

# **Affirmative action and student academic performance at UFMG, Brazil**

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# Significance

- Brazil has been experiencing changes in relation to student admissions at universities.
- UFMG implemented a socio-racial bonus on their entrance exam between 2009 and 2012.
- We performed some analyses about the association between this affirmative action and student academic performance in 2009 and 2010.

# Changes at UFMG

- Affirmative actions:
  - **Socio-racial bonus** (2009–2012): 10% (7 years in public primary/secondary school) + 5% (black/brown).
  - **Quota law** (2013...): public school, income, race/color.
- Admission exams:
  - 2009–2010: Traditional entrance exam (**vestibular**).
  - 2011–2013: National exam of secondary education (**ENEM**) replaced the first phase of vestibular, along with short essay in the second phase.
  - 2014...: Exam done through the unified selection system (**SISU**) of the Ministry of Education.

# Criticisms of the bonus program

- Race/color criterion would benefit black/brown applicants with a better **socioeconomic status**.
  
- Students receiving the bonus would **perform worse academically** in relation to other students:
  - Reduce quality of education.
  - Increase retention rates.
  
- Students benefiting from bonus would have difficulties completing the undergraduate program, which would increase **dropout rates**.

# Our studies and main results

- Investigate **socioeconomic status** of students who received socio-racial bonus.
  - Bonus benefited students with worse SES.
- Correlation between bonus and **grade** on admission exam.
  - Positive association, controlling for covariates.
- Correlation between bonus and **academic performance**, considering different majors.
  - Grades are usually similar between beneficiary and non-beneficiary students, but there are exceptions...

## Data source

- Permanent commission of admission exam (COPEVE):
  - 2008 (no bonus), 2009, 2010 (bonus).
  - Information about bonus category (0%, 10%, 15%).
  - Grade on admission exam.
  - Socioeconomic characteristics of students.
  - The socioeconomic data can be criticized as lacking reliability: online self administered questionnaires.
- Department of registry and academic control (DRCA):
  - Grade point average (GPA) in each semester of 2009 and 2010.

# Registered and admitted students from UFMG admission exam, 2009 and 2010

Bonus socio-racial category	2009		2010	
	Registered (%)	Admitted (%)	Registered (%)	Admitted (%)
<b>0% bonus</b>	72.24	64.18	73.25	64.96
<b>10% bonus</b>	10.85	11.60	9.92	9.20
<b>15% bonus</b>	16.91	24.22	16.83	25.84
<b>Overall total</b>	60,914	5,372	62,032	6,045

Source: COPEVE (2009, 2010).

# Before and after the bonus

- Socio-racial bonus changed characteristics of students, based on comparisons between 2008 (no bonus) and 2009, 2010 (bonus).
- After affirmative action, higher proportions of students:
  - Public secondary school.
  - Black/brown.
  - Mother with low education.
  - Low household income (<1, 1–2, 2–5 minimum wages).
  - Participating in the labor market.



# Characteristics and grade on admission exam

## – Multinomial logistic regression:

- Analyze whether bonus categories (dependent variable) are associated with characteristics of students:
  - Gender
  - Age
  - Race/color
  - Household income per capita
  - Labor force participation
  - Mother's education
  - Type of secondary school
  - Shift of secondary school (morning/evening)

## – Ordinary least squares regression:

- Estimate if grades of admitted students (dependent variable) are associated with bonus categories.

## **Multinomial: bonus categories (dependent)**

- Students with worse socioeconomic conditions are more likely to receive the bonus.
- Race/color self declaration did not only benefit black/brown applicants with better socioeconomic status.
- Race criterion was only implemented for students who studied for at least 7 years in public schools, which might have benefited students with low SES.

## **OLS: admission exam grade (dependent)**

- Bonus had a significant association with grades of students on admission exam, controlling for covariates and prior to adding the bonus.
- Using students not receiving the bonus in 2009 as the reference:
  - Students with 10% bonus had 8.9 more points.
  - Students with 15% bonus had 13.6 more points.
- Using students not receiving the bonus in 2010 as the reference:
  - Students with 10% bonus had 5.3 more points.
  - Students with 15% bonus had 11.1 more points.

## Type of secondary school

- Students from federal public secondary schools would have been admitted even without the bonus.
- There is a suggestion that these policies should only be directed to students from municipal and state public schools.
- Admitted students from federal public schools represented 11% in 2008 and 10% in 2010.
- Admitted students from state public schools represented 18% in 2008 and 30% in 2010.

# Academic performance

- Do beneficiary students have worse grade point averages (GPA) compared to non-beneficiary students?
- We merged data on socioeconomic characteristics with academic performance for students who were in 1st, 2nd, 3rd, and 4th semesters in 2009 and 2010.
- Unit of analysis refers to each semester of each student.
- Database has 28,325 observations.

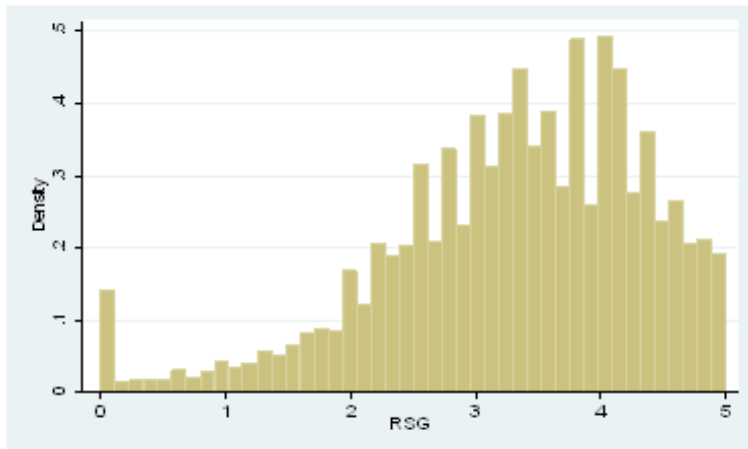
# Statistical models

- Ordinary least squares regressions estimated associations of several variables with GPA.
- There are criticisms that GPA is not a good measure of academic performance, because it is not comparable among professors, classes, and majors.
- A way to deal with this issue is to include information about semester in university, semester of entrance, and major.
- Models also considered information on socioeconomic status, household characteristics, and secondary education.

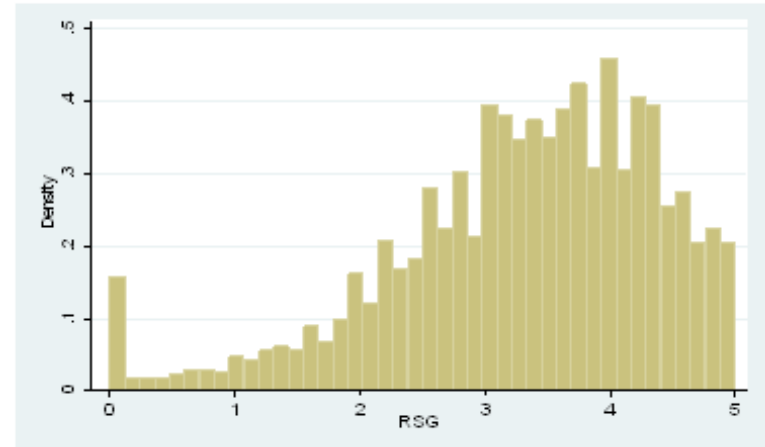
# GPA distribution by bonus category

- Apparently, GPA is similar across bonus categories:

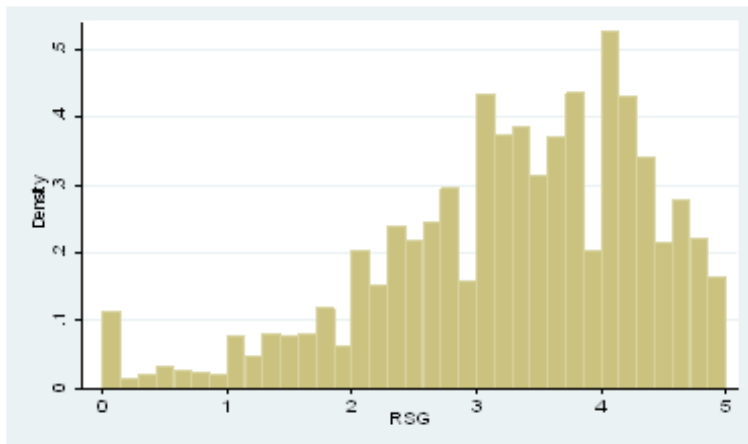
All students



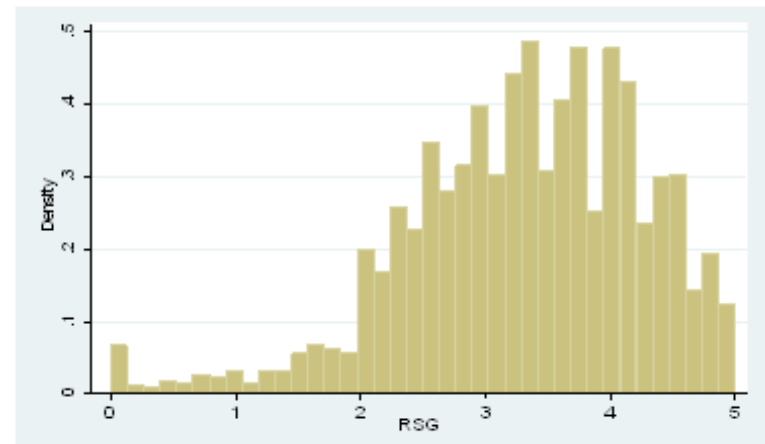
Students without bonus



Students with 10% bonus



Students with 15% bonus



# Comparison of GPA across groups

Semester at university	GPA	GPA no bonus	GPA 10% bonus	GPA 15% bonus
1	3.35	3.37	3.29	3.34
2	3.29	3.27	3.32	3.32
3	3.22	3.21	3.18	3.25
4	3.30	3.29	3.30	3.31
<b>Total</b>	<b>3.30</b>	<b>3.30</b>	<b>3.28</b>	<b>3.32</b>

- In the first semester, GPA of non-beneficiary students is a little higher than other groups.
- In other semesters, students with 15% bonus perform better academically.
- Differences are small and not statistically significant.
- It is necessary to control for other student characteristics...



# Associations of other characteristics with GPA

- **Gender:** men have lower GPAs than women.
- **Age:** older students have lower GPAs than younger students.
- **Marital status:** single students have higher GPAs than those who are married, when not controlling for their major.
- **Semester in university:** there is a general tendency of decline in GPA over time.
- **Semester of entrance:** those who started in 2009/1 and 2010/1 have higher GPAs than those who started in 2010/2.
- **Major:** students in STEM, biology, and health majors had lower GPAs than the reference (pedagogy).
- **Bonus:** GPA differences between students without bonus, 10% bonus, and 15% bonus were not statistically significant.

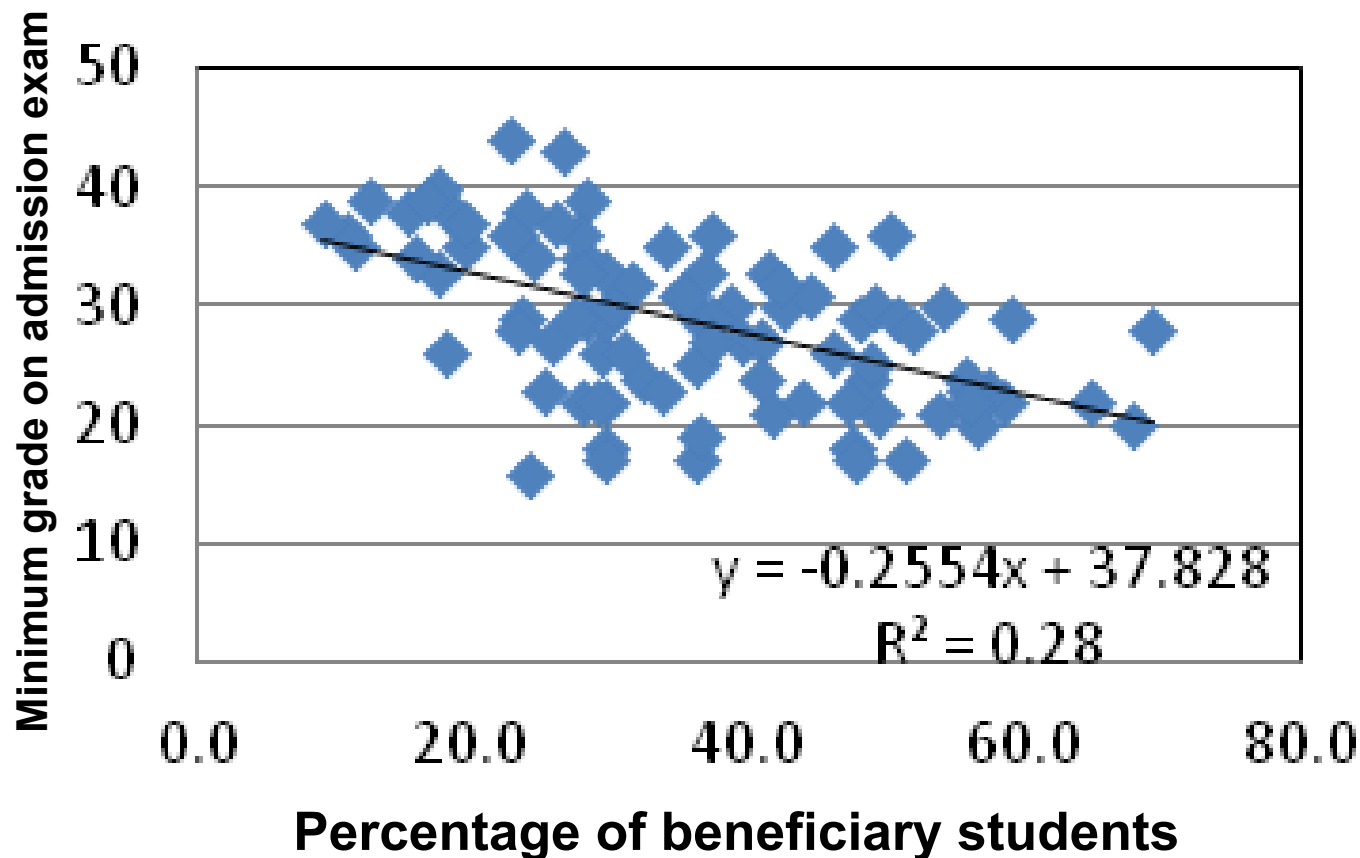
## **Models estimated for subgroups**

- Several models were estimated for subgroups of students to estimate GPA differentials:
  - By bonus category.
  - By semester at university.
  - By semester at university and semester of entrance.

**GPA differentials were small  
and not statistically significant  
between beneficiary and  
non-beneficiary students.**

# Bonus and level of competition in each major

- Percentage of beneficiary students is higher in less competitive majors on admission exam.



## Field, competition, % of beneficiary students

- In general, **differences were not statistically significant.**
- **STEM:** beneficiary students had higher GPAs in more competitive majors and overall.
- **Humanities:** beneficiary students had higher GPAs in less competitive majors with many beneficiary students.
- **Biology/Health:** beneficiary students had lower GPAs in more competitive majors.
- **Arts:** beneficiary students had higher GPAs overall.
- **Agrarian:** beneficiary students had higher GPAs in less competitive majors and lower GPAs in more competitive majors with few beneficiary students.

## Final considerations

- In general, GPAs are similar between students without bonus, 10% bonus, and 15% bonus.
- We controlled our models for several covariates.
- The main disadvantage of beneficiary students seems to be their underrepresentation in more competitive majors.
- There were considerable differences on proportions of beneficiary students by major.
- This issue might have been overcome by the quota law requirement of minimum percentages by major.

# Future projects

- Further studies with **more recent data**, which will allow us to conduct a cohort analysis.
- We intend to **compare policies**: socio-racial bonus period and quota law period.
- **HLM models** can explore individual variables and those related to major.
- Conduct **qualitative research** to understand barriers experienced by beneficiary students in competitive majors:
  - Require more financial investment (materials, books...)?
  - Less friendly environment for students with low SES?