



Shiga toxigenic *Escherichia coli* incidence is related to small area variation in cattle density in a region in Ireland

Title	Shiga toxigenic <i>Escherichia coli</i> incidence is related to small area variation in cattle density in a region in Ireland
Author(s)	Brehony, Carina;Cullinan, John;Cormican, Martin;Morris, D.
Publication Date	2018-05-12
Publisher	Elsevier
Repository DOI	10.1016/j.scitotenv.2018.05.038

1 **SHIGA TOXIGENIC *ESCHERICHIA COLI* INCIDENCE IS RELATED TO SMALL AREA**
2 **VARIATION IN CATTLE DENSITY IN A REGION IN IRELAND.**

3

4 **C. Brehony¹, J. Cullinan², M. Cormican^{1,3}, and D. Morris¹**

5 1. Antimicrobial Resistance and Microbial Ecology Group, School of Medicine, National
6 University of Ireland, Galway, Ireland

7 2. School of Business & Economics, National University of Ireland, Galway, Ireland

8 3. Department of Medical Microbiology, University Hospital Galway, Galway, Ireland

9

10 **Abstract**

11 **Introduction:**

12 Shiga toxigenic *Escherichia coli* (STEC) are pathogenic *E. coli* that cause infectious
13 diarrhoea. In some cases infection may be complicated by renal failure and death. The
14 incidence of human infection with STEC in Ireland is the highest in Europe. The
15 objective of the study was to examine the spatial incidence of human STEC infection in a
16 region of Ireland with significantly higher rates of STEC incidence than the national
17 average and to identify possible risk factors of STEC incidence at area level.

18

19 **Methods:**

20 Anonymised laboratory records (n=379) from 2009-2015 were obtained from
21 laboratories serving three counties in the West of Ireland. Data included location and
22 sample date. Population and electoral division (ED) data were obtained from the Irish
23 2011 Census of Population. STEC incidence was calculated for each ED (n=498) and
24 used to map hotspots/coldspots using the Getis-Ord Gi* spatial statistic and significant
25 spatial clustering using the Anselin's Local Moran's I statistic. Multivariable regression
26 analysis was used to consider the importance of a number of potential predictors of
27 STEC incidence.

28

29 **Results:**

30 Incidence rates for the seven-year period ranged from 0 to 10.9 cases per 1000. A
31 number of areas with significant local clustering of STEC incidence as well as variation
32 in the spatial distribution of the two main serogroups associated with disease in the
33 region *i.e.* O26 and O157 were identified. Cattle density was found to be a statistically
34 significant predictor of STEC in the region.

35 **Conclusions:**

36 GIS analysis of routine data indicates that cattle density is associated STEC infection in
37 this high incidence region. This finding points to the importance of agricultural
38 practices for human health and the importance of a “one-health” approach to public
39 policy in relation to agriculture, health and environment.

40

41 **Keywords:**

42 STEC, GIS, public-health, clustering, risk-factors, zoonosis

43

44 **1. Introduction**

45 Shiga toxigenic *Escherichia coli* (STEC) also known as Verocytotoxigenic *E. coli* (VTEC)
46 are pathogenic *E. coli* that are associated with a spectrum of illness. After exposure
47 some people remain asymptomatic whereas others develop self-limiting gastroenteritis
48 or bloody diarrhoea (haemorrhagic colitis). Haemolytic uraemic syndrome (HUS),
49 characterized by acute renal failure, occurs in 3-7% of cases, with those most at risk
50 being those aged less than 5 years of age [1]. The natural host for STEC are ruminants.
51 Some animals excrete the microorganism in very high numbers (termed 'super-
52 shedders') in their faeces [2][3]. The risk to humans is posed from contact with animal
53 faecal matter, through direct contact with the animals or indirectly through the
54 contaminated environment *e.g.* recreational or drinking water, or contaminated
55 foodstuffs *e.g.* raw milk, raw meat [4]. Managing the risk to humans from STEC is
56 particularly challenging as it has a very low infectious dose (<100 bacterial cells) and it
57 can survive in the environment for extended periods of time [5].

58 The incidence of human infection with STEC in Ireland has been the highest in
59 Europe since 2008; it was ten times the EU average in 2016 with 15.6 cases per 100,000
60 inhabitants in Ireland versus an average EU incidence of 1.77/100,000 [6]. Within
61 Ireland there is significant regional variation in the incidence of STEC infection. Among
62 the high incidence areas is a region of three counties (Galway, Mayo and Roscommon)
63 in the west of Ireland. In this region the crude incidence in 2016 was 26 per 100,000
64 inhabitants compared to the national average of 18 per 100,000 inhabitants [1]. By
65 contrast the incidence in a region in the east of Ireland comprised of counties Dublin,
66 Kildare and Wicklow was 7.7 per 100,000 inhabitants.

67 In Ireland, the most commonly recognised modes of STEC transmission are
68 direct animal contact, person-to-person and waterborne [1][7]. However, for a

69 significant number (13%) of cases each year, the mode of transmission is reported as
70 'unknown' or 'unspecified' [1]. Small group water supplies, untreated private wells,
71 livestock density and domestic wastewater treatment have all been implicated in STEC
72 transmission and in STEC outbreaks [1][8][9].

73 The aim of this project was to examine the spatial incidence of STEC infection in
74 a region of Ireland with higher incidence than the national average and to model the
75 relationship between STEC incidence and a range of potential predictors at a
76 geographical level. Diagnostic testing for STEC in the region is concentrated primarily in
77 one laboratory which facilitated data access.

78

79 **2. Methods**

80 Ethical approval for this study was granted by the National University of Ireland,
81 Galway Research Ethics Committee. Anonymised laboratory data for confirmed STEC
82 cases from 2009 to 2015 inclusive were obtained from diagnostic laboratories serving
83 the three counties Galway, Mayo and Roscommon. Duplicates and possible linked
84 confirmed STEC cases were removed leaving 'primary cases' (n=379). Possible linked
85 STEC cases were defined as those that were from the same electoral division (ED) with
86 the same serogroup and within one month of a 'primary case'. Metadata recorded for
87 each case included location geocoded at ED level and clinical laboratory sample receipt
88 date. There were 498 EDs in the region studied. Population and ED data including
89 number of households, land surface area (km²), household water source and household
90 wastewater treatment, were obtained from the 2011 Census of Population for Ireland
91 from the Central Statistics Office [10]. ED population ranged from 83 to 14,384
92 individuals and total land surface area ranged from 0.56 km² to 162.3 km². Population
93 data was used to calculate the cumulative incidence rate (per 1000 inhabitants) of

94 confirmed STEC cases for each ED for the study period. Data on cattle and sheep
95 numbers were obtained from the 2010 Census of Agriculture [11].

96 The calculated STEC incidence rate was used to investigate geographic clustering
97 within the region using 'hotspot' analysis and 'cluster' analysis. The hotspot analysis
98 involved calculating the Getis-Ord G_i^* [12] statistic for STEC incidence in each ED with
99 the resulting z-scores indicating where EDs with either high or low values cluster
100 spatially. For statistically significant positive/negative z-scores, the larger/smaller the
101 z-score is, the more intense the clustering of high/low values *i.e.* a hotspot/coldspot. In
102 order to be classified as a statistically significant hotspot, for example, an ED will have a
103 high z-score and be surrounded by other EDs with high z-scores. Cluster analysis, on the
104 other hand, uses Anselin's Local Moran's I test statistic [13]. Again the approach
105 involves the calculation of a test statistic (*i.e.* Local Moran's I value) along with a z-score
106 and a pseudo p-value, indicating the cluster type (or outlier) for each statistically
107 significant ED. The cluster/outlier type distinguishes between a statistically significant
108 cluster of high values (HH), cluster of low values (LL), outlier in which a high value is
109 surrounded primarily by low values (HL), and outlier in which a low value is
110 surrounded primarily by high values (LH). Statistical significance was set at 95%.

111 Finally, to consider the relationship between STEC incidence by ED and a range
112 of potential predictors, correlation and multivariable regression analyses were
113 undertaken. First, Pearson correlations between ED-level STEC incidence and the
114 various potential predictors were estimated to give an indication of the strength of
115 linear association between variables. Associated significance levels of each correlation
116 coefficient were at the 95% level. In the multivariable analysis, STEC incidence rate in
117 an ED was the dependent variable and a range of potential predictors were considered
118 (Table 1), based on data availability and previously published research [10, 11, 14, 15].

119 For the multivariable regression analysis, we estimated a stepwise (backward selection)
120 model, applying a 5% significance level for removal. This meant that the variable with
121 the greatest p-value was removed, one at a time, until all remaining variables had a p-
122 value less than the 5% threshold. We also tested the robustness of our findings by
123 applying a 10% significance level for removal, as well as by estimating a number of
124 backward stepwise models with 5% and 10% significance levels for removal and
125 addition. Overall, our main findings were robust across these different approaches.
126 Moreover, we also considered models that accounted for spatial dependence in both the
127 dependent and independent variables and found this did not alter our key conclusions.

128

129 **3. Results**

130 *3.1 STEC cases and incidence*

131 The overall seven-year incidence ranged from 0 to 10.9 cases per 1000 inhabitants
132 across the region with a mean of 0.95/1000 – equivalent to 94.57/100,000 and a per
133 year average of 13.51/100,000. There were no cases across the whole time period in
134 289 of the 498 EDs (58%). In EDs *with no* cases versus EDs *with* cases, population
135 density was lower (108 versus 182 individuals per km²), cattle density was lower (69
136 versus 81 cattle per km²), and septic tank density was lower (5.2 versus 8.5 per per
137 km²). There was seasonality in number of cases with a majority of 66.2% (251/379)
138 occurring in Spring and Summer (March to August). Within this there was a lag between
139 the two main serogroups with most O157 cases occurring earlier in the year in
140 Spring/Summer (March to August) and most O26 cases occurring slightly later in
141 Summer/Autumn (June to November). For O157, 80.3% (102/127) of cases occurred in
142 March to August while 71.7% of O26 cases occurred from June to November.

143

144 3.2 Cluster Analysis

145 Cluster analyses using the Anselin's Local Moran's I and Getis-Ord G_i^* test statistics
146 identified a number of areas with significant local clustering of STEC incidence (Figs. 1
147 and 2). For example, there were a number of both HH clusters and HL outliers, most
148 obviously in county Roscommon and east county Mayo. Moreover, there were a number
149 of HL outliers in the west and southeast of the region. In relation to the hotspot analysis,
150 there were 37 EDs (7.4%) that were identified as significant hotspots (at least 95%
151 confidence) - 21 EDs at the 95% level and 16 at the 99% level. There were no ED
152 hotspots at the 99% level in county Galway while there were four in county Mayo
153 (57.1% of hotspots) and 12 in county Roscommon (48% of hotspots). Roscommon
154 county had the largest proportion of its EDs as significant hotspots at 22.7% versus
155 4.6% and 2.1% in counties Mayo and Galway respectively.

156 The majority of cases were of the two serogroups O26 (n=172) and O157
157 (n=126), accounting for 78.6% of all cases (O157-33.2% and O26-45.4%). Getis-Ord G_i^*
158 hotspot/coldspot analysis of each serogroup indicated spatial clustering
159 (Supplementary Figs. 1 and 2) and apparent degree of non-overlapping hotspots for
160 each serogroup. A total of 22/24 (91.7%) of the O26 significant hotspots (95% level)
161 were in counties Galway and Mayo while all 33 significant O157 hotspots were in
162 counties Galway and Roscommon.

163

164 3.3 Correlation Analysis

165 The Pearson correlation analysis suggested a statistically significant degree of linear
166 association between STEC rates and cattle density (positive; $p=0.000$) and rurality
167 (positive; $p=0.0293$) (Table 2). All other variables were found to have small pairwise
168 correlations which were not statistically significant at 5%.

169 3.4 Multivariable Analysis

170 In the final iteration of the stepwise regression model (Table 3) we found that cattle
171 density was the only statistically significant predictor of STEC incidence in our sample, a
172 result that was robust across a range of alternative models. No other variable was found
173 to be significantly and robustly associated with STEC incidence in any of our
174 multivariable regression analyses. Moreover, in addition to the model presented, we
175 also estimated similar models separately for the two main serogroups *i.e.* O26 and
176 O157. In both cases we also found that cattle density was the only significant and robust
177 predictor of incidence.

178

179 4. Discussion

180 GIS is a flexible and adaptable methodology with a wide range of uses such as
181 identifying and ameliorating public health risks [16][17][18] including determining
182 geographical variation in risk and transmission of infectious diseases [19][20][21]. In
183 our study, we were able to apply GIS methodology and multivariable analysis to identify
184 areas at increased risk of STEC incidence in a region of Ireland and also factors that may
185 underlie this increased risk. Since STEC incidence varies significantly by region this type
186 of analysis may indicate specific regional risk factors which may be addressed in order
187 to reduce incidence. We found that cattle density was the primary risk factor for STEC
188 incidence in this region. Rurality and population density were also positively and
189 negatively correlated with incidence respectively.

190 Cattle density has repeatedly been found as significantly associated with STEC
191 incidence [22][23][24]. One German study indicated increasing risk associated with
192 increasing cattle density [22]. This is significant since Ireland plans to increase milk and
193 beef production over the next 10 years as part of the Food Wise 2025 strategy [25] – the

194 national dairy herd is set to increase from 1.3 million animals in 2016 to 1.7 million by
195 2025 [26]. Such an increase may impact on the incidence of STEC infection in areas with
196 a high density of livestock farming. Previous work on risk factors for STEC infection in
197 Ireland has indicated that as well as cattle density, domestic wastewater treatment and
198 private well usage are significantly associated with STEC infection [9]. The study region
199 in the west of Ireland is primarily rural with a low population density. However, factors
200 that may be indicated in increased STEC incidence risk such as domestic wastewater
201 treatment and private well usage did not appear as significant. This may indicate that
202 contact with the zoonotic ruminant host and its waste is the primary risk factor in this
203 region. The west of Ireland has almost a quarter of all farms in Ireland, a lower than
204 average farm size but less than 10% of the country's population [10, 11]. Management
205 of cattle to prevent onward transmission of this zoonosis may prevent a significant
206 amount of human disease. This could include herd vaccination [27]; genome sequencing
207 can identify lineages of STEC within cattle with higher zoonotic potential intelligently
208 guiding prevention measures such as selective herd vaccination [28].

209 This work has a number of limitations. The cases' geocode ED level related to
210 residential address but it is possible the exposure may have occurred elsewhere.
211 However, it is likely that the majority of cases will have acquired the infection in their
212 own locale and the use of all confirmed case data over a seven-year period should
213 reduce the effects. Also, not using data from cases within an ED within a month from a
214 'primary case' will reduce the effects of outbreaks and person-to-person transmission
215 on the data which may include outbreaks originating from outside a primary case's ED.

216 This work has provided further evidence of the key role cattle play in the
217 transmission of STEC to humans. Since the agricultural sector plays a particularly
218 important role in the Irish economy and will grow in the coming years it will be

219 important to have in place means of managing the sector from a public health
220 standpoint also. ‘One Health’ is a concept that recognises that “*human health and animal*
221 *health are interdependent and bound to the health of the ecosystems*” [29]. Our findings
222 demonstrate this interdependence with respect to STEC and emphasizes the need to
223 link agricultural policy and practice with impact on human health at a local area level.
224 As incidence can vary significantly within a country/county, mapping can be used to
225 target interventions and monitor outcomes.

226

227 **5. Conclusions**

228 STEC incidence in this region shows striking local variation and this variation is related
229 to cattle density. GIS should be applied more generally to map local variation in
230 zoonotic disease incidence, to target interventions and to monitor outcomes.

231

232 **Acknowledgements**

233 Thanks to the Division of Clinical Microbiology for their help particularly Belinda
234 Hanahoe. This work was funded through an Irish Research Council Government of
235 Ireland Postdoctoral Fellowship. Icons in graphical abstract made by Freepik
236 (www.freepik.com) from Flaticon (www.flaticon.com). Flaticon is licensed by Creative
237 Commons BY 3.0.

238

239 1. HPSC. Annual Epidemiological Report 2016. 2018.

240 2. Murphy BP, McCabe E, Murphy M, Buckley JF, Crowley D, Fanning S, et al.

241 Longitudinal study of two Irish dairy herds: low numbers of shiga toxin-producing

242 *Escherichia coli* O157 and O26 super-shedders identified. *Front Microbiol.* 2016;7.

243 3. Chase-Topping M, Gally D, Low C, Matthews L, Woolhouse M. Super-shedding and the

244 link between human infection and livestock carriage of *Escherichia coli* O157. *Nat Rev*

245 *Microbiol.* 2008;6:904–12.

246 4. Kintz E, Brainard J, Hooper L, Hunter P. Transmission pathways for sporadic Shiga-

247 toxin producing *E. coli* infections: A systematic review and meta-analysis. *Int J Hyg*

248 *Environ Health.* 2017;220:57–67.

249 5. Money P, Kelly AF, Gould SWJ, Denholm-Price J, Threlfall EJ, Fielder MD. Cattle,

250 weather and water: Mapping *Escherichia coli* O157:H7 infections in humans in England

251 and Scotland. *Environ Microbiol.* 2010;12:2633–44.

252 6. ECDC. ECDC Surveillance Atlas. ECDC. 2017. <https://atlas.ecdc.europa.eu/public/>.

253 Accessed 17 April 2018.

254 7. Garvey P, Carroll A, McNamara E, McKeown PJ. Verotoxigenic *Escherichia coli*

255 transmission in Ireland: a review of notified outbreaks, 2004–2012. *Epidemiol Infect.*

256 2016;144:917–26.

257 8. O’Sullivan M, Garvey P, O’Riordan M, Coughlan H, McKeown P, Brennan A, et al.

258 Increase in VTEC cases in the south of Ireland: link to private wells? *Eurosurveillance.*

259 2008;13.

260 9. ÓhAiseadha C, Hynds PD, Fallon UB, O’Dwyer J. A geostatistical investigation of

261 agricultural and infrastructural risk factors associated with primary verotoxigenic *E.*

262 *coli* (VTEC) infection in the Republic of Ireland, 2008–2013. *Epidemiol Infect.*

263 2017;145:95–105.

- 264 10. CSO. Census 2011. 2011.
- 265 11. CSO. Census of Agriculture 2010 – Final Results. Dublin; 2012.
- 266 12. Getis A, Ord JK. The analysis of spatial association by use of distance statistics. *Geogr*
267 *Anal.* 1992;24:189–206.
- 268 13. Anselin L. Local Indicators of Spatial Association-LISA. *Geogr Anal.* 1995;27:93–115.
- 269 14. Haase T, Pratschke J, Gleeson J. The 2011 All-Island HP Deprivation Index. 2014.
- 270 15. Teljeur C, Kelly A. An urban–rural classification for health services research in
271 Ireland. *Irish Geogr.* 2008;41:295–311.
- 272 16. McGrory ER, Brown C, Bargary N, Williams NH, Mannix A, Zhang C, et al. Arsenic
273 contamination of drinking water in Ireland: A spatial analysis of occurrence and
274 potential risk. *Sci Total Environ.* 2017;579:1863–75.
- 275 17. Zhang C, Luo L, Xu W, Ledwith V. Use of local Moran’s I and GIS to identify pollution
276 hotspots of Pb in urban soils of Galway, Ireland. *Sci Total Environ.* 2008;398:212–21.
- 277 18. Stopka TJ, Krawczyk C, Gradziel P, Geraghty EM. Use of spatial epidemiology and hot
278 spot analysis to target women eligible for prenatal women, infants, and children
279 services. *Am J Public Health.* 2014;104:183–90.
- 280 19. Meyers DJ, Hood ME, Stopka TJ. HIV and hepatitis C mortality in Massachusetts,
281 2002-2011: Spatial cluster and trend analysis of HIV and HCV using multiple cause of
282 death. *PLoS One.* 2014;9:2002–11.
- 283 20. Khormi HM, Kumar L. The importance of appropriate temporal and spatial scales for
284 dengue fever control and management. *Sci Total Environ.* 2012;430:144–9.
- 285 21. Patterson B, Morrow CD, Kohls D, Deignan C, Ginsburg S, Wood R. Mapping sites of
286 high TB transmission risk: Integrating the shared air and social behaviour of TB cases
287 and adolescents in a South African township. *Sci Total Environ.* 2017;583:97–103.
- 288 22. Frank C, Kapfhammer S, Werber D, Stark K, Held L. Cattle density and shiga toxin-

289 producing *Escherichia coli* infection in Germany: Increased risk for most but not all
290 serogroups. *Vector-Borne Zoonotic Dis.* 2008;8:635–44.

291 23. Friesema IHM, Van de Kassteele J, De Jager CM, Heuvelink AE, van Pelt W.
292 Geographical association between livestock density and human Shiga toxin-producing
293 *Escherichia coli* O157 infections. *Epidemiol Infect.* 2011;139:1081–7.

294 24. Kistemann T, Zimmer S, Vgsholm I, Andersson Y. GIS-supported investigation of
295 human EHEC and cattle VTEC O157 infections in Sweden: Geographical distribution,
296 spatial variation and possible risk factors. *Epidemiol Infect.* 2004;132:495–505.

297 25. DAFM. Foodwise 2025: A 10-year vision for the Irish agri-food industry. 2015.

298 26. Teagasc. Dairy Sector Road Map. 2016.
299 <https://www.teagasc.ie/media/website/publications/2016/Road-map-2025-Dairy.pdf>.

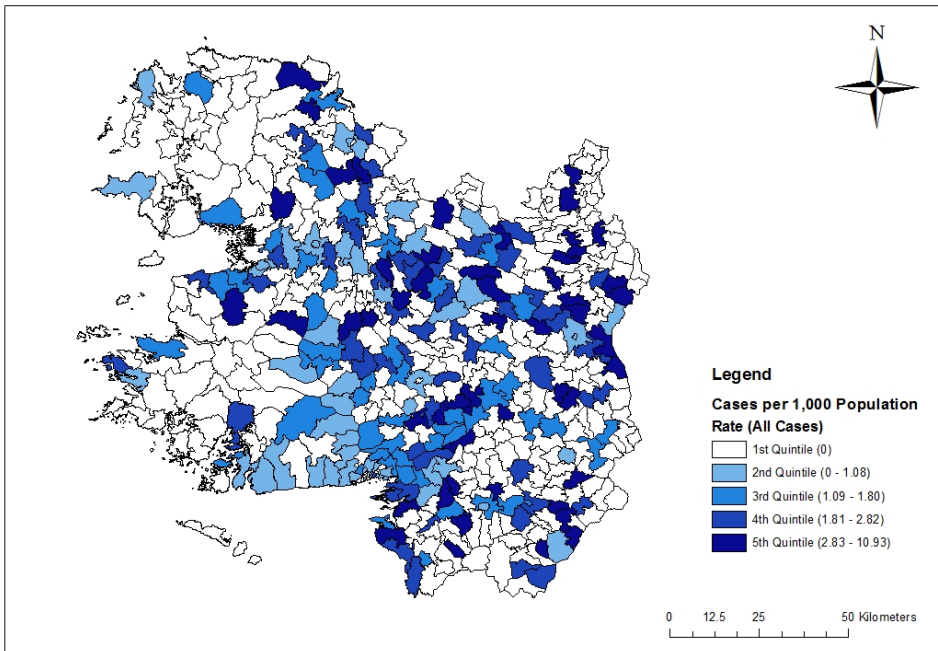
300 27. Matthews L, Reeve R, Gally DL, Low JC, Woolhouse MEJ, McAteer SP, et al. Predicting
301 the public health benefit of vaccinating cattle against *Escherichia coli* O157. *Proc Natl*
302 *Acad Sci.* 2013;110:16265–70.

303 28. Lupolova N, Dallman TJ, Matthews L, Bono JL, Gally DL. Support vector machine
304 applied to predict the zoonotic potential of *E. coli* O157 cattle isolates. *Proc Natl Acad*
305 *Sci.* 2016;113:11312–7.

306 29. OIE. One Health. <http://www.oie.int/en/for-the-media/onehealth/>.

307

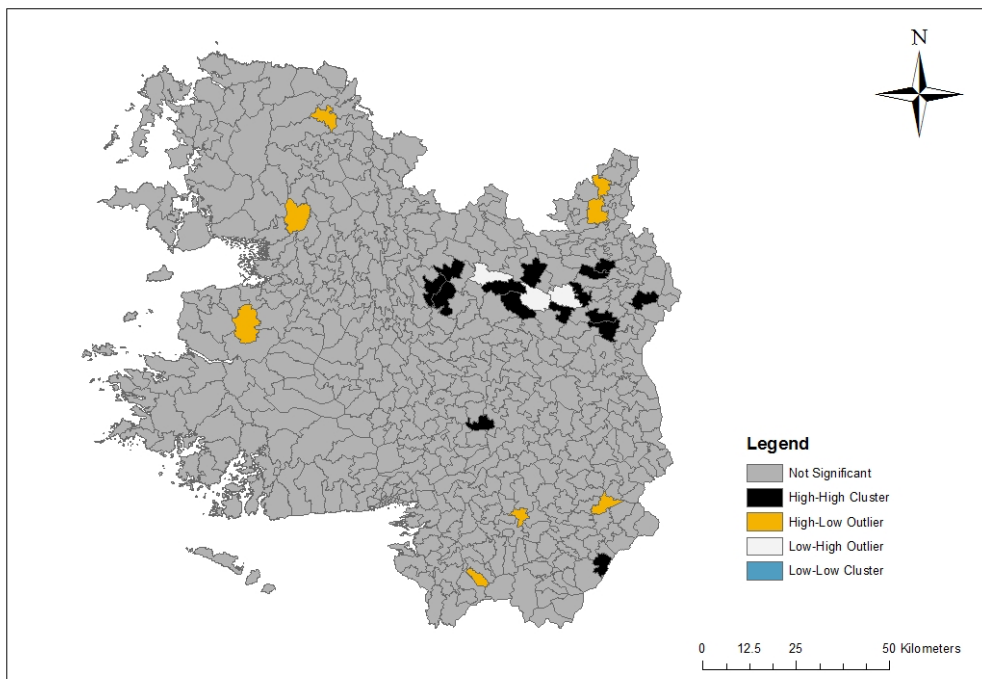
308



309

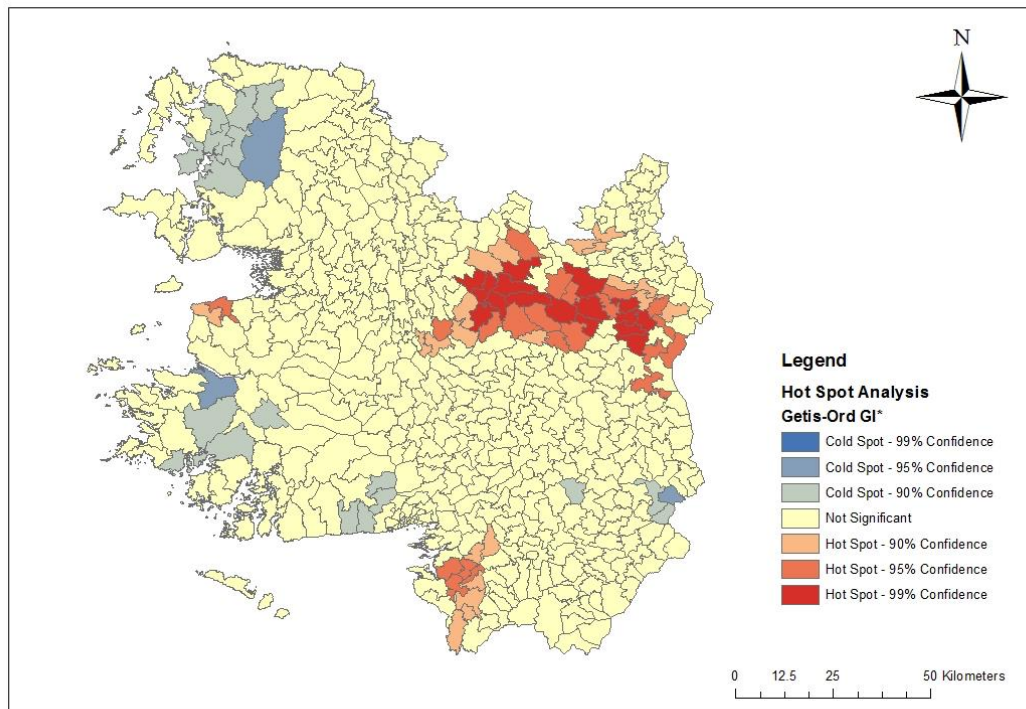
310 **Fig. 1: Incidence per 1000 of confirmed Shiga-toxigenic *E. coli* cases in study region 2009-**
 311 **2015 inclusive (n=379).**

312



313

314 **Fig. 2: Anselin's Local Moran's I cluster analysis (n=379).**



315

316 **Fig. 3: Getis-Ord Gi* 'Hotspot'/'Coldspot' analysis for all cases (n=379).**

317 **Tables**

318

319 **Table I: Variable Definitions and Sample Descriptive Statistics**

Variable Name	Variable Description	Mean (SD) or %
<i>Dependent Variable</i>		
<i>STEC Rate</i>	STEC incidence rate (cases per 1,000 population)	0.946 (1.568)
<i>Potential Predictors</i>		
<i>Cattle Density</i>	Number of cattle per km ²	74.313 (46.031)
<i>Sheep Density</i>	Number of sheep per km ²	90.328 (91.853)
<i>Private Water Source</i>	Percentage of households with a private water source	0.320 (0.261)
<i>Septic Tank Density</i>	Percentage of households with a septic tank	0.741 (0.262)

<i>Deprivation</i>	Relative deprivation (Trutz Haase Index)	-6.730 (3.450)
<i>Population Density</i>	Number of persons per km ²	138.829 (516.467)
<i>Rurality</i>	= Rural ED	90.56%
	= Urban ED	9.44%

320
321
322
323
324

Source: Analysis of hospital records, Census of Population 2011 data (CSO, 2011), Census of Agriculture 2010 data (CSO, 2012), data from Haase et al. (2014) (Haase et al., 2014) and Teljeur and Kelly (2008) (Teljeur and Kelly, 2008).
Note: All variables are calculated at ED level.

325

326 **Table 2: Pairwise (Pearson) Correlations between STEC Incidence Rate and**
 327 **Potential Predictors**

Variable Name	Correlation (Significance Level)
<i>Cattle Density</i>	0.1816 (0.0000)
<i>Sheep Density</i>	0.0314 (0.4849)
<i>Private Water Source</i>	0.0478 (0.2875)
<i>Septic Tank Density</i>	0.0017 (0.9697)
<i>Deprivation Index</i>	-0.0482 (0.2834)
<i>Population Density</i>	-0.0831 (0.0638)
<i>Rurality</i>	0.0977 (0.0293)
Observations	498

328
 329 Source: Analysis of hospital records, Census of Population 2011 data (CSO, 2011), Census of Agriculture 2010 data (CSO,
 330 2012), data from Haase et al. (2014) (Haase et al., 2014) and Teljeur and Kelly (2008) (Teljeur and Kelly, 2008).
 331 Note: All variables are calculated at ED level.
 332

333

334 **Table 3: Regression Model of STEC Incidence Rates at ED Level**

Variable	Coefficient	Standard Error	p-Value
<i>Cattle Density</i>	0.0062	0.0015	0.0000
Constant	0.4859	0.1314	0.0000
Observations	498		

335
 336 Source: Analysis of hospital records, Census of Population 2011 data (CSO, 2011), Census of Agriculture 2010 data (CSO,
 337 2012), data from Haase et al. (2014) (Haase et al., 2014) and Teljeur et al (2008) (Teljeur and Kelly, 2008).
 338

339 Note: The model is a stepwise (backward selection) multivariable linear regression model, applying a 5% significance level
 340 for removal. This means that only variables found to be statistically significant at the 5% level are included in the final
 341 model. All analysis conducted at ED level.
 342

343

344

345