
Segregation and spatial patterns of recent immigration in Barcelona

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Presentation structure

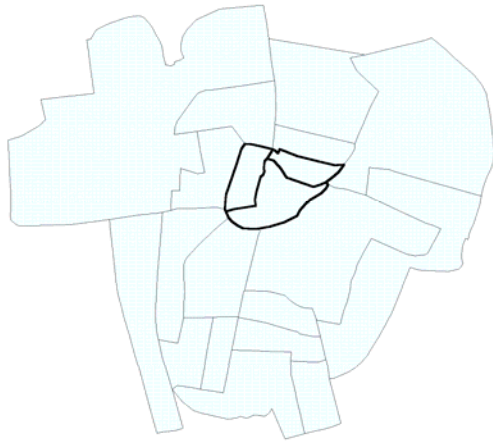
- Introduction
- Objectives
- Segregation measures and spatial autocorrelation
- Data and methodology
- Results
- Conclusions

Introduction

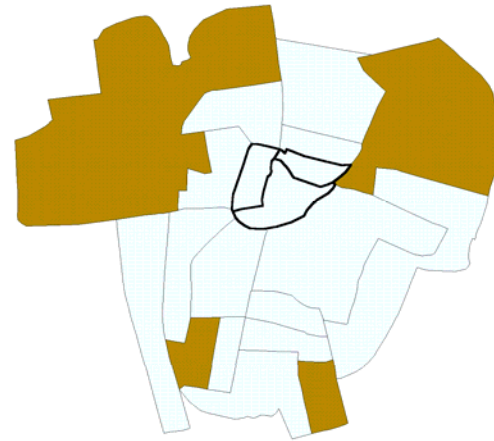
- Segregation measures
 - Statistics to detect the different distribution between population groups.
 - Five dimensions
 - Evenness
 - Exposure
 - Clustering
 - Concentration
 - Centralization

Evenness indices

Low Segregation



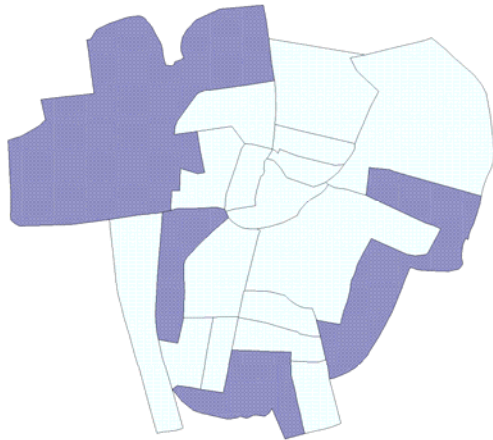
High Segregation



Exposure indices

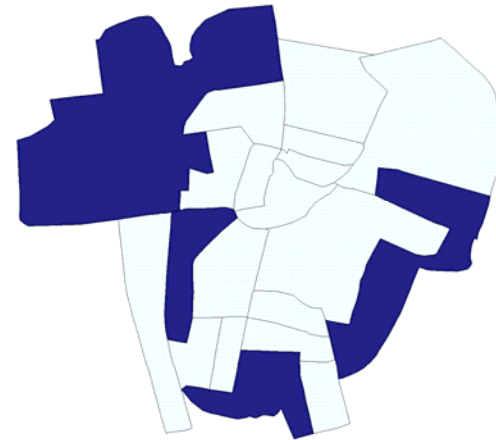
Low Segregation

Group X:50%, Group Y:50%



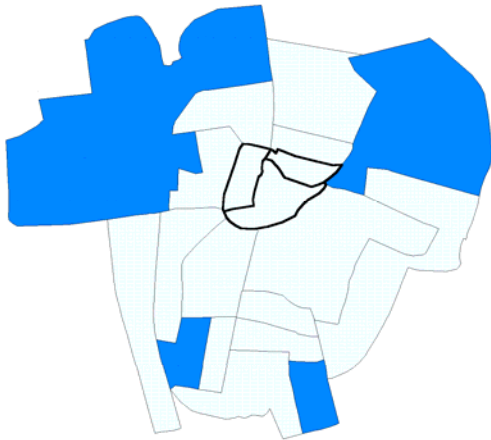
High Segregation

Y:100%

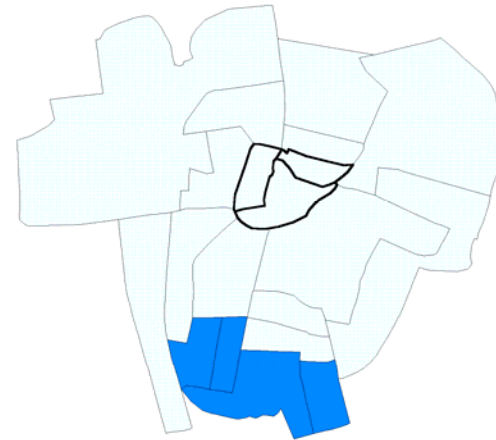


Clustering indices

Low Segregation

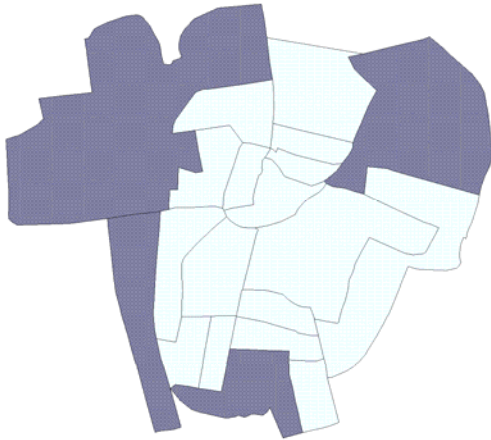


High Segregation

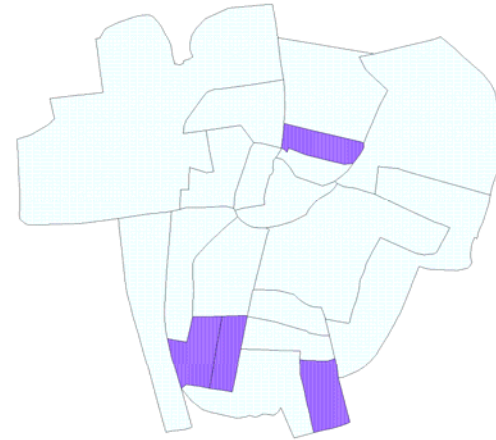


Concentration indices

Low Segregation

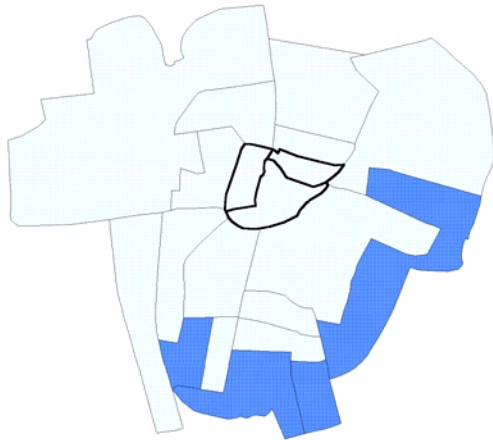


High Segregation

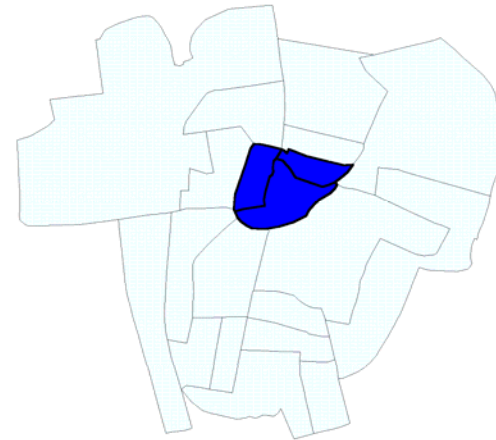


Centralization indices

Low Segregation



High Segregation



Migration in Spain

- Shift from emigrants to immigrants country
- Fast change, e.g. in Barcelona municipality the immigrant population increased from 53,428 in 2000 to 167,223 in 2003.
- Very different situation to other European countries.

Objectives

- Which pattern of localization do immigration minorities in Barcelona follow?
- Is this pattern unique or are there some differences between nationality groups?
- Analyzing the residential segregation and localization patterns, is the combination of traditional segregation measures with global and local spatial statistics useful?
- Which is the statistical relationship between segregation indices and spatial autocorrelation measures?

Non spatial measures

Segregation index

$$IS = \frac{1}{2} \sum_{i=1}^n \left| \frac{x_i}{X} - \frac{t_i - x_i}{T - X} \right|$$

Dissimilarity index

$$D = \frac{1}{2} \sum_{i=1}^n \left| \frac{x_i}{X} - \frac{y_i}{Y} \right|$$

Exposure index

$$\eta^2 = \frac{xPx - P}{1 - P}$$

$$xPx = \sum_{i=1}^n \left(\frac{x_i}{X} \right) \left(\frac{x_i}{t_i} \right)$$

Note: All indices range from 0 to 1, except ACE (from -1 to 1).

Concentration index

$$DEL = \frac{1}{2} \sum_{i=1}^n \left| \frac{x_i}{X} - \frac{a_i}{A} \right|$$

Centralization index

$$ACE = \left(\sum_{i=1}^n X_{i-1} A_i \right) - \left(\sum_{i=1}^n X_i A_{i-1} \right)$$

Spatial measures

- Non spatial dissimilarity: intra-zonal interaction between groups.

- Spatial dissimilarity: inter-zonal interaction between groups.

Spatial measures (I)

- Dissimilarity boundary-modified index (Morrill, 1991)

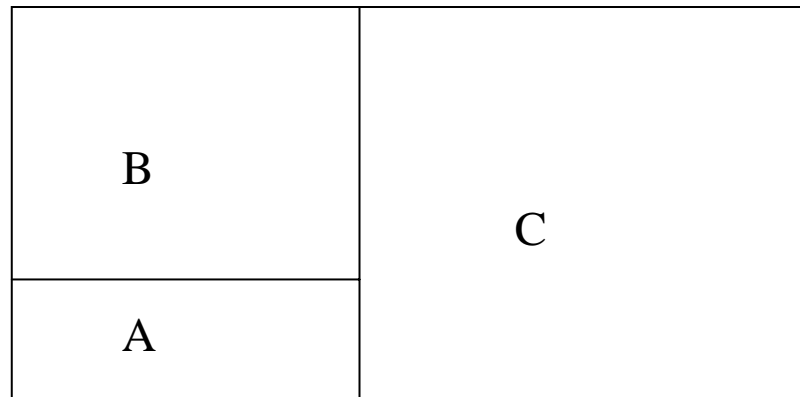
$$D(adj) = D - \frac{\sum_{i=1}^n \sum_{i=1}^n |c_{ij}(z_i - z_j)|}{\sum_{i=1}^n \sum_{j=1}^n c_{ij}}$$

Pattern of differences in proportions minority across all adjacent boundaries

Spatial measures (II)

- Dissimilarity weight-modified index (Wong, 1993)

$$D(w) = D - \frac{1}{2} \sum_{i=1}^n \sum_{j=1}^n w_{ij} |z_i - z_j| \quad w_{ij} = \frac{d_{ij}}{\sum d_{ij}}$$



Spatial measures (III)

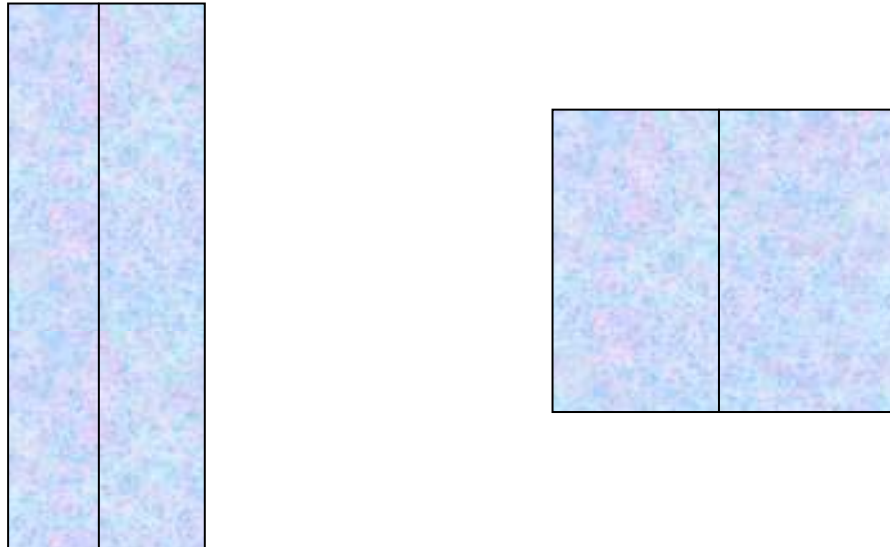
Dissimilarity shape modified index

$$D(s) = D - \frac{1}{2} \sum_{i=1}^n \sum_{j=1}^n w_{ij} |z_i - z_j| \frac{\frac{1}{2} [(P_i / A_i) + (P_j / A_j)]}{\max(P_i / A_i)}$$



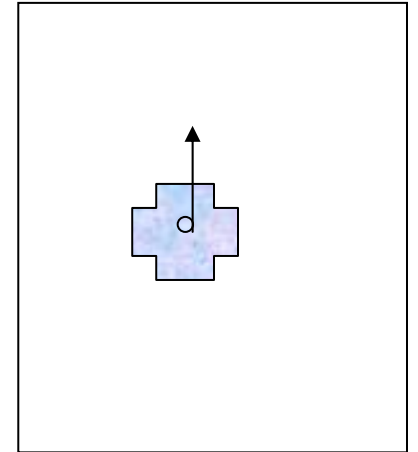
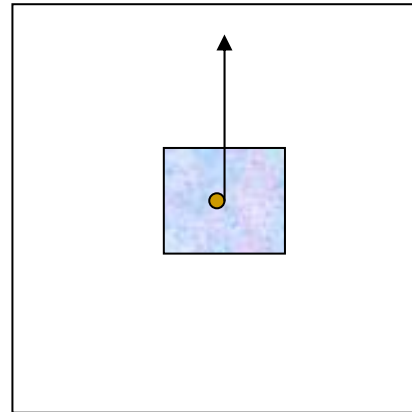
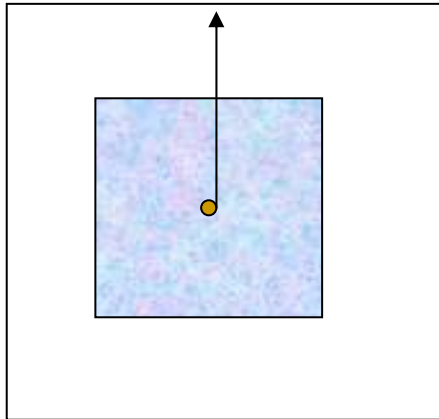
Shape vs Interaction (I)

- Compactness measure: Perimeter/Area



More compact units: low perimeter-area ratio = lower chance to interact with members of others units

Shape vs Interaction (II)



Spatial measures (IV)

Absolute clustering index $ACL = \left\{ \left[\sum_{i=1}^n (x_i / X) \sum_{j=1}^n (c_{ij} x_j) \right] - \left[X / n^2 \sum_{i=1}^n \sum_{j=1}^n c_{ij} \right] \right\} / \left\{ \left[\sum_{i=1}^n (x_i / X) \sum_{j=1}^n (c_{ij} t_j) \right] - \left[X / n^2 \sum_{i=1}^n \sum_{j=1}^n c_{ij} \right] \right\}$

Global Moran's I

$$I = (N / S_o) \sum_{i=1}^n \sum_{j=1}^m c_{ij} (x_i - \mu)(x_j - \mu) / \sum_{i=1}^n (x_i - \mu)^2$$

Local Moran's I

$$I_i = \frac{(x_i - \mu)}{m_0} \sum_{j=1}^n c_{ij} (x_j - \mu)$$

with $m_0 = \sum_{i=1}^n (x_i - \mu)^2 / n$

Study area and Data

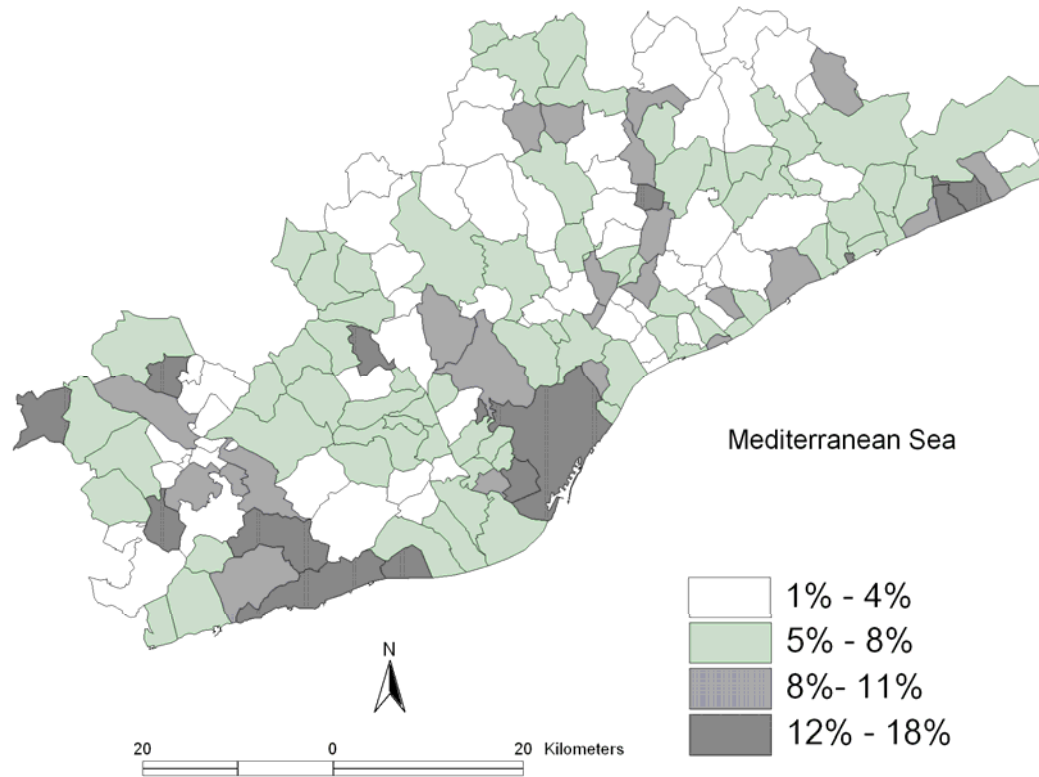
- Barcelona municipality (2003)
 - Population 1,582,738 (10.5% immigrants)
 - 1,491 census tracts

- Barcelona Region (2003)
 - Population 4,615,918 (8% immigrants)
 - 3,478 census tracts

Data source: Bureau Statistics Barcelona

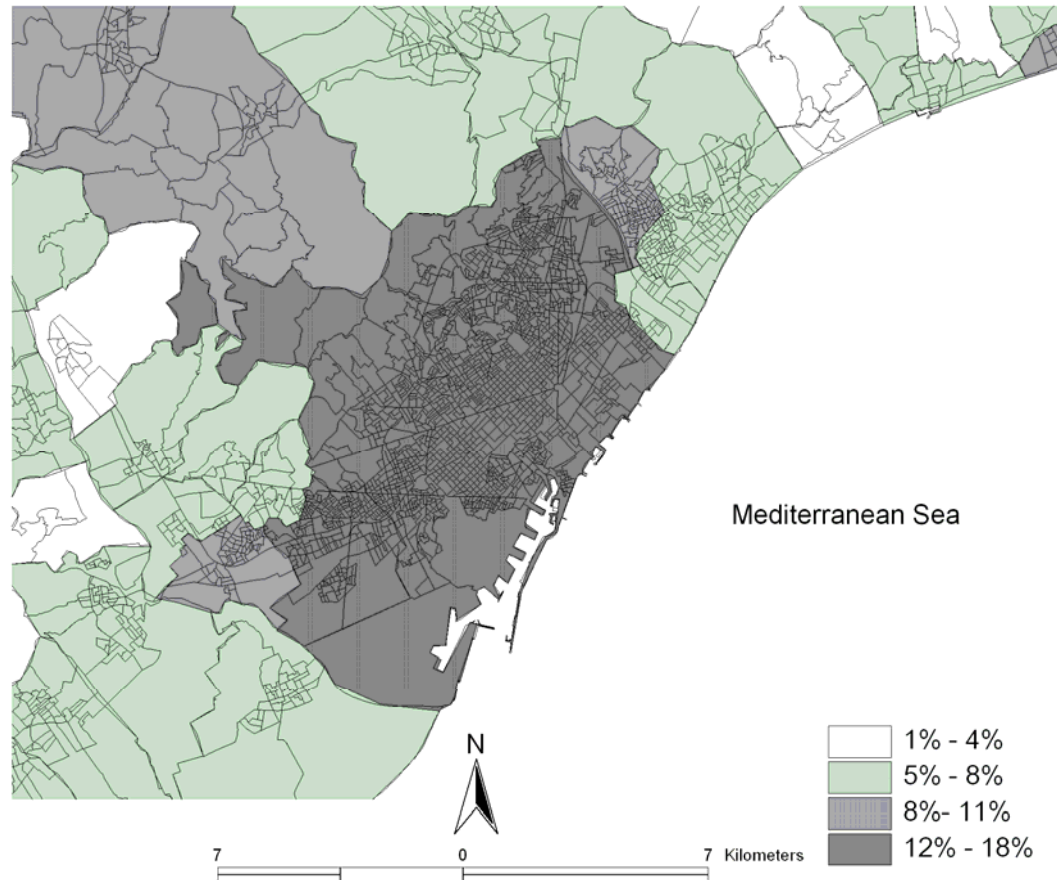
Barcelona metropolitan region

Municipality division



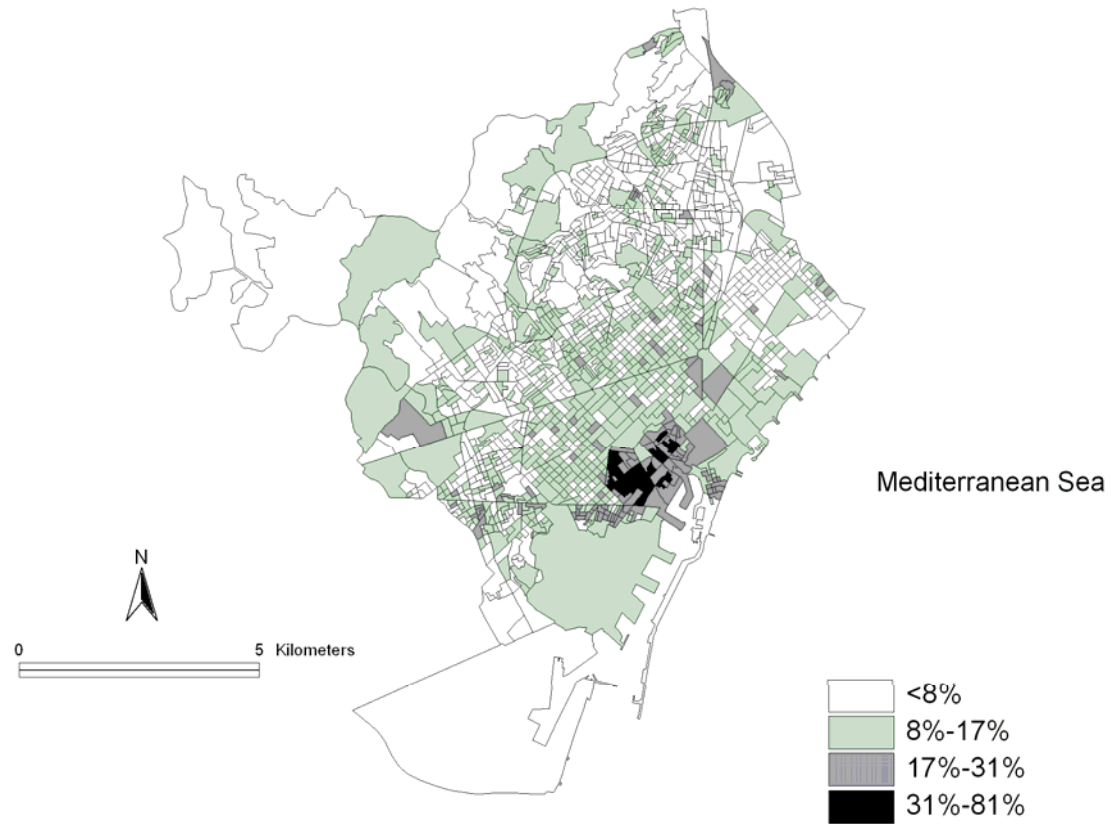
Central municipalities

Census tract division



Barcelona municipality

Census tract division

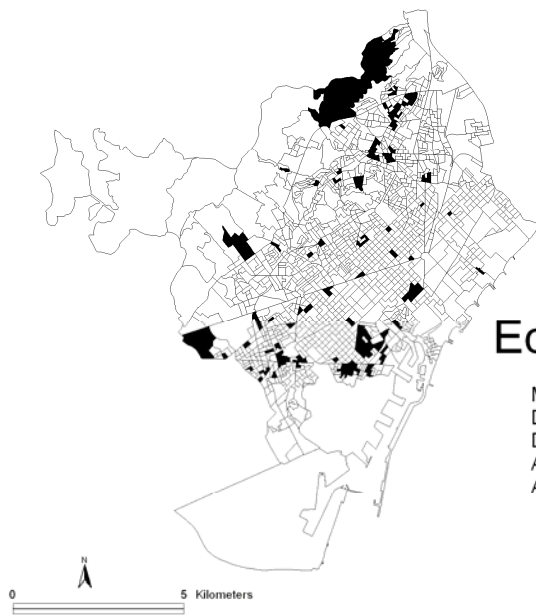


Segregation indices and Moran's I for each immigrant group

Indices	Ecuador	Colombia	Morocco	Peru	Argentina	Pakistan	Italy	Dominican Rep.	France	The Philippines	China
Barcelona (n =1.491)											
Index of segregation	0.389	0.351	0.597	0.384	0.353	0.807	0.370	0.579	0.424	0.784	0.599
Dissimilarity shape modified	0.384	0.348	0.594	0.382	0.351	0.805	0.369	0.577	0.423	0.783	0.598
Eta-squared	0.018	0.007	0.035	0.007	0.006	0.085	0.004	0.015	0.006	0.074	0.011
Delta	0.675	0.654	0.745	0.689	0.635	0.879	0.634	0.773	0.633	0.872	0.782
Absolute Centralization index	0.196	0.291	0.453	0.255	0.358	0.660	0.379	0.393	0.355	0.724	0.388
Index of absolute clustering	0.017	0.008	0.008	0.007	0.006	0.006	0.005	0.004	0.003	0.003	0.003
Moran's I	0.249*	0.123*	0.522*	0.209*	0.343*	0.655*	0.497*	0.365*	0.538*	0.620*	0.151*
RMB (n =3.478)											
Index of segregation	0.464	0.411	0.522	0.536	0.425	0.843	0.463	0.619	0.502	0.845	0.665
Dissimilarity shape modified	0.463	0.410	0.520	0.535	0.425	0.843	0.463	0.618	0.501	0.845	0.665
Eta-squared	0.022	0.008	0.040	0.009	0.007	0.073	0.005	0.013	0.007	0.070	0.018
Delta	0.896	0.865	0.825	0.918	0.845	0.975	0.842	0.926	0.802	0.954	0.945
Absolute Centralization index	0.823	0.763	0.515	0.886	0.683	0.933	0.737	0.842	0.690	0.945	0.801
Index of absolute clustering	0.012	0.005	0.015	0.004	0.004	0.003	0.003	0.002	0.002	0.001	0.003
Moran's I	0.431*	0.260*	0.453*	0.402*	0.415*	0.637*	0.546*	0.392*	0.564*	0.626*	0.422*

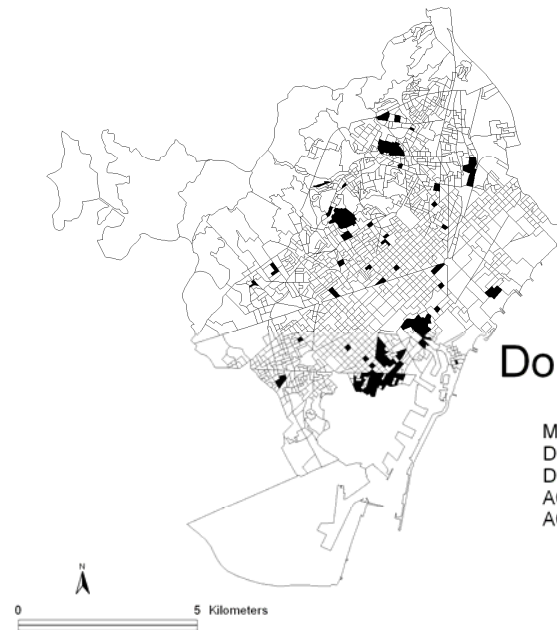
Note: * significance 5% (999 permutations). Contiguity weight matrix. Rook criteria.

Cluster map (I)



Ecuador

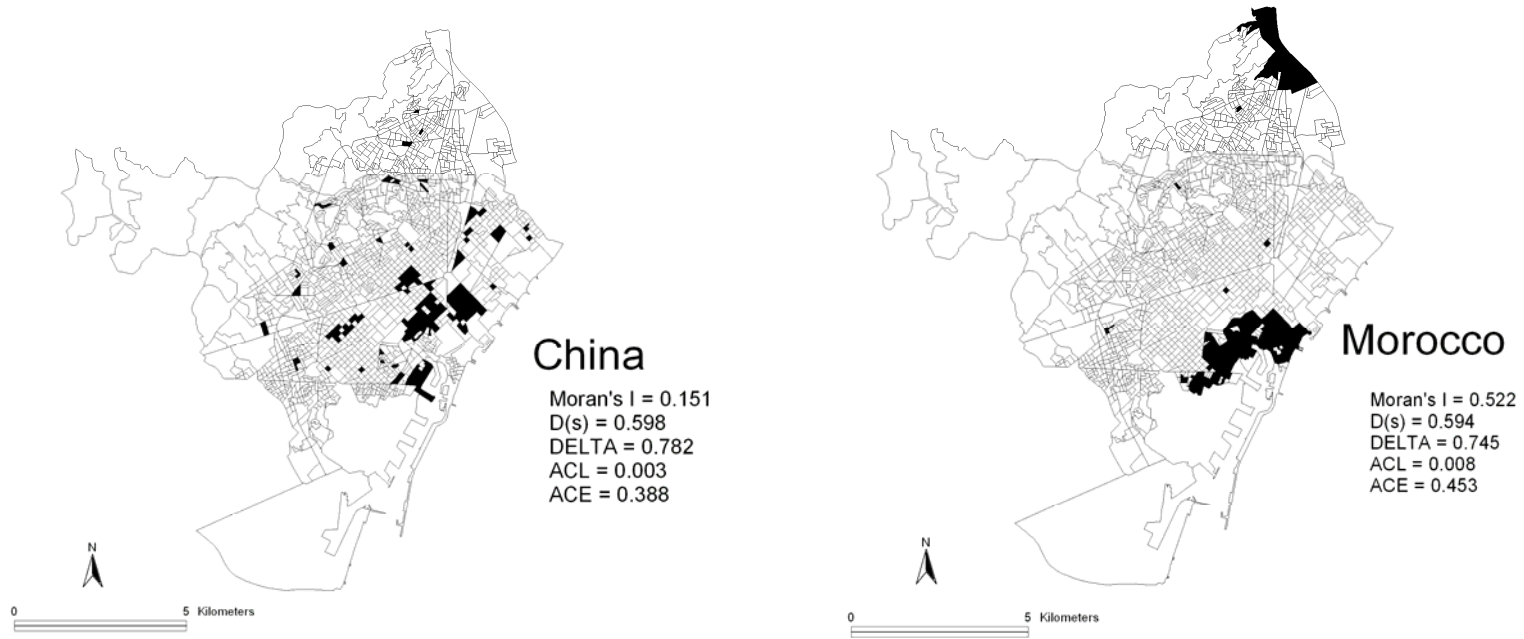
Moran's I = 0.249
D(s) = 0.384
DELTA = 0.675
ACL = 0.017
ACE = 0.196



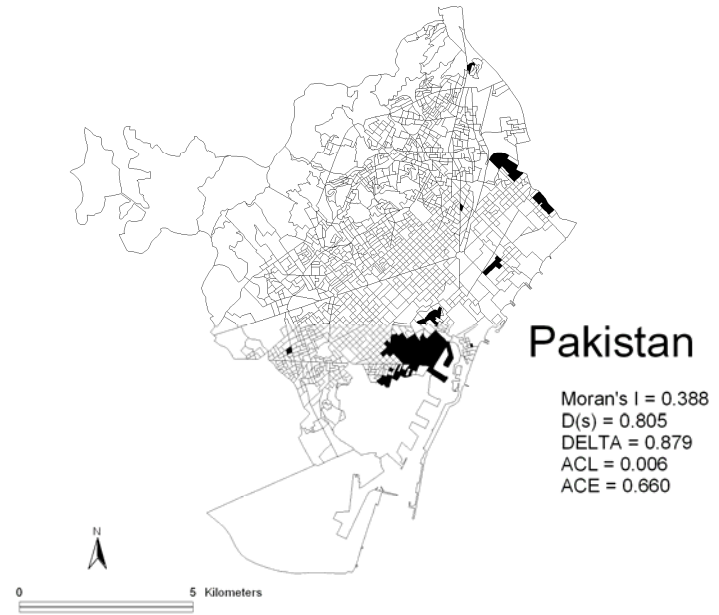
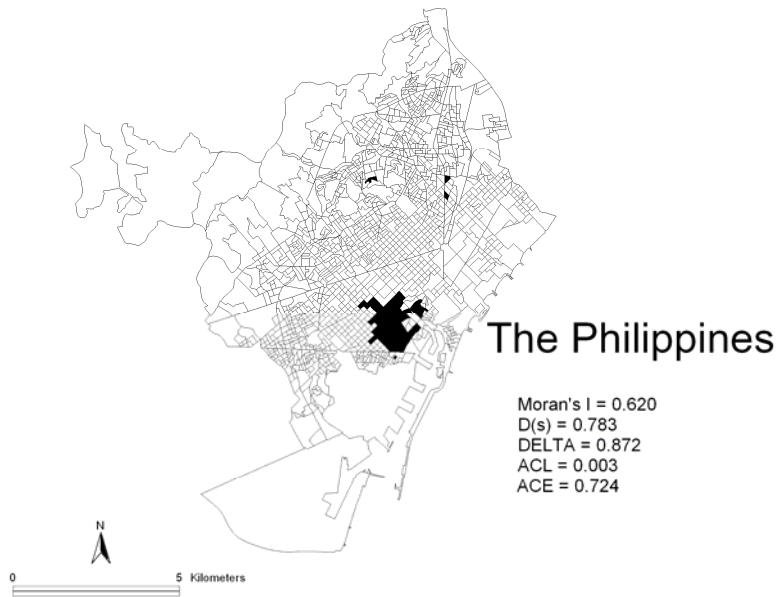
Dominican Rep.

Moran's I = 0.365
D(s) = 0.577
DELTA = 0.773
ACL = 0.004
ACE = 0.393

Cluster (II)



Cluster (III)



Some patterns of segregation

- Barcelona

- The Philippines and Pakistan: high evenness, exposure, concentration and centralization.
- Morocco: high exposure, clustering and centralization.
- China: high evenness and concentration.
- Ecuador and Colombia: high clustering.

- Barcelona region

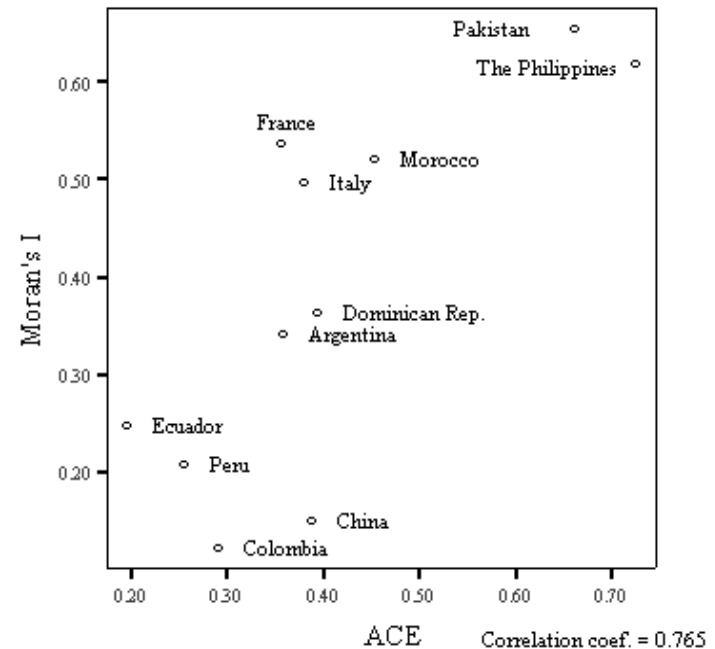
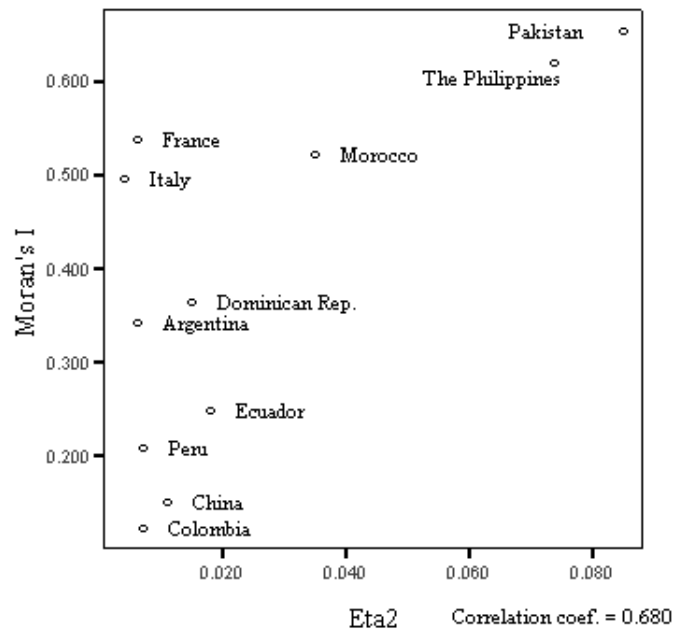
- Pakistan and the Philippines: high evenness, exposure, concentration and centralization.
- China: high evenness and concentration.
- Morocco: high clustering and exposure.
- Ecuador and Colombia: high clustering.

- For European countries (i.e. Italy and France) the Global Moran is high but they don't present segregation.

Exploring linear relationships

Segregation indices-Moran's I

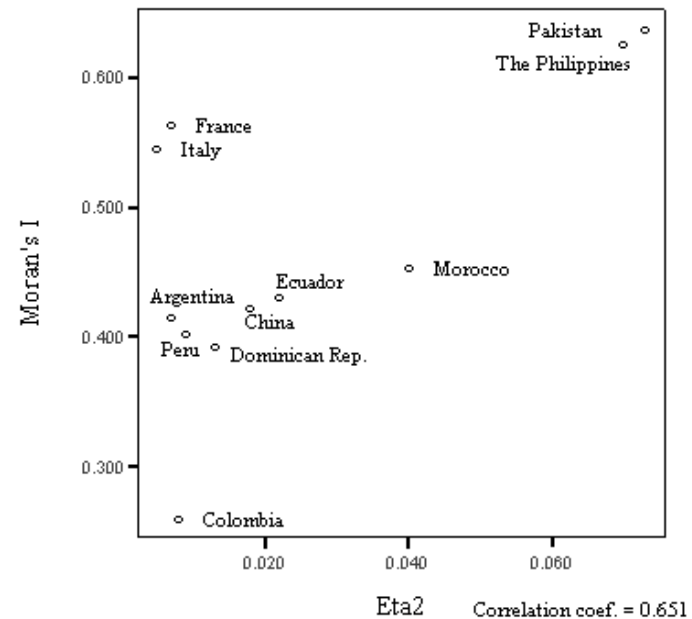
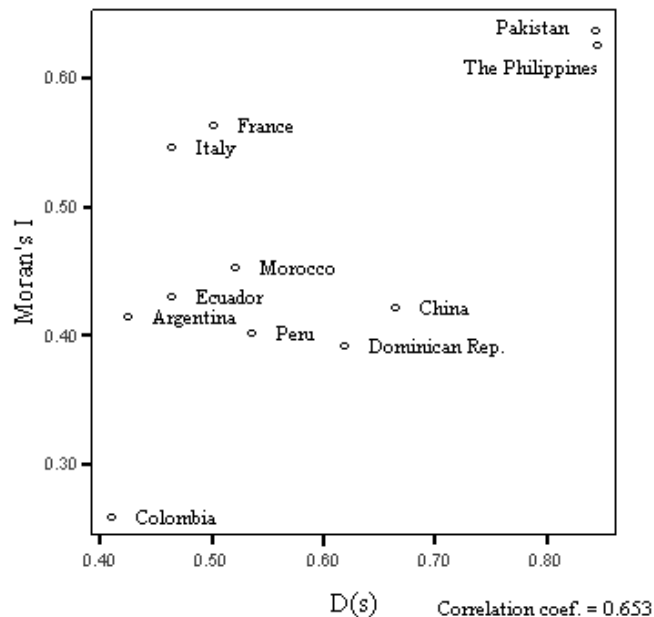
- Correlation matrix: only significance correlation in four cases.
- Barcelona



Exploring linear relationships

Segregation indices-Moran's I

- Barcelona Region



Summary and conclusions

- We present a combined strategy to find out localization patterns of population groups (i.e. immigrant minorities) in an urban area.
- This approach includes non spatial and spatial measures of residential segregation and spatial autocorrelation statistics.
- For the Barcelona case the most segregated groups are Pakistanis and Philippines with relative high level segregation in four dimensions.
- By means of LISA indicators and its cluster map we found that the localization patterns are diverse and we find out two opposite situations: dispersed and centred.
- The spatial autocorrelation statistics are useful to detect areas with the need for social assistance for immigrant groups.
- Regarding the statistical relationship between segregation indices and spatial autocorrelation measures, the results suggest the need of more case studies and simulation experiments.

References (I)

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- *Social Forces*
- *Social Science Quarterly*
- *Sociology and Social Research*
- *Sociological Methodology*

- *Computers, Environment and Urban Systems*
- *Demography*
- *European Journal of Geography*
- *Geoforum*
- *Geographical Analysis*
- *Geography Research Forum*
- *Housing Studies*
- *L'Espace géographique*

References (II)

- *Urban Affairs Quarterly*
- *Urban Geography*
- *Urban Studies*
- *Economic Geography*

- *Economic Letters*
- *Journal of Political Economy*
- *Journal of Socio-Economic Planning Sciences*
- *Journal of Urban Economics*
- *Quarterly Journal of Economics*

- *Bulletin de l'Institut International de Statistique*
- *Journal of Mathematical Sociology*
- *Mathematical Social Sciences Population Index*

People and Tools

- GIS (ArcView, ArcGis, MapInfo)
- D.W.S. Wong (George Mason University)
- P. Apparicio (University of Quebec)
- L. Anselin (University of Illinois). GeoDa
- R. Bivand (Norwegian School of Economics and Business Administration). R
- J.P.Lesage (University of Toledo) Matlab

Moltes gràcies

Preguntes?