# Multiple predictors of performance in introductory general physics courses 

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## Assessment Pretests

- Diagnostic pretest covering pre-college mathematics ("Math")
- calculators allowed
- Pre-instruction tests of scientific reasoning skill and physics concept knowledge:
- Lawson Test of Scientific Reasoning ("Lawson")
- Force Concept Inventory (FCI)


## Mathematics Diagnostic Pretest

What is the length of side $x$ ?

A. $y \cos \left(z^{\circ}\right)$
B. $y \sin \left(z^{\circ}\right)$
C. $y \tan \left(z^{\circ}\right)$
D. $y / \cos \left(z^{\circ}\right)$
E. $y / \sin \left(z^{\circ}\right)$
F. $y / \tan \left(z^{\circ}\right)$
G. $\cos \left(z^{\circ}\right) / y$
H. $\sin \left(z^{\circ}\right) / y$
I. $\tan \left(z^{\circ}\right) / y$
J. $\sqrt{y^{2}+z^{2}}$
K. $\sqrt{z^{2}-y^{2}}$
L. $y / z$
(There may be more than one correct answer, but please select only ONE answer.)
A. $0 \quad$ B. 1
C. undefined
D. 0.707
E. 0.894
(There may be more than one correct answer, but please select only ONE answer.)

## $\sin \left(90^{\circ}\right)=?$

A. 0
B. 1
C. undefined
D. 0.707
E. 0.894
(There may be more than one correct answer, but please select only ONE answer.)
$\tan \left(0^{\circ}\right)=?$
A. 0 B. 1
C. undefined
D. 0.707
E. 0.894
(There may be more than one correct answer, but please select only ONE answer.)

What is the value of $\theta$ ?

A. $\cos (3 / 6)$
D. $\cos ^{-1}(3 / 6)$
G. $30^{\circ}$
J. $27^{\circ}$
B. $\sin (3 / 6)$
E. $\sin ^{-1}(3 / 6)$
H. $45^{\circ}$
K. 3/6
C. $\tan (3 / 6)$
F. $\tan ^{-1}(3 / 6)$
I. $60^{\circ}$
L. 0.524
(There may be more than one correct answer, but please select only ONE answer.)

## Solve for $\theta$.

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

A. $\frac{\eta+\omega}{\gamma-\lambda}$
B. $\frac{\eta-\omega}{\lambda-\gamma}$
C. $\frac{\gamma-\lambda}{\omega-\eta}$
D. $\frac{\lambda-\gamma}{\eta-\omega}$
E. $\frac{\eta-\omega}{\gamma \lambda}$
F. $\frac{\omega-\eta}{\gamma \lambda}$
G. $\frac{\omega-\eta}{\gamma-\lambda}$
H. $\frac{\omega-\eta}{\gamma+\lambda}$
I. $\frac{\eta-\omega+\gamma}{\lambda}$
J. $\frac{\omega-\eta+\lambda}{\gamma}$
(There may be more than one correct answer, but please select only ONE answer.)

## Time ( $s$ )

A. $\frac{1}{3} \mathrm{~m} / \mathrm{s}$ because the object moves 1 meter in 3 seconds.
B. $\frac{1}{3} \mathrm{~m} / \mathrm{s}$ because the line rises 1 box while it goes 3 boxes in the hori-
C. $\frac{2}{3} \mathrm{~m} / \mathrm{s}$ because the object moves 2 meters in 3 seconds.
D. $\frac{2}{3} \mathrm{~m} / \mathrm{s}$ because the line rises 2 boxes while it goes 3 boxes in the horizontal direction

There may be more than one correct answer, but please select only ONE answer.)
$\frac{a / b}{c^{2} / d}=$ ?
A. $\frac{a c^{2}}{b d}$
B. $\frac{a d}{b c^{2}}$
C. $\frac{b d}{a c^{2}}$
D. $\frac{b c^{2}}{a d}$
(There may be more than one correct answer, but please select only ONE answer.)
$\left(\frac{a}{3}\right)^{3}=?$
A. $\frac{a^{3}}{3}$
B. $\frac{a}{27}$
C. $\frac{a^{3}}{27}$
(There may be more than one correct answer, but please select only ONE answer.)
$2\left(\frac{a}{b}\right)=?$
A. $\frac{2 a}{b}$
B. $\frac{2 a}{2 b}$
C. $\frac{a}{2 b}$
(There may be more than one correct answer, but please select only ONE answer.)
A. $\frac{6}{8}$
B. $\frac{12}{8}$
C. $\frac{3}{8}$
D. $\frac{3}{2}$
E. $\frac{3}{4}$
(There may be more than one correct answer, but please select only ONE answer.)


## Solve for x .

$\frac{3}{2}=7 x$
A. $\frac{14}{3}$
B. $\frac{3}{14}$
C. $\frac{21}{2}$
D. $\frac{21}{14}$
(a) Area of the circle $=$ ?

| A. $8 \pi \mathrm{~cm}^{3}$ | F. $8 \pi \mathrm{~cm}^{2}$ | K. $8 \pi \mathrm{~cm}$ |
| :--- | :--- | :--- |
| B. $16 \pi \mathrm{~cm}^{3}$ | G. $16 \pi \mathrm{~cm}^{2}$ | L. $16 \pi \mathrm{~cm}$ |
| C. $32 \pi \mathrm{~cm}^{3}$ | H. $32 \pi \mathrm{~cm}^{2}$ | M. $32 \pi \mathrm{~cm}$ |
| D. $64 \pi \mathrm{~cm}^{3}$ | I. $64 \pi \mathrm{~cm}^{2}$ | N. $64 \pi \mathrm{~cm}$ |
| E. $128 \pi \mathrm{~cm}^{3}$ | J. $128 \pi \mathrm{~cm}^{2}$ | O. $128 \pi \mathrm{~cm}$ |

A. $4.5 \mathrm{~cm}^{3}$
B. $9 \mathrm{~cm}^{3}$
C. $12 \mathrm{~cm}^{3}$
D. 18 cm
F. $4.5 \mathrm{~cm}^{2}$
H. $12{ }^{2}$
H. $12 \mathrm{~cm}^{2}$
I. $18 \mathrm{~cm}^{2}$
K. 4.5 cm
M. 12
M. 12 cm
N. 18 cm
O. 36 cm
(There may be more than one correct answer, but please select only ONE answer.) (There may be more than one correct answer, but please select only ONE answer.)
$v^{2}=v_{0}^{2}+2 a d$
$v_{0}=0$
$a=\frac{\Delta v}{\Delta t}$
$\Delta v=60$
$\Delta t=8$
$v=30$
$d=?$
A. $d=30$
B. $d=60$
C. $d=120$
D. $d=240$
E. $d=480$
(There may be more than one correct answer, but please select only ONE answer.)
$c y=d x$
$a-y=b x$
$x=$ ?
A. $\frac{a c}{d+b}$
B. $\frac{a c}{d-b}$
C. $\frac{a c}{b c-d}$
D. $\frac{a c}{b c+d}$
E. $\frac{a c}{d b}$
F. $\frac{a}{d b}$
G. $\frac{a}{b+\frac{d}{c}}$
H. $\frac{a}{b+d}$
I. $\frac{1}{b}\left(a-\frac{d}{c}\right)$
J. $\frac{c}{d}(a-b)$
(There may be more than one correct answer, but please select only ONE answer.)

## Scientific reasoning skills: The 24-item Lawson test

Suppose you are given two clay balls of equal size and shape. The two clay balls also weigh the same. One ball is flattened into a pancake-shaped piece. Which of these statements is correct?
a. The pancake-shaped piece weighs more than the ball
b. The two pieces still weigh the same
c. The ball weighs more than the pancake-shaped piece

> Understanding shapeindependence of mass

Six square pieces of wood are put into a cloth bag and mixed about. The six pieces are identical in size and shape, however, three pieces are red and three are yellow. Suppose someone reaches into the bag (without looking) and pulls out one piece. What are the chances that the piece is red?

a. $\quad 1$ chance out of 6
b. $\quad 1$ chance out of 3
c. $\quad 1$ chance out of 2
d. 1 chance out of 1
e. cannot be determined

Probabilistic reasoning

To the right are drawings of a wide and a narrow cylinder. The cylinders have equally spaced marks on them. Water is poured into the wide cylinder up to the 4th mark (see A). This water rises to the 6th mark when poured into the narrow cylinder (see B).

Both cylinders are emptied (not shown) and water is poured into the wide cylinder up to the 6 th mark. How high would this water rise if it were poured into the empty narrow cylinder?

a. to about 8
b. to about 9
c. to about 10
d. to about 12
e. none of these answers is correct

At the right are drawings of three strings hanging from a bar. The three strings have metal weights attached to their ends. String 1 and String 3 are the same length. String 2 is shorter. A 10 unit weight is attached to the end of String 1. A 10 unit weight is also attached to the end of String 2. A 5 unit weight is attached to the end of String 3. The strings (and attached weights) can be swung back and forth and the time it takes to make a swing can be timed.

Suppose you want to find out whether the length of the string has an effect on the time it takes to swing back and forth. Which strings would you use to find out?
a. only one string
b. all three strings
c. 2 and 3
d. 1 and 3
e. 1 and 2

## Proportional reasoning

Twenty fruit flies are placed in each of four glass tubes. The tubes are sealed. Tubes I and II are partially covered with black paper; Tubes III and IV are not covered. The tubes are placed as shown. Then they are exposed to red light for five minutes. The number of flies in the uncovered part of each tube is shown in the drawing.


This experiment shows that flies respond to (respond means move to or away from):
a. red light but not gravity
b. gravity but not red light
c. both red light and gravity
d. neither red light nor gravity

Farmer Brown was observing the mice that live in his field. He discovered that al of them were either fat or thin. Also, all of them had either black tails or white tails. This made him wonder if there might be a link between the size of the mice and the color of their tails. So he captured all of the mice in one part of his field and observed them. Below are the mice that he captured.


Do you think there is a link between the size of the mice and the color of their tails?

[^0]
## Relation Between Scores and Grades

- Correlation coefficients between pretest scores and final course grades vary greatly from course to course:
$>r \approx+0.10-+0.50$.
- However, slopes of fit lines for grades vs. pretest score are relatively high, therefore...
- ...pretest scores on diagnostic assessments can approximately predict probabilities of final course grades





## What varies from class to class?

- Specific sets of variables that yield best fit in multivariable linear regressions-there is no universal "best fit" model.


## What does not vary from class to class?

- Students with high scores on diagnostic pretests have much higher probability of receiving high grades than students with low pretest scores, and much lower probability of receiving low grades.


## What does not vary ${ }^{1}$ from class to class?

- Students with high scores on diagnostic pretests have much higher probability of receiving high grades than students with low pretest scores, and much lower probability of receiving low grades.
${ }^{1}$ true in $95 \%$ of cases observed


## What does not vary ${ }^{1}$ from class to class?

- Students with high ${ }^{2}$ scores on diagnostic pretests have much higher probability of receiving high ${ }^{2}$ grades than students with low pretest scores, and much lower probability of receiving low grades.
${ }^{1}$ true in $95 \%$ of cases observed
${ }^{2}$ top quartile in their class


## What does not vary ${ }^{1}$ from class to class?

- Students with high ${ }^{2}$ scores on diagnostic pretests have much $^{3}$ higher probability of receiving high ${ }^{2}$ grades than students with low pretest scores, and much ${ }^{3}$ lower probability of receiving low grades.
${ }^{1}$ true in $95 \%$ of cases observed
${ }^{2}$ top quartile in their class
${ }^{3}$ generally between 200-500\%


## What does not vary ${ }^{1}$ from class to class?

- Students with high ${ }^{2}$ scores on diagnostic pretests have much $^{3}$ higher probability of receiving high ${ }^{2}$ grades than students with low ${ }^{4}$ pretest scores, and much ${ }^{3}$ lower probability of receiving low ${ }^{4}$ grades.
${ }^{1}$ true in $95 \%$ of cases observed
${ }^{2}$ top quartile in their class
${ }^{3}$ generally between 200-500\%
4bottom quartile in their class


## Comparing probabilities of high and low grades

- What is the probability of a student with a high score on a preinstruction assessment getting a high grade in the class?
- How does that compare to a low-scoring student's probability of getting a high grade?
- What is the probability of a student with a high score on a preinstruction assessment getting a low grade in the class?
- How does that compare to a low-scoring student's probability of getting a low grade?


## Sample Description

- 25 introductory physics classes from 4 universities, over 2000 total students
- Instruction in most classes was "non-traditional," generally highly interactive using research-based instructional materials and methods


## Course and Institution Code

Alg-1: Algebra-based course, first semester
Alg-2: Algebra-based course, second semester
Calc-1: Calculus-based course, first semester
Calc-2: Calculus-based course, second semester

ASU-P: Arizona State University, Polytechnic campus
ASU-T: Arizona State University, Tempe campus
LMU: Loyola Marymount University
UWF: University of West Florida
CU: University of Colorado, Boulder

Consistent result:
High (top-quartile) scorers on the diagnostic pretests were much more likely to get high (top-quartile) grades than were low scorers

High Course Grade vs. Mathematics Diagnostic Pretest Score

| Course | Campus | $\mathbf{N}$ | Top-quartile Math: \% <br> with top-quartile grades | Bottom-quartile Math: \% with <br> top-quartile grades | High-grade <br> odds ratio |
| :--- | :--- | :---: | :---: | :---: | :---: |
| Alg-1 2021a | ASU-P | 39 | $51 \%$ | $10 \%$ | 5.0 |
| Alg-1 2021b | ASU-P | 42 | $44 \%$ | $10 \%$ | 4.6 |
| Alg-1 2022a | ASU-P | 40 | $27 \%$ | $6 \%$ | 4.4 |
| Alg-1 2022b | ASU-P | 52 | $49 \%$ | $10 \%$ | 5.1 |
| Alg-1 2023a | ASU-P | 42 | $39 \%$ | $10 \%$ | 4.1 |
| Alg-1 2023b | ASU-P | 46 | $64 \%$ | $9 \%$ | 7.3 |
| Alg-2 2022 | ASU-P | 75 | $46 \%$ | $21 \%$ | 2.2 |
| Alg-2 2023 | ASU-P | 92 | $41 \%$ | $13 \%$ | 3.2 |
| Alg-2 2021 | ASU-T | 129 | $30 \%$ | $39 \%$ | 0.8 |
| Calc-1 2021a | UWF | 53 | $43 \%$ | $0 \%$ | " |
| Calc-1 2021b | UWF | 42 | $43 \%$ | $0 \%$ | " |
| Calc-2 2021 | UWF | 58 | $43 \%$ | $14 \%$ | 3.1 |
| AVERAGE | (unweighted) | $\mathbf{7 1 0}$ | $43 \%$ | $\mathbf{1 2 \%}$ | 3.7 |

High Course Grade vs. Mathematics Diagnostic Pretest Score

| Course | Campus | $N$ |  | Bottom-quartile Math: \% with top-quartile grades | High-grade odds ratio |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Alg-1 2021a | ASU-P | 39 | 51\% | $10 \%$ | 5.0 |
| Alg-1 2021b | ASU-P | $42$ | 44\% | 10\% | 4.6 |
| Alg-1 2022a | ASU-P | 40 | 27\% | 6\% | 4.4 |
| Alg-1 2022b | ASU-P | 52 | 49\% | 10\% | 5.1 |
| Alg-1 2023a | ASU-P | 42 | 39\% | 10\% | 4.1 |
| Alg-1 2023b | ASU-P | 46 | 64\% | 9\% | 7.3 |
| Alg-2 2022 | ASU-P | 75 | 46\% | 21\% | 2.2 |
| Alg-2 2023 | ASU-P | 92 | 41\% | 13\% | 3.2 |
| Alg-2 2021 | ASU-T | 29 | 30\% | 39\% | 0.8 |
| Calc-1 2021a | UWF | 53 | 43\% | 0\% | " ${ }^{\prime}$ " |
| Calc-1 2021b | UWF | 42 | 43\% | 0\% | " ${ }^{\prime}$ " |
| Calc-2 2021 | UWF | 58 | 43\% | 14\% | 3.1 |
| AVERAGE | (unweighted) | (710) | 43\% | 12\% | 3.7 |

High Course Grade vs. Mathematics Diagnostic Pretest Score

| Course | Campus | N | Top-quartile Math: \% with top-quartile grades | Botrom-quartile Math: \% with top-quartile grades | High-grade odds ratio |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Alg-1 2021a | ASU-P | 39 | 51\% | $10 \%$ | 5.0 |
| Alg-1 2021b | ASU-P | 42 | 44\% | $10 \%$ | 4.6 |
| Alg-1 2022a | ASU-P | 40 | 27\% | 6\% | 4.4 |
| Alg-1 2022b | ASU-P | 52 | 49\% | 10\% | 5.1 |
| Alg-1 2023a | ASU-P | 42 | 39\% | 10\% | 4.1 |
| Alg-1 2023b | ASU-P | 46 | 64\% | 9\% | 7.3 |
| Alg-2 2022 | ASU-P | 75 | 46\% | 21\% | 2.2 |
| Alg-2 2023 | ASU-P | 92 | 41\% | 13\% | 3.2 |
| Alg-2 2021 | ASU-T | 129 | 30\% | 39\% | 0.8 |
| Calc-1 2021a | UWF | 53 | 43\% | 0\% | " $\infty$ " |
| Calc-1 2021b | UWF | 42 | 43\% | 0\% | " $\infty$ " |
| Calc-2 2021 | UWF | 58 | 43\% | 14\% | 3.1 |
| AVERAGE | (unweighted) | (710) | 43\% | 12\% | 3.7 |

High Course Grade vs. Mathematics Diagnostic Pretest Score

| Course | Campus | N | Top-quartile Math: $\%$ <br> with top-quartile grades | Bottom-quartile Math: \% with <br> top-quartile grades | High-grade <br> odds ratio |
| :--- | :--- | :---: | :---: | :---: | :---: | :---: |
| Alg-1 2021a | ASU-P | 39 | $51 \%$ | $10 \%$ | 5.0 |
| Alg-1 2021b | ASU-P | 42 | $44 \%$ | $10 \%$ | 4.6 |
| Alg-1 2022a | ASU-P | 40 | $27 \%$ | $6 \%$ | 4.4 |
| Alg-1 2022b | ASU-P | 52 | $49 \%$ | $10 \%$ | 5.1 |
| Alg-1 2023a | ASU-P | 42 | $39 \%$ | $10 \%$ | 4.1 |
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| Alg-2 2023 | ASU-P | 92 | $41 \%$ | $13 \%$ | 3.2 |
| Alg-2 2021 | ASU-T | 129 | $30 \%$ | $39 \%$ | 0.8 |
| Calc-1 2021a | UWF | 53 | $43 \%$ | $0 \%$ | $" \infty "$ |
| Calc-1 2021b | UWF | 42 | $43 \%$ | $0 \%$ | $" \infty "$ |
| Calc-2 2021 | UWF | 58 | $43 \%$ | $14 \%$ | 3.1 |
| AVERAGE | (unweighted) | $\mathbf{7 1 0 )}$ | $43 \%$ | $\mathbf{1 2 \%}$ | 3.7 |


| Course | Campus | $N$ | Top-quartile Math: \% with top-quartile grades | Bottom-quartile Math: \% with top-quartile grades | High-grade odds ratio |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Alg-1 2021a | ASU-P | 39 | 51\% | 10\% | 5.0 |
| Alg-1 2021b | ASU-P | 42 | 44\% | 10\% | 4.6 |
| Alg-1 2022a | ASU-P | 40 | 27\% | 6\% | 4.4 |
| Alg-1 2022b | ASU-P | 52 | 49\% | 10\% | 5.1 |
| Alg-1 2023a | ASU-P | 42 | 39\% | 10\% | 4.1 |
| Alg-1 2023b | ASU-P | 46 | 64\% | 9\% | 7.3 |
| Alg-2 2022 | ASU-P | 75 | 46\% | 21\% | 2.2 |
| Alg-2 2023 | ASU-P | 92 | 41\% | 13\% | 3.2 |
| Alg-2 2021 | ASU-T | 129 | 30\% | 39\% | 0.8 |
| Calc-1 2021a | UWF | 53 | 43\% | 0\% | " ${ }^{0}$ " |
| Calc-1 2021b | UWF | 42 | 43\% | 0\% | " ${ }^{\prime \prime}$ |
| Calc-2 2021 | UWF | 58 | 43\% | 14\% | 3.1 |
| AVERAGE | (unweighted) | (710) | 43\% | 12\% | 3.7 |

High Course Grade vs. Mathematics Diagnostic Pretest Score

| Campus | $N$ | Top-quartile Math: \% <br> with top-quartile grades | Bottom-quartile Math: \% with <br> top-quartile grades |
| :--- | :--- | :--- | :--- | odds ratio


| AVERAGE | (unweighted) | (710) | $43 \%$ | $\ldots$ | $\cdots$ |
| :---: | :---: | :---: | :---: | :---: | :---: |

## High scorers on math pretest were 3.7 times more likely to get a high grade than were low scorers

High Course Grade vs. Lawson Test of Scientific Reasoning Pretest Score

| Course | Campus | $N$ | Top-quartile Lawson: \% with top-quartile grades | Bottom-quartile Lawson: \% with top-quartile grades | High-grade odds ratio |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Alg-1 2021a | ASU-P | 35 | 46\% | 23\% | 2.0 |
| Alg-1 2021b | ASU-P | 38 | 32\% | 8\% | 4.0 |
| Alg-1 2022a | ASU-P | 41 | 49\% | 10\% | 5.0 |
| Alg-1 2022b | ASU-P | 54 | 57\% | 10\% | 5.6 |
| Alg-1 2023a | ASU-P | 36 | 39\% | 33\% | 1.2 |
| Alg-1 2023b | ASU-P | 44 | 55\% | 9\% | 6.0 |
| Alg-2 2022 | ASU-P | 73 | 41\% | 6\% | 7.6 |
| Alg-2 2023 | ASU-P | 92 | 52\% | 10\% | 5.0 |
| Alg-1 | cu | 469 | 45\% | 8\% | 5.5 |
| Calc-2 | cu | 276 | 57\% | 8\% | 6.9 |
| Alg-1 2007 | LMU | 24 | 50\% | 0\% | " ${ }^{\circ}$ " |
| Alg-1 2009 | LMU | 51 | 34\% | 11\% | 3.2 |
| Alg-1 2011 | LMU | 57 | 53\% | 18\% | 2.9 |
| Alg-1 2012 | LMU | 44 | 64\% | 6\% | 10.5 |
| Alg-1 2013 | LMU | 30 | 53\% | 12\% | 4.6 |
| Alg-1 2014 | LMU | 33 | 61\% | 0\% | " ${ }^{\text {" }}$ |
| Alg-1 2015 | LMU | 24 | 63\% | 0\% | $" \infty$ " |
| Alg-1 2016 | LMU | 35 | 41\% | 0\% | " ${ }^{\prime \prime}$ |
| Alg-1 2018 | LMU | 47 | 54\% | 9\% | 6.3 |
| Alg-1 2021 | LMU | 27 | 44\% | 0\% | " ${ }^{\text {" }}$ |
| AVERAGE | (unweighted) | (1530) | 50\% | 9\% | 5.5 |

High Course Grade vs. Lawson Test of Scientific Reasoning Pretest Score

| Campus | $N$ | Top-quartile Lawson: \% <br> with top-quartile grades | Bottom-quartile Lawson: \% <br> with top-quartile grades | High-grade <br> odds ratio |
| :--- | :--- | :--- | :--- | :--- | :--- |


| Alg-1 $20<1$ | Lmu | 41 | $44 \%$ | 0\% | $" \infty$ " |
| :---: | :---: | :---: | :---: | :---: | :---: |
| VERAGE | (unweighted) | (1530) | $50 \%$ | 9\% | 5.5 |

## High scorers on Lawson pretest were 5.5 times more likely to get a high grade than were low scorers

| Course | Campus | $N$ | Top-quartile FCI: \% with top-quartile grades | Bottom-quartile FCI: \% with top-quartile grades | High-grade odds ratio |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Alg-1 2018 | ASU-P | 48 | 40\% | 8\% | 4.8 |
| Alg-1 2019 | ASU-P | 63 | 38\% | 13\% | 3.0 |
| Alg-1 2021a | ASU-P | 35 | 57\% | 0\% | " ${ }^{\prime}$ " |
| Alg-1 2021b | ASU-P | 37 | 32\% | 17\% | 1.9 |
| Alg-1 2022a | ASU-P | 41 | 21\% | 15\% | 1.4 |
| Alg-1 2022b | ASU-P | 52 | 26\% | 7\% | 3.9 |
| Alg-1 2023a | ASU-P | 40 | 30\% | 20\% | 1.3 |
| Alg-1 2023b | ASU-P | 47 | 55\% | 18\% | 3.1 |
| Alg-1 | CU | 470 | 41\% | 12\% | 3.5 |
| Alg-1 2007 | LMU | 23 | 87\% | 0\% | " ${ }^{\prime \prime}$ |
| Alg-1 2009 | LMU | 51 | 63\% | 0\% | " $\infty$ " |
| Alg-1 2012 | LMU | 44 | 50\% | 0\% | " $\infty$ " |
| Alg-1 2013 | LMU | 30 | 51\% | 0\% | " $\infty$ " |
| Alg-1 2014 | LMU | 33 | 43\% | 12\% | 3.6 |
| Alg-1 2015 | LMU | 24 | 67\% | 0\% | " $\infty$ " |
| Alg-1 2016 | LMU | 34 | 71\% | 0\% | " ${ }^{\prime \prime}$ " |
| Alg-1 2018 | LMU | 47 | 34\% | 14\% | 2.4 |
| Alg-1 2021 | LMU | 27 | 44\% | 0\% | " ${ }^{\prime \prime}$ |
| Calc-1 2012 | ASU-P | 40 | 43\% | 0\% | " $\infty$ " |
| Calc-1 2013a | ASU-P | 18 | 44\% | 0\% | " $\infty$ " |
| Calc-1 2013b | ASU-P | 48 | 54\% | 17\% | 3.3 |
| Calc-1 2021a | UWF | 62 | 29\% | 26\% | 1.1 |
| Calc-1 2021b | UWF | 53 | 40\% | 15\% | 2.6 |
| AVERAGE | (unweighted) | (1367) | 46\% | 8\% | 5.4 |

High Course Grade vs. FCI

| Ipus | $\boldsymbol{N}$ | Top-quartile FCI: \% with <br> top-quartile grades | Bottom-quartile FCI: \% with <br> top-quartile grades | High-grade <br> odds ratio |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 48 | $40 \%$ |  | $8 \%$ | 4.8 |


|  |  |  | 4u\% | $10 \%$ | $\angle .0$ |
| :---: | :---: | :---: | :---: | :---: | :---: |
| AVERAOE | (unveighted) | (1357) | 46\% | 8\% | 5.4 |

High scorers on FCI pretest were 5.4 times more likely to get a high grade than were low scorers

High scorers on Math pretest were 3.7 times more likely to get a high grade than were low scorers

High scorers on Lawson pretest were 5.5 times more likely to get a high grade than were low scorers

High scorers on FCI pretest were 5.4 times more likely to get a high grade than were low scorers

What about probabilities of getting low grades?

Low Course Grade vs. Mathematics Diagnostic Pretest Score

| Course | Campus | N | Top-quartiie Math: \% with bottom-quartile grades | Bottom-quartile Math: \% with bottom-quartile grades | Low-grade odds ratio |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Alg-1 2021a | ASU-P | 39 | 10\% | 41\% | 4.0 |
| Alg-1 2021b | ASU-P | 42 | 16\% | 48\% | 3.0 |
| Alg-1 2022a | ASU-P | 40 | 0\% | 42\% | " ${ }^{\text {" }}$ |
| Alg-1 2022b | ASU-P | 52 | 26\% | 29\% | 1.1 |
| Alg-1 2023a | ASU-P | 42 | 20\% | 31\% | 1.5 |
| Alg-1 2023b | ASU-P | 46 | 3\% | 21\% | 7.3 |
| Alg-2 2022 | ASU-P | 75 | 11\% | 26\% | 2.4 |
| Alg-2 2023 | ASU-P | 92 | 11\% | 30\% | 2.8 |
| Alg-2 2021 | ASU-T | 129 | 11\% | 30\% | 2.8 |
| Calc-1 2021a | UWF | 53 | 0\% | 41\% | " ${ }^{\text {" }}$ |
| Calc-1 2021b | UWF | 42 | 19\% | 38\% | 2.0 |
| Calc-2 2021 | UWF | 58 | 24\% | 44\% | 1.8 |
| AVERAGE | (unweighted) | (710) | 13\% | 35\% | 2.8 |

Low scorers on Math pretest were 2.8 times more likely to get a low grade than were high scorers

Low Course Grade vs. Lawson Test of Scientific Reasoning Pretest Score

| Course | Campus | $N$ | Top-quartile Lawson: \% with bottom-quartile grades | Bottom-quartile Lawson: \% with bottomquartile grades | Low-grade odds ratio |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Alg-1 2021a | ASU-P | 35 | 0\% | 34\% | " ${ }^{\prime}$ " |
| Alg-1 2021b | ASU-P | 38 | 11\% | 53\% | 5.0 |
| Alg-1 2022a | ASU-P | 41 | 15\% | 52\% | 3.5 |
| Alg-1 2022b | ASU-P | 54 | 15\% | 28\% | 1.9 |
| Alg-1 2023a | ASU-P | 36 | 14\% | 36\% | 2.6 |
| Alg-1 2023b | ASU-P | 44 | 9\% | 45\% | 5.0 |
| Alg-2 2022 | ASU-P | 73 | 16\% | 27\% | 1.7 |
| Alg-2 2023 | ASU-P | 92 | 13\% | 37\% | 2.8 |
| Alg-1 | CU | 469 | 10\% | 42\% | 4.4 |
| Calc-2 | CU | 276 | 12\% | 44\% | 3.8 |
| Alg-1 2007 | LMU | 24 | 0\% | 58\% | " ${ }^{\prime}$ " |
| Alg-1 2009 | LMU | 51 | 5\% | 48\% | 10.4 |
| Alg-1 2011 | LMU | 57 | 15\% | 46\% | 3.0 |
| Alg-1 2012 | LMU | 44 | 9\% | 27\% | 3.0 |
| Alg-1 2013 | LMU | 30 | 27\% | 12\% | 0.4 |
| Alg-1 2014 | LMU | 33 | 0\% | 68\% | " ${ }^{\prime}$ " |
| Alg-1 2015 | LMU | 24 | 0\% | 75\% | " ${ }^{\prime}$ " |
| Alg-1 2016 | LMU | 35 | 11\% | 46\% | 4.0 |
| Alg-1 2018 | LMU | 47 | 16\% | 42\% | 2.7 |
| Alg-1 2021 | LMU | 27 | 0\% | 89\% | " ${ }^{\prime}$ " |
| AVERAGE | (unweighted) | (1530) | 10\% | 45\% | 4.6 |

Low scorers on Lawson pretest were 4.6 times more likely to get a low grade than were high scorers

## Low Course Grade vs. FCI

| Course | Campus | $N$ | Top-quartile FCI: \% with bottom-quartile grades | Bottom-quartile FCI: \% with bottom-quartile grades | Low-grade odds ratio |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Alg-12018 | ASU-P | 48 | 21\% | 50\% | 2.4 |
| Alg-12019 | ASU-P | 63 | 6\% | 47\% | 7.4 |
| Alg-1 2021a | ASU-P | 35 | 0\% | 56\% | ${ }^{\infty} \times$ |
| Alg-1 2021b | ASU-P | 37 | 11\% | 43\% | 4.0 |
| Ag-1 2022a | ASU-P | 41 | 21\% | 39\% | 1.9 |
| Alg-1 2022 b | Asu-p | 52 | 18\% | 33\% | 1.8 |
| Alg-1 2023a | Asu-p | 40 | 20\% | 37\% | 1.8 |
| Alg-1 2023b | ASU-P | 47 | 9\% | 43\% | 5.1 |
| Alg-1 | cu | 470 | 19\% | 22\% | 1.1 |
| Alg-1 2007 | ımu | 23 | 0\% | 52\% | "ه" |
| Alg-12009 | Lmu | 51 | 8\% | 47\% | 6.0 |
| Alg-1 2012 | Lmu | 44 | 9\% | 50\% | 5.4 |
| Alg-1 2013 | Lmu | 30 | 24\% | 37\% | 1.5 |
| Alg-1 2014 | Lmu | 33 | 7\% | 32\% | 4.7 |
| Alg-1 2015 | lmu | 24 | 0\% | 67\% | "ه" |
| Alg-12016 | Lmu | 34 | 12\% | 47\% | 4.0 |
| Alg-1 2018 | Lmu | 47 | 15\% | 31\% | 2.2 |
| Alg-1 2021 | Lmu | 27 | 0\% | 44\% | ${ }^{\circ} \times$ |
| Calc-1 2012 | ASU-P | 40 | 10\% | 43\% | 4.3 |
| Calc-1 2013a | ASU-P | 18 | 0\% | 44\% | " ${ }^{0}$ |
| Cala-12013b | ASU-P | 48 | 17\% | 8\% | 0.5 |
| Calc-1 2021 a | UwF | 62 | 13\% | 40\% | 3.1 |
| Calc-1 2021 b | uwF | 53 | \% | 25\% | 3.3 |
| AVERAGE | (unweighted) | (1367) | 11\% | 41\% | 3.8 |

Low scorers on FCI pretest were 3.8 times more likely to get a low grade than were high scorers

Consistent result:
Low (bottom-quartile) scorers on the diagnostic pretests were much more likely to get low (bottom-quartile) grades than were high scorers

High scorers on Math pretest were 3.7 times more likely to get a high grade than were low scorers

High scorers on Lawson pretest were 5.5 times more likely to get a high grade than were low scorers

High scorers on FCl pretest were 5.4 times more likely to get a high grade than were low scorers

Low scorers on Math pretest were 2.8 times more likely to get a low grade than were high scorers

Low scorers on Lawson pretest were 4.6 times more likely to get a low grade than were high scorers

Low scorers on FCl pretest were 3.8 times more likely to get a low grade than were high scorers

High and low grades for high and low scorers were compared in 12 classes for the math diagnostic, 20 classes for the Lawson pretest, and 23 classes for the FCl , a total of 110 high/low comparisons. The quartile ratios were greater than 1.0 in 107 of the 110 cases (97\%).

## Regression analysis can be misleading

- High scatter in the data leads to relatively low correlation
- However, quartile comparison can reveal highly significant differences between low and high scorers






BOTTOM QUARTILE FCI, TOP QUARTILE GRADES, $\mathrm{N}=2$




## LAWSON PRETEST VS. GRADES, 20 CLASSES COMBINED



## LAWSON PRETEST VS. GRADES, 20 CLASSES COMBINED



## LAWSON PRETEST VS. GRADES, 20 CLASSES COMBINED



## LAWSON PRETEST VS. GRADES, 20 CLASSES COMBINED



## LAWSON PRETEST VS. GRADES, 20 CLASSES COMBINED



## Alternative to Regression Analysis

- Stratify sample into "high" and "low" scorers on pretest measure \#1 (e.g, FCI), then separate each group further into high and low scorers on pretest measure \#2 (e.g, Lawson test).
- We already know that the measure \#1 groups differ in grade probabilities
- Compare high/low grade probabilities to see whether pretest measure \#2 offers additional predictive power regarding grade probabilities


## Further Analysis of Alg-1 CU sample ( $N=466$ )

|  |  | Probability of topquartile grade | Probability of bottomquartile grade |
| :---: | :---: | :---: | :---: |
|  | Top-half on Lawson pretest | 60\% | 15\% |
| Top-Quartile on FCI Pretest | Bottom-half on Lawson pretest | 26\% | 26\% |
|  | Ratio | 2.3 | 1.8 |
| Bottom-Quartile on FCI Pretest | Top-half on Lawson pretest | 23\% | 15\% |
|  | Bottom-half on Lawson pretest | 0\% | 26\% |
|  | Ratio | -- | 1.8 |

Even within a sample separated into high and low FCI pretest scores, Lawson pretest score was an additional reliable predictor of high/low grades.

## Important Note

- Motivational factors can also be highly influential, in some cases overcoming the "disadvantages" revealed by low pretest scores.


## Summary

- Numerous factors influence students' physics course performance
- Previous preparation in calculational skill, reasoning, and physics concept knowledge are significant predictors of course grades
- Our results are consistent with findings reported by:
- L. Ding, PRPER 10, 023101 (2014)]
- Salehi et al., PRPER 15, 020114 (2019)
- Stewart et al., PRPER 17, 010107 (2021)


[^0]:    a. appears to be a link
    b. appears not to be a link
    c. cannot make a reasonable guess

