

Towards building capacity on Spatial Analysis

A data-wrangling focused workshop

Manuel Lopez Bugueno

Graduate School of International Development, Nagoya University

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Outline

- 1 Workshop objectives
- 2 Case study overview
- 3 Case study research design
- 4 Case study results
- 5 Basic data wrangling
- 6 Practice yourself

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Workshop objectives

- ① To develop capacity on geographic and economic data wrangling for spatial analysis
- ② To get familiar with data analysis tools: Stata, Python, GeoDa
- ③ To manage basic spatial econometrics' concepts:
 - ▶ Exploratory spatial data analysis (ESDA)
 - ★ Visualizing simple spatial distributions
 - ★ Weight matrixes
 - ★ Global spatial autocorrelation
 - ★ Local spatial autocorrelation
 - ★ HH, LL, HL, LH clusters
- ④ To perform ESDA

Today's outline

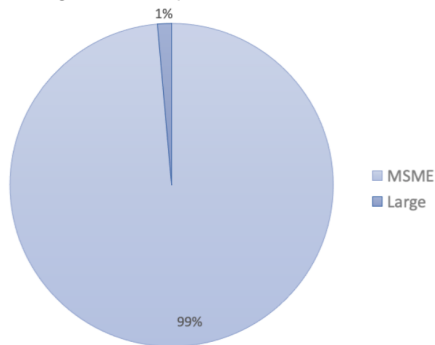
- 1 Applied spatial econometric concepts
- 2 Review of basic geographic, satellite and economic data sources
- 3 Basic data wrangling in Stata

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MSMEs are key for growth but they face historic and structural challenges

Registered companies with sales - 2021



- ▶ 98.6% of registered companies with sales
- ▶ 55.3% of employment
- ▶ 14.55% of total registered sales
- ▶ Structural challenges: necessity, innovation and added value capacities, rigidity, access to markets, finance, others

Source: Author's work using official data, 2021

Literature review

A wide range of literature has been developed over the past two decades noting the relevance of MSMEs to growth:

- They are key agents for diffusing knowledge and innovations, boosting competition, and contributing to employment (Beck et al., 2005) (Acs et al., 2008)

Literature review

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- They are key agents for diffusing knowledge and innovations, boosting competition, and contributing to employment (Beck et al., 2005) (Acs et al., 2008)
- They can help bridge the gap between knowledge and total factor productivity (Solow, 2007)
- Influenced by the stage of development of a country (Porter,):
 - ▶ Factor-driven.
 - ▶ Efficiency-driven.
 - ▶ Innovation-driven.
- Their contribution is positively related to the level of human capital. As human capital level increases, more innovative high-growth potential firms can be expected (Qian Acs, 2013)
- Evidence also shows that birth rate is also relevant for development at the subnational level (Bruce et al., 2009)

Literature review

Developing countries:

- Labor-intensive, low-tech activities, less-qualified human capital → lower growth (Acs et al., 2008).
- Institutional challenges. Empirical evidence for ASEAN+1 and Latin America (Ha et al., 2008) (Acs and Amoros, 2008).
- Key paper by Cravo (2015) applies spatial methods to the municipal in Brazil (Cravo, 2015)

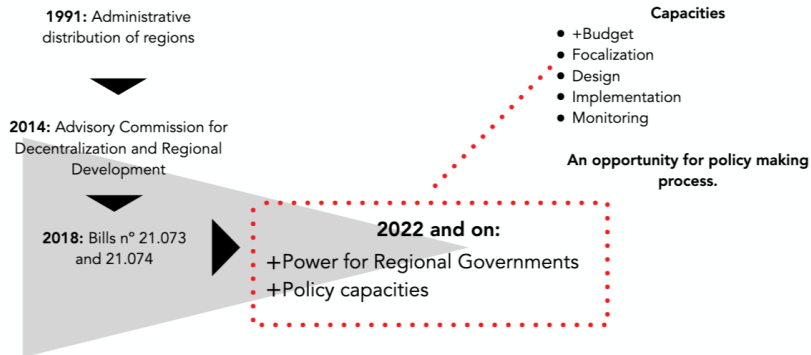
Chile: strong institutional infrastructure

- Support in key stages: starting-up a company, scaling business models, digital transformation, productivity, others.
- Nº 1 in SME Development Services in Latin America in 2019 → OECD.

Chile: strong institutional infrastructure facing new challenges

- Lack of a formal policy/strategy that defines strategic intent, short-term, long-term goals.
- Lack of a formal and binding governance.
- Hundreds of instruments, mostly designed centrally.

Decentralization process: An opportunity for regional development



Source: Author's work based on literature.

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This case's research design

1 Objective

- ▶ To provide an exploratory standpoint on spatial interactions related to MSMEs economic activity.
 - ★ Question 1 → How can Chilean policy makers target policy actions?
 - ★ Question 2 → Does space play a relevant role when evaluating MSMSE economic activity?
 - ★ Question 3 → Where does MSME activity concentrate over space?

2 Data

- ▶ Sales - IRS, 2021
- ▶ Population projections - NIS, 2021
- ▶ Official map adm3 - UREDE, 2021

3 Methods

- ▶ Exploratory Spatial Data Analysis

This case's research outputs

- Crossectional analysis of the MSME economic activity in Chile, 2020 (**IMPORTANT:** only one variable analyzed).
- Global spatial autocorrelation analysis → Global cluster patterns → Moran's I.
- Local spatial autocorrelation analysis → Local Cluster Analysis.

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Global Spatial Auto-correlation Analysis

- Up to what extent geographical units influence their neighbours → Overall clustering patterns.
- Measured by Moran's I Statistic: -1 to 1.
- 2020 data analysis.
- Weight matrix $k=4$.

IMPORTANT! Before continuing: What's Moran's I?

- Moran's I is the indicator that measures global spatial autocorrelation.
- Meaning that global spatial autocorrelation refers to the existence of regional relations at an overall level.
- In simple words, it measures how strong is the relationship of the regions at study in terms of a particular variable.
- From an overall standpoint, it helps answers the question "Is the role of space relevant when analyzing a specific variable?" .

NOTE: More formal and detailed definitions are contained in the materials that will be provided later on.

Global Spatial Auto-correlation Analysis - Sales

Moran's I $k=4$, 10% significance - Sales

- 2018 \rightarrow 0.105

Global Spatial Auto-correlation Analysis - Sales

Moran's I $k=4$ - Sales

- 2005 \rightarrow 0.110
- 2020 \rightarrow 0.105

What could be derived from such Moran's I value?

Local Indicator of Spatial Auto-correlation Analysis (LISA)

- Moran's I provides overall vision. LISA → what cities are clustering at significant levels.
- Weight matrix: Knn=4.
- Significance → 0.10 → many 1-city clusters.

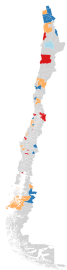
IMPORTANT! Before continuing: What's LISA?

- LISA is a statistical method used to identify spatial clusters of high or low values within a dataset.
- It helps reveal where similar values are geographically concentrated.
- It helps pinpoint specific locations where certain attributes exhibit significant spatial relationships, enabling insights into local patterns, hotspots, and potential spatial dependencies within the data..
- From an overall standpoint, it helps answers the questions "Where are spatial regimes located?" or "Where should I target a policy?".

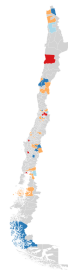
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Local Spatial Auto-correlation Analysis (LISA) - Sales

Spatial clusters and outliers knn 4 - Sales 2005 ($p < 0.10$)



Spatial clusters and outliers knn4 - Sales 2020 ($p < 0.10$)



Overall Spatial Patterns - Sales

Log of MSME Sales 2005 (Three natural breaks)



Log of MSME Sales 2020 (Three natural breaks)



Local Spatial Auto-correlation Analysis (LISA) - Sales

Number of cities by cluster and year - Sales

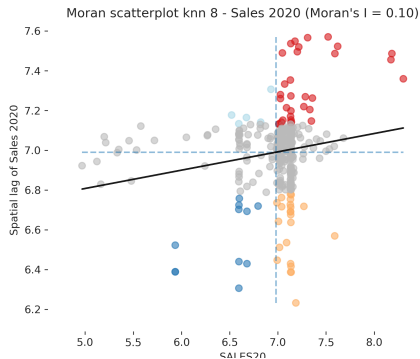
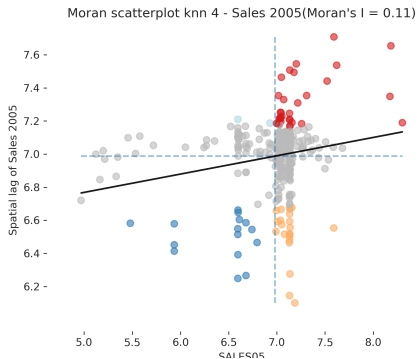
Quadrant	2005	2020
HH	32	24
HL	20	18
LL	15	10
LH	3	9
Total significant	70	61
Non-significant	275	284

Source: Author's calculation

The most notorious patterns:

- HH cluster → slight decrease Metropolitan, central and northern macrozone.
- LL cluster → slight decrease, highly concentrated in Austral macrozone by 2020.

Local Spatial Auto-correlation Analysis



The graph in the right says knn 8 and it must say knn 4.

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Basic data wrangling?

Geographic data:

- Where can I get a map for the country/region I want to analyze?
- Where can I get satellite, economic, and demographic data **(fast)**?

Basic data wrangling?

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- Where can I get a map for the country/region I want to analyze?
- Where can I get satellite, economic, and demographic data **(fast)**?

GeoQuery.

Basic data wrangling:

Managing data:

- How can I get my data prepared for ESDA?
- How can I check basic summary Statistics?

Let's go to Stata.

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Basic data wrangling:

- Get the map, annual ntl, and population for the country of your interest. Use 2 years, the same for each variable.
- Perform basic transformations.
- Make summary statistics for your variables of interest.
- Reshape dataset

References

- Acs, Z. and Amoros, J. (2008).
Entrepreneurship and competitiveness dynamics in latin america.
Small business Economics, pages 305–322.
- Acs, Z., Desai, S., and Hessels, J. (2008).
Entrepreneurship, economic development and institutions.
Small business Economics, pages 219–234.
- Beck, T., Demirguc-Kunt, A., and Levine, R. (2005).
Smes, growth, and poverty: Cross-country evidence.
Journal of Economic Growth, pages 199–229.
- Bruce, D., Deskins, J., Hill, B., and Rork, J. (2009).
(small) business activity and state economic growth: Does size matter?
Regional studies.