

# 1 **Assessing the Effect of Test Speededness on Individual and Collaborative Exams**

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## 13 14 **Abstract:**

15 Identifying strategies that improve learner's information retention, collaboration skills, and  
16 academic performance are of acute interest in higher learning. Additionally, modeling real-world  
17 scenarios to prepare students for post-academic life can be greatly beneficial. By using different  
18 testing strategies, such as assigning exams to be done individually or in groups and modulating  
19 the allotted time-per-question, one can compare the efficacy of these changes to the standard  
20 testing format. In this study, we used data from two undergraduate courses to evaluate how  
21 changing the time per question and how working in groups impacts test grades. Self-reflection  
22 questions were also used to gauge student's satisfaction with the changes and see if their  
23 perceptions aligned with the data. On average, students' performance improved when taking tests  
24 in groups compared to individually, however, the increase in time-per-question did not have a  
25 consistent impact. Students had overall positive reactions to working in groups with a greater  
26 sense of confidence and collaboration reported in the self-reflection questionnaire. While more  
27 data are required to make definitive conclusions, these data show that integrating additional  
28 group-based activities, specifically test-taking, can improve student performance and enjoyment  
29 in learning outcomes.

30  
31 **Keywords:** Collaborative learning, active learning, trivia, games, test speededness

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45 **Introduction**

46 Collaborative learning (CL) is an educational approach by which learners work with others  
47 (students, peers, teachers) to problem solve and understand concepts. This method contrasts  
48 with traditional, teacher-centered instruction by including students in a more active learning  
49 process. The positive effects of CL on students' development and performance are supported by  
50 decades of research. Implementing CL practices has been shown to greatly improve student  
51 individual learning (Linton et al., 2014), engagement (Molinillo et al., 2018), and satisfaction (Le  
52 et al., 2017; Martins et al. 2021) in the classroom. While CL includes a diverse array of specific  
53 lesson plans and methods, it can be used in all subjects and is relevant to all aspects of life. In  
54 academia, students work together when studying and completing coursework. Collaboration  
55 persists outside academia in all careers as people communicate and work together to fulfill  
56 individual and collective goals. Collaboration also facilitates work efficiency and time management  
57 to meet deadlines. Certain CL techniques and activities mimic real-world scenarios and therefore  
58 can prepare students beyond the teacher-centered alternative (Cheng et al. 2021).

59 Test speededness is the measure of how time constraints on tests affect the performance  
60 of the individual taking the test (Cintron 2021). Different testing scenarios highlight the complex  
61 nature of test speededness and the difficulty in generalizing across groups, but also why it could  
62 be a valuable metric to monitor and explore. For example, compare a test that consists of  
63 completing as many basic arithmetic questions as a test-taker can in 30 seconds to a test where  
64 the test-takers have several hours to complete it, but the complexity of each question varies  
65 greatly. These two scenarios provide different information about learning outcomes and the  
66 individuals taking the test. There is limited research on the impact of CL on test speededness.  
67 Our preliminary research found that collaborative testing improves student performance and  
68 speed on an exam (Greenberg & Martins 2022) but did not include exams with a time constraint.

69 Collaborative testing is a concept that connects CL and test speededness, allowing  
70 students to work with others on an exam. To further explore collaborative testing, this study aimed  
71 to evaluate the effect of collaborative testing compared to individual testing on test speededness.  
72 We present data on students' perceptions of self-efficacy in these two testing settings and the  
73 extent to which students learned something new while taking a test in a group. We also used the  
74 virtual, game-based learning platform "Kahoot!" to perform a similar evaluation on test-takers  
75 when given varying levels of per-question time. Results from previous classes found that while  
76 the time taken to complete an exam individually did not predict the student's grade, a negative  
77 correlation ( $P=0.0416$   $r=-0.351$ ) was found between student's grades and the time it took to  
78 complete the exam as a group (Supplemental Figure 1). Groups that completed the exam faster  
79 tended to have higher grades, suggesting that students work more efficiently and achieve higher  
80 results when collaborating. Additionally, it was found that students perform better individually in  
81 Kahoot! games when there is a 20 second time constraint per question compared to a 30 second  
82 time constraint (Supplemental Figure 2). Based on these previous results, we hypothesized that  
83 group learning enhances student performance and efficiency. The objectives of this study were  
84 to:

- 85 1) Measure the effect of collaborative versus individual test-taking.
  - 86 2) Measure the effect of test speededness on accuracy.
  - 87 3) Measure the effect change of test speededness on collaborative versus individual test taking.
  - 88 4) Analyze how students' self-perception of performance reflects their actual performance.
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90 **Materials and Methods**

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92 *Class Design*

93 The study consisted of data from two General Education undergraduate courses at the  
94 University of Florida: “PLP2000: Plants, Plagues, and People” and “PLP2311: What Are Plants  
95 Talking About?” that were taught simultaneously by the same instructor in the Spring of 2023.  
96 One class had 14 students, and the other class had 43 students. The same instructor taught both  
97 courses.

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99 *Two-Stage Exams*

100 Two two-stage exams were completed during the semester and were divided into  
101 individual and group segments. Students had a three-hour block to complete both sections, and  
102 because no student exceeded two hours, we considered this the non-time-constrained exam.  
103 Initially, students completed the exam individually. Once all students had finished the individual  
104 portion and handed it in, students formed groups of four or five members on their own to retake  
105 the same exam collaboratively. Collaborative work was done by communicating quietly in groups  
106 on a single exam copy. The groups were distantly arranged in the classroom and instructor and  
107 TA walked around the room to make sure groups were not trying to listen to the discussion from  
108 other groups. The groups varied from week to week. The two-stage exams consisted of 20  
109 questions. 10 questions were created by the course instructor and the other 10 questions were  
110 selected by the instructor from the questions created by students for the weekly quizzes. Student  
111 exam grades were 60% attributed to individual performance, 30% attributed to group  
112 performance, and 10% attributed to completion of the post-exam self-reflection questionnaire.

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114 *Kahoot! Quizzes*

115 Kahoot! provided a virtual, game-based testing platform that students could log into and  
116 answer from their phones or computers. Kahoot! quizzes were administered as time-constrained  
117 exercises that were delivered in two parts, individually and in a group. The total number of  
118 questions per exercise was 20, consisting of 17 multiple choice questions and 3 true/false  
119 questions. The questions were different for the individual and group scenarios (two sets of 20  
120 questions), and a time constraint was imposed on each question. One quiz had a time constraint  
121 of 30 seconds per question for individual and group parts. The second had a time constraint of 20  
122 seconds per question for individual and group parts. If the student or group did not choose an  
123 answer for a question, the question would be marked as incorrect. The score is formulated in  
124 Kahoot! by the quickness and accuracy of students’ answers, with higher scores achieved for  
125 correct answers given more quickly. An incorrect answer yields a score of 0. The correct answer  
126 was immediately provided to the students after each question. Groups consisted of 4 - 5 students.  
127 For all Kahoot! exercises, the individual part was administered before the group part. Student  
128 performance on the Kahoot! exercises did not affect students’ grades in either class. There were  
129 four total iterations of the Kahoot! quizzes, two for each class, resulting in eight separate  
130 evaluations. Kahoot! exercises were administered during the class period prior to the class of the  
131 two non-time-constrained exams.

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135 *Self-Reflection Questionnaire*

136 Self-reflection questionnaires were administered immediately after students completed a  
 137 two-stage exam. These surveys consisted of the following 14 questions (Table 1) and were  
 138 returned anonymously. Students received 10% of their grades by simply returning the  
 139 questionnaire with an answer. Students were informed before completing the questionnaire that  
 140 there were no right or wrong answers. We collected qualitative data from the surveys as well as  
 141 quantitative data from numeric-scale questions.

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143 **Table 1:** List of questions used in student self-reflection questionnaires.

Question Number	Question
1	Describe your experiences and thoughts about completing the test individually as compared to in a group.
2	Did you learn anything from your colleagues during the collaborative part of the test that was not clear before, or were you already comfortable with the subject?
3	Did you find it faster to do the test in a group or by yourself? If yes, why? If no, why?
4	Did you find it easy to collaborate with your peers? If yes, why? If no, why?
5	Did you experience any challenges when completing the test with your group? Please explain.
6	Did any of the questions you created show up on the test? If yes, did you remember the answer?
7	Explain why you agree or disagree with the following statement: Creating questions helped me to learn the subject.
8	On a scale of 1 to 10, how well do you perform when answering timed questions? 1 = very bad; 10 = great.
9	On a scale of 1 to 10, how competitive do you consider yourself to win a game (example: trivia)?
10	What challenges (if any) do you perceive to have the greatest influence on your performance on timed questions?
11	On a scale of 1 to 10, how closely does your perception match your performance (about question 10)? 1 = never; 10 = always
12	Did you like doing Kahoot! before the exam? If yes, why? If no, why?
13	On a scale of 1 to 10, how do you rate the difficulty of this exam? 1 = too easy; 5 = fair level; 10 = too hard
14	What is your gender identity? (select all that apply): Woman, Man, Transgender, Non-binary/non-conforming, Prefer Not to Answer

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145 *Data Collection and Data Analysis*

146 All activities conducted in this research were approved by the Institutional Review Board, with the  
 147 service survey number IRB202100054. Wilcoxon signed-rank test (Whitley & Ball 2002) was used  
 148 to assess the Kahoot! and exam performances. Data analysis was performed in RStudio and  
 149 SigmaPlot® version 14.5, RStudio (RStudio Team, 2020), and wordcloud package (Ian Fellows,  
 150 2018) were used for data analysis and artwork.

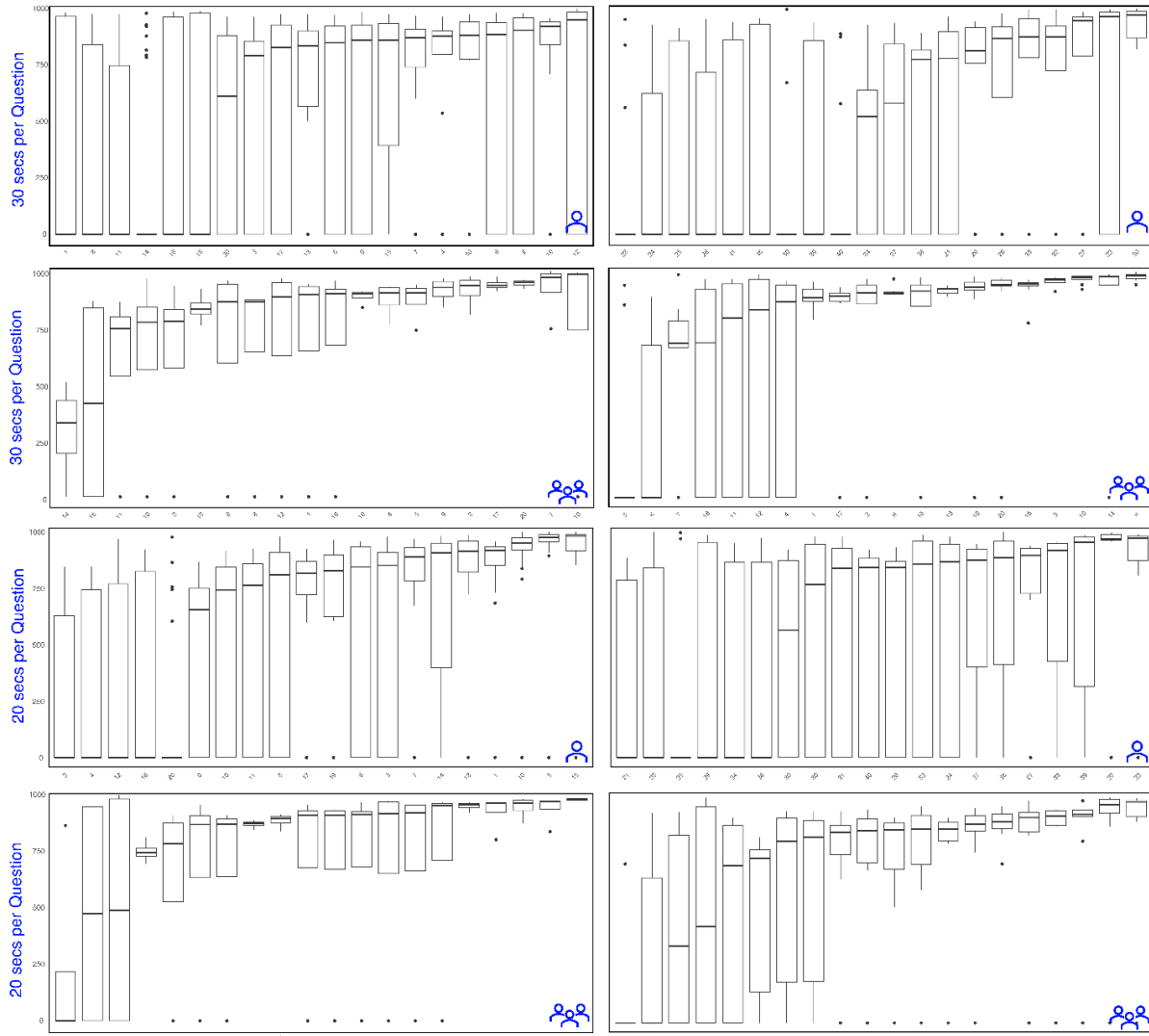
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152 **Results**

153 **Time-Constrained Evaluations**

154 Kahoot! quizzes served as time-constrained evaluations. Group performance was better  
155 than individual performance on all Kahoot! evaluations ( $P < 0.001$  for 20s/question;  $P = 0.004$  for  
156 30s/question). The average individual performance on the 20 second Kahoot! quizzes were 67%  
157 in one class and 61% in the other class. The average group performance for these classes was  
158 73% and 80%, respectively. For Kahoot! quizzes with the 30 second time constraint, average  
159 individual scores were 60% and 55% and average group scores were 78% and 85%, respective  
160 of each class. Without grouping by class, the average individual performance on the Kahoot!  
161 evaluations with a time constraint of 20 seconds was 66.4% and average group performance was  
162 75.6%. Under a 30 second time constraint, average individual performance fell to 58.5% but  
163 average group performance increased to 79%.

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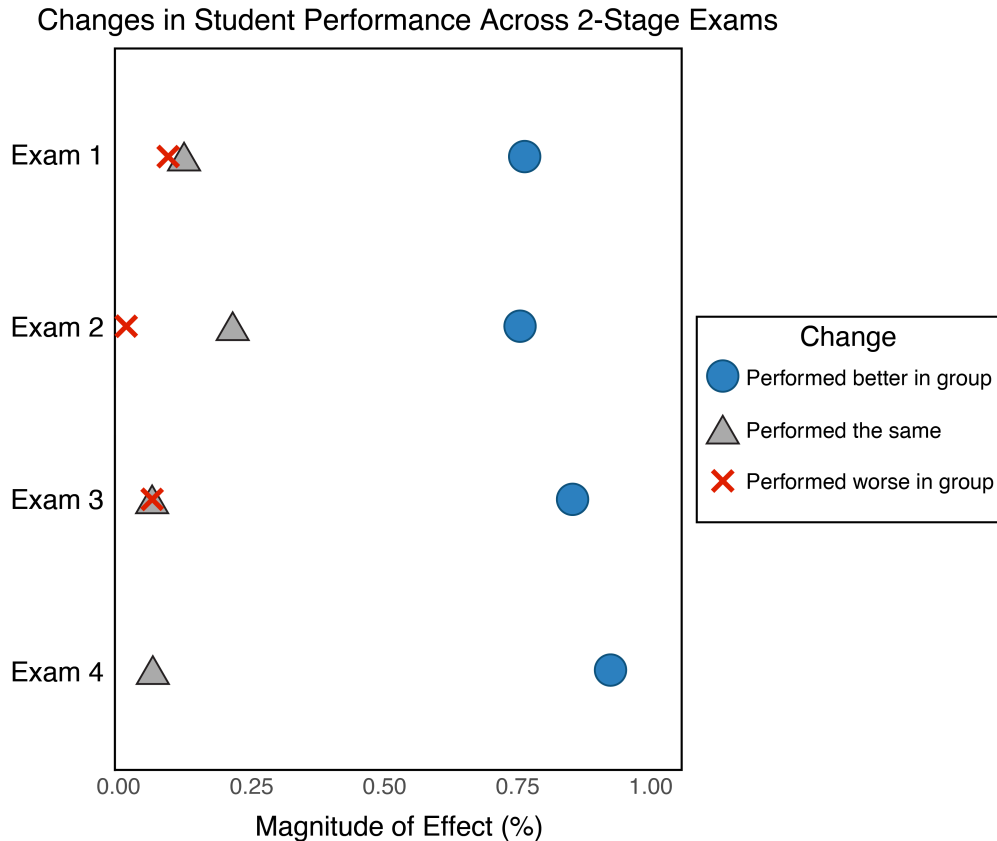
201 **Figure 1:** Individual and group performance on Kahoot! evaluations. Individual performance and  
 202 group performance are indicated by the silhouettes in the bottom right of each box plot. The x axis  
 203 of each graph represents question number, and the y axis is the possible score. Question number  
 204 is arranged by increasing median score. Repetitions of Kahoot! evaluations by different student  
 205 populations are shown in adjacent box plots. Kahoot! evaluations were administered with a time  
 206 constraint of 20 seconds per question and 30 seconds per question. Individuals and groups had  
 207 completely different sets of questions, all related to the same subject. Results from the top 4  
 208 graphs were completed by students from the PLP2311 course while the bottom 4 graphs were  
 209 completed by students from the PLP2000 course.

210 On average, groups took less time than individuals did to answer a question correctly for  
 211 all four Kahoot! evaluations (Figure 1). This trend (groups taking less time than individuals) was  
 212 present for all iterations of the Kahoot! evaluations, regardless of whether there was a 20-second  
 213 or 30-second time constraint per question.

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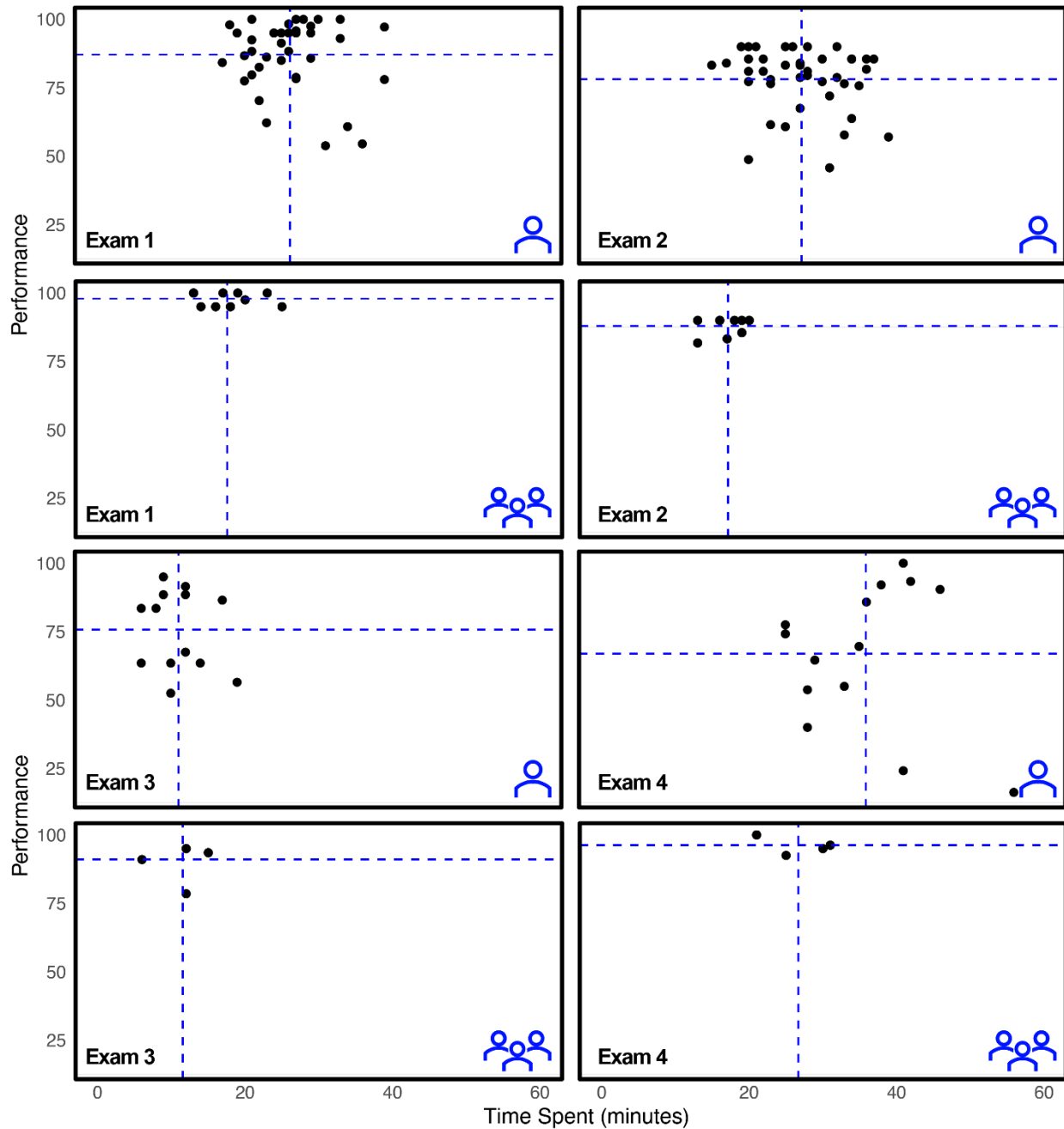
218 **Two-Stage Exams**

219 When individual performance was compared to group performance for the exams, better  
220 average results were obtained for the group scores than individual scores on all the two-stage  
221 exams ( $p < 2.74e-06$ ,  $p < 9.01e-07$ ,  $p = 0.006$ ,  $p = 0.001$ ) (Figure 2). Specifically, 75% of students  
222 performed better on exams when working in groups than working individually. No student  
223 performed worse while working in a group on exam 4.  
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225 **Figure 2:** The effect of exam setting (individual vs group) on student performance was measured  
226 using a Wilcoxon signed-rank test. In this figure, performance is categorized by “performed better  
227 in group,” “performed the same,” and “performed worse in group.” Exams 1 and 2 were completed  
228 by students from the PLP2311 course while exams 3 and 4 were completed by students from the  
229 PLP2000 course. The proportion of students that performed better in a group setting was the  
230 highest on all four exams with a magnitude of  $\geq 0.75$ . No student performed worse in a group on  
231 Exam 4, so there is no red X present.  
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234 All exams, except for exam 3, saw a reduction in the average time taken to complete the exam.  
235 This can be seen by comparing vertical dashed lines across corresponding plots in Figure 3. Even  
236 though exam 3 took longer in groups than individually, it was only by one minute. Individual and  
237 group performance can be compared by looking at the horizontal dashed lines across  
238 corresponding plots which indicates average performance.



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 240 **Figure 3.** Performance and time to complete the exam individually and in groups for 4 exams in  
 241 two general education courses. Exams 1 and 2 were completed individually (single person icon)  
 242 or in groups (3 people icon) by students from the PLP2311 course while exams 3 and 4 were  
 243 completed individually (single person icon) or in groups (3 people icon) by students from the  
 244 PLP2000 course. Horizontal dashed lines indicate average performance per exam, and vertical  
 245 dashed lines indicate average time taken per exam.

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 247 **Self-Reflection Questionnaire**

248 Students had mostly positive remarks regarding taking tests as a group compared to doing so  
 249 individually as reported in all the self-reflection questionnaires (two questionnaires per class):  
 250 74% of responses to question 1 preferred working in groups with the most common reasons being



251 reduction in time and stress and the ability to collaborate with others. Twenty one percent (21%)  
252 had no preference taking the exams individually or in groups, and 5% preferred taking the exams  
253 individually. Similarly, only 3% of students responded to question 3 that they felt working in groups  
254 was slower, and only 1% responded to question 4 that they found working in groups was not  
255 easier (Figure 4). Students found that group testing allowed them to share and discuss ideas  
256 which reportedly improved their confidence. For instance, some students reported: "I felt more  
257 confident taking the test as a group and felt like I learned more from my peers". Others found  
258 group testing to be less stressful and helped reduce their anxiety: "The test was very stressful  
259 individually, so when I worked in a group I felt a lot more calm". Furthermore, over 82% of survey  
260 responses to question 2 indicated that students either learned something new or received  
261 clarification on material that they were unsure about.

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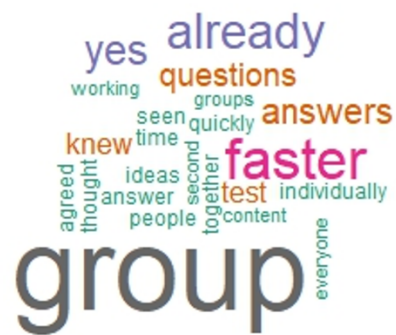
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Question 1: Describe your experiences and thoughts about completing the test individually as compared to in a group?



Question 3: Did you find it faster to do the test in a group or by yourself? Why?



Question 4: Did you find it easy to collaborate with your peers? Why or why not?



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**Figure 4.** Wordclouds for responses to questions 1, 3, and 4 of the self-reflection questionnaires.

We investigated why students performed better in groups than individually on the self-reflection questionnaires, specifically questions 8-12 (Table 1). There was no significant correlation between the change in group and individual performance for each student (dependent variable) and questions 8, 9, and 11 (independent variables) ( $P= 0.434, 0.170, 0.231$ ), suggesting that additional evidence is required for the quantitative survey questions.

The most common challenges identified in question 10 were time pressure (43%), lack of confidence (21%), anxiety (18%), and lack of knowledge (13%).

Fifteen percent (15%) of the students reported facing challenges when working in a group (Question 5). Those who did report challenges described the difficulty arising when other students

279 were confident about certain answers that they disagreed with. This led to peer-to-peer discussion  
280 as all groups finished and submitted the exam without instructor intervention.

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## 283 **Discussion**

284 The results of this study highlight the benefits of group testing over individual testing in  
285 both time-constrained and non-time-constrained evaluations. The data showed that group  
286 performance was consistently better than individual performance in both Kahoot! quizzes and  
287 two-stage exams. Specifically, the average group performance was greater than the average  
288 individual performance regardless of the time constraints. The results indicate that groups not  
289 only achieved higher scores but also took less time to answer correctly, suggesting greater  
290 efficiency and accuracy in a collaborative setting. Despite the small sample size of 57 students  
291 from only two classes, the significant trends observed in this study warrant further investigation.  
292 The greater efficiency is likely due to the collaborative nature of group testing, which facilitates  
293 idea sharing and collective problem-solving.

294 The self-reflection questionnaire provided further insights into the perceived benefits of  
295 group testing. Students reported that group testing allowed them to share and discuss ideas,  
296 which improved their confidence and reduced anxiety: "I enjoyed taking [the exam] as a group  
297 because my team had several ideas I didn't consider". Over 82% of the survey responses  
298 indicated that students learned something new or received clarification on material they were  
299 unsure about, showing the potential value of peer discussions during group tests. This finding  
300 aligns with previous research that has shown students benefit from peer instruction, which  
301 enhances their understanding and retention of course material (Tullis & Goldstone, 2020).  
302 However, it is essential to refine the survey questions to better understand the challenges  
303 students face when working in groups. Previous studies have shown that test anxiety does not  
304 diminish when taking tests as a group compared to individually (Breedlove et al., 2004). Yet, the  
305 structure of individual and collaborative testing in this study differs from those in previous  
306 research, indicating a need for more tailored studies.

307 Interestingly, the data also revealed that individuals performed better under stricter time  
308 constraints, suggesting that the pressure of limited time might enhance focus and performance.  
309 This observation was consistent across both the preliminary and presented data. However, it is  
310 worth noting that not all students participated equally in the Kahoot! evaluations. The different  
311 participation levels indicate that either (or both) time constraints or lack of impact on class grade  
312 might have diminished engagement. Less pressure on any assignment or exam because the  
313 result will not impact their overall grade likely leads to less effort or focus during those ungraded  
314 assignments/exams.

315 The challenges identified in the self-reflection questionnaire, such as time pressure, lack  
316 of confidence, and anxiety, were common among students. These issues suggest that additional  
317 research is needed to explore how different time constraints impact student performance and  
318 stress levels. Manipulating the time constraint from 20 and 30 seconds to 20 and 60 seconds per  
319 question could provide valuable insights into alleviating potential time-pressure experienced by  
320 students. The positive reception of group testing by students, with 100% of survey responses  
321 affirming the value of Kahoot! evaluations for reviewing course material and preparing for exams,  
322 underscores the potential benefits of incorporating collaborative testing methods in educational

323 settings. This study's findings echo the results of existing literature that associates a higher sense  
324 of belonging in science classrooms with higher academic achievement and persistence (Walton  
325 & Cohen, 2011; Yeager & Walton, 2011). Additionally, the extent to which students contribute to  
326 discussions plays a crucial role in their learning experience (Penuel et al., 2023).

327 In conclusion, this study provides compelling evidence that group testing can enhance  
328 student performance, confidence, and learning. However, further research with larger sample  
329 sizes and varied time constraints is necessary to validate these findings and address the identified  
330 challenges. By refining the research design and survey instruments, future studies can offer  
331 deeper insights into the dynamics of group versus individual testing in educational contexts.

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333 **Data availability statement**  
334 The dataset is freely available after registration as a researcher. Computing workflows (source  
335 code and input files) are available on GitHub (<https://github.com/Martins-Lab/WordCloud>).

336  
337 **Conflict of interest**  
338 The author declares that the research was conducted in the absence of any commercial or  
339 financial relationships that could be construed as a potential conflict of interest

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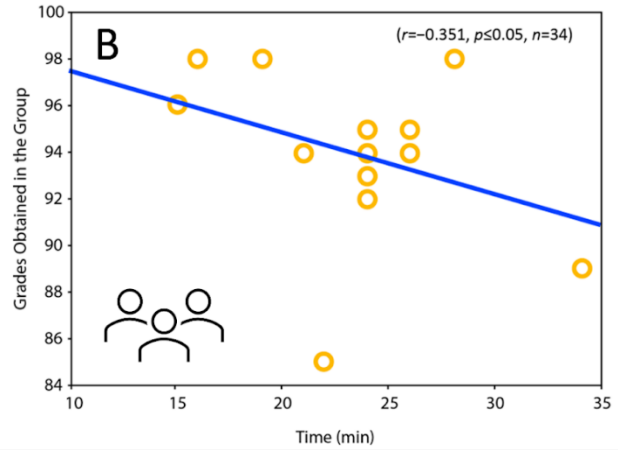
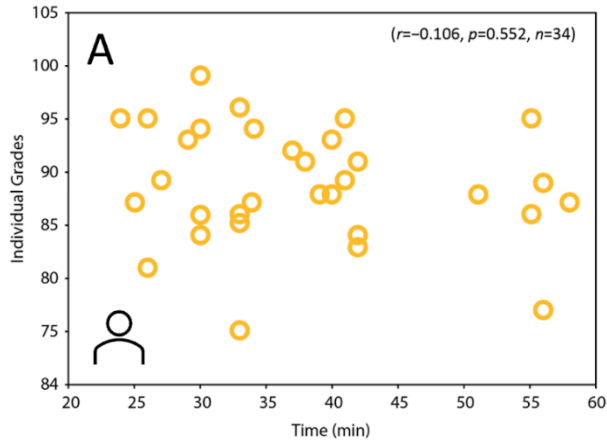
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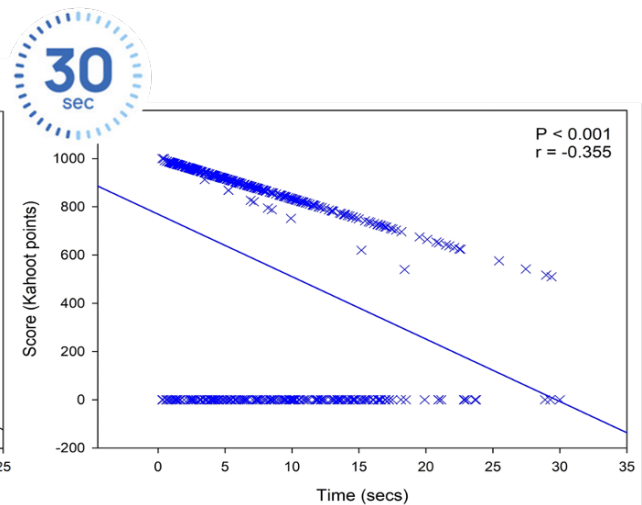
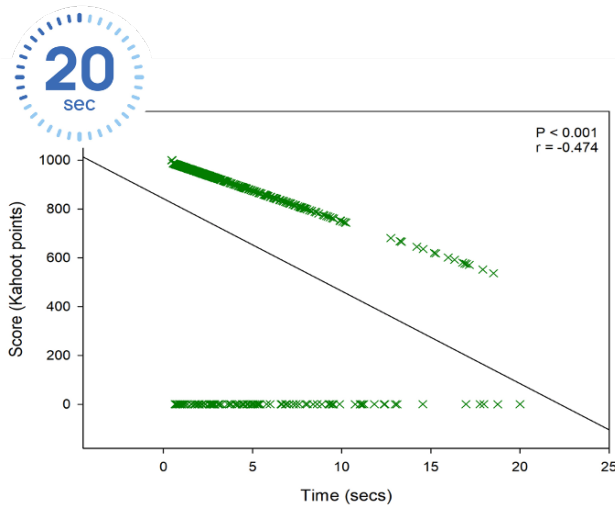
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421 **Supplemental Figure 1** - Pearson's correlation coefficients between students' time to complete  
 422 the two-stage exam individually (A) and in groups (B) and their individual grades (A) and group  
 423 grades (B). The data presented represents two exams with seventeen students per exam (n=34).  
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427 **Supplemental Figure 2** - Time to answer questions vs. score per question for 20 secs (left) and  
 428 30 secs (right) when students took the Kahoot! games individually.  
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