

July 2014

Time Efficiency, Written Feedback, and Student Achievement in Inquiry-Oriented Biology Labs

John M. Basey

University of Colorado at Boulder, John.Basey@colorado.edu

Anastasia P. Maines

University of Colorado at Boulder, Anastasia.Maines@Colorado.EDU

Clinton D. Francis

California Polytechnic State University, CDFranci@calpoly.edu

Recommended Citation

Basey, John M.; Maines, Anastasia P.; and Francis, Clinton D. (2014) "Time Efficiency, Written Feedback, and Student Achievement in Inquiry-Oriented Biology Labs," *International Journal for the Scholarship of Teaching and Learning*: Vol. 8: No. 2, Article 15.

Available at: <https://doi.org/10.20429/ijstl.2014.080215>

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Abstract

We examined how different styles of written feedback by graduate-student teaching assistants (GTAs) in college intro biology lab (USA) influenced student achievement and related the different styles to time efficiency. We quantified GTA feedback on formative lab reports and student achievement on two different types of assessments, a quiz in 2010 and a summative lab report in 2011. We evaluated the extent to which three categories of written feedback impacted student achievement (grade discrepancy between actual and ideal, short direct comments, and in-depth explanatory comments). Student achievement was best explained by both grade discrepancy and short direct comments in 2010 and grade discrepancy only in 2011. In-depth explanations were not part of the best-fit models in either year. Results also indicated that GTAs provided little encouraging feedback, most feedback was targeted and asked students to expand on explanations. Results are discussed in relation to relative time efficiency and GTA training.

Keywords

science education, feedback, evaluation, science teaching, and educational research

Cover Page Footnote

Funding was provided by the President's Teaching and Learning Collaborative and the integrating STEM (iSTEM) Education Initiative. CDF was supported by the University of Colorado Graduate School and the National Evolutionary Synthesis Center (NESCent; NSF #EF-0905606). We also thank the Science Education Initiative, and the various graduate students and undergraduates who participated in this project.

Introduction

In recent years, the push in science education to move from teacher-centered instruction to student-centered instruction has increased the prevalence of write-to-learn educational strategies as exemplified by the well-documented and well-used "Science Writing Heuristic" (Keys et al. 1999, Poock et al. 2007). Going hand-in-hand with this transformation is the importance of written feedback. In a recent review of assessment feedback Li and De Luca (2012) found limited studies addressing actual feedback practices in higher education and due to discipline specific variations, they advocated that more studies on feedback are needed especially in diverse disciplines. Biology is a field in higher education that often uses write-to-learn pedagogies especially in the lab setting.

In the United States (USA) large universities rely on graduate-student teaching assistants (GTAs) to instruct the laboratory (lab) component of large introductory science classes, and biology is no exception (Luft et al. 2004; Kendall and Schussler 2012). For introductory biology labs, Sundberg et al. (2005) estimated that 91% of the sections at research universities were taught by GTAs. For instance, in the fall semester 2013 at the University of Colorado at Boulder (CU) in the Department of Ecology and Evolutionary Biology all 57 sections of introductory biology lab were taught by GTAs and 68% were first-time GTAs. In addition to their lack of experience, GTA's are also limited on the time they can invest in their teaching. The most common expectation is 20 hours per week. Thus to improve student learning, information on the benefits of various types of GTA feedback relative to the cost in time efficiency (i.e. student learning per time invested by GTA) can be extremely valuable.

Research has indicated written feedback provided in a timely manner has great potential to influence student learning (Huxham 2007, Hattie and Timperley 2007, Ambrose et al. 2010). However, written feedback is highly time intensive and may not substantially improve student achievement (Crisp 2007). Voelkel and Mello (2014) compared the effectiveness of written feedback and auditory feedback in a write-to-learn module of undergraduate comparative animal physiology in the

UK. They found that students preferred auditory feedback to written feedback, but written feedback was significantly less time intensive for the instructor. They also found that neither written nor auditory feedback on the formative assessments improved student performance on the subsequent summative assessment. In Australia, Lizzio and Wilson (2008), gathered data from undergraduate students in several disciplines concerning their perceptions of helpful and unhelpful written feedback. A factor analysis revealed three dimensions of helpful feedback: developmental, encouraging and fair. In this study we focused on developmental and encouraging feedback.

Providing students with an understanding of the performance gap between the actual performance and the ideal performance expected by the assessor is of key importance in developmental feedback (DeNisi and Kluger 2000). The most common way to inform students of this gap is through a grade or some numerical evaluation of how close a student came to the ideal performance. Outside grades is a continuum of written feedback ranging from short words and statements to lengthier in-depth explanations that may be several sentences to paragraphs in length. Thus, there are several potential strategies instructors can utilize for written feedback that take considerably different time investments by instructors.

Table 1 shows the assumed relationship between four strategies of written feedback as they relate to overall time investment. In this study, we examined three questions.

Table 1. The assumed relationship between time allocation in written feedback and different strategies of providing written feedback by GTAs.

Time Investment	Description of Feedback Strategy
Low	Supplying accurate grades without other written comments.
Medium	Supplying accurate grades with short directed words or phrases for correction relating to an incorrect or misguided statement.
Medium to High	Supplying accurate grades with extensive explanations for correction relating to an incorrect or misguided statement.
High	Supplying accurate grades with short directed words or phrases and extensive explanations for correction relating to an incorrect or misguided statement.

- Which and how often are the strategies in Table 1 utilized by GTAs to provide developmental feedback to their students on quizzes and lab reports?
- Do the strategies of written feedback outlined in Table 1, result in different levels of student achievement, and if so, which strategies have the greatest influence on student achievement and how do they relate to relative time efficiency?
- What is the frequency at which GTAs provide developmental versus encouraging feedback?

Methods

A. Targeted classes

The study was conducted at the University of Colorado at Boulder (CU) in spring 2010 in General Biology Lab II (GBL II) and in fall 2011 in General Biology Lab I (GBL I). GBL I and GBL II were part of the year-long general biology sequence and were typically taken in order. Both classes were stand alone, 1-credit-hour lab classes that ran concurrently with a 3-credit-hour lecture class that addressed similar content. GBL I and GBL II enrolled approximately 864 students each that were mostly freshman (60%) and sophomores (30%) with a small percentage of juniors (5%) and seniors (5%). Classes were taught by 24

GTAs who facilitated two lab sections each that had up to 18 students. In GBL I, students participated in a series of inquiry-oriented experimental labs that culminated in an open-ended research-based student-project. GBLII was comprised of a mix of experimental and non-experimental labs.

B. Research design for spring 2010 in GBL II

In GBL II, a substantial part of the semester covers biodiversity. Biodiversity labs are hands-on, non-experimental experiences with the following targeted learning goals.

- Compare and contrast life cycles of various groups of organisms.
- Use evidence to defend the contention that a group of organisms (plants or animals) began in water and radiated to land.
- Justify how the current diversity of a particular group can be explained by evolution through natural selection using specific examples examined in lab.

We focused our study on the plant biodiversity lab. Two formative labs covering biodiversity of unicellular/colonial eukaryotes and animals were completed prior to the lab on plant biodiversity. During each lab, students filled out a lab report; the GTA graded the lab report and provided written feedback (formative assessments). One week following the plant biodiversity lab, students were evaluated with a practical short-answer quiz comprised of five stations. Three stations assessed using Bloom's lower-order foundational information and two stations assessed using Bloom's higher-order integration extending from the foundation.

Quizzes from participating students with grades and comments from participating GTAs were photocopied. Two of the authors in this study, JMB and APM, re-graded the quizzes with a rubric. The two researchers started by independently re-grading the same 30 quizzes. Re-grades were compared on each question with a *t*-test and no significant differences in re-grading were present on any of the questions (all, $P > 0.05$). The remaining quizzes were re-graded in an identical manner to the

first 30 except no t-test comparisons were performed. Comments were then coded by JMB (see subsection D). Nineteen GTAs participated and the # of students/GTA ranged from 25 - 35 with an average of 30 students/GTA. The GTAs consisted of 15 females and 4 males with 11 having one semester of teaching experience at CU and 8 with more than one semester of teaching experience at CU.

C. Research design for fall 2011 in GBL I

In GBL I, one overarching set of learning goals relates to science process skills. In this study we targeted one of these learning goals.

- Describe the evidence associated with an investigation and explain how the evidence from the investigation relates to the hypothesis(es).

Early in the semester, students completed 3 guided inquiry lab investigations that all had a formative assessment question addressing the learning goal. In all three labs, GTAs graded the assessments and provided comments. Following the 3 practice events, students derived and designed their own investigations that had a summative assessment question addressing the same learning goal. Assessments of participating students from the first formative lab and the student project lab (summative) with grades and comments from participating GTAs were photocopied. The photocopies were re-graded and feedback was coded by JMB. Eighteen GTAs participated and the # of students/GTA ranged from 17 - 36 with an average of 30 students/GTA. The GTAs consisted of 13 females and 5 males with 10 having no prior teaching experience at CU and 8 with more than 1 semester of teaching experience at CU.

D. Coding feedback from GTAs

Written feedback was first delineated as encouraging or developmental. Encouraging feedback referred to some aspect of the student discussion that was completed well. Encouraging comments were coded as either vague or specific. Vague encouraging comments were not directed to any specific aspect

of the answer. An example is "Great job!" written adjacent to the answer. Specific encouraging comments were directed at some aspect of the answer that was completed particularly well either with arrows or circling the statement, or by lengthier statements. Developmental feedback was delineated into several categories listed in Table 2. For each item of developmental feedback, the quality was indicated on a four-point scale. For example, the four-point scale used for quality of statements classified into the restructure category is shown in Table 3. Each question was categorized and judged for quality.

In 2010, we coded the summative plant diversity quiz. In 2011, we coded the discussion questions from the first exercise of the semester and the full-inquiry student project, and then we combined results to get one overall score per GTA.

Table 2. Categories of developmental feedback used for the data analysis.

Reference Name	Description
Grade Discrepancy (Grade)	The difference in the grade provided by the assessor (JMB and/or APM, see sections B and C) and the grade given to the student by the GTA (e.g. if a GTA gave a grade of 3 and the assessor a grade of 2, the grade discrepancy would be $2 - 3 = -1$).
#	The number of comments representing a single theme for correction relating to an incorrect or misguided statement.
Depth	The extent to which a comment explained how to correct an incorrect statement. Depth was based upon an additional 4-point rubric (see Table 3).

E. Analyses

Analyses were performed using multiple linear regression in program R (R Development Core Team 2012) with all combinations of explanatory variables (e.g., grade discrepancy, number of comments, depth of comments) used as explanatory variables. Competing models were evaluated with an information-theoretic approach (Burnham and Anderson 2002) using Akaike's Information Criterion corrected for small sample sizes (AIC_c). Competing models were ranked based on

differences in AIC_c scores (ΔAIC_c). Models with ΔAIC_c scores within two of the best models were considered to have strong support. For all candidate models we calculated Akaike weights (w_i) to weight the evidence of importance for each variable included in strongly supported models ($\Delta AIC_c < 2.00$).

Table 3. The four-point scale used for depth of comments classified into the restructure category.

Category	1	2	3	4
R = Restructure (Comments that restructure student thinking or how they answer question.)	One word comments or indications, Why? If ..., Then...! (Also underlining phrases in question not correctly addressed by student answer.)	Comments with brief explanation. Examples – “This is just a prediction!” “What about your sample size?”	Comments with additional explanation. Examples – “This is just a prediction – Why will eating sugar increase their respiration rates.” “What about your sample size? Was it adequate?”	Comments with extensive explanation. Example -- “This is just a prediction. Your hypothesis needs to be explanatory (i.e. There is a higher density of rods versus cones in the periphery of your eye, therefore, peripheral vision should improve in dim light relative to bright light.)”

Results

A. How does the variation in written feedback differentially impact student achievement?

The grade discrepancy, number of comments and depth of comments were highly variable, and the number of comments and depth of comments were different for the quiz than they were for the lab report ($\chi^2 = 791$, $d.f. = 5$, $P < 0.001$, Figure 1). A high proportion of GTAs did not put any comments on the quiz in 2010 other than a grade and the depth of comments tended to be concise and specific relative to the depth of comments on the lab report in 2011 (Figure 1).

In 2010, an analysis of all of the developmental explanatory variables (grade discrepancy, number of comments, depth of comments, and number times depth) and their effects on students' achievement for the practical quiz on plant biodiversity indicated that the best-fit model only included grade discrepancy and number of comments (Table 4). Neither depth nor the combination of depth and number of comments were parts of any models competing with the best-fit model ($\Delta AIC_c > 2.00$). A multiple regression analysis with quiz achievement as the dependent variable and grade discrepancy and number of comments as independent variables indicated that both independent variables had a significant effect on the quiz achievement (grade discrepancy, $P = 0.006$; number of comments, $P = 0.010$), with a substantial percentage of the variance in grade explained by the model (multiple adjusted $R^2 = 0.5032$, Figure 2).

In 2011, the analysis of the explanatory variables and their impacts on the achievement for the summative student project lab report indicated that the best-fit model only included grade discrepancy (Table 4). The number of comments, the depth of comments or the combination of number and depth were parts of any models competing with the best-fit model ($\Delta AIC_c > 2.00$). The best-fit model, with grade discrepancy as the independent variable revealed a significant effect by grade discrepancy on the student project lab report achievement score ($P = 0.002$), with a substantial percentage of the variance in

achievement score explained by the model (multiple adjusted $R^2 = 0.4774$, Figure 3).

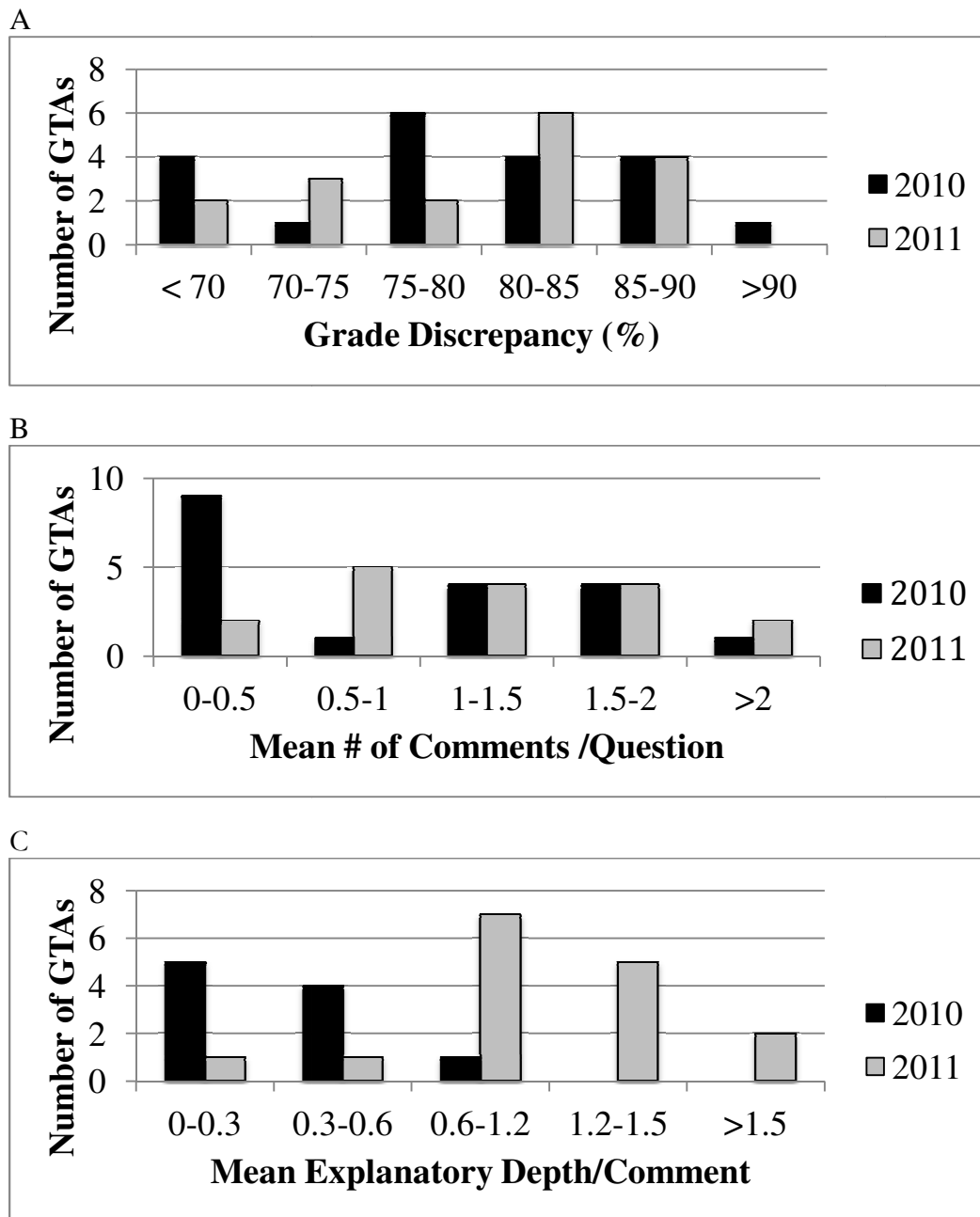


Figure 1. The distributions of grade discrepancy (A), mean number of comments per question (B), and mean explanatory depth of feedback per comment (C) for GTAs for the quiz in 2010 and lab reports in 2011.

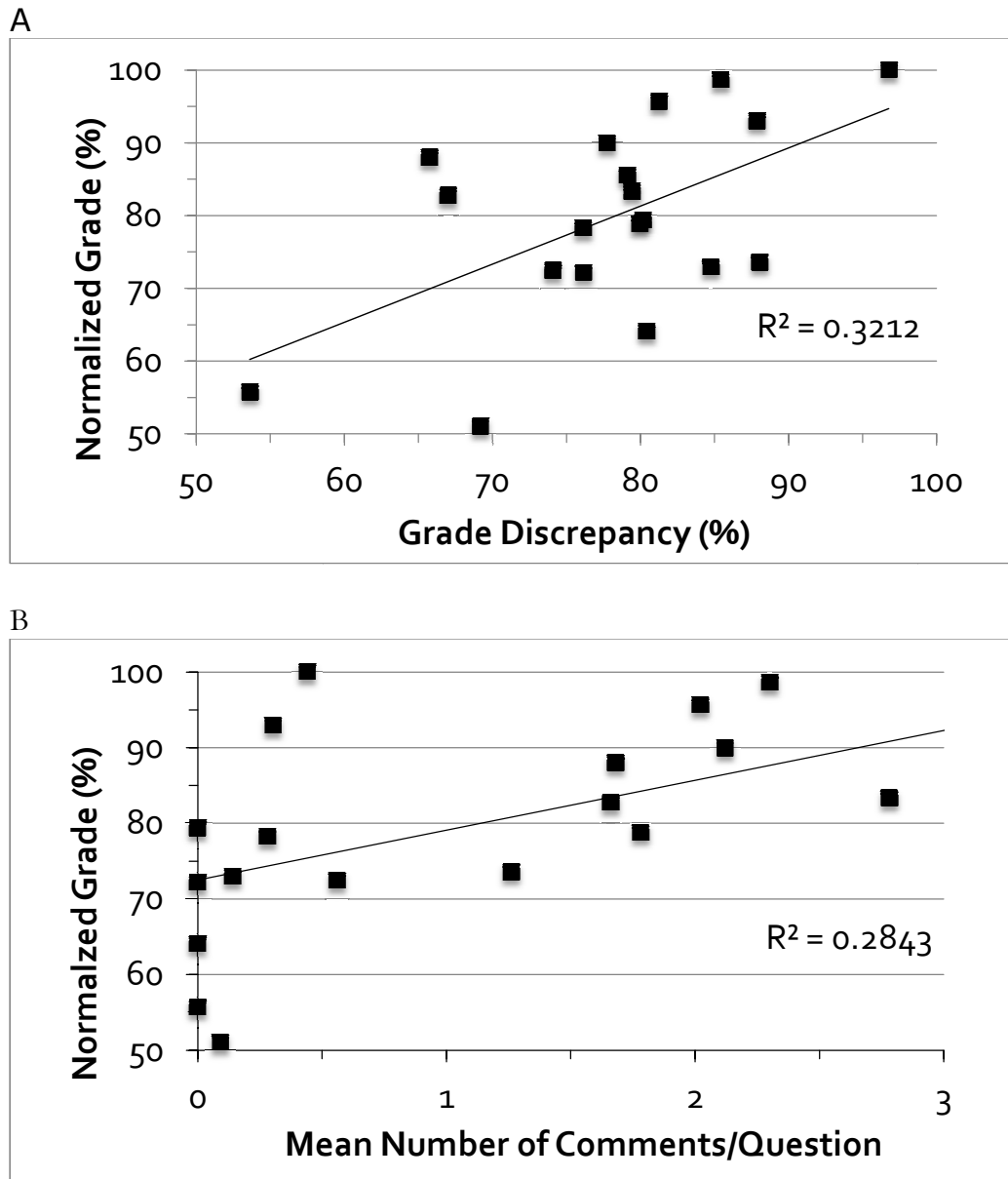


Figure 2. The relationships between grade discrepancy (A) and the mean # of comments per question (B) on the average normalized quiz achievement of students in a given GTA's class. To make the graph easier to interpret, achievement was normalized by setting the highest GTA's average to 100% and adjusting accordingly.

Table 4. The top four candidate models explaining student achievement on the summative assessments in the analyses from 2010 and 2011. Independent variables are described in Table 2. Only models with ΔAIC_c scores within 2 of the best-fit models were considered to have strong support and are indicated in bold-faced type.

Year	Independent Variables	Adj R ²	AIC _c	ΔAIC_c	w _i
2010	Grade + #	0.5032	59.81	0	0.653
	Grade + # + Depth	0.5066	62.22	2.404	0.196
	Grade	0.2813	64.73	4.913	0.056
	#	0.2422	65.73	5.913	0.034
2011	Grade	0.4774	-7.413	0	0.573
	Grade + Depth	0.4509	-5.357	2.056	0.205
	Grade + #	0.4206	-4.445	2.696	0.130
	Grade + # + Depth	0.4200	-1.565	5.849	0.031

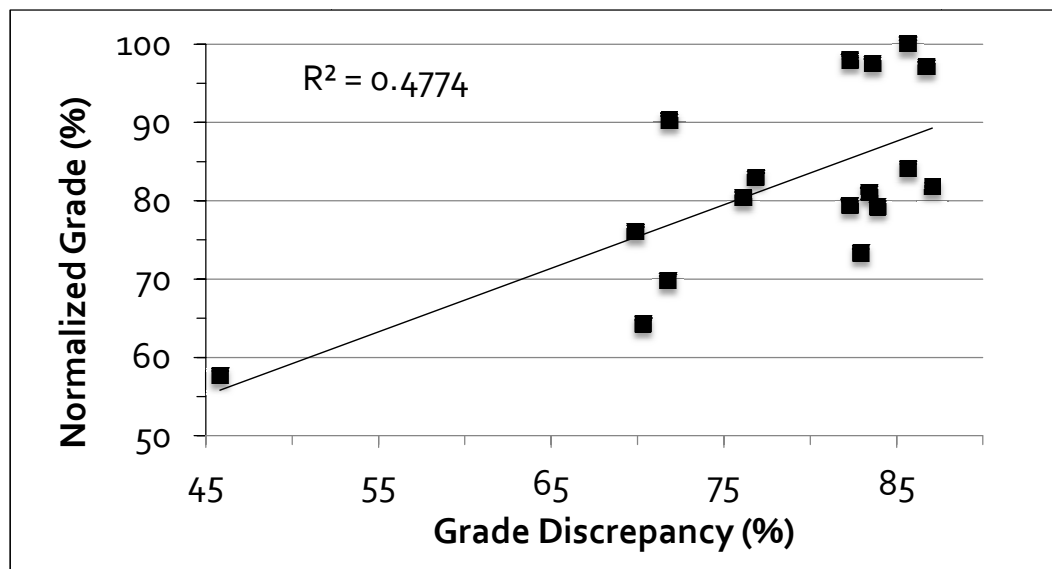


Figure 3. The relationship between grade discrepancy and the average normalized student-project achievement of students in a given GTA's class. To make the graph easier to interpret, achievement was normalized by setting the highest GTA's average to 100% and adjusting accordingly.

B. What types of feedback were provided by GTAs?

Of the feedback from the GTAs, only 3.5% was encouraging with approximately half of that being vague and half being specific (Figure 4). Only 3% of the developmental feedback was vague (Figure 4). By far, most of the developmental feedback (58%) was feedback indicating to the students that they needed to include more information to better support their contentions in their discussion, while only 27% concerned the restructuring of misguided understanding and 7.4 % concerned writing style (Figure 4).

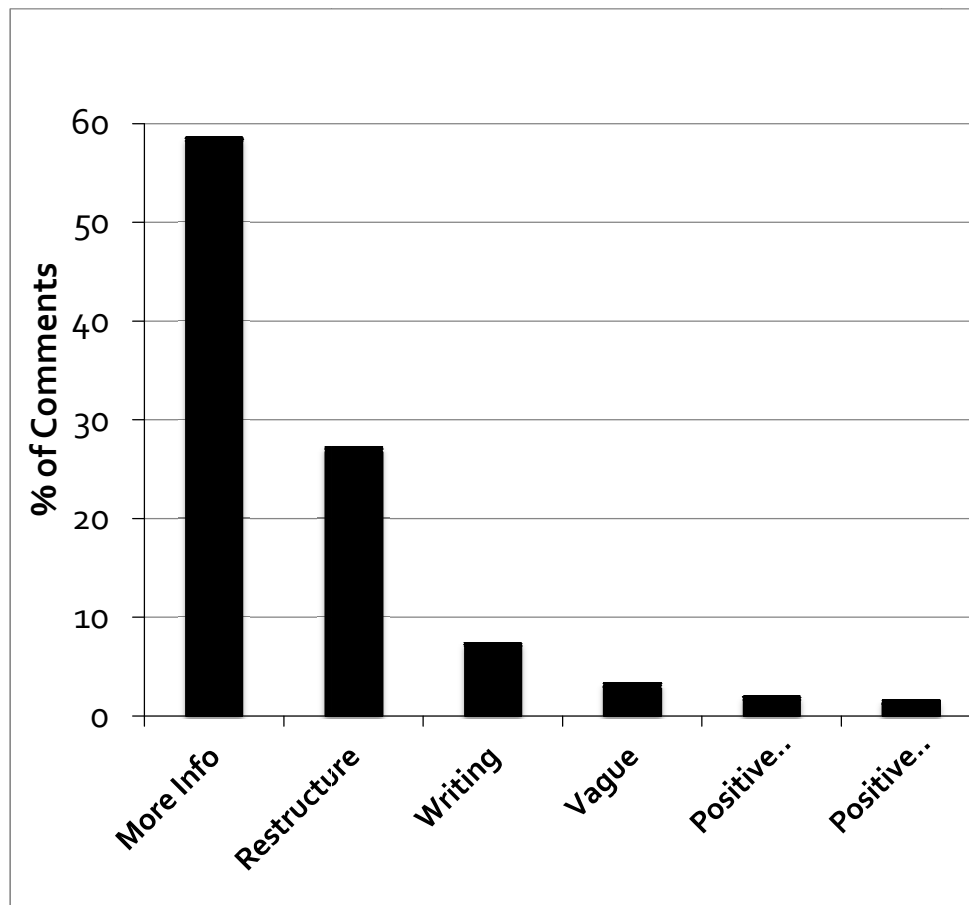


Figure 4. The relative number of comments provided by GTAs in the delineated categories.

Discussion

A. Did written feedback improve student achievement?

Crisp (2007) questioned whether the effect of formative written feedback on student summative achievement was worth the extensive time required for the written feedback. Results of this study show that written feedback from GTAs in introductory biology labs had differential impacts depending on the form of the feedback. Lengthy explanatory written feedback was not a part of the best-fit model for the summative quiz or the lab report, while correctness in providing students a grade that matched the ideal was a part of the best-fit model for both the summative quiz and lab report (Table 4). In addition, for the quiz numerous short and specific comments were also a part of the best-fit model. These results are consistent with literature. Ambrose et al. (2010) contend that too much feedback is problematic for students and can have a negative impact on learning. According to Hattie and Timperley (2007), a key to effective feedback is to “reduce the discrepancy between current and desired understanding”. A grade is basically informing the students how far they are from the ideal answer and the more accurately GTAs informed students of the discrepancy the better students performed.

One confounding element in this analysis is that we did not quantify or observe non-written feedback. Non-quantified in-class observations indicate that GTAs differentially provide verbal feedback during lab time. Some GTAs thoroughly review quizzes and lab reports while others do not. Theoretically, the variability in verbal feedback could decrease the ability of this study design to discern strategies that would be incorporated into a best-fit model. Thus, it is possible that if other forms of feedback were factored out, the parameters examined could have had a greater impact than that seen in this study. However, we argue that the opposite would not be true and the results of this study likely represent the most effective strategies demonstrating a positive effect on student achievement.

B. How do feedback strategies relate to time efficiency?

For this study time efficiency is defined as student learning per time invested in written feedback from the GTA. One limitation

of this study is that we never quantified the time investment for different strategies of written feedback. Instead we used a logical argument to infer time investment for the various strategies (Table 1). It is possible that accurate grading plus some form of commentary occupied more time than haphazard grading plus a greater quantity of commentary. However, it is most likely that the category of number times quality in Table 1 represents the most time consuming strategy and grade discrepancy represents the least time consuming strategy since all GTAs were required to assign a grade.

One of the most simplistic models of time efficiency related to feedback would be one of a positive linear association of written feedback and student achievement. It follows that if overall time investment in feedback relates directly to learning, the best-fit model in this study should have been the model incorporating correctness and number times quality of comments, and the least effective model should have been the null model followed by a sole model of correctness in grading (Table 1). For written lab reports, the results of this study indicate that the most time efficient strategy was supplying an accurate grade without other written comments. For quizzes the most time efficient form of feedback was not as clear. The results of this study indicated two potential strategies: an accurate grade with many short but specific words or comments, or just an accurate grade depending on the time discrepancy of adding brief commentary versus the amount of help the comments provided (Figures 3a and 3b). More research is needed that quantifies the time commitment by GTAs in providing written comments as well as learning gains.

Science education literature indicates other potential methods of providing written feedback in biology classes. Huxham (2007) categorized the written feedback addressed in this research as "personal comments". Huxham (2007) compared feedback in the form of personal comments to feedback in the form of model papers in two non-lab biology courses and found on the summative assessment that students receiving the formative model papers significantly outperformed the students who received the formative personal comments. Huxham (2007) also found that students preferred personal

comments to model papers. Although Huxham (2007) did not quantify time allocation for the two different methods, model papers should be less time consuming than personal comments because all students receive a single set of model papers that can be distributed all at once.

C. Training GTAs with limited training time.

Prior to teaching their first classes, GTAs at large universities in the USA have one to two weeks to be trained (Burke, et al., 2005). If a GTAs' first experience teaching is negative, he/she may not pursue science teaching as a future career or may elect to focus on research. Recruitment and retention, especially of women in science, is an important consideration (Shen, 2013) and research shows that GTA teaching experience improves their research skills (Feldon, et al., 2011). A key component for success of these novice GTAs is training (French, & Russel, 2002; Roerig, et al., 2003; Luft, et al., 2004; Burke, et al., 2005). Due to the limited available time to train GTAs prior to their first teaching experience, information on costs and benefits of different aspects of GTA training and their impacts on student learning as well as student attitudes towards their GTAs can be extremely informative. Results of this study can also be used to inform training policies for these first-time GTAs.

Research has indicated that feedback is most effective when it is targeted towards learning goals and it is specific (Hattie and Timperley 2007). Results of this study indicate that approximately 92% of the overall feedback by the GTAs was targeted and specific. From a meta-analysis, Kluger and DeNisi (1996) indicated that the most effective feedback was encouraging and highlighted correct aspects of performance. Results of this study indicated that only 1.6% of the feedback from GTAs was encouraging and specific (Figure 1).

Aside from grades, most of the developmental feedback from GTAs involved informing the students that they needed to include more information to support contentions in their evidence-based discussions or answers to quiz questions. For the lab reports in 2011, the key question analyzed was a full discussion of the students' experimental results and evidence-based conclusions. In the formative lab reports, students were

provided with guidance on how to answer the discussion questions and what components to include, but the summative assessment was more open-ended and did not provide specific details on what to include. This indicates that students likely commonly left out vital pieces of available information in making their evidence-based arguments. Thus, to improve student achievement, a larger investment in educating the students about evidence-based argumentation at the beginning of the semester may be a successful strategy.

C. Educational Implications

Large introductory science classes at universities have a tendency to be taught by GTAs who often have minimal teaching experience, limited training time prior to their first teaching encounter, and limited time overall. Results of this study indicate that GTAs may be able to save time by foregoing extensive written feedback by accurately grading student work and providing short specific comments, then enhance the feedback with more efficient forms of feedback such as model papers. Beyond the situation-specific implications, lab instructors in general may want to consider results of this study in determining how they provide feedback to students on lab reports and quizzes.

In addition, lab coordinators who train these first-time GTAs often must make difficult decisions on how to train these GTAs. Results of this study indicate that these novice GTAs are doing fairly well at providing specific feedback directed toward the learning goals, but do a poor job at indicating specific components of excellent work (praise) In addition, assessing student work and indicating quality with a grade had the greatest impact on student achievement. Therefore, a workshop on assessing and grading, and the production of a more extensive rubric for the GTAs may be a better use of the limited available training time than a workshop completely devoted to written feedback.

Overall, educators should recognize that these results are preliminary and more research is required to expand on and to verify these results.

Acknowledgements

Funding was provided by the President's Teaching and Learning Collaborative and the Integrating STEM (iSTEM) Education Initiative. CDF was supported by the University of Colorado Graduate School and the National Evolutionary Synthesis Center (NESCent; NSF #EF-0905606). We also thank the Science Education Initiative, and the various graduate students and undergraduates who participated in this project.

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