

1 **Lyme borreliosis incidence in Lombardy, Italy (2000-2015): spatiotemporal analysis and**  
2 **environmental risk factors.**

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33

## 34 **Abstract**

35 Lyme borreliosis cases have been reported from Lombardy in northern Italy, where *Ixodes ricinus* is  
36 the main vector of *Borrelia burgdorferi* sensu lato. However, spatial and temporal variation in the  
37 incidence of Lyme borreliosis is not well understood. In the present study, based on new notified  
38 cases of Lyme borreliosis from 2000 to 2015, an average of 1.24 new cases per million residents per  
39 year was documented. New cases, georeferenced at the municipal level, were analyzed by  
40 retrospective space-time analysis (using SaTScan v. 9.3.1); and land cover, extrapolated from a  
41 Corine Land Cover dataset (using QGIS 2.8.1), was used to implement an environmental risk factor  
42 analysis. Firstly, a temporal high-risk cluster was detected in Lombardy: the relative risk of Lyme  
43 borreliosis was 3.73 times higher during 2008-2015 compared with the entire study period. Moreover,  
44 in a spatiotemporal high-risk cluster with a circular base, land cover consisting of wildland-urban  
45 interface, meadow, forest and meadow-forest transition were significantly higher compared to low-  
46 risk areas. Results of the present study demonstrate that the incidence of Lyme borreliosis is  
47 increasing in Lombardy and that environmental conditions are suitable for *I. ricinus* ticks infected  
48 with *B. burgdorferi* s.l.: citizens and health systems should be aware of Lyme borreliosis to reduce  
49 tick bites with personal protective behaviors and to avoid misdiagnosis, particularly within the area  
50 including the observed high-risk cluster. Economic resources should be invested to inform about  
51 methods to prevent tick bites, how to check people and pets after frequenting risk areas, and ways of  
52 removing the biting ticks when they are found.

53

54 **Keywords** Lyme borreliosis incidence, Spatial analysis, Environmental risk factors, *Borrelia*  
55 *burgdorferi* sensu lato, Epidemiology.

56

## 57 **1. Introduction**

58 The *Borrelia burgdorferi* sensu lato (s.l.) complex includes several causative agents of Lyme  
59 borreliosis in western Europe, where the hard tick *Ixodes ricinus* is the main vector. The incidence of  
60 tick-borne diseases is increasing worldwide, and this trend has been widely documented for Lyme  
61 borreliosis (Rizzoli et al., 2011; Kugeler et al., 2015). Lyme borreliosis eco-epidemiology is complex  
62 as it depends on: tick development and survival; abundance of vertebrates serving as spirochete  
63 reservoirs; hosts that contribute to the spread of the tick; and human exposure to tick-bites (Kilpatrick  
64 et al., 2017). All these factors are linked to environmental features, and geospatial analysis tools have  
65 proved to be helpful in the understanding of tick-borne disease epidemiology (Svec et al., 2013).

66 In Italy, the first case of Lyme borreliosis was recorded in northern Italy in 1983 (Crovato et  
67 al., 1985) and since then most new cases have been observed in the Liguria, Friuli-Venezia Giulia,

68 and Trentino-Alto Adige regions (Cimmino et al., 1992; Pavan et al., 2000; Nazzi et al., 2010). At  
69 present, these northern regions have higher incidence of Lyme borreliosis compared to central and  
70 southern Italy, where Lyme borreliosis appears to be hypoendemic (Santino et al., 1995; Santino et  
71 al., 1996; Fazii and Riario Sforza, 1999). Some regions of northern Italy, such as Piedmont and  
72 Lombardy, also have low incidence or report only sporadic cases (Orani and Sala, 1994; Casbaianca  
73 et al., 1996). Following the increase of diagnosed cases since 1983, the Ministry of Health included  
74 Lyme borreliosis in the list of notifiable diseases in 1992. In Lombardy, the most populous region of  
75 Italy, *I. ricinus* has long been known to be present and *B. burgdorferi* s.l. spirochetes have been  
76 detected in this tick (Scali et al., 2001; Pistone et al., 2010; Olivieri et al., 2010). Despite this, the  
77 epidemiology and spatial distribution of Lyme borreliosis cases are poorly understood, and the  
78 regional trend of disease incidence has not been described. To fill these knowledge gaps, the present  
79 study aimed to evaluate i) the incidence of Lyme borreliosis in the resident population of Lombardy  
80 from 2000 to 2015; ii) the distribution of new cases with a retrospective spatiotemporal analysis; and  
81 iii) the existence of environmental predictors for disease incidence. To address these research  
82 questions, new cases of Lyme borreliosis, georeferenced at the municipal level, were analyzed by  
83 space-time scan statistic (Kulldorff, 1997) followed by an environmental risk factors analysis based  
84 on a Corine Land Cover dataset.

85

## 86 **2. Materials and Methods**

### 87 *2.1. Study area and data sources.*

88 Lombardy is a region of northern Italy (Latitude: 45°40' N; Longitude: 9°30' E), covering  
89 23,863.7 km<sup>2</sup> and divided into 12 provinces (Figure 1). It is the most populous region of Italy, with a  
90 population density of 419.7 inhabitants per km<sup>2</sup>. The health care system is regionally managed in  
91 Italy, and notifiable diseases are recorded at the regional level. For the study, new notified cases of  
92 Lyme borreliosis in the resident population from 2000 (January the 1st) to 2015 (December the 31st)  
93 were obtained from the Rare Disease Register of the Lombardy Region. Age, sex, municipality of  
94 residence and date of notification were collected for each case. We verified that notifications were  
95 always done in the same year as the appearance of symptoms, so in the annual based statistical  
96 analysis, no bias was introduced due to the time lag between diagnosis and notification. Sporadic  
97 information about travel-associated cases was recorded only for non-residents, and these were not  
98 included in the present study. Annual demographic data for the Lombardy resident population were  
99 obtained from the National Institute of Statistic (Istituto Nazionale di Statistica, ISTAT,  
100 <http://demo.istat.it/>) at the municipal level. For each year and municipality, the age of the resident  
101 population (male or female) was grouped in 5-yr age classes, ranging from one (0-4 years old) to 19

102 (more than 90 years old); Lyme borreliosis cases (male or female) were then assigned to age class.  
103 Also, the shapefile of administrative areas was downloaded from the ISTAT website  
104 (<http://www.istat.it/it/archivio/104317>); using QGIS 2.8.1 (Quantum GIS Development Team,  
105 [www.qgis.org](http://www.qgis.org)), centroids of municipal areas were determined, and their geographical coordinates  
106 were exported. Lyme borreliosis cases were coupled with their municipalities of residence. Annual  
107 incidences were determined for the study period and mean provincial annual incidences were also  
108 calculated. Eleven provincial incidences were determined, although Lombardy Region is currently  
109 composed of twelve provinces. The Monza-Brianza province was created during the study period (in  
110 2009) so demographic data for municipalities in the Monza-Brianza and Milan provinces were  
111 merged and considered as single province for incidence calculation.

### 112 *2.2. Retrospective space-time analysis.*

113 To evaluate whether or not there was a higher than expected Lyme borreliosis incidence in  
114 some areas within the Lombardy Region and during different time periods, retrospective space-time  
115 analysis was performed using SaTScan v. 9.3.1 (Kulldorff et al., 1998). The space-time scan statistic  
116 is defined by a cylindrical window with a circular or elliptic geographic base and with the height  
117 corresponding to time. The window imposed on the map is in turn centered on each of several possible  
118 grid points positioned throughout the study region. For each grid point, the radius of the window  
119 varies continuously in size from zero; an upper limit of 50 percent of the population at risk was  
120 specified. In this way, the circular or elliptic window is flexible in both location and size. In total, the  
121 method creates an infinite number of distinct geographical windows with different sets of neighboring  
122 data locations within them. Each circle or ellipse is a possible candidate cluster, while the height  
123 reflects the period of potential clusters; the minimum (1 yr) and maximum (50 percent of the study  
124 period) temporal cluster size were specified (Kulldorff, 1997). Population file uploaded in SaTScan  
125 for scan statistic with discrete Poisson model contained census data for each municipality at each  
126 January the 1st of the period 2001-2015, divided into the 19 age classes of male and female residents.  
127 The same categorical covariates were introduced in the case file, so an adjustment for age class and  
128 sex was included in the space-time analysis. The coordinates file incorporated municipal UTM zone  
129 32N coordinates on the WGS84 Datum to create both circular and elliptic windows.

130 To evaluate the temporal trend of Lyme borreliosis incidence through the study period,  
131 Kendall's tau-b correlation was used.

### 132 *2.3. Explanatory spatial analysis.*

133 To separate associations between environmental features and Lyme borreliosis incidence in  
134 Lombardy Region, data on land cover classes and their spatial proportion in each municipality were  
135 obtained from the Corine Land Cover (CLC) dataset of the National Environmental Information

136 System (Sistema Informativo Ambientale Nazionale, <http://www.sinanet.isprambiente.it/it/sia->  
137 [ispra/download-mais/corine-land-cover/](http://www.sinanet.isprambiente.it/it/sia-ispra/download-mais/corine-land-cover/)). Fifty-five classes of land cover were categorized in this  
138 dataset. The CLC nomenclature for levels I, II, III was the one described by Bossard et al. (2000) and  
139 Heymann et al. (1994). Average altitude (in meters above sea level, m a.s.l.) for each municipality  
140 was obtained from ISTAT (<http://www.istat.it/it/archivio/156224>).

141 Municipalities with centroids located inside or outside the cylindrical high-risk spatiotemporal  
142 cluster(s) were tested for environmental differences by a generalized linear model (GLM) with binary  
143 logistic regression. The percentages of municipal area covered by each of the CLC land cover classes  
144 and the altitude were considered independent variables; CLC classes that covered less than 0.2% of  
145 area both inside and outside the cluster(s) were excluded. Location of a municipal centroid inside  
146 versus outside the cluster(s) was the dependent variable. Independent variables were tested for  
147 multicollinearity by tolerance and variance inflation factor (VIF); the final model was obtained by  
148 backward elimination of not significant independent variable and Akaike Information Criterion  
149 (AIC). Statistical analyses were performed using SPSS ver. 20 (IBM, Chicago, IL, U.S.A.).  
150 The analysis workflow of the present study is schematized in the block diagram presented in the  
151 supplementary material (Fig. S1)

152

### 153 **3. Results**

154 In the 16 years from 2000 to 2015, 189 new cases of Lyme borreliosis were recorded in the  
155 resident population of the Lombardy Region (11.8 new cases/year). The resident population  
156 amounted to 9,523,648 people: an average of 1.24 new cases per million of residents per year was  
157 observed. The spatial distribution of municipalities in which these cases were recorded is shown in  
158 Figure 2. The annual incidence across the study period varied from 0.3 (minimum, observed in 2005)  
159 to 2.6 (maximum, observed in 2014) new cases per million of residents; and the provincial incidence  
160 varied from 0.3 to 7.6 new cases per year recorded in Lodi and Sondrio provinces respectively (Figure  
161 3).

#### 162 *3.1. Retrospective spatiotemporal analysis.*

163 The retrospective spatiotemporal analysis of Lyme borreliosis incidence produced both a  
164 purely temporal and a spatiotemporal high-risk significant cluster. The temporally significant cluster  
165 covered an eight-year period (from 2008, January the 1st to 2015, December the 31st) and  
166 allmunicipal centroids were included (relative risk=3.73; p-value<0.001). During this period, under  
167 the space-time scan statistic's null hypothesis of homogeneous distribution of incidence, the number  
168 of expected new cases of Lyme borreliosis in the Lombardy Region resident population was 97.5.  
169 However, the actual number of observed new cases was 151 (observed/expected ratio=1.55), with an

170 average of 1.98 new cases per million of residents per year (Figure 4). Further, a strong positive  
171 correlation was detected between year and Lyme borreliosis incidence in the resident population by  
172 Kendall's tau-b correlation ( $\tau_b=0.633$ ;  $p<0.001$ ).

173 The high-risk spatiotemporal cluster presented a circular base (relative risk=14.01; p-  
174 value<0.001); it covered the same time period as the previously described temporal cluster (Figure  
175 5). The latitude and longitude of its center were 46°9'58.55"N and 9°26'40.47"E, respectively, and its  
176 radius length measured 42.33 km. Throughout the study period, the risk of Lyme borreliosis was 14.0  
177 times higher for residents in this space-time cylinder than for people residing outside it. Out of 1,530  
178 locations (total municipal centroids of Lombardy Region), 225 municipalities with 436,360 resident  
179 people were situated inside this cluster. Municipalities situated inside the spatiotemporal cluster  
180 belonged to Bergamo, Como, Lecco and Sondrio provinces. A mean municipal altitude of 991 m a.s.l.  
181 (s.d. 466) was observed within the cluster, while the regional mean is 406 m a.s.l. (s.d. 458).  
182 Moreover, within the cluster, expected and actual observed new cases of Lyme borreliosis were 4.4  
183 and 47 respectively (observed/expected ratio=10.8), with an average of 13.5 new recorded cases per  
184 million of residents per year. No spatiotemporal clusters presenting an elliptic base were detected.

### 185 3.2. Explanatory spatial analysis.

186 Fourteen CLC land cover classes, out of 36, each covered less than 0.2% of the surface both  
187 inside and outside the cluster obtained with the retrospective spatial analysis: these were excluded in  
188 the construction of the GLM. The coverage by the remaining 22 classes and municipality altitudes  
189 were tested for multicollinearity: class 2111 of CLC (tolerance=0.041; VIF=24.602) and altitude  
190 (tolerance=0.134; VIF=6.266) were excluded. The complete list of variables included and excluded  
191 for statistical analysis are presented in Table S1 of the supplementary material. The backward  
192 elimination of all non-significant independent variables required seven steps, but the best AIC was  
193 obtained after six steps; so, class 332 ("Bare rocks") remained in the final model despite the p-  
194 value>0.05. Overall, percentages of area covered by 12 different classes of CLC (112, 231, 243, 311,  
195 312, 313, 321, 322, 324, 333, 511, 512) were significant positive predictors of being inside the high-  
196 risk cluster of Lyme borreliosis incidence (Table S2 and S3). The listed type of land cover positively  
197 associated with Lyme borreliosis incidence are classified as "Artificial surfaces" (class 112, odds  
198 ratio: 1.051), "Agricultural areas" (classes 231 and 243; odds ratios: 1.078 and 1.068, respectively),  
199 "Forest and semi-natural areas" (classes 311, 312, 313, 321, 322, 324 and 333; odds ratios: 1.075,  
200 1.091, 1.089, 1.127, 1.106, 1.072 and 1.117, respectively), and "Water courses" (classes 511 and 512;  
201 odds ratios: 1.083 and 1.116, respectively).

202

## 203 4. Discussion

204 According to Sykes and Makiello (2017), the incidence of Lyme borreliosis in Italy during  
205 2001-2015 was 0.01 new cases per million of resident population/year, but the disease is probably  
206 underdiagnosed and underreported. During our study period (2000-2015), 1.24 new cases per million  
207 residents/year were observed in Lombardy. Noticeable differences were documented both between  
208 years and between provinces (Figure 3): the annual incidence for 2014 was 2.61, more than twice the  
209 average for 2001-2015, and the mean annual incidence for Sondrio, the northernmost province, was  
210 7.63, more than six times the regional average.

#### 211 *4.1. Retrospective spatiotemporal analysis.*

212 The scan statistic showed the incidence of Lyme borreliosis in Lombardy to be heterogeneous  
213 both in space and time. Firstly, the detected temporally significant cluster demonstrated that the  
214 incidence of Lyme borreliosis is increasing over time in Lombardy. Attention towards the disease has  
215 grown over the years and the observed increasing incidence is probably partially due to growing  
216 awareness of clinicians and demand for testing (Mavin et al., 2015). Nevertheless, a real increase of  
217 Lyme borreliosis incidence likely occurred in Lombardy Region, similar to other European and North  
218 American studies reporting an increase of ticks, tick bites and Lyme borreliosis (Rizzoli et al., 2011;  
219 Vandenesch et al., 2014; Kugeler et al., 2015). This phenomenon could be due to several factors, such  
220 as those influencing vectors, reservoir hosts and human-tick encounters (Lindgren and Jaenson,  
221 2006). The present study showed that about 15% of regional municipalities (225/1530) and 5% of the  
222 regional resident population (436,360/9,523,648) were located inside the detected high-risk space-  
223 time cluster of Lyme borreliosis. From 2008-2015, the annual incidence of Lyme borreliosis in the  
224 resident population within the cluster was about eleven times greater than the regional average in the  
225 whole study period (13.5 new cases per million of resident people per year versus 1.2). Possible bias  
226 of our spatiotemporal retrospective analysis could lie in the low incidence of Lyme borreliosis  
227 registered in Lombardy: different attitudes in notifying the disease in certain health structures could  
228 lead to errors. However, we must consider that the overall spatial distribution of cases concerns the  
229 whole region (Figure 2), thus making us assume that this error was contained. Furthermore, the results  
230 of the explanatory spatial analysis discussed below seemed to confirm that the identified high-risk  
231 area presented environmental characteristics suitable for the spread of Lyme borreliosis. Finally, the  
232 spatiotemporal analysis, taking into account the population density and the population structure at a  
233 highly detailed level, minimizes the possible errors related to specific segments of the population  
234 exposed to the disease (Li et al., 2014), so the existence of this cluster can be considered reliable.

#### 235 *4.2. Explanatory spatial analysis.*

236 Environmental differences were detected between municipalities situated inside and outside  
237 the regional high-risk space-time cluster of Lyme borreliosis incidence: municipal area percentages

238 for 13 different land cover classes were predictors of being located within the cluster (Table S3).  
239 Class 112 ("Discontinuous urban fabric") was positively related to high risk for Lyme borreliosis  
240 incidence. It could be hypothesized that the "Discontinuous urban fabric" land cover class is  
241 positively associated with human-tick encounters. Previously, the 'emergence' of Lyme borreliosis  
242 cases registered in the Czech Republic in the 1990–2000s was solely attributable to disease exposure  
243 at or near (<5 km) patients' homes and human risk for Lyme borreliosis appear to be peridomestic, at  
244 least in the northeastern United States (Diuk-Wasser et al., 2012; Zeman et al., 2013). Further, Larsen  
245 et al. (2014) observed those counties with high Lyme borreliosis incidence tended to have a large  
246 share of its population residing in the wildland-urban interface. According to these authors, the high  
247 percentage of municipal area covered by "Discontinuous urban fabric" within the high risk-cluster  
248 could determine a high exposure to tick bites at or near resident people's home. Mixes of anthropized  
249 and natural environment inside the high-risk cluster also involved agricultural activities, as evidenced  
250 by the presence as a predictor in the final model of the 243 class ("Land principally occupied by  
251 agriculture, with significant areas of natural vegetation").

252 The risk of being situated inside the high-risk cluster was also positively related to the  
253 percentage of municipal area occupied by seven CLC classes in which land cover varied from  
254 meadow (classes 231 and 321) to forest (classes 311, 312 and 313), and meadow-forest transition  
255 (classes 322 and 324). These results agree with observations made elsewhere in Europe, in which *I.*  
256 *ricinus* samples were collected in localities characterized by deciduous or mixed  
257 deciduous/coniferous woodland or eco-tones between woodland and open, meadow-like areas  
258 (Jaenson et al., 2009). We also found that the percentage of municipal area covered by coniferous  
259 forests was a positive predictor of being within the high-risk cluster; then, not only broadleaf/mixed  
260 forests but also specific types of coniferous forests can probably produce a layer of decaying  
261 vegetation on the ground providing sufficient humidity for the development and survival of ticks and  
262 supporting a range of potential vertebrate reservoir hosts (Stanek et al., 2012). Higher percentage of  
263 municipal area covered by classes 231, 321, 311, 312, 313, 322 and 324 inside the high-risk cluster  
264 seem to be also consistent with previous studies that underlined, mainly in North America, the  
265 importance of forest fragmentation and forest-herbaceous edge for Lyme borreliosis incidence  
266 (Jackson et al., 2006; Horobik et al., 2006). European Lyme borreliosis studies have focused more on  
267 climate and less on local site-specific or landscape characteristics, so possibilities for comparisons  
268 are scarce (Killilea et al., 2008). In Central France, Halos et al. (2010) observed that the rate of *B.*  
269 *burgdorferi* s.l. infection in *I. ricinus* was higher in questing ticks collected both from the forest and  
270 the fragmented forest than those from pastures. Moreover, in the sub-sample from pastures, the  
271 infection rate of ticks was higher when forests surrounded pastures with low perimeter length/surface



272 area ratios and having a high percentage of shrubs on the perimeter. Further, in habitats characterized  
273 by forest, pasture and hedgerow/ecotones, rodents and birds, suitable hosts for younger stages of *I.*  
274 *ricinus*, were particularly concentrated in the shrubby vegetation around pastures; rodents were more  
275 often captured near hedgerows between pasture and woodland than inside pastures and forest (Boyard  
276 et al., 2008; Vourc'h et al., 2008). Apparently, in Central France, the spatial distribution of both small  
277 hosts and ticks infected by *B. burgdorferi* s.l., grossly fitted with the twelve cited explanatory  
278 variables of the final model obtained in the present study. Nevertheless, a relation between infection  
279 rates in vectors and Lyme borreliosis in humans has not been verified; more often Lyme borreliosis  
280 appeared linked to density of infected ticks and tick density, which probably is mainly affected by  
281 host availability (Nazzi et al., 2010; Sonnleitner et al., 2015; Randolph, 2001). The association of  
282 Lyme borreliosis cases with certain land cover classes could be related to the presence of hosts  
283 required by *I. ricinus* for its life cycle. Hofmesteeer et al. (2016) quantified the relative importance of  
284 host groups providing blood meals for different life stages of *I. ricinus*. Rodents, birds (thrushes and  
285 other small birds) and ungulates played the main role in maintaining and disseminating tick populations.  
286 Inside the high-risk cluster of Lyme borreliosis incidence, observed typologies of cultivated and  
287 natural areas favor all the listed host groups. Particularly, vegetation within the cluster seemed highly  
288 suitable for some ungulates. In Lombardy, the highest population density of roe deer (*Capreolus*  
289 *capreolus*) was observed inside the high-risk cluster (Carnevali et al., 2009). Moreover, in northern  
290 Italy, Manfredi et al. (1999) observed that higher frequency of tick-bites was recorded in  
291 municipalities with higher roe deer density. As regards red deer (*Cervus elaphus*) living in the  
292 mountain forest of Lombardy, its population density inside the Lyme borreliosis high-risk cluster is  
293 lower than that of roe deer, and it does not differ from surrounding areas. Further, the regional  
294 population density of Alpine chamois (*Rupicapra rupicapra*) peaks within the high-risk cluster, but  
295 probably it is less relevant for the dissemination of ticks: *I. ricinus* infestation prevalence is higher in  
296 roe deer than in chamois living in the same areas (Hoby et al., 2009). Presence of wild boar (*Sus*  
297 *scrofa*) and ibex (*Capra ibex*) within the cluster is scarce or sparse (Carnevali et al., 2009).

## 298 **5. Conclusions**

299 In conclusion, the results presented in this study showed that the incidence of Lyme borreliosis  
300 in Lombardy is higher than the estimates previously proposed for Italy (Sykes and Makiello, 2017).  
301 Increasing incidence of Lyme borreliosis must be taken into account by healthcare practitioners, who  
302 should always consider a differential diagnosis with Lyme borreliosis in patients with compatible  
303 clinical symptoms. Further, medical staff should always be encouraged to report cases of the disease,  
304 and the resident population should also be aware of this situation. Finally, information campaigns  
305 should be put into practice on behaviors to reduce the risk and duration of tick bites, particularly

306 within the identified high-risk cluster. The social and economic costs of Lyme borreliosis should push  
307 investments primarily in the direction of prevention and, when necessary, early treatment of the  
308 disease, with appropriate training for health personnel and population exposed to the risk of  
309 transmission (Rizzoli et al., 2011; Lohr et al 2015; Mac et al. 2019). Implementation of local efficient  
310 and cost-effective vector monitoring should also be considered (Capelli et al., 2012).

311

### 312 **Conflict of interest**

313 The authors declare no competing interests

314

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320

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443

444 **Figures captions.**

445 **Fig. 1.** Lombardy (dark grey) and its 12 provinces (BG: Bergamo; BS: Brescia; CR: Cremona; CO:  
446 Como; LC: Lecco; LO: Lodi; MB: Monza Brianza; MI: Milano; MN: Mantova; PV: Pavia; SO:  
447 Sondrio; VA: Varese; dotted area: Italy)

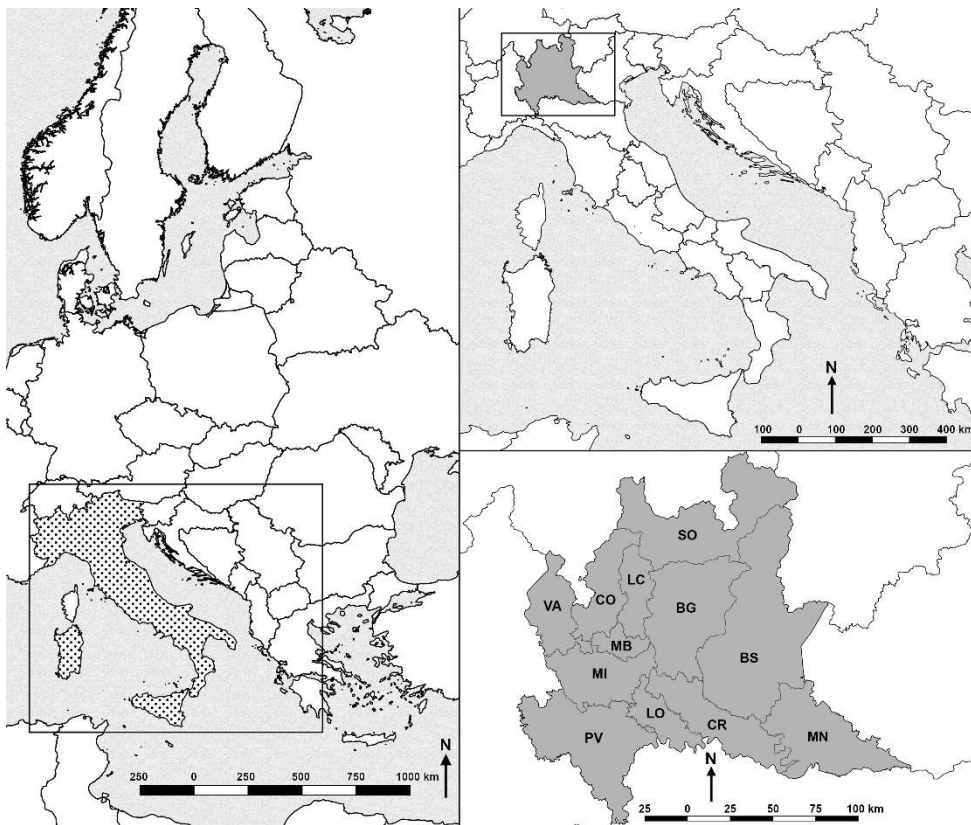
448 **Fig. 2.** Spatial distribution and number of Lyme borreliosis cases (a) and incidence of Lyme  
449 borreliosis (b) in the resident population of Lombardy at the municipal level (2000-2015)

450 **Fig. 3.** Mean provincial annual incidence of Lyme borreliosis (a) and annual incidence (dark grey  
451 bars; left vertical scale) and case number (light grey bars; right vertical scale) (b). Dashed lines  
452 indicate the mean regional annual incidence (a, b).

453 **Fig 4.** Annual incidence (columns) and time period of the temporal high-risk significant cluster of  
454 Lyme borreliosis (black bar); dashed line is the mean regional annual incidence.

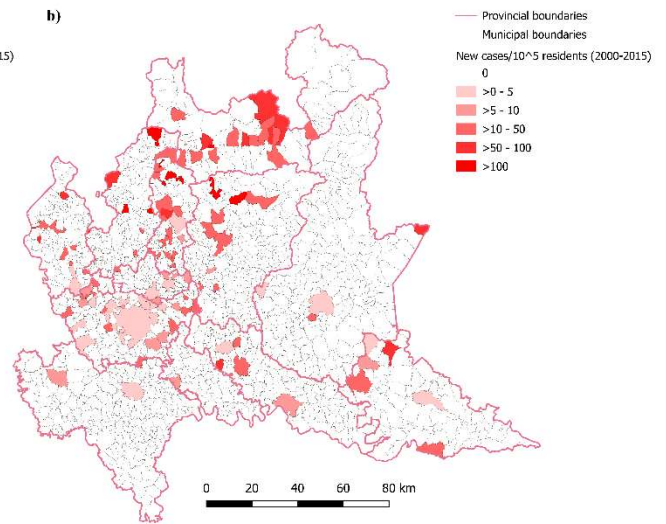
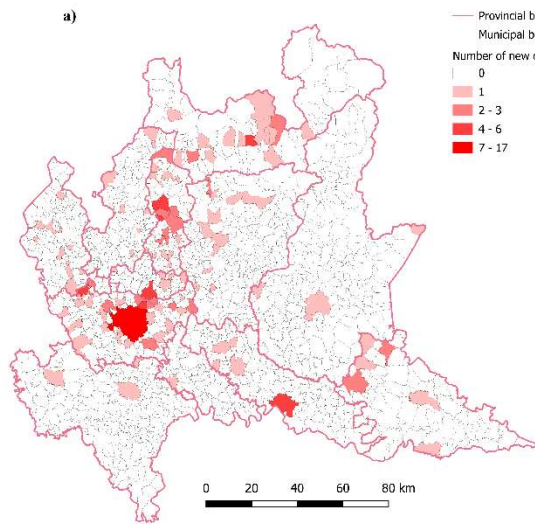
455 **Fig. 5.** Spatiotemporal high-risk significant cluster of Lyme borreliosis incidence in Lombardy (2000-  
456 2015)

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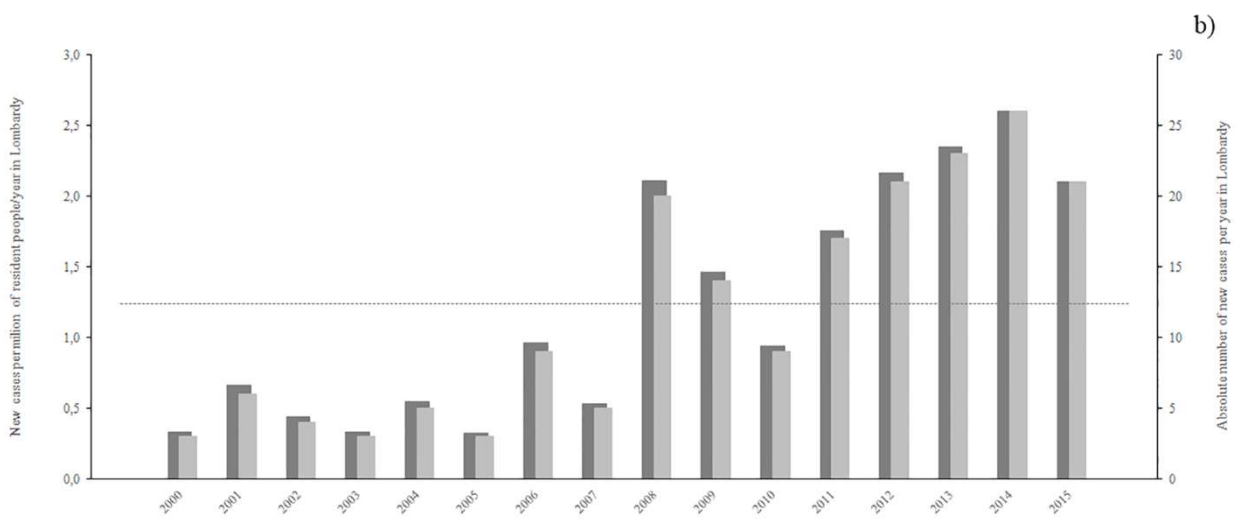
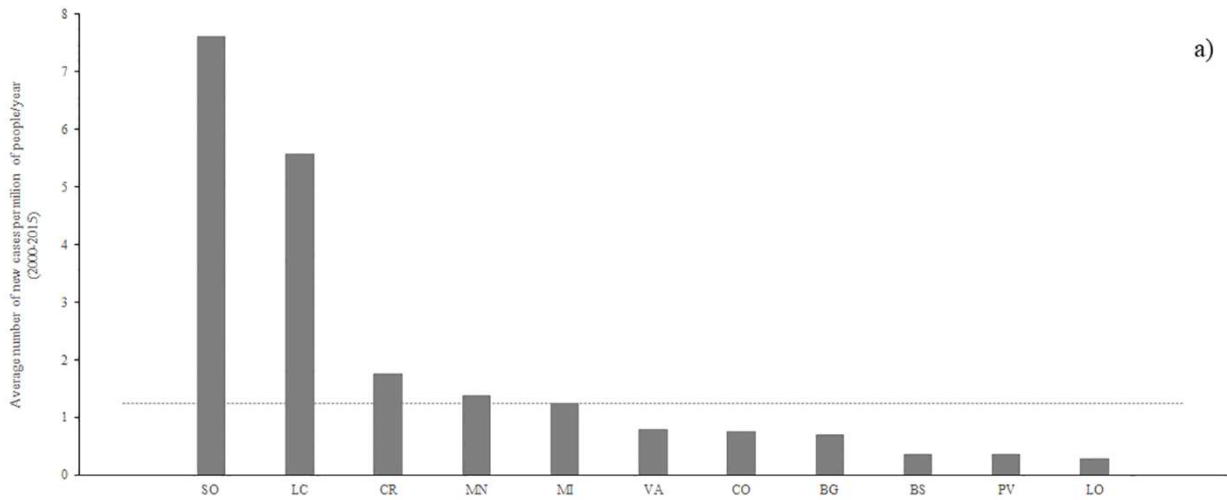
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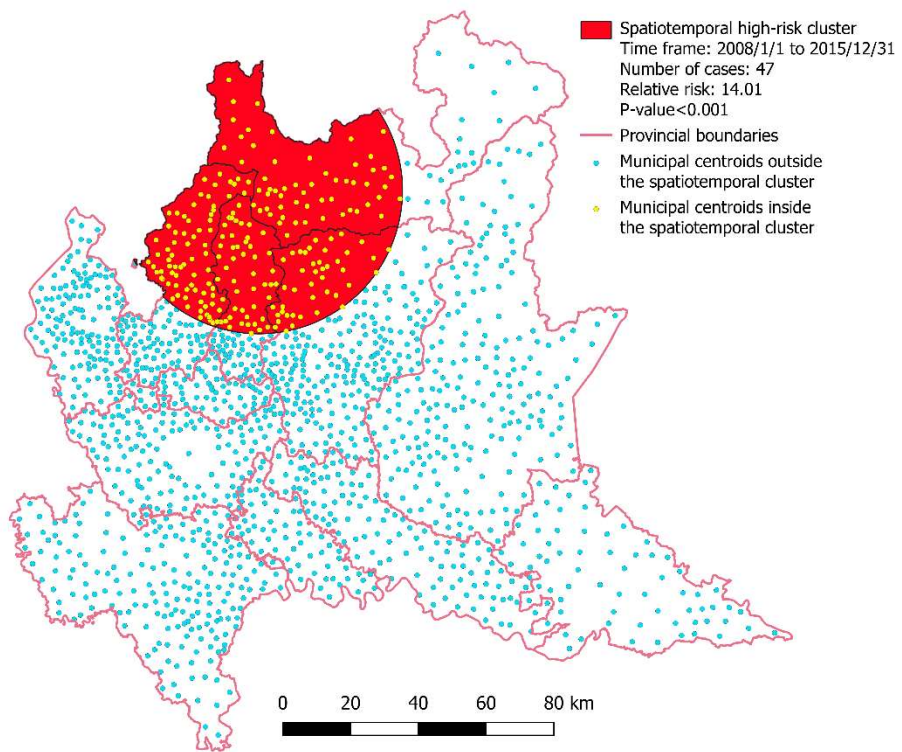
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467 **Supplementary material**  
 468 **Lyme borreliosis incidence in a hypoendemic area in Italy (2000-2015): spatiotemporal analysis**  
 469 **and territorial risk factors.**  
 470

**Table S1**  
 Variables included or excluded in the construction of the generalized  
 linear model with binary logistic regression

Variable	Included	Excluded	Cause of exclusion
111 (%)	x		--
112 (%)	x		--
121 (%)	x		--
122 (%)		x	<0.2%
124 (%)		x	<0.2%
131 (%)	x		--
132 (%)		x	<0.2%
133 (%)		x	<0.2%
141 (%)		x	<0.2%
142 (%)		x	<0.2%
211 (%)		x	Multicollinearity
212 (%)		x	<0.2%
213 (%)	x		--
221 (%)	x		--
222 (%)		x	<0.2%
223 (%)		x	<0.2%
224 (%)	x		--
231 (%)	x		--
241 (%)		x	<0.2%
242 (%)	x		--
243 (%)	x		--
322 (%)	x		--
324 (%)	x		--
331 (%)		x	<0.2%
332 (%)	x		--
333 (%)	x		--
335 (%)		x	<0.2%
311(%)	x		--
312 (%)	x		--
313 (%)	x		--
321 (%)	x		--
411 (%)		x	<0.2%
412 (%)		x	<0.2%
511 (%)	x		--
512 (%)	x		--
Altitude		x	Multicollinearity

471 (%)= percentage of municipal soil covered by the indicated CLC class  
 472 <0.2%= the CLC class covered less than 0.2% of soil  
 473

**Table S2**

Selection of final model by backward elimination and best AIC. The removal of all terms with p-values  $\geq 0.05$  required 7 steps; final model according to AIC and backward elimination was obtained at step 6.

Step of backward elimination	Eliminated variable	AIC
Full model	--	797.828
Step 1	213	802.754
Step 2	121	800.770
Step 3	221	799.404
Step 4	111	798.415
Step 5	242	797.381
Step 6	131	796.042
Step 7	332	797.103

474  
475

**Table S3**

Generalized linear model with binary logistic regression: final model

Variable	Description of Corine Land Cover classes	B $\pm$ s.e.	Wald Chi-Square test	O.R. (95% CI)	P-value
112	Discontinuos urban fabric	0.049 $\pm$ 0.010	23,192	1.051 (1.030-1.072)	<0.001
231	Pastures	0.075 $\pm$ 0.011	50,300	1.078 (1.056-1.100)	<0.001
243	Land principally occupied by agriculture, with significant areas of natural vegetation	0.066 $\pm$ 0.009	49,910	1.068 (1.049-1.088)	<0.001
311	Broad-leaved forests	0.072 $\pm$ 0.009	66,791	1.075 (1.056-1.094)	<0.001
312	Coniferous forests	0.087 $\pm$ 0.012	56,856	1.091 (1.066-1.116)	<0.001
313	Mixed forests	0.085 $\pm$ 0.009	85,996	1.089 (1.069-1.109)	<0.001
321	Natural grassland	0.120 $\pm$ 0.012	102,506	1.127 (1.102-1.154)	<0.001
322	Moors and heathland	0.101 $\pm$ 0.023	19,206	1.106 (1.057-1.157)	<0.001
324	Transitional woodland/shrub	0.070 $\pm$ 0.011	38,594	1.072 (1.049-1.096)	<0.001
332	Bare rocks	0.047 $\pm$ 0.026	3,257	1.049 (0.996-1.104)	0.071
333	Sparsely vegetated areas	0.111 $\pm$ 0.017	41,937	1.117 (1.080-1.155)	<0.001
511	Water courses	0.080 $\pm$ 0.017	22,626	1.083 (1.048-1.119)	<0.001
512	Water bodies	0.110 $\pm$ 0.013	70,293	1.116 (1.088-1.145)	<0.001

476 B: unstandardized coefficient; s.e.: standard error; O.R.: odds ratio; 95% CI: 95% confidence interval.

477



479 **Fig. S1.** The block diagram of the analysis workflow (LB: Lyme borreliosis; ISTAT: National Institute of Statistic; CLC:  
480 Corine Land Cover; SINANET: National Environmental Information System; GLM: generalized linear model; AIC:  
481 Akaike Information Criterion).  
482