

Impacts of state aid for non-traditional students

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(Does not include updated results in 2019 versions)

Oded Gurantz

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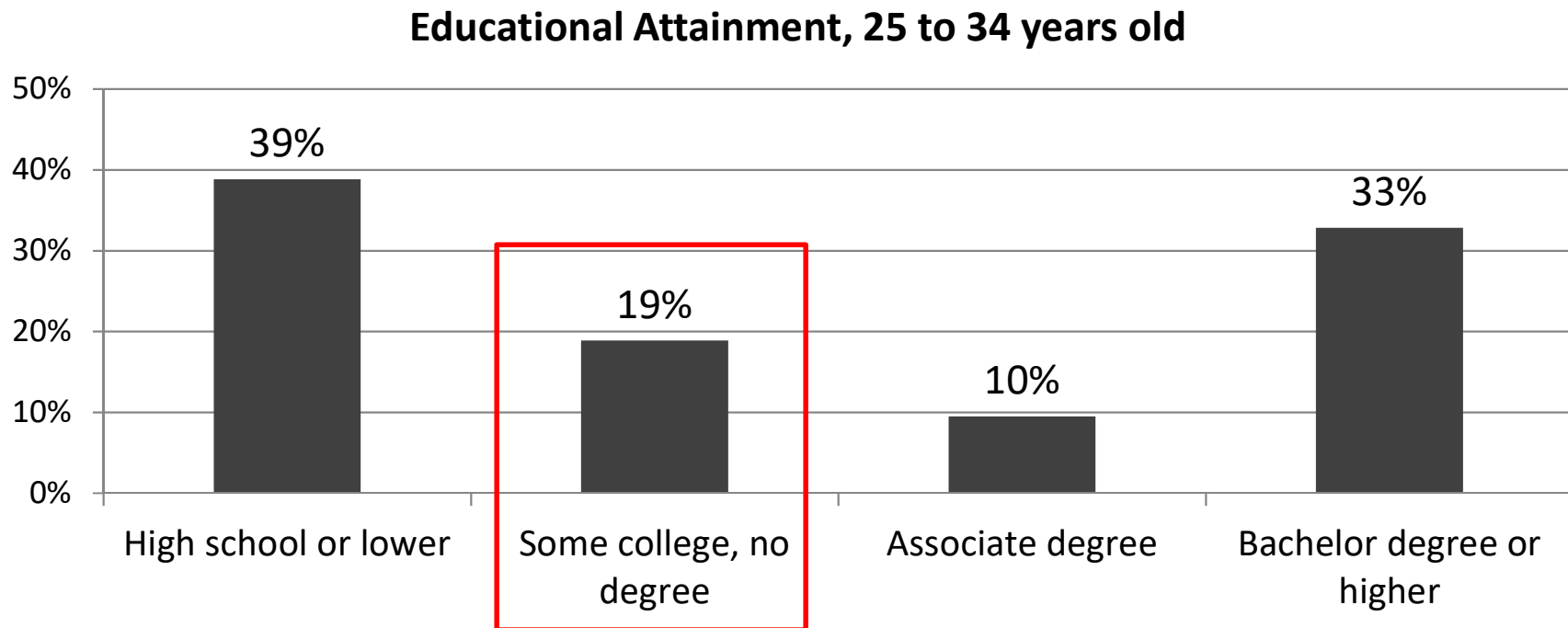
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Background

- Postsecondary attainment has increased over the last few decades...as have dropouts



Source: Current Population Survey Annual Social and Economic Supplement, 2010



Background

- Financial aid ~30% of state and federal expenditures on higher education (Pew Charitable Trust, 2015)
- Positively impacts undergraduate attendance and completion (Angrist, Autor, Hudson, & Pallais, 2014; Castleman & Long, 2016; Denning, Marx, & Turner, 2017; Dynarski, 2000, 2003, 2004, 2008; Fitzpatrick & Jones, 2016; Goldrick-Rab, Kelchen, Harris, & Benson, 2016; Scott-Clayton, 2011; Scott-Clayton & Zafar, 2016)
 - Cal Grant award led to higher graduate degree completion and wages (Bettinger, Gurantz, Kawano, Sacerdote & Stevens, 2019)



Research Question

- Does financial aid help “non-traditional” students?
 - Older, independent, working adults
- Implications for workforce development
 - Voucher program for re-training
 - Policy shifts towards continued schooling do not consistently match rhetoric



Research Question

- Impacts of aid may be weaker for non-traditional students
 - Larger monetary and non-monetary constraints
 - Better information on college benefits and “costs”
- Few studies with non-traditional students
 - “Opening Doors” in community colleges, military veterans (Barr, 2016; Denning, 2017; Mayer, et al., 2016; Richburg-Hayes et al., 2009; Patel & Valenzuela, 2013; Richburg-Hayes, Sommo, & Welbeck, 2011)



Context

- Competitive Cal Grant program
 - Submit FAFSA and GPA verification [form](#)
 - Over 900,000 unique applicants from 2002 to 2011
 - Outcomes from National Student Clearinghouse and Unemployment Insurance (UI) data
- Award includes \$1500 “subsistence” and:
 - Community college: None but covered by “BOGS”
 - Four-year public: Full [tuition](#)
 - Private: \$9,700 tuition



Table 1. Descriptive Statistics, First-time Competitive award

Application cycle	All
FAFSA type	All
Years	2002-2011
N	911,492
	Estimate
Female	58%
Dependent Student	39%
Age: dependent	21
Age: independent	31
Application GPA	2.8
Income	\$20,923
FAFSA educational background	
No college experience	9%
1st year	22%
2nd year	38%
3rd year or higher	30%
FAFSA school listings	
Number of Schools	1.3
Only one school listed	85%

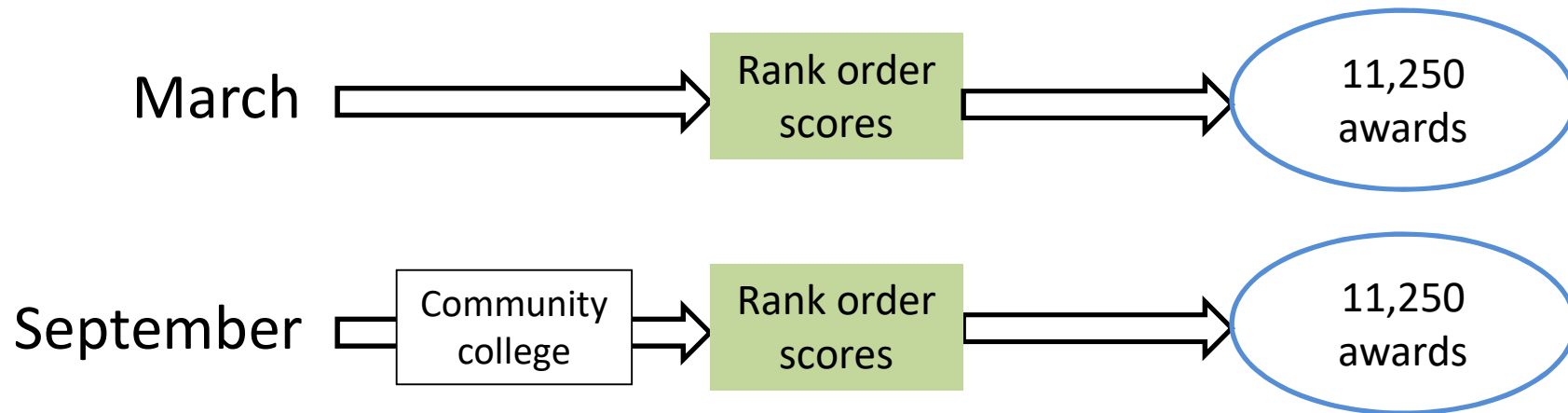
Almost all non-traditional students list only one school on FAFSA

Considering few postsecondary options



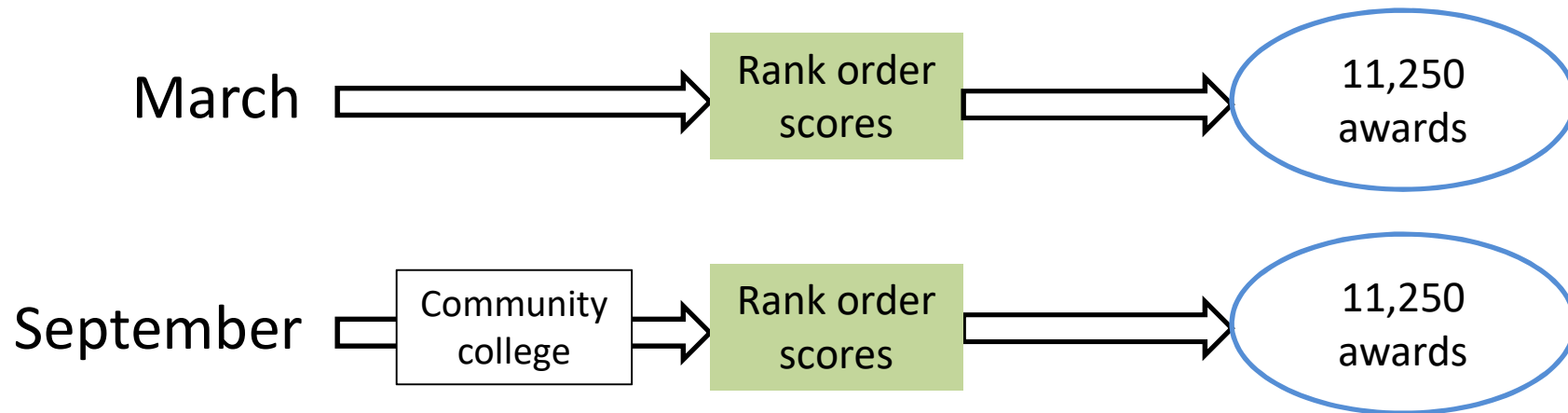
Competitive Application Cycles

- Assigned up to 200 points
 - [GPA](#) (35%) and need (65%): [Income and family size](#); [Parent education](#), Household status, "[Access Equalizer](#)"



Competitive Application Cycles

- Awards offered using a year-varying and unknown eligibility [cutoff](#)
- Example: Students with 165 points are offered an award but those with 164 points are not

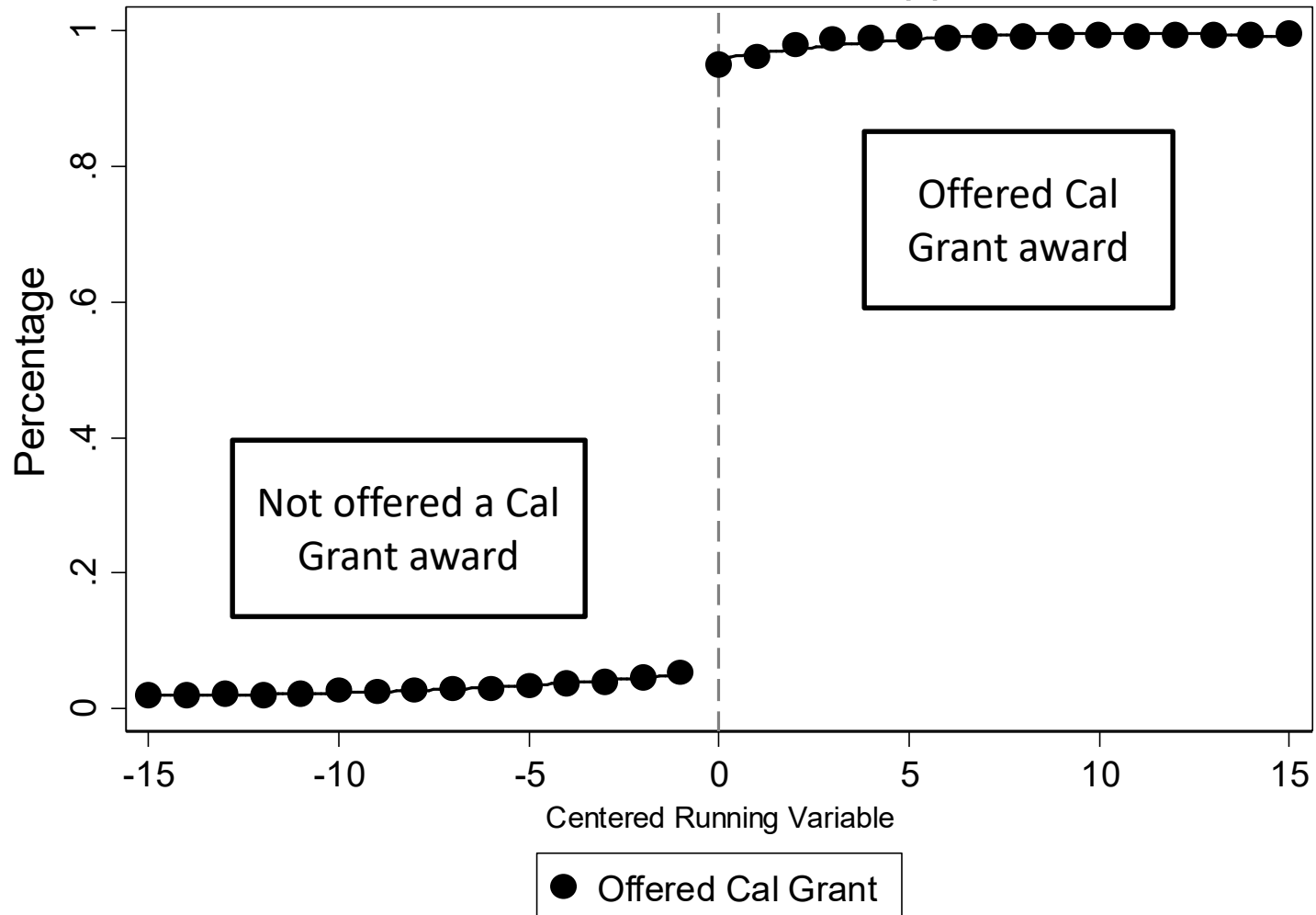


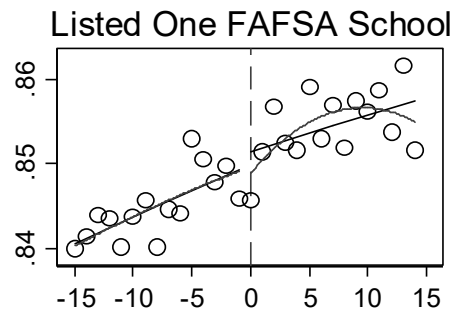
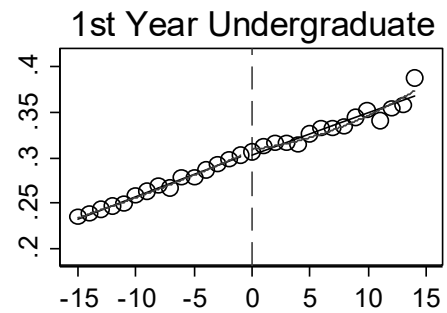
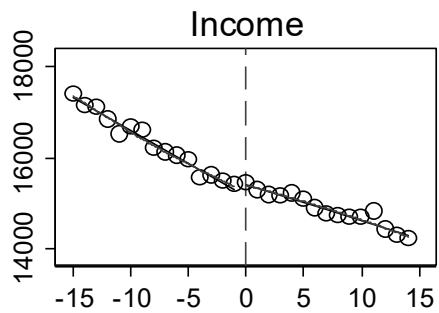
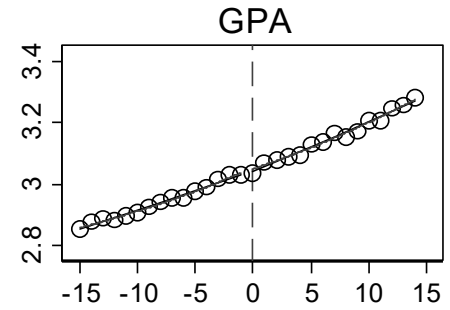
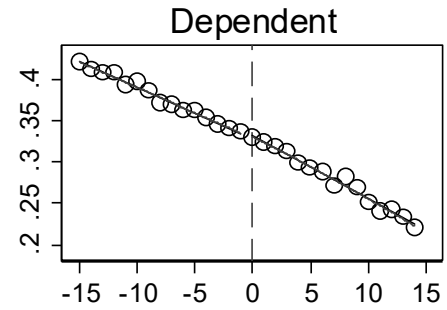
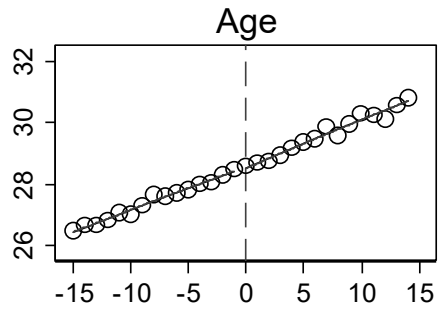
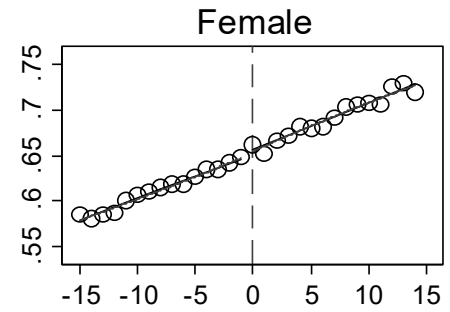
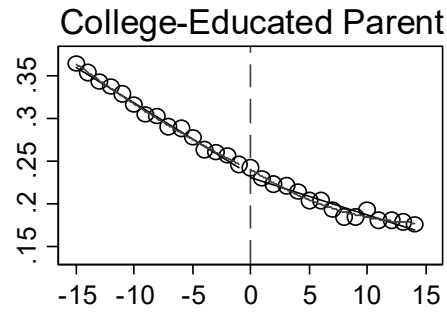
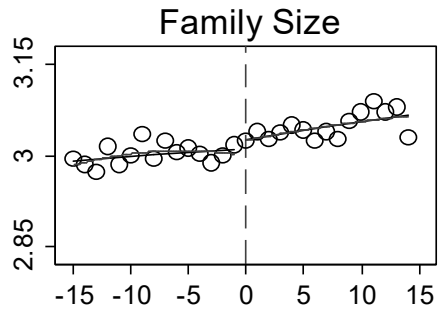
Research Design

- Regression discontinuity design
 - Can provide causal impacts when eligibility determined by a known assignment variable
- Students near the eligibility threshold essentially randomly assigned
 - Research design is valid if applicants are unable to precisely manipulate their position

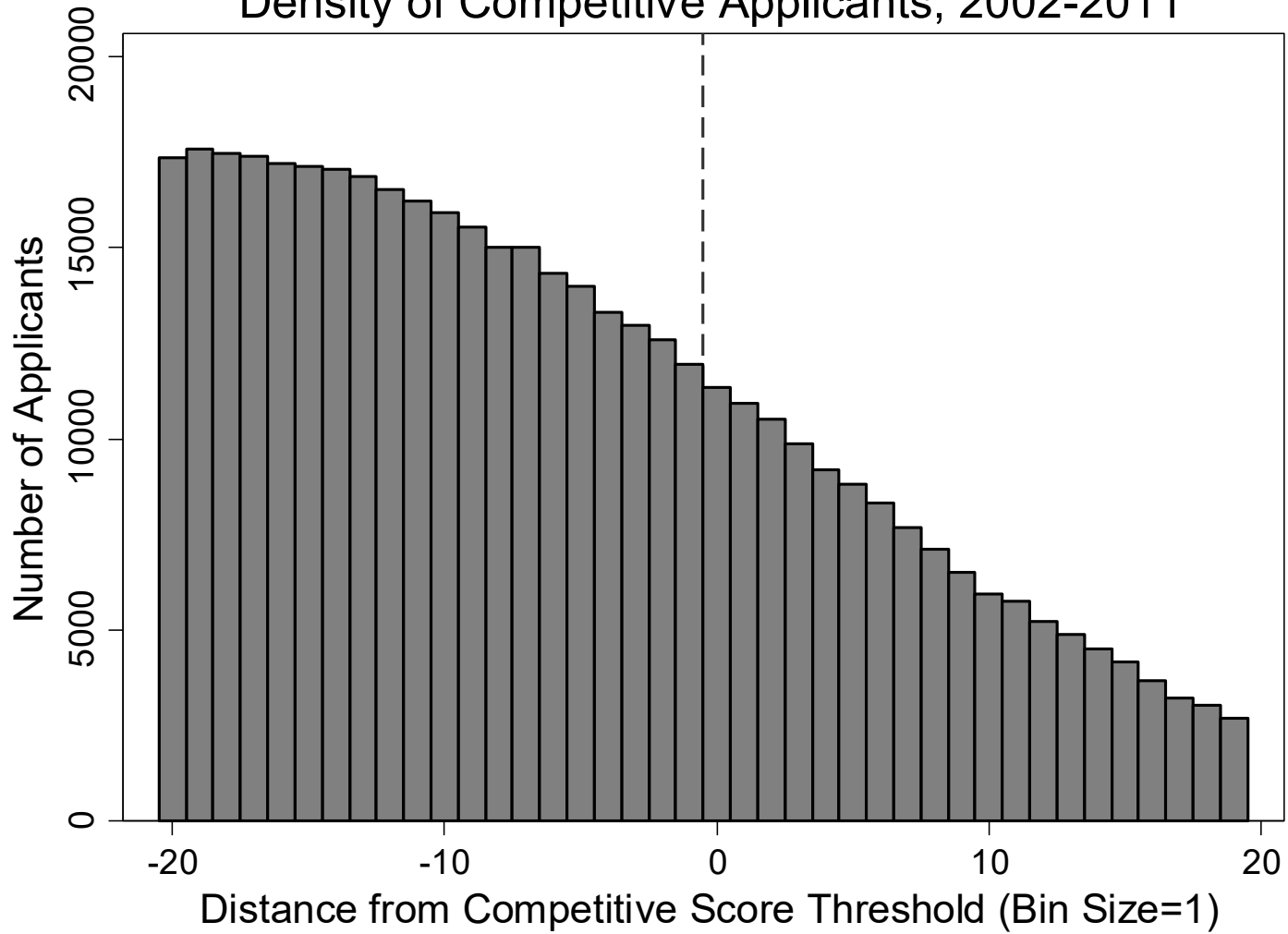


Cal Grant Offer, All Applicants

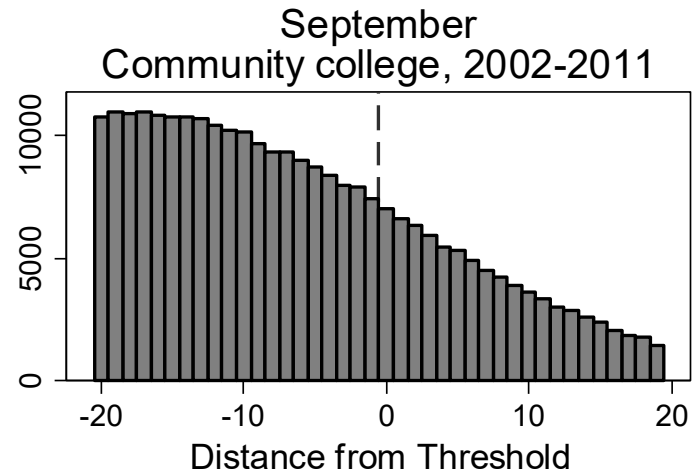
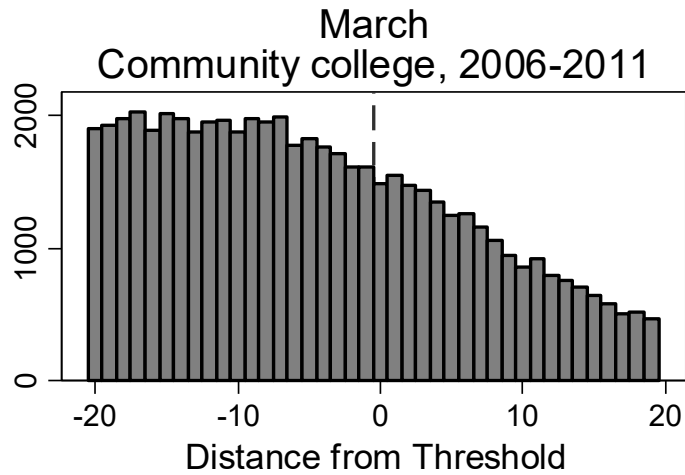
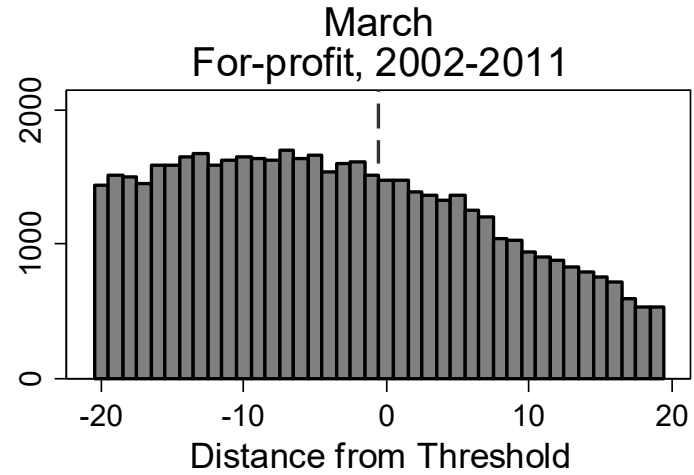
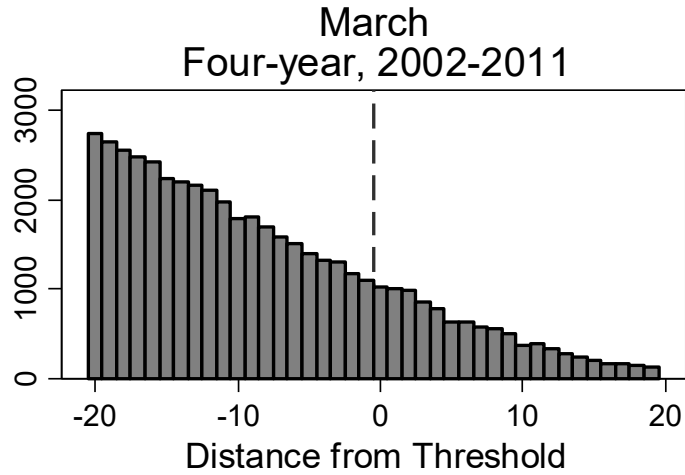




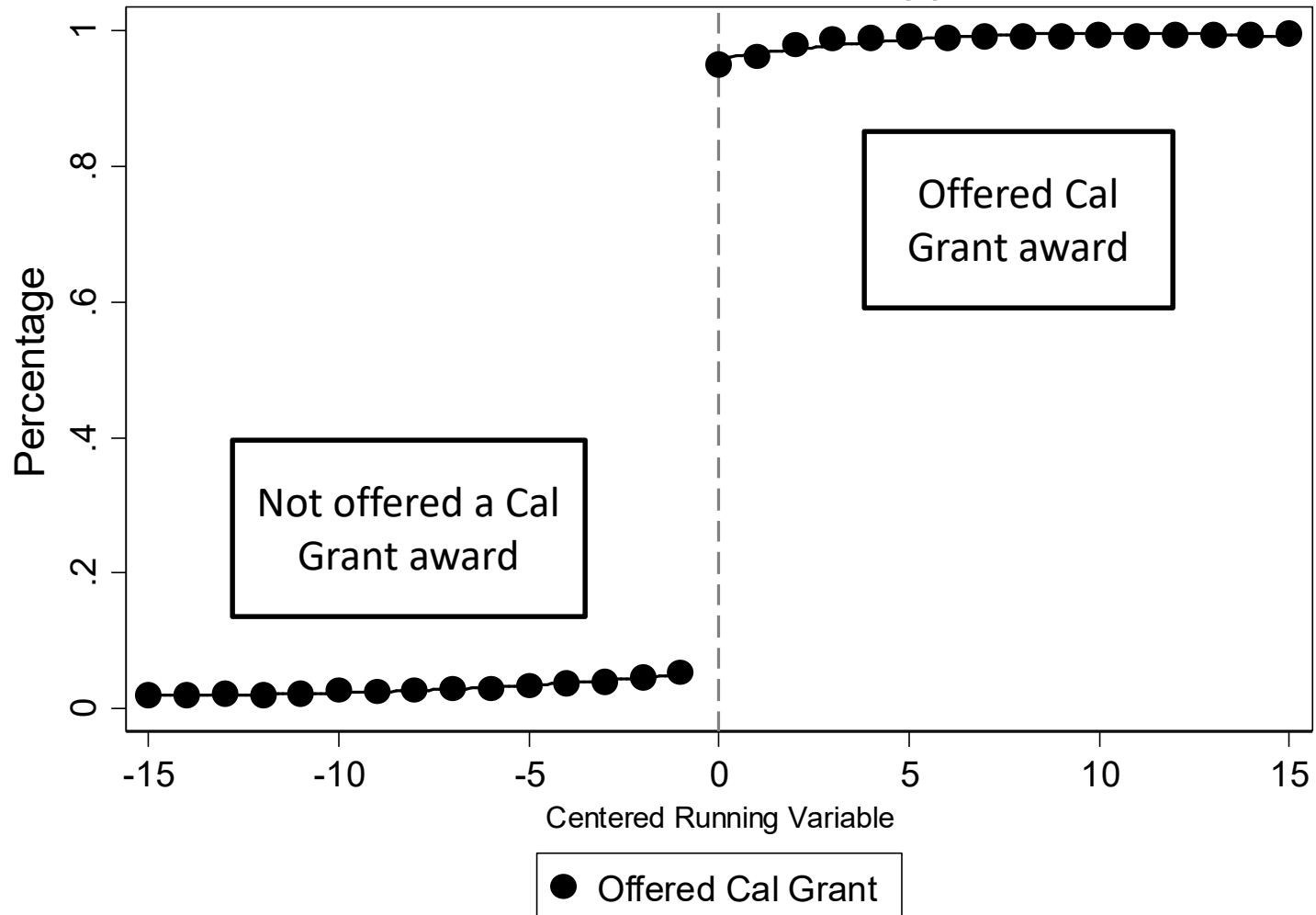
Density of Competitive Applicants, 2002-2011



Density of Competitive Applicants, by FAFSA Type



Cal Grant Offer, All Applicants



Research Design

- Estimating equation for pooled results

$$Y_{igt} = \beta_0 + \beta_1 * f(score_{ig}) + \beta_2 * CG_{igt} + \beta_3 * CG_{igt} * f(score_{ig}) + \theta_{gt} + \varepsilon_{igt}$$

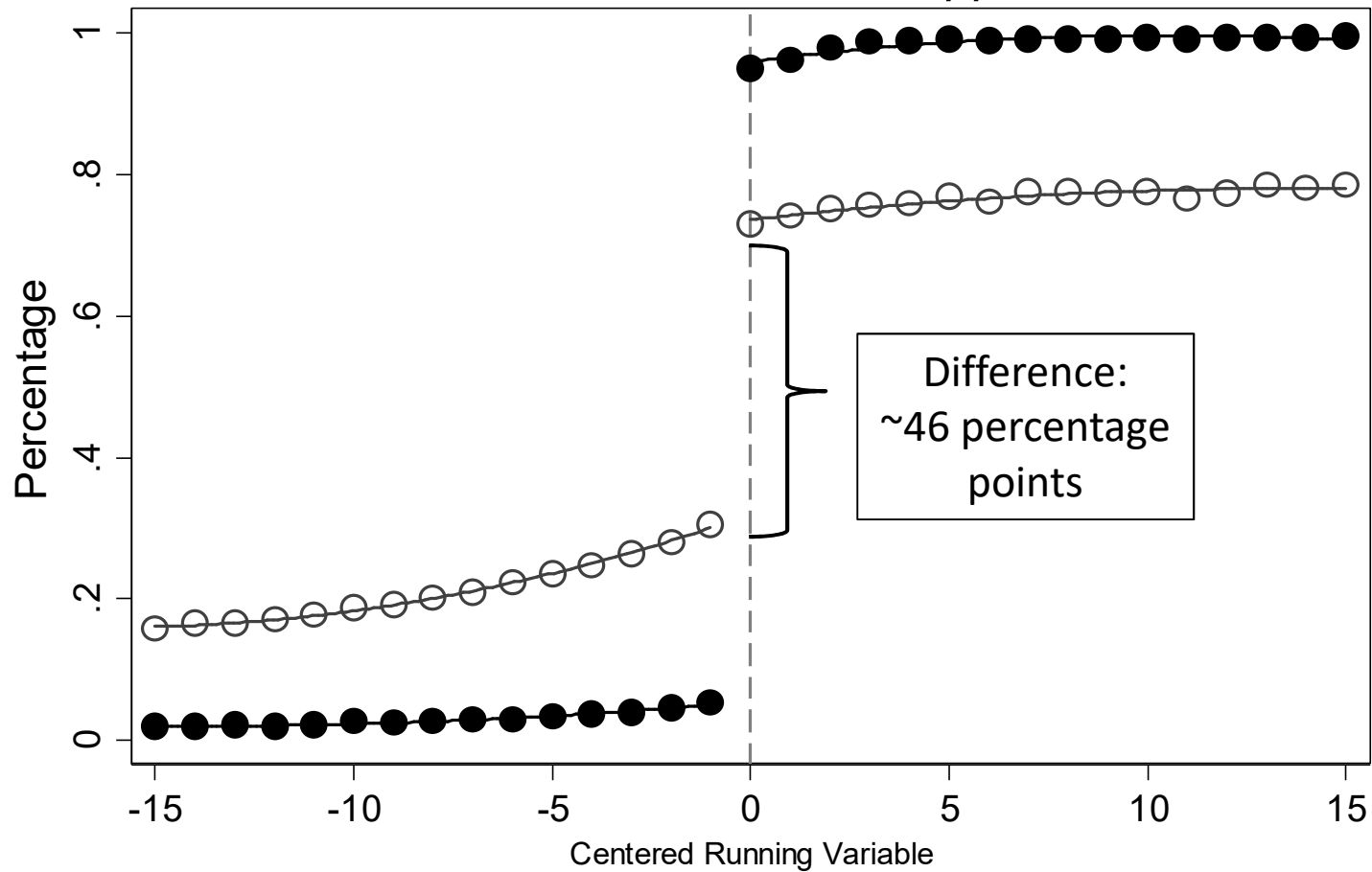
- CG_{igt} : Dummy variable for award eligibility
- θ_{gt} : Year-by-FAFSA group fixed effects
- Robust standard errors
- Optimal bandwidth: 8 points (Imbens & Kalyanaraman, 2012)
- IV analysis for award utilization



Results

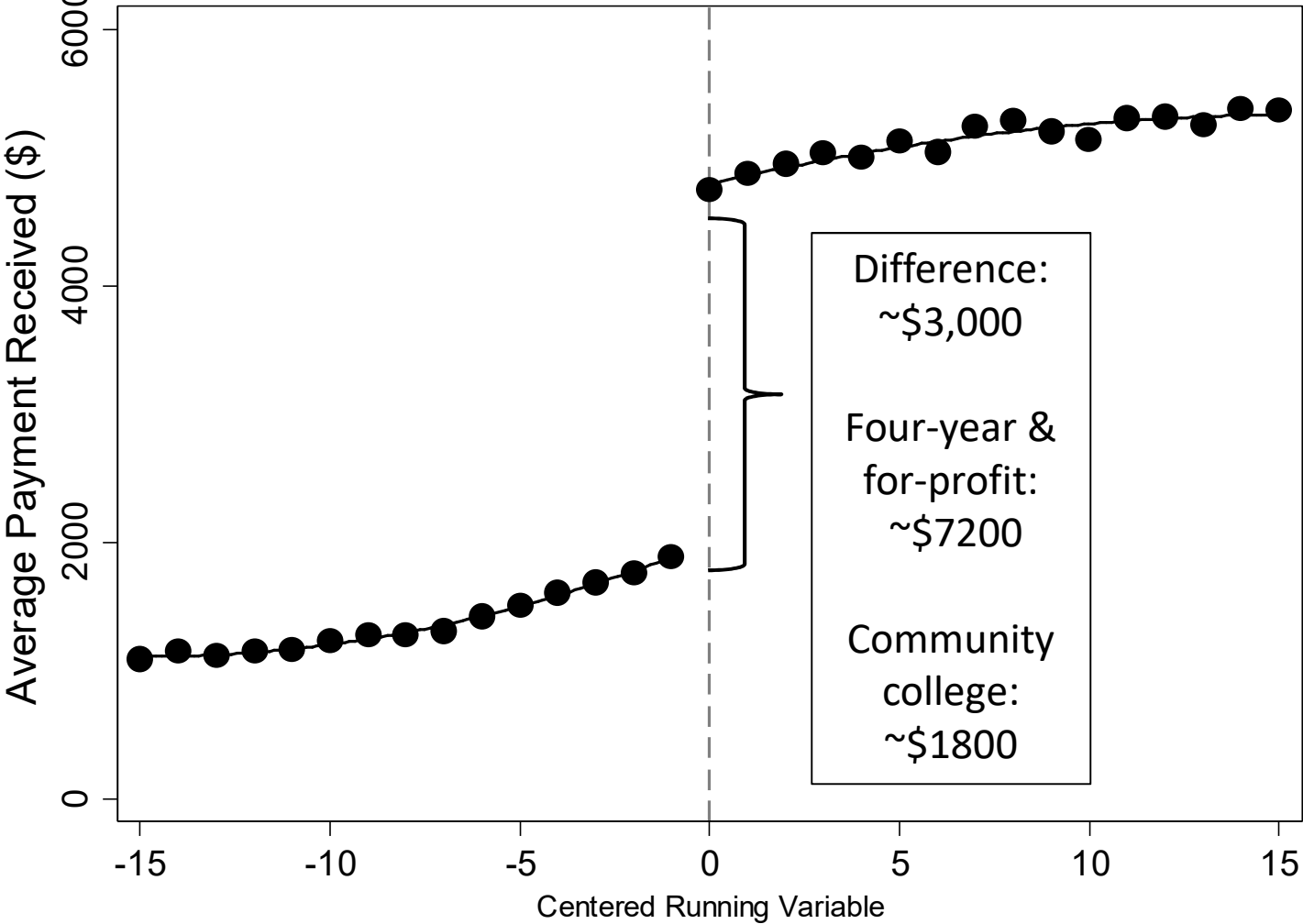
- **Impact of eligibility on total aid received?**
- Does the award impact college attainment?
- Does the award impact labor force outcomes?

Cal Grant Utilization, All Applicants



● Offered Cal Grant ○ Ever Received Payment

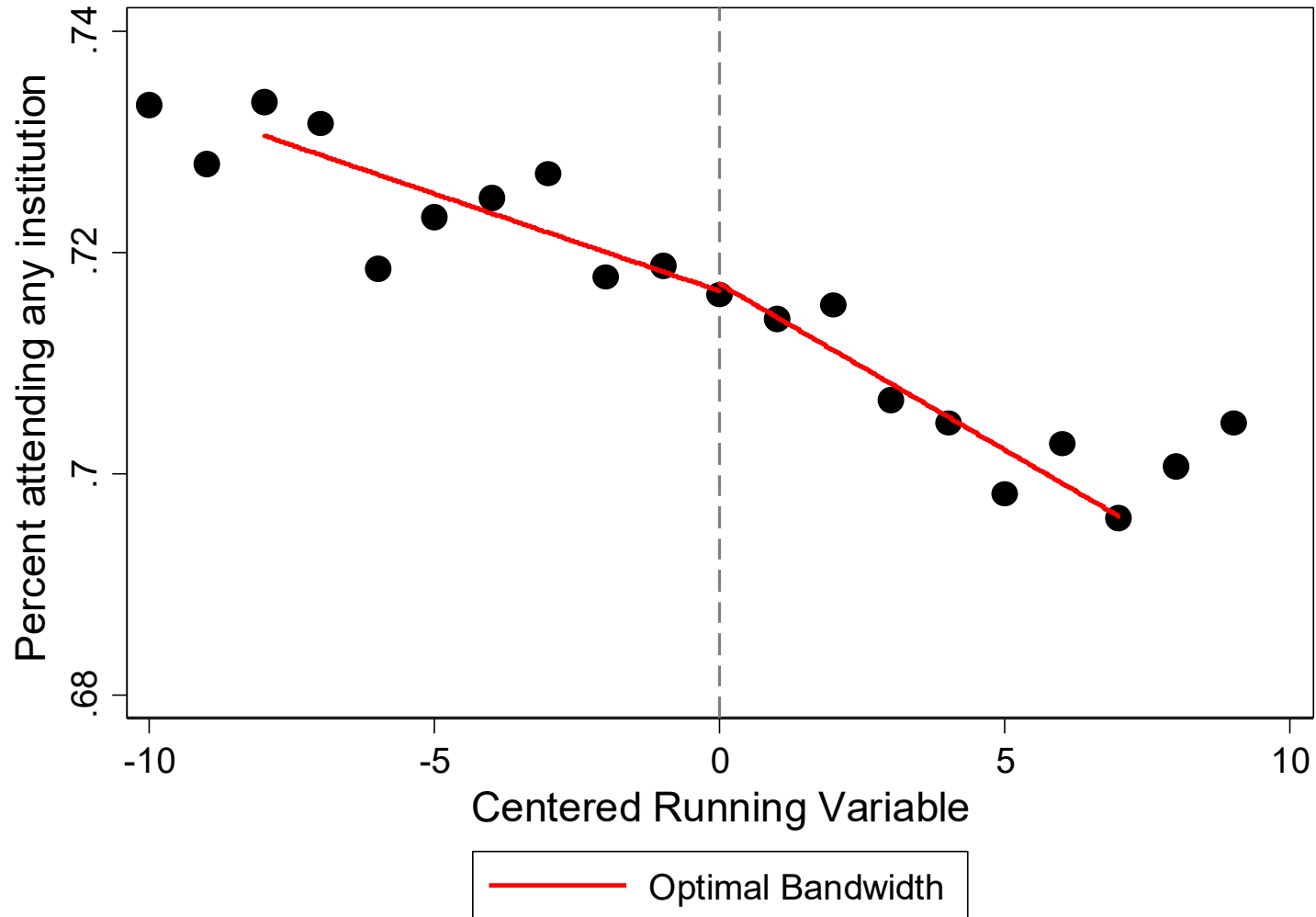
Total Payment Received, All Applicants



Results

- Impact of eligibility on total aid received?
- **Does the award impact college attainment?**
- Does the award impact labor force outcomes?

All students: Immediate Attendance



All students: Earned Degree

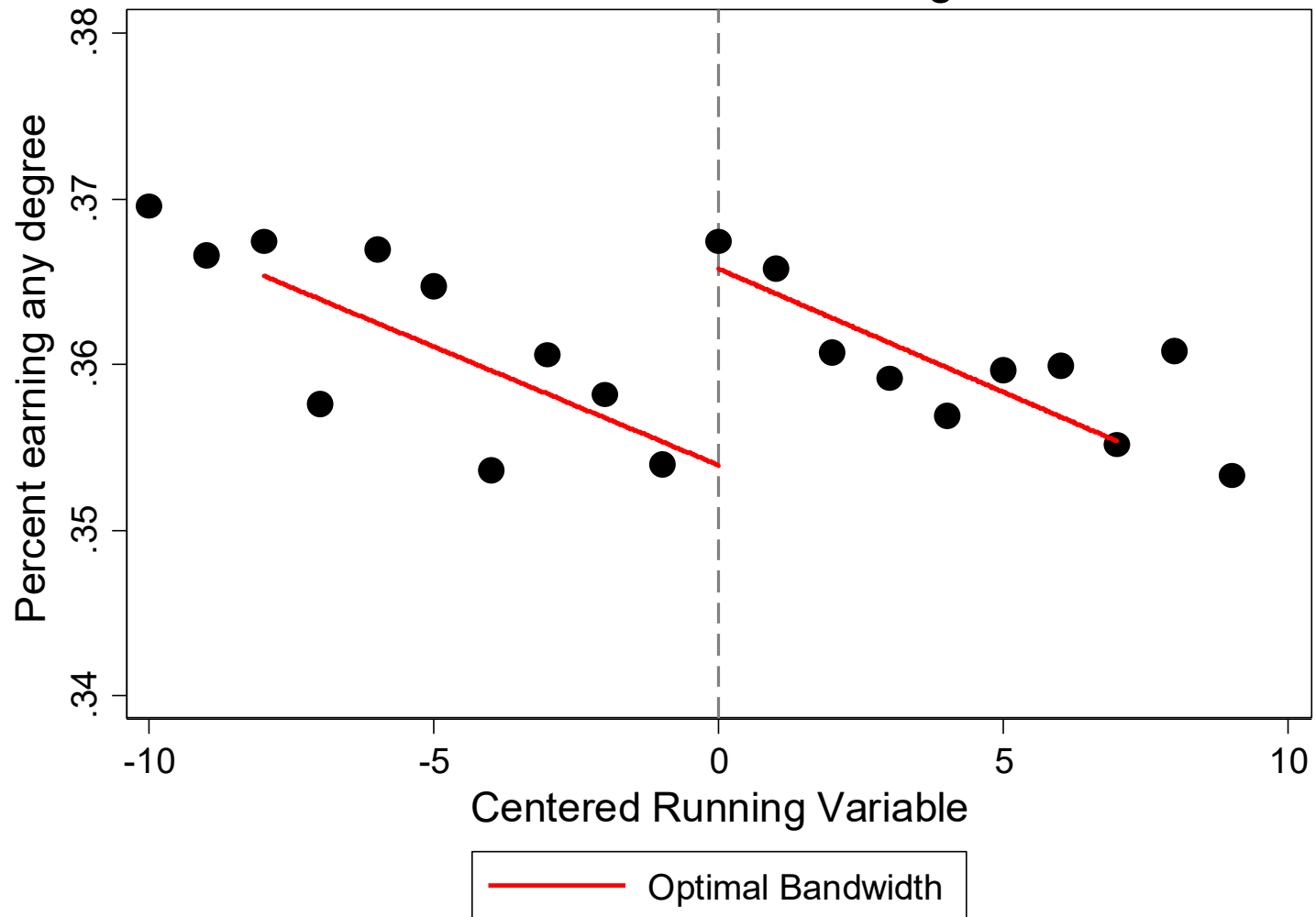


Table 3. Impacts of Competitive award on attendance and degree completion

	Regression estimate	Baseline rate	Percent Change
Immediately attend college	0.001 (0.004)	71.8%	0.1%
Associate degree	0.002 (0.004)	19.6%	1.0%
Bachelor degree	0.009** (0.003)	19.9%	4.5%

Notes. + p<0.1, * p<0.05, ** p<0.01. Sample includes 185,915 students.

[Full results](#)

Table 4. Impacts of Competitive award on bachelor's degree attainment, by FAFSA preferences

	N	Baseline value	Reduced Form	IV
Four-year	17639	63.4%	0.015 (0.015)	0.024 (0.023)
For-profit	23772	22.6%	0.039** (0.011)	0.086** (0.025)
March Community College	25182	13.4%	0.005 (0.009)	0.017 (0.027)
September Community College	114136	13.4%	0.005 (0.004)	0.010 (0.009)

Notes. + p<0.1, * p<0.05, ** p<0.01.



Table 4. Impacts of Competitive award on associate's degree attainment, by FAFSA preferences

	N	Baseline value	Reduced Form	IV
Four-year	17639	2.7%	-0.000 (0.004)	-0.001 (0.006)
For-profit	23772	14.1%	-0.005 (0.009)	-0.011 (0.020)
March Community College	25182	24.0%	0.014 (0.010)	0.043 (0.032)
September Community College	114136	22.7%	-0.000 (0.005)	-0.000 (0.010)

Notes. + p<0.1, * p<0.05, ** p<0.01.

Results: For-Profit Students

- Increases persistence into second year by 3 percentage points
- Larger impacts for students who are older, female, more college experience
- Robust to bandwidth, functional forms, kernels, covariates, non-reporting NSC schools



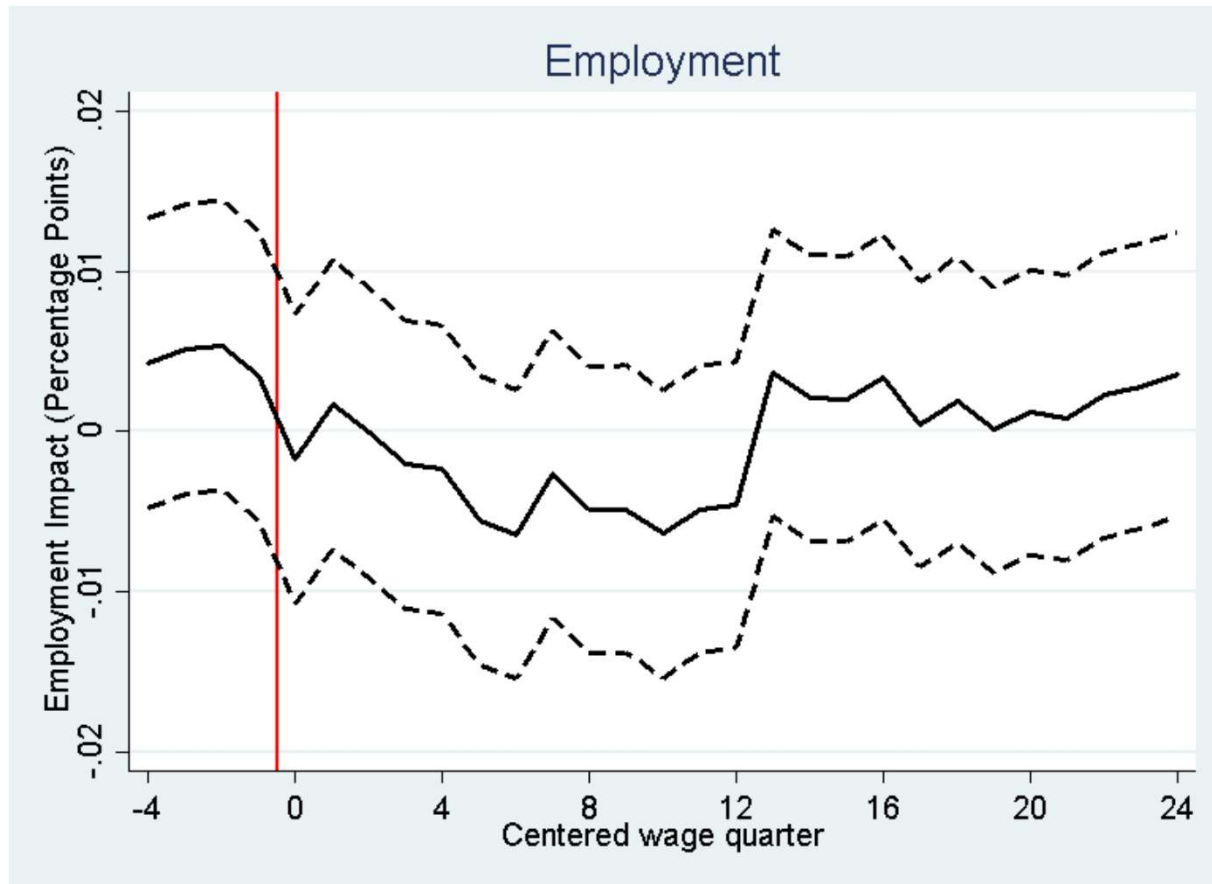
Results

- Impact of eligibility on total aid received?
- Does the award impact college attainment?
- **Does the award impact labor force outcomes?**
 - Estimate treatment effects for 25 quarters of UI data post initial application status



Results

- No shifts in short- or long-term employment



Results

- No shifts in short- or long-term wages



Results

- No large shifts in employment or wages

Table 8. Impacts on award eligibility on long-term labor force outcomes

Group	Employment	Wages
Four-year	-0.2 (0.9)	-16 (137)
<i>(Baseline rate below estimates)</i>	64.8%	\$9,094
For-profit	0.0 (0.8)	142 (107)
	66.1%	\$8,608
Community College: March	0.5 (0.8)	46 (108)
	56.6%	\$6,899
Community College: Sept.	0.1 (0.4)	36 (57)
	58.9%	\$6,584

Notes. + $p < 0.1$, * $p < 0.05$, ** $p < 0.01$. Results stack student-by-wage quarter observations for 3 to 5.5 years after initial application. Sample sizes for the four rows are 224212, 270827, 253296, and 839048 observations, respectively.

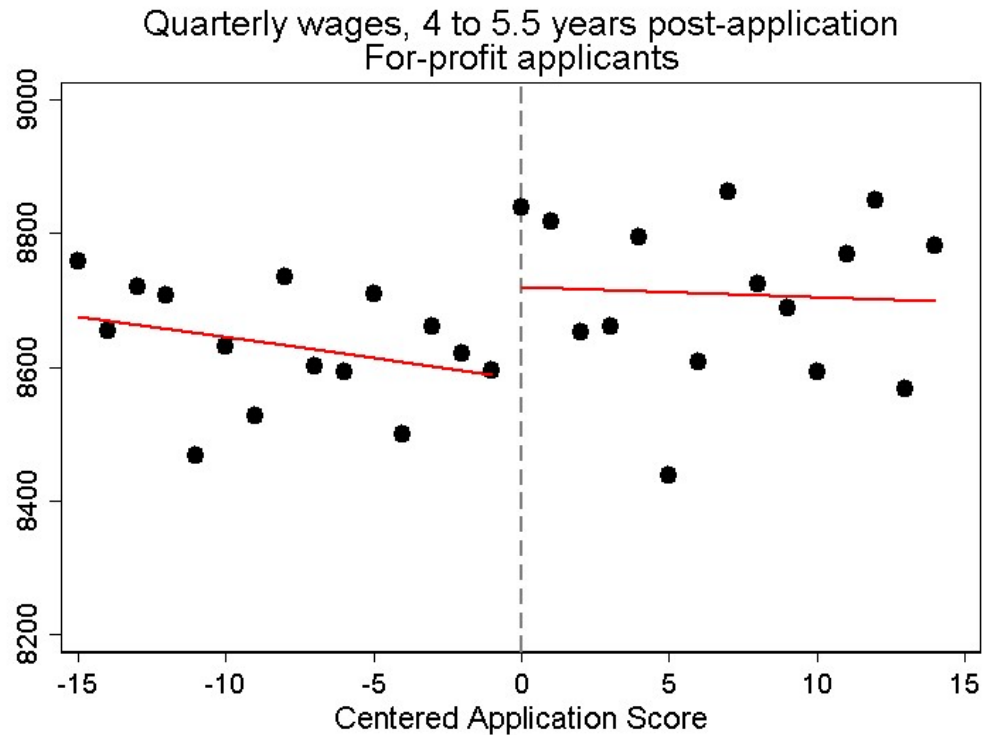


Let's speculate about impacts on
for-profit students



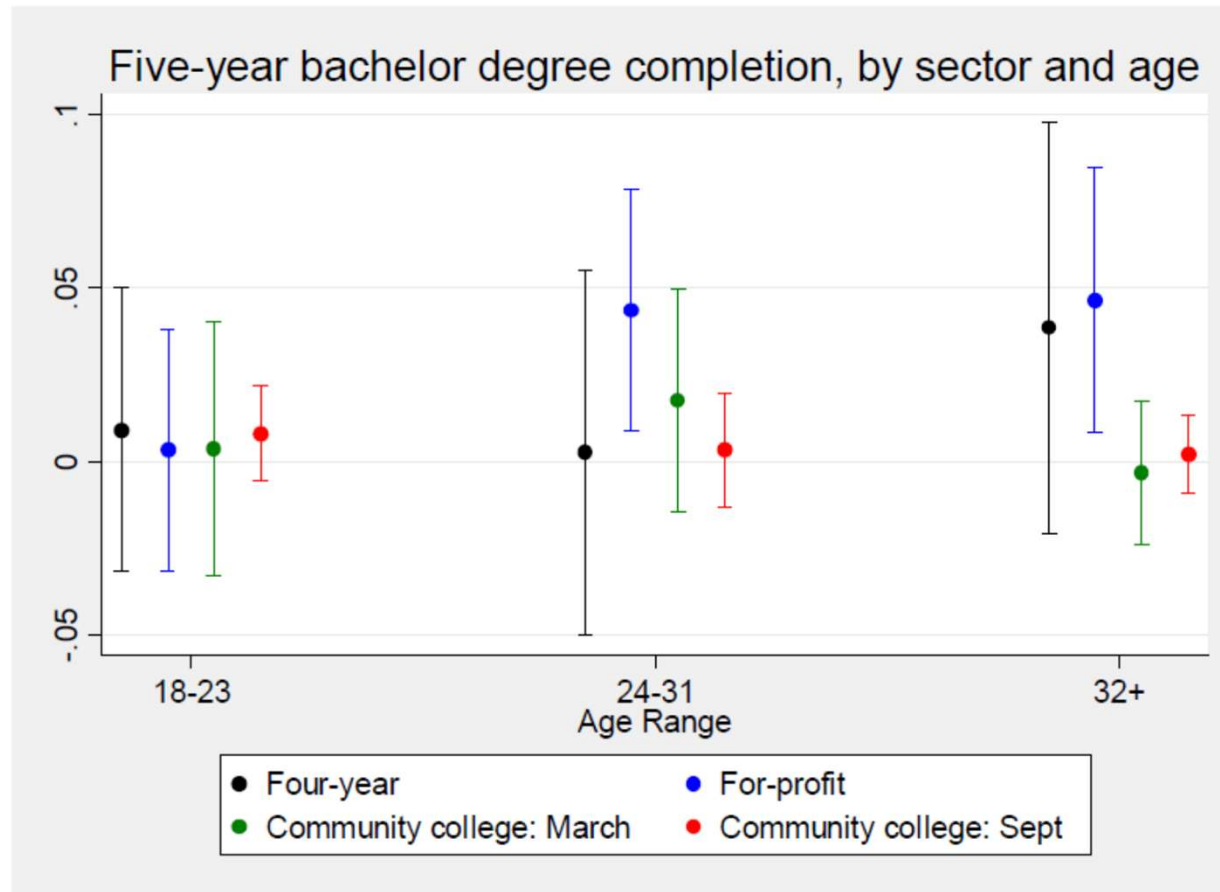
Speculation #1

- RD scatterplot suggests increase at the threshold



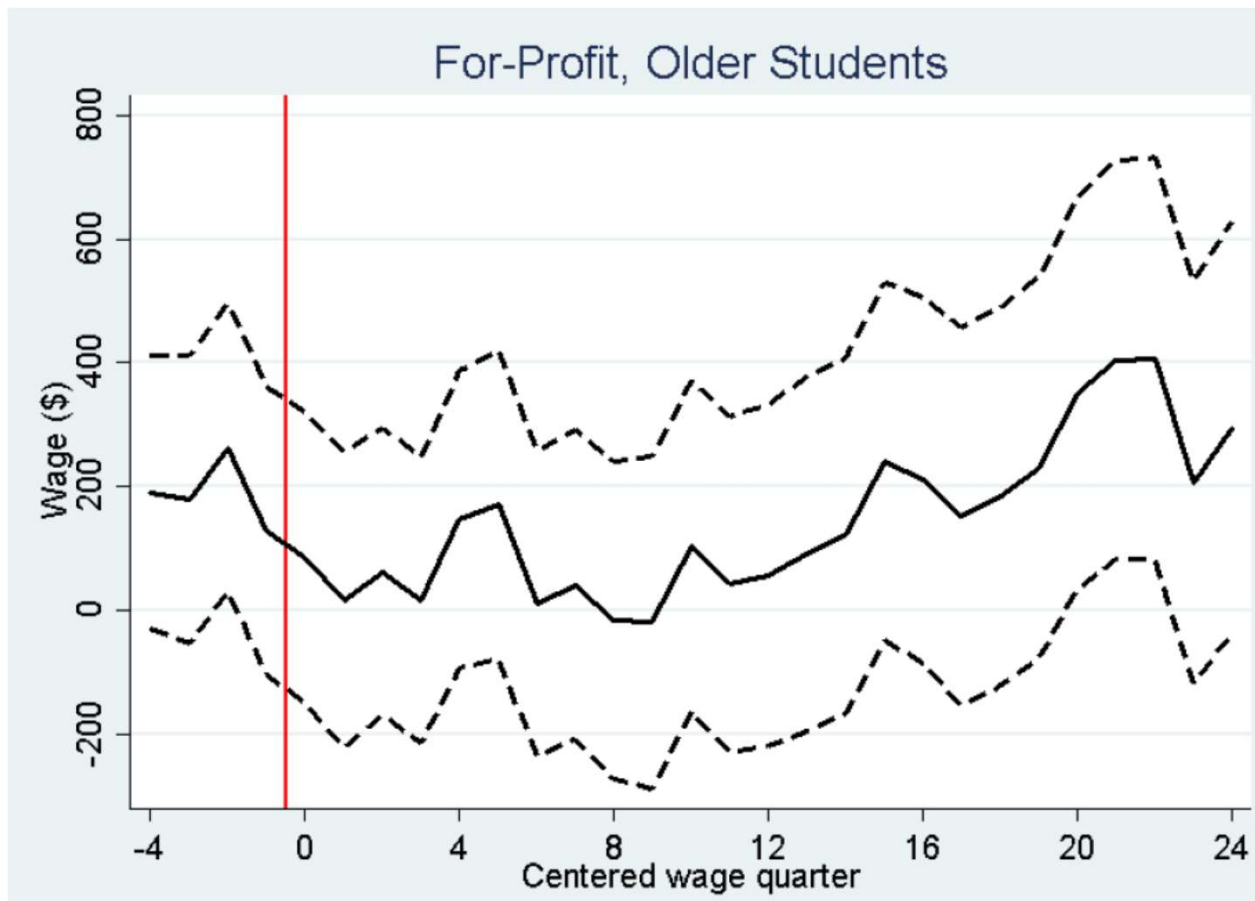
Speculation #2

- Degree impacts larger for older students



Speculation #2

- Wage impacts larger for older students



Discussion

- No impacts for majority of applicants
- For-profit colleges typically produce weaker labor market outcomes (Cellini & Chaudhary, 2014; Cellini & Turner, 2016; Darolia, et al., 2015; Deming, et al., 2016; Jepsen, Mueser, & Jeon, 2016)
- “Tinkering” unlikely to improve program design
 - Threshold identifies impacts on neediest students
 - Relatively low application barriers



Discussion

- Is the award efficient?

Cost-benefit comparison of financial aid programs

	Setting	Outcome	Cost per degree
<i>Non-traditional</i>			
Competitive Award	California, Varied	Bachelor	\$300,000
"Opening Doors" (Mayer et al., 2016)	Ohio, Community college	Associate	\$50,000
GI Bill Expansion (Barr, 2016)	National, Veterans	Bachelor	\$100,000
<i>Traditional</i>			
Entitlement Award (Bettinger et al., 2016)	California	Bachelor	\$150,000
Wisconsin Scholars Grant (Goldrick-Rab et al., 2016)	Wisconsin	Bachelor	\$190,000
Florida Student Access Grant (Castleman & Long, 2016)	Florida	Bachelor	\$30,000



Discussion

- Is the award efficient?
- Financial aid for working adults appears less efficient than for traditional students
- Unclear if state will earn a positive return on investment even for for-profit students, even under rosiest assumptions



Discussion

- Vouchers effective if individuals can assess job and educational options (Perez-Johnson, Moore, & Santillano, 2011; Schwerdt, Messer, Woessmann, & Wolter, 2012)
- Financial aid not panacea for working adults
 - May have strong ideas on why schooling matters



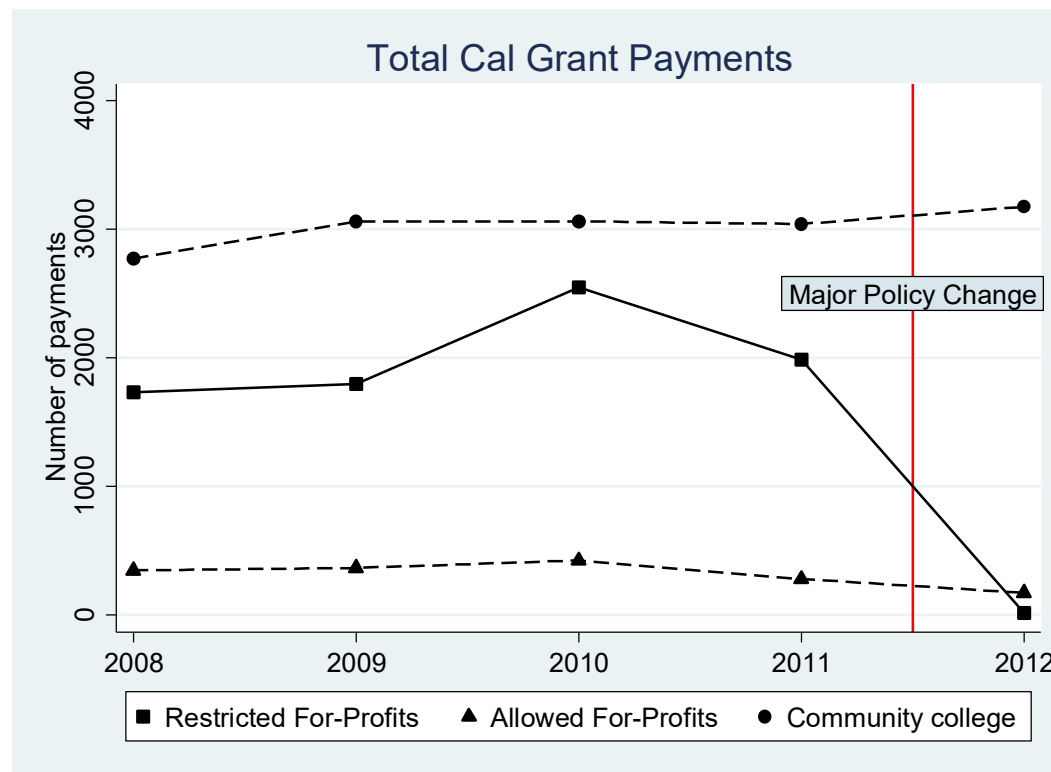
Discussion

- Could we induce for-profit students to attend alternative institutions?
 - Perhaps students interested in for-profits could be shifted towards cheaper institutions?
- Relatively inelastic preference for for-profit colleges



Does removing aid shift student behaviors?

- CSAC eliminated aid toward for-profits



Does removing aid shift student behaviors?

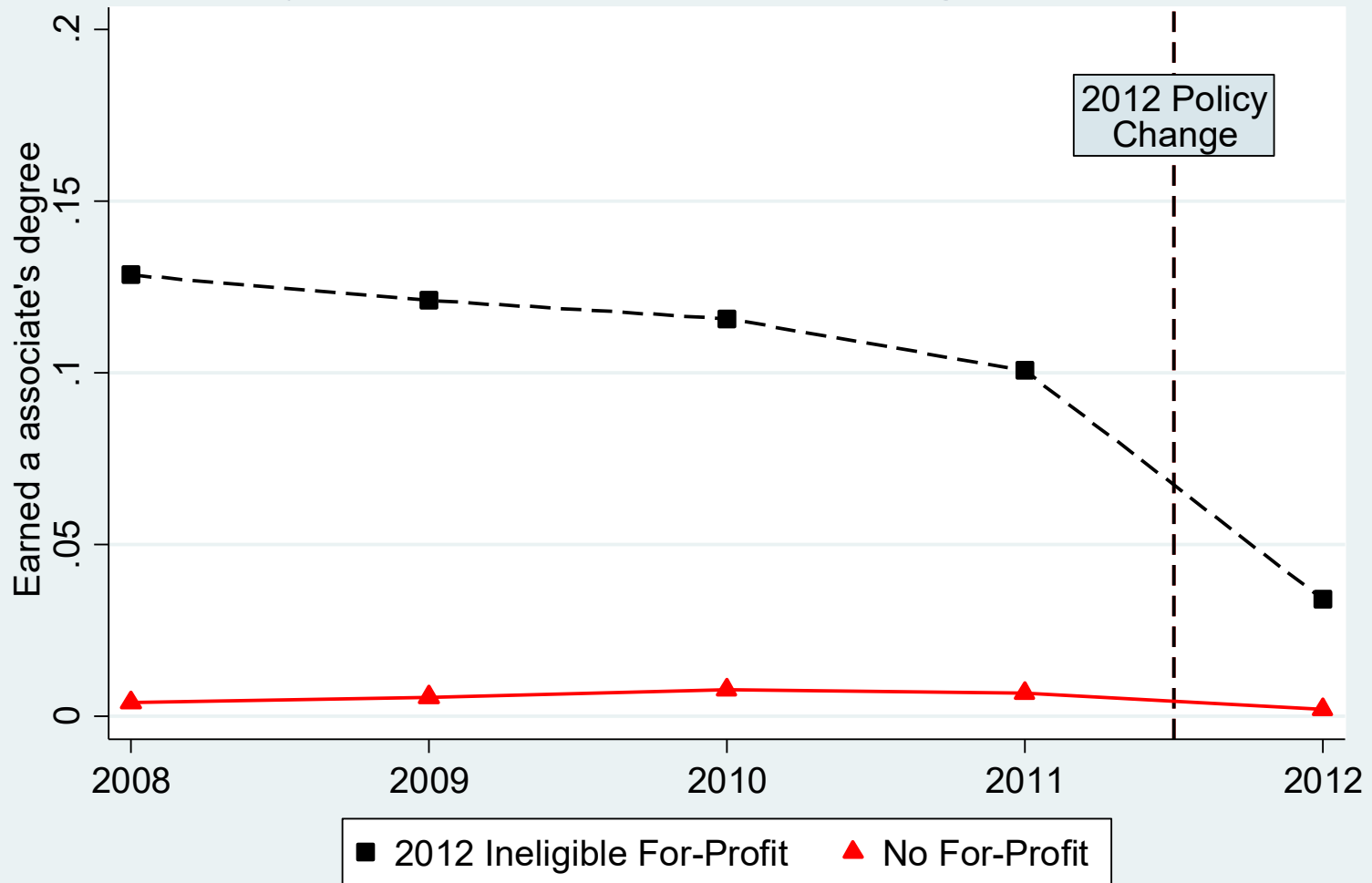
Table 3. Postsecondary attendance of Traditional Students, NSC subsample

	Year 1	Year 4
For-profit	-0.094** (0.013)	0.018+ (0.009)
Baseline	49.0%	11.2%
Community college	0.047** (0.018)	0.001 (0.016)
Baseline	27.9%	23.6%
Did not attend	0.047** (0.015)	-0.022 (0.018)
Baseline	19.3%	55.6%
Four-year	0.004 (0.015)	0.000 (0.015)
Baseline	10.2%	12.5%

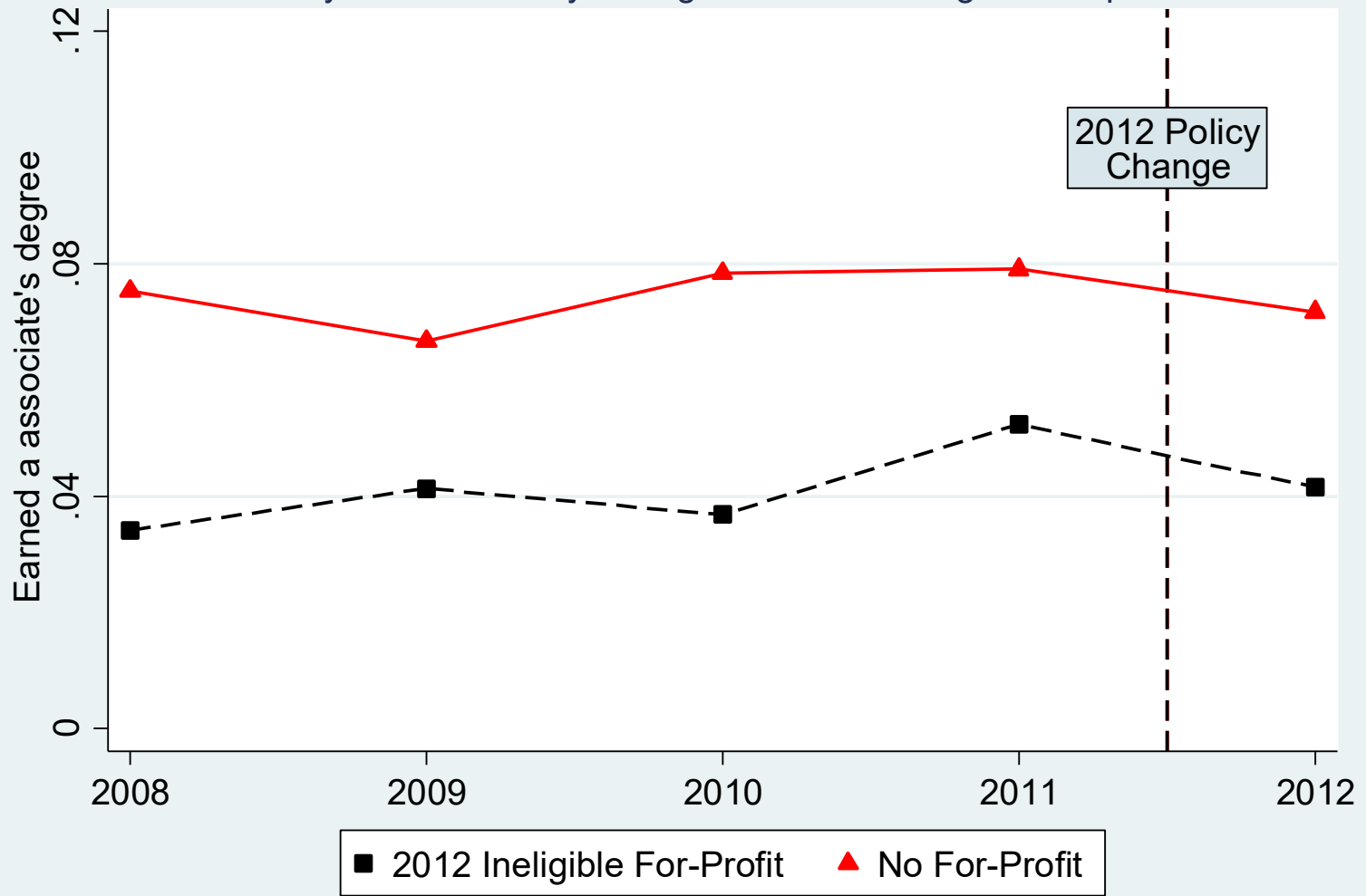
Notes. + $p < 0.1$ * $p < 0.05$ ** $p < 0.01$. All regressions are based on the subsample of 15,796 observations that has strong NSC coverage. Baseline values are means for 2010 applicants in the NSC subsample who listed any for-profit on their FAFSA.



Two-year For-Profit Associate's degree completion



Four-year Community College Associate's degree completion



Preliminary findings

- High school students: for-profit attendance declines, shifts into community college, degrees decline
- Non-traditional students: no shifting towards other institutions, degrees decline
 - Results differ from Cellini, et al. (2016)



Impacts of state aid for non-traditional students

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Appendix Table. Tuition at four-year public institutions

Application Year	In-State Resident Undergraduate Tuition	
	California State University (CSU)	University of California (UC)
2002	\$1,428	\$3,429
2003	\$2,046	\$4,984
2004	\$2,334	\$5,684
2005	\$2,520	\$6,141
2006	\$2,520	\$6,141
2007	\$2,772	\$6,636
2008	\$3,048	\$7,126
2009	\$4,026	\$7,788
2010	\$4,230	\$10,302
2011	\$5,472	\$12,192



Scoring: GPA

GPA	SCORE
2.00 - 2.04	30
2.05 - 2.09	31
2.10 - 2.14	32
2.15 - 2.19	33
2.20 - 2.24	34
2.25 - 2.29	35
2.30 - 2.34	36
2.35 - 2.39	37
2.40 - 2.44	38



3.70 - 3.74	64
3.75 - 3.79	65
3.80 - 3.84	66
3.85 - 3.89	67
3.90 - 3.94	68
3.95 - 3.99	69
4.00	70



Scoring: Parent Education

Some states and colleges offer aid based on the level of schooling your parents completed.

24. Highest school completed by Parent 1

Middle school/Jr. high 1 High school 2 College or beyond 3 Other/unknown 4

25. Highest school completed by Parent 2

Middle school/Jr. high 1 High school 2 College or beyond 3 Other/unknown 4



Scoring: Access Equalizer

1. The high school code on the GPA verification form is one of the following:
 - * A continuation high school; or
 - * A high school in the upper quartile of free or reduced lunch program; or
 - * A high school in the lowest quartile of university-going rate, excluding those high schools having no reported university-going rate and those having a free or reduced lunch rate of less than 25 percent.

or

2. The student submitted a GED test score.

GPA from	Disadvantaged High School Experience	
	No	Yes
High School	0	18
Non-High School	0	See below chart

Number of Years Out of High School	Educational Level				
	No College	1	2	3	4
2-3	9	6	3	0	0
4-5	12	9	6	0	0
6-7	15	12	9	3	0
8 or more	18	15	12	6	3



Scoring: Income and Household

size

TABLE 1: DEPENDENT STUDENTS
2010-11 COMPETITIVE CAL GRANT A AND B PROGRAM
SCORING FOR FAMILY INCOME AND HOUSEHOLD SIZE

Parents' Income	Size of Household								
	10	9	8	7	6	5	4	3	2
\$0 - \$19,850	76	76	76	76	76	76	76	76	76
\$19,851 - \$21,350	76	76	76	76	76	76	76	76	75
\$21,351 - \$22,850	76	76	76	76	76	76	76	76	74
\$22,851 - \$24,350	76	76	76	76	76	76	76	76	73
\$24,351 - \$25,850	76	76	76	76	76	76	76	75	71
\$25,851 - \$27,350	76	76	76	76	76	76	76	74	70
\$27,351 - \$28,850	76	76	76	76	76	76	76	73	69
\$28,851 - \$30,350	76	76	76	76	76	76	76	71	67
\$30,351 - \$31,850	76	76	76	76	76	76	75	70	66
\$31,851 - \$33,350	76	76	76	76	76	76	74	68	65
\$33,351 - \$34,850	76	76	76	76	76	76	72	67	64
\$34,851 - \$36,350	76	76	76	76	76	75	71	66	63
\$36,351 - \$37,850	76	76	76	76	76	74	70	65	62
\$37,851 - \$39,350	76	76	76	76	76	73	68	64	61
\$39,351 - \$40,850	76	76	76	76	76	72	67	63	60
\$40,851 - \$42,350	76	76	76	76	75	70	66	61	58
\$42,351 - \$43,850	76	76	76	76	74	69	65	60	57
\$43,851 - \$45,350	76	76	76	76	73	68	64	59	56
\$45,351 - \$46,850	76	76	76	76	72	67	63	58	55
\$46,851 - \$48,350	76	76	76	75	71	66	61	57	54
\$48,351 - \$49,850	76	76	76	74	69	65	60	56	52
\$49,851 - \$51,350	76	76	76	72	68	63	59	54	51
\$51,351 - \$52,850	76	76	75	71	67	62	58	53	49
\$52,851 - \$54,350	76	76	74	70	66	61	57	52	48
\$54,351 - \$55,850	76	76	73	68	65	60	56	50	46
\$55,851 - \$57,350	76	75	71	67	64	59	54	49	45
\$57,351 - \$58,850	76	74	70	66	63	58	53	47	43
\$58,851 - \$60,350	76	73	69	65	62	57	52	46	41
\$60,351 - \$61,850	75	71	68	64	60	56	50	44	40
\$61,851 - \$63,350	74	70	66	63	59	54	49	42	38
\$63,351 - \$64,850	73	69	65	62	58	53	48	41	37
\$64,851 - \$66,350	71	68	64	61	57	52	46	39	34
\$66,351 - \$67,850	70	67	63	60	56	50	44	37	32
\$67,851 - \$69,350	69	66	62	58	55	49	42	35	30
\$69,351 - \$70,850	68	64	61	57	53	47	41	32	29
\$70,851 - \$72,350	67	63	60	56	52	46	39	30	28
\$72,351 - \$73,850	66	62	59	55	51	44	37	29	
\$73,851 - \$75,350	65	61	58	54	49	42	35		
\$75,351 - \$76,850	64	60	56	52	48	40	33		
\$76,851 - \$78,350	62	59	55	51	46	38	30		
\$78,351 - \$79,850	61	58	54	49	44	36	29		
\$79,851 - \$81,350	60	57	53	48	43	34	28		
\$81,351 - \$82,850	59	55	51	46	41	32			
\$82,851 - \$84,350	58	54	50	45	39	30	Ineligible		
\$84,351 - \$85,850	57	53	48	43	37	29			
\$85,851 - \$87,350	56	52	47	41	35	28			
\$87,351 - \$88,850	54	50	45	39	33				
\$88,851 - \$90,350	53	49	43	37	30				
\$90,351 - \$91,850	52	47	42	35	29				
\$91,851 - \$93,350	50	45	40	33	28				

TABLE 3: SINGLE INDEPENDENT AND MARRIED STUDENTS
2010-11 COMPETITIVE CAL GRANT A AND B PROGRAM
SCORING FOR FAMILY INCOME AND HOUSEHOLD SIZE

Student/Spouse Income	Without Dependents Other Than Spouse	
	Married Couple	Single
\$0 - \$8,910	72	72
\$8,911 - \$9,480	72	71
\$9,481 - \$10,050	72	70
\$10,051 - \$10,620	72	69
\$10,621 - \$11,190	72	68
\$11,191 - \$11,760	72	68
\$11,761 - \$12,330	72	65
\$12,331 - \$12,900	72	64
\$12,901 - \$13,470	72	63
\$13,471 - \$14,040	72	62
\$14,041 - \$14,610	72	61
\$14,611 - \$15,180	72	60
\$15,181 - \$15,750	72	59
\$15,751 - \$16,320	72	58
\$16,321 - \$16,890	72	57
\$16,891 - \$17,460	72	56
\$17,461 - \$18,030	72	55
\$18,031 - \$18,600	71	54
\$18,601 - \$19,170	70	53
\$19,171 - \$19,740	69	52
\$19,741 - \$20,310	68	51
\$20,311 - \$20,880	67	50
\$20,881 - \$21,450	66	49
\$21,451 - \$22,020	65	48
\$22,021 - \$22,590	64	47
\$22,591 - \$23,160	63	46
\$23,161 - \$23,730	62	45
\$23,731 - \$24,300	60	44
\$24,301 - \$24,870	59	43
\$24,871 - \$25,440	58	41
\$25,441 - \$26,010	57	40
\$26,011 - \$26,580	56	39
\$26,581 - \$27,150	55	38
\$27,151 - \$27,720	54	37
\$27,721 - \$28,290	53	36
\$28,291 - \$28,860	52	35
\$28,861 - \$29,430	51	34
\$29,431 - \$30,000	50	
\$30,001 - \$30,570	49	
\$30,571 - \$31,140	47	
\$31,141 - \$31,710	46	
\$31,711 - \$32,280	45	
\$32,281 - \$32,850	44	
\$32,851 - \$33,420	43	
\$33,421 - \$33,990	42	

Appendix Table 1. Competitive award income limits

	Dependent	Independent		
		With Dependents	Single, No Dependent	Married, No Dependent
2002	\$76,500	\$76,500	\$27,800	\$24,700
2003	\$77,100	\$77,100	\$28,180	\$24,680
2004	\$78,100	\$78,100	\$28,300	\$24,800
2005	\$80,400	\$80,400	\$29,200	\$26,070
2006	\$83,600	\$83,600	\$30,385	\$26,605
2007	\$85,100	\$85,400	\$31,150	\$26,830
2008	\$89,500	\$88,970	\$32,205	\$28,215
2009	\$92,100	\$92,125	\$33,665	\$29,675
2010	\$93,350	\$93,500	\$33,990	\$29,430
2011	\$91,575	\$91,185	\$33,245	\$29,085

Notes. Income limits for dependents and independents with dependents refers to families with six or more students. Income limits generally decline by about \$5,000 per family member, and income limits for families of two individuals are generally \$20,000 lower.



Table 1. Descriptive Statistics, First-time Competitive award applicants, 2002-2011

	(1)	(2)	(3)	(4)
Application cycle	March	March	March	September
FAFSA type	Four-year	For-profit	CC	CC
Years	2002-2011	2002-2011	2006-2011	2002-2011
N	143,329	87,132	106,991	545,576
College educated parent	55%	38%	36%	37%
Dependent	44%	18%	33%	43%
Age	26	30	29	27
FAFSA educational background				
No college experience	1%	9%	4%	12%
First or second year	12%	66%	76%	70%
Third or fourth year	86%	24%	20%	17%



Competitive Cal Grant

Student 1

- 3.0 GPA; \$35,000 AGI
- Independent, no kids
- Both parents college-educated
- Four years out of HS
- Sophomore status

Competitive score = 119

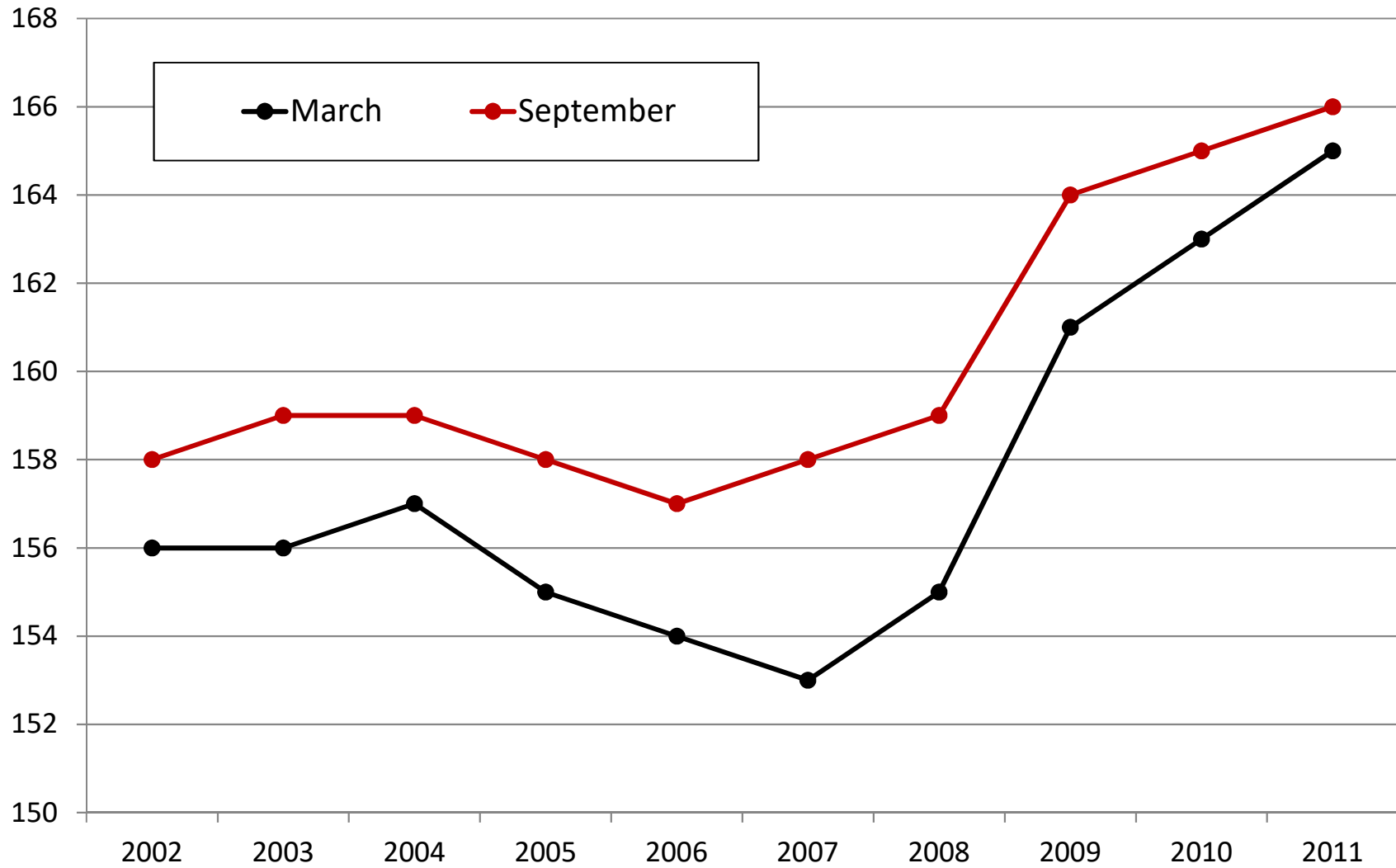
Student 2

- 3.7 GPA; \$20,000 AGI
- Independent, one kid
- Both parents high school graduates
- Eight years out of HS
- Freshman status

Competitive score = 183



Competitive award eligibility scores, 2002-2011



Appendix Table 2. Covariate Balance at Competitive award eligibility threshold

	(1)	(2)	(3)	(4)	(5)
Application cycle	All	March	March	All	September
FAFSA type	All	Four-year	For-profit	CC	CC
Years	2002-2011	2002-2011	2002-2011	2006-2011	2002-2011
N	185915	17639	23772	25182	114136
Family Size	0.018 (0.014)	0.027 (0.045)	0.036 (0.040)	0.005 (0.040)	0.014 (0.018)
College educated parent	-0.001 (0.004)	0.027+ (0.014)	0.018 (0.012)	-0.010 (0.011)	-0.007 (0.005)
Female	0.006 (0.004)	0.006 (0.015)	0.013 (0.013)	0.004 (0.012)	0.005 (0.006)
Age	-0.107 (0.091)	-0.376 (0.263)	0.420+ (0.227)	0.014 (0.269)	-0.148 (0.119)
Dependent	0.002 (0.004)	0.019 (0.015)	-0.005 (0.010)	0.012 (0.011)	-0.001 (0.006)
Student GPA	-0.002 (0.007)	-0.021 (0.016)	-0.013 (0.015)	-0.007 (0.013)	-0.002 (0.011)
Total Income	189.123 (120.069)	-248.801 (411.481)	276.163 (369.580)	282.075 (325.400)	209.745 (149.099)

Notes. + $p < 0.1$, * $p < 0.05$, ** $p < 0.01$. Coefficients are treatment effects at the eligibility threshold pooled across the years listed in the column heading, as estimated by equation (1). All results use local linear regressions that include all observations within the optimal bandwidth of eight points of the eligibility threshold.



Competitive Score, All Applicants, 2002-2011

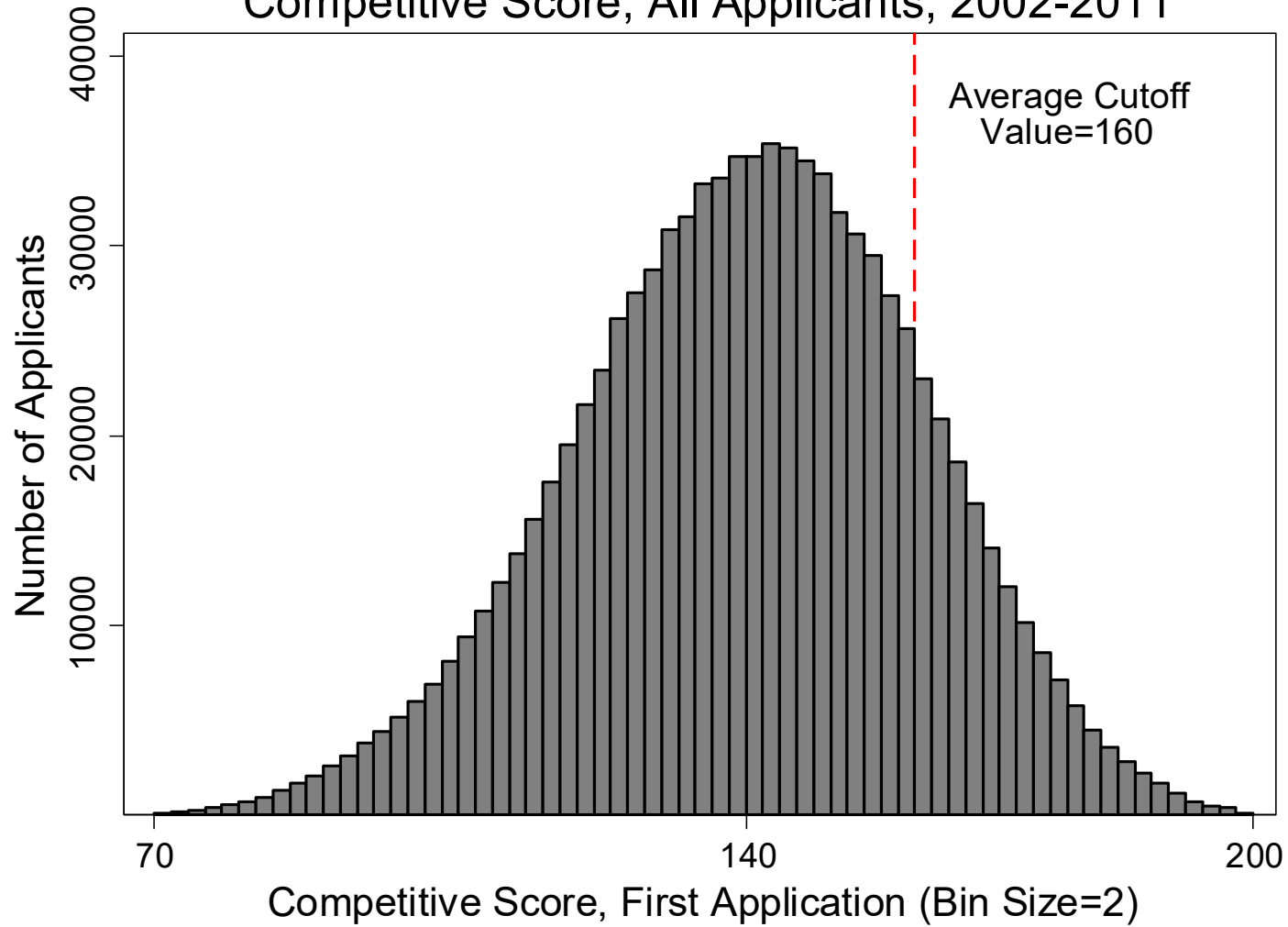


Table 2. First-Stage impacts of Competitive award eligibility on program take-up

	(1)	(2)	(3)	(4)	(5)
Application cycle	All	March	March	March	September
FAFSA type	All	Four-year	For-profit	CC	CC
Years	2002-2011	2002-2011	2002-2011	2006-2011	2002-2011
N	185915	17639	23772	25182	114136
Offered Cal Grant A or B	0.933** (0.002)	0.931** (0.005)	0.844** (0.007)	0.751** (0.008)	0.995** (0.001)
<i>(Baseline rate below estimates)</i>	4.2%	1.3%	14.1%	15.5%	0.1%
Received Cal Grant payment in first year	0.637** (0.003)	0.759** (0.009)	0.509** (0.011)	0.454** (0.010)	0.695** (0.004)
	3.7%	1.1%	13.7%	13.2%	0.0%
Total grant aid: first year	1713.8** (15.9)	4459.0** (79.3)	4719.6** (91.6)	642.6** (15.7)	879.7** (6.6)
	\$64	\$31	\$336	\$120	\$1
Ever received Cal Grant payment	0.462** (0.004)	0.630** (0.011)	0.453** (0.011)	0.320** (0.012)	0.475** (0.005)
	27.0%	16.7%	22.5%	36.1%	27.6%
Total grant aid: all years	3059.7** (54.7)	7221.7** (189.1)	7237.1** (177.9)	1469.2** (153.5)	1831.2** (64.3)
	\$1,793	\$1,230	\$1,211	\$2,323	\$1,866

Notes. + p<0.1, * p<0.05, ** p<0.01. Coefficients are treatment effects at the eligibility threshold pooled across years, as estimated by equation (1). All results use local linear regressions that include all observations within the optimal bandwidth of eight points of the eligibility threshold. Robust standard errors in parentheses. Baseline rates include all observations one or two points below the eligibility threshold.



Appendix Table 3. Impacts of Competitive award on attendance and degree completion

	(1)	(2)	(3)	(4)	(5)
Application cycle	All	March	March	March	September
FASFA type	All	Four-year	For-profit	CC	CC
N	185915	17639	23772	25182	114136

Immediate attendance

Attend	0.001 (0.004)	0.005 (0.013)	0.009 (0.013)	0.009 (0.012)	-0.004 (0.005)
CA community college	-0.001 (0.004)	0.001 (0.010)	-0.004 (0.006)	0.013 (0.012)	-0.003 (0.005)
CA four-year public or non-profit	0.000 (0.002)	0.008 (0.013)	0.002 (0.002)	-0.003 (0.004)	-0.000 (0.002)
For-profit	0.003 (0.002)	0.000 (0.002)	0.008 (0.013)	0.000 (0.002)	0.001 (0.001)
All other schools	0.001 (0.001)	0.003 (0.003)	0.002 (0.002)	-0.001 (0.002)	0.001 (0.001)

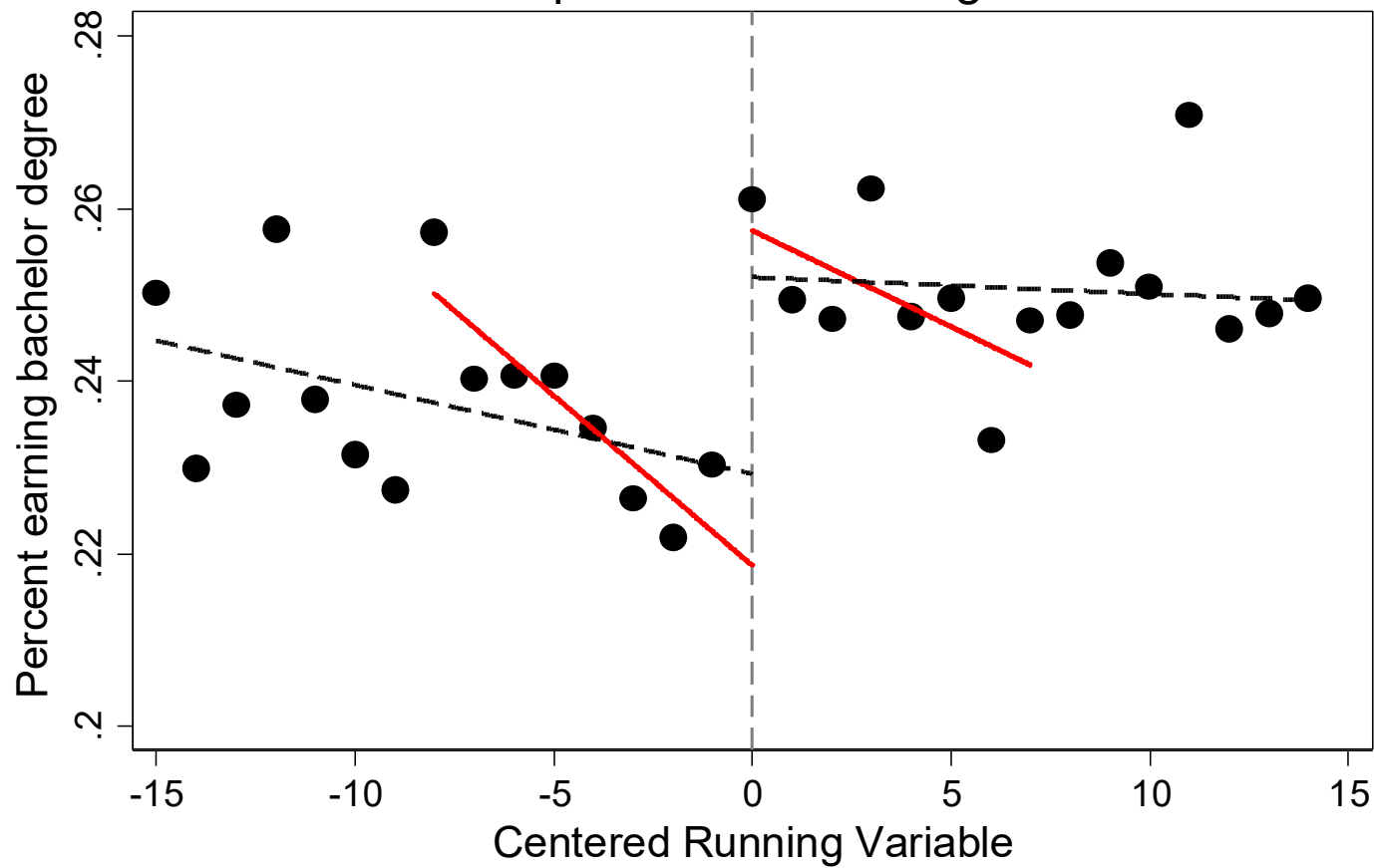
Ever attend

Attend	0.004 (0.003)	0.000 (0.010)	0.001 (0.013)	0.022* (0.010)	0.002 (0.004)
CA community college	-0.001 (0.004)	0.007 (0.014)	-0.020+ (0.010)	0.017 (0.011)	0.000 (0.005)
CA four-year public or non-profit	0.009* (0.004)	0.008 (0.012)	0.010+ (0.006)	0.007 (0.011)	0.010+ (0.005)
For-profit	0.002 (0.003)	-0.003 (0.006)	0.015 (0.013)	-0.001 (0.006)	-0.000 (0.003)
All other schools	-0.000 (0.002)	0.006 (0.008)	-0.001 (0.005)	-0.006 (0.006)	0.001 (0.003)

Notes. + p<0.1, * p<0.05, ** p<0.01. Coefficients are treatment effects at the eligibility threshold pooled across years, as estimated by equation (1). All regressions run linear specification that include all observations within 15 points of the eligibility threshold. Robust standard errors in parentheses.

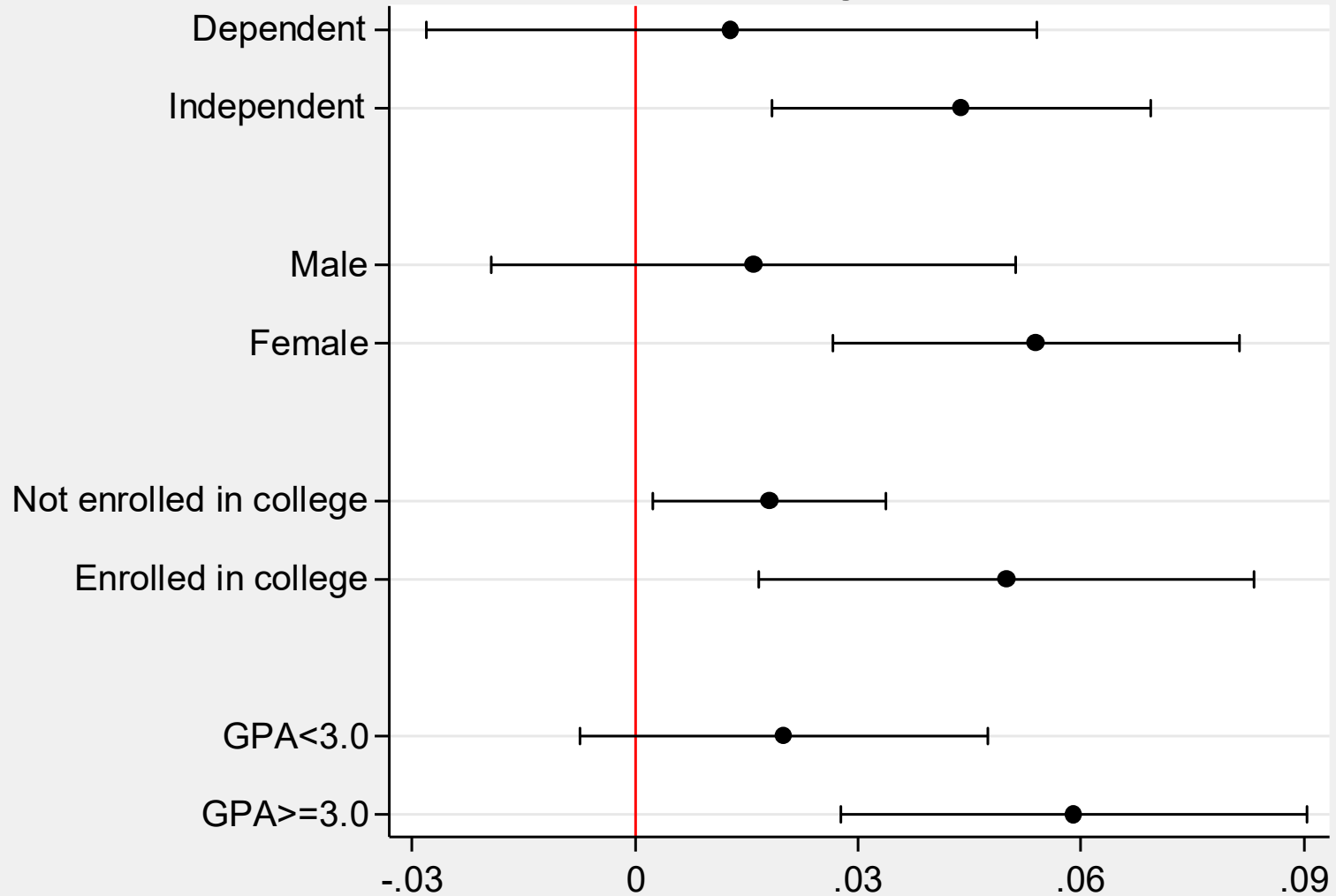


For-profit: Bachelor degree

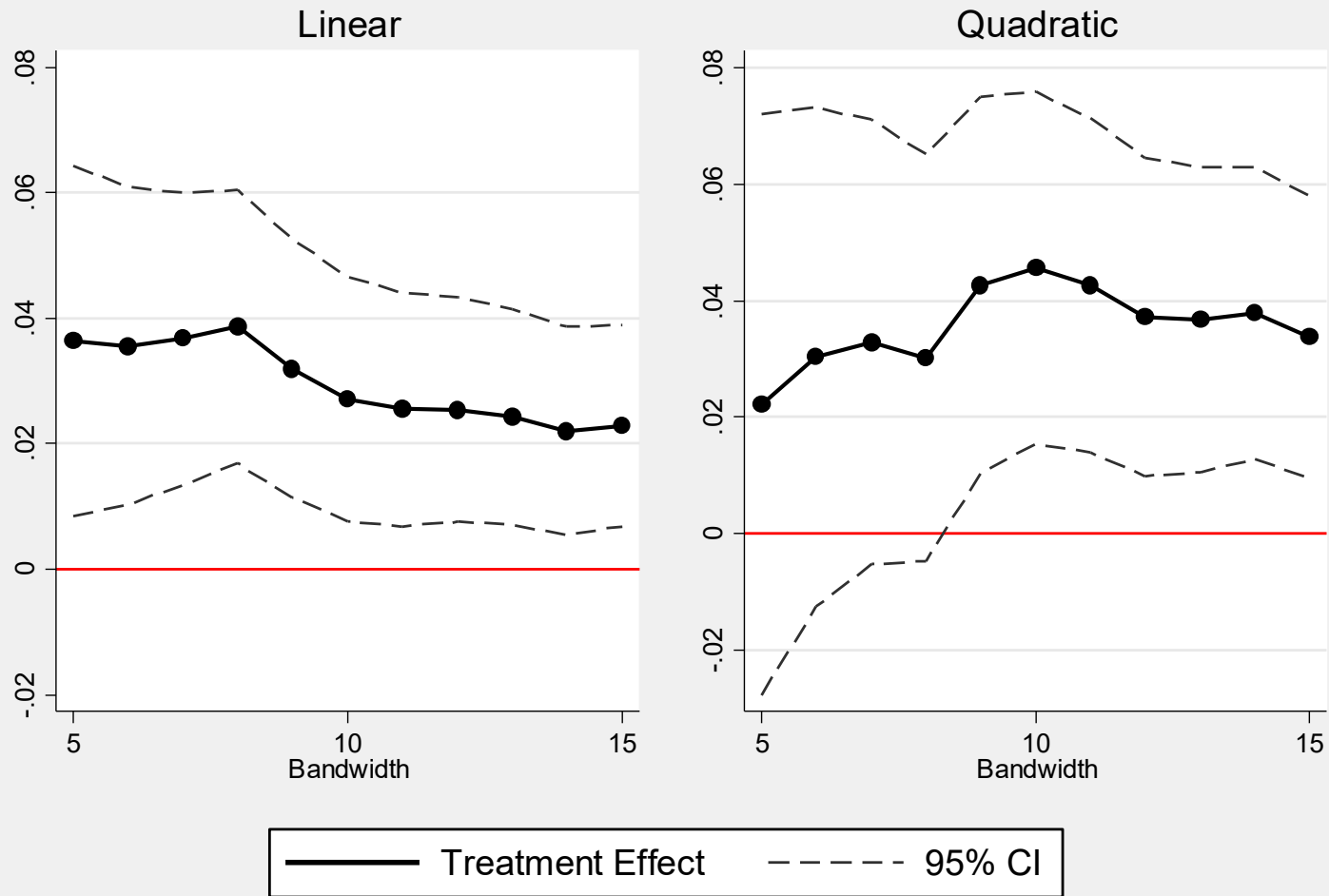


— Optimal Bandwidth - - - - Full Bandwidth

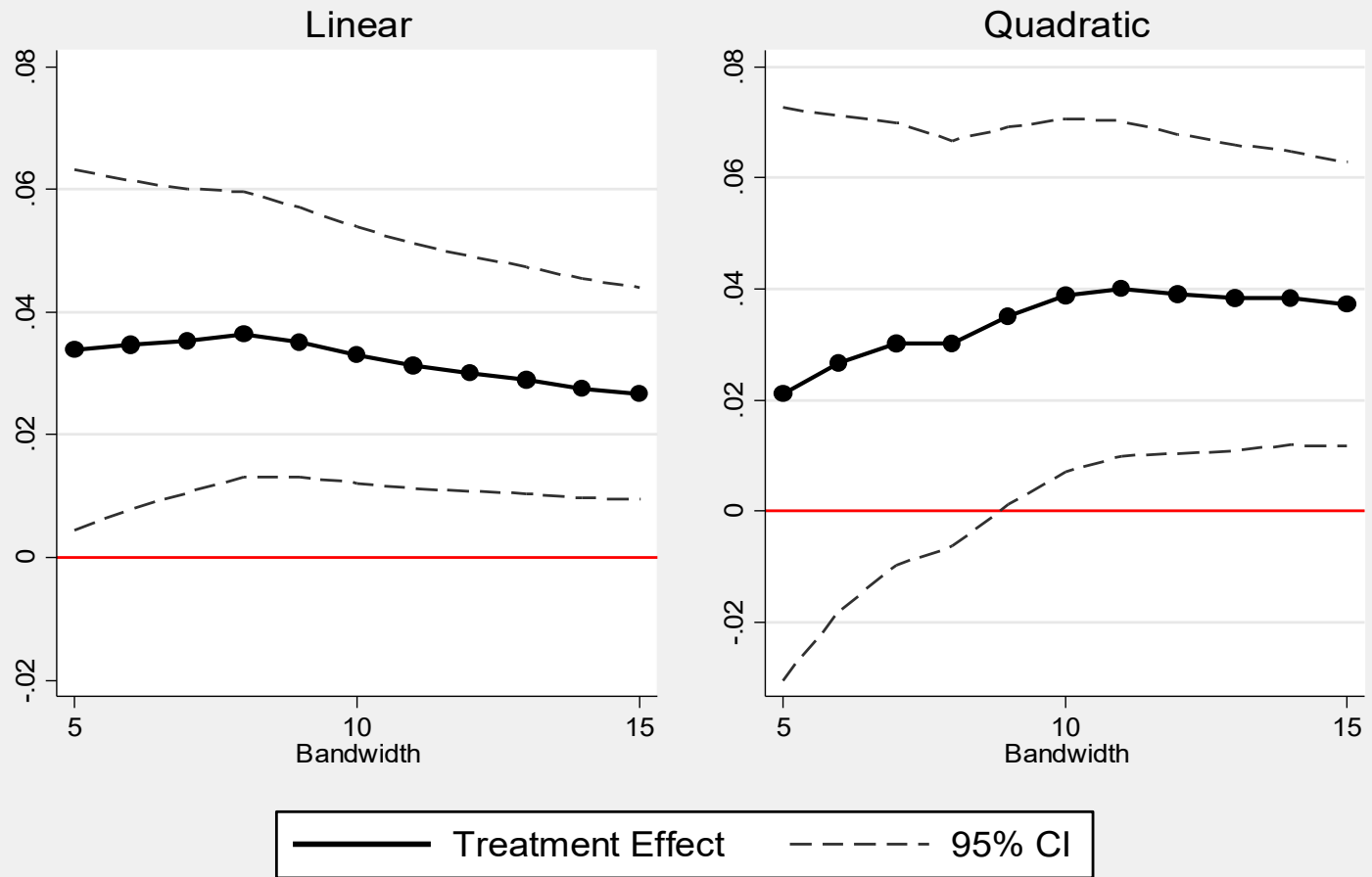
Bachelor Degree: For-profit



Impact on bachelor degree completion, For-profit students



Impact on bachelor degree completion, For-profit students, Tri kernel



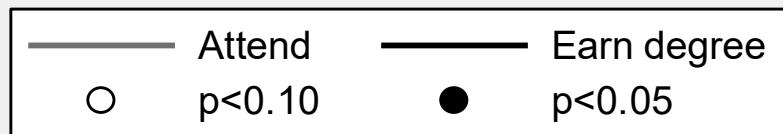
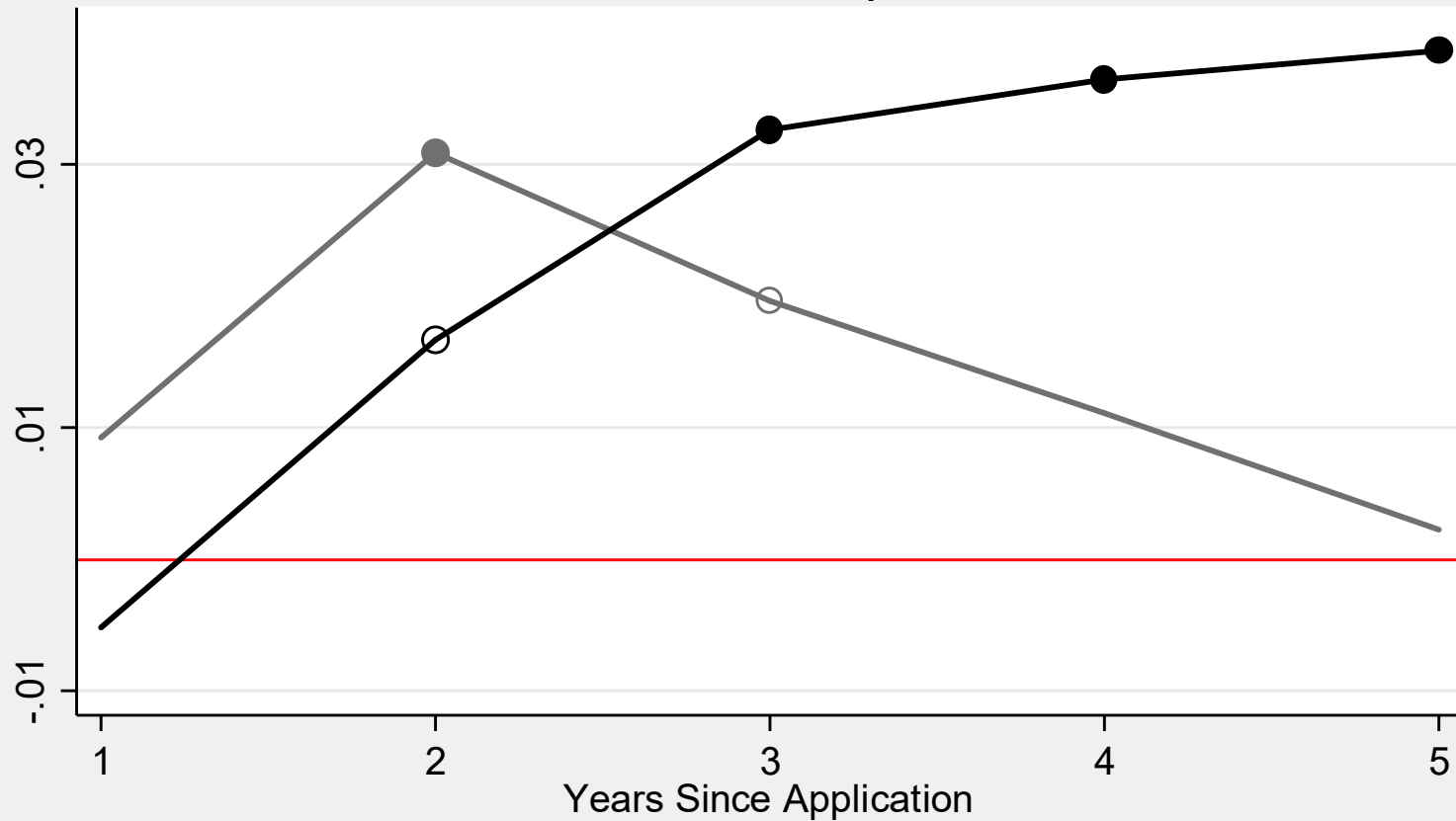
Results: Non-Reporting Schools

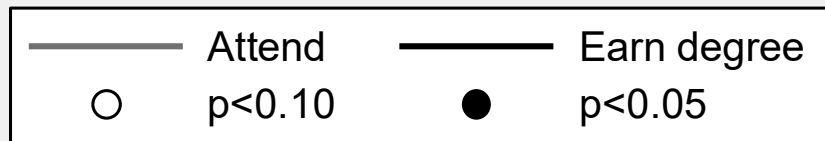
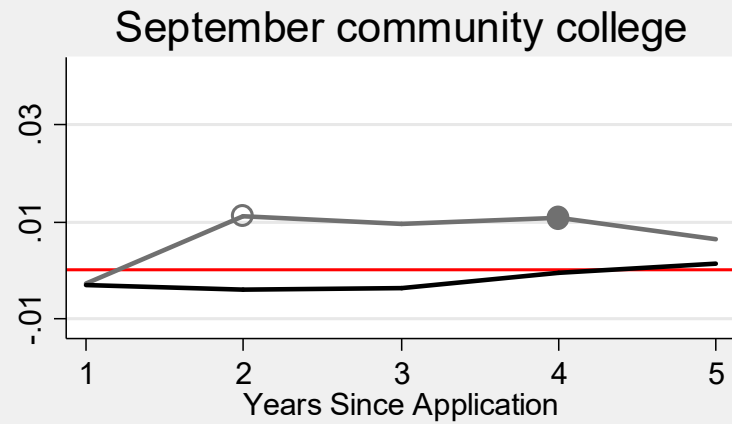
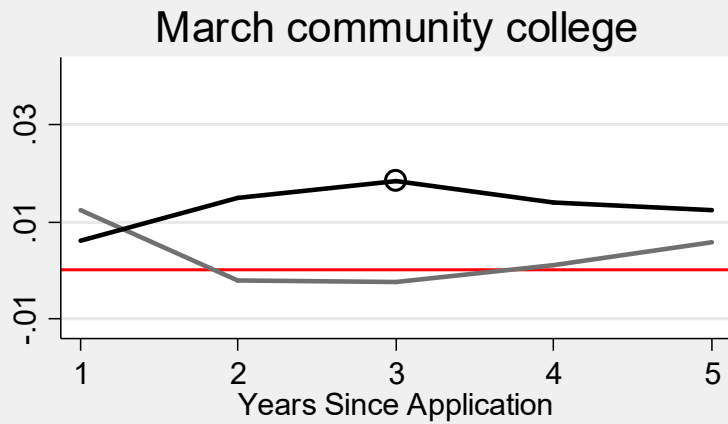
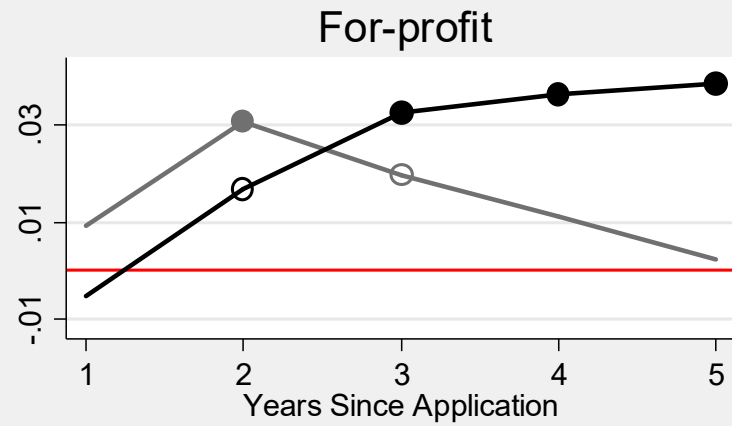
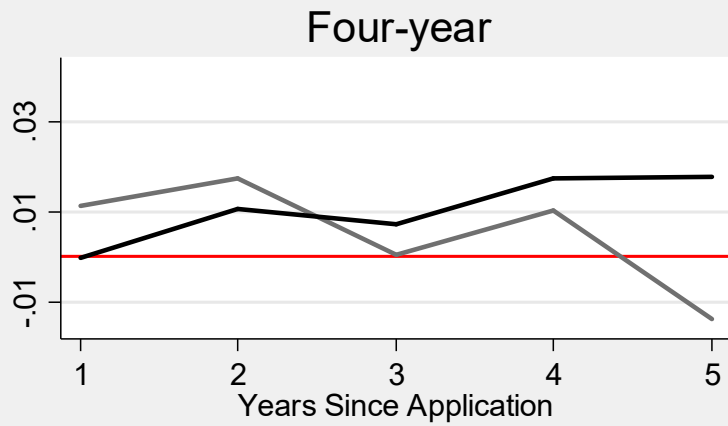
Appendix Table 4. Impacts of Competitive award on attendance and degree completion, NSC reporting robustness checks

	(1)	(2)	(3)	(4)
Student type		March for-profit		
Remove non-reporting colleges	No	Yes	Yes	Yes
Blocking restriction	None	>50%	>40%	>30%
N	41606	34852	34746	34738
Initial attendance	0.009 (0.013)	0.013 (0.014)	0.013 (0.014)	0.013 (0.014)
Ever attended	0.001 (0.013)	0.004 (0.013)	0.004 (0.013)	0.004 (0.013)
Associate degree	-0.005 (0.009)	-0.001 (0.010)	-0.001 (0.010)	-0.001 (0.010)
Bachelor degree	0.039** (0.011)	0.043** (0.013)	0.043** (0.013)	0.043** (0.013)
Any degree	0.030* (0.013)	0.039** (0.014)	0.038** (0.014)	0.038** (0.014)

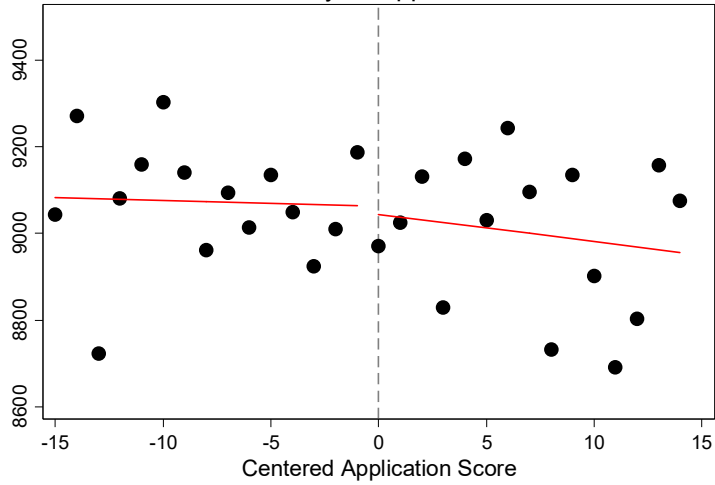
Notes. + $p < 0.1$, * $p < 0.05$, ** $p < 0.01$. Coefficients are treatment effects at the eligibility threshold pooled across years, as estimated by equation (1). All regressions run linear specification that include all observations within 15 points of the eligibility threshold. Robust standard errors in parentheses. Blocking restrictions refer to the percent of students reported blocked in the NSC Student Tracker Control report.

Effects over time: For-profit students

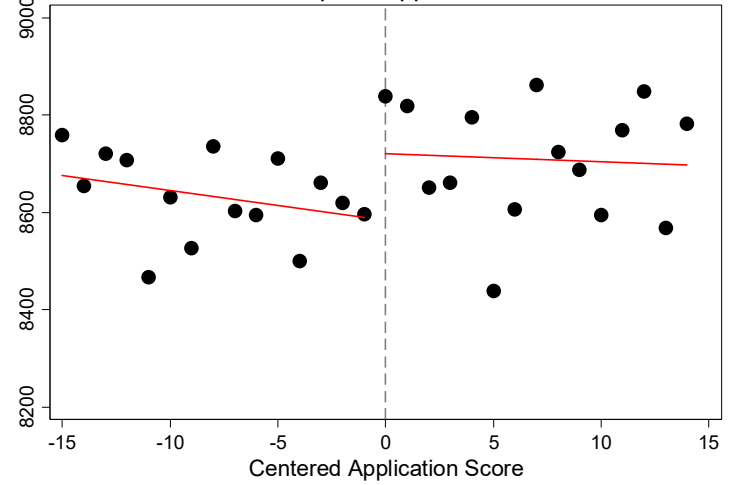




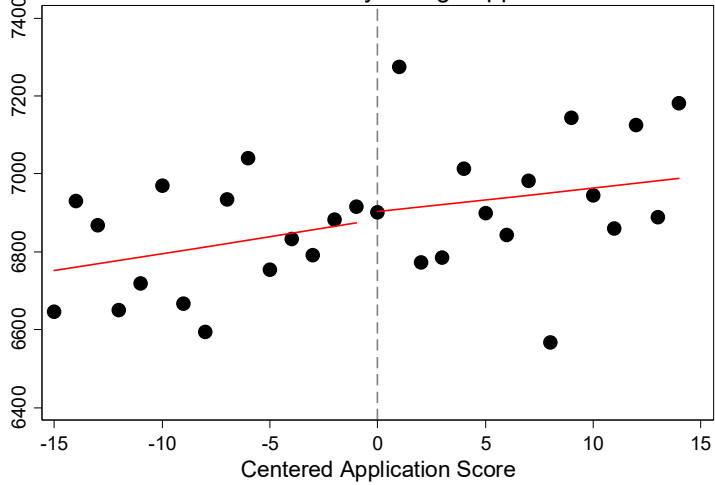
Quarterly wages, 3 to 5 years post-application
Four-year applicants



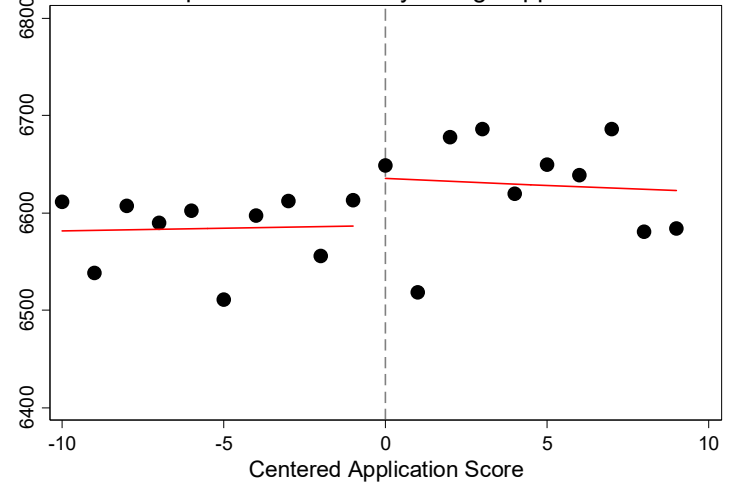
Quarterly wages, 3 to 5 years post-application
For-profit applicants



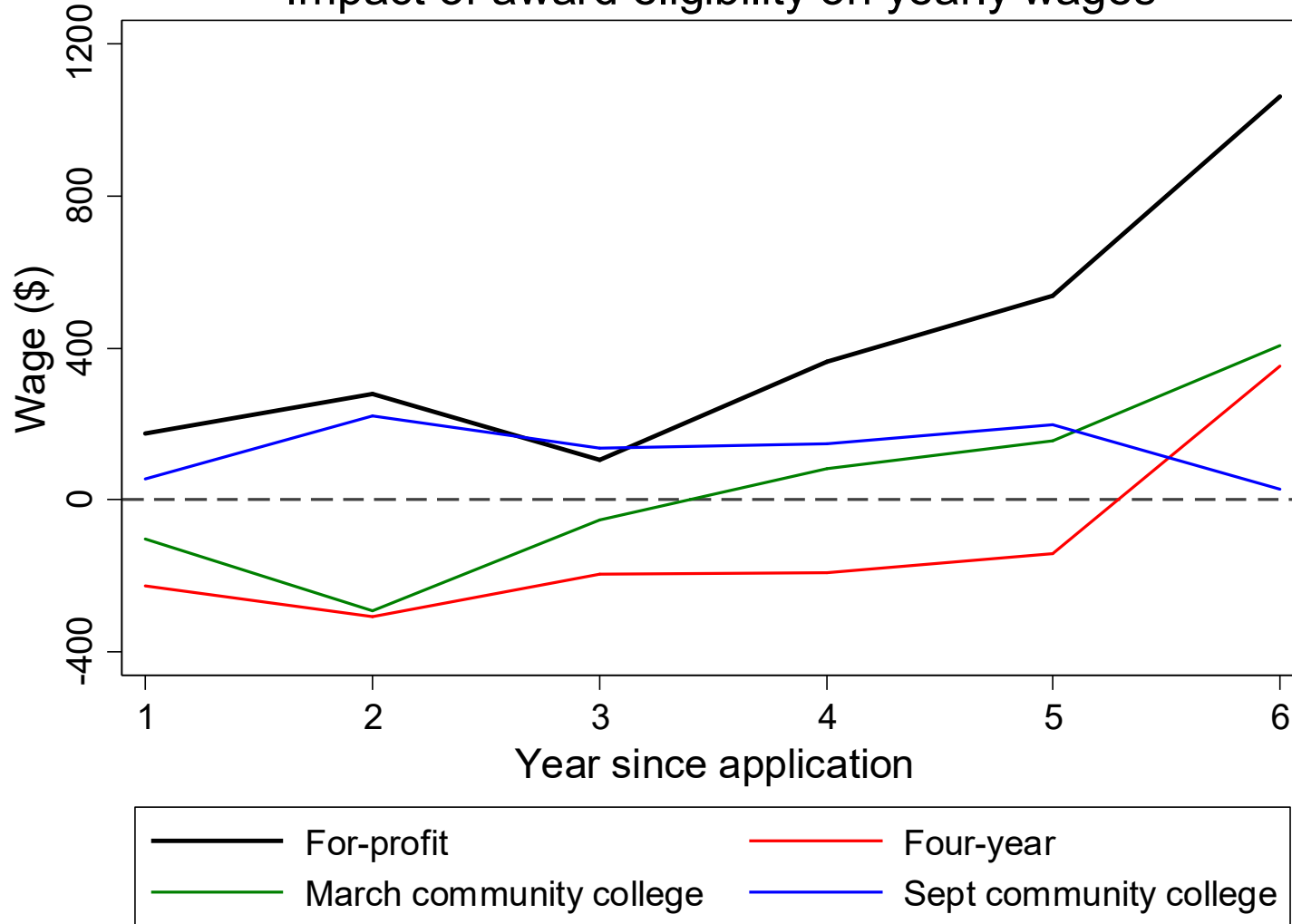
Quarterly wages, 3 to 5 years post-application
March community college applicants



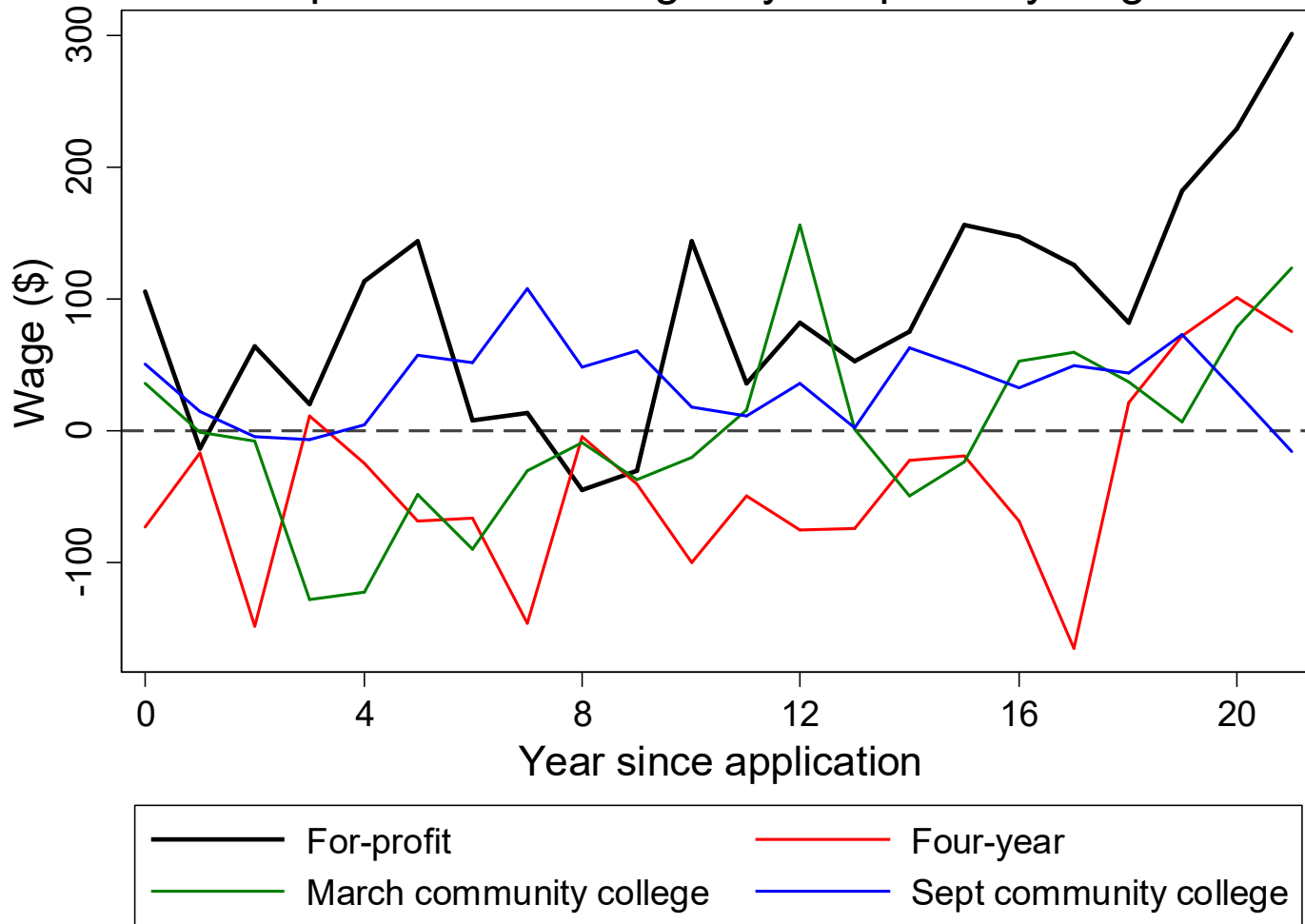
Quarterly wages, 3 to 5 years post-application
September community college applicants



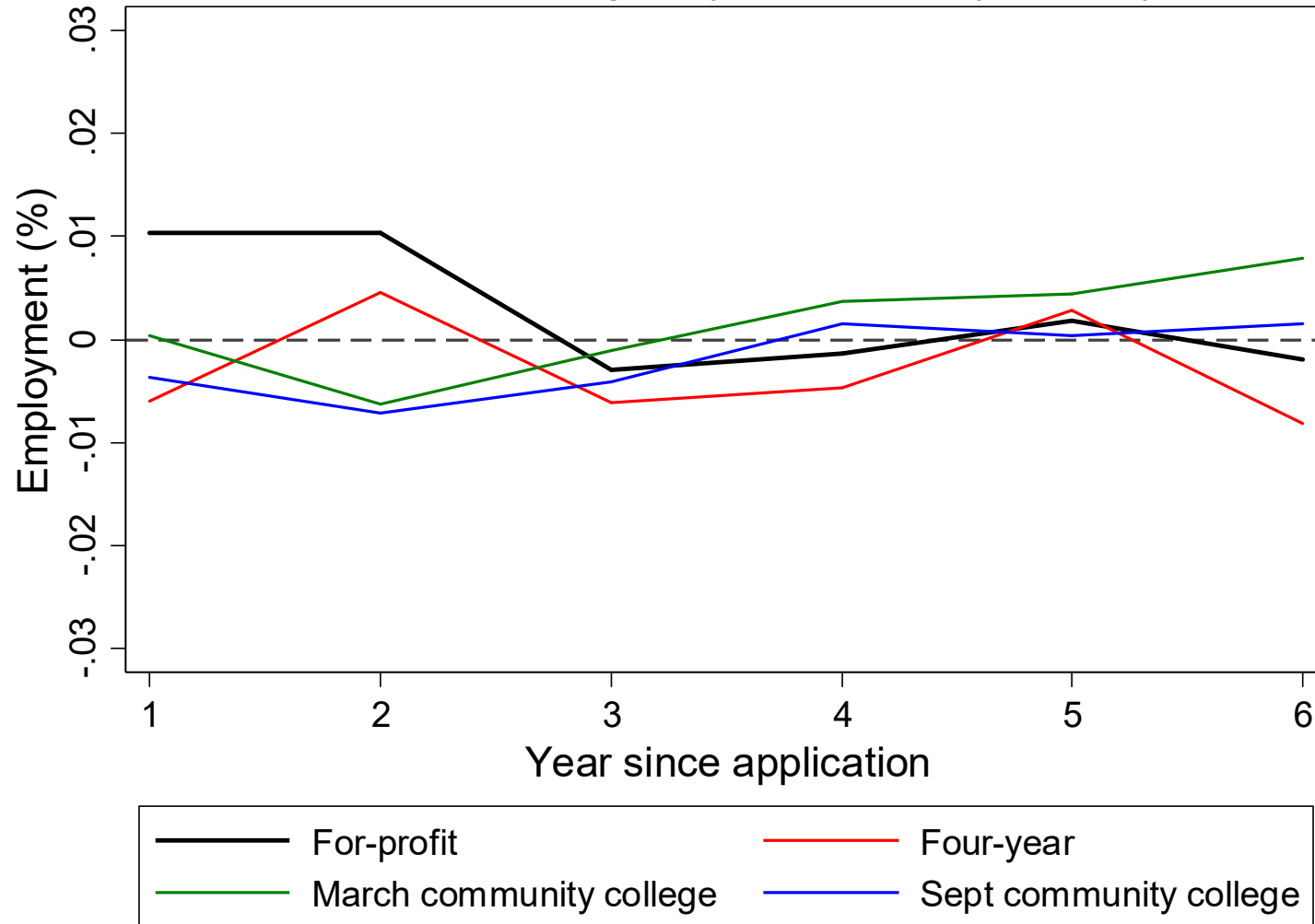
Impact of award eligibility on yearly wages



Impact of award eligibility on quarterly wages



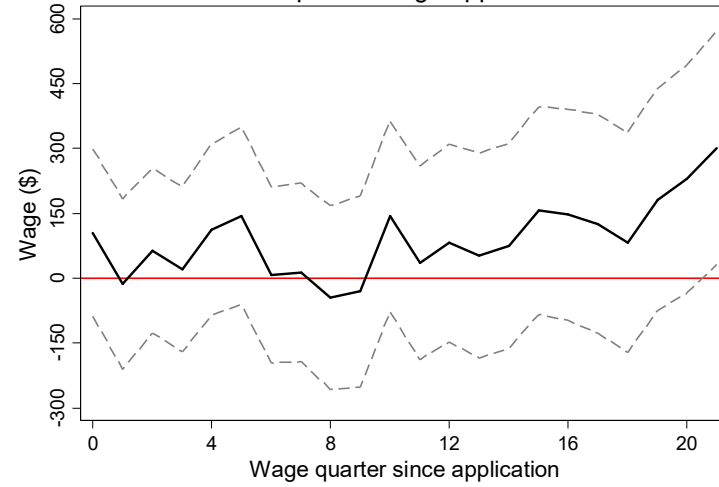
Impact of award eligibility on quarterly employment



Impact on quarterly wages
Four-year college applicants



Impact on quarterly wages
For-profit college applicants



Impact on quarterly wages
March community college applicants



Impact on quarterly wages
September communiyt college applicants

