Physics students' mathematical environment: Operational skills, contextual understanding, symbolic representation

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Data Sources

We have given diagnostic pretests covering pre-college mathematics to over 7000 introductory physics students (non-credit; calculators allowed):

In addition, we have carried out more than 70 one-on-one problem-solving interviews with physics students to further explore the nature of students' thinking.

What is the length of side x ?	What is the value of θ ?
y	3 6 θ
A. $ycos(z^{\circ})$ D. $y/cos(z^{\circ})$ G. $cos(z^{\circ})/y$ J. $\sqrt{y^2+z^2}$	A. $cos(3/6)$ D. $cos^{-1}(3/6)$ G. 30° J. 27°
B. $ysin(z^{\circ})$ E. $y/sin(z^{\circ})$ H. $sin(z^{\circ})/y$ K. $\sqrt{z^2-y^2}$	B. $sin(3/6)$ E. $sin^{-1}(3/6)$ H. 45° K. $3/6$
C. $ytan(z^{\circ})$ F. $y/tan(z^{\circ})$ I. $tan(z^{\circ})/y$ L. y/z	C. $tan(3/6)$ F. $tan^{-1}(3/6)$ I. 60° L. 0.524
(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.)
$cos(0^{\circ}) = ?$ A. 0 B. 1 C. undefined D. 0.707 E. 0.894	Solve for θ .
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$cos(0^{\circ}) = ?$ 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.) $sin(90^{\circ}) = ?$	Solve for $ heta.$ $\gamma heta+\eta=\lambda heta+\omega$
$cos(0^{\circ}) = ?$ 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.) $sin(90^{\circ}) = ?$ A. 0 B. 1 C. undefined D. 0.707 E. 0.894	Solve for θ . $\gamma \theta + \eta = \lambda \theta + \omega$ A. $\frac{\eta + \omega}{\gamma - \lambda}$ C. $\frac{\gamma - \lambda}{\eta - \omega}$ E. $\frac{\eta - \omega}{\gamma + \lambda}$ G. $\frac{\omega - \eta}{\gamma - \lambda}$ I. $\frac{\eta - \omega + \gamma}{\lambda}$
$cos(0^{\circ}) = ?$ 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.) $sin(90^{\circ}) = ?$ 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.)	Solve for θ . $\gamma \theta + \eta = \lambda \theta + \omega$ A. $\frac{\eta + \omega}{\gamma - \lambda}$ C. $\frac{\gamma - \lambda}{\omega - \eta}$ E. $\frac{\eta - \omega}{\gamma \lambda}$ G. $\frac{\omega - \eta}{\gamma - \lambda}$ I. $\frac{\eta - \omega + \gamma}{\lambda}$
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$cos(0^{\circ}) = ?$ 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.) $sin(90^{\circ}) = ?$ 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.) $tan(0^{\circ}) = ?$ A. 0 B. 1 C. undefined D. 0.707 E. 0.894	Solve for θ . $\gamma \theta + \eta = \lambda \theta + \omega$ A. $\frac{\eta + \omega}{\gamma - \lambda}$ C. $\frac{\gamma - \lambda}{\omega - \eta}$ E. $\frac{\eta - \omega}{\gamma \lambda}$ G. $\frac{\omega - \eta}{\gamma - \lambda}$ I. $\frac{\eta - \omega + \gamma}{\lambda}$ B. $\frac{\eta - \omega}{\lambda - \gamma}$ D. $\frac{\lambda - \gamma}{\eta - \omega}$ F. $\frac{\omega - \eta}{\gamma \lambda}$ H. $\frac{\omega - \eta}{\gamma + \lambda}$ J. $\frac{\omega - \eta + \lambda}{\gamma}$ (There may be more than one correct answer, but please select only ONE answer.)

What is the slope of the graph below?



 $\left(rac{a}{3}
ight)^3 = ?$ A. $rac{a^3}{3}$ B. $rac{a}{27}$ C. $rac{a^3}{27}$

(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.)

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

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.)

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

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

(There may be more than one correct answer, but please select only ONE answer.)

(a) Area of the circle	e = ?		(b) Area of the tri	angle = ?	6 cm	Solve for x. $\frac{3}{2} = 7x$ A. $\frac{14}{3}$ B. $\frac{3}{14}$ C. $\frac{21}{2}$ D. $\frac{21}{14}$	
A. $8\pi \text{ cm}^3$	F. 8π cm ²	K. 8π cm	A. 4.5 cm^3	F. 4.5 cm^2	K. 4.5 cm	(There may be more than one correct answer, but p	please select only ONE answer.)
B. $16\pi \text{ cm}^3$	G. 16π cm ²	L. 16π cm	B. 9 cm ³	G. 9 cm^2	L. 9 cm		
C. $32\pi \text{ cm}^3$	H. 32π cm ²	M. 32π cm	C. 12 cm^3	H. 12 cm^2	M. 12 cm		
D. $64\pi \text{ cm}^{\circ}$	1. $64\pi \text{ cm}^2$	N. 64π cm	D. 18 cm ³	I. 18 cm ²	N. 18 cm		
E. 128% CIII	J . 128 <i>n</i> cm	0. 128 ^{<i>n</i>} cm	E. 36 cm [°]	J. 36 cm ²	0. 36 cm		
(There may be more than	n one correct answer, but plea	se select only ONE answer.)	(There may be more th	an one correct answer, but	t please select only ONE answ	er.)	
$v^2 = v_2^2 + $	2ad						
$v_0 = 0$					cy = dx		
$c_0 = 0$					a - u = bx		
$a=rac{\Delta v}{\Delta t}$					5		
$\Delta v = 60$					x = ?		
$\Delta t = 8$					ac	ac ac a	$1 \begin{pmatrix} d \end{pmatrix}$
v = 30					A. $\frac{d}{d+b}$	C. $\frac{1}{bc-d}$ E. $\frac{1}{db}$ G. $\frac{1}{b+\frac{d}{c}}$	I. $\frac{1}{b}\left(a-\frac{a}{c}\right)$
d = ?					B. $\frac{ac}{d-b}$	D. $\frac{ac}{bc+d}$ F. $\frac{a}{db}$ H. $\frac{a}{b+d}$	J. $\frac{c}{d}\left(a-b\right)$
A. $d = 30$	0 B. $d = 60$ C	. $d = 120$ D. $d = 120$	= 240 E. $d = -$	480	(There may be n	ore than one correct answer, but please select onl	y ONE answer.)

(There may be more than one correct answer, but please select only ONE answer.)

Trigonometry Questions with samples of correct student responses



1. What is the length of side x?





 $\sin^{-1}(\Theta) = \sin^{-1}(\frac{3}{6})$ $A = 30^{\circ}$

What is the value of θ ?

Correct-response rates (written, free-response)

(36 classes; *N* > 3000)

What is the length of side x?







Correct-response rates (written, free-response)

Correct-response rate

But the Problem is More Complicated...

- Weak calculational skills are only part of the problem.
- Student difficulties that *appear* to be mathematical in origin may actually be due in part to application in a *physical* context [Thompson, Manogue, Roundy, and Mountcastle, 2012; Zavala and Barniol, 2013]

"Language mismatches"

- Students are often confused by the very different symbols and techniques used in physics classes, for identical operations first seen in mathematics classes (Dray and Manogue, 1999-2004)
 - *Example:* The "area element" used in vector calculus to do area integrals looks very different in physics textbooks, compared to mathematics textbooks

$$dS = \sqrt{\left[1 + \left(\frac{\partial z}{\partial x}\right)^2 + \left(\frac{\partial z}{\partial y}\right)^2\right]} dx dy \quad [math, general expression]$$

 $dS = r^2 \sin \theta \, d\theta \, d\phi$ [physics, for a sphere]

Confusion can result from the nature of the symbols themselves

Solve for θ .

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

Solve for x. ax + b = cx + d



Correct-response rate



Physics concepts and context make a difference

- Distinguishing between a quantity (v), *change* in that quantity (Δv), and ratios of changes ($\Delta v / \Delta t$) is always challenging, but in the context of motion, additional obstacles are introduced by confusion about the *meaning* and the *distinction between* velocity and acceleration. (Trowbridge and McDermott, 1981)
- Students' difficulties in graphical interpretation in the context of motion are exacerbated by misleading intuitions drawn from objects' physical trajectories. (McDermott, Rosenquist, and Van Zee, 1987)
- Finding and comparing the "area under the curve" may be more challenging in a thermodynamics context than in a "pure math" context, e.g., in analyzing thermodynamic process represented on a pressure-volume diagram. (Christensen and Thompson, 2010-2012)

Influence of context

Shaffer and McDermott (2005) found a lower correct-response rate on a vector question in a physical context (45% correct, left diagram) than in an abstract mathematical context (65% correct, right diagram)



What factors influence ability to interpret context?

- Higher proficiency with basic calculational skills frees energy and time to apply conceptual knowledge in appropriate contexts.
- Self-checking skills can help avoid preventable errors.
- The level of reasoning skill may impact ability to interpret contexts appropriately.
- Deeper understanding of physics concepts can help guide their appropriate application in context.

Findings from >70 Interviews: Students make many "careless" errors

- During interviews, students tended to self-correct approximately 60% of their initial errors with little or no prompting, suggesting that many errors are "careless."
- These findings suggest that increased focus on improving students' self-checking behavior might provide significant performance dividends.
 - However, studies have shown that making these improvements is quite challenging

Relation Between Scores and Grades

• Performance on **full online diagnostic** can *approximately* predict final course grade

Course	Campus	N	Overall % grade ≤ C+	Score ≥ 81% % grade ≤ C+	Score ≤ 57% % grade ≤ C+	Low-grade Ratio score ≤ 57% vs. score ≥ 81%

Course	Campus	N	Overall % grade ≤ C+		
Alg-1 2021	ASU-P	78			

Alg-1: Algebra-based course, first semester

Course	Campus	Ν	Overall % grade ≤ C+		
Alg-1 2021	ASU-P	78	26%		

Alg-1: Algebra-based course, first semester

Course	Campus	N	Overall % grade ≤ C+	Score ≥ 81% % grade ≤ C+	Score ≤ 57% % grade ≤ C+	Low-grade Ratio score ≤ 57% vs. score ≥ 81%
Alg-1 2021	ASU-P	78	26%	19%	38%	2.1

Alg-1: Algebra-based course, first semester

Students who scored low on math diagnostic pretest had more "C" course grades than those who scored high

Course	Campus	N		
Alg-1 2021	ASU-P	78		
Alg-1 2022	ASU-P	93		
Alg-2	ASU-P	72		
Calc-1	UWF	103		

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

ASU-P: Arizona State University, Polytechnic campus UWF: University of West Florida

Course	Campus	N	Overall % grade ≤ C+		
Alg-1 2021	ASU-P	78	26%		
Alg-1 2022	ASU-P	93	19%		
Alg-2	ASU-P	72	29%		
Calc-1	UWF	103	39%		

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

ASU-P: Arizona State University, Polytechnic campus UWF: University of West Florida

Low Course	Grade vs. Full	Diagnostic Score

Course	Campus	N	Overall % grade ≤ C+	Score ≥ 81% % grade ≤ C+	Score ≤ 57% % grade ≤ C+	Low-grade Ratio score ≤ 57% vs. score ≥ 81%
Alg-1 2021	ASU-P	78	26%			
Alg-1 2022	ASU-P	93	19%			
Alg-2	ASU-P	72	29%			
Calc-1	UWF	103	39%			

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

ASU-P: Arizona State University, Polytechnic campus UWF: University of West Florida

Course	Campus	N	Overall % grade ≤ C+	Score ≥ 81% % grade ≤ C+	Score ≤ 57% % grade ≤ C+	Low-grade Ratio score ≤ 57% vs. score ≥ 81%
Alg-1 2021	ASU-P	78	26%	19%	38%	2.1
Alg-1 2022	ASU-P	93	19%	8%	28%	3.4
Alg-2	ASU-P	72	29%	14%	35%	2.6
Calc-1	UWF	103	39%	26%	54%	2.1

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

ASU-P: Arizona State University, Polytechnic campus UWF: University of West Florida

Students who scored low on math diagnostic pretest had **consistently** more "C" course grades than those who scored high

Course	Campus	N	Overall % grade ≥ A-	Score ≥ 81% % grade ≥ A-	Score ≤ 57% % grade ≥ A-	High-grade Ratio score ≥ 81% vs. score ≤ 57%
Alg-1 2021	ASU-P	78				
Alg-1 2022	ASU-P	93				
Alg-2	ASU-P	72				
Alg-2	ASU-T	129				
Calc-1	UWF	103				
Calc-2	UWF	59				

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 UWF: University of West Florida

Course	Campus	N	Overall % grade ≥ A-	Score ≥ 81% % grade ≥ A-	Score ≤ 57% % grade ≥ A-	High-grade Ratio score ≥ 81% vs. score ≤ 57%
Alg-1 2021	ASU-P	78	35%			
Alg-1 2022	ASU-P	93	45%			
Alg-2	ASU-P	72	39%			
Alg-2	ASU-T	129	60%			
Calc-1	UWF	103	22%			
Calc-2	UWF	59	49%			

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 UWF: University of West Florida

Course	Campus	Ν	Overall % grade ≥ A-	Score ≥ 81% % grade ≥ A-	Score ≤ 57% % grade ≥ A-	High-grade Ratio score ≥ 81% vs. score ≤ 57%
Alg-1 2021	ASU-P	78	35%	63%	15%	4.2
Alg-1 2022	ASU-P	93	45%	67%	28%	2.4
Alg-2	ASU-P	72	39%	64%	25%	2.6
Alg-2	ASU-T	129	60%	67%	55%	1.2
Calc-1	UWF	103	22%	40%	0%	"∞"
Calc-2	UWF	59	49%	61%	38%	1.6

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 UWF: University of West Florida Students who scored high on math diagnostic pretest had **consistently** more "A" course grades than those who scored low

Factors other than math preparation may influence course performance

• For example:

- Scientific reasoning skills, as measured by the Lawson Test of Scientific Reasoning
- Physics concept knowledge, as measured by the Force Concept Inventory

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

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. 1 chance out of 6
- b. 1 chance out of 3
- c. 1 chance out of 2
- d. 1 chance out of 1
- e. cannot be determined

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

Course	Campus	N	Overall % grade ≥ A-	Top-quartile Lawson % grade ≥ A-	Bottom-quartile Lawson % grade ≥ A-	High-grade Ratio Top quartile vs. Bottom quartile
Alg-1 2021	ASU-P	73	35%	65%	17%	3.9
Alg-1 2022	ASU-P	99	45%	62%	28%	2.2
Alg-2	ASU-P	73	39%	60%	15%	4.0

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

ASU-P: Arizona State University, Polytechnic campus

Students who scored high on Lawson reasoning pretest had **consistently** more "A" course grades than those who scored low

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

Course	Campus	N	Overall % grade ≤ C+	Top-quartile Lawson % grade ≤ C+	Bottom-quartile Lawson % grade ≤ C+	Low-grade Ratio Bottom quartile vs. Top quartile
Alg-1 2021	ASU-P	73	26%	5%	56%	11.1
Alg-1 2022	ASU-P	99	19%	10%	28%	2.9
Alg-2	ASU-P	73	29%	10%	35%	3.5

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

ASU-P: Arizona State University, Polytechnic campus

Students who scored low on Lawson reasoning pretest had **consistently** more "C" course grades than those who scored high

Physics concept knowledge: The 30-item FCI

An elevator is being lifted up an elevator shaft at a constant speed by a steel cable as shown in the figure below. All frictional effects are negligible. In this situation, forces on the elevator are such that:

- (A) the upward force by the cable is greater than the downward force of gravity.
- (B) the upward force by the cable is equal to the downward force of gravity.
- (C) the upward force by the cable is smaller than the downward force of gravity.
- (D) the upward force by the cable is greater than the sum of the downward force of gravity and a downward force due to the air.
- (E) none of the above. (The elevator goes up because the cable is being shortened, not because an upward force is exerted on the elevator by the cable).



What Grade is Predicted by FCI Pretest Score?

• Henderson (2002), University of Minnesota (N > 1000)

FCI Pretest score:	0-30%	63-100%
	A: 10%	A: 47%
	B: 30%	B: 40%
	C: 46%	C: 9%

Students who scored high on FCI pretest had higher course grades than those who scored low

What Grade is Predicted by FCI Pretest Score?

• Meltzer (2012/13), Arizona State University (N > 100)

FCI Pretest score:	0-30%	63-100%
	A: 12%	A: 65%
	B: 44%	B: 22%
	C: 26%	C: 13%

Students who scored high on FCI pretest had higher course grades than those who scored low

Factors are correlated, but not 100%

- Outliers using one prediction method—e.g., low-scorers on the math diagnostic with high grades—can often be explained by high pretest scores on another predictor, such as the Lawson reasoning test or the FCI
- Students with low pretest scores on all diagnostics can sometimes perform well with exceptional efforts (e.g., regular class attendance, excellent class participation, consistent execution of assignments)

Summary

- Numerous factors influence students' physics course performance
- Previous preparation in calculational and reasoning skills is important, as well as physics concept knowledge
- Motivation and effort can potentially compensate for relative weaknesses in skills or knowledge preparation