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Cross-Notation Knowledge of Fractions and Decimals

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CROSS-NOTATION KNOWLEDGE

Abstract

Understanding fractions and decimals requires not only understanding each notation separately, or *within-notation knowledge*, but also understanding relations between notations, or *cross-notation knowledge*. Multiple notations pose a challenge for learners but could also present an opportunity, in that cross-notation knowledge could help learners to achieve a better understanding of rational numbers than could easily be achieved from within-notation knowledge alone. This hypothesis was tested by re-analyzing three published datasets involving fourth to eighth grade children from the U.S. and Finland. All datasets included measures of rational number arithmetic, within-notation magnitude knowledge (e.g., accuracy comparing fractions versus fractions and decimals versus decimals), and cross-notation magnitude knowledge (e.g., accuracy comparing fractions versus decimals). Consistent with the hypothesis, cross-notation magnitude knowledge predicted fraction and decimal arithmetic while controlling for within-notation magnitude knowledge. Further, relations between within-notation magnitude knowledge and arithmetic were not notation specific; fraction magnitude knowledge did not predict fraction arithmetic more than decimal arithmetic, and decimal magnitude knowledge did not predict decimal arithmetic more than fraction arithmetic. Implications of the findings for assessing rational number knowledge and learning and teaching about rational numbers are discussed.

Keywords: numerical development, fractions, decimals, magnitude knowledge, arithmetic, cross-notation knowledge, Integrated Theory of Numerical Development

Introduction

Rational numbers are among the most important and difficult topics children encounter in early math education. Over two-thirds of a nationally-representative sample of U.S. adults reported using rational numbers in their jobs (Handel, 2016). Further, rational number knowledge predicts success in algebra (Booth, Newton, & Twiss-Garrity, 2014) and general math achievement in high school when controlling for whole number arithmetic skill, non-verbal IQ, working memory, and family socio-economic status (Siegler et al., 2012). However, many individuals struggle with rational numbers even after years of instruction (Siegler, Thompson, & Schneider, 2011).

Unlike whole numbers, rational numbers are regularly represented using several different notations—fractions, decimals, and percentages. This fact poses a challenge for learners, in that understanding rational numbers requires not only understanding each notation on its own, or *within-notation knowledge*, but also understanding the relations between notations, or *cross-notation knowledge*. Even many high school students have trouble understanding that fractions and decimals can represent the same numbers (Vamvakoussi & Vosniadou, 2010). However, multiple rational number notations may also present an opportunity: making connections between fractions and decimals could enable learners to achieve better understanding of, and proficiency with, each notation than could easily be achieved otherwise.

The present study tested a specific version of the above hypothesis—that cross-notation knowledge of fraction and decimal magnitudes contributes to fraction and decimal arithmetic skill. To do so, we investigated relations between cross-notation magnitude understanding and fraction and decimal arithmetic skill, controlling for within-notation magnitude understanding. Within- and cross-notation magnitude understanding were measured using magnitude

CROSS-NOTATION KNOWLEDGE

comparison and ordering tasks involving either one notation (e.g., comparing fractions to fractions) or multiple notations (e.g., comparing fractions to decimals).

Below, we briefly review previous research on children's knowledge of fractions and decimals, including knowledge of magnitudes and knowledge of arithmetic. Next, we elaborate the concept of cross-notation knowledge, discuss how such knowledge might facilitate learning about rational numbers, and review previous research relating to cross-notation knowledge.

Then, we describe the goals and approach of the present study in more detail.

Children's Knowledge of Fractions and Decimals

Understanding fractions and decimals requires understanding that they have magnitudes that can be compared, ordered, and placed on number lines (Siegler et al., 2011). Unfortunately, this understanding proves elusive for many children with respect to both fractions (Braithwaite & Siegler, 2018; Bright, Behr, Post, & Wachsmuth, 1988; Jordan, Resnick, Rodrigues, Hansen, & Dyson, 2017; Mazzocco & Devlin, 2008) and decimals (Desmet, Grégoire, & Mussolin, 2010; DeWolf, Bassok, & Holyoak, 2015; Malone, Loehr, & Fuchs, 2017; Resnick, Rinne, Barbieri, & Jordan, 2019; Rittle-Johnson, Siegler, & Alibali, 2001). For example, on the U.S. National Assessment of Educational Progress (NAEP), only 50% of eighth graders in 2007 correctly ordered $\frac{2}{7}$, $\frac{5}{9}$, and $\frac{1}{12}$ from smallest to largest, and only 42% of eighth graders in 2005 correctly identified a point midway between .005 and .006 on a number line as .0055 (US Department of Education, Institute of Education Sciences, 2005, 2007).

Many children also display poor proficiency with rational number arithmetic, again with both fractions (Byrnes & Wasik, 1991; Gabriel, Coché, et al., 2013; Hansen et al., 2015; Hecht & Vagi, 2012; Mack, 1995; Newton, Willard, & Teufel, 2014; Siegler et al., 2011) and decimals (Author, 2018; Hiebert & Wearne, 1985; Kouba et al., 1988; Rittle-Johnson & Koedinger, 2009).

CROSS-NOTATION KNOWLEDGE

For example, sixth graders correctly answered only 46% of fraction arithmetic problems in one study (Siegler & Pyke, 2013) and only 57% of decimal arithmetic problems in another study (Tian, Braithwaite, & Siegler, 2020a). Common arithmetic errors include adding fractions by separately adding their numerators and denominators (e.g., $3/5 + 1/4 = 4/9$), passing through a common denominator when multiplying fractions (e.g., $3/5 \times 1/5 = 3/5$), adding digits with different place values when adding decimals (e.g., $4 + .3 = .7$), and placing the decimal point incorrectly when multiplying decimals (e.g., $.4 \times .2 = .8$).

According to the Integrated Theory of Numerical Development (Siegler & Braithwaite, 2017; Siegler et al., 2011), understanding numerical magnitudes is critical for learning arithmetic. The theory therefore implies that difficulties understanding the magnitudes of fractions and decimals contribute to difficulties with fraction and decimal arithmetic. Consistent with the theory, individual differences in magnitude understanding predict differences in arithmetic skill for both fractions (Bailey, Hansen, & Jordan, 2017; Siegler & Pyke, 2013; Siegler et al., 2011; Torbeyns, Schneider, Xin, & Siegler, 2015) and decimals (Rittle-Johnson & Koedinger, 2009). Further, interventions designed to improve fraction magnitude understanding have been shown to improve fraction arithmetic skill (Dyson, Jordan, Rodrigues, Barbieri, & Rinne, 2018; Fuchs et al., 2013). A possible mechanism underlying these phenomena is that understanding the magnitudes of individual numbers enables students to evaluate whether candidate answers to arithmetic problems are plausible, and thereby to reject incorrect procedures that generate implausible answers (Braithwaite & Siegler, 2020; Siegler et al., 2011).

Cross-Notation Knowledge of Rational Numbers

Much prior research has treated fractions and decimals as separate topics. Similarly, many math curricula devote separate chapters to fractions and decimals, and devote relatively

CROSS-NOTATION KNOWLEDGE

little space to relations between them (e.g., Charles et al., 2012; Dixon, Adams, Larson, & Leiva, 2012). Knowledge of such relations, or cross-notation knowledge, is the focus of the present study. We argue that cross-notation knowledge merits greater attention than it has previously received, in part because it may confer benefits that are difficult to achieve through within-notation knowledge alone.

Potential Benefits of Cross-Notation Knowledge

First, cross-notation knowledge could enable learners to use knowledge about each notation to help solve problems involving the other notation. For example, to understand why $.4 \times .2 = .08$ rather than $.8$, a child might reason that $\frac{4}{10} \times \frac{2}{10} = \frac{8}{100}$, or more generally that multiplying tenths by tenths yields hundredths. As another example, a child who has not learned or does not remember how to solve $\frac{3}{5} + \frac{1}{4}$ but knows how to solve $0.6 + 0.25$ might translate the former problem into the latter to solve it. Children could use such strategies once they have been taught to translate between fractions and decimals, which typically occurs in fourth grade in the U.S., and once they have been taught—though not necessarily mastered—at least some fraction or decimal arithmetic procedures, which occurs mainly in fifth and sixth grade (CCSSI, 2010). The above approach to understanding decimal multiplication is provided in some math textbooks (e.g., Eureka Math; Great Minds, 2015), and both of the above strategies were observed in a recent study of adults' fraction and decimal arithmetic among adults (Author, submitted). Individuals with stronger cross-notation knowledge may be more likely to benefit from such strategies.

Second, cross-notation knowledge could focus learners' attention on similarities between fractions and decimals, leading to a deeper understanding of rational numbers. Fractions and decimals are superficially different; for example, adding fractions with unlike denominators

CROSS-NOTATION KNOWLEDGE

requires conversion to a common denominator, whereas adding decimals requires adding digits with the same place value. Yet, fractions and decimals have many similarities relating to general properties of rational numbers, such as the principle that a sum of positive numbers is larger than either addend. Making connections between fractions and decimals could reinforce learners' understanding of these general properties, which could in turn facilitate acquisition of within-notation knowledge. For instance, understanding the above principle could help learners avoid errors that violate it, such as $3/5 + 1/4 = 4/9$ and $4 + .3 = .7$.

Previous Research on Cross-Notation Knowledge

Several previous studies have employed tasks that assess cross-notation knowledge (though without using that term), such as conversion between fractions and decimals and cross-notation comparison or ordering (Binzak & Hubbard, 2020; Ganor-Stern, 2013; Hurst & Cordes, 2016, 2018; Mazzocco & Devlin, 2008; McMullen, Laakkonen, Hannula-Sormunen, & Lehtinen, 2015; Van Hoof, Janssen, Verschaffel, & Van Dooren, 2014; Zhang, Fang, Gabriel, & Szűcs, 2016). However, these studies did not analyze relations between cross-notation knowledge and other aspects of rational number knowledge.

Other studies did not assess cross-notation knowledge but hint at influences of decimal knowledge on fraction knowledge and vice versa that could be mediated by cross-notation knowledge. For example, a longitudinal study found that decimal magnitude knowledge in winter of fourth grade predicted fraction magnitude knowledge in spring of fourth grade when controlling for initial fraction magnitude knowledge (I. Resnick et al., 2019; see also McMullen & Van Hoof, 2020). Similarly, using a priming paradigm, Ren and Gunderson (2019) found that activating children's and adults' fraction knowledge affected subsequent performance on a decimal magnitude comparison task. However, an intervention study found no benefit of

CROSS-NOTATION KNOWLEDGE

integrated fraction/decimal instruction over fractions-only instruction for improving fraction outcomes among at-risk fourth graders (Malone, Fuchs, Sterba, Fuchs, & Foreman-Murray, 2019). In summary, the role of cross-notation knowledge in children's numerical development (if any) is not yet clear.

The Present Study

The main goal of the present study was to test the prediction that individual differences in cross-notation knowledge would explain unique variance in rational number arithmetic skill when controlling for within-notation fraction and decimal magnitude knowledge. This prediction is consistent with the more general hypothesis that cross-notation knowledge confers benefits beyond those of within-notation knowledge alone. The prediction builds on previous research that has found positive relations between individual differences in magnitude knowledge with fractions or decimals and arithmetic skill with the same notation (Bailey et al., 2017; Rittle-Johnson & Koedinger, 2009; Siegler & Pyke, 2013; Torbeyns et al., 2015), consistent with the Integrated Theory of Numerical Development (Siegler et al., 2011).

Another goal was to investigate whether effects of fraction and decimal magnitude knowledge on arithmetic skill are notation specific. If children's knowledge of different notations is highly compartmentalized, magnitude knowledge with each notation should predict arithmetic with the same notation more than arithmetic with the other notation, and should not predict arithmetic with the other notation at all when controlling for magnitude knowledge with that other notation. However, our hypothesis regarding cross-notation knowledge suggests that knowledge of each notation could help acquire proficiency with the other notation as well. To the extent that this is the case, within-notation magnitude knowledge of each notation could predict

CROSS-NOTATION KNOWLEDGE

arithmetic with both notations about equally, and could predict arithmetic with the other notation even when controlling for magnitude knowledge with that other notation.

Research Approach and Analyses

To test these predictions, we re-analyzed data from studies of children that included assessments of rational number arithmetic as well as assessments of fraction magnitude knowledge (e.g., “ $1/2 > 3/4?$ ”), decimal magnitude knowledge (e.g., “ $0.50 > 0.75?$ ”), and cross-notation magnitude knowledge (e.g., “ $4/5 > 0.89?$ ”) using comparison or ordering tasks. A literature search by the first author identified three published studies that met these criteria, two conducted by the second author (Author, 2016, 2020) and one conducted by the third author (Author, 2018). All of these studies were included in our analyses.

We fit a “within-notation-only” model and a “cross-and-within-notation” model to each dataset, then compared the models. Both models were linear mixed models with rational number arithmetic accuracy as the dependent variable; grade level, fraction magnitude knowledge, and decimal magnitude knowledge as fixed effects; and participant as a random effect. The cross-and-within-notation model, but not the within-notation-only model, also included cross-notation magnitude knowledge as a fixed effect. We expected that model comparisons would favor the cross-and-within-notation model and that in this model, cross-notation magnitude knowledge would have a positive effect on arithmetic accuracy.

To investigate notation-specificity of effects of magnitude knowledge on arithmetic skill, in the studies that included both fraction and decimal arithmetic (Studies 2 and 3), all models included arithmetic notation and interactions of arithmetic notation with each magnitude knowledge measure as fixed effects. We also considered that magnitude knowledge might differentially predict skill with different arithmetic operations. For example, magnitude

CROSS-NOTATION KNOWLEDGE

knowledge might be more related to skill with addition and subtraction than with multiplication and division because sums and differences of rational numbers can be estimated by composing or decomposing magnitudes, whereas estimation of products and quotients of rational numbers requires more advanced transformations such as scaling (CCSSI, 2010, 5.NF.5; Devlin, 2008). Therefore, in the studies whose arithmetic tasks involved multiple operations (Studies 1 and 3), all models included operation and interactions of operation with each magnitude knowledge measure as fixed effects. In the one study that included both fraction and decimal arithmetic with multiple operations (Study 3), the models also included the three-way interactions of arithmetic notation and operation with each magnitude knowledge measure as fixed effects.

Models were fit using both frequentist and Bayesian approaches in *R* (version 3.6.1; R Core Team, 2018). Frequentist analyses employed *lmer* from the *lme4* package (Bates, Maechler, Bolker, & Walker, 2015) and *lmerTest* (Kuznetsova, Brockhoff, & Christensen, 2016). Models were fit using maximum likelihood (ML) and were compared using the Akaike Information Criterion (AIC) and Chi-square tests. Bayesian analyses employed *brm* from the *brms* package in *R* (Bürkner, 2017), which is a front end for Stan (Carpenter et al., 2017), a probabilistic programming language. Default priors from *brm* were used (an improper flat prior over the reals for fixed effects and a half student-*t* prior for the standard deviation of random effects); sampling employed the no-U-turn sampler (NUTS; Hoffman & Gelman, 2014) with 8 chains of 10,000 iterations, including 2,000 warmup iterations, for each model. Bayesian model comparisons employed the leave-one-out information criterion (LOOIC), an estimate of predictive accuracy (Gelman, Hwang, & Vehtari, 2014), and Bayes Factors (BFs), obtained from *LOO* and *bayes_factor* in *brms*. Andraszewicz and colleagues (2015) recommend interpreting BFs

CROSS-NOTATION KNOWLEDGE

exceeding 1, 3, 10, 30, and 100 as indicating anecdotal, moderate, strong, very strong, and extremely strong evidence, respectively.

Bayesian analyses were included because they could, in principle, provide evidence favoring the null hypothesis—that is, the within-notation-only model. However, to preview the results, all model comparisons favored the cross-and-within-notation model. Therefore, we report details regarding the cross-and-within-notation models in the main text, and details regarding the within-notation-only models in the Supplementary Materials. For each effect in the cross-and-with-notation models, we report a point estimate (point estimates from Bayesian and frequentist analyses were identical except in one case, noted below), a 95% credible interval (95% CI) from the Bayesian analysis, and significance test results from the frequentist analysis.

Study 1

Our first dataset came from a single time point of a longitudinal study of Finnish primary school students' rational number development (Author, 2016, 2020). Participants were fourth through sixth graders from two schools in southwest Finland. In Finland, fraction and decimal magnitudes and addition and subtraction of fractions with like denominators is typically covered by the end of fourth grade, decimal arithmetic and more advanced fraction arithmetic is covered in fifth and sixth grades. Within-notation magnitude knowledge was assessed using magnitude comparison and ordering tasks, and cross-notation magnitude knowledge was assessed using a magnitude comparison task. The measure of arithmetic skill was a fraction arithmetic task, which included all four arithmetic operations.

CROSS-NOTATION KNOWLEDGE

Method

Participants

Our analysis included 277 fourth ($n = 94$; $\text{Mean}_{\text{Age}} = 10$ years, 11 months), fifth ($n = 83$; $\text{Mean}_{\text{Age}} = 11$ years, 11 months), and sixth ($n = 100$; $\text{Mean}_{\text{Age}} = 12$ years, 10 months) graders (138 male; 139 female). The sample represented a Finnish urban population, including students from lower-middle class to middle class backgrounds and from diverse ethnic backgrounds. The ethics board of XXX (project name: XXX), the district, and school administrations approved the study.

Tasks, Stimuli, and Procedure

Participants completed a paper-and-pencil test of their rational number knowledge in a whole-class setting in their regular math classrooms. The test included assessments of magnitude knowledge, understanding of rational number density, and fraction arithmetic, administered in that order. The density assessment does not relate to the predictions tested in the present study and so will not be discussed further (see Author, 2020 for details on this task). Students had 45 minutes to complete the test.

Magnitude Knowledge. The magnitude knowledge assessment included three tasks: within-notation comparison, within-notation ordering, and cross-notation comparison. The within-notation comparison task required participants to circle the larger of two fractions (e.g., $5/8$, $4/3$) or two decimals (e.g., 0.36, 0.5), or to circle both numbers if they were equal. The within-notation ordering task required participants to put three fractions (e.g., $6/8$, $2/2$, $1/3$) or three decimals (e.g., 6.79, 6.786, 6.4) in order from smallest to largest. The cross-notation comparison task was identical to the within-notation comparison task except that each trial involved comparing one fraction and one decimal (e.g., $1/7$, 0.7).

CROSS-NOTATION KNOWLEDGE

Each within-notation task included three fraction items and three decimal items, and the cross-notation comparison task included four items. Each correct answer was given one point. Measures of within-notation magnitude knowledge were calculated separately for fractions and decimals by adding scores from the comparison and ordering tasks (maximum = 6 for each notation). Scores on the cross-notation comparison task (maximum = 4) served as our measure of cross-notation magnitude knowledge. Cronbach's alpha was .86 for fraction magnitude knowledge, .81 for decimal magnitude knowledge, and .78 for cross-notation magnitude knowledge. All measures of magnitude knowledge were converted to proportions correct and mean-centered for analysis.

Fraction Arithmetic. Participants completed 12 fraction arithmetic problems, including 7 fraction addition and subtraction items ($3/5+1/5$; $2/9+5/9$; $2/5+3/10$; $2\ 3/5+1/5$; $4-1/2$; $5\ 4/5-2/5$; $3\ 3/4+4$) and 5 fraction multiplication and division items ($1/2\times 1/2$; $2/3\times 4/5$; $1\ 3/8\times 1/8$; $6/7\times 3/2$; $1/4\div 1/2$) with like and unlike denominators. Each correct answer was given one point, with a maximum score of 7 for the addition and subtraction (Cronbach's alpha = .75) and 5 for multiplication and division (Cronbach's alpha = .71). These scores were converted to proportions correct separately for addition/subtraction and multiplication/division.

Analysis

The within-notation-only model was a linear mixed model with accuracy on the fraction arithmetic tasks as the dependent variable; grade, within-notation fraction magnitude knowledge, within-notation decimal magnitude knowledge, arithmetic operation, and the interactions of fraction and decimal magnitude knowledge with arithmetic operation as fixed effects; and participant as a random effect. The cross-and-within-notation model included all effects that were included in the within-notation-only model, and also included cross-notation magnitude

CROSS-NOTATION KNOWLEDGE

knowledge and its interaction with arithmetic operation as fixed effects. Arithmetic operations were classified as either addition/subtraction or multiplication/division, which were dummy coded as -0.5 and 0.5 respectively¹.

Results and Discussion

Descriptive statistics and zero-order correlations for the measures of magnitude knowledge and arithmetic are shown in the Appendix (Table A1). As predicted, model comparisons favored the cross-and-within-notation model over the within-notation-only model, as indicated by lower AIC (-6.6 vs. -0.3), a significant Chi-square test ($\chi^2(2) = 10.3, p = .006$), lower LOOIC (-21.5 vs. -17.3), and BF of 2.9.

Details regarding the cross-and-within-notation model are shown in Table 1. As predicted, higher cross-notation knowledge predicted higher arithmetic accuracy. This result is consistent with the hypothesis that cross-notation knowledge benefits arithmetic learning, at least for fraction arithmetic. The absence of a cross-notation knowledge by arithmetic operation interaction indicates that effects of cross-notation knowledge did not differ between addition/subtraction and multiplication/division.

===== Table 1 =====

A significant main effect was also found for decimal magnitude knowledge, but not for fraction magnitude knowledge. Both fraction and decimal magnitude knowledge interacted with arithmetic operation. To investigate these interactions, we used the samples generated in the Bayesian analysis to calculate 95% CIs for effects of fraction and decimal magnitude knowledge

¹ Assigning numeric codes with a difference of 1.0 for arithmetic operation ensures that the estimated effect of arithmetic operation equals the difference in accuracies between arithmetic operations. Assigning numeric codes centered around 0.0 ensures that the estimated effect of each other predictor in the model equals the average of the predictor's estimated effects for all arithmetic operations, as would be the case in ANOVA.

CROSS-NOTATION KNOWLEDGE

on addition/subtraction and multiplication/division accuracy². Effects of fraction magnitude knowledge were larger for addition/subtraction than multiplication/division, but the 95% CIs of both effects included zero (addition/subtraction: estimate = 0.10, 95% CI = [-0.01, 0.21]; multiplication/division: estimate = -0.08, 95% CI = [-0.19, 0.03]). Effects of decimal magnitude knowledge were also larger for addition/subtraction than multiplication/division, and 95% CIs of the effects excluded zero for addition/subtraction (estimate = 0.19, 95% CI = [0.07, 0.30]) but not multiplication/division (estimate = 0.01, 95% CI = [-0.11, 0.13]).

Effects of grade and arithmetic operation were also found. Children in higher grades were more accurate (fourth grade = 28%, fifth grade = 39%, sixth grade = 51%), and accuracy was higher on addition/subtraction than multiplication/division problems (60% vs. 20%).

Study 2

Study 2 analyzed data from a study of children's rational number magnitude knowledge, rational number arithmetic, and pre-algebra skills previously reported in Author (2018). Participants were fourth to seventh graders in the USA. According to the Common Core State Standards for mathematics, comparison of fractions and decimals, as well as addition of fractions with like denominators and multiplication of fraction by a whole number, should be covered by the end of fourth grade, whereas decimal arithmetic and more advanced fraction arithmetic are to be covered in fifth and sixth grade (CCSSI, 2010). The study included both within-notation and cross-notation magnitude comparison tasks. The measure of arithmetic skill included fraction and decimal addition problems, but no other arithmetic operations.

² Effect on addition/subtraction = (main effect of magnitude knowledge) – 0.5 * (interaction with operation).
Effect on multiplication/division = (main effect of magnitude knowledge) + 0.5 * (interaction with operation).

CROSS-NOTATION KNOWLEDGE

Method

Participants

Our analysis included 39 children ($M_{age} = 11.8$ years, range: 9.8 to 14.4 years; 10 fourth graders, 10 fifth graders, 3 sixth graders, and 16 seventh graders; 24 boys and 15 girls), recruited from the Boston, MA, USA area through a variety of recruitment methods and testing locations, including schools, child care programs, and on-campus research lab. We do not have additional demographic information about the sample. Two children who were included in Author (2018) were excluded from the current analysis because they had missing arithmetic data, which is the primary purpose of the current analysis. The institutional review board of XXX approved the study (IRB# XXX, project name XXX).

Tasks, Stimuli, and Procedure

Children completed assessments of magnitude knowledge, pre-algebra, and rational number arithmetic in that order. The pre-algebra assessment does not relate to the predictions tested in the present study and so will not be discussed further (see Author (2018) for details about this task). The entire session occurred one-on-one between a researcher and the child, using a computer for the magnitude knowledge assessment and paper-and-pencil for all other tasks.

Magnitude Knowledge. Magnitude knowledge was measured using a magnitude comparison task in which children were shown two numbers presented on a computer screen and asked to decide which was larger as accurately and quickly as they could by pressing the corresponding key on the keyboard. The task included six types of comparisons: fraction versus fraction, decimal versus decimal, whole number versus whole number, fraction versus decimal, fraction versus whole number, and decimal versus whole number.

CROSS-NOTATION KNOWLEDGE

Each block consisted of 16 trials, made from four unique comparisons from two ratio bins, each shown twice ($4 \times 2 \times 2 = 16$). The ratio bins (larger magnitude/smaller magnitude) were approximately 1.5 (range: 1.35 to 1.67) and 2.5 (range: 2.20 to 2.92). The pairs of numbers compared in the fraction vs. fraction, decimal vs. decimal, and decimal vs. fraction blocks had the same magnitudes, up to rounding error. For example, the fraction vs. fraction trials included the comparison $\frac{3}{5}$ vs. $\frac{2}{9}$; the corresponding comparisons in the decimal vs. decimal and fraction vs. decimal blocks were 0.60 vs. 0.22 and $\frac{3}{5}$ vs. 0.22. In the fraction vs. decimal block, the larger value was presented as a fraction on half the trials and as a decimal on the other half. Magnitude values ranged from $\frac{1}{5}$ (0.2) to $\frac{7}{2}$ (3.5), to include values above and below one. For fraction stimuli, the numerators and denominators were all between 1 and 10; for fraction vs. fraction comparisons, each component of each fraction differed from both components of the other fraction. Decimals were always presented to the hundredth digit (potentially with a 0 in the hundredth digit, e.g., 0.20) with an integer before the decimal point (sometimes 0).

Each type of comparison was presented in a separate block. The six blocks were presented in a random order for each participant. Although participants were encouraged to answer as quickly as they could, they had unlimited time and all trials were included, regardless of their reaction time.

Within-notation magnitude knowledge was calculated as the proportion of trials correct (out of 16) on the fraction vs. fraction (Cronbach's $\alpha = .77$) and decimal vs. decimal (Cronbach's $\alpha = .62$) blocks, separately. Proportion correct on the fraction vs. decimal block (Cronbach's $\alpha = .72$) served as our measure of cross-notation magnitude knowledge. Data from blocks involving whole numbers were not included in the current analyses. As in Study 1, all measures of magnitude knowledge were mean-centered.

CROSS-NOTATION KNOWLEDGE

Rational Number Arithmetic. The rational arithmetic assessment included a fraction addition task and a decimal addition task. Order of these two tasks was counterbalanced between participants.

The fraction addition task included five fraction addition problems ($2/3+5/6$; $2/5+3/4$; $12+4/7$; $5/8+2/4$; $3/9+2/3$) presented in a booklet with enough space between problems to workout solutions and provide an answer. Problems were presented horizontally, with fractions presented in their formal upright notation. All problems involved fractions with different denominators. Children were able to take as long as they needed. Performance was scored as the proportion of problems correct (out of 5; Cronbach's alpha = .95) and any correct answer was accepted (it did not need to be in any particular format or specific simplified fraction).

The decimal addition task included five decimal addition problems ($0.5+0.38$; $0.21+0.63$; $0.78+0.19$; $0.45+0.8$; $0.53+0.49$) presented in a booklet with enough space between problems to workout solutions and provide an answer. Problems were presented horizontally. Three problems involved addends that both had two decimal digits, and two problems involved one addend with two decimal digits and one addend with one decimal digit. Children were able to take as long as they needed. Performance was scored as the proportion of problems correct (out of 5; Cronbach's alpha = .64) and any correct answer was accepted.

Analysis

The within-notation-only model was a linear mixed model with accuracy on the arithmetic assessment as the dependent variable; grade, within-notation fraction magnitude knowledge, within-notation decimal magnitude knowledge, arithmetic notation, and the interactions of fraction and decimal magnitude knowledge with arithmetic notation as fixed effects; and participant as a random effect. The cross-and-within-notation model included all

CROSS-NOTATION KNOWLEDGE

effects that were included in the within-notation-only model as well as cross-notation magnitude knowledge and its interaction with arithmetic notation as fixed effects. In all analyses, fraction and decimal arithmetic were dummy coded as -0.5 and 0.5 respectively³.

Results and Discussion

Descriptive statistics and zero-order correlations for the measures of magnitude knowledge and arithmetic are shown in the Appendix (Table A2). As in Study 1, model comparisons favored the cross-and-within-notation model, as indicated by lower AIC (30.5 vs. 33.4), a significant Chi-square test ($\chi^2(2) = 6.8, p = .033$), lower LOOIC (30.4 vs. 31.6), and BF of 22.0.

Details regarding the cross-and-within-notation model are shown in Table 2. As predicted, higher cross-notation magnitude knowledge predicted higher arithmetic accuracy, replicating the main finding of Study 1. Effects of fraction and decimal magnitude knowledge were not significant, and no interactions reached significance. Thus, there was not statistically significant evidence that fraction magnitude knowledge relates more strongly to fraction than decimal arithmetic or that decimal magnitude knowledge relates more strongly to decimal than fraction arithmetic.

===== Table 2 =====

Finally, significant effects of grade and arithmetic notation were also found. Children in higher grades were more accurate (fourth grade = 48%, fifth grade = 82%, sixth grade = 80%, seventh grade = 85%). Accuracy was higher on decimal than fraction arithmetic (84% vs. 65%).

³ Assigning numeric codes with a difference of 1.0 for arithmetic notation implies that the estimated effect of arithmetic operation equals the difference in accuracies between arithmetic notations. Assigning numeric codes centered around 0.0 implies that the estimated effect of each other predictor in the model equals the average of the predictor's estimated effects for both arithmetic notations, as would be the case in ANOVA.

Study 3

The third dataset came from a single time point of a longitudinal study of middle school students' rational number development (Author, 2019, 2020). Participants were seventh and eighth graders in the USA, where formal instruction in fractions and decimals is typically completed prior to seventh grade (CCSSI, 2010). The magnitude knowledge assessment employed within-notation ordering tasks with fractions and decimals, and a cross-notation ordering task. The arithmetic assessment in this study included all four operations with both fractions and decimals.

Methods

Participants

Our analysis included 394 children (232 seventh graders and 162 eighth graders; 209 females and 185 males). All participants were from a single school in Gainesville, FL, USA, which was made up of students who were identified as 51% white, 28% African American, 11% Hispanic, and 5% Asian in district records; 43% of students at the school were eligible for free or reduced lunch. All participants had parental consent to participate in the study and gave their own assent before participating. The ethics board of XXX (project name: XXX), the district, and school administrations approved the study.

Tasks, Stimuli, and Procedure

Participants completed a series of assessments of various aspects of rational number knowledge (detailed in Author, 2020). Only the magnitude knowledge assessment and rational number arithmetic assessment will be examined in the present study. The arithmetic assessment was completed immediately prior to the magnitude knowledge assessment. Students had 50

CROSS-NOTATION KNOWLEDGE

minutes to complete all assessments. The assessments were administered in whole class format during students' regular science class by the second author.

Magnitude Knowledge. The magnitude knowledge assessment included fraction ordering and decimal ordering tasks, which served as our measures of within-notation magnitude knowledge, and a cross-notation ordering task, which served as our measure of cross-notation magnitude knowledge. Each task included two items. Each item required participants to put either three or four numbers in order from smallest to largest. The fraction items were $\{5/8, 11/37, 3/4\}$ and $\{6/12, 5/7, 2/6, 2/3\}$, the decimal items were $\{7.351, 7.8, 7.09, 7.71\}$ and $\{0.68, 0.29, 0.351, 0.5\}$, and the mixed items were $\{0.5, 1/4, 5/100, 0.356\}$ and $\{13/52, 0.111, 2/3, 0.8\}$.

Because each task included only two items, but each item required multiple pairwise comparisons, to increase the captured variance across participants, participants received one point for each pair of numbers that they ordered correctly. For example, for the item $\{5/8, 11/37, 3/4\}$, participants received 1 point for correctly ordering each of the following pairs of numbers: $5/8$ vs. $11/37$, $5/8$ vs. $3/4$, and $11/37$ vs. $3/4$. The maximum possible scores were 9 for fractions (Cronbach's alpha = .93) and 12 for decimals (Cronbach's alpha = .95). For the cross-notation magnitude knowledge task, only cross-notation pairs (e.g. 0.5 vs. $1/4$ but not $1/4$ vs. $5/100$) were scored, for a maximum of 8 points for cross-notation magnitude knowledge (Cronbach's alpha = .80). As in Studies 1 and 2, magnitude knowledge scores were converted to proportions correct and mean-centered.

Rational Number Arithmetic. Participants completed 24 rational number arithmetic problems. Items included 12 fraction arithmetic items ($2/3 - 1/3$; $4/7 \div 1/2$; $3/4 \times 1/5$; $8 \frac{1}{2} \div 4 \frac{1}{8}$; $5/7 - 1/2$; $1/5 + 2/3$; $7/8 + 2/8$; $2 \frac{3}{4} + 4 \frac{1}{8}$; $2 \frac{6}{7} + 5 \frac{1}{2}$; $5/8 \div 3/8$; $3 \frac{2}{3} - 3/4$; $3/5 \times 1/5$) and 12 decimal arithmetic items (1.05×0.2 ; $0.71 - 0.4$; $0.11 + 0.7$; $5.29 - 4.2$; $3.4 + 1.02$; $0.38 - 0.14$; $0.4 + 0.2$;

CROSS-NOTATION KNOWLEDGE

0.9÷0.3; 0.4×0.52; 0.111×0.097; 3.06×5.3; 0.84÷0.4). Each correct answer was given one point.

Scores on each combination of notation (fraction, decimal) and arithmetic operation (addition/subtraction, multiplication/division) were converted to proportions correct for analysis.

Cronbach's alpha was .86 for fraction addition/subtraction, .67 for fraction multiplication/division, .73 for decimal addition/subtraction, and .78 for decimal multiplication/division.

Analysis

The within-notation-only model was a linear mixed model with accuracy on the arithmetic assessment as the dependent variable; grade, within-notation fraction magnitude knowledge, within-notation decimal magnitude knowledge, arithmetic operation, arithmetic notation, the interaction of operation and notation, the interactions of fraction and decimal magnitude knowledge with arithmetic operation and arithmetic notation, and the three-way interactions of fraction and decimal magnitude knowledge with both operation and notation as fixed effects; and participant as a random effect. The cross-and-within-notation model included all effects that were included in the within-notation-only model as well as cross-notation magnitude knowledge, its interactions with operation and notation, and the three-way interaction of cross-notation magnitude knowledge with both operation and notation. As in Study 1, arithmetic operation was dummy-coded as -0.5 for addition or subtraction and 0.5 for multiplication or division, and as in Study 2, arithmetic notation was dummy-coded as -0.5 for fraction arithmetic and 0.5 for decimal arithmetic.

Results and Discussion

Descriptive statistics and zero-order correlations for the measures of magnitude knowledge and arithmetic are shown in the Appendix (Table A3). As in Studies 1 and 2, all

CROSS-NOTATION KNOWLEDGE

model comparisons favored the cross-and-within-notation model, as indicated by lower AIC (185.5 vs. 201.2), a significant Chi-square test ($\chi^2(4) = 23.7, p < .001$), lower LOOIC (46.7 vs. 50.4), and BF of 63.9.

Details regarding the cross-and-within-notation model are shown in Table 3. As predicted, cross-notation magnitude knowledge positively predicted arithmetic accuracy. No interactions involving cross-notation magnitude knowledge were found. Thus, cross-notation magnitude knowledge had about equally strong relations to fraction and decimal arithmetic and to accuracy with different arithmetic operations.

===== Table 3 =====

The main effect of fraction magnitude knowledge did not reach significance, but a three-way interaction of fraction magnitude knowledge, arithmetic operation, and arithmetic notation was found. To investigate this interaction, we used the samples generated in the Bayesian analysis to calculate estimated effects of fraction magnitude knowledge, and 95% CIs thereof, for each combination of arithmetic operation and notation⁴. The 95% CI of the effect on fraction addition/subtraction excluded zero (estimate = 0.16, 95% CI = [0.03, 0.29]), whereas the 95% CIs of the effects on other problem types included zero (fraction multiplication/division: estimate = -0.05, 95% CI = [-0.18, 0.08]; decimal addition/subtraction: estimate = 0.02, 95% CI = [-0.11, 0.15]; decimal multiplication/division: estimate = 0.09, 95% CI = [-0.04, 0.22]).

⁴ Effect on fraction addition/subtraction = (main effect of magnitude knowledge) – 0.5 * (interaction with operation) – 0.5 * (interaction with notation) + 0.25 * (three-way interaction).
Effect on fraction multiplication/division = (main effect of magnitude knowledge) + 0.5 * (interaction with operation) – 0.5 * (interaction with notation) – 0.25 * (three-way interaction).
Effect on decimal addition/subtraction = (main effect of magnitude knowledge) – 0.5 * (interaction with operation) + 0.5 * (interaction with notation) – 0.25 * (three-way interaction).
Effect on decimal multiplication/division = (main effect of magnitude knowledge) + 0.5 * (interaction with operation) + 0.5 * (interaction with notation) + 0.25 * (three-way interaction).

CROSS-NOTATION KNOWLEDGE

An effect of decimal magnitude knowledge was also found, qualified by an interaction with arithmetic operation. We investigated the interaction by calculating means and 95% CIs of effects of decimal magnitude knowledge on addition/subtraction accuracy and multiplication/division accuracy, as in Study 1. Effects of decimal magnitude knowledge were larger for addition/subtraction (estimate = 0.34, 95% CI = [0.24, 0.44]) than multiplication/division (estimate = 0.18, 95% CI = [0.09, 0.29]), but in contrast to Study 1, 95% CIs for both effects excluded zero. Effects of decimal magnitude knowledge on fraction arithmetic did not differ from effects of decimal magnitude knowledge on decimal arithmetic.

Finally, effects of arithmetic operation and arithmetic notation were found, indicating that accuracy was higher on addition/subtraction than multiplication/division as in Study 1, and was higher on decimal than fraction arithmetic as in Study 2. These effects were qualified by an operation by notation interaction, indicating that for addition/subtraction, accuracy was higher with decimals than fractions (fractions: 41%, decimals: 66%), whereas the opposite was true for multiplication/division (fractions: 36%, decimals: 24%).

In contrast to Studies 1 and 2, there was no effect of grade. This null result may reflect the fact that participants in Study 3 were in seventh or eighth grade, during which rational number arithmetic is not a focus of instruction. Studies 1 and 2 included children in fourth, fifth, and sixth grades, during which rational number arithmetic is a major focus of instruction.

Combined Analyses

Results of Studies 1, 2, and 3 were broadly consistent but differed in some details. For example, not all model comparisons favored the cross-and-within-notation model equally strongly (BFs = 2.9, 22.0, and 63.9 in Studies 1, 2, and 3 respectively), and some effects were found in only some studies. To address these issues, pooled data from all three studies were

CROSS-NOTATION KNOWLEDGE

submitted to a within-notation-only model and a cross-and-within-notation model. Predictors were as in Study 3 except that experiment was included as a random effect, with participants nested within experiments. Model comparisons favored the cross-and-within-notation model, as indicated by lower AIC (426.8 vs. 456.0), a significant Chi-square test ($\chi^2(4) = 37.2, p < .001$), lower LOOIC (293.9 vs. 310.0), and BF of 34,376.7. This BF indicates extremely strong evidence for the cross-and-within-notation model (Andraszewicz et al., 2015).

Details regarding the cross-and-within-notation model are shown in Table 4. Significant effects were the same as in Study 3, with the exception that an effect of grade appeared in this analysis but not in Study 3. Cross-notation magnitude knowledge predicted arithmetic accuracy and did not interact with any other predictor. Interactions involving within-notation magnitude knowledge did appear, and were investigated as in Study 3, yielding very similar results. The effect of fraction magnitude knowledge was credibly greater than zero for fraction addition/subtraction (estimate = 0.13, 95% CI = [0.04, 0.22]) but not for any other problem category (fraction multiplication/division: estimate = -0.07, 95% CI = [-0.16, 0.02]; decimal addition/subtraction: estimate = 0.02, 95% CI = [-0.11, 0.14]; decimal multiplication/division: estimate = 0.08, 95% CI = [-0.04, 0.21]). The effect of decimal magnitude knowledge was larger for addition/subtraction (estimate = 0.27, 95% CI = [0.19, 0.35]) than for multiplication/division (estimate = 0.13, 95% CI = [0.05, 0.21]) but was credibly greater than zero in both cases.

===== Table 4 =====

General Discussion

The present study investigated relations between individual differences in magnitude knowledge and individual differences in rational number arithmetic skill. In contrast to previous studies, which investigated such relations primarily using within-notation measures of magnitude

CROSS-NOTATION KNOWLEDGE

knowledge, the present study estimated unique effects of both cross-notation and within-notation magnitude knowledge. Below, we review the key findings and discuss their implications for the role of cross-notation knowledge and within-notation knowledge in learning about rational numbers, instruction in rational numbers, and math learning in general.

The Role of Cross-Notation Knowledge in Learning About Rational Numbers

Individual differences in cross-notation magnitude knowledge predicted arithmetic skill with rational numbers while controlling for within-notation magnitude knowledge. To our knowledge, the present study is the first to show this effect. Attesting to the robustness of the effect, it appeared in three datasets that involved children of different ages and nationalities, different measures of magnitude knowledge, and different measures of rational number arithmetic. The effect did not vary as a function of arithmetic notation or arithmetic operation.

Many measures of children's knowledge of rational number magnitudes have relied exclusively on within-notation tasks, such as fraction magnitude comparison (Fazio, DeWolf, & Siegler, 2016; Gabriel, Szucs, & Content, 2013; Meert, Grégoire, & Noël, 2010), fraction number line estimation (Booth et al., 2014; Resnick et al., 2016), decimal magnitude comparison (DeWolf, Grounds, Bassok, & Holyoak, 2014; Roell, Viarouge, Houdé, & Borst, 2017), or decimal number line estimation (Durkin & Rittle-Johnson, 2015; Rittle-Johnson et al., 2001). The present findings demonstrate that purely within-notation magnitude tasks may fail to capture important aspects of individual differences, and therefore suggest that it could be useful to include cross-notation tasks in assessments of rational number magnitude knowledge. Related, it could also be useful to investigate children's uses of cross-notation knowledge, such as translating between notations, when performing within-notation tasks (e.g., Siegler et al., 2011).

CROSS-NOTATION KNOWLEDGE

Which aspects of individual differences are captured by cross-notation magnitude tasks but are not captured, or are captured less well, by differences in accuracy on within-notation magnitude tasks? One possibility is that cross-notation tasks tap into children's conceptual understanding of fraction-decimal equivalence and their procedural skill at converting fractions into decimals and decimals into fractions. For example, when asked to compare 0.5 and $\frac{1}{4}$, a child might reason that $0.5 = \frac{1}{2}$ and $\frac{1}{2} > \frac{1}{4}$ so $0.5 > \frac{1}{4}$. Alternatively, the child might reason that $\frac{1}{4} = 0.25$ and $0.25 < 0.5$ so $\frac{1}{4} < 0.5$.

Another possibility is that cross-notation tasks tap into analog magnitude representations that ground children's understanding of both fraction and decimal magnitudes (Matthews, Lewis, & Hubbard, 2016; Zhang et al., 2016). Binzak and Hubbard (2020) found that adults perform cross-notation comparisons faster and more accurately as the distance between the to-be-compared numbers increases, consistent with reliance on analog magnitude representations during such comparisons. However, distance effects also appeared for within-notation comparisons, and were generally as large for fraction versus fraction comparisons as for cross-notation comparisons. Thus, within-notation and cross-notation comparisons likely both elicit similar levels of reliance on analog magnitude representations. It remains to be seen whether such representations are involved in the aspects of individual differences that are uniquely captured by cross-notation tasks.

Both accounts of cross-notation magnitude knowledge are consistent with the possibility that this knowledge has a causal effect on rational number arithmetic. First, conversion between fractions and decimals could enable children to use knowledge of each notation to reason about arithmetic problems involving the other notation. For example, a child who has this ability, when presented $.4 \times .2$, could reason that $.4 \times .2 = \frac{4}{10} \times \frac{2}{10} = \frac{8}{100} = .08$, thus avoiding the common

CROSS-NOTATION KNOWLEDGE

error $.4 \times .2 = .8$. Second, analog magnitude representations could enable children to evaluate answers to arithmetic problems based on plausibility. For example, a child who can form an analog magnitude representation of $3/5 + 1/4$ might recognize that the common incorrect response $4/9$ is implausibly small. As these examples illustrate, magnitude knowledge could help children avoid common errors in rational arithmetic, thus increasing the likelihood of learning correct procedures and concepts.

In principle, variables not included in our analyses could account for some or all of the variance shared by cross-notation magnitude knowledge and rational number arithmetic. However, many variables that might play such a role are also correlated with fraction and decimal magnitude knowledge, for example general math achievement, nonverbal reasoning, working memory, and vocabulary (Bailey et al., 2017; Malone et al., 2017; Resnick et al., 2019; Siegler et al., 2012). The fact that our analyses controlled for fraction and decimal magnitude knowledge reduces the likelihood that such variables completely explain the relations that were found between cross-notation magnitude knowledge and arithmetic skill. Future research should further assess this possibility by controlling for a more extensive set of covariates than were included in the present study and directly testing the possibility of a causal relation.

The Role of Within-Notation Knowledge in Learning About Rational Numbers

In principle, relations between within-notation magnitude knowledge and arithmetic could be notation-specific, with fraction magnitude knowledge related specifically to fraction arithmetic and decimal magnitude knowledge related specifically to decimal arithmetic. This intuitively plausible pattern of relations is what would be expected if children's knowledge of rational numbers is compartmentalized by notation, with knowledge of magnitudes and knowledge of arithmetic being connected within each compartment. However, the present

CROSS-NOTATION KNOWLEDGE

findings did not display such a pattern. Fraction magnitude knowledge did not predict fraction arithmetic more strongly than decimal arithmetic, and decimal magnitude knowledge did not predict decimal arithmetic more strongly than fraction arithmetic.

A possible explanation for these results is that within-notation measures of magnitude knowledge tap into a general understanding of rational number magnitudes that is not specific to either notation and that is related to arithmetic proficiency with both notations. This general understanding could include analog representations of numerical magnitudes, as mentioned above (Binzak & Hubbard, 2020; Matthews et al., 2016; Zhang et al., 2016), as well as concepts and principles that apply to both fractions and decimals, such as the concept of representing numerical magnitudes as positions on a number line or the principle that a sum of positive numbers is greater than either addend. The fact that, in the present study, performance on decimal magnitude tasks predicted arithmetic skill more consistently than performance on fraction magnitude tasks predicted arithmetic skill could be because decimal magnitude tasks are more sensitive measures of general magnitude understanding than fraction magnitude tasks are, a possibility worth exploring in the future.

In our combined analysis, fraction magnitude knowledge uniquely predicted accuracy with fraction addition and subtraction, but not with fraction multiplication and division. Similarly, decimal magnitude knowledge predicted addition and subtraction accuracy more strongly than multiplication and division accuracy. These results may reflect students being more likely to think about numerical magnitudes in the context of addition and subtraction than multiplication and division, perhaps because addition and subtraction transparently involve composition and decomposition of magnitudes. Consistent with this explanation, most middle-school children know that adding positive fractions or decimals “makes bigger” and subtracting

CROSS-NOTATION KNOWLEDGE

them “makes smaller,” whereas far fewer correctly understand how multiplication or division by fractions or decimals affects numerical magnitudes (Lortie-Forgues & Siegler, 2017; Siegler & Lortie-Forgues, 2015).

Relations Between Within- and Cross-Notation Knowledge

Distinguishing between within- and cross-notation knowledge of rational numbers naturally leads to the question of how these types of knowledge relate to each other. We propose an iterative model in which each form of knowledge contributes to development of the other. Initially, children likely primarily acquire within-notation knowledge, including notation-specific concepts such as numerator and denominator (for fractions) and place value (for decimals). Such knowledge may create a foundation for subsequent development of cross-notation knowledge; for example, understanding the concepts of numerator and denominator provides a basis for converting fractions into decimals via division of numerator by denominator. Cross-notation knowledge may lead to further improvements in within-notation knowledge by one or both of the mechanisms proposed in the Introduction: (1) learners using one notation to help understand the other and (2) similarities between fractions and decimals drawing attention to general properties of rational numbers. Our iterative model implies that individual differences in each type of knowledge should predict improvements in the other type of knowledge both over time and after intervention. Future research should test these predictions.

The above proposal is compatible with and extends the Integrated Theory of Numerical Development (Siegler & Braithwaite, 2017). According to the theory, numerical development during middle childhood involves children integrating their knowledge of different types of numbers into a unified framework, represented by the number line. Previous formulations of the theory have emphasized one aspect of this process of integration, namely integrating rational

CROSS-NOTATION KNOWLEDGE

number knowledge with whole number knowledge. The iterative model described above draws attention to a complementary aspect of the process, namely integrating knowledge of fractions and knowledge of decimals, and implies that this aspect of integration may lead to refinements in knowledge of fractions, decimals, and rational numbers in general. Thus, consideration of cross-notation knowledge permits more detailed description of the developmental processes proposed by the Integrated Theory.

Implications for Instruction in Rational Numbers

If, as proposed, connections between fractions and decimals can facilitate learning rational arithmetic, then students might benefit from instruction that explicitly relies on such connections during instruction. For example, a student who incorrectly claims that $\frac{3}{5} + \frac{1}{4} = \frac{4}{9}$ might benefit from a teacher pointing out that $\frac{3}{5} + \frac{1}{4} = 0.6 + 0.25 = 0.85$, and that $\frac{4}{9}$ is much smaller than 0.85. Similarly, a student who incorrectly claims that $.4 \times .2 = .8$ might benefit from a teacher showing that $.4 \times .2 = \frac{4}{10} \times \frac{2}{10} = \frac{8}{100}$, and that $\frac{8}{100} = 0.08$, not 0.8. As these examples illustrate, making connections between fractions and decimals could help remediate misconceptions and encourage integration of previously encountered information.

The examples also illustrate how instruction that relies on connections between fractions and decimals may require prior knowledge on the part of students to be effective. For example, explaining $.4 \times .2$ by referring to $\frac{4}{10} \times \frac{2}{10}$ assumes that students know how to multiply a fraction by a fraction, a fifth grade topic in US schools (CCSSI, 2010). Thus, this explanation is most likely to be useful in fifth grade after fraction multiplication has been covered, or in sixth grade. Similarly, explaining $\frac{3}{5} + \frac{1}{4}$ by referring to $0.6 + 0.25$ is most likely to be useful in fifth grade after covering how to add decimals with unequal numbers of decimal digits (CCSSI, 2010), or in sixth grade. Educators who use such approaches should ensure that children have sufficient prior

CROSS-NOTATION KNOWLEDGE

knowledge to benefit from the instruction, and studies testing interventions that use such approaches should also test whether prior knowledge moderates the effects of the interventions.

This perspective may help to interpret results of a recent study that investigated effects of emphasizing cross-notation knowledge when teaching about fractions and decimals (Malone et al., 2019). At-risk fourth graders were randomly assigned to a business-as-usual control condition; a fractions-only intervention; or an integrated intervention that covered fractions, decimals, and connections between them. Fraction magnitude knowledge and fraction arithmetic improved more in both experimental conditions than in the control condition, but the integrated intervention did not lead to greater improvement on these measures than the fractions-only intervention. A possible explanation is that participants' knowledge of decimal magnitudes was insufficient to help them benefit from the cross-notation instruction. Consistent with this possibility, accuracy on a decimal magnitude task was rather low at pretest (11%) and still low at posttest (36%), though higher than at pretest. Students with greater decimal magnitude knowledge might be more able to leverage that knowledge to help understand fractions in the context of an integrated intervention.

Implications for Math Learning in General

The present study's emphasis on cross-notation knowledge aligns well with research that emphasizes the importance of understanding and flexibly using multiple external representations (MERs) when learning and doing math (Ainsworth, 2006). Previous research on MERs has largely emphasized connections between symbolic and graphical representations or between multiple graphical representations (e.g., Acevedo Nistal, Van Dooren, & Verschaffel, 2013; Ainsworth, 2006; Braithwaite & Goldstone, 2013), such as between fractions and number lines, fractions and pie charts, or number lines and pie charts (Rau & Matthews, 2017). The present

CROSS-NOTATION KNOWLEDGE

findings suggest that connections between multiple symbolic representations may also play an important role in math education.

Although the present study focused on cross-notation knowledge involving fractions and decimals, cross-notation knowledge is a more general concept. It also includes, to name a few, knowledge of relations of fractions and decimals to percentages and ratios; relations between different units of measure; relations among different notations for large whole numbers, such as 4,100,000, 4.1E6, and 4.1×10^6 ; and relations between degree and radian notations for the sizes of angles. In each example, understanding and flexibly using different notations requires relatively deep understanding of the concepts that the notations represent, but the effort to achieve cross-notation knowledge may also help learners to achieve such deep understanding and improve performance in related tasks. Future research should test this possibility in a wider range of mathematical domains.

Limitations

One limitation of the present study is that our literature search was not exhaustive. Other studies may exist that met our criteria for inclusion but were not included in the present study. Related, we did not include data on within-notation magnitude knowledge obtained using number line estimation tasks. This exclusion may have negatively biased our estimates of effects of within-notation magnitude knowledge on arithmetic, because arithmetic accuracy is more strongly correlated with number line estimation than with comparison (Schneider et al., 2018). Our analyses may also have underestimated effects of cross-notation knowledge because we did not include measures of cross-notation knowledge involving percentages. Percentages offer distinct affordances from both fractions and decimals (Tian, Braithwaite, & Siegler, 2020b), so knowledge of relations between fractions and percentages, and between decimals and

CROSS-NOTATION KNOWLEDGE

percentages, may make unique contributions to arithmetic development (Moss & Case, 1999). Future research should investigate the unique contributions of within- and cross-notation magnitude knowledge to rational number arithmetic using a wider range of datasets with more varied measures of both types of magnitude knowledge.

Conclusion

Cross-notation knowledge is an important aspect of mathematical knowledge in general and rational number knowledge in particular. The present study shows that cross-notation knowledge of rational number magnitudes captures variation among individuals that is not fully captured by within-notation measures of magnitude knowledge and that predicts individual differences in rational arithmetic proficiency. Thus, it could be useful to include cross-notation tasks in assessments of rational number knowledge. Further, future research should explore the possibility of using connections between fractions and decimals to improve children's understanding of both notations individually and rational number knowledge more generally.

References

- Acevedo Nistal, A., Van Dooren, W., & Verschaffel, L. (2013). Improving students' representational flexibility in linear-function problems: an intervention. *Educational Psychology*, (September 2013), 1–24. <https://doi.org/10.1080/01443410.2013.785064>
- Ainsworth, S. (2006). DeFT: A conceptual framework for considering learning with multiple representations. *Learning and Instruction*, 16(3), 183–198.
- Andraszewicz, S., Scheibehenne, B., Rieskamp, J., Grasman, R., Verhagen, J., & Wagenmakers, E.-J. (2015). An introduction to Bayesian hypothesis testing for management research. *Journal of Management*, 41(2), 521–543. <https://doi.org/10.1177/0149206314560412>
- Author. (submitted).

CROSS-NOTATION KNOWLEDGE

Author. (2016).

Author. (2018).

Author. (2019).

Author. (2020).

Bailey, D. H., Hansen, N., & Jordan, N. C. (2017). The codevelopment of children's fraction arithmetic skill and fraction magnitude understanding. *Journal of Educational Psychology*, *109*(4), 509–519. <https://doi.org/10.1037/edu0000152>

Bates, D., Maechler, M., Bolker, B., & Walker, S. (2015). Fitting linear mixed-effects models using lme4. *Journal of Statistical Software*, *67*(1), 1–48. <https://doi.org/10.18637/jss.v067.i01>

Binzak, J. V., & Hubbard, E. M. (2020). No calculation necessary: Accessing magnitude through decimals and fractions. *Cognition*, *199*(February), 104219. <https://doi.org/10.1016/j.cognition.2020.104219>

Booth, J. L., Newton, K. J., & Twiss-Garrity, L. K. (2014). The impact of fraction magnitude knowledge on algebra performance and learning. *Journal of Experimental Child Psychology*, *118*, 110–118. <https://doi.org/10.1016/j.jecp.2013.09.001>

Braithwaite, D. W., & Goldstone, R. L. R. L. (2013). Integrating formal and grounded representations in combinatorics learning. *Journal of Educational Psychology*, *105*(2), 666–682. <https://doi.org/10.1037/a0032095>

Braithwaite, D. W., & Siegler, R. S. (2018). Developmental changes in the whole number bias. *Developmental Science*, *21*(2), e12541. <https://doi.org/10.1111/desc.12541>

Braithwaite, D. W., & Siegler, R. S. (2020). Putting fractions together. *Journal of Educational Psychology*.

CROSS-NOTATION KNOWLEDGE

- Bright, G. W., Behr, M. J., Post, T. R., & Wachsmuth, I. (1988). Identifying fractions on number lines. *Journal for Research in Mathematics Education*, 19(3), 215–232.
- Bürkner, P. C. (2017). brms: An R package for Bayesian multilevel models using Stan. *Journal of Statistical Software*, 80(1). <https://doi.org/10.18637/jss.v080.i01>
- Byrnes, J. P., & Wasik, B. A. (1991). Role of conceptual knowledge in mathematical procedural learning. *Developmental Psychology*, 27(5), 777–786. <https://doi.org/10.1037/0012-1649.27.5.777>
- Carpenter, B., Gelman, A., Hoffman, M. D., Lee, D., Goodrich, B., Betancourt, M., ... Riddell, A. (2017). Stan: A probabilistic programming language. *Journal of Statistical Software*, 76(1). <https://doi.org/10.18637/jss.v076.i01>
- Charles, R., Caldwell, J., Cavanagh, M., Chancellor, D., Copley, J., Crown, W., ... Van der Walle, J. (2012). *enVisionMATH (Common Core edition)*. Glenview, IL: Pearson Education, Inc.
- Common Core State Standards Initiative. (2010). *Common core state standards for mathematics*. Washington, D.C.: National Governors Association Center for Best Practices and the Council of Chief State School Officers. Retrieved from <http://www.corestandards.org/math>
- Desmet, L., Grégoire, J., & Mussolin, C. (2010). Developmental changes in the comparison of decimal fractions. *Learning and Instruction*, 20(6), 521–532. <https://doi.org/10.1016/j.learninstruc.2009.07.004>
- Devlin, K. (2008). It ain't no repeated addition. Retrieved from https://www.maa.org/external_archive/devlin/devlin_06_08.html
- DeWolf, M., Bassok, M., & Holyoak, K. J. (2015). From rational numbers to algebra: Separable contributions of decimal magnitude and relational understanding of fractions. *Journal of*

CROSS-NOTATION KNOWLEDGE

- Experimental Child Psychology*, 133, 72–84. <https://doi.org/10.1016/j.jecp.2015.01.013>
- DeWolf, M., Grounds, M. A., Bassok, M., & Holyoak, K. J. (2014). Magnitude comparison with different types of rational numbers. *Journal of Experimental Psychology: Human Perception and Performance*, 40(1), 71–82. <https://doi.org/10.1037/a0032916>
- Dixon, J. K., Adams, T. L., Larson, M., & Leiva, M. (2012). *GO MATH! (Common Core edition)*. Orlando, FL: Houghton Mifflin Harcourt Publishing Company.
- Durkin, K., & Rittle-Johnson, B. (2015). Diagnosing misconceptions: Revealing changing decimal fraction knowledge. *Learning and Instruction*, 37, 21–29. <https://doi.org/10.1016/j.learninstruc.2014.08.003>
- Dyson, N. I., Jordan, N. C., Rodrigues, J., Barbieri, C., & Rinne, L. (2018). A Fraction Sense Intervention for Sixth Graders With or At Risk for Mathematics Difficulties. *Remedial and Special Education*, 074193251880713. <https://doi.org/10.1177/0741932518807139>
- Fazio, L. K., DeWolf, M., & Siegler, R. S. (2016). Strategy use and strategy choice in fraction magnitude comparison. *Journal of Experimental Psychology: Learning, Memory, and Cognition*, 42(1), 1–16.
- Fuchs, L. S., Schumacher, R. F., Long, J., Namkung, J., Hamlett, C. L., Cirino, P. T., ... Changas, P. (2013). Improving at-risk learners' understanding of fractions. *Journal of Educational Psychology*, 105(3), 683–700. <https://doi.org/10.1037/a0032446>
- Gabriel, F. C., Coché, F., Szucs, D., Carette, V., Rey, B., & Content, A. (2013). A componential view of children's difficulties in learning fractions. *Frontiers in Psychology*, 4(715), 1–12. <https://doi.org/10.3389/fpsyg.2013.00715>
- Gabriel, F. C., Szucs, D., & Content, A. (2013). The development of the mental representations of the magnitude of fractions. *PLoS ONE*, 8(11), 1–14.

CROSS-NOTATION KNOWLEDGE

<https://doi.org/10.1371/journal.pone.0080016>

Ganor-Stern, D. (2013). Are $1/2$ and 0.5 represented in the same way? *Acta Psychologica*, *142*(3), 299–307. <https://doi.org/10.1016/j.actpsy.2013.01.003>

Gelman, A., Hwang, J., & Vehtari, A. (2014). Understanding predictive information criteria for Bayesian models. *Statistics and Computing*, *24*(6), 997–1016.
<https://doi.org/10.1007/s11222-013-9416-2>

Great Minds. (2015). *Eureka Math*. Washington, D.C.: Great Minds. Retrieved from greatminds.org/math

Handel, M. J. (2016). What do people do at work? *Journal for Labour Market Research*, *49*(2), 177–197. <https://doi.org/10.1007/s12651-016-0213-1>

Hansen, N., Jordan, N. C., Fernandez, E., Siegler, R. S., Fuchs, L., Gersten, R., & Micklos, D. (2015). General and math-specific predictors of sixth-graders' knowledge of fractions. *Cognitive Development*, *35*, 34–49. <https://doi.org/10.1016/j.cogdev.2015.02.001>

Hecht, S. A., & Vagi, K. J. (2012). Patterns of strengths and weaknesses in children's knowledge about fractions. *Journal of Experimental Child Psychology*, *111*(2), 212–229.
<https://doi.org/10.1016/j.jecp.2011.08.012>

Hiebert, J., & Wearne, D. (1985). A model of students' decimal computation procedures. *Cognition and Instruction*, *2*(3), 175–205. <https://doi.org/10.1080/07370008.1985.9648916>

Hoffman, M. D., & Gelman, A. (2014). The No-U-Turn sampler: adaptively setting path lengths in Hamiltonian Monte Carlo. *Journal of Machine Learning Research*, *15*, 1593–1623.
Retrieved from <http://www.jmlr.org/papers/volume15/hoffman14a/hoffman14a.pdf>

Hurst, M. A., & Cordes, S. (2016). Rational-number comparison across notation: Fractions, decimals, and whole numbers. *Journal of Experimental Psychology: Human Perception and*

CROSS-NOTATION KNOWLEDGE

Performance, 42(2), 281–293. <https://doi.org/10.1037/xhp0000140>

Jordan, N. C., Resnick, I., Rodrigues, J., Hansen, N., & Dyson, N. (2017). Delaware Longitudinal Study of Fraction Learning: Implications for Helping Children With Mathematics Difficulties. *Journal of Learning Disabilities*, 50(6), 621–630. <https://doi.org/10.1177/0022219416662033>

Kouba, V. L., Brown, C. A., Carpenter, T. P., Lindquist, M. M., Silver, E. A., & Swafford, J. O. (1988). Results of the Fourth NAEP Assessment of Mathematics: Number, Operations, and Word Problems. *The Arithmetic Teacher*, 35(8), 14–19.

Kuznetsova, A., Brockhoff, P. B., & Christensen, R. H. B. (2016). lmerTest: Tests in Linear Mixed Effects Models.

Lortie-Forgues, H., & Siegler, R. S. (2017). Conceptual knowledge of decimal arithmetic. *Journal of Educational Psychology*, 109(3), 374–386. <https://doi.org/10.1037/edu0000148>

Mack, N. K. (1995). Confounding whole-number and fraction concepts when building on informal knowledge. *Journal for Research in Mathematics Education*, 26(5), 422–441. <https://doi.org/10.2307/749431>

Malone, A. S., Fuchs, L. S., Sterba, S. K., Fuchs, D., & Foreman-Murray, L. (2019). Does an integrated focus on fractions and decimals improve at-risk students' rational number magnitude performance? *Contemporary Educational Psychology*, 59(June), 101782. <https://doi.org/10.1016/j.cedpsych.2019.101782>

Malone, A. S., Loehr, A. M., & Fuchs, L. S. (2017). The role of domain-general cognitive abilities and decimal labels in at-risk fourth-grade students' decimal magnitude understanding. *Learning and Individual Differences*, 58(May), 90–96. <https://doi.org/10.1016/j.lindif.2017.05.007>

CROSS-NOTATION KNOWLEDGE

- Matthews, P. G., Lewis, M. R., & Hubbard, E. M. (2016). Individual differences in nonsymbolic ratio processing predict symbolic math performance. *Psychological Science*, *27*(2), 191–202. <https://doi.org/10.1177/0956797615617799>
- Mazzocco, M. M. M., & Devlin, K. T. (2008). Parts and “holes”: Gaps in rational number sense among children with vs. without mathematical learning disabilities. *Developmental Science*, *11*(5), 681–691. <https://doi.org/10.1111/j.1467-7687.2008.00717.x>
- McMullen, J., Laakkonen, E., Hannula-Sormunen, M. M., & Lehtinen, E. (2015). Modeling the developmental trajectories of rational number concept(s). *Learning and Instruction*, *37*, 14–20. <https://doi.org/10.1016/j.learninstruc.2013.12.004>
- McMullen, J., & Van Hoof, J. (2020). The role of rational number density knowledge in mathematical development. *Learning and Instruction*, *65*.
<https://doi.org/10.1016/j.learninstruc.2019.101228>
- Meert, G., Grégoire, J., & Noël, M.-P. P. (2010). Comparing the magnitude of two fractions with common components: Which representations are used by 10- and 12-year-olds? *Journal of Experimental Child Psychology*, *107*(3), 244–259.
<https://doi.org/10.1016/j.jecp.2010.04.008>
- Moss, J., & Case, R. (1999). Developing children’s understanding of the rational numbers: A new model and an experimental curriculum. *Journal for Research in Mathematics Education*, *30*(2), 122. <https://doi.org/10.2307/749607>
- Newton, K. J., Willard, C., & Teufel, C. (2014). An examination of the ways that students with learning disabilities solve fraction computation problems. *The Elementary School Journal*, *39*(3), 258–275. https://doi.org/10.1163/_afco_asc_2291
- Rau, M. A., & Matthews, P. G. (2017). How to make ‘more’ better? Principles for effective use

CROSS-NOTATION KNOWLEDGE

- of multiple representations to enhance students' learning about fractions. *ZDM - Mathematics Education*, 49(4), 531–544. <https://doi.org/10.1007/s11858-017-0846-8>
- Ren, K., & Gunderson, E. A. (2019). Malleability of Whole-Number and Fraction Biases in Decimal Comparison. *Developmental Psychology*, 55(11), 2263–2274. <https://doi.org/10.1037/dev0000797>
- Resnick, I., Jordan, N. C., Hansen, N., Rajan, V., Rodrigues, J., Siegler, R. S., & Fuchs, L. S. (2016). Developmental growth trajectories in understanding of fraction magnitude from fourth through sixth grade. *Developmental Psychology*, 52(5), 746–757. <https://doi.org/10.1037/dev0000102>
- Resnick, I., Rinne, L., Barbieri, C., & Jordan, N. C. (2019). Children's reasoning about decimals and its relation to fraction learning and mathematics achievement. *Journal of Educational Psychology*, 111(4), 604–618. <https://doi.org/10.1037/edu0000309>
- Rittle-Johnson, B., & Koedinger, K. R. (2009). Iterating between lessons on concepts and procedures can improve mathematics knowledge. *The British Journal of Educational Psychology*, 79(3), 483–500. <https://doi.org/10.1348/000709908X398106>
- Rittle-Johnson, B., Siegler, R. S., & Alibali, M. W. (2001). Developing conceptual understanding and procedural skill in mathematics: An iterative process. *Journal of Educational Psychology*, 93(2), 346–362. <https://doi.org/10.1037/0022-0663.93.2.346>
- Roell, M., Viarouge, A., Houdé, O., & Borst, G. (2017). Inhibitory control and decimal number comparison in school-aged children. *PLOS ONE*, 12(11), e0188276. <https://doi.org/10.1371/journal.pone.0188276>
- Schneider, M., Merz, S., Stricker, J., de Smedt, B., Torbeyns, J., Verschaffel, L., & Luwel, K. (2018). Associations of number line estimation with mathematical competence: A meta-

CROSS-NOTATION KNOWLEDGE

- analysis. *Child Development*, 89(5), 1467–1484. <https://doi.org/10.1111/cdev.13068>
- Siegler, R. S., & Braithwaite, D. W. (2017). Numerical Development. *Annual Review of Psychology*, 68, 187–213. <https://doi.org/10.1146/annurev-psych-010416-044101>
- Siegler, R. S., Duncan, G. J., Davis-Kean, P. E., Duckworth, K., Claessens, A., Engel, M., ... Chen, M. (2012). Early predictors of high school mathematics achievement. *Psychological Science*, 23(7), 691–697. <https://doi.org/10.1177/0956797612440101>
- Siegler, R. S., & Lortie-Forgues, H. (2015). Conceptual knowledge of fraction arithmetic. *Journal of Educational Psychology*, 107(3), 909–918. <https://doi.org/10.1037/edu0000025>
- Siegler, R. S., & Pyke, A. A. (2013). Developmental and individual differences in understanding of fractions. *Developmental Psychology*, 49(10), 1994–2004. <https://doi.org/10.1037/a0031200>
- Siegler, R. S., Thompson, C. A., & Schneider, M. (2011). An integrated theory of whole number and fractions development. *Cognitive Psychology*, 62(4), 273–296. <https://doi.org/10.1016/j.cogpsych.2011.03.001>
- Team R Core. (2018). R: A Language and Environment for Statistical Computing. *Vienna, Austria, 0*.
- Tian, J., Braithwaite, D. W., & Siegler, R. S. (2020a). Distributions of textbook problems predict student learning: Data from decimal arithmetic. *Journal of Educational Psychology*. <https://doi.org/10.1037/edu0000618>
- Tian, J., Braithwaite, D. W., & Siegler, R. S. (2020b). How do people choose among rational number notations? *Cognitive Psychology*, 123. <https://doi.org/10.1016/j.cogpsych.2020.101333>
- Torbeyns, J., Schneider, M., Xin, Z., & Siegler, R. S. (2015). Bridging the gap: Fraction

CROSS-NOTATION KNOWLEDGE

understanding is central to mathematics achievement in students from three different continents. *Learning and Instruction*, 37, 5–13.

<https://doi.org/10.1016/j.learninstruc.2014.03.002>

US Department of Education, Institute of Education Sciences, N. C. for E. S. (2005). National Assessment of Educational Progress Mathematics Assessment. Retrieved from <https://nces.ed.gov>

Vamvakoussi, X., & Vosniadou, S. (2010). How many decimals are there between two fractions? Aspects of secondary school students' understanding of rational numbers and their notation. *Cognition and Instruction*, 28(2), 181–209. Retrieved from <http://www.tandfonline.com/doi/abs/10.1080/07370001003676603>

Van Hoof, J., Janssen, R., Verschaffel, L., & Van Dooren, W. (2014). Inhibiting natural knowledge in fourth graders: towards a comprehensive test instrument. *ZDM - Mathematics Education*, 47(5). <https://doi.org/10.1007/s11858-014-0650-7>

Zhang, L., Fang, Q., Gabriel, F. C., & Szűcs, D. (2016). Common magnitude representation of fractions and decimals is task dependent. *Quarterly Journal of Experimental Psychology*, 69(4), 764–780. <https://doi.org/10.1080/17470218.2015.1052525>

CROSS-NOTATION KNOWLEDGE

Tables

Table 1. Frequentist and Bayesian Analysis Results from Cross-And-Within-Notation Model (Study 1, $N = 277$).

Effect	B	Bayesian analysis	Frequentist analysis	
		95% CI	t	p
Grade	0.07	[0.03, 0.10]	4.1	<.001
Arithmetic operation	-0.40	[-0.43, -0.36]	-22.4	<.001
Fraction magnitude knowledge	0.01	[-0.08, 0.10]	0.2	.87
Fraction magnitude knowledge * arithmetic operation	-0.18	[-0.32, -0.05]	-2.7	.008
Decimal magnitude knowledge	0.10	[0.01, 0.19]	2.2	.03
Decimal magnitude knowledge * arithmetic operation	-0.18	[-0.32, -0.04]	-2.5	.01
Cross-notation magnitude knowledge	0.14	[0.05, 0.23]	3.2	.001
Cross-notation magnitude knowledge * arithmetic operation	-0.01	[-0.15, 0.12]	-0.2	.86

Note. Here and throughout, B indicates estimated effects, which were identical in the frequentist and Bayesian analyses unless stated otherwise; 95% CI indicates 95% credible intervals of effects from the Bayesian analyses; and t and p indicate test results from the frequentist analyses.

CROSS-NOTATION KNOWLEDGE

Table 2. Frequentist and Bayesian Analysis Results from Cross-And-Within-Notation Model (Study 2, $N = 39$).

Effect	B	Bayesian analysis	Frequentist analysis	
		95% CI	<i>t</i>	<i>p</i>
Grade	0.07	[0.01, 0.13]	2.5	.02
Arithmetic notation	0.18	[0.08, 0.29]	3.8	<.001
Fraction magnitude knowledge	0.14	[-0.44, 0.71]	0.5	.62
Fraction magnitude knowledge * arithmetic notation	-0.31 ⁵	[-1.16, 0.53]	-0.8	.41
Decimal magnitude knowledge	0.01	[-0.91, 0.93]	0.02	.98
Decimal magnitude knowledge * arithmetic notation	-0.86	[-2.21, 0.51]	-1.4	.17
Cross-notation magnitude knowledge	0.68	[0.004, 1.35]	2.2	.04
Cross-notation magnitude knowledge * arithmetic notation	-0.70	[-1.70, 0.29]	-1.6	.13

⁵ -0.31 denotes the estimated interaction of fraction magnitude knowledge with arithmetic notation in the Bayesian analysis; the corresponding estimate from the frequentist analysis was -0.32.

CROSS-NOTATION KNOWLEDGE

Table 3. Frequentist and Bayesian Analysis Results from Cross-And-Within-Notation Model (Study 3, $N = 394$).

Effect	Bayesian analysis		Frequentist analysis	
	B	95% CI	<i>t</i>	<i>p</i>
Grade	0.03	[-0.01, 0.06]	1.3	.19
Arithmetic operation	-0.24	[-0.26, -0.22]	-21.3	<.001
Arithmetic notation	0.07	[0.04, 0.09]	6.0	<.001
Arithmetic operation * arithmetic notation	-0.37	[-0.41, -0.33]	-16.6	<.001
Fraction magnitude knowledge	0.06	[-0.03, 0.15]	1.2	.21
Fraction magnitude knowledge * arithmetic operation	-0.07	[-0.18, 0.04]	-1.3	.19
Fraction magnitude knowledge * arithmetic notation	0.00	[-0.10, 0.11]	0.0	.97
Fraction magnitude knowledge * arithmetic operation * arithmetic notation	0.28	[0.07, 0.50]	2.6	.01
Decimal magnitude knowledge	0.26	[0.18, 0.35]	6.1	<.001
Decimal magnitude knowledge * arithmetic operation	-0.15	[-0.25, -0.05]	-3.0	.002
Decimal magnitude knowledge * arithmetic notation	-0.02	[-0.12, 0.08]	-0.4	.66
Decimal magnitude knowledge * arithmetic operation * arithmetic notation	0.08	[-0.12, 0.28]	0.8	.42
Cross-notation magnitude knowledge	0.20	[0.11, 0.29]	4.5	.001
Cross-notation magnitude knowledge * arithmetic operation	-0.04	[-0.14, 0.06]	-0.7	.47
Cross-notation magnitude knowledge * arithmetic notation	0.00	[-0.10, 0.10]	0.0	.99
Cross-notation magnitude knowledge * arithmetic operation * arithmetic notation	0.18	[-0.02, 0.39]	1.8	.08

CROSS-NOTATION KNOWLEDGE

Table 4. Frequentist and Bayesian Analysis Results from Cross-And-Within-Notation Model
(Combined Data From Studies 1-3).

Effect	B	Bayesian analysis	Frequentist analysis	
		95% CI	<i>t</i>	<i>p</i>
Grade	0.04	[0.02, 0.06]	3.4	<.001
Arithmetic operation	-0.31	[-0.33, -0.29]	-29.6	<.001
Arithmetic notation	0.07	[0.04, 0.09]	5.8	<.001
Arithmetic operation * arithmetic notation	-0.23	[-0.27, -0.19]	-11.1	<.001
Fraction magnitude knowledge	0.04	[-0.03, 0.11]	1.2	.24
Fraction magnitude knowledge * arithmetic operation	-0.07	[-0.16, 0.03]	-1.3	.18
Fraction magnitude knowledge * arithmetic notation	0.02	[-0.08, 0.12]	0.3	.74
Fraction magnitude knowledge * arithmetic operation * arithmetic notation	0.27	[0.08, 0.46]	2.7	.006
Decimal magnitude knowledge	0.20	[0.13, 0.27]	5.9	<.001
Decimal magnitude knowledge * arithmetic operation	-0.14	[-0.23, -0.05]	-3.1	.002
Decimal magnitude knowledge * arithmetic notation	0.02	[-0.07, 0.12]	0.5	.63
Decimal magnitude knowledge * arithmetic operation * arithmetic notation	0.07	[-0.11, 0.25]	0.8	.45
Cross-notation magnitude knowledge	0.19	[0.12, 0.26]	5.6	<.001
Cross-notation magnitude knowledge * arithmetic operation	-0.01	[-0.10, 0.08]	-0.3	.79
Cross-notation magnitude knowledge * arithmetic notation	0.00	[-0.10, 0.10]	0.1	.96
Cross-notation magnitude knowledge * arithmetic operation * arithmetic notation	0.14	[-0.04, 0.33]	1.5	.12

CROSS-NOTATION KNOWLEDGE

Appendix

Table A1. Descriptive Statistics and Zero-Order Correlations Between Measures (Study 1)

	Mean	SD	Correlations					
			Within-Notation Fraction Magnitude	Within-Notation Decimal Magnitude	Cross-Notation Magnitude	Fraction Arithmetic	Fraction Addition and Subtraction	Fraction Multiplication and Division
Within-Notation Fraction Magnitude	.55	.37	-					
Within-Notation Decimal Magnitude	.67	.33	.60***	-				
Cross-Notation Magnitude	.55	.38	.67***	.59***	-			
Fraction Arithmetic	.43	.23	.41***	.44***	.48***	-		
Fraction Addition and Subtraction	.60	.26	.48***	.50***	.50***	.89***	-	
Fraction Multiplication and Division	.20	.26	.11†	.15*	.22	.72***	.32***	-

Note. Mean denotes mean proportion correct. † $0.05 < p < 0.10$; * $0.01 < p < 0.05$, ** $0.001 < p < 0.01$, *** $p < 0.001$

CROSS-NOTATION KNOWLEDGE

Table A2. Descriptive Statistics and Zero-Order Correlations Between Measures (Study 2)

	Mean	SD	Correlations					
			Within-Notation Fraction Magnitude	Within-Notation Decimal Magnitude	Cross-Notation Magnitude	Fraction and Decimal Addition	Fraction Addition	Decimal Addition
Within-Notation Fraction Magnitude	.75	.19	-					
Within-Notation Decimal Magnitude	.94	.09	.17	-				
Cross-Notation Magnitude	.78	.18	.72***	.46**	-			
Fraction and Decimal Addition	.74	.29	.49***	.24	.58***	-		
Fraction Addition	.65	.43	.52***	.33*	.62***	.94***	-	
Decimal Addition	.84	.22	.27†	-.03	.28†	.75***	.48**	-

Note. Mean denotes mean proportion correct. † 0.05 < p < 0.10; * 0.01 < p < 0.05, ** 0.001 < p < 0.01, *** p < 0.001

CROSS-NOTATION KNOWLEDGE

Table A3. Descriptive Statistics and Zero-Order Correlations Between Measures (Study 3)

	Mean	SD	Correlations							
			Within-Notation Fraction Magnitude	Within-Notation Decimal Magnitude	Cross-Notation Magnitude	Rational Number Arithmetic	Fraction Addition and Subtraction	Fraction Multiplication and Division	Decimal Addition and Subtraction	Decimal Multiplication and Division
Within-Notation Fraction Magnitude	.66	.28								
Within-Notation Decimal Magnitude	.80	.27	.51***							
Cross-Notation Magnitude	.65	.31	.66***	.56***						
Rational Number Arithmetic	.42	.23	.42***	.51***	.50***					
Fraction Addition and Subtraction	.41	.34	.44***	.50***	.50***	.86***				
Fraction Multiplication and Division	.36	.28	.14**	.23***	.21***	.66***	.43***			
Decimal Addition and Subtraction	.66	.30	.29***	.40***	.36***	.68***	.45***	.23***		
Decimal Multiplication and Division	.24	.22	.34***	.36***	.40***	.82***	.62***	.50***	.37***	

Note. Mean denotes mean proportion correct. † 0.05 < p < 0.10; * 0.01 < p < 0.05, ** 0.001 < p < 0.01, *** p < 0.001