

Geographic Data Science - Lecture VI

Exploring Space in Data

[Dani Arribas-Bel](#)

Today

- ESDA
- Spatial Autocorrelation
- Measures
 - Global
 - Local

ESDA

Exploratory

Spatial

Data

Analysis

[Exploratory]

Focus on discovery and assumption-free investigation

[Spatial]

Patterns and processes that put *space* and *geography* at the core

[Data Analysis]

Statistical techniques

Questions that **ESDA** helps...

Answer

- *Is the variable I'm looking at concentrated over space? Do similar values tend to locate closeby?*
- *Can I identify any particular areas where certain values are clustered?*

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- *Is the variable I'm looking at concentrated over space? Do similar values tend to locate closeby?*
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Ask

- *What is behind this pattern? What could be generating the process?*
- *Why do we observe certain clusters over space?*

Spatial Autocorrelation

Everything is related to everything else, but near things are more related than distant things

Waldo Tobler (1970)

Spatial Autocorrelation

- Statistical representation of Tobler's law
- Spatial counterpart of traditional correlation

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Degree to which similar values are located in similar locations

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Degree to which similar values are located in similar locations

Two flavors:

- **Positive:** similar values → similar location (*closeby*)
- **Negative:** similar values → dissimilar location (*further apart*)

Examples

Positive SA:

Negative SA:

Examples

Positive SA: income,

Negative SA:

Examples

Positive SA: income, poverty,

Negative SA:

Examples

Positive SA: income, poverty, vegetation,

Negative SA:

Examples

Positive SA: income, poverty, vegetation, temperature...

Negative SA:

Examples

Positive SA: income, poverty, vegetation, temperature...

Negative SA: supermarkets,

Examples

Positive SA: income, poverty, vegetation, temperature...

Negative SA: supermarkets, police stations,

Examples

Positive SA: income, poverty, vegetation, temperature...

Negative SA: supermarkets, police stations, fire stations,

Examples

Positive SA: income, poverty, vegetation, temperature...

Negative SA: supermarkets, police stations, fire stations, hospitals...

Scales

[Global]

Clustering: do values tend to be close to other (dis)similar values?

Scales

[Global]

Clustering: do values tend to be close to other (dis)similar values?

[Local]

Clusters: are there any specific parts of a map with an extraordinary concentration of (dis)similar values?

Global Spatial Autocorr.

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"Clustering"

Overall trend where the distribution of values follows a particular pattern over space

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[Positive] Similar values close to each other (high-high, low-low)

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[Negative] Similar values far from each other (high-low)

Global Spatial Autocorr.

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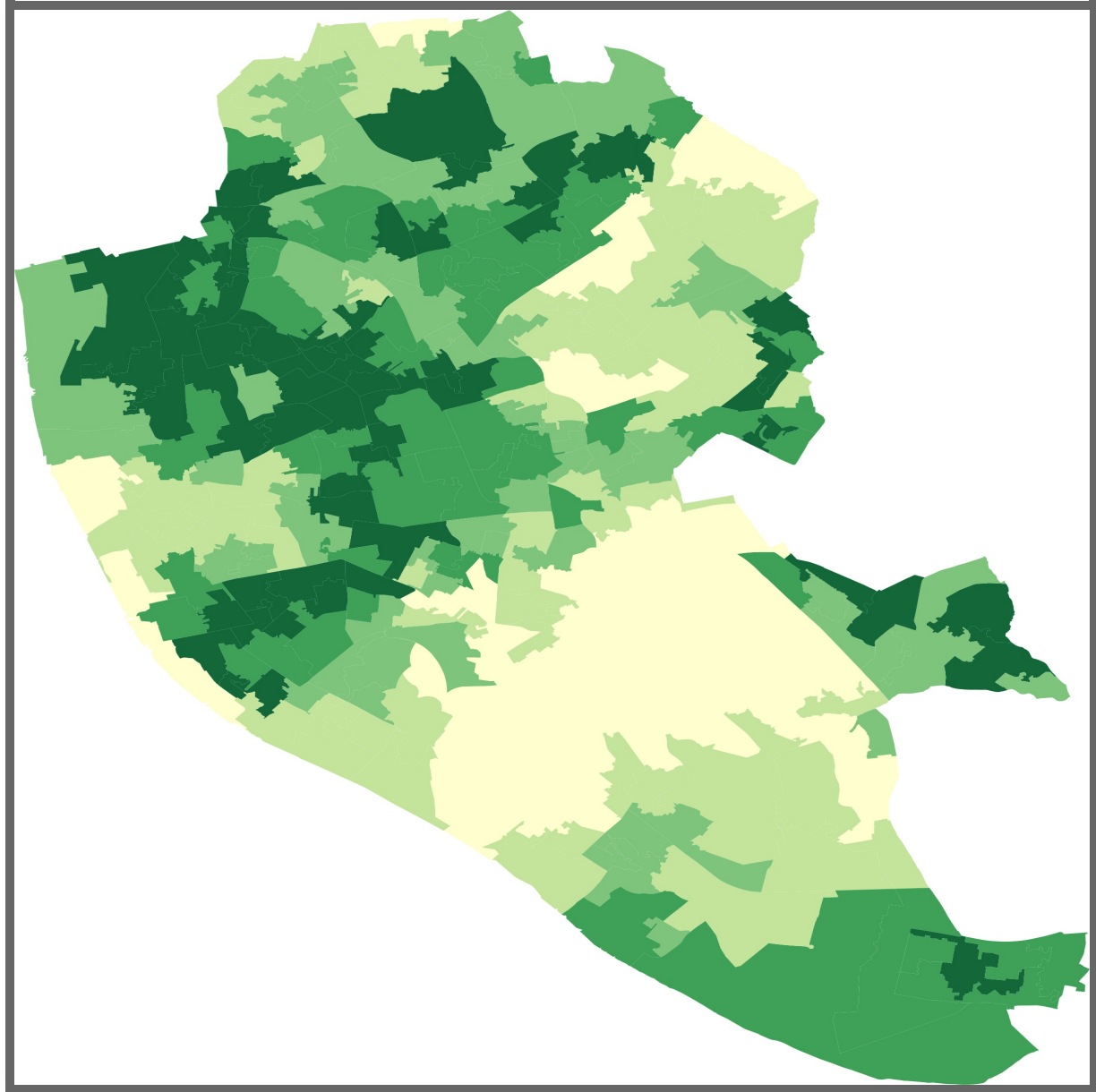
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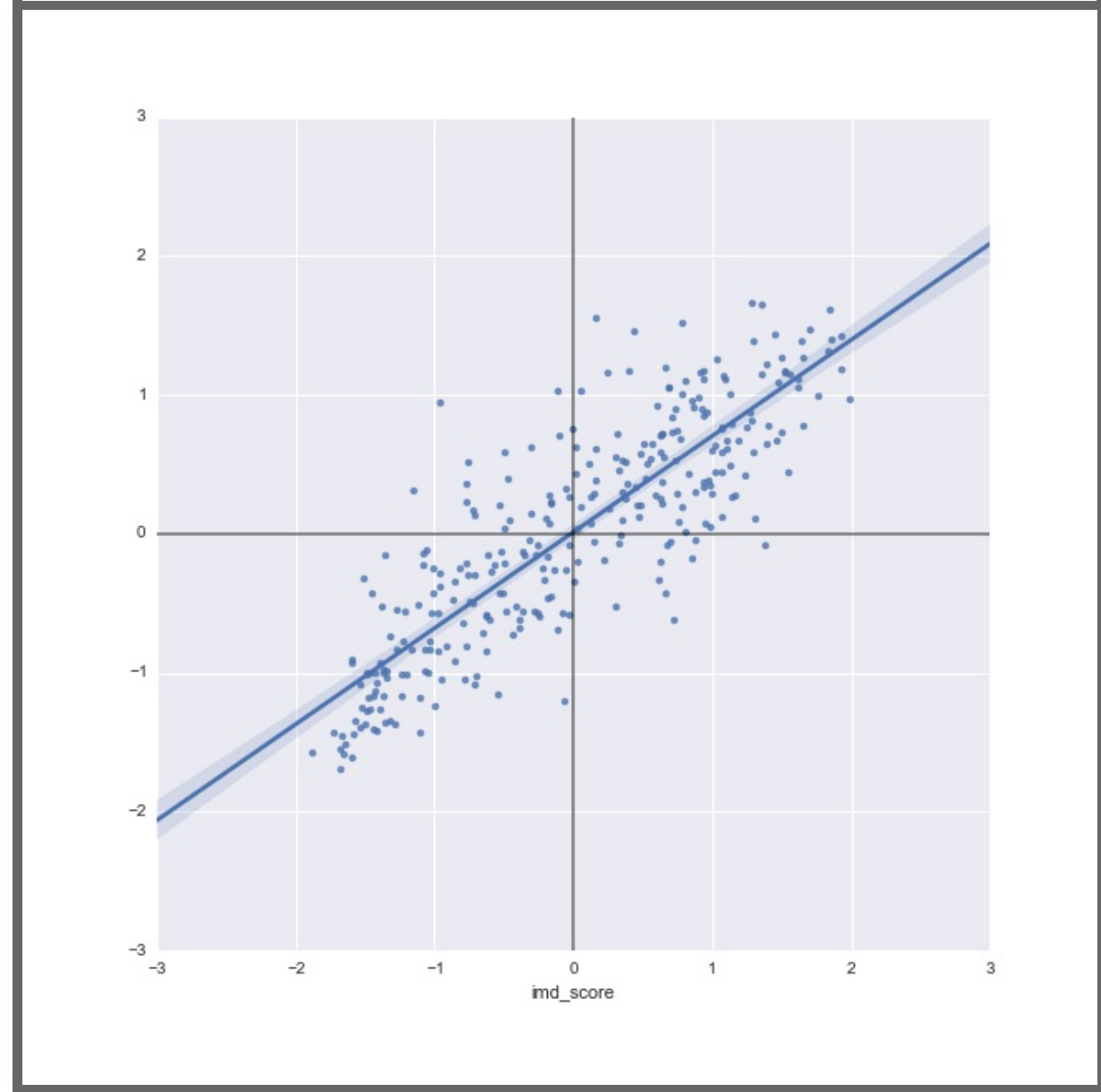
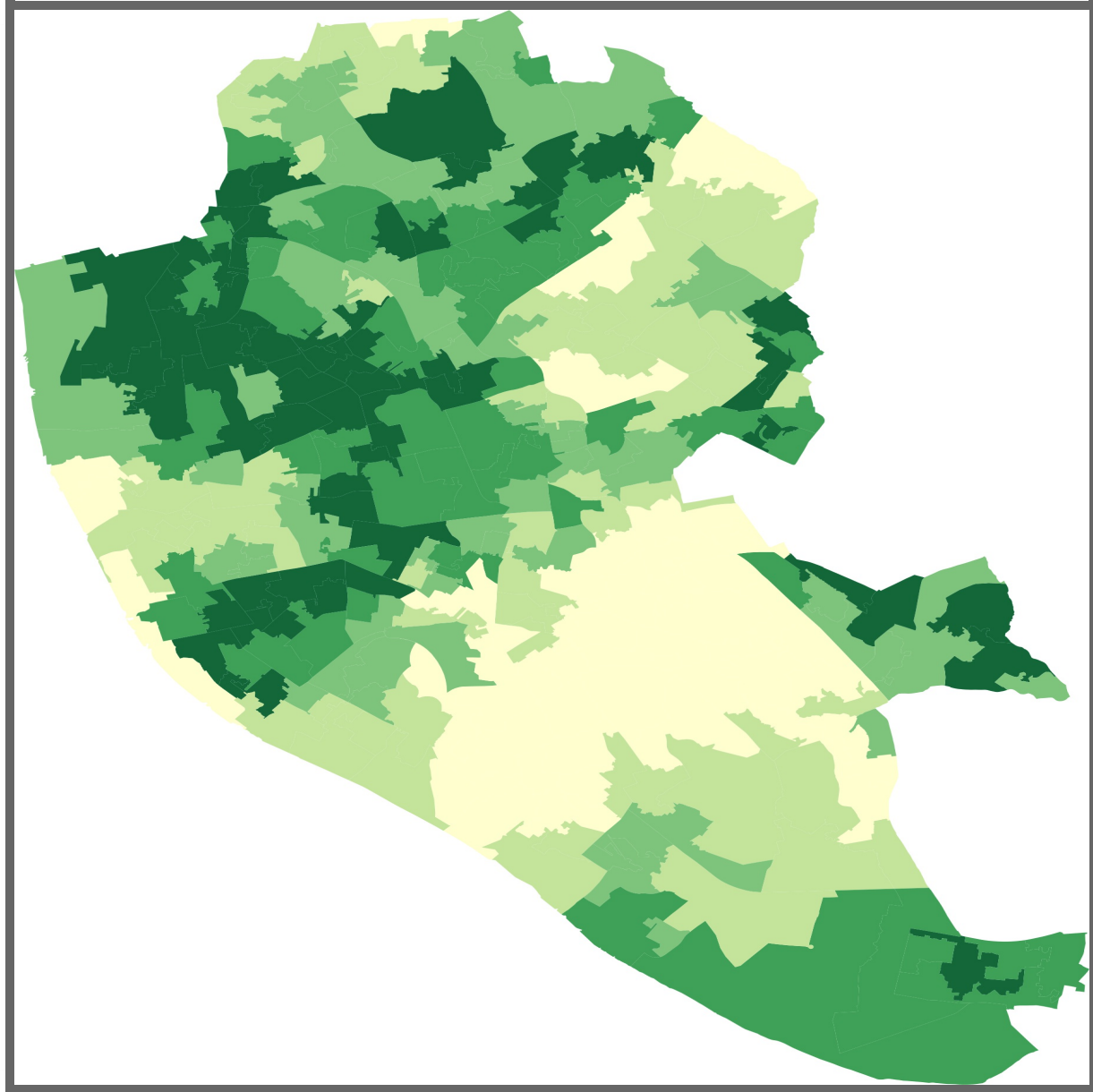
[Negative] Similar values far from each other (high-low)

How to measure it???

Moran Plot

- Graphical device that displays a **variable** on the horizontal axis against **its spatial lag** on the vertical one
- Variable and spatial weights matrix are preferably **standardized**
- Assessment of the overall association between a variable in a given location and in its *neighborhood*





[Interactive Demo]

Moran's I

Formal test of global spatial autocorrelation

Statistically identify the presence of clustering in a variable

Slope of the Moran plot

Inference based on how likely it is to obtain a map like observed from a purely random pattern

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$$I = \frac{N}{\sum_i \sum_j w_{ij}} \frac{\sum_i \sum_j w_{ij} (Z_i)(Z_j)}{\sum_i (Z_i)^2}$$

Local Spatial Autocorr.

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"Clusters"

Pockets of spatial instability

Portions of a map where values are correlated in a particularly strong and specific way

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How to measure it???

LISAs

Local Indicators of Spatial Association

Statistical tests for **spatial cluster detection** → Statistical significance

Compares the **observed** map with many **randomly** generated ones to see how likely it is to obtain the observed associations **for each location**

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Local Indicators of Spatial Association

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$$I_i = \frac{Z_i}{m_2} \sum_j W_{ij} Z_j \quad ; \quad m_2 = \frac{\sum_i Z_i^2}{N}$$

Cholera Deaths at the street level

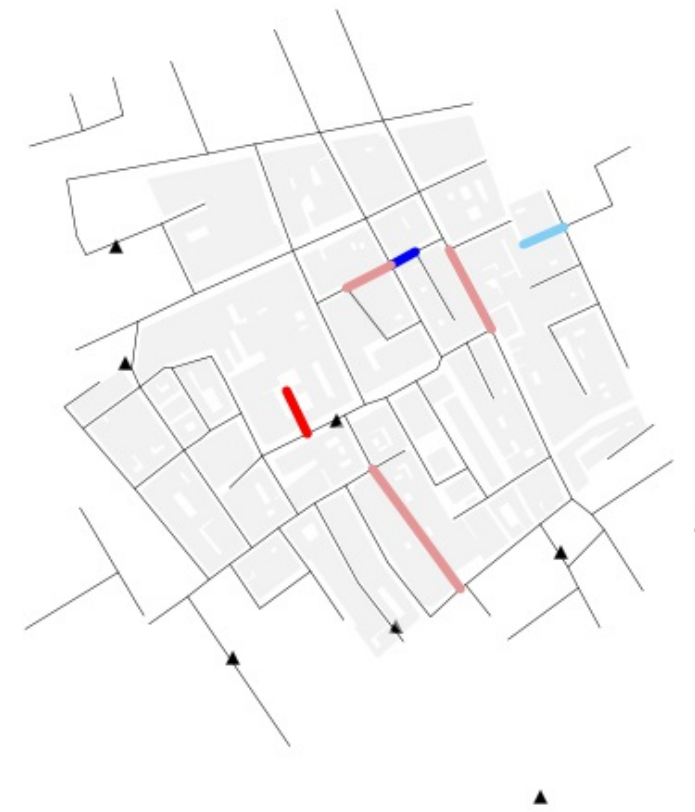
- 0.00 - 2.00
- 2.00 - 6.00
- 6.00 - 12.00
- 12.00 - 18.00
- 18.00 - 36.00



Cholera Deaths at the street level



LISA for Cholera Deaths



Recapitulation

ESDA is a family of techniques to explore and spatially interrogate data

Main function: characterize **spatial autocorrelation**, which can be explored:

- **Globally** (e.g. Moran Plot, Moran's I)
- **Locally** (e.g. LISAs)



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