Caleiro, António; Guerreiro, Gertrudes

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Understanding the Election Results in Portugal
A spatial econometrics point of view*

António Caleiro
Universidade de Évora, Departamento de Economia

Gertrudes Guerreiro
Universidade de Évora, Departamento de Economia

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Resumo/ Abstract:

The great majority of the theoretical analysis about electoral cycles has considered the national space as the territory of interest for the study of the economic consequences of an electoralist behaviour by the central government. This fact, in conjunction to the nature of the data most commonly available, has lead many authors to empirical studies which, by the use of more or less sophisticated econometric techniques, intend to verify the empirical evidence of electoral cycles whether in their political versions or in their partisan versions. Given that the election results for the main parties, at least for Portugal, clearly reflect some spatial localization we find rather intriguing to verify that so very few of those empirical studies use spatial econometrics techniques. This being said, the main objective of the paper is to analyse the results corresponding to the last legislative election that took place in Portugal, from the partisan viewpoint, by the use of well-known techniques of spatial econometrics. The confrontation of the results obtained ignoring the spatial localization of the data will lead us to the nature and extent of the improvement on the results obtained by spatial econometrics techniques in what concerns the detection of empirical evidence supporting the existence of a link between voters’ ideology and the election results obtained by the two main parties in Portugal.

Palavras-chave/Keyword: Elections, Partisan Models, Portugal, Spatial Econometrics, Voters

Classificação JEL/JEL Classification    C31, E32, R12
1 Introduction and Motivation

The existence of democratic elections is often associated with the question of an electoral cycle created by the incumbents.\(^1\) As is well-known, the electoral cycle literature has developed in two clearly distinct phases. The first, which took place in the mid-seventies, considered the existence of non-rational (naive) voters. See Nordhaus (1975) and Hibbs (1977). Following the rational expectations revolution, in the late eighties the second generation of models considered fully rational voters. See Alesina (1987), Rogoff and Sibert (1988) and Person and Tabellini (1990).

In fact, in a seminal paper in the mid-seventies, Nordhaus took a decisive step in the development of the theory and practice of political business cycles. Besides assuming that the sole objective of an opportunistic government is to maximise the number of votes at the following election, Nordhaus (1975) also considered myopic and retrospective voters, \(i.e.\) an electorate that does not take into account the evolution of the economy beyond the (next) election date. The hypothesised behaviour of government and voters then leads to a typical political business cycle, \(i.e.\) recessions at the beginning of the term of government and inflationary expansions at the end of the term.

A critique of political business cycles à la Nordhaus was made by Hibbs (1977), who suggested the partisan approach to the electoral cycles literature. The author considered a different form of action by the party in power as well as different behaviour by the voters. In particular, Hibbs (1977) viewed parties as representing social classes with different political preferences. In this context, electoral victories are not an objective \(per se\), but rather the necessary means to implement the best policy for the class the party represents. Voters, on the other hand, vote for the party which best defends their political ideology. Thus, assuming a partisan approach, it is considered that the political parties exploit different points on the Phillips curve in order to provide welfare gains to their core constituencies.\(^2\)

The empirical literature generated by the initial theoretical studies on electoral cycles was not conclusive about their consistency with reality. Partly as a reaction to these empirical studies and partly in response to the rational expectations revolution, a new generation of models of (rational) electoral cycles emerged in the late eighties. These ‘second-generation’ models depart from their predecessors in the behaviour assumed by the private sector, in general, and, in particular, by voters. The assumption of voters rationality reduces the possibility of regular electoral cycles, although it does not eliminate them completely, as will be emphasised below. In fact, if the parties are significantly different, then voters can rationally anticipate those differences. By allowing parties to be different in their preferences for economic policies and targets, on the grounds that they represent different voters who hold different in-

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\(^1\)The terminology ‘electoral cycles’ will be used to designate the general case, that is when the distinction between political and partisan cycles is not important. Following this terminology, a possible confusion between a particular case (\(i.e.\) the political case à la Nordhaus) and the general case – as easily happens when the terminology ‘political business cycles’ is used to designate the general case – is avoided.

\(^2\)In Minford and Peel (1982) and Minford (1990), an interesting ‘alternative’ is considered, which we could classify as intermediate between the opportunistic and partisan approaches. It assumes that parties are supported by their core constituencies and some floating voters, who determine the election outcome. In this case, the maximisation of some objective function leads to the best trade-off between the chances of winning elections and assuring the loyalty of their support constituencies.
terests or ideologies, Alesina (1987) concluded that two parties with different optimal policies have different incentives to implement economic policies that differ from the ones announced. Considering the uncertainty regarding electoral outcomes, Alesina (1987) showed that the consequent uncertainty about future partisan policies generates business fluctuations. In this case, the model shows that, at the beginning of a right-wing (resp. left-wing) government’s term, income/output will be below (resp. above) its natural level and unemployment above (resp. below). Once expectations and prices are adjusted, output and unemployment converge to their natural level. This means that economic activity after the adjustment should be independent of who is in power. Regarding the rate of inflation, its level will always be higher during the mandate of a left-wing party, even after the level of economic activity has converged to its natural level.

A final point must be made concerning empirical evidence. The great majority of the theoretical analysis about electoral cycles has considered the national space as the territory of interest for the study of the economic consequences of an electoralist behaviour by the central government. This fact, in conjunction to the nature of the data most commonly available, has lead many authors to empirical studies which, by the use of more or less sophisticated econometric techniques, aimed at testing for the existence of this kind of cycle in its various forms. Given that the election results for the main parties, at least for Portugal, clearly reflect some spatial localization we find rather intriguing to verify that so very few of those empirical studies use spatial econometrics techniques. For instance, a causal observation on the data concerning the (Portuguese) election results over space shows that the results obtained by the incumbent, at a regional level, should not be considered completely independent of the party ruling the distinct municipalities distributed over the national territory. These issues gain particular importance if, from a partisan point of view, one intends to analyse the election results as consequences from decisions taken by an ideological voters, i.e. by an electorate that votes in a party which best represents its political ideology. In other words, if one wants to understand the percentage of votes obtained by the parties at the elections as the result of voting decisions taken by ideological electorate which, in turn, at least in Portugal, reflects some geographical distribution in space, it is apparent that spatial econometrics techniques should be used.

This being said, the main objective of the paper is to analyse the results corresponding to the last legislative election that took place in Portugal, from the partisan viewpoint, by the use of well-known techniques of spatial econometrics. The confrontation of the results with the ones obtained ignoring the spatial localization of the data will lead us to the nature and extent of the improvement on the results obtained by spatial econometrics techniques in what concerns the detection of empirical evidence supporting the existence of a link between voters’ ideology and the election results obtained by the two main parties in Portugal.

The paper is structured as follows. Section 2 offers the political-economic model that reflects the economic policies and outcomes associated with partisan behaviour by the incumbent. In accordance to those policies and outcomes, ideological voters take voting decisions. This process is shown in section 3. In order to test the hypothesis that the election results reflect voters’ ideology, section 4 presents, in the first place, the non-spatial econometric results and, in the second place, the spatial econometrics results. Section 5 concludes.
2 The Political-Economic Model of Government Behaviour

As is quite common in the literature, concerning the government’s objective function, we assume that the discounted disutility — at a rate $\beta > 0$ — during a mandate that ends at $t = T$, results from quadratic deviations of inflation, $\pi_t$, and output (measured in logarithms), $q_t$, from their desired values which, for the sake of simplicity, are assumed to be 0 and $\bar{q} > 0$, respectively. In other words, while the desired value for the inflation rate is zero the government also wants to stabilise output at a level above the natural one. Thus,

$$L = \sum_{t=1}^{T} \beta^{t} \left( (q_t - \bar{q})^{2} + \theta \pi_t^{2} \right)$$  \hspace{1cm} (1)

represents the government’s loss function where,

$$q_t = \alpha (\pi_t - \pi^e_t),$$  \hspace{1cm} (2)

and $\pi^e_t$ is the expected inflation for period $t$, at time $t - 1$, given by

$$\pi^e_t = E[\pi_t | I_{t-1}].$$  \hspace{1cm} (3)

Concerning the policy instrument, we assume that the government, at period $t$, selects inflation $\pi_t$ to minimise its disutility, given by (1), subject to the structure of the economy given by (2) and (3).

By their nature, elections are a source of uncertainty, as a change in the government, and hence a change in policies, may result from an election. Generally speaking, the fact that election results can be considered news is of decisive importance to the partisan vision of electoral cycles. Let us consider two possible kinds of governments, $i = L, R$, which differ in their relative concern about inflation in that their objective functions are given by

$$L = \sum_{t=1}^{T} \beta^{t} \left( (q_t - \bar{q})^{2} + \theta^{i} \pi_t^{2} \right),$$  \hspace{1cm} (4)

where $\theta^L < \theta^R$. In other words, right-wing governments ($i = R$) favour less inflationary results than left-wing governments ($i = L$).

Taking expected inflation, $\pi^e_t$, as given in the optimisation of (4) subject to (2) and (3), the incumbent determines time-consistent inflation rates $\pi^*_t$ as follows. If $t$ is not an election period, $\pi^*_t = \pi_t$ which means

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3 Output $q_t$ is measured from the natural level. In other words, $q_t = y_t - \bar{y}$, where $y_t$ is output and $\bar{y}$ is its value at the natural rate of unemployment. Some authors prefer to normalise the natural level of output $\bar{Y}$ to 1 such that, in logs, $\bar{y} = 0$. In this case, one can follow the model, taking $q_t$ to be the level of output.

4 This naturally means that the government does not want output to be infinitely large. If, indeed, that corresponded to the government’s objective, then a quadratic (in inflation) linear (in output) objective function would be appropriate. See, for instance, Gärtnert (2000), pp. 3-5.

5 This is also true for some results considering endogenous uncertainty. For instance, it is well known that the results concerning reputation change once that kind of uncertainty is considered.

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\[ \pi^i_t = \frac{\alpha}{\theta^i} \bar{q} \quad \text{and} \quad q_t = 0, \quad i = L, R. \quad (5) \]

Voters who are rational and forward-looking know the two governments’ objective functions and hence can compute their two optimal inflation rates \((5)\). Although these policies are known, since it is assumed that the distribution of voters’ preferences is unknown, the electoral results are unknown; see Alesina et al. (1997), p. 55. Hence, if \( t \) is an election period, expected inflation \( \pi^e_t \) is an average of \( \frac{\alpha}{\theta^L} \bar{q} \) and \( \frac{\alpha}{\theta^R} \bar{q} \) weighted by the probabilities that each type of government will be in office.\(^6\) That said, if \( t \) is an election period, the expected inflation will not coincide with the effective inflation rate as

\[ \pi^e_t = p_t \pi^L_t + (1 - p_t) \pi^R_t, \]

where \( p_t \) is defined to be the probability of a left-wing electoral victory in period \( t \).

Given that \( \theta^L < \theta^R \), a term of office beginning in period \( t \) will be characterised by

\[ \begin{align*}
\pi^e_t &< \pi^L_t \Rightarrow q_t = \alpha (1 - p_t) (\pi^L_t - \pi^R_t) > 0 \Rightarrow y_t > \bar{y} \quad \text{if } L \text{ is in office after } t, \\
\pi^e_t &> \pi^R_t \Rightarrow q_t = \alpha p_t (\pi^R_t - \pi^L_t) < 0 \Rightarrow y_t < \bar{y} \quad \text{if } R \text{ is in office after } t, 
\end{align*} \]

and

\[ \begin{align*}
\pi^e_{t+1} &= \pi^L_t \Rightarrow q_t = 0 \Leftrightarrow y_t = \bar{y} \quad \text{if } L \text{ is in office after } t, \\
\pi^e_{t+1} &= \pi^R_t \Rightarrow q_t = 0 \Leftrightarrow y_t = \bar{y} \quad \text{if } R \text{ is in office after } t.
\]

In other words, output is above (resp. below) its natural level in the first period of a left (resp. right)-wing government.\(^7\) Every other period until the next election, as expectations perfectly adjust, output will be at its natural level independently of the kind of incumbent. Inflation, in turn, will always be higher during left-wing governments. Hence, in this case, decreasing (resp. increasing) the electoral period length will, on average and in the case of power rotation, create a higher (resp. lower) volatility (costly fluctuations) of output and inflation rates.\(^8\).

\(^{4}\)As in most of the literature, we will assume exogenous probabilities. Ellis (1991) is, to the best of our knowledge, the only study to consider endogenous probabilities.

\(^{7}\)This is also known as the partisan effect.

\(^{8}\)This means that there may be intermediate values of inflation rates,

\[ \pi^R < \pi^* < \pi^L, \]

such that both types of governments would be better off if both implement \( \pi^* \) rather than their preferred policies \( \pi^L \) and \( \pi^R \) because the sub-optimality introduced by fluctuations in inflation and output is eliminated. As we have just noted, one way of reducing these fluctuations on average (but which does not necessarily mean a loss reduction) is to increase the electoral period length.

Alesina (1987) shows that \( \pi^* \) is decreasing (resp. increasing) with the probability of a right (resp. left)-wing electoral victory because the increase in the bargaining power of each type of government will make \( \pi^* \) closer to their own preferred policies, \( \pi^L \) or \( \pi^R \). For this mechanism to be effective, \( i.e. \) considered credible, one naturally has to assume a sufficiently long time horizon for both types of governments and a sufficiently low discount of future. Almost the same argument is used in the strategic use of budget deficits literature; see Milesi-Ferretti and Spolaore (1994).
3 The Model of Voting Decisions

As is well-known, the partisan approach to electoral cycles considers that parties implement policies that reflect the preferences of parties’ support constituencies. In this sense, the previous analysis may be complemented by the study of its consequences for the voters’ set, characterised by different preferences. Let us, then, consider that

\[ L_j^t = (q_t - \overline{q})^2 + \theta^j \overline{q}^t \]

represents the one-period preferences of voter \( j \). For this voter the cost, during a term starting at \( t = 1 \) and finishing at \( t = T \), depends on the type of incumbent.

The discounted cost (at a rate \( \rho \)) associated with a left-wing electoral victory would be

\[ \rho \left( (\alpha (1 - p_t) (\pi^L_t - \pi^R_t) - \overline{q})^2 + \theta^j (\pi^L_t)^2 \right) + \sum_{t=2}^{T} \rho^j \left( (\overline{q})^2 + \theta^j (\pi^L_t)^2 \right), \]

whereas in the case of a right-wing electoral victory, this cost would be

\[ \rho \left( (\alpha p_t (\pi^R_t - \pi^L_t) - \overline{q})^2 + \theta^j (\pi^R_t)^2 \right) + \sum_{t=2}^{T} \rho^j \left( (\overline{q})^2 + \theta^j (\pi^R_t)^2 \right). \]

Following rational behaviour, voters decide to vote on the left or the right after comparing (6) with (7). This gives them the trade-off that they face at the election day. Straightforwardly, the difference in costs (6) − (7) will be

\[ \Delta = (\pi^L_t - \pi^R_t) \frac{\rho \alpha^2 (1 - \rho) (1 - 2p_t) (\pi^L_t - \pi^R_t) + \theta^j (\rho - \rho^{T+1}) (\pi^L_t + \pi^R_t) - 2 \rho \alpha (1 - \rho) \overline{q}}{1 - \rho} \]

The previous expression thus gives the criterion used by voter \( i \) to vote for the left-wing party or for the right-wing party. Voter \( j \) strictly prefers the left-wing candidate if \( \Delta < 0 \) and, naturally, strictly prefers the right-wing candidate if \( \Delta > 0 \). Moreover, it allows us to confirm that:

- The more costly inflation is to voter \( j \), that is, the higher \( \theta^j \) is, the higher the costs of having left-wing governments instead of right-wing ones.9
- The higher the probability is of a left-wing electoral victory \( p_t \), the higher are the incentives to vote for this kind of party.10

4 The Econometric Results

Let us proceed with the detection of empirical evidence supporting the existence of a link between voters’ ideology and the election results obtained by the two main parties in Portugal. As is well-known, the two main parties in Portugal are the Socialist Party (PS) and the Social Democrat Party (PSD), which have been in power

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9 In fact, \( \frac{\partial \Delta}{\partial \theta} = (\pi^L - \pi^R) (\pi^L + \pi^R) \frac{\rho - \rho^{T+1}}{1 - \rho} > 0 \).

10 In fact, \( \frac{\partial \Delta}{\partial \rho} = -2 \rho \alpha^2 (\pi^L - \pi^R)^2 < 0 \).
almost ever since the re-implantation of democracy in Portugal in 1974. Their im-
portance in political terms is such that a good electoral result for one the parties
represents, whatever the type of election, a bad electoral result for the other. More-
ever, it is apparent that the Socialist Party represents a (more) ‘leftist’ part of the
electorate whereas the Social Democrat Party represents a (more) ‘rightist’ part of
the electorate.

As is clear, the previous section linked the voters’ ideology and the decisions to
vote through the relative degree of inflation aversion. Unfortunately there is no data
for inflation sufficiently disaggregated not to destroy the geographical nature of the
observations. Fortunately, the last demographic census that took place in Portugal
provided data sufficiently disaggregated, i.e. at the level of the 278 municipalities, for
the unemployment rate.\footnote{Plainly, we are excluding the municipalities for the Azores and Madeira islands.} Clearly, assuming a high(er) degree of inflation aversion
can be considered synonymous of a low(er) degree of unemployment aversion. We
therefore proceed the study based on the data for the unemployment rate.

4.1 A non spatial econometrics point of view

A causal observation on the data concerning the (Portuguese) election results over
space shows that the results obtained by the incumbent, at a regional level, should not
be considered completely independent of the party ruling the distinct municipalities
distributed over the national territory. So, the model that will be considered is the
following:

\[
\begin{align*}
PS &= \beta_{0,PS}X_0 + \beta_{1,PS}MunPS + \beta_{2,PS}UnempRate + u_{PS}, \\
PSD &= \beta_{0,PSD}X_0 + \beta_{1,PSD}MunPSD + \beta_{2,PSD}UnempRate + u_{PSD},
\end{align*}
\]

where:

- \(PS\) and \(PSD\) represent the percentage of votes obtained by the Socialist and
  Social Democrat parties, by municipalities, at the legislative election that took
  place in Portugal in 2002;
- \(X_0\) denotes a constant;
- \(MunPS\) and \(MunPSD\) are dummy variables that take the value 1 if the party
  ruling the municipality is, respectively, the Socialist Party and the Social De-
  mocrat Party, and 0 otherwise;
- \(UnempRate\) represents the unemployment rate of the municipality as deter-
  mined by the demographic census;
- \(u_{PS}\) and \(u_{PSD}\) are residuals supposed to be in accordance to the usual assump-
  tions.

The estimation of (8) and (9) by ordinary least squares resulted in:\footnote{The \(t\) ratios are indicated in parentheses.}
\[ PS = 0.3078 + 0.0714 \text{ MunPS} + 0.5140 \text{ UnempRate}, \quad (10) \]
\[ PSD = 0.4306 + 0.1325 \text{ MunPSD} - 1.1054 \text{ UnempRate}. \quad (11) \]

Plainly, (10) and (11) confirm the prediction of the model saying that voters located in municipalities characterised by higher (resp. lower) levels of unemployment, that meaning a higher (lower) level of unemployment aversion decided to give electoral support to the party expected to be characterised also by a higher (lower) level of unemployment aversion.\(^{13}\) Furthermore, the results confirm the intuitively clear importance of the party ruling the distinct municipalities on the results obtained by each party at the legislative elections, which is specially evident for the Social Democrat Party. To sum up, given also the significance of all estimates, (10) and (11) apparently constitute congruent models.

The fact that the election results obtained by both parties are not independent of the ideology of the party in power at the municipalities re-emphasises the idea that the geographical localisation of the observations should be taken into account. This is strikingly evident from the representation over the national territory of the residuals associated with (10) and (11). See the following figures.

\[ \text{Figure 1: Residuals from (10) – PS.} \]
\[ \text{Figure 2: Residuals from (11) – PSD.} \]

\textbf{Note:} Gray/white municipalities mean positive/negative residuals

The previous figures clearly indicate that ordinary least square residuals are spatially autocorrelated at least in the sense that positive (resp. negative) residuals tend

\(^{13}\)The regressions made also for the Communist Party (on the left wing) and for the Popular Party (on the right ring), in a way, confirmed this result. In fact, a positive influence of the unemployment rate on the results obtained by the Communist Party and a negative influence of the unemployment rate on the results obtained by the Popular Party, were revealed, both in significative terms.
to occur in contiguous municipalities. In other words, the plots, over space, of the residuals show that the election results, for both parties, at the $i$-th municipality, tend to be higher (resp. lower) than expected is, in the surrounding municipalities, the same happens. This phenomenon seams to be specially evident for the Social Democrat Party model. This evidence is indeed confirmed by the regressions of the residuals on the residuals of the nearest municipality, as the figures 6 and 7 in the Annex show. In fact, the correlation coefficient between the residuals of each municipality and the residuals for the closest municipality are around 52%, for the PS model, and 61% for the PSD model. These results provide, in our opinion, clear evidence of spatial autocorrelation. The independence of ordinary least squares residuals is thus violated.

To sum up, the previous results, on the one hand, confirmed the theoretical predictions of the model but, on the other hand, clearly indicate that one should not ignore the localization of the observations over space. In order to explicitly take into account the influence that each observation may exert upon the nearby observations, one has to adopt a spatial econometrics point of view.

### 4.2 A spatial econometrics point of view

As is relatively well-known, one says that spatial autocorrelation occurs when values of a variable concerning nearby locations are more similar than those concerning more distant locations. For instance, if a high level of unemployment in a municipality makes its presence in neighbouring municipalities more (resp. less) likely, we say that the phenomenon exhibits positive (resp. negative) spatial autocorrelation. The existence of spatial autocorrelation in the data may lead to spatial correlation of OLS residuals, given that positive/negative residuals tend to occur together. This seems indeed to be the case under study. As a consequence, the assumption about the independence of residuals is clearly violated under spatial autocorrelation. To put it formally, when the residuals, $u$, are spatially autocorrelated

$$E[uu^T] = \sigma^2 \Sigma = \Theta,$$

where the variance-covariance matrix $\Theta$ contains non-zero off-diagonal elements. When residuals are not i.i.d., the OLS estimators are unbiased but inefficient as the estimated standard errors are biased downwards. Hence, the main effect is the inflation of the value of tests statistic, which increases the chance of incorrectly rejecting the null hypothesis of non-significance. See, among others, Dubin et al. (1999).

The so-called simultaneous (SAR) or conditional (CAR) approaches have been used quite commonly as specifications of spatial autoregressions.

Generally speaking, SAR models correspond to modeling

14 The nearest neighbour municipality was obtained through the use of a MATLAB toolbox available at www.spatial-statistics.com due to Kelley Pace. Most of the spatial econometrics results were obtained by the use of this Spatial Statistics Toolbox. See also the site www.spatial-econometrics.com from James LeSage.

15 A parallel exercise showed also an interesting relation between the unemployment rate for each municipality and the unemployment rate of the nearest neighbour. An ordinary least squares estimation resulted in $\text{UnemRate} = 0.0354 + 0.52 \text{UnemRateNearestNeighnour}$. See LeSage (1999).
\[ y_i = \alpha \sum_{j \in N_i} d_{ij}y_j + \varepsilon_i \quad \text{with} \quad \mathbb{E}[y_i] = 0 \quad \mathbb{E}[\varepsilon_i] = 0 \quad \text{Var}[\varepsilon_i] = \sigma^2, \]

that is

\[ y = \alpha \mathbf{D} y + \varepsilon \quad \text{with} \quad \mathbb{E}[y] = 0 \quad \mathbb{E}[\varepsilon] = 0 \quad \text{Var}[\varepsilon] = \mathbb{E}[\varepsilon \varepsilon^T] = \sigma^2 \mathbf{I} = \Sigma, \]

where \( \mathbf{D} \) is an \( n \times n \) spatial weights (not necessarily symmetric) matrix with zeros on the diagonal and non-negative values off-diagonals, and \( \alpha \) represents the spatial autoregressive coefficient. Solving the model, one obtains

\[ y = (\mathbf{I} - \alpha \mathbf{D})^{-1} \varepsilon \quad \text{with} \quad \text{Var}[y] = \mathbb{E}[yy^T] = \Sigma \left((\mathbf{I} - \alpha \mathbf{D})^T (\mathbf{I} - \alpha \mathbf{D})\right)^{-1}. \]

As in the paper, a mixed SAR approach corrects the model

\[ y = \mathbf{X} \beta + \varepsilon, \]

by a weighted average of the values on nearby observations, \( \mathbf{D} y \), such that

\[ y = \alpha \mathbf{D} y + \mathbf{X} \beta + \varepsilon \quad \varepsilon \sim N(0, \sigma^2 \mathbf{I}). \]  \hfill (13)

If so

\[ y = (\mathbf{I} - \alpha \mathbf{D})^{-1} \mathbf{X} \beta + (\mathbf{I} - \alpha \mathbf{D})^{-1} \varepsilon. \]

Under the usual conditions, \( (\mathbf{I} - \alpha \mathbf{D})^{-1} = \mathbf{I} + \alpha \mathbf{D} + \alpha^2 \mathbf{D}^2 + \cdots \). See Anselin (2001). It is therefore clear that each observation is determined by the values of all exogenous variables at all locations through a distance decay function, \( (\mathbf{I} - \alpha \mathbf{D})^{-1} \), which acts as a spatial multiplier.

The CAR approach uses the conditional expectations

\[
\begin{align*}
\mathbb{E}[y_i | y_{i,j \neq i}] &= \phi \sum_{j \neq i} c_{ij} y_j \Leftrightarrow \mathbb{E}[y_i | y^*] = \phi \mathbf{C} y \Rightarrow y = (\mathbf{I} - \phi \mathbf{C}) = u \\
\text{Var}[y_i | y_{i,j \neq i}] &= \sigma^2 \Leftrightarrow \text{Var}[y_i | y^*] = \sigma^2 \mathbf{I} = \Sigma \\
\text{Var}[y] &= \Sigma (\mathbf{I} - \phi \mathbf{C})^{-1} \quad \text{Var}[u] = \Sigma (\mathbf{I} - \phi \mathbf{C}) = \Sigma (\mathbf{I} - \phi \mathbf{C})^T,
\end{align*}
\]

where \( \mathbf{C} \) is a \( n \times n \) symmetric weighting matrix with zeros on the diagonal and non-negative values off-diagonals and \( \phi \) is a spatial autoregressive coefficient.

Usually the \( \mathbf{C} \) and \( \mathbf{D} \) matrices are normalized such that their rows sum to 1. As illustrations how to construct the \( \mathbf{C} \) and \( \mathbf{D} \) matrices see Pace and Barry (1997b) and Pace and Barry (1997c). Naturally, a non-zero entry in the \( j \)th column of the \( i \)th row of any of these matrices indicates that the \( j \)th observation will be used to adjust the prediction of the \( i \)th observation \((i \neq j)\). As the particular observation cannot predict itself, the diagonal elements are all zero. This being said, it is apparent that

\begin{itemize}
  \item Usually, one can choose weighting matrices in accordance to Delaunay triangles or to nearest neighbours. In the first case, the spatial weighting matrix leads to a variance-covariance matrix that depends upon only one parameter, \( i.e. \) the spatial autoregressive coefficient. In the second case, the spatial weighting matrix leads to a variance-covariance matrix that depends upon three parameters, \( i.e. \) the spatial autoregressive coefficient, the number of neighbours and the rate of decay of the influence of neighbours.
\end{itemize}
spatial estimators rely upon the examination of the \( n^2 \) possible relations between \( n \) observations. But, as we reasonably assume that the direct influence of sufficiently distant observations upon a particular observation decay to 0, those matrices are usually sparse and that may be used to overcome obvious computational difficulties.

Despite being possible to use some form of generalised least squares, the fact is that spatial estimators are usually obtained through maximum likelihood methods. For instance, the profile likelihood function for the SAR model (13)

\[
y - \alpha D y = X \beta + \varepsilon
\]

is then

\[
L (\beta, \alpha, \sigma^2) = c + \ln |I - \alpha D| - \frac{n}{2} \ln (SSE),
\]

where \( c \) represents a constant and \( SSE \) denotes the sum-of-squared errors.

After this brief exposition of the econometric issues we now proceed with the estimation of CAR and SAR models for each of the two parties, PS and PSD. For both models, the locational coordinates of the Portuguese municipalities, as shown by figure 8 in the Annex, are of crucial importance. From those spatial coordinates it is then possible to obtain the spatial weight matrix based on Delaunay triangulation.\(^{18}\) The following figure plots the non-zero elements of that Delaunay weight matrix and it clearly shows how sparse is the matrix.

![Figure 3: Plot of the Spatial Weight Matrix](image)

The following table shows the estimates of the coefficients for the CAR and SAR models and makes the comparison with the OLS counterparts.

<table>
<thead>
<tr>
<th></th>
<th>OLS</th>
<th></th>
<th>CAR</th>
<th></th>
<th>SAR</th>
<th></th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>PS</td>
<td>PSD</td>
<td>PS</td>
<td>PSD</td>
<td>PS</td>
<td>PSD</td>
</tr>
<tr>
<td>Constant</td>
<td>0.3078</td>
<td>0.4306</td>
<td>0.3202</td>
<td>0.4507</td>
<td>0.3259</td>
<td>0.4434</td>
</tr>
<tr>
<td>Mun.</td>
<td>0.0714</td>
<td>0.1325</td>
<td>0.0527</td>
<td>0.0632</td>
<td>0.0510</td>
<td>0.0595</td>
</tr>
<tr>
<td>UnempRate</td>
<td>0.5140</td>
<td>-1.1054</td>
<td>0.3939</td>
<td>-0.8363</td>
<td>0.3671</td>
<td>-0.7596</td>
</tr>
</tbody>
</table>

\(^{18}\) Again, almost all of the following results were obtained thorough the use of a Spatial Statistics Toolbox for MATLAB, due to Kelley Pace.
From the results, three facts should be highlighted. In the first place, all the three methods lead to estimates of the same sign. In this sense, the explicit consideration of spatial issues do not contradict the predictions of the model supporting the decision of voters. In the second place, the results for the spatial models are, somehow, similar but, according to the CAR approach, the non-constant elements, i.e. the effect of the party ruling the municipality and the effect of the unemployment rate, exert, in absolute terms, a stronger effect on the percentage of votes obtained by the two main parties in Portugal than that corresponding to the SAR approach. In the third place, both spatial approaches lead to results, in magnitude, distinct from those obtained through the non-spatial OLS. This is so because, in fact, for both models, the estimated spatial autoregressive coefficients assume quite large values, clearly indicating that spatially lagged variables, which the non-spatial OLS omits, lead these methods towards other values for the estimates. Quite remarkably the estimated autoregressive coefficients are as follows: 0.98 (CAR - PS model), 0.99 (CAR - PSD model), 0.77 (SAR - PS model) and 0.86 (SAR - PSD model). These maximum likelihood values are easily confirmed by the figures of the profile log-likelihoods by variable which are, as an illustration for the SAR models, plotted below.

Moreover, an inspection of the log-likelihood ratio tests associated with each variable reveals significance for all of the results.
A natural way of assessing the increase on the quality of the results obtained through the application of spatial econometrics techniques, in comparison with non-spatial ones, is the examination of residuals. Plainly, as figures 1 and 2 show, the OLS models present clear evidence of spatial autocorrelation on the residuals. See also figures 6 and 7 in the annex. This is apparently (and obviously) not the case for the residuals corresponding to the CAR and SAR models. See figures 9, 10, 11 and 12 in the annex. In fact, the regression of the estimated residuals on the estimated residuals of the nearest neighbour municipality whose results were

\[
\hat{u}_t = 5.241E-06 - 0.1082 \hat{u}_{t Nearest Neighbour} \quad \text{CAR-PS model}
\]

\[
\hat{u}_t = 8.042E-05 - 0.0820 \hat{u}_{t Nearest Neighbour} \quad \text{CAR-PSD model}
\]

\[
\hat{u}_t = -8.063E-06 + 0.0131 \hat{u}_{t Nearest Neighbour} \quad \text{SAR-PS model}
\]

\[
\hat{u}_t = -1.4523E-05 + 0.0219 \hat{u}_{t Nearest Neighbour} \quad \text{SAR-PSD model}
\]

show no significant evidence of spatial autocorrelation.

5 Conclusion

The paper performed an exercise on spatial econometrics to validate the theoretical predictions of a model explaining the decisions to vote in accordance to the degree of unemployment aversion. To do that, we used data for the Portuguese municipalities and the election results obtained by the two main parties at the last legislative election that took place in Portugal. Besides confirming those predictions, the econometric results showed clear evidence that, indeed, spatial issues should be taken into account when trying to understand the Portuguese election results. Plainly, the large
spatial autoregressive coefficients that were obtained indicate the importance of geographically correlated variables which are simply omitted by non-spatial econometrics methods. In this sense, it is not surprising that geographically correlated variables contributed for a substantial increase on the overall fit. Despite not being an objective to obtain a model with the maximum predictive power, it is of striking importance to highlight that the $R^2$ increased from the 0.21 (PS) and 0.36 (PSD) for OLS to values substantially larger as 0.61 (CAR - PS model) and 0.79 (CAR - PSD model) or to 0.58 (SAR - PS model) and 0.78 (SAR - PSD model). To sum up, in our opinion, the paper certainly reveals results that deserve to be further explored in future occasions. For the moment, it is our hope that the paper has contributed to show that, in order to understand the election results in Portugal, a spatial econometrics point of view is essential, not only for economists but also for politicians.

References


6 **Annex**

![Spatial Autocorrelation Evidence - PS](image)

Figure 6: The regression of $\hat{u}_{PS}$ on $\hat{u}_{PS}$ (nearest neighbour)
Figure 7: The regression of $\hat{u}_{PSD}$ on $\hat{u}_{PSD}$ (nearest neighbour)
Figure 8: The geographical coordinates of the Portuguese municipalities
Figure 9: Residuals of the CAR–PS model
Figure 10: Residuals of the CAR–PSD model
Figure 11: Residuals of the SAR–PS model
Figure 12: Residuals of the SAR–PSD model