The Evolution of Opportunities in Latin America's Fastest Growing Country: 50 years of Evidence

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October 2023

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Outline



2 Constructing a Historical Dataset



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Summary 1/4

Why?:

- We all care about a fundamental question: how do countries develop?
- But we typically lack long series of microdata to document how development varies across groups, space and over time.

What?:

This paper contributes to fill a gap in our knowledge of the long-run evolution of opportunities in developing countries.

- We describe the evolution of 'education opportunities' over the last five decades.
- In Chile, perhaps the fastest-growing country in Latin America.

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Fast Economic Growth& Increase in Higher Education Enrollment



How?:

• We put together a unique dataset from Chile's centralized application and admissions system to higher education.

 \Rightarrow These are detailed administrative records of the population of test takers from 1967 onwards:

- We digitized historical records in paper (exhaustive back-and-forth checking procedures) since 1967 - 2000,
- + We combined them with modern data sources 2000 onwards,
- + We are merging these data with available administrative records (enrollment, graduation, teacher censuses, and more),
- + What else? We welcome ideas!

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Summary 3/4

Findings? We document the following four novel results:

- Gender gap in scores: \Downarrow^- by a factor of ten (0.55 σ to 0.06 σ)
- Ethnic gap: \Downarrow^- by about a half in scores & participation
- Share of low SES taking the exam:
 ^{↑+} by a factor of 1.5 (from 0.36 to 0.55)
- Geography: Exam take-up ↑⁺ for under-represented areas (about 10%)

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Summary 4/4

So?

- We uncover significant long-term progress on a host of metrics.
- This evidence adds to the medium and shorter term evidence available for Chile.
- Despite progress, there are important challegens ahead: shares of top-scorers, measures of quality, and many more.
- Long term view might help us see advances and challenges typically hidden with short tem information
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Research Paper



2 Constructing a Historical Dataset



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Admissions System in Chile

SAT equivalent called *Prueba de Aptitude Academica* in 1967, *Prueba Seleccion Universitaria* starting in 2003.

Up to eight tests, depending on the year.

With the scores in hand, and a GPA equivalent score, students apply to 8-12 options of career and college combinations.

College/Major/Campus triples choose what weights to put on each test and GPA to determine a ranking.

Students are assigned to college/carears in the order of their target specific score until slots are filled up.

Design is thought to be such that it resembles Deferred Acceptanc and there is no incentive for strategic behavior regarding the ordering of preferences.

• The higher education system in Chile has the unique feature of a centralized application and admissions system since 1967.

• The information on all test scores, applications and assignment outcomes were printed in books and newspapers and stored to this day.

Historical Data : Newspapers



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Historical Data : Application and Assignment

• We secured an agreement with the local authorities to use this information and have been able to locate and take digital copies of these books.



Evolution of Opportunities - 50 Years

• We have

- Collected digital copies of old books and newspapers ;
- Sent the images to India to be processed;
- Exhaustive back-and-forth auditing the processed data;
- Supplemented with aggregated info from official reports

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 - Collected digital copies of old books and newspapers ;
 - Sent the images to India to be processed;
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• Significant efforts were made to find, compile, audit and digitize records from archival sources.

- As a result:
 24 Million Test Scores
 - 6.5 Million Observations
 - 135k Pictures [Pre-digital era]
 - 400 Books [Pre-digital era]
 - 50 years of Data



Each year of data consisted of 10-12 books with 300-400 pages each. Three types of books, by subperiod:

Books	1967-1974	1975-76-80	1977-88-{80}
 (A) Scores (Antecedentes) (B) Registration IDs (Indices) (C) Applications (Conglomerado) 	x	x	

Information printed in the books:

(A) Reference number, test scores and high school GPA.

- (B) Reference number, ID number (RUT), name, sex, year of graduation, region, school code.
- (C) Reference number, application majors and scores and admission results.

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- (C) Reference number, application majors and scores and admission results.

Figure: Example: Old Book (A) with PAA Scores

Test ID	Names	Grad.	Year	Score	es	GPA]
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Figure: Example: Old Book (B) with ID number (RUT)

Test ID	N	ames		Sex			RUT -					_
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Note: Personal information intentionally blurred.

Figure: Example: Old Book (B) with Applications

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- We distinguish three components within the 1967-1988 period:
 - The first is to finish the process of digitalizing and processing the scores, applications, and results from 1981-1988.
 - 2 The second piece is to add test score data for all participants from 1967 onward.
 - **3** The final part is adding the scores, applications, and results from 1976-1980.

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Research Paper



2 Constructing a Historical Dataset How Did we Do?: Aggregate vs Recovered Microdata



How Did we Do?: Test-Takers by Year

Old Aggregated Data Sources: Diaz, Himmel, Maltes (1985).

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AñOS	1967	196.8	1969	1970	1971	1972	1973	1974	1975	1976	1977	1978
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Punta-	N 29.678	31.011	36.042	49.244	50.079	76.858	107.818	103.219	119.504	91.445	84.806	102.494
jes	X 16.1	16,9	18,1	17,9	17,7	-16,7	16,1	17,5	19,7	20,7	23,1	23.1
Brutos	s 11.38	11,46	11,24	12,34	13,20	12,62	12,51	13,21	13,43	13,69	14,03	13,30

Year	How Did we Do?: Test-Takers by Year [1967-1988] Aggregated Data (External)
1967	29,678
1968	31,011
1969	36,042
1970	49,244
1971	50,079
1972	76,858
1973	107,818
1974	103,219
1975	119,504
1976	91,445
1977	84,806
1978	102,494
1979	107,274
1980	110,508
1981	117,371
1982	109,351
1983	119,245
1984	122,201
1985	121,169
1986	125,522
1987	114,775
1988	110,652

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Year	How Did we Do?: Te Aggregated Data (Extern	st-Takers by Year [1967-1988] nal) Our Data
1967	29,678	29,655
1968	31,011	31,014
1969	36,042	35,935
1970	49,244	42,759
1971	50,079	50,072
1972	76,858	76,076
1973	107,818	107,795
1974	103,219	103,219
1975	119,504	119,521
1976	91,445	91,424
1977	84,806	84,820
1978	102,494	102,541
1979	107,274	107,275
1980	110,508	110,354
1981	117,371	117,344
1982	109,351	109,196
1983	119,245	119,238
1984	122,201	122,120
1985	121,169	121,164
1986	125,522	125,519
1987	114,775	114,462
1988	110,652	110,650

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Year	How Did we Do?: Test-Ta Aggregated Data (External)	akers by Year [1 Our Data	967-1988] Percentage
1967	29,678	29,655	99.92
1968	31,011	31,014	100.01
1969	36,042	35,935	99.70
1970	49,244	42,759	86.83
1971	50,079	50,072	99.99
1972	76,858	76,076	98.98
1973	107,818	107,795	99.98
1974	103,219	103,219	100.00
1975	119,504	119,521	100.01
1976	91,445	91,424	99.98
1977	84,806	84,820	100.02
1978	102,494	102,541	100.05
1979	107,274	107,275	100.00
1980	110,508	110,354	99.86
1981	117,371	117,344	99.98
1982	109,351	109,196	99.86
1983	119,245	119,238	99.99
1984	122,201	122,120	99.93
1985	121,169	121,164	100.00
1986	125,522	125,519	100.00
1987	114,775	114,462	99.73
1988	110,652	110,650	100.00

How Did we Do?: Test-Takers by Year, Special Subjects

Year	Advanced	Math	Biolog	gy	Chemistry	/Physics	Soc. Scie	ences
	External	Ours	External	Ours	External	Ours	External	Ours
1975	88,976		72,769		72,769		71,610	
1976	73,788		63,998		63,998		63,513	
1977	67,762		56,036		51,913		53,252	
1978	83,446		65,505		65,076		65,776	
1979	85,503		72,165		68,157		72,601	
1980	84,698		73,836		68,629		73,954	
1981	85,255		66,428		58,498		59,306	
1982	73,431		53,743		61,713		45,359	
1983	72,916		57,943		45,852		49,503	
1984	71,939		64,447		36,510		52,097	

How Did we Do?: Test-Takers by Year Special Subjects

Year	Advanced Math		Advanced Math Biology		Chem./F	Physics	Soc. So	Soc. Sciences		
	External	Ours	External	Ours	External	Ours	External	Ours		
1975	88,976	88,672	72,769	72,780	72,769	72,780	71,610	71,498		
1976	73,788	73,692	63,998	64,032	63,998	64,032	63,513	63,529		
1977	67,762	67,587	56,036	56,027	51,913	51,965	53,252	53,143		
1978	83,446	83,383	65,505	65,502	65,076	65,142	65,776	65,798		
1979	85,503	85,213	72,165	71,946	68,157	68,243	72,601	72,507		
1980	84,698	84,453	73,836	73,727	68,629	68,297	73,954	73,813		
1981	85,255	85,170	66,428	66,262	58,498	58,324	59,306	59,116		
1982	73,431	73,215	53,743	53,502	61,713	61,426	45,359	45,244		
1983	72,916	72,865	57,943	57,836	45,852	45,684	49,503	49,462		
1984	71,939	71,808	64,447	64,296	36,510	36,385	52,097	51,998		

How Did we Do?: Test-Takers by Year [1989-2003]

Year	Aggregated Data (External)	Our Data	Percentage
1989	108,871	108,855	99.99
1990	112,091	112,090	100.00
1991	118,778	118,778	100.00
1992	121,824	121,364	99.62
1993	135,081	135,221	100.10
1994	129,048	129,050	100.00
1995	125,444	125,432	99.99
1996	119,643	119,588	99.95
1997	132,664	132,610	99.96
1998	144,381	142,382	98.62
1999	154,244	154,244	100.00
2000	165,904	165,908	100.00
2001	171,491	171,879	100.23
2002	181,640	182,019	100.21
2003	181,063	181,486	100.23



Research Paper



2 Constructing a Historical Dataset



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Women taking College Entrance Exam



Women eligible for Elite College/Majors



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Gender Gap in Average Math/Lang Score



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Disadvantaged Groups @ Elite College/Majors

Mapuche Descendants

Low SES



Share in Top 5% by Ethnicity



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Geography



(c) Municipalities with low levels of schooling in the 1980s

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Low SES



All Test-Takers Progress



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Test-Takers Progress for Elite Degrees



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Conclusion

- We uncover significant long-term progress on a host of metrics.
- This evidence adds to the medium and shorter term evidence available for Chile.
- Despite progress, there are important challegens ahead: shares of top-scorers, measures of quality, and many more.
- Long term view might help us see advances and challenges typically hidden with short tem information
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