

Gender Attrition in Computer Science: An Investigation of Why Female Students  
Report Under-Performing in Introductory Courses

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## Introduction

In the field of Computer Science (CS), gender disparity has been a challenge for over 40 years (Austing, Baldwin, McKay, & Shaw, 1979; Camp, 1997; Cohoon, 2001; Frenkel, 1990; Klawe, 2011; Montanelli & Mamrak, 1976; Spertus, 1991). Specifically, women are typically underrepresented in the field. Today, the number of women in undergraduate Computer Science programs hovers around 18%, nationally (US Dept. Education, 2009). Computer Science departments traditionally have trouble recruiting female students; this naturally accounts for some of the gender disparity. However, departments also suffer from attrition of female students once they enter the major. A reason commonly cited among females who decide to leave the major is that they under-perform in introductory classes. Loosely, this claim admits two broad possibilities: either female students actually under-perform in introductory courses, or they only perceive that they under-perform. This paper considers each of these possibilities in turn. First, we investigate if female students actually perform worse than their male peers in introductory classes. We conclude that there is no evidence to support the claim that females under-perform in this regard. Second, we investigate if females only perceive that they are under-performing and consider possible causes of this perception. To explore these questions, we analyze survey and grade data for over one thousand students across introductory CS courses.

## Methods

To address the research questions, we analyze two sources of data: anonymous surveys, and student grade information.

### Surveys

Students answered an IRB approved, web-based survey with approximately ten questions. The survey included demographic questions, Likert-scale questions, and

free-form questions. The surveys were distributed at various points such as the beginning of a course, the end of a course, or when dropping a class. Students were tracked through an anonymous identifier in order to recognize when the same student took the survey more than once. The dataset contains responses from 1019 distinct undergraduate students who were enrolled in Computer Science introductory courses between 2008 and 2010 at the University of Virginia.

## Grades

Instructors provided final grade and gender data for 1,023 distinct undergraduates who were enrolled in CS1 or CS2 courses between 2008 and 2010 at the University of Virginia. This amounted to a total of 2,021 final grade instances. Student genders were manually labelled as male, female, or unknown based on name and photograph information. Letter grades were converted to the standard College Board GPA scale (i.e. "B"=3.0, "B+"=3.3, etc.). Final grades marked as either "incomplete" or "pass/fail" were omitted from the dataset (41 out of 2062 were not included). Table 1 shows the classes involved in the creation of this dataset, as well as the sample sizes for each year. The University of Virginia CS Department features two different CS1 classes based on intended degree; additionally, the CS2 class is considered introductory.

Because of the anonymous nature of the surveys, it was impossible to link a particular survey respondent to a set of CS course grades.

## Results

We address two primary research questions by analyzing the dataset described in the Methods section. These questions correspond to two broad explanations for why female students report under-performing in introductory CS courses. First, we evaluate whether female student actually perform worse than their male peers in these courses; we find no evidence to support the claim that females perform worse than males in this regard. Then, we investigate if females only perceive that they are under-performing, and discuss possible factors that contribute to this perception.

**RQ1: Do females under-perform their male peers in introductory CS classes?**

We use final grade data to address this question. These data are converted into a numerical GPA scale, and are partitioned by gender (male, female, and unknown). The descriptive statistics for these data are located in Table 2. Additionally, Figure 1 shows a boxplot of the grade data, split by gender group. To investigate the differences in final grade based on gender, we performed an ANOVA with  $\alpha = .05$ . The ANOVA did not yield a significant effect of gender on final grade,  $F(2, 2018) = 2.396$ ,  $p = .0914$ ,  $\omega^2 = .0014$ . The 95% confidence interval for male-female is  $[-.0061, .1943]$ . This indicates that grades do not differ by gender group. However, since we were most interested in the differences between males and females, we also conducted a two-sided independent samples t-test using grade data from only those groups (i.e. the unknown group was dropped for this test). This t-test, performed at  $\alpha = .05$ , did not reveal any significant difference between males' and females' final grades,  $t(1615) = 1.8435$ ,  $p = .0656$ ,  $d = .0999$ . This confirms our findings from the ANOVA: grade data does not differ significantly by gender.

**RQ2: Do females perceive themselves as under-performing?**

Since there is no significant difference between the actual performance of males and females in introductory CS courses, the remaining broad explanation for females reporting under-performance is that they only perceive the discrepancy. We investigate this hypothesis by analyzing the survey data. In particular, we focus on two questions: (1) "I am doing well in the CS/CPE program based on my own expectations" and (2) "I am doing well in the CS/CPE program based on the expectations of others". Students answered these questions on a 5-point Likert scale ranging from "Strongly Disagree" to "Strongly Agree". The response frequencies, partitioned by gender, are in Table 3 and Table 4, respectively.

A chi-square test of independence was performed for each of these questions to investigate the relationship between gender and survey responses. The test for "I am doing well ... based on my own expectations" did not reveal a significant effect on

responses by gender at  $\alpha = .05$ ,  $\chi^2(4) = 7.509$ ,  $p = .1113$ ,  $V = .1554$ . However, a chi-square test for "I am doing well . . . based on the expectations of others" was significant at  $\alpha = .05$ ,  $\chi^2(4) = 12.0696$ ,  $p = .0168$ ,  $V = .1964$ . This means that gender significantly affects response to this question. Computing the standardized residuals reveals that both the "Strongly Agree" and "Strongly Disagree" options were significant.

## Discussion

Female students report that they under-perform in introductory CS courses compared to their male peers. In this paper, we propose and evaluate two possible explanations. First, we investigate whether female student actually perform worse than male students by analyzing final grade data. We perform an ANOVA to test for differences in grade data based on all three gender groups (male, female, and unknown). The ANOVA did not provide statistically significant results. We also conducted a two-sided independent samples t-test based only on the grade data of the two groups of interest (males and females). This, too, failed to provide significant evidence that gender affects final grade in introductory courses. The p-value for this test was surprisingly low; the results could be considered marginally significant. However, the effect size for this test was also very small, signifying that, even if the difference between males and females was statistically significant, it was only about 10% of a standard deviation.

Since females do not under-perform males in a significant manner, we investigate the possibility that female students only perceive that they perform poorly in these courses. We use two survey questions to address this hypothesis. The first question asks for a Likert-style response to the following claim: "I am doing well in the CS/CPE program based on my own expectations". We perform a chi square test of independence to determine if gender affects response; the test did not reveal a significant difference. However, we also perform a chi square test of independence on responses to "I am doing well in the CS/CPE program based on the expectations of others". This test showed that gender affects response to this question in a statistically significant way. The analysis of these survey results provides insight into the source of the perception of

under-performance in female students. One possibility is that female students have higher expectations of themselves, and thus are more prone to perceiving poor performance. However, the first chi square test reveals that this is not the case: females and males have no significant difference in their own expectations. Another possibility is that female students perceive that others have higher expectations of them than male students do. The second chi square test supports this claim with statistical significance. This indicates that female students perceive that others expect more of them, and thus the females are more likely to report under-performing.

## References

- Austing, R., Baldwin, L. J., McKay, L., & Shaw, M. (1979, January). Curriculum 78 (panel discussion): Consequences for the student profile. *SIGCSE Bull.*, 11, 87–88. Retrieved from <http://doi.acm.org/10.1145/953030.809560> (Moderator-Dale, Nell) doi: <http://doi.acm.org/10.1145/953030.809560>
- Camp, T. (1997, October). The incredible shrinking pipeline. *Commun. ACM*, 40, 103–110. Retrieved from <http://doi.acm.org/10.1145/262793.262813> doi: <http://doi.acm.org/10.1145/262793.262813>
- Cphoon, J. M. (2001). Toward improving female retention in the computer science major. *Commun. ACM*, 44, 108–114. Retrieved from <http://doi.acm.org/10.1145/374308.374367> doi: <http://doi.acm.org/10.1145/374308.374367>
- Frenkel, K. A. (1990, November). Women and computing. *Commun. ACM*, 33, 34–46. Retrieved from <http://doi.acm.org/10.1145/92755.92756> doi: <http://doi.acm.org/10.1145/92755.92756>
- Klawe, M. (2011, October). Increasing the participation of females in computing careers. *J. Comput. Sci. Coll.*, 27, 98–100. Retrieved from <http://dl.acm.org/citation.cfm?id=2037151.2037173>
- Montanelli, R. G., Jr., & Mamrak, S. A. (1976, October). The status of women and minorities in academic computer science. *Commun. ACM*, 19, 578–581. Retrieved from <http://doi.acm.org/10.1145/360349.360361> doi: <http://doi.acm.org/10.1145/360349.360361>
- Spertus, E. (1991, aug). Why are there so few female computer scientists? In *Mit ai lab tech report 1315* (pp. 1–112).
- US Dept. Education. (2009). *Digest of education statistics*. <http://nces.ed.gov/programs/digest/d10>.

| Course ID | Semesters                    | Students |
|-----------|------------------------------|----------|
| CS1 (BS)  | F'08, S'09, F'09, F'10, S'10 | 1320     |
| CS1 (BA)  | S'09, F'10, S'10             | 172      |
| CS2       | F'08, F'09, S'09, S'10       | 570      |

Table 1

*Courses studied in final grade data. F/S indicates Fall or Spring semester.*



|      | male | female | unknown |
|------|------|--------|---------|
| N    | 1100 | 517    | 404     |
| Mean | 3.25 | 3.15   | 3.16    |
| sd   | 0.93 | 0.97   | 0.99    |

Table 2

*Descriptive statistics for final grade data.*

|         | Strongly Agree | Agree | Neutral | Disagree | Strongly Disagree |
|---------|----------------|-------|---------|----------|-------------------|
| males   | 29             | 68    | 39      | 36       | 11                |
| females | 9              | 51    | 33      | 22       | 13                |

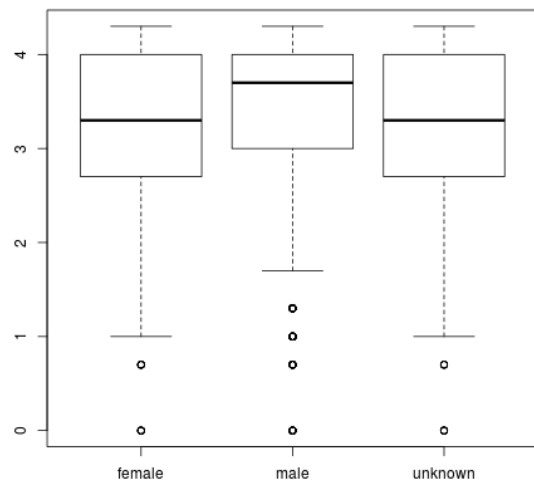
Table 3

*Frequencies of responses to "I am doing well in the CS/CPE program based on my own expectations".*

|         | Strongly Agree | Agree | Neutral | Disagree | Strongly Disagree |
|---------|----------------|-------|---------|----------|-------------------|
| males   | 34             | 64    | 55      | 25       | 6                 |
| females | 10             | 41    | 50      | 17       | 11                |

Table 4

*Frequencies of responses to "I am doing well in the CS/CPE program based on the expectations of others".*



*Figure 1.* A boxplot of grade data, split by gender group.