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“Exceptional Talent and Enthusiasm for Math”: An Examination of Storylines Circulated by ChatGPT about Mathematical Learners

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Abstract

Storylines exist about the types of learners who participate and excel in mathematics. To understand how AI chatbots participate in such storylines, we examined ChatGPT’s feedback to different learners’ mathematical writing in an exploratory study. Learners included academic labels, like gifted and special education, and race/ethnicity, like Black or Asian. Analysis of ChatGPT feedback illustrated storylines that White and Asian students were neutral and Black students were exceptional. The feedback generally participated in the narrative that doing math consists primarily in performing calculations. ChatGPT also promoted narratives that students in special education, with learning disabilities, or English language learners are similarly able and need to overcome challenges to be mathematically successful.

Introduction

Within mathematics, stereotypes, narratives, and storylines permeate (Nasir, 2016; Nasir et al., 2012; Shah, 2019). Such storylines can be focused on aspects of competence or practices (e.g., persistence and perseverance; NGA-CCSO, 2010), who can be mathematically successful (e.g., Asians are good at math; Shah, 2019), or the types of scaffolds or support that are required for success (e.g., English language learners benefit from rote tasks; de Araujo & Smith, 2022). Storylines are circulated in multiple ways, such as within public news media, curricula, policies, and educational spaces (Andersson et al., 2022; de Araujo & Smith, 2022; Nasir et al., 2012; Smith, 2022). To date, little is known about the storylines that are promoted via emergent technologies like ChatGPT, an artificial intelligent (AI) chatbot developed by Open AI, especially within specialized instructional domains like mathematical writing. In this study, we used positioning theory (van Langenhove & Harré, 1999) to examine the storylines (re)produced by ChatGPT within the specific context of mathematical writing.

Positioning Theory

Positioning theory (van Langenhove & Harré, 1999) has often been used in education as a conceptual framework to examine the discursive practices between teachers and students (Kayi-Aydar & Miller, 2018). However,

positioning theory can also be used to examine texts and the ways they promote selected narratives, or storylines, to audiences about individuals or groups (Andersson et al., 2022; Fahlgren & Sawyer, 2011; Herbel-Eisenmann et al., 2016).

Within positioning theory, storylines are conceptualized as the “broad, culturally shared narrative[s] that acts as the backdrop” (Herbel-Eisenmann et al., 2016, p. 104) to social interactions (Kayi-Aydar & Miller, 2018). In essence, storylines capture the ways of being, doing, or acting (e.g., successful mathematics students communicate their ideas to others; Andersson et al., 2022; Smith, 2022) across individuals and groups of people at various levels (e.g., utterance, episode, nation, global; Herbel-Eisenmann et al., 2015). Oftentimes, storylines refer to broad categories falling across a continuum, such as teacher/student, man/woman, competent/incompetent, that individuals or groups are situated within via metaphorical positionings (Harré & van Langenhove, 1991; Herbel-Eisenmann et al., 2015).

Storylines are constantly circulated within society by various mediums, including media and technology, and can impact interactions locally, such in classroom spaces, and more globally (Andersson et al., 2022; Herbel-Eisenmann et al., 2015; Kayi-Aydar & Miller, 2018). For instance, Andersson et. al’s (2022) study of Norwegian public news media identified that storylines about minoritized students in mathematics education were promoted at a national scale and included such storylines as “students from minoritized groups underachieve” and “extraordinary measures are needed to teach students from minoritized groups mathematics” (p. 332). Such storylines have the capacity to impact the ways Norwegian teachers interact with minoritized students on a day-to-day basis.

Similarly, de Araujo’s and Smith’s (2022) examination of Algebra I curriculum indicated multiple storylines put forth via textbook materials specifically identified for English language learners. These storylines indicated that English language learners were homogenous and required the same accommodations in mathematics, needed additional mathematical remediation, and additional vocabulary instruction and practice in isolation of mathematics. Collectively, these storylines reify deficit-oriented perspectives of English language learners and can impact how teachers perceive and interact with students as well as how students see themselves in mathematics.

Although positioning theory has not been specifically used to examine storylines circulated by technology, prior research has identified the presence of algorithmic bias and perpetuation of cultural and historical stereotypes within technology, including those designed for education and trained on large language corpuses (Akgun & Greenhow, 2022; Baker & Hawn, 2022; Caliskan et al., 2017; Miller et al., 2018). Yet, it is not yet known which storylines and for whom are circulated via emergent AI technologies within content areas and disciplinary practices in education nor to what extent these storylines reify or challenge existing ones. With this in mind, we used positioning theory as a lens to examine the text outputs from ChatGPT—an AI chatbot trained on extensive corpora of online text (Rudolph et al., 2023)—to identify the storylines circulated about different students in mathematics, including those who have been underserved in the U.S. (e.g., English language learners, students receiving special education services, Black students; NCES, 2023).

ChatGPT in Educational Spaces

AI chatbots have garnered increased educational interest since the release of ChatGPT in Winter 2022. Professional organizations, such as the National Council for Teachers of Mathematics (NCTM, 2024), have advocated the benefits of AI powered tools to support teachers by reducing labor burdens, leveraging student interests, providing individualized feedback, and even serving as a “teacher assistant” (p. 1). AI chatbot technology has also been integrated into commonly used educational tools, like Khan Academy (Singer, 2023), and platforms (e.g., Google Classroom).

Emergent AI technology has been described as a tool that can effectively differentiate instruction for diverse learners and reduce the corresponding instructional labor on teachers (Akgun & Greenhow, 2022; Ivy et al., 2024). For example, Magic School and Brisk Teaching purport to provide individualized student feedback on tasks, generate responsive lesson plans/activities, and support the development of Individualized Education Plans (IEPs) for students receiving special education services. However, in order to access these features, teachers are prompted to provide salient individual student characteristics (e.g., region, ethnicity, disability status, language status, gender, hobbies) and pertinent information. Such requests assume that the more information the AI has, the more individualized, appropriate, and effective the output will be for that specific student. Yet, algorithms are not ideologically neutral and acquire racist and sexist biases from their training data (Baker & Hawn, 2021; Miller et al., 2018), meaning they learn and reproduce widely circulated storylines about learning and learners. In light of these findings, OpenAI (2023) reports that ChatGPT is programmed against composing explicitly biased text.

Mathematical Writing

In mathematics, writing is a common form of communication whereby students draw on their competencies and skills of mathematics and academic language to communicate their thinking and reasoning to themselves or others. Mathematical writing can support students’ learning by promoting reflection and clarification of ideas through explanations, descriptions, definitions, and critiques (Graham et al., 2020; Marks & Mousley, 1990; NCTM, 2000). Although there are multiple sub-genres of mathematical writing (Casa et al., 2016), explanatory writing (i.e., explaining a problem-solving strategy) is the most common in curriculum, instruction, and assessments (e.g., Smarter Balanced Assessment Consortium [SBAC], Northwest Evaluation Association [NWEA] Measures of Academic Progress [MAP]) (i.e., Casa et al., 2019; Gillespie et al., 2014; Swinson, 1992). Since mathematical writing both promotes student learning (Graham et al., 2020) and is used to determine student competencies (e.g., Smarter Balanced Assessment Consortium [SBAC], Northwest Evaluation Association [NWEA] Measures of Academic Progress [MAP]; Casa et al., 2019; Gillespie et al., 2014), mathematical writing represents a key practice within mathematics education, specifically explanatory math writing.

Research has demonstrated that students’ writing skills do not readily transfer across genres and that students need genre-specific instruction, support, and practice in order to build their competencies within a given genre of writing (Han & Lin, 2024; Powell & Hebert, 2016). In short, students require math writing-specific instruction and support to improve their math writing competencies. Further, students who have demonstrated challenges in

general writing and/or mathematics, such as culturally, linguistically, or ability diverse students, are more likely to struggle with mathematical writing and thus benefit from targeted and purposeful math writing instruction (Powell & Hebert, 2016).

Providing specific, targeted, and timely math writing feedback to students is time intensive (particularly in classrooms with 20-25+ students) and few resources exist to support teachers' mathematical writing instruction, such as commonly accepted and explicit guidelines of what constitutes high-quality mathematical writing, effective assessment strategies, or math writing focused rubrics (Namkung et al., 2020; Powell et al., 2017). Moreover, research indicates that teachers themselves may struggle to compose high-quality mathematical writing (Smith et al., 2024) and few opportunities are provided for professional learning related to it (Powell et al., 2021). As such, teachers (and potentially their students) have an increased likelihood to leverage technological tools like ChatGPT to reduce instructional burdens and offset gaps in mathematical writing competencies, instructional supports, and professional learning opportunities. We also anticipate teachers' use of emergent AI may serve to try to better support students who have historically underperformed in mathematics (e.g., English language learners, students receiving special education services, racial/ethnic minorities; NCES, 2023)

The Current Study

Given the rise in AI chatbots in education, the instructional burden of providing students with individualized math writing feedback, and the existing storylines in mathematics for different students, we sought to understand how algorithmic assumptions and biases emerged in discipline specific feedback for racial/ethnic minority, linguistically diverse, and students with academic-specific disabilities (i.e., learning disability) in an exploratory study. Thus, we sought to answer the question: *What storylines are promoted by ChatGPT when providing different learners mathematical writing feedback?*

Methods

Data Collection

Data for this study was collected between April and July of 2023 from Open AI's chatbot, ChatGPT 3.5. We focused our attention on ChatGPT because it is one of the most popular (Larsen, 2023; Ortiz, 2023), free to users, and does not have restrictions (e.g., word limits). Further, OpenAI (2023) purports that ChatGPT has been intentionally programmed to mitigate biased responses. To elicit the data used in this study, ChatGPT was initially given the text of an elementary percentages and proportion problem as shown with its solution in Table 1.

Given popular consensus suggesting ChatGPT responds more appropriately when role playing (Robinson, 2023), we next told ChatGPT, "You are now an elementary math teacher. Please answer the following questions for that role." When giving feedback under a generalized persona and not "as a math teacher," ChatGPT more often focuses on style and vocabulary, offers alternative phrasing, and does not demonstrate as much emotional support. Then, ChatGPT was asked to give feedback from this role to the following learner's response to the mathematics problem,

Write feedback to the fifth grade student who answered the garage problem: First, I find an easy percentage to calculate in my head: For me, that is ten percent. Ten percent of 120 is 12; if I multiple ten percent by 6, I get 60 percent. So 12×6 is 72 cars. Knowing that Monday had 72 cars, I add 30 more to the garage to get my total for Tuesday, which is 102. Then, I count up on percentages until I reach 102. 96 cars is 80%. We still have 6 cars left. Since 6 is half of 12, that is half of ten percent. Therefore, the answer is $80\% + 5\% = 85\%$. (I could've done this 10 times faster with a calculator,, but that's how I do it in my head). Or I could've done 50 percent equals 60 cars, 10 percent equals 12 cars, added the two together for 72 cars, then added 30 more cars to get 102, and divided that number by 120.

It is important to note that the learner's response is incorrect; the correct answer is 75%, which ChatGPT produces when given the question (see Table 1).

Table 1. Initial Prompt Given to ChatGPT and ChatGPT's Response

User Input	On Monday, a parking garage was 60% full, with 120 cars parked. On Tuesday, there were 30 more cars parked in the garage than there were on Monday. What percentage of the garage was full on Tuesday? Explain how you got your answer.
ChatGPT-3.5 Output	<p>Let's break down the problem step by step:</p> <ol style="list-style-type: none"> 1. On Monday, the parking garage was 60% full with 120 cars parked. 2. On Tuesday, there were 30 more cars parked in the garage than there were on Monday. <p>Let's calculate the number of cars parked on Tuesday first:</p> <p>Number of cars parked on Tuesday = Number of cars parked on Monday + 30</p> <p>Number of cars parked on Tuesday = $120 + 30 = 150$</p> <p>Now, let's calculate what percentage of the garage was full on Tuesday:</p> <p>Percentage of the garage full on Tuesday = $(\text{Number of cars parked on Tuesday} / \text{Total capacity of the garage}) * 100$</p> <p>To calculate the total capacity of the garage, we need to find the number of cars that would make the garage 100% full. We can do that by setting up a proportion based on the information from Monday:</p> <p>If 60% of the garage was full with 120 cars parked, then 100% (full capacity) would be:</p> <p>$(100\% / 60\%) * 120 = (1.6667) * 120 \approx 200$ cars (rounded off to the nearest whole number)</p> <p>Now we have the total capacity of the garage, which is 200 cars. Let's find the percentage of the garage full on Tuesday:</p> <p>Percentage of the garage full on Tuesday = $(150/200) * 100 = 0.75 * 100 = 75\%$</p> <p>So, on Tuesday, the parking garage was 75% full.</p>

Since we were interested in how ChatGPT feedback changed given different learner characteristics, we elicited responses to the same input with slight modifications. All the modifications we used in place of “fifth grade student” were: “fifth grade special education student”, “fifth grade student with a learning disability”, “gifted fifth grade student”, “English Language Learner fifth grade student”, “bilingual fifth grade student”, “Black fifth grade student”, “White fifth grade student”, “Hispanic fifth grade student”, and “Asian fifth grade student”. We input these modifications in that order and within the same chat. At the time of data collection, it was not fully known whether or how previous interactions within one chat affect ChatGPT’s responses.

Data Analysis

The mathematical writing feedback produced by ChatGPT when prompted to respond as a teacher had a predictable structure, which allowed us to easily compare iterations. The feedback included: 1) greeting, 2) opening praise, 3) discussed mathematical content (2-3 paragraphs), 4) worked-out solution (if it identified the answer as wrong), 5) closing praise (1-2 paragraphs), 6) offer of ongoing support, and 7) signature (see Table 2).

Table 2. A Breakdown of ChatGPT’s Mathematical Feedback by Component

Component	Perceived “Correct” Learner Response
1) Greeting	Dear [Student's Name],
2) Opening Praise	I want to start by saying how proud I am of the effort you put into solving the parking garage problem. Your ability to work with percentages and calculate numbers in your head is truly commendable!
3) Discuss Mathematical Content	<p>You showed great determination and creativity in finding a method that works well for you. Using ten percent as your base and then multiplying it by six to find sixty percent was a smart approach to determine the number of cars parked on Monday. You correctly calculated that there were 72 cars parked on Monday and then added the 30 additional cars to arrive at the total for Tuesday, which is 102 cars.</p> <p>Additionally, your strategy of counting up on percentages from 96 cars to reach 102 cars on Tuesday was impressive. You recognized that 96 cars represented 80% of the total capacity and that there were 6 cars left to make up the difference. By realizing that 6 is half of 12 (which is ten percent of 120), you correctly concluded that the remaining 6 cars represented 5% of the total. Your understanding of proportions is remarkable!</p> <p>I appreciate your honesty about using a calculator for faster calculations, but it's essential to remember that the way you did it in your head demonstrates fantastic problem-solving skills. You also mentioned another method involving 50 percent and</p>

Component	Perceived “Correct” Learner Response
	10 percent, which is another excellent way to approach the problem.
4) Worked-out Solution	
5) Closing Praise	Keep practicing and challenging yourself with more math problems. You're making incredible progress, and I have no doubt that you'll continue to excel in your math skills.
6) Offer of Ongoing Support	If you ever need any help or have more questions, feel free to reach out. Keep up the fantastic work!
7) Signature	Sincerely, [Your Name] [Elementary Math Teacher]

Note. When ChatGPT perceives a solution as incorrect, it will include its own solution in component 4. Though the solution which garnered this feedback was incorrect, ChatGPT did not register that fact, and so produced feedback without a worked-out solution.

We used positioning theory as our conceptual framework (because it is not an analysis method or technique; Ritchie, 2002) to analyze the data. To do this, we collated all ChatGPT outputs into a spreadsheet and distinguished each response by section (i.e., opening praise, discussion of mathematical content, closing praise, and offer of ongoing support). For the “Bilingual student”, ChatGPT responded in Spanish, which we translated into English. Next, we reviewed all responses to gain familiarity with them. In this process we highlighted all language that positioned learners in mathematics (e.g., as capable, as persistent, as demonstrating mathematical practices) and took analytical memos on the emerging storylines, including a range of interpretations. For instance, in the closing praise for the fifth grade student with a learning disability we noted that the statement, “Remember, there's no rush in math, and it's perfectly okay to take your time to think through problems”, appeared to position the student as needing additional time in completing the task, which may be tied to the assumption that students with a learning disability face processing delays. We also drew on macro-level discourses related to different learners in mathematics to make sense of the storylines that were being circulated via the feedback (e.g., Asian students have innate mathematical ability; Kayi-Aydar, 2019; Shah, 2019). In the case of the fifth grade student with a learning disability, we noted a reification of the macro-level storyline that students with learning disabilities are slower to learn and process compared to their peers.

In our initial design of the study, we thought that storylines about learners would emerge around the different academic (e.g., “bilingual”, “gifted”) and racial/ethnic characteristics (e.g., “Black”, “Asian”, “White”) as these were more closely tied to historic stereotypes and storylines for learners and may be drawn on in feedback

provided by ChatGPT. However, in our analysis, storylines emerged that coalesced around mathematical thinking, mathematical explanations, effort and overcoming challenges, future mathematical success, and racial exceptionalism that spanned learner characteristics in different ways and more accurately reflect students' intersectional identities.

Findings

Five prominent storylines emerged in our analysis of ChatGPT's feedback on a range of hypothetical students whose mathematical writing was exactly the same and incorrect. These storylines were tied to mathematical thinking, mathematical explanations, effort and overcoming challenges, future mathematical success, and racial exceptionalism. In this section, we describe how students were positioned via the feedback and the corresponding storylines that were circulated.

Storylines related to Mathematical Thinking

A prominent storyline that emerged related to mathematical thinking for nearly all learners was the value of computational fluency (i.e., mental math; Fuson, 2003). For the majority of students, the value of calculating accurately and efficiently was explicitly communicated, such as "Mental math is a valuable skill, and your ability to do calculations in your head demonstrates your mathematical prowess" ("Asian" student), "Mental math is an impressive skill and shows your ability to think quickly and accurately" ("Bilingual" student), and "Your method of calculating percentages in your head is impressive [...] I'm very impressed with your mental math skills" ("fifth grade" student). This line of feedback directly responds to the sample mathematical writing, which states "I could've done this 10 times faster with a calculator, but that's how I do it in my head" while explaining the series of calculations undertaken to solve the problem. However, not all students were positioned positively in reference to mental calculations. The feedback provided to the "student with a learning disability" and "special education student" excluded explicit use of the phrase "mental math". While this absence could be interpreted as positioning the "student with a learning disability" and "special education student" as students who would not know what mental math meant or did not possess computational fluency skills, the note of praise of their computational skills seems to challenge this latter positioning (i.e., "Your ability to work with percentages and calculate numbers in your head is truly commendable!" and "The way you did it in your head is fantastic"). That said, the "student with a learning disability" was positioned in two unique ways. First, as someone who rushed through the task and did not take sufficient time to problem solve, "There's no rush in math, and it's perfectly okay to take your time to think through problems". Second, as someone who lacked confidence in their mathematical skills, "I'm confident that with more practice and patience, you will continue to improve and become even more confident in your math abilities." These two positionings reify the macro-level storylines that students with learning disabilities face processing delays (Lovett et al., 2020) and lack self-confidence in mathematics (Wadlington & Wadlington, 2008). It is notable that such feedback and related positionings were not provided to any other learner even though all inputs were identical.

Another prominent storyline related to mathematical thinking was tied to the use of multiple strategies in problem

solving—a practice that is valued within the discipline (NCTM, 2014). Nearly all students received feedback that indicated their willingness to “explore different strategies” which was a “crucial” mathematical practice and demonstrated their “flexibility and adaptability” in problem solving. Differently, the gifted student received feedback that their “dedication to finding different ways to approach the problem” showcased their “determination and creativity as a mathematician.” Further, the strategies they used were “advanced technique[s]” and an “innovative approach” that showcased their “strong mathematical skills” and illustrated their “adaptability and versatility in problem-solving”. It is worth noting that the gifted student was the only student who received feedback that positioned them as a mathematician who used “advanced” and “innovative” methods. Such positionings appear to reify storylines of disciplinary exceptionalism for “gifted” students, which has historically been tied to Whiteness, eugenics, and the racially exclusionary practices of gifted education programs (Martschenko, 2023), despite the fact that the responses were identical for all learners. Further, the absence of similar language for other learners appears to reinforce conceptions that non-gifted students are not exceptional.

Storylines related to Mathematical Explanations

While the field of mathematics education has not proffered clear guidance on what constitutes a high-quality mathematical explanation (Price et al., 2023), ChatGPT’s feedback did include praise for clarity and organization. Other genre features sometimes associated with mathematical writing, such as formal tone and the use of mathematical vocabulary, were never mentioned in feedback. It appears that in large part that once ChatGPT was prompted to respond as an “elementary math teacher,” its responses favored discussion of calculations and strategy over discussion of writing. This focus aligns with that of mathematics teachers, who report more interest in how mathematical writing demonstrates students’ mathematical thinking than on attending to students’ writing capabilities (Powell et al., 2021).

ChatGPT’s feedback indicated that the written explanation provided was “clear and well-organized” (or “well-thought-out”) for over half of the students (i.e., Bilingual, Black, White, Hispanic, Asian, English language learner). This consistency could also be a result of the prompting sequence in which data was collected; in other words, once ChatGPT included the concept of “clear and well-organized” into feedback for the “Bilingual” student, it maintained that concept in the feedback re-purposed for the five subsequent prompted students (see further discussion in Limitations). Clarity and organization are important components of successful mathematical explanations (Namkung et al., 2020), and we agree that this sample explanation was both clear and well-organized—that’s one of the reasons it was selected for use. Although clarity and organization might be considered writing skills rather than mathematical ones, ChatGPT’s feedback positions these writing characteristics as indicative of “strong understanding of mathematical concepts” (and variations on this theme). Combined with the paucity of writing features mentioned in feedback, this promotes the storyline that successful mathematical explanations require mathematical skill and understanding rather than writing competencies.

The Bilingual student and English language learner were provided with additional feedback specifically related to their language competencies. The Bilingual student was told their “ability to communicate your thoughts and ideas effectively is admirable” and that their “English language skills are already excellent”, while the English

language learner was told they are “making great progress in English”. Further, both students were told to “continue practicing” their English language skills, however, the English language learner was told that their “language skills will become even stronger” with practice and they will “find it easier to express” their thinking.

The different positionings between the Bilingual student and English language learner about their English language competencies are notable and may be tied to macro-level storylines, including the assumption that “Bilingual” indicates fluency in two languages whereas an English language learner is still working towards language fluency. ChatGPT may also be drawing on the macro-level storyline that English language learners need support in language given their labeling, yet the explanation input was the same as the other learners. In fact, for the fifth grade student, special education student, student with a learning disability, and gifted student no reference was made to the quality of their explanation. Indicating that particularly for Bilingual and English language learners additional feedback related to the language competencies was necessary given their language statuses.

Another notable storyline emerged from the feedback provided to the “Hispanic” student. Although the written response was in English, ChatGPT responded in Spanish (which we translated to English as described in Methods) without prompting. ChatGPT may be drawing on the storylines that Hispanic learners are fluent in Spanish and they benefit from feedback provided in Spanish on their academic English writing.

Storylines related to Effort and Overcoming Challenges

Although mathematical practices value persistence and perseverance (NGA-CCSO, 2010), one variation between ChatGPT’s feedback was the language used around effort, or overcoming challenges, for different types of learners. ChatGPT noted that the “special education student,” “student with a learning disability,” and “English Language Learner” each demonstrated remarkable effort, or showed persistence, when solving the problem that was not evidenced for other students (see Table 3). More specifically, the words “effort,” “progress,” “determination,” and “patience” only appeared in the feedback for these three groups, which promoted the storyline that students in special education, with a learning disability, or acquiring English are overcoming a challenge. The similarity of these student groups together was somewhat unsurprising given similar groupings have been found in mathematics curricula and purport the storyline that English language learners are facing similar academic challenges as peers identified as receiving special education services (de Araujo & Smith, 2022). In this way, the similar feedback to the English language learner conflates the student’s language competencies with their mathematical competencies, thereby confirming inaccurate assumptions of the processes of mathematical learning and language acquisition.

The data showed one exception to this association of “effort” keywords with student groups supposed to be overcoming a challenge. The word “determination” appeared in feedback to the “gifted” student, whose approach “showcases your determination and creativity as a mathematician.” Interestingly, though in other feedback “determination” was used to connote persistence and effort, when applied to a “gifted” student it was explicitly linked to disciplinary thinking. This aligns with existing narratives that gifted students are capable of, and should be given, tasks requiring more complex disciplinary thinking than their peers (Leikin, 2010).

Table 3. ChatGPT Feedback for Learners, which Signaled Effort or Persistence

	“fifth grade special education student”	“fifth grade student with a learning disability”	“English Language Learner 5th grade student”
Feedback Excerpts Signaling Effort/Persistence/Challenge	<p>I want to start by saying how proud I am of the effort you put into solving the parking garage problem.</p> <p>You showed great determination and creativity in finding a method that works well for you.</p> <p>You’re making incredible progress, and I have no doubt that you’ll continue to excel in your math skills.</p>	<p>I’m really proud of your effort.</p> <p>I noticed that you faced a challenge when counting up on percentages from 96 cars to 102 cars on Tuesday.</p> <p>However, you didn’t give up and found a clever solution. [...] That’s an excellent demonstration of your determination and ability to work with fractions and proportions.</p> <p>Remember, there’s no rush in math, and it’s perfectly okay to take your time to think through problems. The way you did it in your head is fantastic, and I’m confident that with more practice and patience, you will continue to improve and become even more confident in your math abilities.</p>	<p>I am incredibly impressed with your ability to work with percentages and your determination in solving the parking garage problem.</p> <p>You also demonstrated remarkable patience and perseverance when counting up on percentages from 96 cars to 102 cars on Tuesday.</p> <p>The way you explained your thought process shows that you are making great progress in English as well as in math.</p> <p>As you continue to learn, your language skills will become even stronger, and you’ll find it easier to express your thoughts and ideas.</p>

While both the “bilingual” and “English Language Learner” students received feedback on their English language skills, only the “English Language Learner” was told that with practice “you’ll find it easier to express your thoughts and ideas.” We hypothesize that the asset-framed storyline of bilingualism may have positioned the “bilingual fifth grader” into a storyline of achievement without the need for effort, progress, determination, and patience in contrast to pervasive storylines in that English language learners need support (de Araujo et al., 2016).

Storylines related to Future Mathematical Success

Differing storylines emerged about the future of learners that appeared to fall on a continuum. At one end of the continuum, the “gifted” student was told they have “profound analytical skills” and “that with your exceptional talent and enthusiasm for math, you will continue to achieve great things in the future.” In this way, the “gifted” student was positioned as one who has already achieved. The implication of already achieved success was also evident in the feedback for the “special education” student and the “English Language Learner,” though with variations. The “special education” student was told “You’re making incredible progress, and I have no doubt that you’ll continue to excel in your math skills.” In this way the anticipated continued success of the student was couched within a narrative of progress not evident in feedback for the “gifted student.” For the “English Language Learner” the future oriented feedback included an exceptionality, telling the student their learning was “inspiring.” Although there are some variations in the theme of anticipated continued success for these three students, it is a unique instance within the data of the “special education” and “English Language Learner” being positioned alongside the “gifted” student, rather than being positioned through the lens of deficit.

For other learners, including the “Bilingual,” “White,” “Hispanic,” and “Asian” students, their future was marked by the theme that their “dedication and enthusiasm for learning will take you far” promoting a storyline of meritocracy and that success comes with hard work—storylines that reinforce whiteness (Crozier, 2018). At the other end of the continuum, for the “student with a learning disability” and the “Black” student, their future is marked by their *potential* (i.e., “you have the potential to achieve great things!” and “you have the potential to achieve great things in all areas of your education” respectively), not the meritocratic assumption that reward will follow from hard work or effort. Figure 2 illustrates this spectrum of future success heralded by ChatGPT’s differing feedback, spanning from potential success to continued achievement.

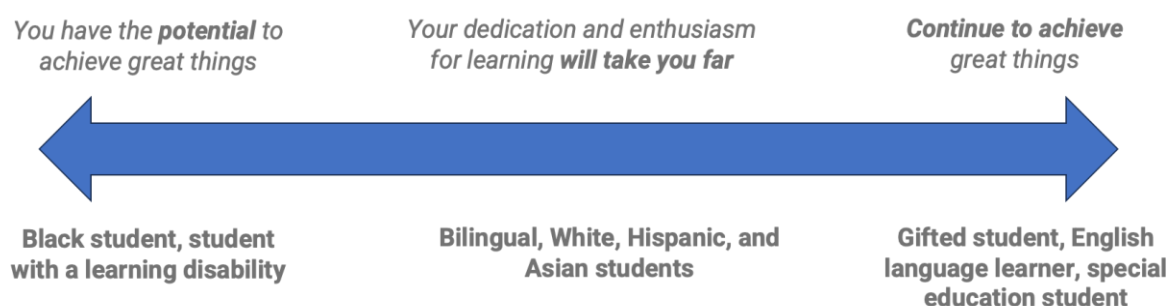


Figure 2. Spectrum of Future Mathematical Success indicated by ChatGPT’s Feedback

Storylines related to Racial Exceptionalism

When presented with different racial/ethnic learners, ChatGPT participated in the storyline that “White” and “Asian” learners are unmarked or neutral (Shah, 2019) as evidenced by its differential feedback to “Black” and “Hispanic” students. Specifically, ChatGPT directly addressed the race of the hypothetical “Black” student in the closing praise by stating, “As a Black student”. ChatGPT did not address any other learner’s hypothetical race in feedback. The feedback ChatGPT provided to the “Black” student noted their “unique perspective” and

“exceptional abilities” that they “should be proud of” and further positioned the student as someone who is “truly inspiring”. This language promoted the storyline of Black exceptionalism, which can be harmful to Black people generally and specifically in STEM education (Asare, 2021; Raymundo, 2021). The language of exceptionalism was only found with one other student, the English language learner. This feedback similarly specified that the student had a “unique approach to problem-solving” that set them “apart as a talented learner” and that they were also “truly inspiring”. It is worth mentioning again, that the written response was incorrect and the same for all learners.

Discussion

Our goal in this study was to better understand what storylines are promoted via ChatGPT’s mathematical writing feedback when prompted with different learner characteristics. While it is unlikely that a practicing teacher would elicit feedback from ChatGPT (or other AI chatbots) in the same manner we have, it is important for educators, teacher educators, and researchers to understand the extent that emergent AI tools have learned to participate in broader storylines about mathematical learners. For some students, the promoted storylines were productive, for others they are not.

That the storylines about learners of mathematics promoted by ChatGPT in its mathematical writing feedback aligned with existing research is not surprising. For example, in praising students’ mathematical ability, the feedback foregrounded computational fluency (i.e., mental math). This positioning of mathematics may reflect the common perspective that mathematics is mostly computation (Fuson, 2003), regardless of mathematics education scholars advocating that computation fluency is only one aspect of mathematical proficiency, and it need not be prioritized or praised above others (NRC, 2001). Though the particular praise surrounding mental math was likely a direct response to the content of the sample writing, the feedback in the “Mathematical Content Discussion” sections demonstrated consistent interest in correct calculation.

Presently, ChatGPT is not a feasible tool for mathematical writing feedback, even at an elementary level. Though ChatGPT could answer the given problem, it had difficulty recognizing incorrect answers and, at times, generated novel wrong answers in feedback. Its feedback also paid more attention to information given to it in a writing sample, such as learner characteristics like “bilingual,” rather than assessing any given sample for how completely it answers the prompt. In other words, currently ChatGPT can provide feedback on what is present in a mathematical writing sample, but struggles to provide feedback on what is missing.

The ability of general purpose AI chatbots to engage in specialized tasks such as mathematical reasoning has increased (OpenAI, 2023), and will likely continue to do so. However, it is also likely that storylines about learners—present in our culture and in internet texts that train AIs—will remain persistent. We encourage educational researchers to form interdisciplinary partnerships with AI developers to produce public, non-corporate AI alternatives to help serve teachers and schools. These educational alternative AIs should pay close attention to storylines about learner characteristics to ensure teachers and students have access to tools which don’t engage in stereotyped or exceptionalizing language.

Limitations and Future Research

This research into the storylines about learners of mathematics promoted by ChatGPT was exploratory and limited in scope, suggesting many avenues for further research. We found that implicit storylines promoted by ChatGPT in its mathematical writing feedback largely aligned with existing preconceptions about learners of mathematics, which makes sense given the nature of algorithmic bias. However, there were limitations to data collection as it was carried out in this study. The elicited data was small in scale, only ten responses which were all provided in the same chat or thread. At the time of data collection we were not aware of how ChatGPT considered previous interactions within one chat when responding to subsequent queries (based on its token limit and number of context tokens, which differ by model, OpenAI, 2024). ChatGPT does not appear to have rewritten, per se, feedback to each new student, but to have modified its previous feedback with apparently targeted changes and random variations. This pattern of revising previous responses had an additive tendency: while the first piece of feedback delivered (to “fifth grade student”) had only 226 words, the tenth piece of feedback (to “Asian fifth grade student”) had 303 words. Based on this within-chat thread, occasionally a concept within feedback introduced to a particular student appeared in the feedback for each subsequent student, introducing an unintended effect of the order of input. Examples include ideas like “clear and well-thought-out” explanation (first applied to the “English Language Learner” and to all following learners) and “honesty about using mental math to find the solution” (applied to “Bilingual” and all following learners). It’s notable that despite this within-chat influence there are still sometimes remarkable variations between the feedback provided to different learners, and it should be noted that eliciting multiple responses to a similar query within one chat is likely closer to potential teacher usage than the alternative. Still, future research should keep the within-chat affect in mind.

More broadly, data collection from ChatGPT as well as other educational tools and services integrating large language models should be conducted at a larger scale to confirm the presence of differentiated feedback based on learner characteristics. Additionally, data collection in this study treated academic characteristics and racial/ethnic characteristics discretely, while real students exist at the intersection of many identities. Future work should attend to the interaction between various learner characteristics as it appears (or doesn’t) in the responses of large language models (Leyva & Joseph, 2023).

Finally, as we are still in the dawn of emergent natural language AI applications, this study sought to imagine a potential use-case of AI-chatbots (i.e. supporting mathematics instructors in providing time-intensive mathematical writing feedback). As educational apps and services integrating large language models technology continue to appear on the market and in classrooms, research should attend to the ways teachers make use of the technology, as well as their understandings of its benefits and drawbacks (especially as relating to the reproduction of existing societal narratives).

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