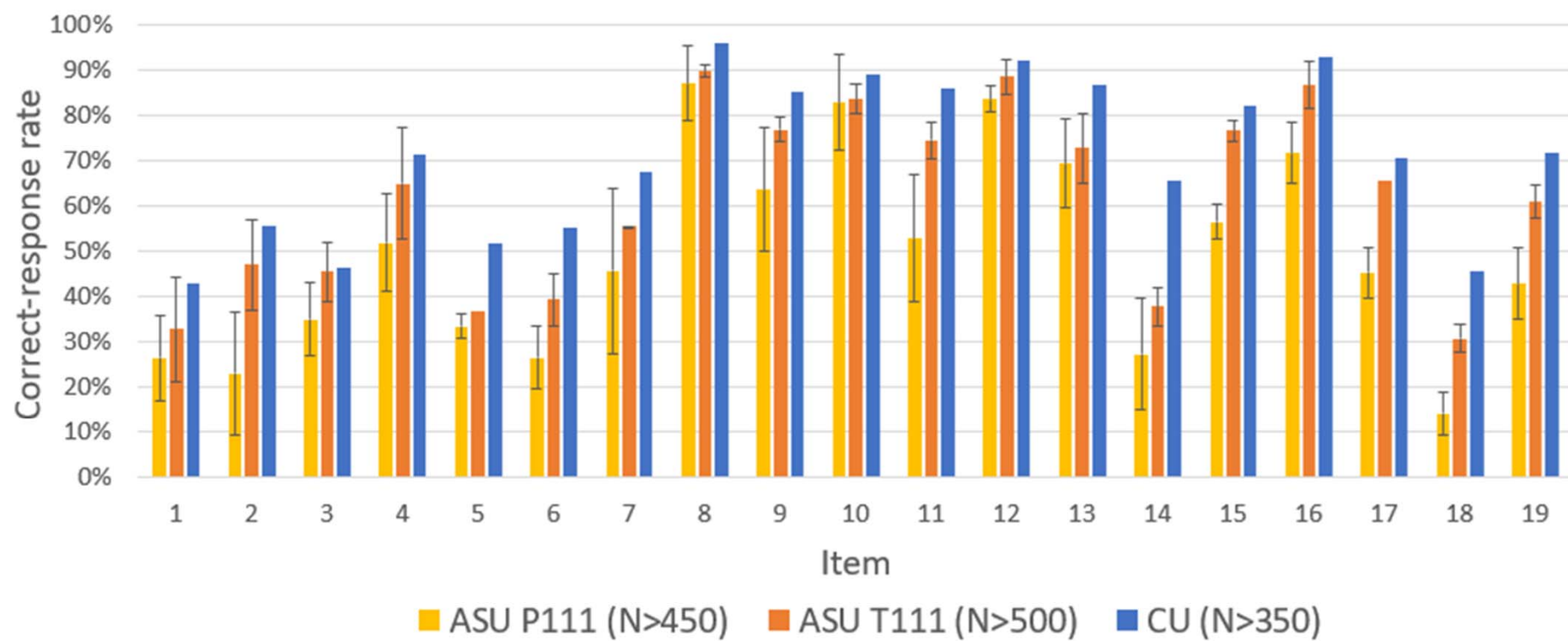
Calculus-based course, 2018

ASU-Tempe: 55% correct ($N = 862$)

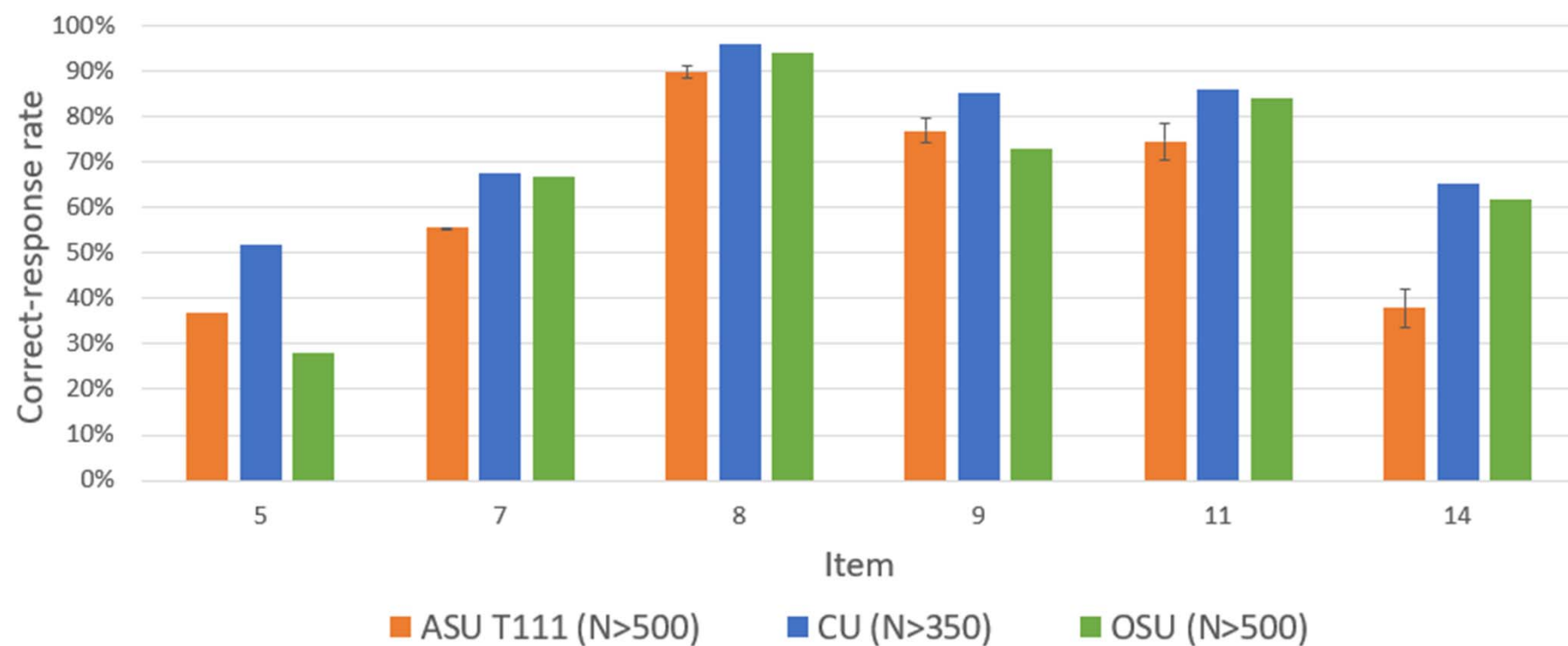
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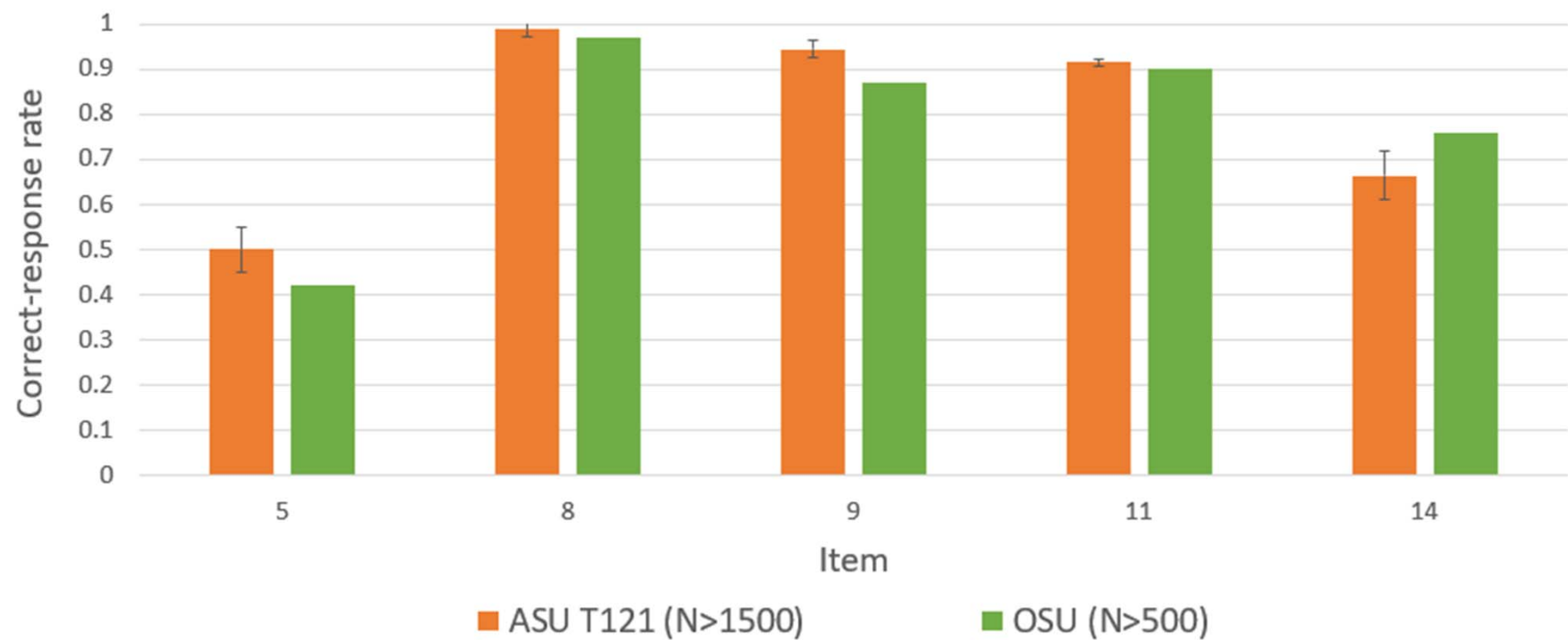
Correct-response rates: algebra-based course



Correct-response rates: algebra-based course



Correct-response rates: calculus-based course



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Algebra: Symbolic vs. Numeric Coefficients

Calculus-based course, 1st semester (% correct; ASU-Tempe, 2018 fall + spring)

What is the numerical value of x ?

$$78.4 - y = 8x$$

$$0.5y = 2x$$

Numeric version

79% correct ($N = 1043$)

$$cy = dx$$

$$a - y = bx$$

$$x = ?$$

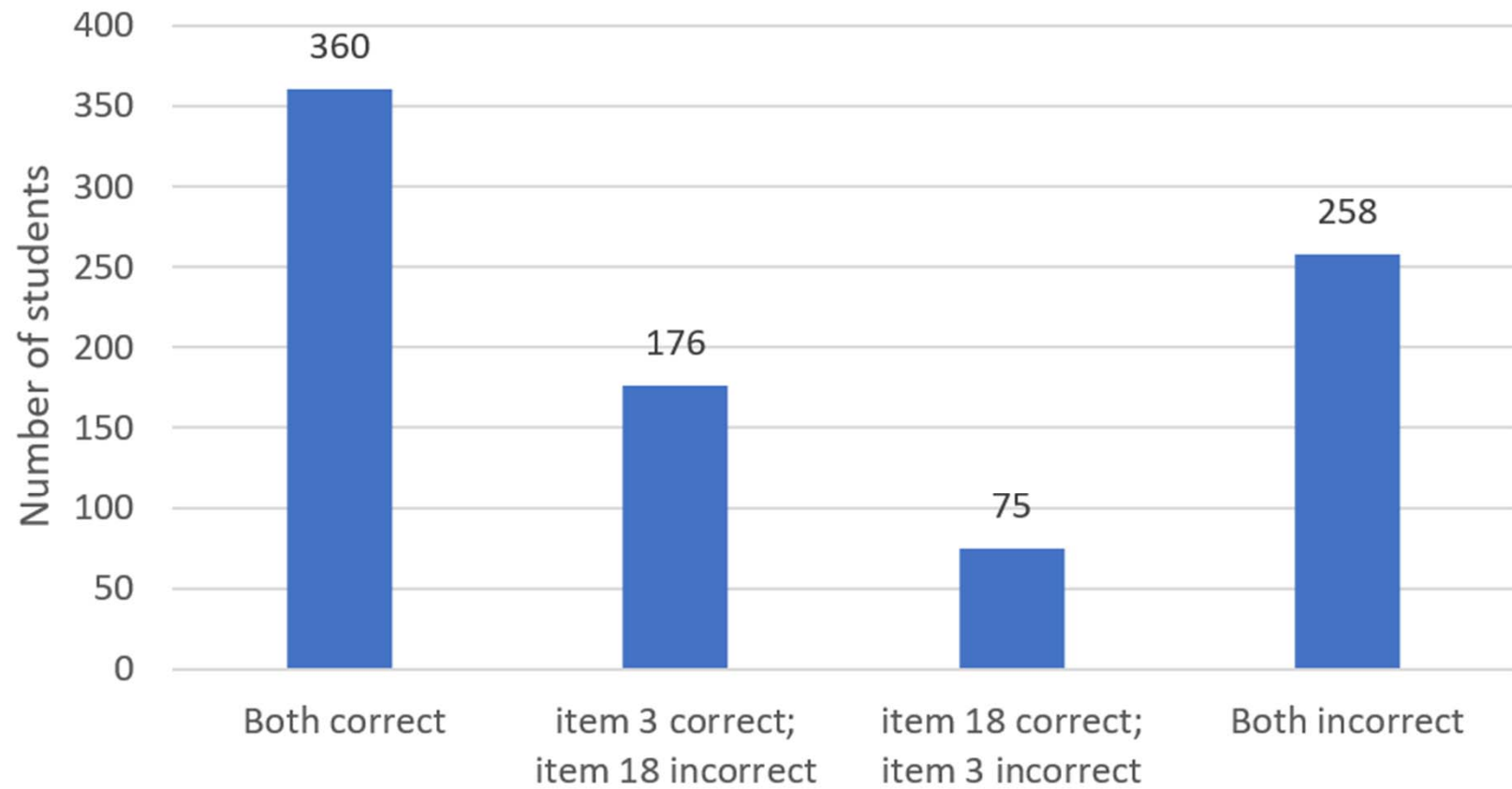
Symbolic version

55% correct ($N = 862$)

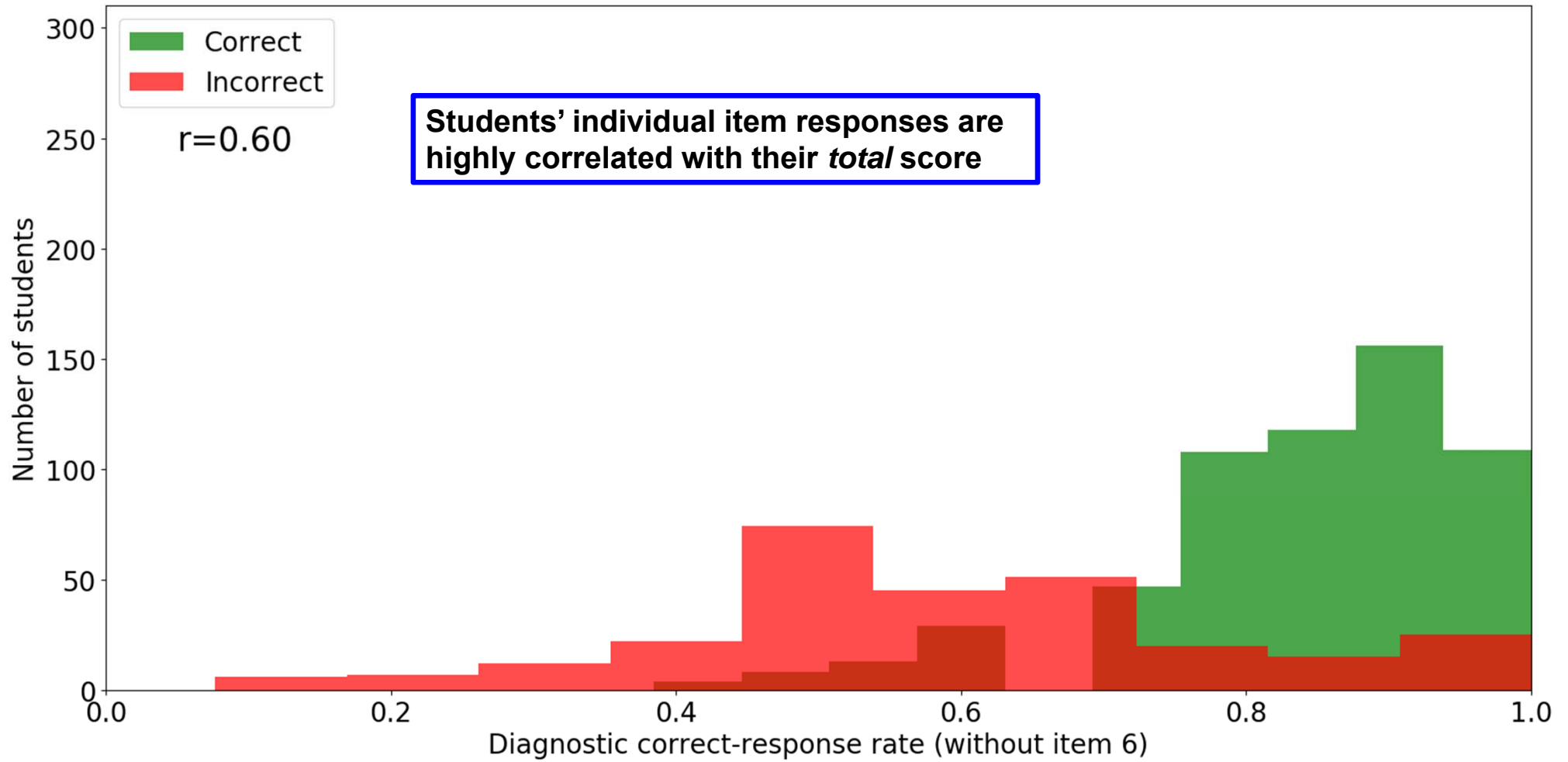
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Performance on items 3 and 18 ($r = 0.43$)

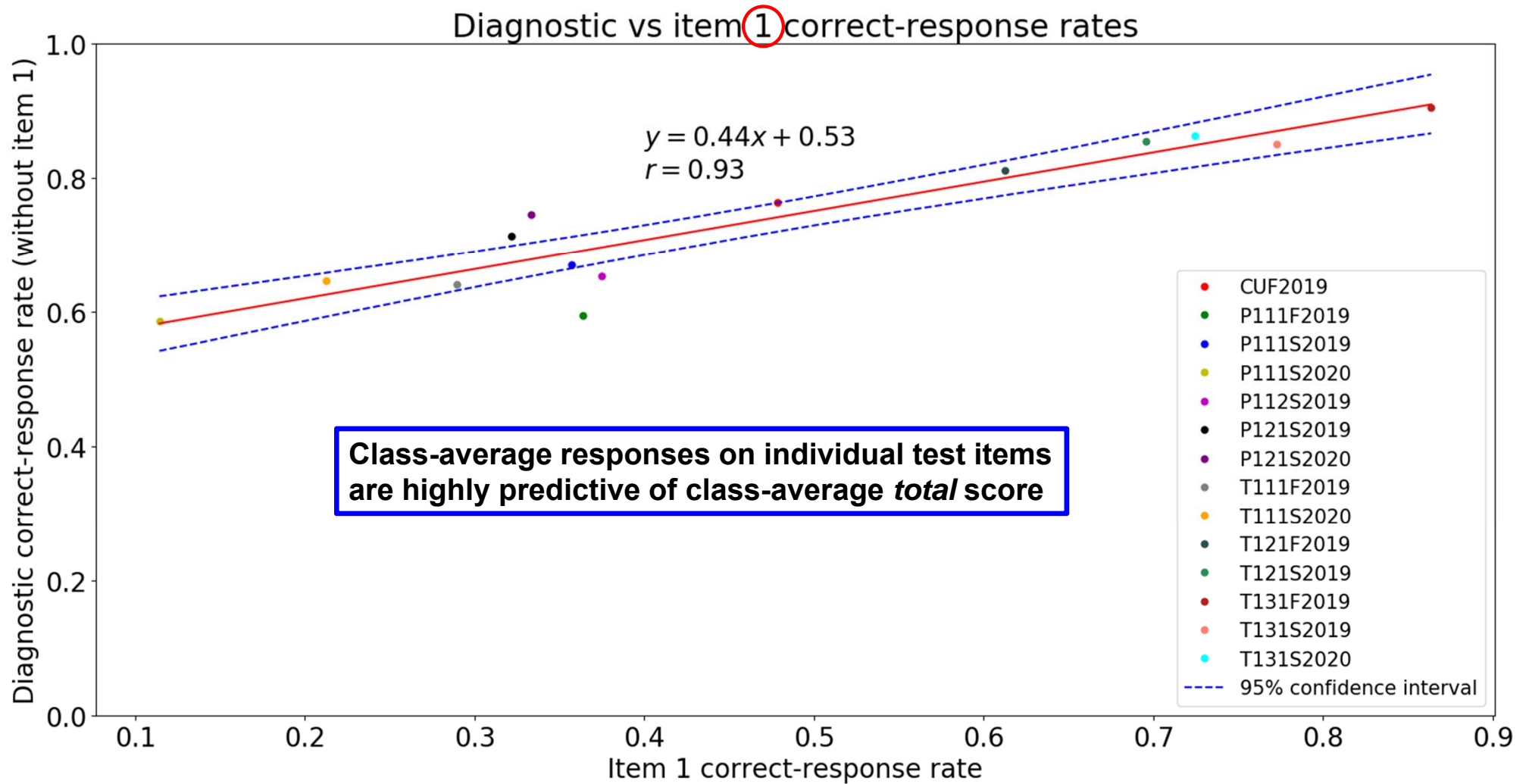


Student distribution: item 6

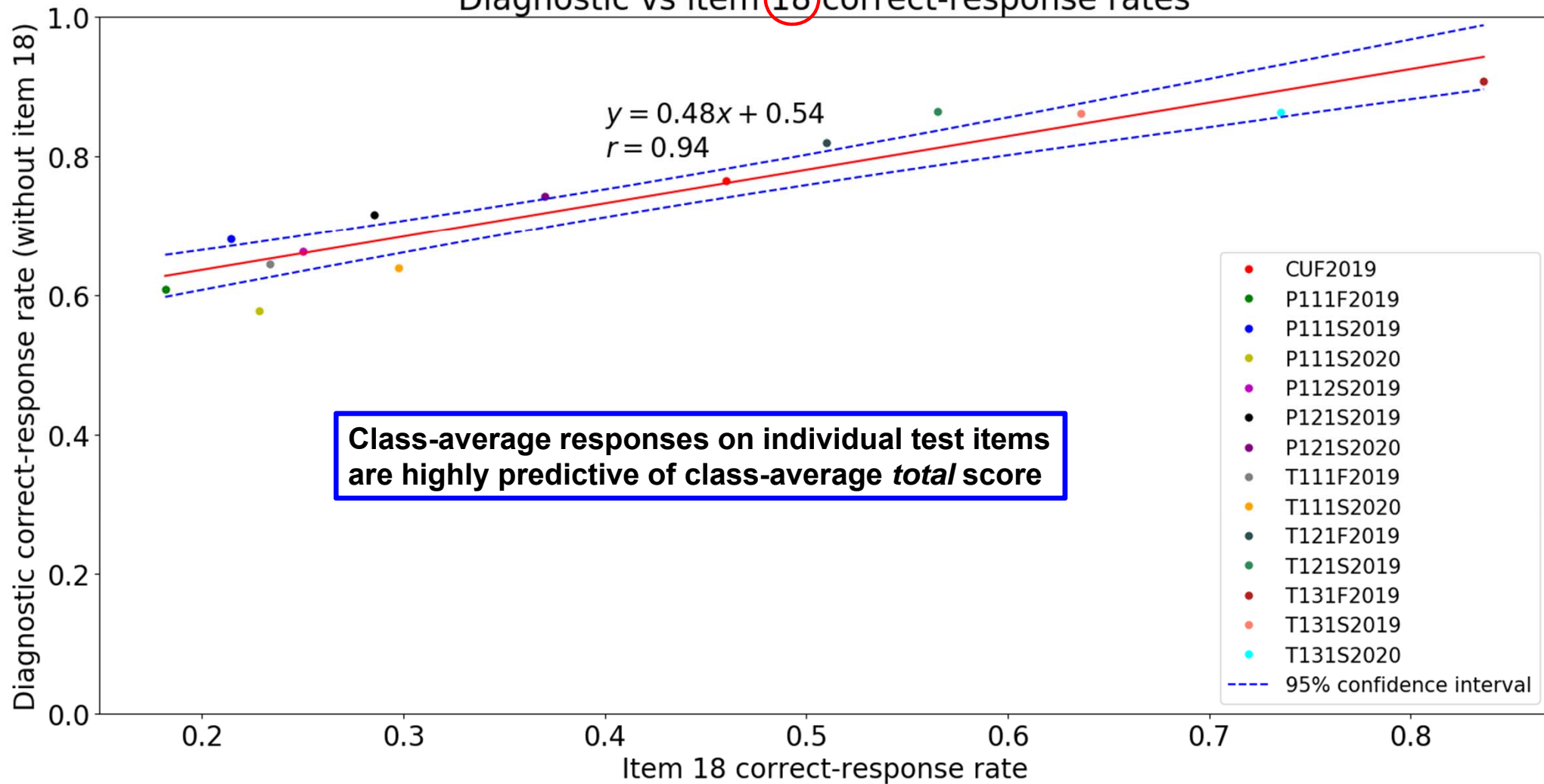


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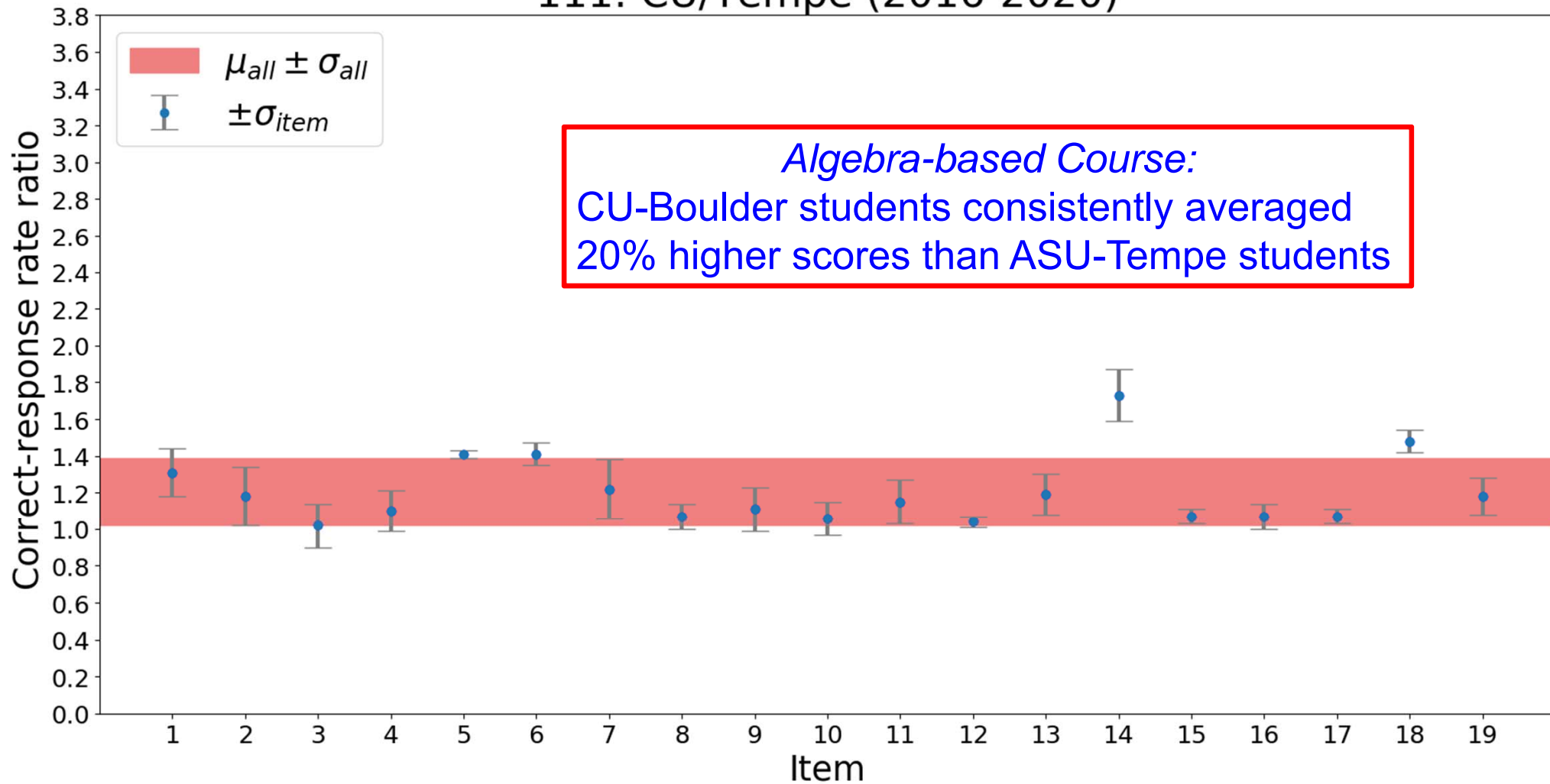
Diagnostic vs item 18 correct-response rates



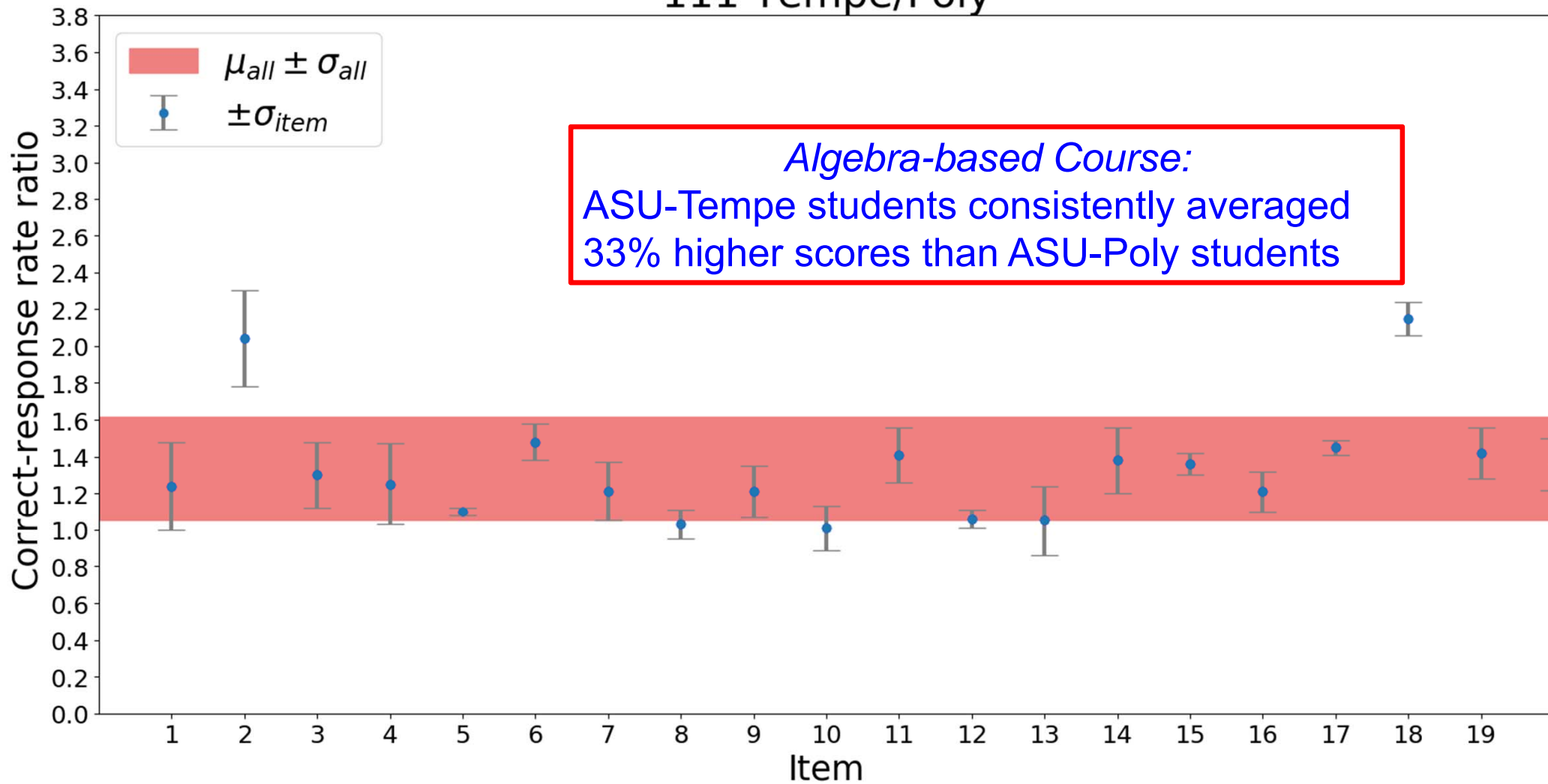
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111: CU/Tempe (2016-2020)



111 Tempe/Poly

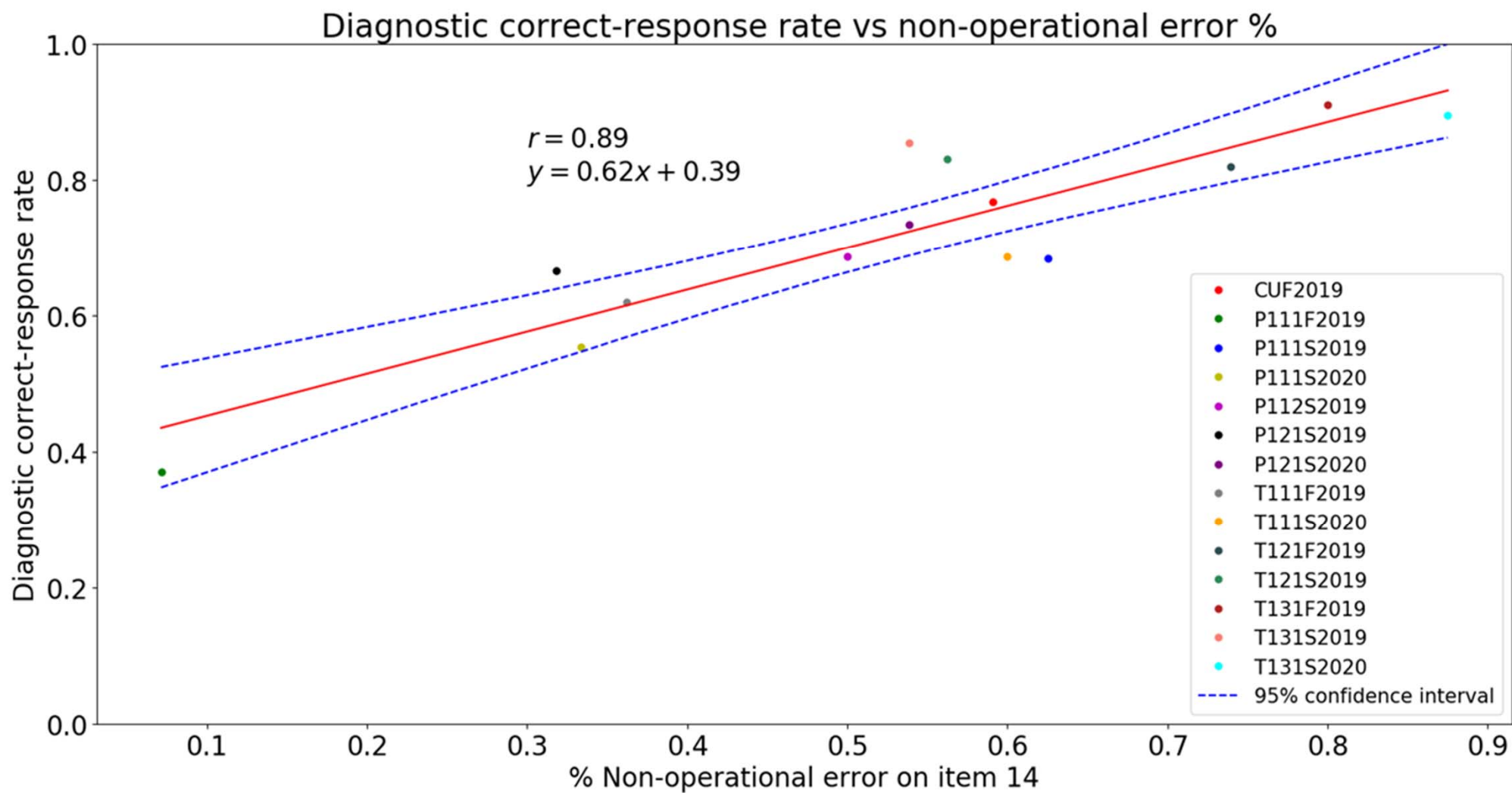


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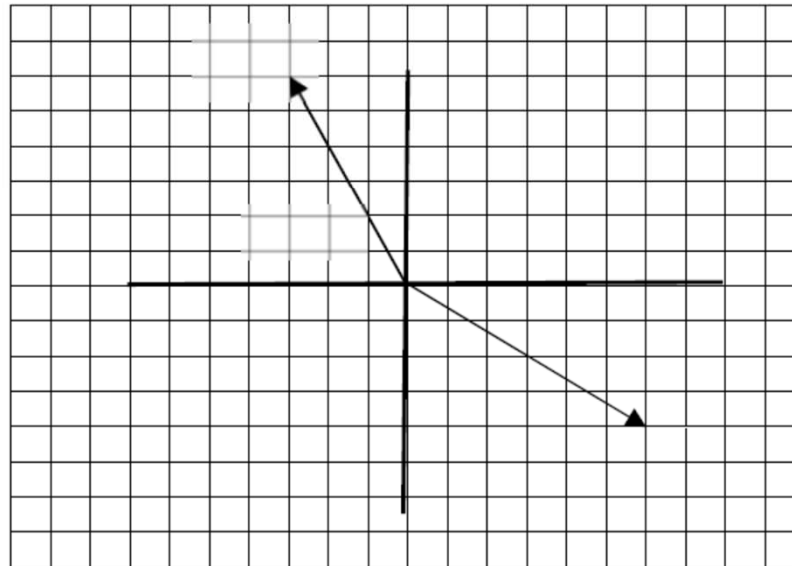


Possible Instructional Strategies

- Difficulties due to **skill-practice deficits** might be addressed by short-term, in- and out-of-class tutorials and assignments, designed to refresh students' previously learned knowledge and skills (e.g., Mikula and Heckler, 2017)
 - Current project, OSU + ASU, NSF DUE #1914709/1914712
 - Regular low-stakes on-line homework assignments requiring multiple consecutive correct answers
- Inclusion of multi-step contexts in these assignments *may* reduce the prevalence of non-operational errors as well.

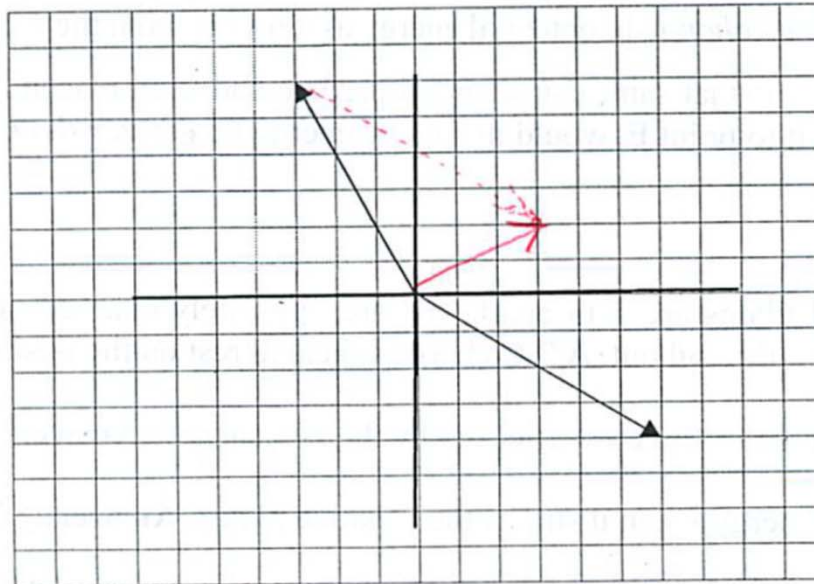
Pretest (February 13)

2. A charge at the origin experiences electrical forces from two separate source charges (source charges are not shown; the arrows represent those two forces). Draw an arrow to represent the net electrical force acting on the charge at the origin.



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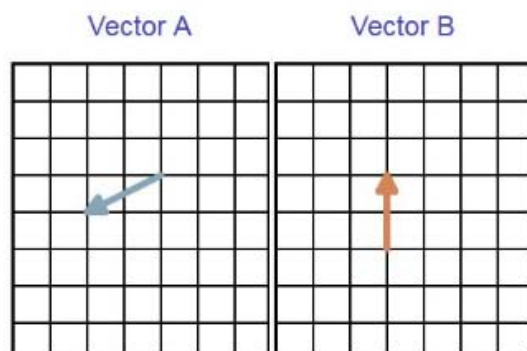


$$x: 6 - 3 = +3$$

$$y: 6 - 4 = +2$$

Instructional Intervention

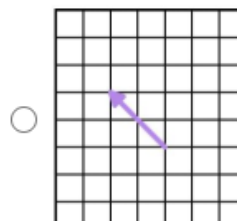
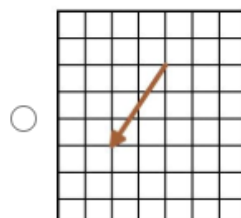
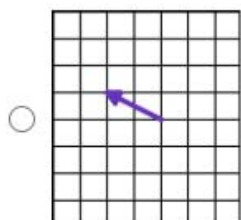
- Initial instruction and group practice in class *before* pretest was administered
- Virtually *no* in-class review after pretest
- Three rounds (one every two weeks) of online “Essential Skills” [from Ohio State University] practice assignments (homework points awarded for completion of four correct items in a row) *before* post-test



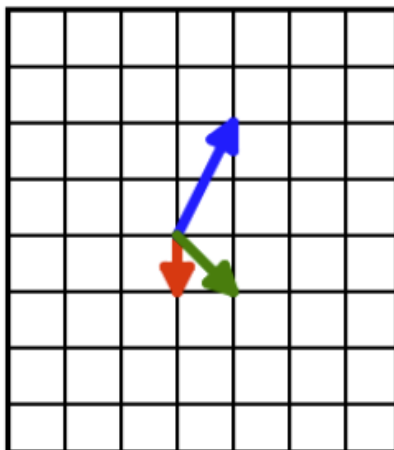
“Essential Skills” practice, example #1

Vector \vec{A} and Vector \vec{B} are shown above.

Which of the following options represents the vector sum, $\vec{A} + \vec{B}$?



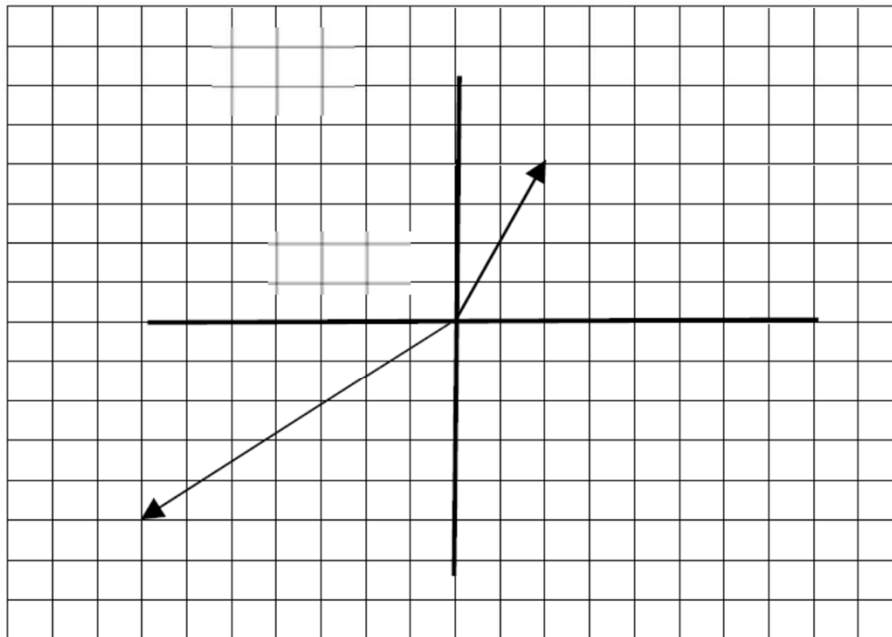
“Essential Skills” practice, example #2



Three forces (vector A, vector B, and vector C) are shown above in free-body diagram form. Which of the options below represents the net force?

Posttest (April 2)

1. A charge at the origin experiences electrical forces from two separate source charges (source charges are not shown; the arrows represent those two forces). Draw an arrow to represent the net electrical force acting on the charge at the origin.



Results on Vector-Diagram Problem

$N = 39$ (Matched, pre- and post)

Class Average Pretest Score: 44%

Class Average Posttest Score: 79%

(Difference in means significant, $p < 0.001$)

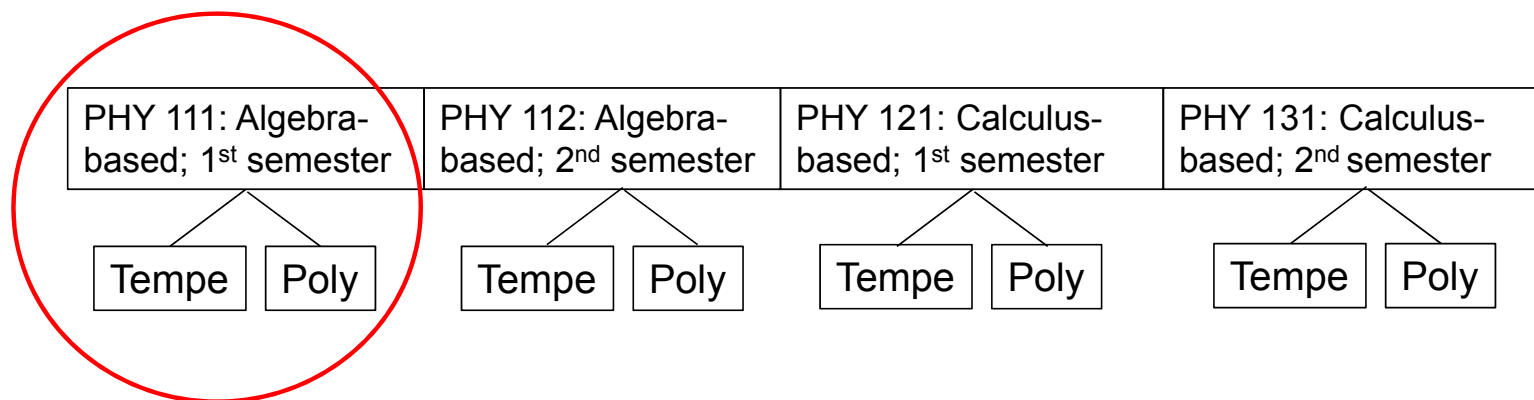
Summary

- Physics students' mathematical errors have a variety of causes
- Errors due to skill-practice deficits with “unfamiliar” operations (such as vectors) may be addressable through regular, brief online assignments
- Errors due to deeply-ingrained difficulties carried over from K-12 instruction may be harder to address

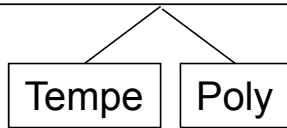
Possible Instructional Strategies

- Difficulties due to “**carelessness**” might be addressed by guiding students to (1) carefully check and re-check key steps in their calculation; (2) slow down, review problem statements, and re-solve when possible
- Other studies (e.g., G. White) have shown that much practice and repetition is needed to induce students to adopt consistent error-checking habits

Our 8 Sample Populations



Arizona State University:
Algebra-based; 1st semester



Our 3 Sample Populations

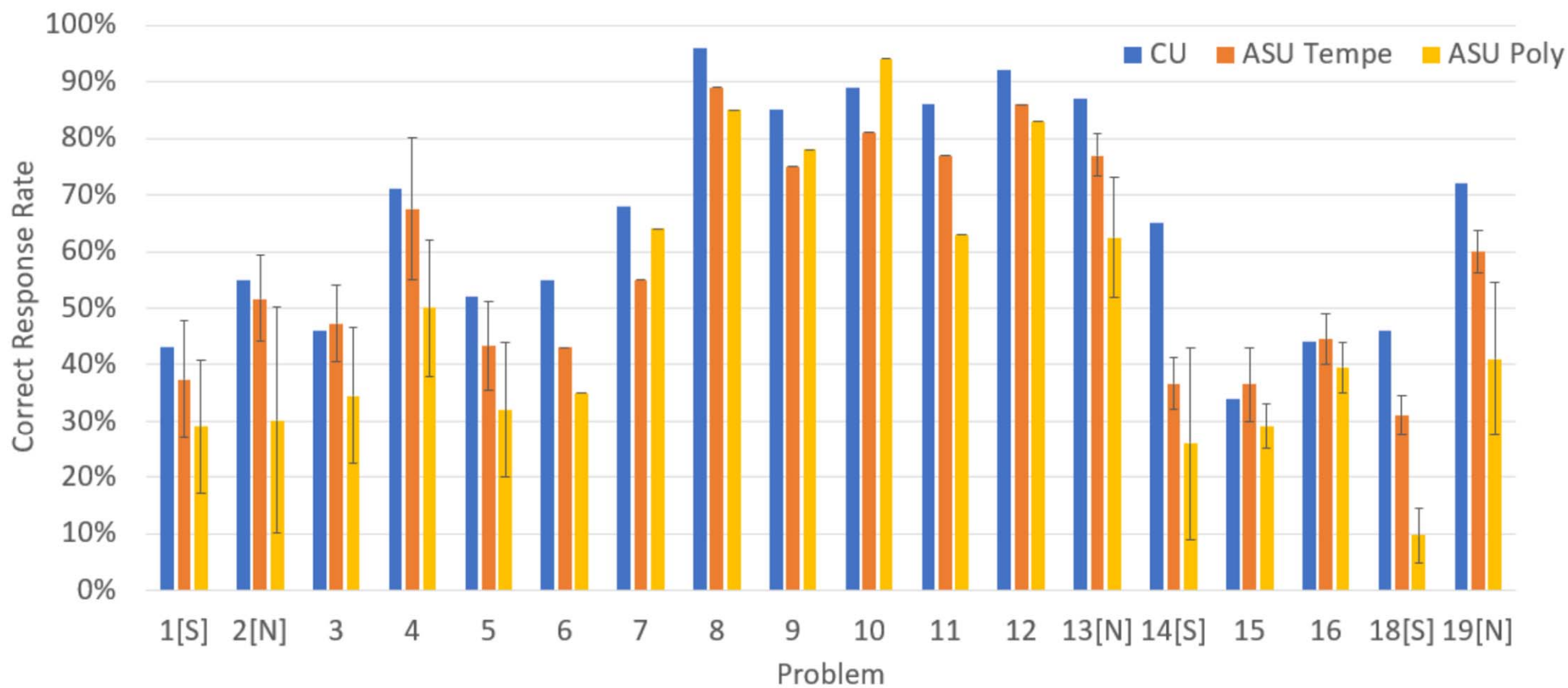
Arizona State University:
Algebra-based; 1st semester

Tempe

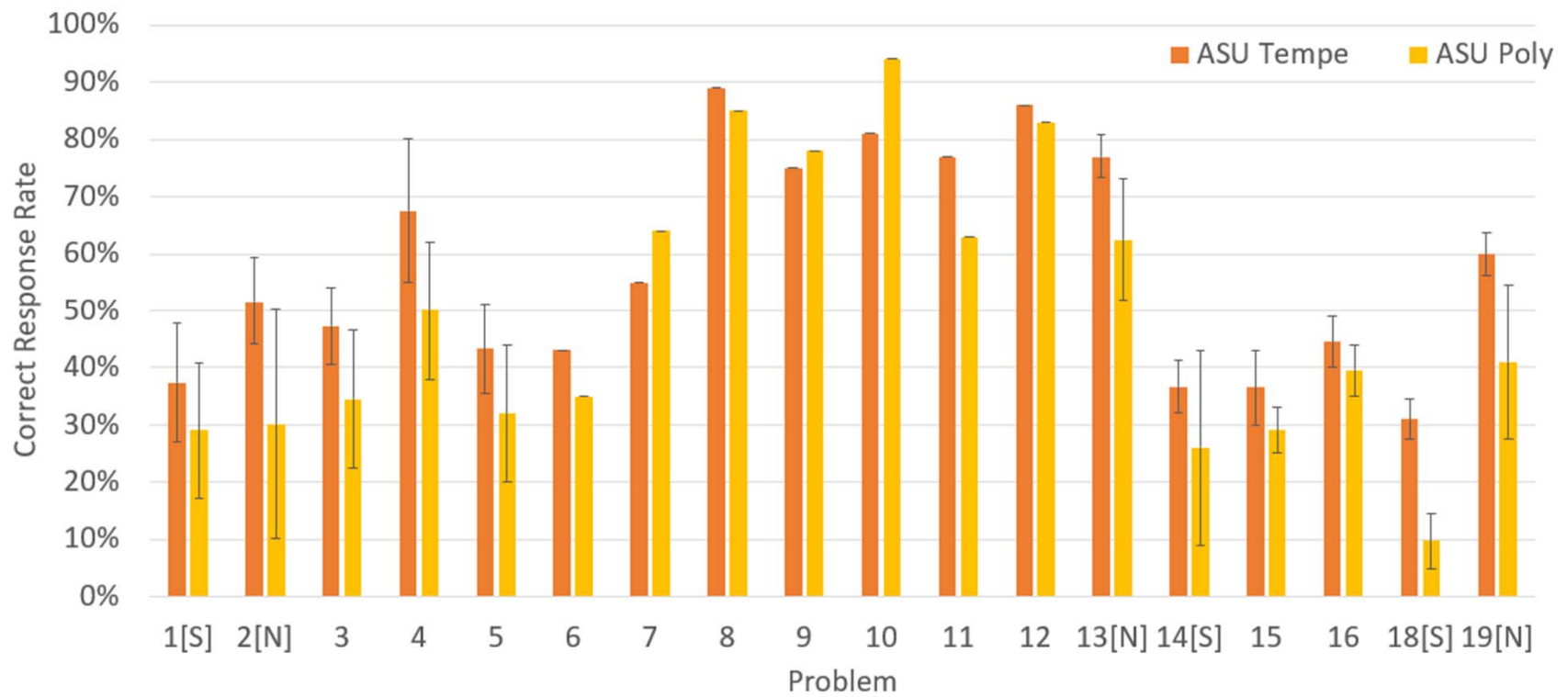
Poly

University of Colorado: Algebra-
based, 1st semester

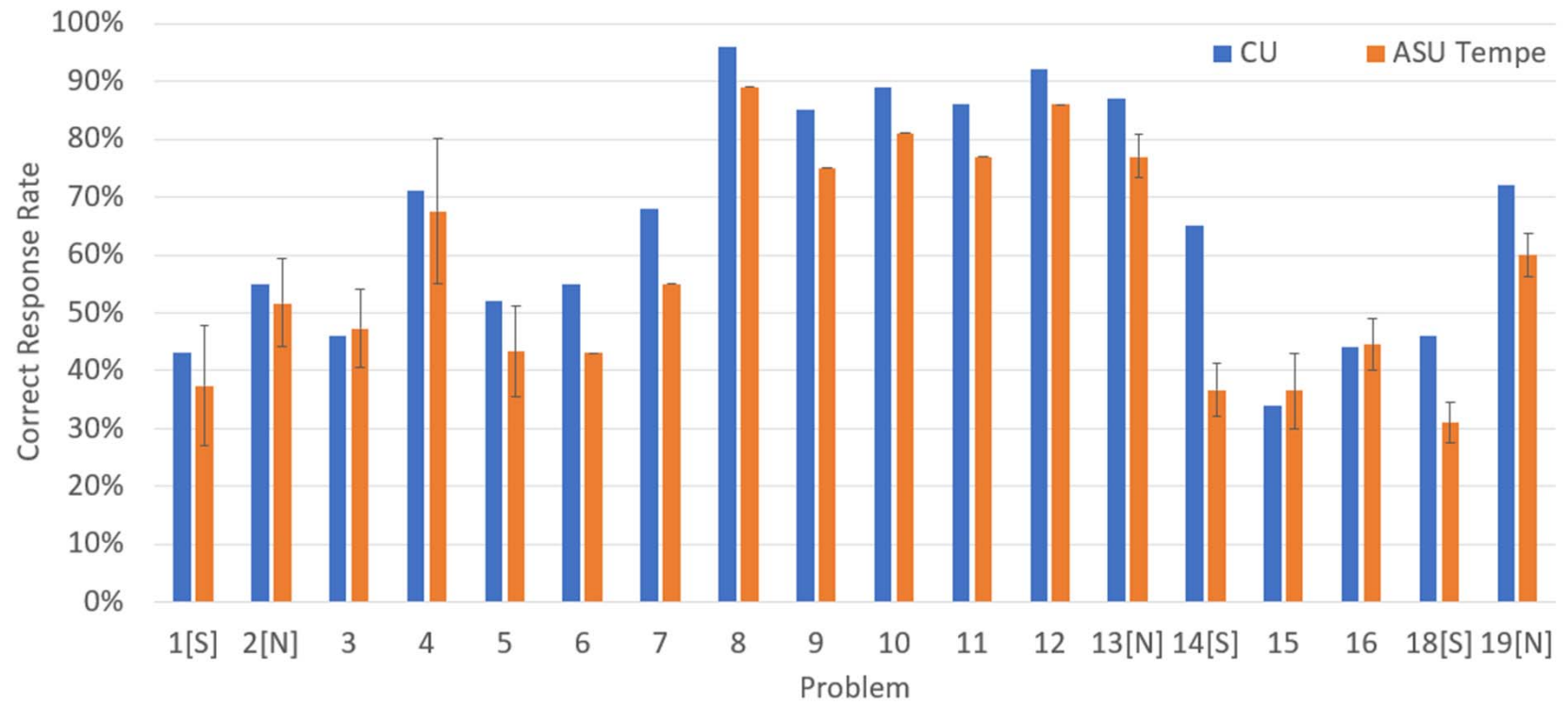
Correct Response Rates: All Problems and Campuses



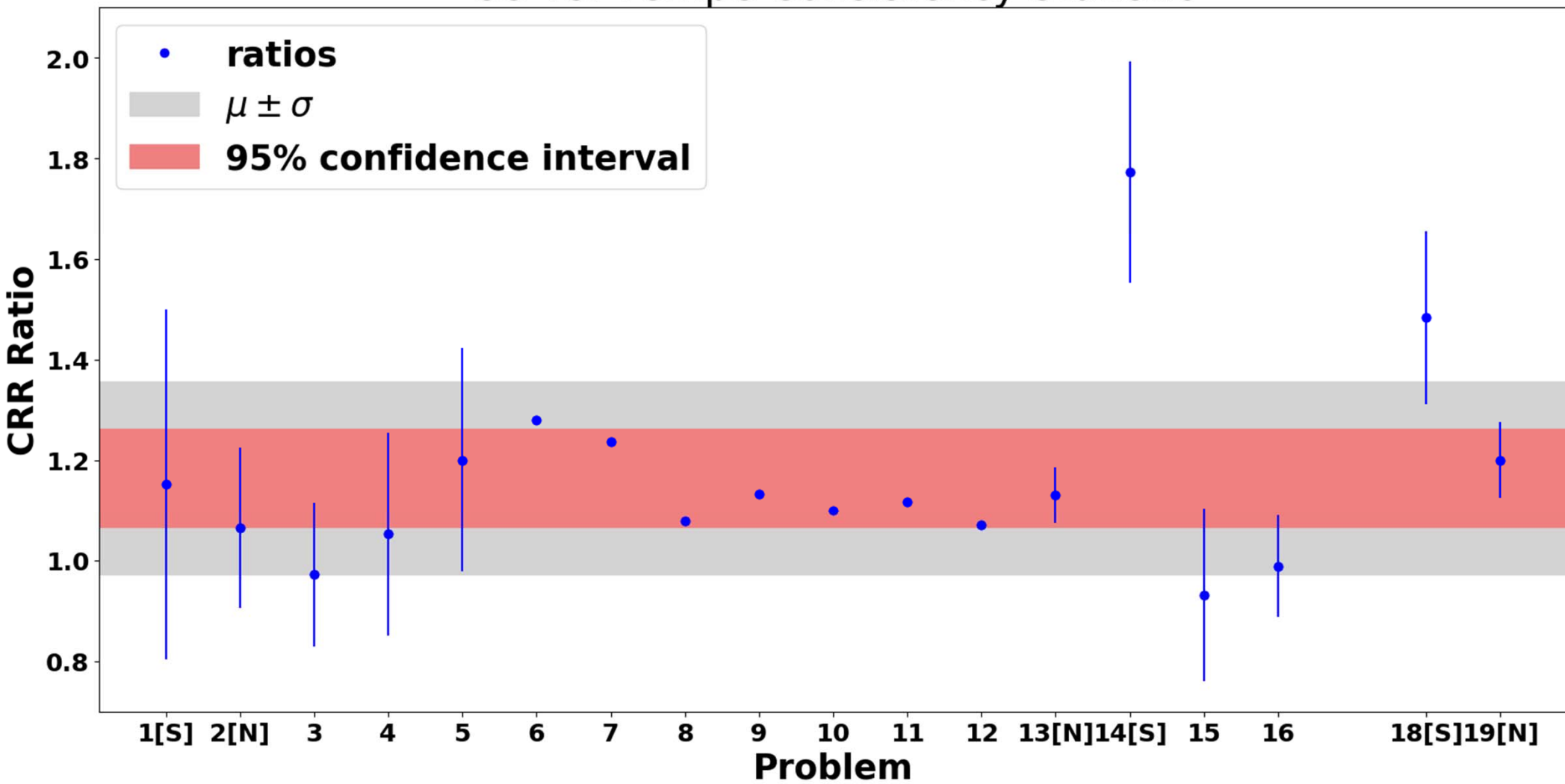
Correct Response Rates: Tempe vs. Poly



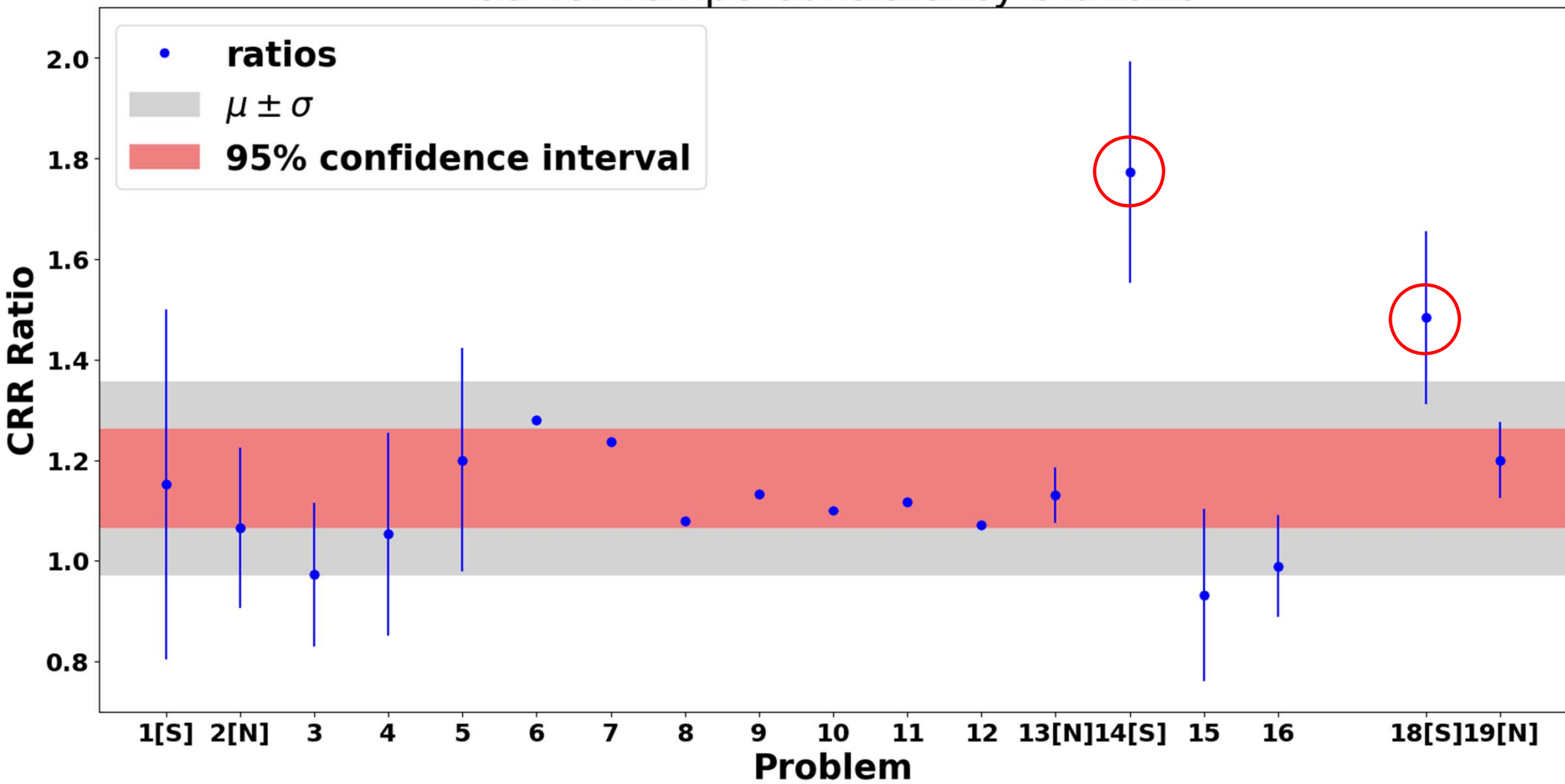
Correct Response Rates: CU vs. Tempe



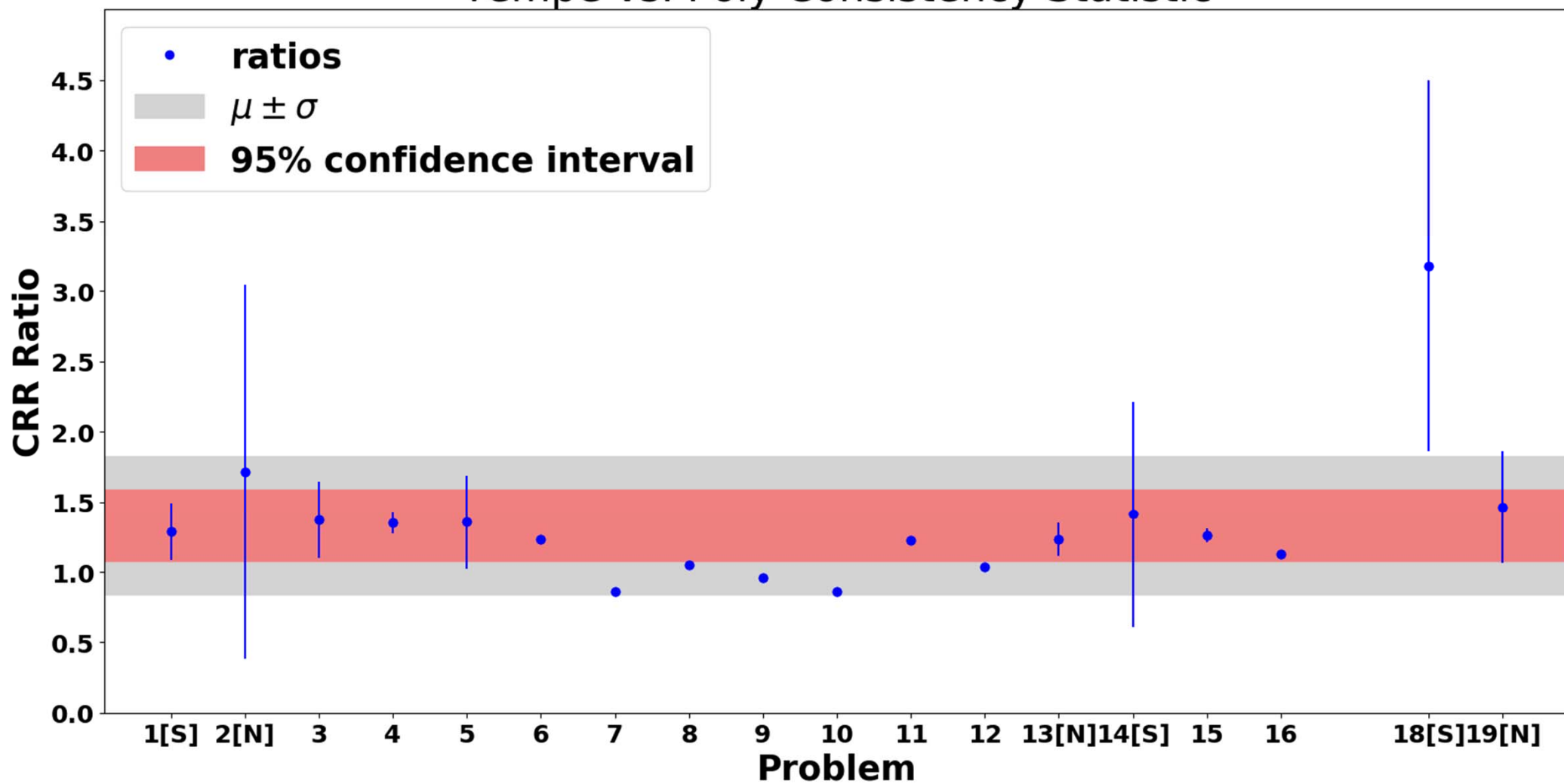
CU vs. Tempe Consistency Statistic



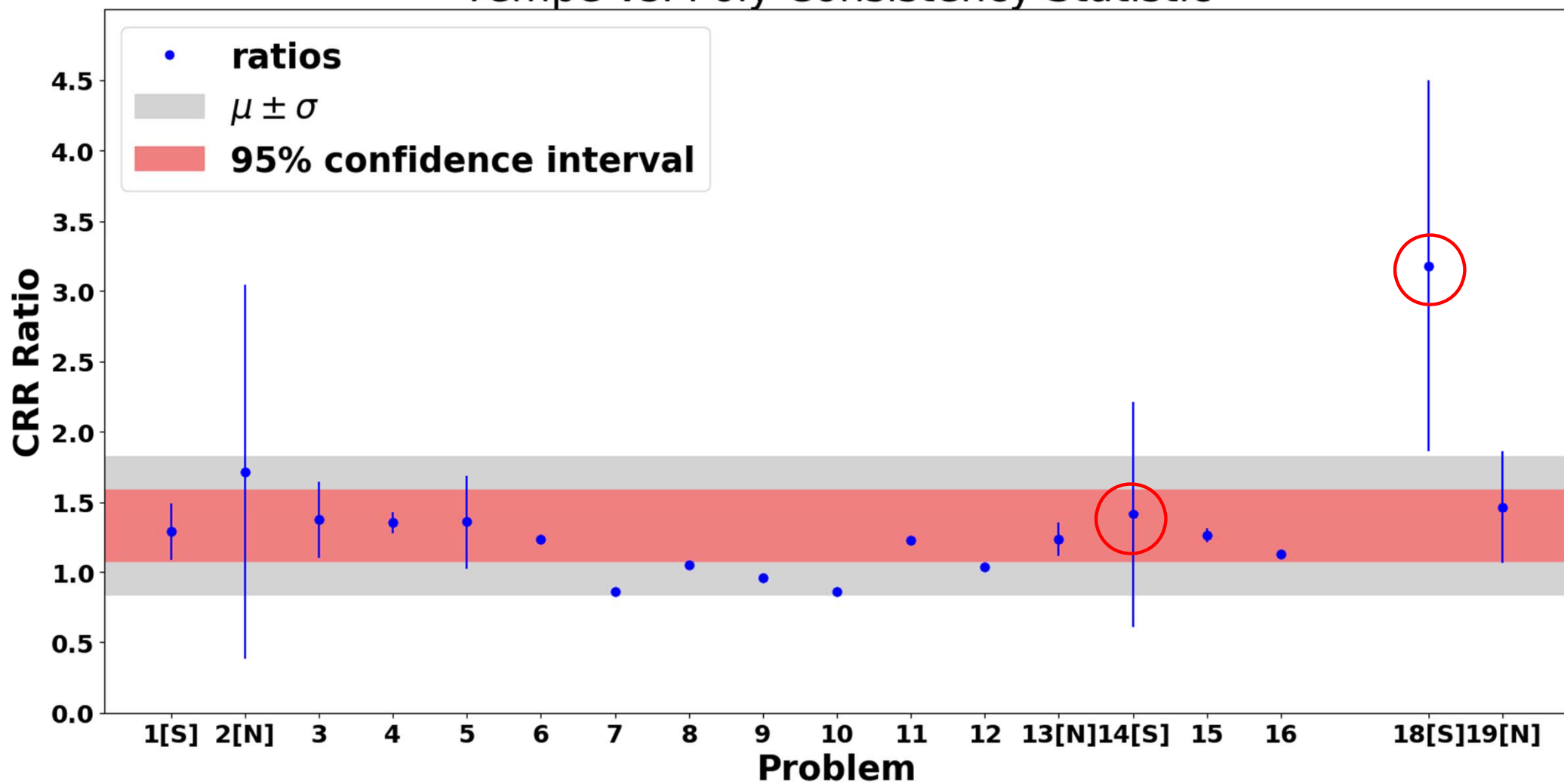
CU vs. Tempe Consistency Statistic



Tempe vs. Poly Consistency Statistic



Tempe vs. Poly Consistency Statistic



Item Responses Reflect Institutional Differences

- The correct-response rate (CRR) for CU on the 19 test items averages 16% higher than those at ASU-Tempe, while Tempe averages 33% higher than Poly, with ratios of all but two test items falling within fairly narrow bands (mean \pm 1 sd).
- Conjecture #1: The differences in mean CRRs reflect differences among the institutions' student populations
- Conjecture #2: Most of the (otherwise diverse) test items probe operational ability to similar “degrees”
- Conjecture #3: Another “level” of operational-ability difference is probed by the multi-step symbolic test items

Why the Difficulties with Symbols?

Some Suggestions Arising from the Interviews

- In elementary math courses, “simplified forms” of equations are emphasized (i.e., few messy symbols and functions).
- Many students get “overloaded” by seeing all the variables, and are unable to carry out procedures that they do successfully with numbers.
- Many students have had *insufficient practice* with algebraic operations to avoid being overwhelmed by standard algebraic manipulations.
 - Students tend to become *careless*

Error Types

- “Operational” Errors: Inadequate learning or expertise with fundamental operations
 - **Conceptual** confusion, e.g., What is an inverse sine? What is slope?
 - Weak **skills** with numerical and/or algebraic operations (e.g., factoring)
 - Inadequate **practice** with symbolic operations (e.g., dividing fractions)
- “Non-operational” Errors: Difficulties connecting context of problem to context in which operations were learned
 - Physics context, e.g., position-time graph with appropriate units
 - Problems involving multiple linked steps, each involving basic operations

Weak Operational Skills, or Carelessness?

- We define “non-operational errors” as errors that occur when the student apparently demonstrates knowledge of the mathematical operations needed to solve individual steps of a multi-step problem, yet fails to solve the problem correctly
 - causes for error might include not accessing previously learned skills, or not exercising sufficient care.
- With certain assumptions, we can estimate the percentage of students that solved certain problems incorrectly because of “non-operational errors”

Possible Origins of Errors

- We assume several different possible sources for students' errors:
 - Difficulty with operations: Inadequate learning or expertise with fundamental operations, including symbolic operations
 - Difficulty accessing knowledge: Students don't connect context of problem to context in which operations were learned, e.g., "multi-step" context
 - "Careless" errors, due to simple inattention, lack of checking, etc.; can be corrected (in principle) by greater attentiveness.
 - (*Note: ≈50% of errors were "self-corrected" during interviews*)