## Politecnico di Milano Scuola di Ingegneria Industriale e dell'Informazione

APPLIED STATISTICS February 15th, 2023

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## Problem n.2

The shapefile Milan contains the current NILs (Nuclei d'Identità Locale, i.e. the neighbourhoods) in the city of Milano (source: Comune di Milano) The neighborhoods are univocally defined by an ID\_NIL (a number, to be used as ID variable), or NIL (the extended neighborhood name). For each NIL, the number n of public establishments such as bars, restaurants, pubs, etc., where serving is the primary activity (source: Comune di Milano) is reported. Moreover, the standardized variable n\_per\_area was created dividing, for each NIL, the variable n by the variable Shape\_Area measuring the area.

- a) By making use of a contiguity-based spatial weight of order 1 (W1), able to consider both common sides and common vertices, report the *minimum* and *maximum* number of neighborhoods and the *sparsity percentage* (i.e., the percentage of non-zero values).
- b) According to **W1**, what is the number of Neighbors associated to the highest frequency? Report both this number as well as the associated highest frequency.
- c) Based on W1, focus now on the variable n\_per\_area and build the LISA Cluster Map and Significance Map. Comment on them.
  - Moreover, report the NILs identified as outliers for a p-value≤ 0.05 when testing spatial autocorrelation. How would you explain their outlyingness?
- d) Report the Moran's I and, among the NILs with a positive spatial autocorrelation, report the one with the highest  $z_j \overline{z}$ .

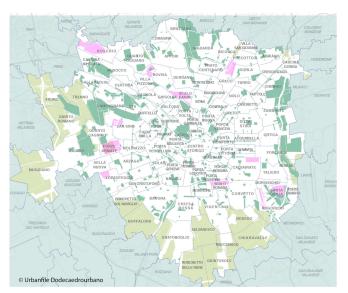


Figure 1: Dark green areas represent usable public green spaces, light green areas represent non-usable green spaces, while pink areas indicate developing zones.

In addition, the file revenues.txt collects the average daily revenues (revenue [k $\in$ ]) in 2023 of 70 minimarkets located in Milan. For each minimarket i, the dataset also reports its UTM coordinates  $s_i$  and the resident population in the neighborhood (population( $s_i$ )). For i = 1, ..., 70, consider the following model:

$$revenue(s_i) = a_0 + a_1 \cdot population(s_i) + \delta(s_i)$$

with  $\delta(s_i)$  a stationary residual (spherical without nugget, with initial parameters 500 and 1000 for the sill and range, respectively).

- g) Estimate via generalized least squares the parameters  $a_0$ ,  $a_1$  of the model, and briefly detail the implementation choices and procedure, reporting also the relevant R code. Report the estimated values for the variogram.
- h) Provide a kriging prediction  $revenue^*(s_0)$  of the revenues at a shop located in the Brera district at location  $s_0 = (514703.8, 5035569.3)$ , for which  $population(s_0) = 6054.468$ , briefly detailing the implementation choices.