

**Latin American Laboratory for Assessment of the Quality  
of Education - LLECE**

**Using Stata to assess the  
achievement of Latin American  
students in Mathematics,  
Reading and Science**

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# Outline

- 1. Why Stata?**
- 2. What the SERCE is?**
- 3. Stata at work**
- 4. Challenges**
- 5. Concluding remarks**

# 1. Why Stata?

- **Managing Complex Designs**
  - Weights, strata, psu's, fpc, etc.
- **Alternative variance estimation methods: Taylor linearization, Replication Methods and Bootstrap**
- **Matrix Language (Watson, 2005)**
  - Allows you to store estimation results
- **Programming and Macros**
  - Allows you to automate the whole estimation and testing process.

## 2. What the SERCE is?

- **Second Regional Comparative and Explanatory Study (OREALC/UNESCO Santiago, 2008)**
- **Objective: Give insight into the learning acquired by Latin American and Caribbean students and analyze the associated factors related to that learning.**
  - **Primary school students who during the period 2005 /2006 attended third and sixth grades**
  - **Areas of Mathematics, Language (Reading and Writing) and Natural Science.**
- **Collective effort of the National Assessment Systems in Latin America and the Caribbean, articulated by the Laboratory for Assessment of the Quality of Education (LLECE).**

# Participants



## 2. What the SERCE is?. Instruments

### ◆ Tests:

- **Asses conceptual domains and cognitive processes.**
- **Based on common curricular elements (OREALC/UNESCO Santiago, 2005) and the life-skills approach (Delors et al. ,1996)**
- **IRT to asses students' ability**
- **Items:**
  - **4 Levels of Performance**
  - **Balanced incomplete blocks of Items.**
  - **Close and open-ended questions**

### ◆ Questionnaires

- **Students, teachers, principals, and parents.**

## 2. What the SERCE is?. Design

- **Stratification:**
  - **3 Domains: Rural, Urban Public, Urban Private**
  - **Aprox. 14 Strata on each country**
- **Clustered Sampling:**
  - **Simple random sample (SRS) of schools (PSU's) without replacement**
  - **All third and sixth grade students on each selected school**

<b>Schools</b>	<b>Classrooms</b>		<b>Students</b>	
	<b>3rd</b>	<b>6th</b>	<b>3rd</b>	<b>6th</b>
3.065	4.627	4.227	100.752	95.288

- **The design is approximated by a two-stage stratified design with PSUs sampled with replacement**

## 2. What the SERCE is?. Design and...

- **Weights:**
  - Take into account unequal probabilities of selection, stratification, clustering, non-response and undercoverage
- **Taylor linearization to estimate variance (Wolter, 1985; Shao, 1996; Judkins, 1990; Kreuter & Valliant, 2007)**
  - + No Computationally intensive
  - Releasing of the unit identifiers in public data sets
- **SERCE's first report:**
  - Mean scores and Proportions and Hypothesis Testing.
- **Databases and technical documentation will be publicly available in 2009/1**

### 3. Stata at work. Database

```
. use m3, clear
```

```
. describe
```

Contains data from **m3.dta**

obs: 96.663

vars: 92

size: 15.466.080 (98,4% of memory free)

7 Nov 2008 20:20

variable name	storage type	display format	value label	variable label
pais	str2	%2s		País
centro_educat~o	str3	%3s		Centro educativo
grado	str1	%1s		Grado
aula	str2	%2s		Aula
area	str1	%1s		Área
estudiante	str2	%2s		Estudiante
cuadernillo	str2	%2s		Cuadernillo
bloque_primera	str1	%1s		Bloque primera
bloque_segunda	str1	%1s		Bloque segunda
LlavePaisCentro	str5	%5s		Identificador del país
id_grado	str6	%6s		Identificador de grado
id_gradoaula	str8	%8s		Identificador de aula
id_alumno	str10	%10s		Identificador de alumno
admrur	byte	%12.0f	admrur	Primera variable de est
estrato	long	%12.0f	estrato	Estratificacion aprigri

### 3. Stata at work. Declaring Complex Design

```
. svydescribe
```

```
Survey: Describing stage 1 sampling units
```

```

pweight: peso_estudiante
VCE: linearized
Single unit: missing
Strata 1: estratoregional
SU 1: LlavePaisCentro
FPC 1: <zero>

```

Stratum	#Units	#Obs	#Obs per Unit		
			min	mean	max
10000000	9	167	9	18,6	25
10000000	31	1591	29	51,3	100
10000000	13	1230	70	94,6	133
10000000	8	210	15	26,3	43
10000000	12	748	30	62,3	95
10000001	24	286	3	11,9	30
10000001	5	234	20	46,8	116
10000001	3	61	8	20,3	36
10000001	7	330	23	47,1	72
10000001	4	512	63	128,0	233
10000001	4	84	6	21,0	35
10000001	4	213	38	53,3	71

### 3. Stata at work. Means

```
. svy, subpop(serce) : mean puntaje_escal_a_m3  
(running mean on estimation sample)
```

Survey: Mean estimation

Number of strata =	241	Number of obs =	91252
Number of PSUs =	2686	Population size =	10907247
		Subpop. no. obs =	91252
		Subpop. size =	10907247
		Design df =	2445

	Mean	Linearized Std. Err.	[95% Conf. Interval]	
puntaje_es~3	505,1089	2,404318	500,3942	509,8236

Note: 13 strata omitted because they contain no subpopulation members.

### 3. Stata at work. Proportions

```
. svy, subpop(serce): proportion (nivel)
(running proportion on estimation sample)
```

Survey: Proportion estimation

```
Number of strata =      241      Number of obs      =      91252
Number of PSUs   =      2686     Population size     =     10907247
                                           Subpop. no. obs    =      91252
                                           Subpop. size       =     10907247
                                           Design df          =      2445
```

```
_prop_1: nivel = <I
```

	Proportion	Linearized Std. Err.	[95% Conf. Interval]	
<b>nivel</b>				
_prop_1	,1122651	,0057282	,1010324	,1234978
I	,1430188	,0044257	,1343402	,1516973
II	,282574	,0044472	,2738533	,2912946
III	,3602692	,0078467	,3448823	,375656
IV	,101873	,0043448	,0933531	,1103929

Note: 13 strata omitted because they contain no subpopulation members.

### 3. Stata at work

#### ➤ Perform hypothesis testing and store results

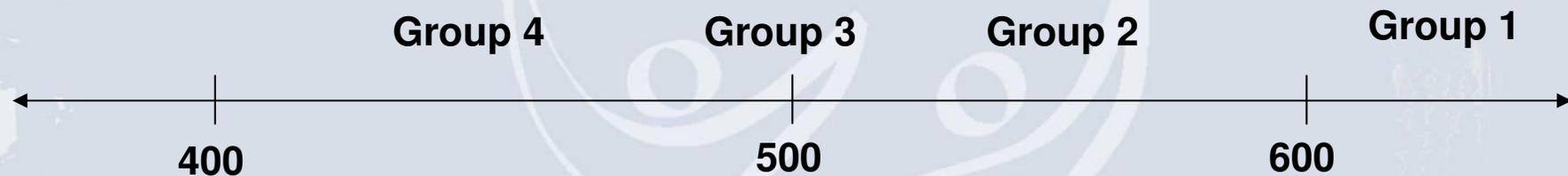
```
. svy, subpop(serce) : mean puntaje_escal_a_m3, over(rural)
. lincom [puntaje_escal_a_m3]Rural - [puntaje_escal_a_m3]Urbana
( 1) - [puntaje_escal_a_m3]Urbana + [puntaje_escal_a_m3]Rural = 0
```

	Coef.	Std. Err.	t	P> t	[95% Conf.
(1)	-51,08027	3,817521	-13,38	0,000	-58,56618

```
. matrix define Rural = ( r(estimate), r(se) , r(estimate)/r(se) , 2
. mat colnames Rural = Coef se t P_value df
. mat rownames Rural = Total
. mat list Rural
Rural[1,5]
Total   Coef      se      t      P_value      df
Total  -51,080273  3,8175211  -13,380482  1,855e-39  2445
```

### 3. Stata at work

- **Automation of the estimation and testing process**
  - To classify countries into groups according to its difference with the region's mean (500 with 100 of standard deviation)



- **Bonferroni's Test**
  - For each country: Test country mean score against other countries means
  - In Reading 6<sup>th</sup> aprox.  $17 \times 17 = 289$  test to be performed

## Mean scores comparison Reading, 6th grade

	Promedio países	Argentina	Brasil	Chile	Colombia	Costa Rica	Cuba	Ecuador	El Salvador	Guatemala	México	Nicaragua	Panamá	Paraguay	Perú	R. Dominicana	Uruguay	Nuevo León
Argentina	=		=	▼	=	▼	▼	▲	▲	▲	▼	▲	▲	▲	▲	▲	▼	▼
Brasil	▲	=		▼	=	▼	▼	▲	▲	▲	=	▲	▲	▲	▲	▲	▼	▼
Chile	▲	▲	▲		▲	▼	▼	▲	▲	▲	▲	▲	▲	▲	▲	▲	=	=
Colombia	▲	=	=	▼		▼	▼	▲	▲	▲	▼	▲	▲	▲	▲	▲	▼	▼
Costa Rica	▲	▲	▲	▲	▲		▼	▲	▲	▲	▲	▲	▲	▲	▲	▲	▲	▲
Cuba	▲	▲	▲	▲	▲	▲		▲	▲	▲	▲	▲	▲	▲	▲	▲	▲	▲
Ecuador	▼	▼	▼	▼	▼	▼	▼		▼	=	▼	▼	▼	=	▼	▲	▼	▼
El Salvador	▼	▼	▼	▼	▼	▼	▼	▲		▲	▼	▲	▲	▲	=	▲	▼	▼
Guatemala	▼	▼	▼	▼	▼	▼	▼	=	▼		▼	▼	▼	=	▼	▲	▼	▼
México	▲	▲	=	▼	▲	▼	▼	▲	▲	▲		▲	▲	▲	▲	▲	▼	▼
Nicaragua	▼	▼	▼	▼	▼	▼	▼	▲	▼	▲	▼		=	▲	=	▲	▼	▼
Panamá	▼	▼	▼	▼	▼	▼	▼	▲	▼	▲	▼	=		▲	=	▲	▼	▼
Paraguay	▼	▼	▼	▼	▼	▼	▼	=	▼	=	▼	▼	▼		▼	▲	▼	▼
Perú	▼	▼	▼	▼	▼	▼	▼	▲	=	▲	▼	=	=	▲		▲	▼	▼
R. Dominicana	▼	▼	▼	▼	▼	▼	▼	▼	▼	▼	▼	▼	▼	▼	▼		▼	▼
Uruguay	▲	▲	▲	=	▲	▼	▼	▲	▲	▲	▲	▲	▲	▲	▲	▲		=
Nuevo León	▲	▲	▲	=	▲	▼	▼	▲	▲	▲	▲	▲	▲	▲	▲	▲	=	

## 4. Challenges

- **Alternative Variance estimation methods**
  
- **Multilevel analysis**
  - **There is a first regional analysis**
  - **Country specific analysis**
  
- **LLECE and SERCE:**
  - **SERCE “pilot” of the Third study**
  - **Human resources, facilities and funding restrictions**
  - **LLECE network of the National Evaluation Systems**

## 5. Concluding remarks

- **We have presented the estimation of the main results of the first report of the SERCE**
  - **SERCE:**  
**Assessment of the performance in the domains of Mathematics, Reading and Science of third and sixth grades students in sixteen countries of Latin America and the Caribbean in 2005/2006.**
  - **Mean scores and their variability by country, areas, grades and some subpopulations.**
  - **Comparisons made in order to check for the differences in performance.**

## 5. Concluding remarks

- **Stata's good properties to analyze survey data.**
  - **Take in to account important aspects of a complex survey design**
  - **Availability of alternative variance estimation methods.**
  - **Automation the whole estimation and testing process using matrix and macro language Stata**

# References

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**Thanks for you attention!**

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**<http://llece.unesco.cl/ing/>**