

The Private and Public Returns of University Merit Scholarships

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Motivation

- **College generates large private and social returns**
 - Economic mobility (Zimmerman, 2019)
 - Private returns (Hoekstra, 2009; Zimmerman, 2014; Ost et al., 2018)
 - Social and fiscal returns (Moretti, 2004; Hsieh et al., 2019; Trostel, 2010)
- **These perceived returns motivate public investment in the form of Government Scholarships**
 - Governments heavily subsidize elite higher education in low-income countries
 - Scholarships reward academic achievement, and may expand access
 - Justified by:
 - **Efficiency:** human capital accumulation
 - **Equity:** access for high-ability, low-income students

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A Core Tension in Merit-Based Scholarships

Where low state capacity makes it difficult to assess need, scholarships are often merit-based and **income-blind**.

- Some recipients may be **marginal**: they enroll only because of the scholarship
- Others may be **infra-marginal**: they would enroll anyway, using private resources

Implication: Scholarships may expand access *and/or* reallocate who pays.

Research Questions

Do merit scholarships in Uganda expand enrollment, or mainly shift students across financing channels?

- **Policy focus: Government Merit Scholarship Scheme**
 - National merit scholarships based on exam scores
 - District quota scholarships (also exam-score based)

What are the private and public returns to merit scholarships?

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 - Private returns: Employment, earnings, wage growth
 - Public returns: Tax revenue

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Focus for today: context, data, preliminary results of the first question.

Why Uganda is an Attractive Setting

- **Low but Rapidly Growing College Degree Attainment:**
 - 4.4% of adults held a college degree in 2021
 - Up from 1.7% in 2012 (World Bank, 2021)
- **Government Scholarships and Causal Identification:**
 - The government allocates merit-based scholarships, enabling causal identification of their marginal effects using a regression discontinuity design.
- **Collaboration with Uganda Revenue Authority:**
 - The URA has an infrastructure for research collaboration, enhancing productivity and research partnerships (e.g., Manwaring and Regan (2024); Cohen (2024)).

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Should education subsidies target the university level?

Efficient allocation of education budgets depends on the returns by level.

- Educated individuals play a significant role in fostering economic growth and structural transformation (Romer, 1986; Hanushek and Woessmann, 2008).

Early Childhood Education vs. Higher Education:

- Some point to high returns for **Early Childhood Education** (Heckman et al., 2006).
 - Though other evidence suggests smaller-than-expected benefits (Durkin et al., 2022).
- **Tertiary education** is associated with high returns in Uganda (Kavuma et al., 2015)
- **Both** types of investments can have high (even infinite) MVPF if fiscal externalities from increased earnings recoup costs (Hendren and Sprung-Keyser, 2020)

Contribution

Existing work shows that need-based financial aid increases access in the US

- Dynarski et al. (2023); Dynarski (2003); Bettinger et al. (2019)
- But can adversely affect quality (Cohodes and Goodman, 2014)

And college access improves labor market outcomes in middle-income countries

- Barrios-Fernandez et al. (2023); Sekhri (2020); Londoño-Vélez et al. (2024)

Our contribution:

- Identify causal effects of **merit-based scholarships** in a **low-income country**
 - In low-capacity states, merit is easier to measure than need
- Use tax data to measure MVPF of such scholarships
 - Common in the developing world despite perception as regressive

Outline

Introduction

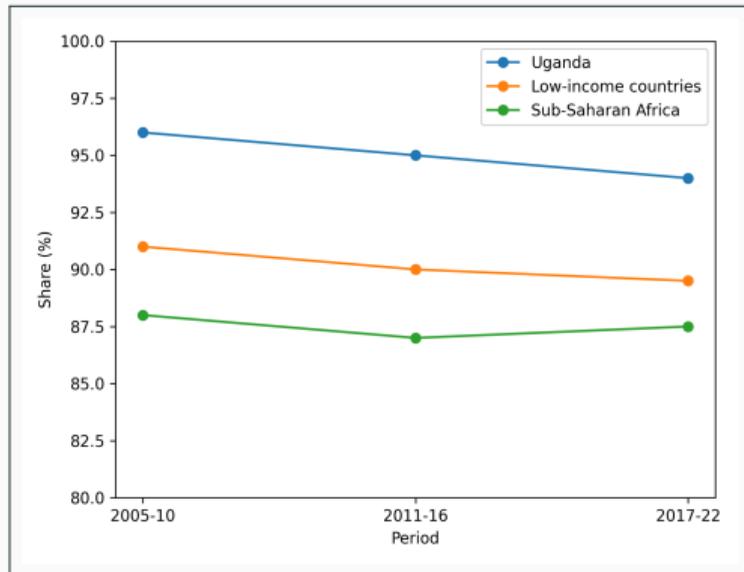
Context

Data

RD Estimates

Discussion and Conclusion

Context: Formal vs. Informal Employment

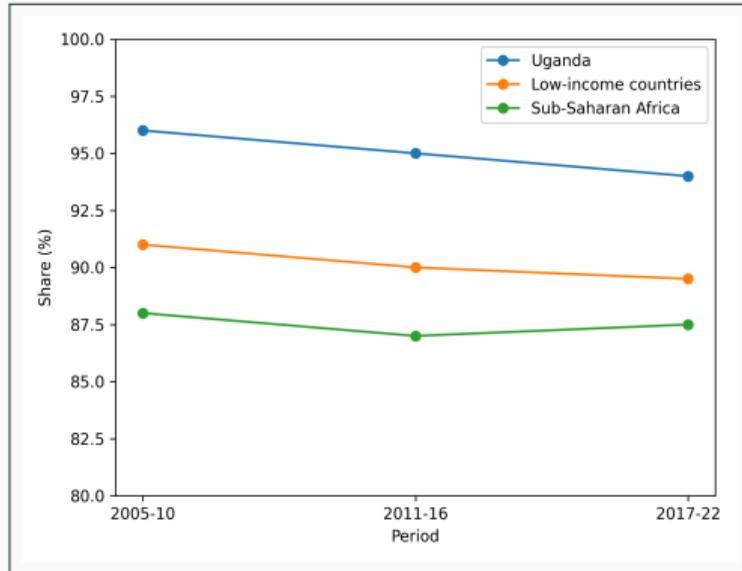


Informal Sector Employment

- Employment is highly informal (International Monetary Fund, 2024).
- Wages are low (median \sim \$50/month)
- About 50% of workers are employed in MSMEs (UBOS, 2020)
- College-educated workers face low unemployment

Implication: Higher education is a key pathway into the formal sector and the tax base.

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Higher Education in Uganda

- **Transition rates**

- ~100K students sit for A-level exams each year; $\leq 60\%$ apply to universities and $\leq 40\%$ apply for scholarships.

- **Institutions**

- 9 public universities account for 54% of university enrollment
- 44 private universities; 227 total HEIs (2019–2020)

- **Enrollment (access is low)**

- Only 5.3% of college-age youth are enrolled in higher education as of 2015, below Sub-Saharan Africa (9.4%) and the global average (38%). (UNCHE, 2023)

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Admission to Ugandan Public Universities

- **Admission channels**

- Students are admitted either on full-ride scholarships or through private entry.
- Scholarship admissions occur first and are centrally administered.

- **Merit-based scholarships**

- Allocated based exclusively on performance on national A-level exams.
- **Direct merit awards:** need-blind, covering full tuition, room, and board for ~3,000 students annually.
- **District quota (place-based):** test-score-based cutoffs applied within districts (700–800 awards) to broaden geographic representation.

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Implication: This system generates rich administrative admissions data with test-score-based eligibility rules, allowing us to observe scholarship assignment, admission outcomes, and private reapplication at the program–year level.

Application Process for Public Merit Scholarships

- Applicants submit an ordered list of up to six program–university choices.
 - E.g., “Economics at University X” is one choice.
- Admissions use a deferred-acceptance–style algorithm with program-specific capacities and test-score rankings.
 - This process generates program-year-specific test score cutoffs.
- Application process for district quota scholarships is parallel and similar.
- Students submit applications **before** exam results and cutoffs are known.
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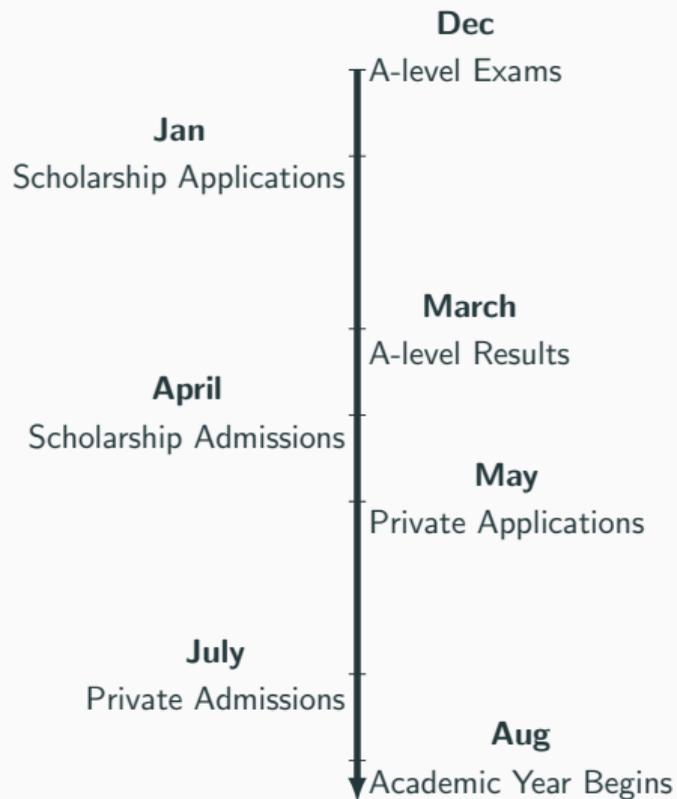
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Implication: These features create program-specific cutoffs which we exploit in a regression discontinuity design.

Application Timeline



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Data: Student Applications

- **Applicants:** All public university applicants, 2014/15–2018/19
 - ~38,000 applications per year through the centralized platform
 - ~75% also submit district-quota preferences
- **Information observed:**
 - Test scores and demographics
 - Ranked program–university choices
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Enrollment and Graduation Outcomes

- **Enrollment (Makerere University)**
 - Administrative transcript / results data
 - Only available for flagship Makerere University (so far)
 - We classify a student as enrolled if they appear in the results database at least once
- **Graduation (All Public Universities)**
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 - Lists include: name, gender, degree awarded
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Data: Labor Market Outcomes

- **URA administrative tax data**
 - Universe of formal-sector income records
 - Monthly earnings, employment spells, and tax payments
- **LinkedIn profiles (complementary)**
 - Employment history and skill composition

URA administrative tax records and LinkedIn will provide our main source of labor-market outcomes (2nd question).

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Summary Stats

Descriptive Statistics for the 2016/2017 cohort

	count	mean	sd	min	max
Female	36,585	0.45	0.50	0	1
Age	32,675	19.37	1.43	16	37
# of choices ranked	36,585	5.52	0.94	0	6
# of distinct universities listed	36,585	2.80	0.92	1	6
Lists Makerere at least once	36,585	0.89	0.31	0	1
A-level Science track	36,445	0.60	0.49	0	1
First choice is STEM	36,264	0.52	0.50	0	1
Admitted on Merit	36,585	0.07	0.25	0	1
Admitted on District Quota	36,585	0.02	0.15	0	1
Admitted on Private	36,585	0.35	0.48	0	1

Digression: Papers and Proceedings

In related work we study application transitions and mistakes, including both application and behavioral errors.

- Although the system is quite complex and students do make mistakes, we do not find these mistakes to be particularly consequential in this context.

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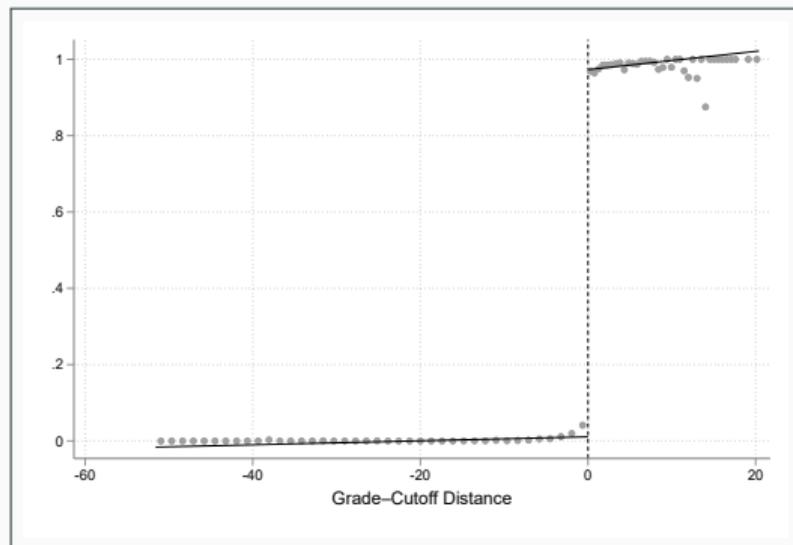
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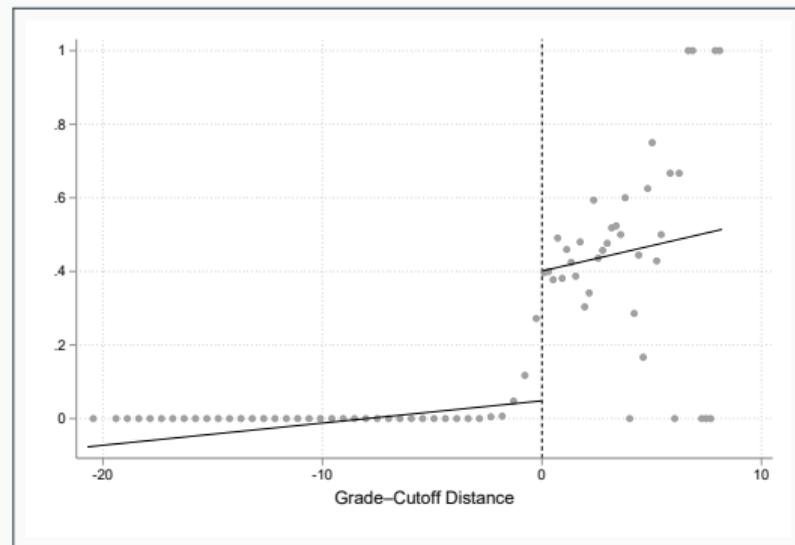
Admissions to Public University via Scholarship Programs

Direct Merit Admission



RD estimate = 0.910

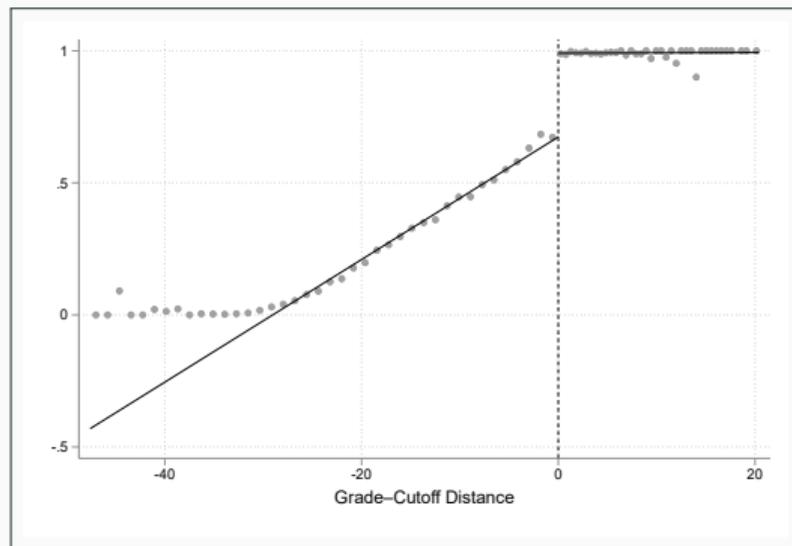
District Quota Admission



RD estimate = 0.046

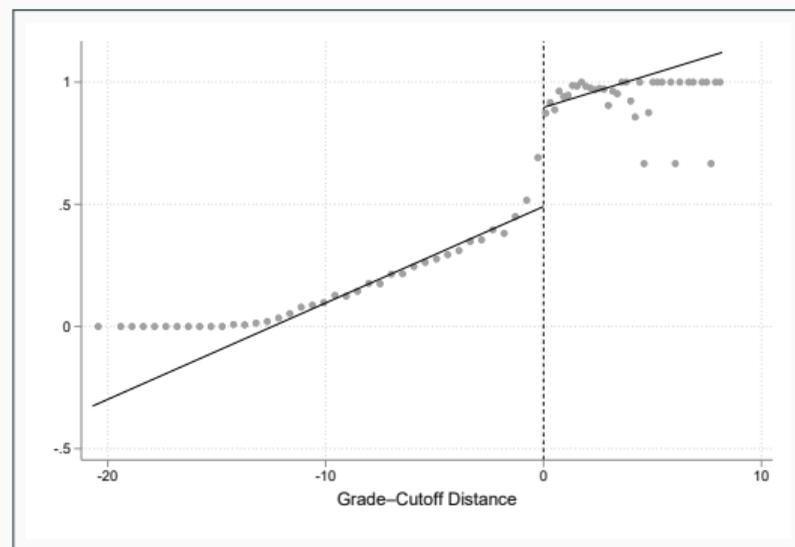
Any Admission: Reapplication and Substitution

Any Admission: Direct Merit Cutoff



RD estimate = 0.277

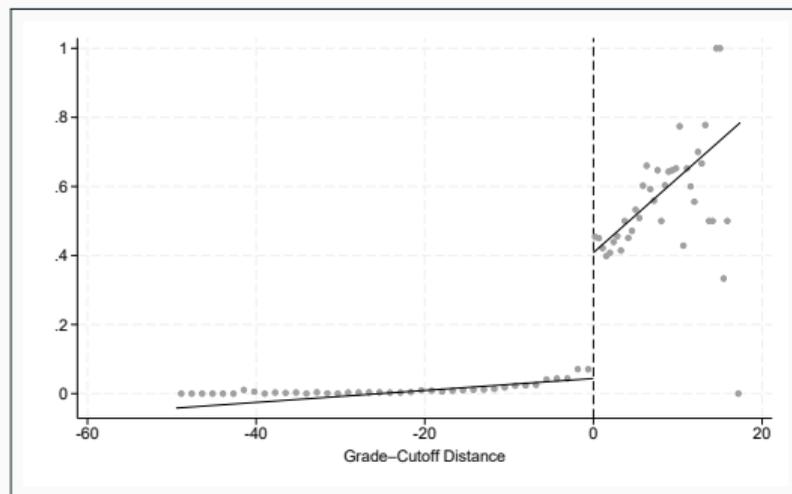
Any Admission: District Quota Cutoff



RD estimate = 0.051

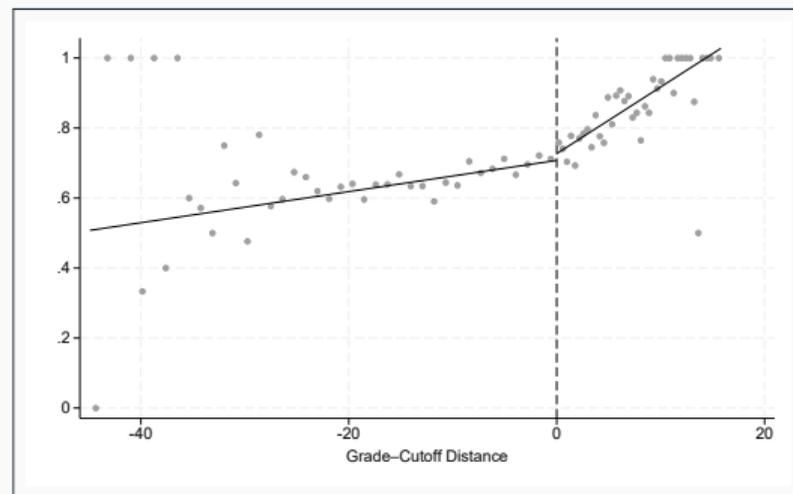
Enrollment (Makerere)

Enrollment via Merit Scholarship



RD estimate = 0.387

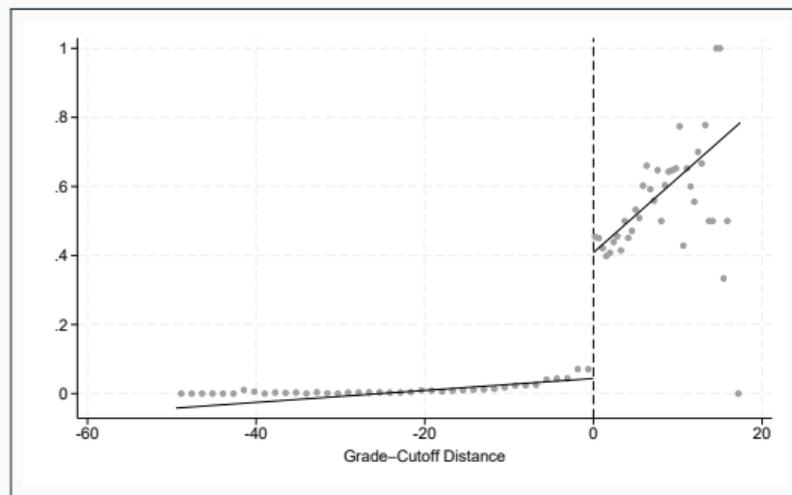
Any Enrollment



RD estimate = 0.015

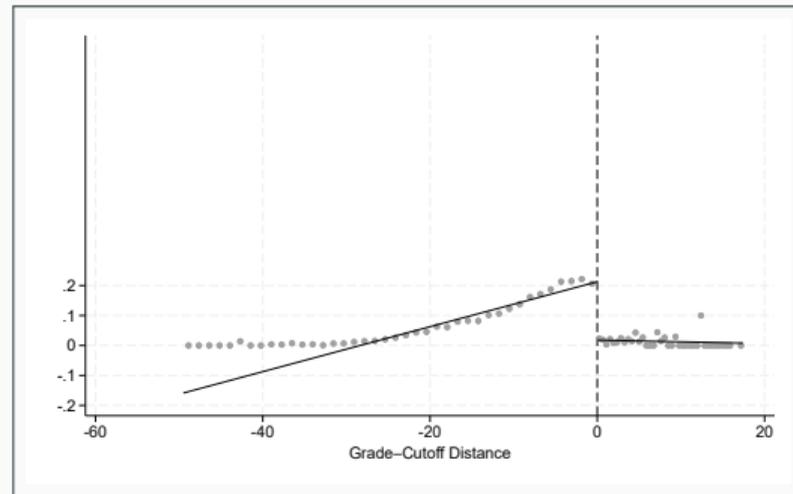
Enrollment (Merit vs Private: Makerere)

Enrollment via Merit Scholarship



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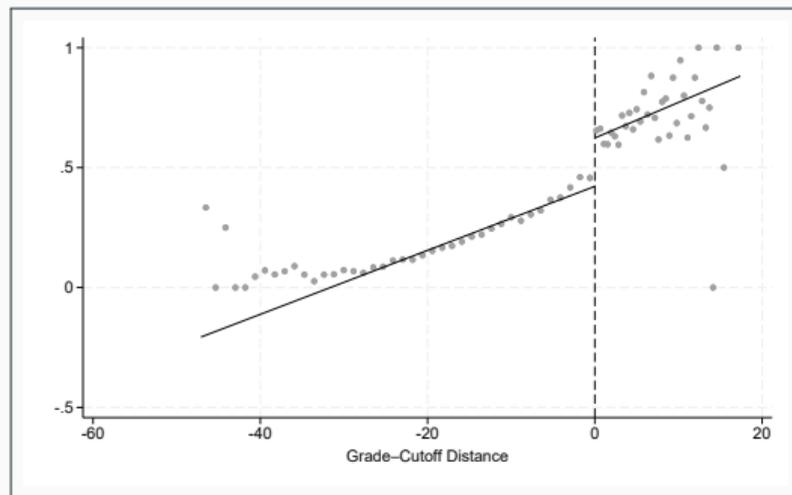
Private Enrollment



RD estimate = -0.175

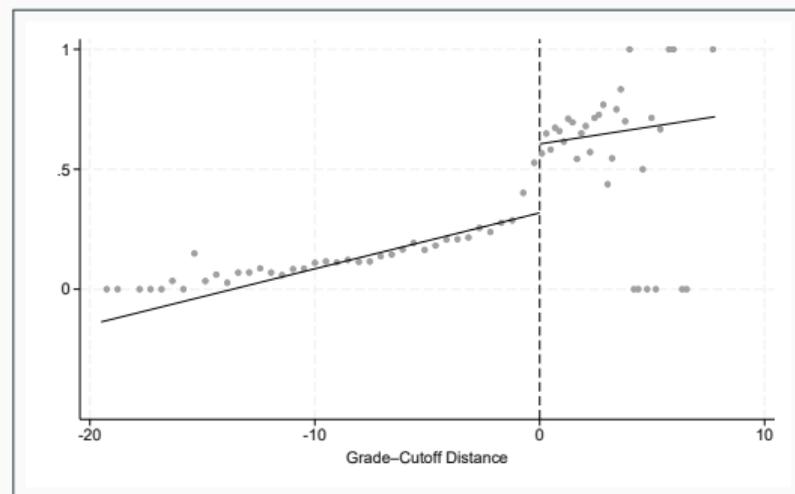
Graduation from any public university

Graduation: Direct Merit Cutoff



RD estimate = 0.206

Graduation: District Quota Cutoff



RD estimate = 0.208

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Transfer vs. Access at the Scholarship Cutoff

Two margins of response to scholarships:

- **Transfer margin (financing shift at entry):**
 - Students who would enroll regardless of scholarship eligibility
 - Shift from private payment to public subsidy upon admission
 - *Empirically:* large discontinuities in admission and merit enrollment, with no meaningful jump in total enrollment at entry
- **Access margin (persistence and completion):**
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Interpretation: The scholarship primarily operates through a **transfer margin at entry**, but generates **moderate access through persistence and completion**.

Next Steps

- **Link to URA administrative tax data**
 - Link applicants/admissions to the URA universe of formal-sector earnings records
- Estimate long-run labor-market impacts
 - RD/IV effects on employment, earnings dynamics, and formal-sector participation
- Compute the MVPF and interpret through access vs. transfer
 - Decompose policy into access (new human capital) vs. transfer (financing shift)
 - Translate labor-market estimates into fiscal externalities (tax revenue / transfers) and WTP (in the spirit of Hendren and Sprung-Keyser (2020))
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The end

Thanks!

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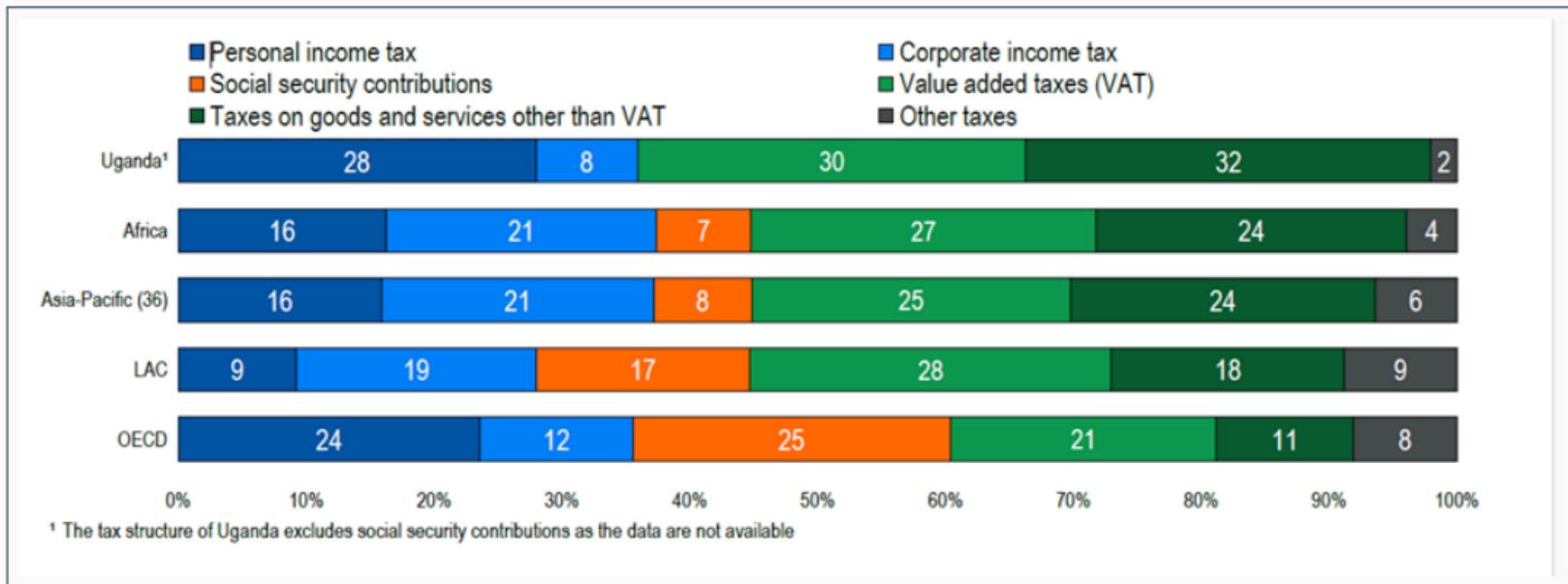
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