Financing College Through Student Loans: An Incentive for Academic Performance?

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Corresponding Author: Peter Resch Department of Finance, University of Central Florida, Orlando, United States Email: peter.resch@ucf.edu **Abstract:** Student debt in the United States has reached unprecedented levels. Whereas student loans have paved the way to a college degree for millions of young Americans, it is not clear if student debt acts an incentive for academic performance or not. Using the results from a survey conducted with 877 undergraduate business students in a large public university in the United States, we evaluate the association between student debt and academic performance, measured by cumulative GPA. Students with debt have a significantly higher probability of obtaining a GPA below 3.0 than those without debt. For students with a debt balance below \$10,000, the probability of achieving a GPA above 3.5 is 7.8 percentage points lower than for students without debt. This difference increases to 13.7 percentage points when the debt balance is between \$10,001-20,000. Our findings indicate that the burden of student debt is exacerbated by poorer academic performance.

Keywords: Academic Performance, GPA, Student Debt, College Students, Probit Regression

Introduction

College students in the United States are increasingly pursuing education under financial constraints. While student loans from private and public sources have made college education a reality for millions of American students, the potentially negative consequences of student debt have gained increased attention. In the United States, GPA is used as an outcome proxy for subject matter mastery (Waldman and Korbar, 2004), while reflecting aspects of general cognitive ability and motivation (Bartels et al., 2000). The cumulative GPA is calculated by dividing a student's total grade points by the total number of credit hours. Thus, academic performance is a quantitative assessment of the efficacy of educational experiences. GPA is one of the best predictors of college persistence and degree completion (Cabrera et al., 2005; Pascarella and Terenzini, 2005) and is positively correlated with the starting salaries of college graduates (Sandvig et al., 2005; Waldman and Korbar, 2004). In addition, GPA accumulated upon college graduation is an important evaluation criterion for employers and graduate school admissions (Allen et al., 2008; Carini et al., 2006; Pascarella and Terenzini, 2005). In the context of debt, higher GPA levels are negatively correlated with debt default (Christman, 2000; Podgursky *et al.*, 2002). Overall, GPA has risen over the past two decades due to "grade inflation" caused by varied factors, including easier accessibility of professor reviews, parents' expectations of student grades, and grad school competition (Lindsay, 2022). However, this grade inflation coincides with rising student debts.

Despite unprecedented levels of student loan balance, research on the relationship between student debt and academic performance is sparse (Stoddard *et al.*, 2018).

Our study complements emerging literature by answering whether student loans represent a burden or a liberating force for achieving academic success (Barr *et al.*, 2021; Velez, 2013; Ma *et al.*, 2019; Robb, 2017). This study explores the presence and magnitude of the relationship between student debt and the academic performance of 877 undergraduate business students enrolled in a public university in the Southeastern United States. Our results indicate that higher levels of student debt are significantly associated with lower academic performance. The negative relationship between GPA and student debt found in this study is robust to a wide set of control variables.

Background

According to The Federal Reserve (2021), by the end of 2020, student debt in the United States had reached an



all-time high of \$1.7 trillion. The total outstanding higher education debt is growing rapidly and is expected to increase in the future (Harris, 2019; Perry, 2019). According to the Institute for College Access & Success, 56% of seniors graduating from public and non-profit colleges in 2019 had student loan debt, ranging from an average of \$28,500 to more than \$292,000 for bachelor's degrees and dental school programs, respectively (Schak *et al.*, 2020). According to data from the United States Department of Education (n.d.), nearly one in every five borrowers defaulted before the COVID-19 pandemic. As the student debt crisis intensifies, public discourse in the United States is becoming more urgent.

Higher college enrollment rates and rising tuition costs, combined with slow loan repayment rates, are key drivers of increasing student debt (Kaur, 2020). This trend is magnified by employers who increasingly require college degrees for jobs that previously had no such requirement. This phenomenon, referred to as "degree inflation," would cause more people to return to college later in life (Fuller and Raman, 2017). From an economic perspective, student loans can improve the efficiency of the economy by raising the supply of college-educated workers in the labor market (Avery and Turner, 2012). Historically, borrowing money to fund a college degree has been perceived as a good investment, with long-term rates of return, generally exceeding the cost of borrowing (Walker and Zhu, 2011). The monetary investment value for obtaining a college degree is conditioned by several factors, including the type of degree obtained and the educational attainment level.

Numerous demographic, socio-economic, and behavioral characteristics associated with academic performance have been identified. This includes gender, age, working status, and socio-economic status of college students. For example, female students have been found to obtain higher grades than their male counterparts (Chee et al., 2005; Conger and Long, 2010; Ebenuwa-Okoh, 2010; Sax and Harper, 2007; Sheard, 2009), while older students often perform worse academically than their younger peers (Spitzer, 2000). Moreover, students from weaker socioeconomic backgrounds (Sirin, 2005) or those working to support their education (Hawkins et al., 2005; Pascarella et al., 1998; Pike et al., 2008; Rochford et al., 2009) have been found to perform worse academically. Research by Xu and Zia (2012); Lusardi et al. (2010) suggest that students with higher levels of financial literacy perform better in college. Previous studies (Chemers et al., 2001; Richardson et al., 2012; Segerstrom and Nes, 2006; Tetzner and Becker, 2018) suggest that students with higher levels of optimism tend to do better in college, similar to those with high

levels of conscientiousness (Chamorro-Premuzic and Furnham, 2008).

Research exploring the potential consequences of student debt has established that student debt may lead to higher levels of anxiety and stress, which may negatively impact academic performance (Baker and Montalto, 2019; Heckman et al., 2014; Nora et al., 2006; Northern et al., 2010; Mani et al., 2013). Thus, student debt may act as a distraction from studies (Northern et al., 2010) or impose an emotional burden, resulting in lower academic performance. Furthermore, studies by Boatman and Long (2016); Cabrera et al. (2005); Nora et al. (2006) suggest that student debt is associated with negative outcomes, such as lower goal commitment, engagement and persistence and even dropping out of college. However, students' ability to accumulate debt to finance higher education could act as a liberating force as student loans help overcome financial barriers. For example, higher levels of student loans may have a positive impact on academic outcomes by allowing students to dedicate more time and effort to their studies (Stinebrickner and Stinebrickner, 2003).

Studies regarding the relationship between debt and academic performance have produced mixed results. While in several studies, student debt is found to be negatively correlated with academic performance (Robb, 2017; Stoddard et al., 2018; Ross et al., 2006), supporting the hypothesis that debt is a liability; others support the notion that student loans represented a liberating force to enable students to perform better (Velez, 2013; Marx and Turner, 2019; Wiederspan, 2016). However, a recent study by Denning and Jones (2021), investigating the effect of federal student loan amounts available to US college students, finds no evidence that eligibility for additional loans affected student GPA, persistence, or graduation. Thus, the answer to whether student loans and the accumulation of student debt act as an incentive for academic performance or as a deterrent remains elusive.

Materials and Methods

The research was conducted in a large public university in the Southeastern United States. Two large upper-division business courses offered during the Spring and Summer 2019 semesters were selected on a convenience basis to generate a representative sample of undergraduate university students. Of the 1202 students enrolled in these courses, 877 participated in an online survey. Participation was voluntary; however, the students were offered extra credit points. The survey data were subsequently analyzed using Stata.

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Student				GPA		
debt (\$1,000s)	<2	2.0-2.5	2.5-3.0	3.1-3.5	>3.5	Total
0	6	20	136	198	139	499
<0–10]	1	16	52	56	26	151
<10-20]	1	16	36	38	10	101
>20	1	7	30	34	14	86
Total	9	59	254	326	189	837

In addition to demographic information, class status, selected majors, and work status, students were asked to indicate their debt level independent of the source. Academic performance was measured using self-reported cumulative GPA. Study participants answered four commonly asked questions designed to determine levels of financial literacy. In addition, we included questions designed to obtain a better understanding of students' confidence in their money management skills and expectations related to future salaries. In these questions, the participants were asked to evaluate their money management skills, compare these skills to their peers, and indicate their expected salaries upon graduation. Although these variables were not directly based on prior research in the context of academic performance, they allowed for a better characterization of the students. Finally, they were asked to answer questions related to their investment activities and parental guidance on financial matters, which served as proxies for their socioeconomic status. Each question provided "prefer not to answer" or "do not know" answer choices. These choices were excluded from subsequent analyses.

In Table 1, we present the frequency of students with different debt levels conditional on the cumulative GPA level. In the sample, 40.4% of the students had accumulated debts to pay for college education. Of these, approximately 55% owed more than \$10,000 in debt. The most common interval for self-reported cumulative GPA was 3.1-3.5. Table 2 presents the distribution of all variables according to different levels of self-reported GPA ranges.

The sample consists of 54% male and 46% female students. A total of 86% of the respondents were 25 years or younger. Most students were juniors (67%) and approximately 41% were working full- or part-time at the time of the survey. Seven undergraduate business majors were included in the sample. Across majors, there was cross-sectional variation related to minimum GPA requirements and average starting salaries. Of all the respondents, 61% indicated not having any investment, whereas more than 75% indicated that they received financial guidance from their parents.

Table 3 reports the frequencies of answers related to confidence in money management skills, financial literacy, and salary expectations. The students expressed high levels of confidence in their money management skills on a scale of 0 (very low) to 10 (perfect). Moreover, students assessed their money management skills compared to their peers on a scale of 1 (much lower) to 5 (much higher); whereby, most students viewed their skills as superior to their peers. Approximately 69% of the respondents viewed their skills as higher or much higher. Conversely, only 8.5% evaluated their skills as being lower or much lower. To measure financial literacy levels, students answered four questions aimed at measuring their understanding of interest rates, compounding, and the time value of money (Lusardi and Mitchell, 2007; 2011). Only 181 students (around 21%) answered three or all the questions correctly. To construct a financial literacy measure, we first calculated the score for each student based on the number of questions answered correctly. Each correct answer added one point to the financial literacy score, with a maximum of four points achievable. The average score was 1.7. We classified the students with a score below the average as having "below average financial literacy" and those with a score above the average as having "above average financial literacy.

To establish a measure of expectations regarding future salaries, students were asked to indicate their expected salaries upon graduation. A range of possible starting salaries was provided. For the subsequent analysis, the value 1 ("Low" in Table 3) was assigned to a student expecting a starting salary in an interval below the actual average starting salary of the university's graduates in the same major. Similarly, we assigned the values 2 ("Medium") and 3 ("High") if the expected starting salary fell within or exceeded the historical interval, respectively. Actual starting salaries for different academic majors reflect the real average salaries of university graduates, as provided by the office of professional development. Table 2 reports the salaries for each major and the major itself. Almost half of the students had overly optimistic salary expectations, which is a common characteristic of college students (Dunaway-Seale, 2022).

Table 2: Descriptive statistics for student characteristics.	The average starting salary (in thousands of dollars) for each major
is reported in parentheses	

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Salary expectations	227	100				-	
Low 1 14 38 56 33	142	33	56	38	14	1	
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High 2 27 125 153 82	389						

Results

Table 4 present the estimation results for four ordered probit specifications (1) to (4) with cumulative GPA as the dependent variable. Our results indicate a consistent and negative relationship between cumulative GPA and student debts. The results remain robust even when controlling for a range of demographic and other variables. Across all four model specifications, regression coefficient estimates for student debt on the GPA range from -0.171 to -0.133 and are at least significant at the 5% level.

In general, more rigorous academic majors, requiring higher GPA levels, are associated with higher starting salaries. In models (2) - (4), a business major (represented by the starting salary) is positively correlated with GPA. Conversely, age was negatively correlated with academic performance, with older students generally achieving lower GPAs than their younger peers. Models (3) - (4) show that self-assessed money-management skills and high financial literacy are positively related to academic performance. The remaining variables in Model (2) are not significant in this context.

While the sign of the coefficient estimates in Table 4 predicts the direction in which the different variables affect the probability of observing higher GPAs, the size of the estimates is more complex to interpret.

Figure 1 reports the predicted average marginal effects of Model (4) of debt on the GPA. The five plots depict

different probabilities of observing specific ranges of cumulative GPA for different student debt levels. For instance, the final plot (Panel E) shows that subject to not having student debt, the probability of a student achieving a GPA above 3.5 is about 26%. Similarly, subject to having student debt in the \$10,001-20,000 interval, the upper left plot (Panel A) shows that the probability of a student achieving a GPA below 2.0 is approximately 2%. Panels A, B, and C, which relate to the three lower GPA intervals, show higher conditional probabilities of lower GPA levels if the debt is present. We observe from the plots in Panels D and E that higher GPA levels are more prevalent when students do not have debt.

Table 5 reports the percentage point changes in the probabilities of observing different GPA levels when moving from no debt to the indicated debt interval. These changes are related to Model (4) in Table 4. For instance, the intersection of row 2 (\$10,001-20,000 vs. no student debt) and column 2 (2.0-2.5) indicates the change in the predicted probability of a GPA in the 2.0-2.5 interval when the debt increases from 0 to the \$10,001-20,000 interval. An estimate of 0.069 signifies that a student with debt in the suggested interval has a 6.9 percentage points higher probability of obtaining a GPA in the above-mentioned interval than a non-indebted student. Our empirical model consistently predicted that indebted students have higher probabilities of obtaining GPAs above 3.0.



Fig. 1: Probabilities, with 95% confidence intervals, of GPA outcomes for levels of debt

Table 4: Estimates of the ordered probit specifications for GP.	A Robust standard errors are reported in parentheses
Table 4: Estimates of the ordered brodit specifications for GF.	A. RODUST Standard errors are reported in parentileses

GPA	(1)	(2)	(3)	(4)
Student debt	-0.171***	-0.156***	-0.147***	-0.133***
	(0.036)	(0.038)	(0.042)	(0.038)
Gender		-0.004	0.094	
		(0.080)	(0.086)	
Age		-0.116**	-0.098*	-0.119**
		(0.052)	(0.057)	(0.050)
Class standing		-0.053	-0.011	
-		(0.076)	(0.081)	
Starting salary (major)		0.100***	0.102***	0.090***
		(0.020)	(0.022)	(0.020)
Work Status		0.079	0.022	
		(0.081)	(0.087)	
Investments		-0.043	-0.115	
		(0.080)	(0.089)	
Parental guidance		-0.068	-0.055	
C		(0.095)	(0.102)	
Money management		× ,	0.064**	0.071***
,,			(0.029)	(0.022)
Rel. money management			0.018	· · · · ·
, c			(0.055)	
Financial Literacy			0.281***	0.300***
5			(0.084)	(0.079)
Salary expectations			0.058	()
J I I I I I I I I I I I I I I I I I I I			(0.056)	
Cut1	-2.454	1.364	2.344	1.862
	(0.137)	(0.919)	(1.030)	(0.860)
Cut2	-1.545	2.291	3.353	2.851
	(0.071)	(0.909)	(1.022)	(0.848)
Cut3	-0.423	3.435	4.509	4.028
Cult	(0.052)	(0.912)	(1.026)	(0.853)
Cut4	0.640	4.518	5.593	5.112
Cutt	(0.054)	(0.915)	(1.030)	(0.858)
McFadden's adjusted R^2	0.01	0.01	0.02	0.03
Count adjusted R^2	-0.01	-0.02	0.02	0.03
AIC	2164.95	-0.02 2044.67	1823.46	2044.80
BIC	2188.59	2100.87	1825.40	2044.80
BIC *** = <0.01 ** = <0.05 * = <		2100.07	1070.37	2007.07

*** p<0.01, ** p<0.05, * p<0.1

 Table 5: Percentage point changes in the predicted probability of a student with a GPA in the given interval for the four intervals of student debt compared to a student without student debt. Standard errors are given in parentheses

GPA	<2.0	2.0-2.5	2.5-3.0	3.1-3.5	>3.5
Student debt					
(<=\$10,000 vs. No student debt)	0.006**	0.034**	0.062***	-0.022**	-0.078***
	(0.003)	(0.013)	(0.022)	(0.010)	(0.026)
(\$10,001-20,000 vs. No student debt)	0.016**	0.069***	0.111***	-0.061***	-0.137***
• • • • •	(0.006)	(0.020)	(0.022)	(0.019)	(0.026)
(>\$20,000 vs. No student debt)	0.005	0.023	0.053*	-0.017	-0.067*
	(0.004)	(0.016)	(0.029)	(0.013)	(0.036)
Number of observations	809	809	809	809	809

*** p<0.01, ** p<0.05, * p<0.1

The magnitudes of probability changes reported in Table 5 are large, suggesting that academic performance has a strong negative correlation with student debt.

To further isolate the effect of student debt, we treat debt as a binary variable (0 = no debt; 1 = debt). In Table 6, we report the estimation results from similarly ordered probit regressions as in Table 4. The

main findings of the analysis presented in Table 6 are consistent with the previous findings. The coefficient estimates for student debt are stable across all four model specifications. The estimates vary between -0.428 and -0.334 and are significant at the 1% level. The remaining estimates are similar to those in Table 4.

Table 6: Estimates of the ordered probit specifications for GPA. Students are classified as either not having debt (0) or as having debt
(1). Robust standard errors are reported in parentheses

GPA	(1)	(2)	(3)	(4)
Student debt	-0.428***	-0.411^{***}	-0.383***	-0.344**
	(0.074)	(0.079)	(0.085)	(0.077)
Gender		-0.006	0.099	
		(0.079)	(0.086)	
Age		-0.120**	-0.108*	-0.127**
		(0.053)	(0.058)	(0.050)
Class standing		-0.053	-0.019	
		(0.074)	(0.080)	
Starting salary (major)		0.093***	0.096***	0.087***
		(0.020)	(0.022)	(0.020)
Work status		0.096	0.037	
		(0.080)	(0.086)	
Investments		-0.054	-0.116	
		(0.081)	(0.090)	
Parental guidance		-0.081	-0.064	
C C		(0.092)	(0.100)	
Money management			0.066**	0.070***
			(0.029)	(0.022)
Rel. money management			0.012	
			(0.055)	
Financial literacy			0.274***	0.289*
5			(0.082)	(0.077)
Salary expectations			0.055	· · · · ·
			(0.055)	
Cut1	-2.532	0.953	1.902	1.600
	(0.143)	(0.913)	(1.023)	(0.855)
Cut2	-1.594	1.911	2.937	2.612
	(0.073)	(0.901)	(1.013)	(0.842)
Cut3	-0.465	3.061	3.061	3.799
	(0.055)	(0.903)	(1.016)	(0.847)
Cut4	0.603	4.147	5.182	4.887
	(0.056)	(0.906)	(1.020)	(0.851)
McFadden's adjusted R ²	0.01	0.02	0.03	0.03
Count adjusted R^2	0.00	0.02	0.04	0.05
AIC	2220.17	2099.43	1861.03	2097.27
BIC	2243.96	2155.97	1934.51	2139.78

*** p<0.01, ** p<0.05, * p<0.1

 Table 7: Percentage point changes in the predicted probability of a student with and without debt with a GPA in the given interval.

 Standard errors are given in parentheses

Standard er	roro are grien in pare	mareses			
GPA	<2.0	2.0-2.5	2.5-3.0	3.1-3.5	>3.5
Student debt vs	0.008***	0.043***	0.077***	-0.032***	-0.096**
No student debt	(0.003)	(0.011)	(0.017)	(0.009)	(0.021)

*** p<0.01, ** p<0.05, *p<0.1

Table 7 reports marginal changes in the predicted probability of a student with or without debt in specific GPA interval ranges. The changes relate to Model (4) in Table 6. The results show that the predicted probabilities of a student with a GPA in the lower three intervals increase by 0.8, 4.3, and 7.7 percentage points respectively when a student has debt. These results are significant at the 1% level. For the remaining two GPA

intervals, the corresponding probabilities decrease by 3.2 and 9.6% points, respectively.

Discussion

"Are students who take up loans to finance their education just as likely to obtain a high-Grade Point Average (GPA)-the standard measure of academic achievement-as other students?" Our results provide a negative answer to this question. We find that students with debt have a significantly lower probability of obtaining a GPA above 3.0 than students with no debt. Thus, our empirical results suggest that increasing levels of student debt are negatively associated with academic performance, independent of gender, age, and other variables under consideration. Whereas this study broadly supports insights of previous studies (Robb, 2017; Stoddard *et al.*, 2018, Ross *et al.*, 2006), it does provide an additional research context by focusing on undergraduate business students.

Conclusion

Further research is required in the context of academic outcomes and student debt. As highlighted by Stoddard et al. (2018), disentangling the causal relationship between these two variables is challenging because of the possibility of unobserved heterogeneity driving these relationships. Consequently, additional research is needed to understand the mechanisms through which debt affects academic performance. As suggested by Barr et al. (2021), various types of loans may correlate differently with academic performance; moreover, it is plausible that the effect of student loans on academic performance may not be constant over time (Stoddard et al., 2017). Simultaneously, the relationship between debt and academic performance may differ between student populations. Our study focuses on undergraduate business majors at a large state university. Whether the results obtained from this sample can be replicated in other populations (e.g., students attending private colleges, non-business majors, or students enrolled in graduate programs) requires further investigation.

In the US, recent government initiatives, such as proposed debt forgiveness programs, are designed to address the student debt crisis, at least partially. Specifically, the current debt relief program proposes forgiving up to \$20,000 in federal student loan debts based on income in 2020 or 2021. However, these programs face considerable legislative and legal hurdles and address the issue ex post. If the correlation between academic performance and student debt is significant, as suggested by the results of this study, ex ante interventions could be considered. These ante facto interventions could differ according to the institution, increasing the availability of scholarships to provide targeted academic support for students with higher debt balances.

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Author's Contributions

All authors contributed equally to this study.

Ethics

This article is original and contains no unpublished data. The study strictly adhered to the ethical principles governing research involving human participants. There was complete anonymity and confidentiality for the research participants. Only group scores were reported, with no reference to individual participants in the study.

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