

On Symbols and Stories: Learning Strategies for Solving Different Representations of Algebra Problems

Luis Apolaya (lapolaya@stanford.edu)
Department of Symbolic Systems, Stanford University

Amy Shoemaker (amyshoe@stanford.edu)
Institute for Computational and Mathematical Engineering, Stanford University

Introduction

When considering the teaching of algebra, one of students' first transitions from concrete, arithmetic thinking to more abstract concepts, there is a general notion about which problems are better to teach first to build understanding. For example, consider the following two algebra problems, which are identical in terms of content:

- (A) Solve for x :
 $x * 6 + 66 = 81.9$
- (B) When Ted got home from his waiter job, he multiplied his hourly wage by the 6 hours he worked that day. Then he added the \$66.00 he made in tips and found he had earned \$81.90. How much does Ted make per hour?

Though questions (A) and (B) give and ask for the same information, much can be said about how the presentations of these two problems affect how students and teachers gauge their respective difficulty level, and therefore how likely they are to reach the correct answer. When asked which format best facilitates acquisition of algebraic concepts, for example, teachers agree that problem (A) does so better than problem (B), claiming that symbolic problems are inherently easier and therefore ought to be taught first in an introductory algebra class (M. Nathan & Koedinger, 2000). However, Koedinger and Nathan (2004) conducted a study that revealed situations where story problems are actually *easier* than symbolic problems.

Through the use of probabilistic programming, we seek to understand the cognitive mechanisms that bring forth the patterns Koedinger and Nathan (2004) noticed. We thus hope to shed further light onto the psychology of algebra students and onto how pedagogical methods can better attend to students' development as problem solvers.

Story Problems and the Verbal Hypothesis

There are several reasons why mathematics teachers widely believe that symbolic representations of algebra problems are inherently easier than story problems. For one, symbolic problems are comprised of more easily manipulable components than their verbal counterparts, as all the relevant parts of the problem are present in the symbols and students do not have to identify the key parts of the problem from within a story context (Koedinger & Nathan, 2004). On the other

hand, verbal problems can ground the scenario in a more relatable, real-life manner, which may heighten students' intuitions or provide insight into informal problem-solving strategies they can use. Though surveys cited in (M. J. Nathan, 2012) show that teachers think symbolic problems are likely to be solved correctly, Koedinger and Nathan (2004) show a disparity in the teachers' beliefs and students' performance, as subjects in their study show a higher rate of success for verbal problems.

In explaining this phenomenon, Koedinger and Nathan (2004) propose what they call the *verbal hypothesis*, which states that the earlier acquisition of language gives students an advantage on comprehending and solving story problems over symbolic problems. That is, since the symbols in an algebraic equation must be understood and manipulated to reach and communicate an answer, working with equations has its own risks of comprehension error, just as story problems do. In effect, the authors reduce the role a problem's format can have in students' comprehension mistakes to the affects formats have on students' choice of problem-solving strategies, which ends up being the crucial factor in predicting students' success in solving the problem.

Breaking this observation down further, Koedinger and Nathan (2004) identify three main strategies, each with a differing success rate: *symbolic manipulation*, *unwind*, and *guess and check*. The first, as the name suggests, is the formal method of manipulating algebraic symbols to determine the unknown value. The second strategy involves working backwards from a problem's result value to arrive at the desired unknown value through a series of computations, reversing the computations in the problem, though not necessarily with any symbolic notation. Finally, the third strategy involves looking for the unknown by trying out different values and seeing whether the given equation makes sense, also not necessarily involving an equation. To distinguish the strategies that require algebraic notation from those that do not, the authors marked symbolic manipulation as a formal strategy, and unwind and guess and check as informal strategies. In the scope of their study, Nathan and Koedinger noticed that the informal strategies have greater rates of success (69% for unwind and 71% for guess and check) than symbolic manipulation (51%). Moreover, story problems were more frequently solved with the success-prone informal strategies than symbolic manipulation (see Table 1).

Koedinger and Nathan (2004) draw a correlation between

Table 1: Solution Strategies Employed by Solvers as a Function of Problem Representation (Koedinger & Nathan, 2004)
Key: PR=Problem Representation, U=Unwind, GT=Guess and Test, NR=No Response

PR	U	GT	SM	NR	Other
Story	50	7	5	12	26
Equation	13	14	22	32	19

the strategies used to solve story problems and their findings that students have higher rates of success with story problems. Doing away with conventional belief that some types of problem representation are inherently easier than others, they instead propose that the representation of a problem affects a student's informal, conceptual understanding and thus the strategies they use. The fact that no response was given for 32% of equation problems (which is almost three times the rate of no responses in story problems, see Table 1) further supports their verbal hypothesis for beginning algebra students.

Single- versus Double-Reference Algebra Problems

Though Nathan and Koedinger were able to identify one set of circumstances where students' performance in story problems surpassed teachers' expectations, this is not enough to invalidate such a widespread belief among students and teachers of algebra. Rather, these findings motivated the authors to follow up on their own study by tracking students' use of strategies and performance on more difficult algebra problems. ? (?) introduce the notion of single-reference and double-reference problems. Single-reference problems, like problems (A) and (B) above, make reference to the unknown value only once, whereas double-reference problems, like problems (C) and (D) below, refer to the unknown value twice.

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(C) Roseanne just paid \$38.24 for new jeans. She got them at a 15% discount. What was the original price?

(D) Solve for x :
 $x - 0.15x = 38.24$

After giving students exams with both single-reference and double-reference algebra problems, they were able to replicate their results from (Koedinger & Nathan, 2004), for single-reference problems and found opposite performance rates for double-reference problems. As it turns out, the double-reference problems Koedinger et al. (2008) tested are more likely to be solved correctly in equation representation than in story representation.

More specifically, and keeping the dichotomy of formal and informal strategies from Koedinger and Nathan (2004), the authors noticed a pattern emerge in the students' choice of strategies and their respective success rates in relation to the representation of the algebra problem. When faced with a single-reference story problem, students were more likely to choose and more successful when choosing an informal strategy over a formal strategy, whereas the opposite was true for single-reference symbolic problems. In the case of double-reference story problems, however, formal strategies were chosen more often and led to more correct answers than informal strategies, as was the case for double-reference symbolic problems.

To explain this, Koedinger et al. (2008) propose that informal methods are taxing on working memory when solving double-reference story problems, which makes students prefer and work better with symbolic representations, as all the information needed is concisely contained in an algebraic equation. Moreover, they identify benefits to the *grounded representation* of story problems, such as easier access to problem-solving methods students use in real-life, and a context that facilitates error-checking (if the story mentions dollars and cents, for example, common knowledge about what their labels represent makes it difficult to accidentally add them under the same label of dollars or cents). Though Nathan and Koedinger acknowledge that translation from a story problem to an equation has its difficulties and cognitive demands, they do not posit that translation tells the whole story, and rather predict that single-reference story problems are best solved with informal strategies, and double-reference story problems are best solved with formal strategies, despite any translation that needs to take place.

The Model

Learning to Choose a Strategy

While Koedinger and Nathan (2004) show that the difference in success students have with story problems versus equation problems is largely due to the strategies most common for each type of problem and the success rates of those strategies, they provide no discussion of how students choose what strategy to use for a given problem. One such explanation can be found in work done by Siegler (1987), which presents a developmental theory of how children and youths learn to solve unfamiliar problems by choosing among a small number of strategies. [a bit more here, maybe](#)

Using the probabilistic language WebPPL ((Goodman & Stuhlmüller, 2014)), we created a model that attempts to syn-

thesize the work of ? (?), ? (?), and Siegler (1987) to explore the psychology of strategy choices that math students go through when learning to solve single-reference story and symbolic problems. To do so, we drew on the demonstrated preference of strategies that ? (?) uncovered and the notion of problem type-strategy correspondence from the work of (Singapore) to come up with a predictive model (**include a figure with our theoretical framework?**). The aim of our model was to replicate the rates of successes of the three main strategies from ? (?), which would not only support Nathan and Koedinger’s theories on single-reference story and symbolic problems, but also mark our success in demonstrating how students make these choices.

Using the probabilistic language WebPPL (Goodman and Tenenbaum), we have created a model attempts to synthesize the work of Koedinger and Nathan (2004) and provide a hypothesis of the cognitive pathways that have led to their findings. While Koedinger and Nathan (2004) show that the difference in success students have with story problems versus equation problems is largely due to the strategies most common for each type of problem and the success rates of those strategies, they provide no discussion of how students choose what strategy to use for a given problem. One such explanation can be found in (?), which presents a developmental theory of how children and youths learn to solve unfamiliar problems by choosing among a small number of strategies. **a bit more here, maybe**

In our model, we explore the psychology of strategy choices that math students go through when learning to solve single-reference story and symbolic problems. To do so, we drew on the demonstrated preference of strategies that ? (?) uncovered and the notion of core problem type-strategy correspondence from the work of Khng and Lee (2009). (**include a figure with our theoretical framework?**). The aim of our model was to replicate the rates of successes of the three main strategies from (Koedinger & Nathan, 2004), which would not only support their theories on single-reference story and symbolic problems, but also mark our success in demonstrating how students make these choices.

Current Methods

Second level headings should be 11 point, initial caps, bold, and flush left. Leave one line space above the heading and 1/4 line space below the heading.

Future Methods

Preliminary Results

Result synopsis

Third level headings should be 10 point, initial caps, bold, and flush left. Leave one line space above the heading, but no space after the heading.

Discussion

Arithmetic Interference on Algebra

The findings of (citation) suggest such an explanation that appeals to a phenomenon suggested by (citation of number sense) set in the problem solving realm: interference of prior knowledge. In this study, the authors introduce a hiccup in the acquisition of algebraic problem-solving methods such as symbol manipulation, namely the naive implementation of arithmetic strategies such as unwind and guess and check to algebra problems. That is, in the process of learning which strategies to use for certain problems (citation referring to this process of choosing optimal strategies), students who were able to inhibit interference from prior arithmetic knowledge in a number of different metrics were more likely to solve the given algebraic problems correctly.

This work suggests a correspondence between algebraic strategies with problems that are purely algebraic in nature, and arithmetic strategies with problems that can be arithmetic in nature.

Use standard APA citation format. Citations within the text should include the author’s last name and year. If the authors’ names are included in the sentence, place only the year in parentheses, as in M. J. Nathan (2012), but otherwise place the entire reference in parentheses with the authors and year separated by a comma M. J. Nathan (2012). List multiple references alphabetically and separate them by semicolons M. J. Nathan (2012); Koedinger and Nathan (2004). Use the “et al.” construction only after listing all the authors to a publication in an earlier reference and for citations with four or more authors.

Indicate footnotes with a number¹ in the text. Place the footnotes in 9 point type at the bottom of the column on which they appear. Precede the footnote block with a horizontal rule.²

Number tables consecutively. Place the table number and title (in 10 point) above the table with one line space above the caption and one line space below it, as in Table 2. You may float tables to the top or bottom of a column, or set wide tables across both columns.

Table 2: Sample table title.

Error type	Example
Take smaller	63 - 44 = 21
Always borrow	96 - 42 = 34
0 - N = N	70 - 47 = 37
0 - N = 0	70 - 47 = 30

Figures

All artwork must be very dark for purposes of reproduction and should not be hand drawn. Number figures sequentially,

¹Sample of the first footnote.

²Sample of the second footnote.

placing the figure number and caption, in 10 point, after the figure with one line space above the caption and one line space below it, as in Figure 1. If necessary, leave extra white space at the bottom of the page to avoid splitting the figure and figure caption. You may float figures to the top or bottom of a column, or set wide figures across both columns.

CoGNiTive ScIeNcE

Figure 1: This is a figure.

Acknowledgments

Place acknowledgments (including funding information) in a section at the end of the paper.

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