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Title:

Ecosystem service bundles along the urban-rural gradient: Insights for
landscape planning and management

ORIGINAL RESEARCH ARTICLE

Authors and affiliations:

Francesc Baró^{a, b}, Erik Gómez-Baggethun^{c, d}, Dagmar Haase^{e, f}

^aInstitute of Environmental Science and Technology (ICTA), Universitat Autònoma de Barcelona (UAB), Edifici Z (ICTA-ICP), Carrer de les Columnes s/n, Campus de la UAB, 08193 Cerdanyola del Vallès, Spain

^bHospital del Mar Medical Research Institute (IMIM), Carrer Doctor Aiguader 88, 08003 Barcelona, Spain

^cDepartment of International Environment and Development Studies (Noragric), Norwegian University of Life Sciences (NMBU), P.O. Box 5003, N-1432 Ås, Norway

^dNorwegian Institute for Nature Research (NINA), Gaustadalléen 21, 0349 Oslo, Norway

^eDepartment of Geography, Lab for Landscape Ecology, Humboldt University of Berlin, Rudower Chaussee 16, 12489 Berlin, Germany

^fDepartment of Computational Landscape Ecology, Helmholtz Centre for Environmental Research (UFZ), Permoser Straße 15, 04318 Leipzig, Germany

Corresponding author:

Francesc Baró

E-mail address: francesc.baró@uab.cat; Tel. (+34) 93 5868650

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30 **Abstract**

31 A key challenge of landscape planning and management is coping with multiple ecosystem
32 service (ES) potentials and needs in complex social-ecological systems such as urban regions.
33 However, few studies have analyzed both the supply and demand sides of ES bundles, i.e.,
34 sets of associated ES that repeatedly appear together across time or space, from an integrated
35 perspective. This paper advances a framework to identify, map and assess ES bundles from a
36 supply-demand approach to inform landscape planning and management. The framework is
37 applied to the Barcelona metropolitan region, Spain, covering five ES and using eleven spatial
38 indicators. Each indicator was quantified and mapped at the municipal level ($n = 164$)
39 combining different proxy- and process-based models. Our results show significant
40 associations among ES, both at the supply and demand sides. Further, we identified five
41 distinct ES supply-demand bundle types and characterized them based on their specific ES
42 relationships and their main underlying social-ecological conditions. From our findings, we
43 call for combining land sharing strategies in urban and agricultural areas to increase landscape
44 multifunctionality and, concurrently, assure the conservation of large periurban forest areas
45 that are critical for delivering a wide range of local ES highly demanded by the urban
46 population.

47
48 **Keywords:** Barcelona metropolitan region; ecosystem service mismatch; green infrastructure;
49 spatial analysis; urban-rural gradient.

50 1. Introduction

51 A key challenge of landscape planning and management is coping with multiple ecosystem
52 service (ES) potentials and needs in complex social-ecological systems. The last decade has
53 seen increasing attempts to assess the relationships among different ES through the concept of
54 'ES bundles' (e.g., Chan et al., 2006; Raudsepp-Hearne et al., 2010; Maes et al., 2012;
55 Martín-López et al., 2012; García-Nieto et al., 2013; Renard et al., 2015). An ES bundle has
56 been defined as "set of associated ES that repeatedly appear together across time or space"
57 (Raudsepp-Hearne et al., 2010:5242; see also **Box 1**). A key advantage of the ES bundle
58 approach is that it allows to assess potential synergies and trade-offs by analyzing how
59 different ES in a given area are positively or negatively associated (Bennett et al., 2009; **Box**
60 **1**).

61
62 Assessment of ES bundles has been mostly applied to the supply side of ES (in terms of the
63 ecosystem's potential to deliver ES or its actual flow *sensu* Villamagna et al., 2013; see **Box**
64 **1**) using a spatially explicit approach (e.g., Chan et al., 2006; Raudsepp-Hearne et al., 2010;
65 Maes et al., 2012; Derkzen et al., 2015; Hamann et al., 2015; Queiroz et al., 2015) and, less
66 frequently, also considering a temporal scale (e.g., Haase et al., 2012; Renard et al., 2015). In
67 contrast, studies assessing ES bundles from a demand perspective (i.e., considering the
68 amount of ES required or desired by society *sensu* Villamagna et al., 2013; see **Box 1**) have
69 generally focused on determining different socio-cultural values (e.g., Martín-López et al.,
70 2012; Iniesta-Arandia et al., 2014), but very few have produced spatially explicit information.
71 The reason behind this disparity probably relates to the lack of a clear methodological
72 framework for quantifying and mapping ES demand (Wolff et al., 2015) in contrast to ES
73 supply (Egoh et al., 2012; Crossman et al., 2013; Malinga et al., 2015).

74
75 Even fewer studies have analyzed both the supply and demand sides of ES bundles from an
76 integrated perspective (but see García-Nieto et al., 2013; Castro et al., 2014). Yet, such
77 approach could have important advantages for sustainable landscape planning and
78 management in complex social-ecological systems. These include: (1) enhanced capacity to
79 address green infrastructure planning (GI), i.e., the identification of existing crucial
80 ecosystems for ES delivery (Maes et al., 2015); (2) prioritization of key areas for establishing

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81 GI projects due to expected mismatches between supply and demand of ES from a bundle
82 perspective (García-Nieto et al., 2013); and (3) better understanding of potential trade-offs
83 and synergies between ES considering both ecosystem's processes and societal needs (Castro
84 et al., 2014).

85

86 Considering both the supply and the demand sides of ES bundles can be particularly relevant
87 in urban regions given their high levels of population density and pressure on available land.
88 Assessing ES bundles in these areas can shed light on potential mismatches, trade-offs and
89 synergies possibly driven by urban development processes. Even if urban areas benefit from
90 the appropriation of vast ES providing areas beyond their boundaries (Rees, 1992; Folke et
91 al., 1997), the local supply of ES can contribute to cope with a variety of 'demands',
92 including protection from climate extremes (e.g., moderation of heatwaves and floods),
93 improvement of environmental quality (e.g., air pollution abatement) and healthier life styles
94 (e.g., opportunities for recreation and relaxation) (Bolund and Hunhammar, 1999; Gómez-
95 Baggethun et al., 2013; Haase et al., 2014).

96

97 The aim of this paper is to advance a framework to identify, map and assess ES bundles from
98 a supply-demand perspective in order to support landscape planning, management, and
99 decision-making in urban regions. Our framework builds on previous methodological
100 approaches (Mouchet et al., 2014) and consists of five main steps: (1) selection, quantification
101 and mapping of suitable ES indicators (both at the supply and demand sides); (2) assessment
102 of spatial ES associations at both sides; (3) identification of relevant ES supply-demand
103 bundle types; (4) analysis of ES spatial patterns along the urban-rural gradient and along a
104 gradient of management or planning strategies; and (5) understanding of the spatial
105 characteristics of ES bundles and their relevance for landscape planning and management. We
106 used the Barcelona metropolitan region, Spain, as case study area, considering a set of five ES
107 and eleven indicators (six at the supply side and five at the demand side).

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112 **Box 1.** Definition of the main concepts discussed in this paper.

113 **ES bundle** is a set of associated ES that are supplied by or demanded from a given ecosystem
114 or area and usually appear together repeatedly in time and/or space (modified from Raudsepp-
115 Hearne et al., 2010).

116 **ES supply** represents the capacity or potential of ecosystem's properties and functions to
117 provide a specific bundle of ES within a given time period (modified from Villamagna et al.,
118 2013). In this paper, we consider that ES supply, ES delivery and ES provision are
119 synonymous terms, but these are different to **ES flow**, defined as the ES actually received,
120 used or experienced by people (Villamagna et al., 2013).

121 **ES demand** is the amount of an ES required or desire by society (Villamagna et al., 2013).
122 Therefore, the demand of a given ES may exceed its flow (and eventually its supply).

123 **Synergies and trade-offs** are situations that arise when the use of one ES directly decreases
124 (trade-off) or increases (synergy) the benefits provided by another. This may be due to
125 simultaneous response to the same driver or due to true interactions among ES (Turkelboom
126 et al., 2016).

127 **ES mismatches** are defined as the differences in quality or quantity occurring between the
128 supply and demand of ES (Geijzendorffer et al., 2015).

129 **Green infrastructure (GI)** is a boundary concept with various conceptual meanings (Wright,
130 2011), but here we follow the EU GI strategy definition: “a strategically planned network of
131 natural and semi-natural areas with other environmental features designed and managed to
132 deliver a wide range of ES” (EC, 2013).

133

134 2. Material and methods

135 2.1. Case study area

136 Our research was conducted in the Barcelona metropolitan region (BMR), north-east of Spain
137 (**Fig. 1A**). The BMR (3,244 km²) is the most populous urban region on the Mediterranean
138 coast with 5.03 million inhabitants (Statistical Institute of Catalonia, year 2015) distributed
139 among 164 municipalities. Its urban core is constituted by the municipality of Barcelona (1.61
140 million inhabitants; 101 km²) and several adjacent middle-size cities characterized by very
141 high population densities (**Fig. 1B**). The rest of the BMR is mostly structured in lower density
142 towns, including several sprawling urban areas, except for seven dense sub-centers
143 (municipalities between 50,000 and 200,000 inhabitants). Therefore, the BMR can be
144 described as a polinuclear urban region, conceived as a hybrid between the compact and the
145 dispersed urban models (Catalán et al., 2008).

146
147 Distribution of land uses and covers in the BMR is shaped by its physical geography. Two
148 systems of mountain ranges (Catalan Coastal Range and Catalan Pre-Coastal Range) run
149 parallel to the Mediterranean Sea coast, mostly covered by Mediterranean forests of Pine and
150 Holm Oak trees, shrubland and grassland. Prominent examples of these ecosystems with high
151 value for ES supply include protected areas such as the Montseny massif (Pre-Coastal Range)
152 which has the highest peaks in the BMR (> 1700 m), or the Collserola massif (Coastal Range)
153 which is virtually enclosed by urban land (**Fig. 1C**). In contrast, coastal and inland plains are
154 mostly covered by urban and agricultural land. For instance, the Llobregat river delta is
155 heavily sealed by urban land and transport infrastructure (e.g., the Barcelona airport), but it
156 still preserves valuable agricultural and wetland areas. The Penedès area (west of the BMR) is
157 an important wine-growing region.

158
159 The BMR is one of the regional planning areas of the 'General Territorial Plan of Catalonia'
160 (PTGC, 1995), the uppermost strategic landscape planning instrument in the region of
161 Catalonia. The 'Territorial Metropolitan Plan of Barcelona' (PTMB) was developed following
162 PTGC's guidelines and approved in 2010 by the Government of Catalonia (PTMB, 2010).
163 The PTMB establishes two main planning categories (called "systems") for land use
164 regulation in the BMR: open areas and urban land (**Fig. 1D**). The open areas planning system

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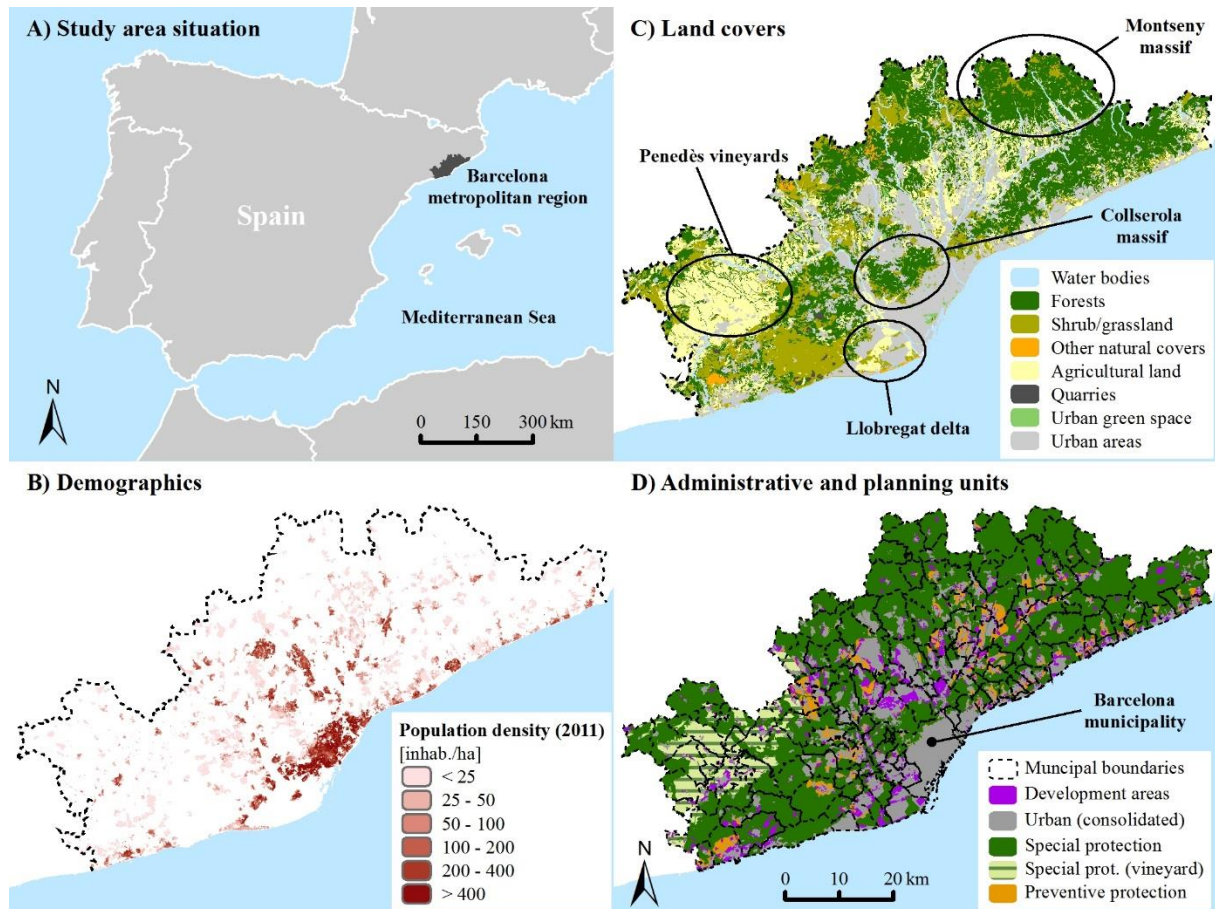
165 (2405 km², 74.1% of the BMR) regulates the land protected from urbanization and includes
166 three planning units: (1) Special protection areas (2032 km²), which consist of land that is
167 highly protected for its ecological and agricultural values, including Natura 2000 sites and
168 other protected areas; (2) Special protection of vineyards (230 km²), consisting of highly
169 protected land for its landscape and agricultural values for the wine sector; and (3) Preventive
170 protection areas (143 km²), for urban-rural transitional areas where urban development is
171 restricted, except in certain circumstances. The urban planning system (840 km², 25.9% of the
172 BMR) regulates consolidated built-up land (635 km²) and defines strategies for urban
173 expansion by the delimitation of development areas (205 km²) that can be subsequently
174 refined by municipalities through so-called local urban master plans.

175

176 We contend that the BMR, as a complex social-ecological system, is a suited testing area for
177 the purpose of this research. The manifest heterogeneous spatial distributions of relevant ES
178 providing areas (Mediterranean forests, agroecosystems, etc.) and potential beneficiaries
179 along the urban-rural gradient can provide relevant insights for the integration of a GI
180 perspective into future landscape planning and management instruments.

181

182



183

184 **Fig. 1.** Land cover, demographics and administrative maps of the case study area (Barcelona metropolitan
 185 region). Own elaboration based on various spatial datasets provided by the Catalan Government, the Catalan
 186 Cartographic and Geological Institute (ICGC) and the Spanish Statistical Office (INE).
 187

188 2.2. Selection, quantification and mapping of ecosystem service indicators

189 Five ES were assessed at the study area: (1) food provision; (2) global climate regulation; (3)
 190 air purification; (4) erosion control; and (5) outdoor recreation (the terminology is based on
 191 the classification of urban ES by Gómez-Baggethun et al., 2013). The selection of these ES
 192 was based on three main criteria: (1) their relevance to the BMR, mainly in terms of expected
 193 demand; (2) consideration of a representative ES sample covering at least one ES from the
 194 three main ES categories of the CICES¹ classification (i.e., provisioning, regulating and
 195 maintenance, cultural services); and (3) the availability of data for both ES supply and

¹ CICES (Common International Classification of Ecosystem Services) latest version is available from:
<http://cices.eu/>

196 demand sides. We consider that this selection satisfies the research goals and provides a
197 sufficient ground for the discussion of possible relevant policy and planning implications.

198

199 For each ES, an indicator (based on direct or proxy data) was defined, measured and mapped,
200 both at the supply and demand sides. In the case of food provision, two indicators of supply
201 were used: crop and livestock production. Hence a total of eleven indicators were included in
202 the analysis. Some indicators build on previous research studies in the case study area (e.g.,
203 Baró et al., 2016). **Appendix A** (Supplementary material) describes in detail the
204 quantification and mapping methods (and provides the corresponding references) used for
205 each ES indicator. **Table 1** provides an overview of the ES indicators, key references, and a
206 brief description of main data sources. Each indicator was quantified using the most recent
207 available datasets (typically from years 2011 to 2013). All the required geoprocessing
208 operations were carried out using ArcGIS v.10 (ESRI) or GRASS GIS v. 7.0 (GRASS
209 Development Team).

210

211 As stated above, ES supply indicators refer here to the ecosystems' capacity to deliver ES, not
212 the actual flow of ES (Villamagna et al., 2013; see also **Box 1**). The reason for using this
213 approach is that we are interested in the long-term perspective and hence in measuring the
214 potential of the study area in terms of ES provision regardless of whether this is actually used
215 or experienced in the present. For example, the supply indicator for air purification (NO₂ dry
216 deposition velocity) indicates the capacity of ecosystems to filter air pollution, but not the
217 actual pollutant removal. In the case of provisioning indicators (both crop and livestock
218 production), it could be assumed that most part of the production is consumed, yet food loss
219 and food waste represents an important problem worldwide (FAO, 2011). Similarly, all
220 carbon sequestration ecosystems' capacity constitutes a flow because global carbon emissions
221 are clearly exceeding actual sequestration rates (Schröter et al., 2014). In the case of erosion
222 control, a biophysical indicator could not be calculated due to data limitations, so we applied
223 an ES expert-based matrix model using land covers as spatial data following Burkhard et al.
224 (2012; 2014). The dimensionless index for outdoor recreation is based on a composite model
225 (Paracchini et al., 2014; Zulian et al., 2014) that estimates the capacity of ecosystems to
226 provide recreation opportunities based on their degree of naturalness, nature protection, and

227 presence of water (see Baró et al., 2016 and **Appendix A** in Supplementary material for
228 further details).

229

230 Despite there is a varying understanding of the concept of ES demand (see Wolff et al., 2015),
231 ES demand refers here to “the amount or level of ES required or desired by society”
232 (Villamagna et al., 2013:116; see also **Box 1**). Following previous studies (e.g., Kroll et al.,
233 2012), demand for food provision was mapped using human population density as proxy
234 indicator. We did not combine population density with average consumption rates because the
235 focus of the research is not on self-sufficiency or balance analysis but on the assessment of
236 the ES spatial patterns from a bundle approach. Demand indicators for regulating ES indicate
237 the magnitude of pressures or inputs needing regulation (air pollution levels for air
238 purification, carbon emissions for climate regulation and soil loss potential for erosion
239 control). This risk reduction approach is commonly applied in the ES literature (Wolff et al.,
240 2015) and assumes that demand is oriented toward a reduction of the indicator values
241 (Burkhard et al., 2014). A particular case is again climate regulation because the demand for
242 this ES is global and hence could be distributed equally over the world surface (Syrbe and
243 Walz, 2012). Yet, carbon emissions are commonly used as a proxy at lower scales (e.g., Baró
244 et al., 2015; Zhao and Sander, 2015) as a way to indicate local contributions to the need for
245 this regulating ES. Finally, demand for experience-based cultural ES such as outdoor
246 recreation can be estimated through the number of people wanting to experience the ES and
247 their feasibility to do so in terms of accessibility to recreational sites (Paracchini et al., 2014;
248 Ala-Hulkko et al., 2016). Following this rationale, here we mapped outdoor recreation
249 demand based on the availability of recreational sites (i.e., areas identified as having a
250 relevant recreation capacity) close to people's home and population density assuming that all
251 inhabitants in the BMR have similar desires in terms of everyday life outdoor recreational
252 opportunities (see Baró et al., 2016 and **Appendix A** in Supplementary material for details).

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255 **Table 1.** Overview of the ES indicators, quantification units, main data sources and key references used in the
 256 BMR case study. Full references for data sources are provided in **Appendix A** (Supplementary material).
 257

ES	Indicator / proxy	Quantification unit	Main data sources and key references
Food provision (provisioning)	Crop production (supply)	kg edible crop production ha ⁻¹ year ⁻¹	Agriculture yield statistical data (year 2013) Kroll et al. (2012)
	Livestock production (supply)	Livestock units km ² year ⁻¹	Agriculture census data (year 2009) Raudsepp-Hearne et al. (2010)
	Population density (demand)	Inhabitants ha ⁻¹	Population census tracts dataset (year 2011) Burkhard et al. (2014)
Global climate regulation (regulating)	Carbon sequestration (supply)	kg C ha ⁻¹ year ⁻¹	National forest inventories data (years 1990 and 2001) Pino (2007)
	Carbon emissions (demand)	kg C ha ⁻¹ year ⁻¹	Municipal Sustainable Energy Action Plans (SEAPs) (year 2012) Zhao and Sander (2015)
Air purification (regulating)	NO ₂ dry deposition velocity (supply)	mm s ⁻¹ ha ⁻¹	Regional land cover dataset (year 2012); Average wind speed data (Regional environment database) Baró et al. (2016)
	NO ₂ concentration levels (demand)	µg NO ₂ m ⁻³ (annual mean)	Air quality data from BMR monitoring stations (year 2013) Baró et al. (2016)
Erosion control (regulating)	Erosion control capacity (supply)	Dimensionless index (0-5)	Expert-based data and regional land covers dataset (year 2012) Burkhard et al. (2012)
	Soil loss potential (demand)	Dimensionless index (0-3)	Soil loss potential dataset (SITxell - Geographic Information System for the Network of Open Areas in the province of Barcelona) Guerra et al. (2014)
Outdoor recreation (cultural)	Recreational potential (supply)	Dimensionless index (0-1)	Various regional spatial datasets on habitat naturalness, protected natural areas and water features (various sources) Baró et al. (2016)
	Recreational demand (demand)	Dimensionless index (0-5)	Population census tracts dataset (year 2011) Baró et al. (2016)

258
259

260 **2.3. Analysis of spatial patterns and associations between ecosystem services**

261 Individual ES indicators were mapped to visualize and compare their spatial patterns across
262 the case study area. Although the spatial resolution of some data sources was relatively high
263 (e.g., the regional land cover dataset was developed at a scale of 1:50,000), we used
264 municipalities ($n = 164$) as the main spatial unit of analysis due to several reasons: (1) urban
265 policies related to ES and GI in the BMR are usually implemented at the municipal level (e.g.,
266 Barcelona City Council, 2013); (2) the municipality is the smallest unit at which livestock
267 census or carbon emissions data are available in the BMR; and (3) statistical computing
268 limitations when dealing with data matrices derived from high resolution rasters. Therefore,
269 ES indicators were quantified for each municipality calculating average values in case the
270 original spatial unit was smaller and normalized by area to enable comparison across
271 municipalities of different size. Further, ES indicators were standardized where necessary in a
272 0-1 range using minimum and maximum values, so that correlation or cluster analyses could
273 be performed (Raudsepp-Hearne et al., 2010; Mouchet et al., 2014).

274
275 As a preliminary step, spatial autocorrelation analysis was carried out for each ES indicator
276 using Global Moran's I with Rook contiguity in ArcGIS v 10 (ESRI). We considered the
277 spatial pattern to be significantly clustered if the obtained z-score (standard deviation) was
278 higher than 1.96 (95% confidence level).

279
280 The analysis of ES associations and bundles types was carried out following Mouchet et al.
281 (2014) and using R statistical software (R Core Team, 2015) and ArcGIS v10 (ESRI). First,
282 associations between pairs of ES were detected using Pearson parametric correlation test both
283 at the supply (fifteen pairs) and demand (ten pairs) sides.

284
285 Overlap analysis was also applied in order to spatially visualize the municipalities with the
286 highest or lowest supply and demand aggregate values, as well as supply – demand spatial
287 congruency. Aggregated ES supply and demand values were calculated using a simple
288 unweighted summation of the standardized indicators' values at the municipality level. In
289 addition, we mapped the “richness” in ES to indicate the spatial diversity of ES in the case
290 study area. To do so, we accounted for the number of ES supplied and demanded in a

291 substantial degree in each municipality. A substantial supply or demand was assumed if the
292 indicator value was equal or higher than the average of the BMR.

293

294 In a second stage, we defined different ES supply-demand bundle types using cluster analysis.
295 We classified municipalities into clusters based on similar combinations of both ES supply
296 and demand values (i.e., ES supply-demand bundle types) using *K*-means clustering algorithm
297 which minimizes within-group variability. The appropriate number of clusters was
298 determined by analyzing the meaningfulness of different clustering outputs with the support
299 of dendrograms and scree plots. The final ES supply-demand bundle types were visualized
300 using star plots (showing average indicator values per cluster) and mapped using ArcGIS to
301 show their spatial patterns in the BMR.

302

303 A principal component analysis (PCA) was also applied to analyze the relationships between
304 the ES supply and demand indicators and the various land planning strategies (i.e., the
305 planning classes defined in the PTMB). Land planning strategies were included in the PCA as
306 the area percentage of each class per municipality.

307

308 Finally, the assessment of ES spatial patterns was complemented by analyzing the urban-rural
309 gradients. Following previous contribution to this research area (Kroll et al., 2012; Larondelle
310 and Haase, 2013), we computed urban-rural gradients of the ES supply and demand indicators
311 considered in the analysis. A 50-km concentric buffer with 1-km intervals was created around
312 the city center of Barcelona (Catalunya square), covering almost all the BMR area. For each
313 concentric ring, the average ES value was calculated omitting null values. In order to improve
314 visualization of the gradients, the analysis was not performed at the municipal level but at the
315 pixel level (using the ES data resampled at a spatial resolution of 100m) and it was based on a
316 reclassification of the ES values in five classes (0-4) using quintiles.

317

318 **3. Results**

319 **3.1. Ecosystem service supply: spatial patterns and associations**

320 Spatial autocorrelation results show that all ES supply indicators were spatially clustered on
321 the case study area. The obtained z-scores (**Fig. 2**) indicate that there is less than 1%
322 likelihood that the individual spatial patterns could be the result of random chance.

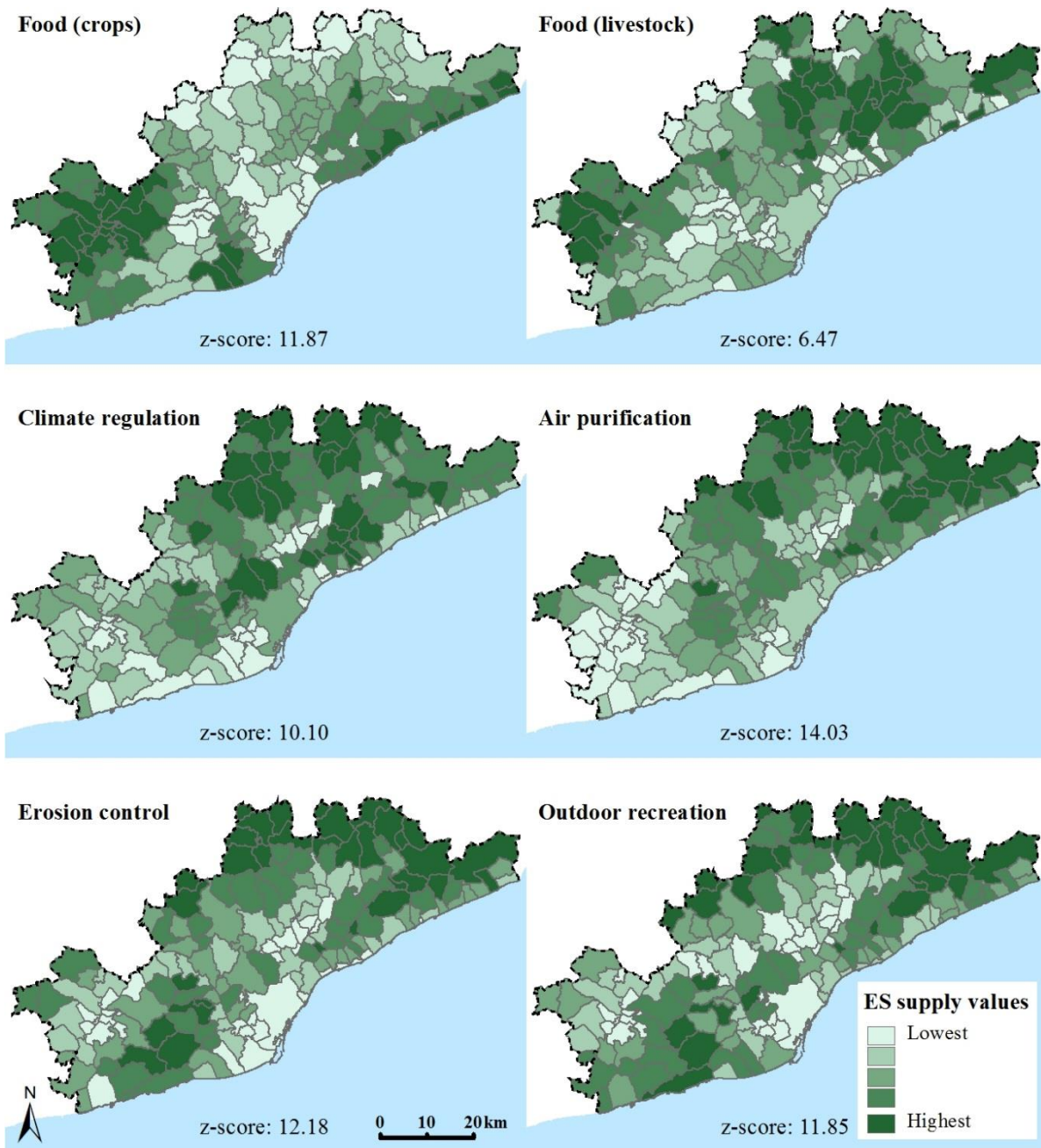
323 Geographic distributions of the six ES supply indicators (**Fig. 2**) revealed clear similarities
324 and dissimilarities among them. On the one hand, potential supply of regulating ES and
325 outdoor recreation was highest in the mountainous landscapes located at the north and north-
326 east of the BMR, mostly covered by Mediterranean forests. On the other hand, the two food
327 production indicators followed very distinct patterns. In the case of crop production, highest
328 values were mostly found in the flat areas of the wine-making county of Penedès (at the west
329 side of the BMR) and in other agricultural areas located along the coast (especially in the
330 Llobregat river delta). Livestock production was mostly clumped in low-density population
331 municipalities located at the hinterland plains, especially at the north and west of the BMR.

332
333 The correlation results between pairs of ES supply indicators are shown in **Table 2**. All pairs
334 were significantly correlated, except those including livestock production. Associations
335 among regulating ES and outdoor recreation were highly positively correlated (Pearson
336 coefficient > 0.5). Crop production was moderately negatively correlated with all regulating
337 services (Pearson coefficient < -0.3 and > -0.5) and weakly negatively correlated with outdoor
338 recreation (Pearson coefficient > -0.3).

339
340 Overlap analysis confirmed that the most relevant and multifunctional municipalities in terms
341 of ES provision are located at the north and north-east of the BMR (**Fig. 3**), including the
342 municipalities with a high share of forest habitats and containing small settlements. In
343 contrast, highly urbanized municipalities (e.g., in the urban core) and those mostly covered by
344 agricultural land showed the lowest aggregated values for ES supply and none or few ES
345 provided in a relevant amount (value \geq mean) (see **Fig. 3**).

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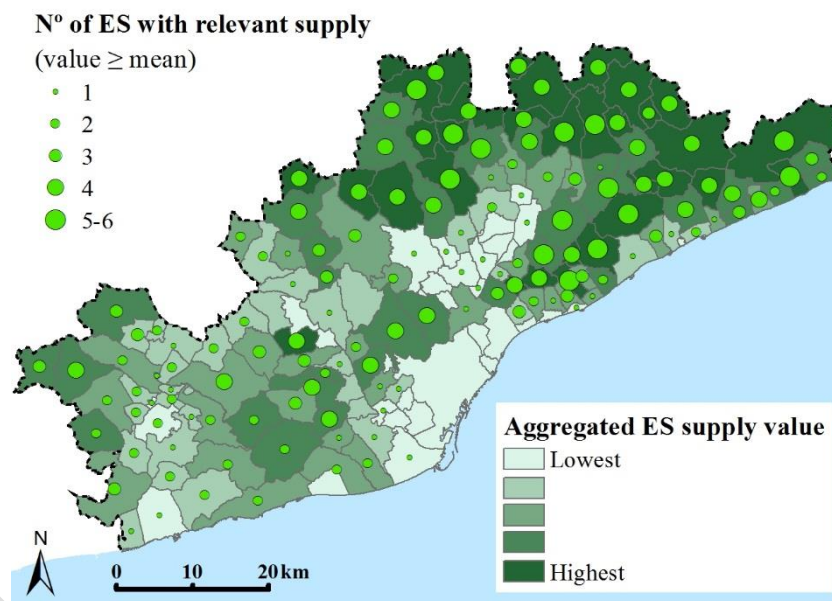
Fig. 2. Spatial patterns of the six ES supply indicators shown at the municipality level. Indicator values are classified in quintiles. All ES indicators are significantly clustered in space (z -score $>$ 1.96).

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351 **Table 2.** Significant correlations (Pearson parametric test) between pairs of ES supply indicators (* $P < 0.001$; ** P
352 < 0.0001).

	Food (crops)	Food (livestock)	Climate regulation	Air purification	Erosion control	Outdoor recreation
Food (crops)	1					
Food (livestock)	0.01	1				
Climate regulation	-0.36**	0.01	1			
Air purification	-0.38**	0.04	0.75**	1		
Erosion control	-0.41**	0.01	0.68**	0.86**	1	
Outdoor recreation	-0.28*	-0.09	0.65**	0.79**	0.86**	1

353



354

355 **Fig. 3.** Aggregated ES supply value and richness in ES, i.e., number of ES with relevant supply (value \geq mean)
356 shown at the municipality level. Aggregated ES supply values are classified in quintiles.

357

358

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360

361 **3.2. Ecosystem service demand: spatial patterns and associations**

362 All indicators of ES demand also showed a significant clustered spatial pattern on the BMR at
363 the individual level (z -score > 1.96 ; **Fig. 4**). Furthermore, all indicators except erosion control
364 displayed a similar spatial distribution characterized by highest values at the urban core
365 (Barcelona and adjacent cities) and a clearly decreasing gradient towards the outskirts of the
366 BMR (except for some municipalities, especially along the coastline). In contrast, demand for
367 erosion control corresponded as expected mostly with the hilly areas located at the center and
368 north-east of the BMR (**Fig. 4**).

369

370 All the ten possible pairwise associations between ES demand indicators were found to be
371 significantly correlated (**Table 3**). Associations among food production, climate regulation,
372 air purification and outdoor recreation were highly positively correlated (Pearson coefficient
373 > 0.5). Erosion control was moderately negatively correlated with food production, climate
374 regulation and outdoor recreation (Pearson coefficient < -0.3 and > -0.5) and weakly
375 negatively correlated with air purification (Pearson coefficient > -0.3).

376

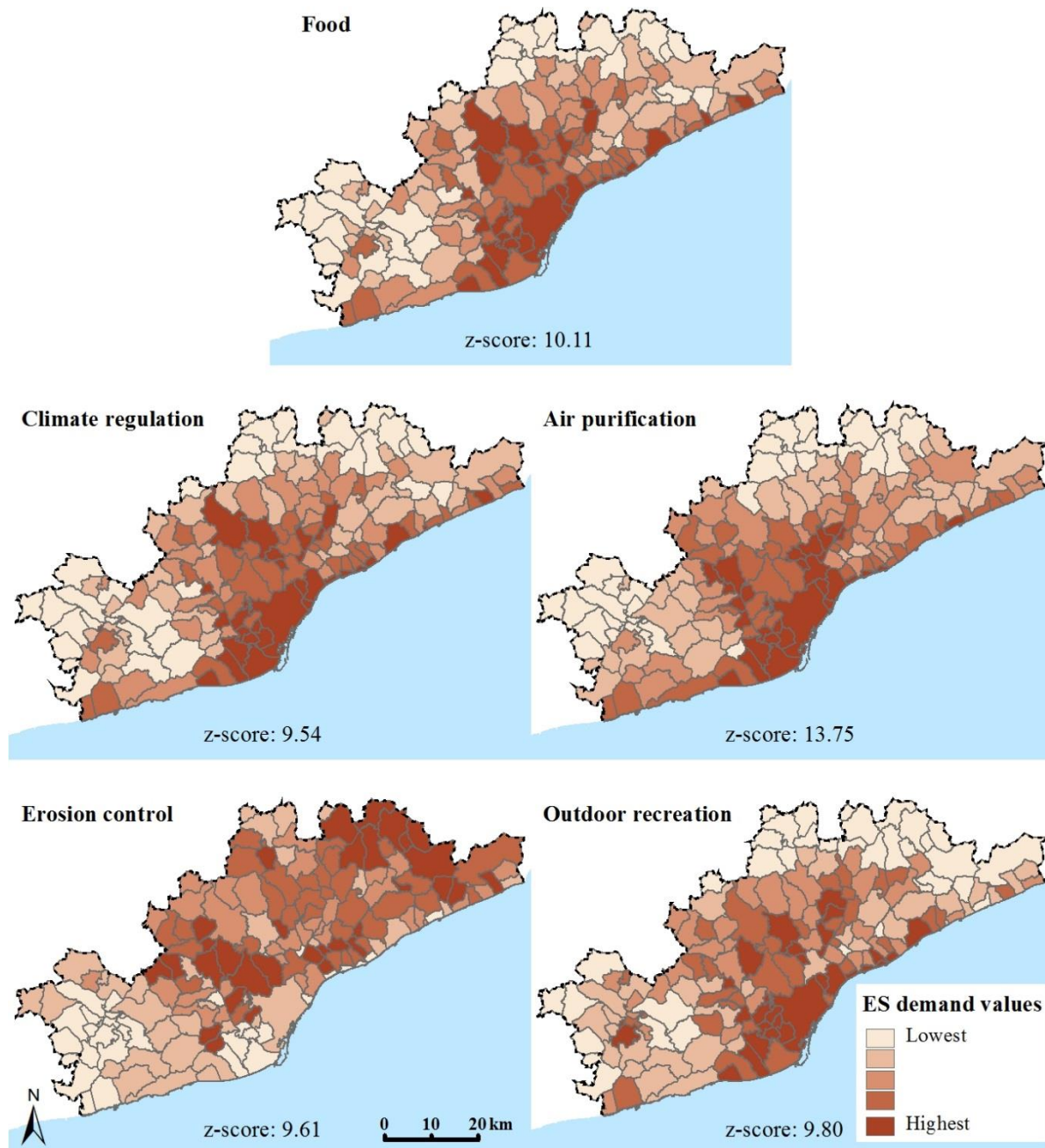
377 As expected, overlap analysis showed that the aggregated ES demand values were highest in
378 the urban core of the BMR (**Fig. 5**). Additionally, this area presented the highest diversity of
379 demands: generally four or five ES were demanded in a relevant degree (indicator value \geq
380 mean). Lowest aggregated ES demand values were found mainly at the north and west of the
381 BMR where municipalities are characterized by low population densities and a high share of
382 agricultural or forest land covers.

383

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Fig. 4. Spatial patterns of the five ES demand indicators shown at the municipality level. Indicator values are classified in quintiles. All ES indicators are significantly clustered in space (z -score $>$ 1.96).

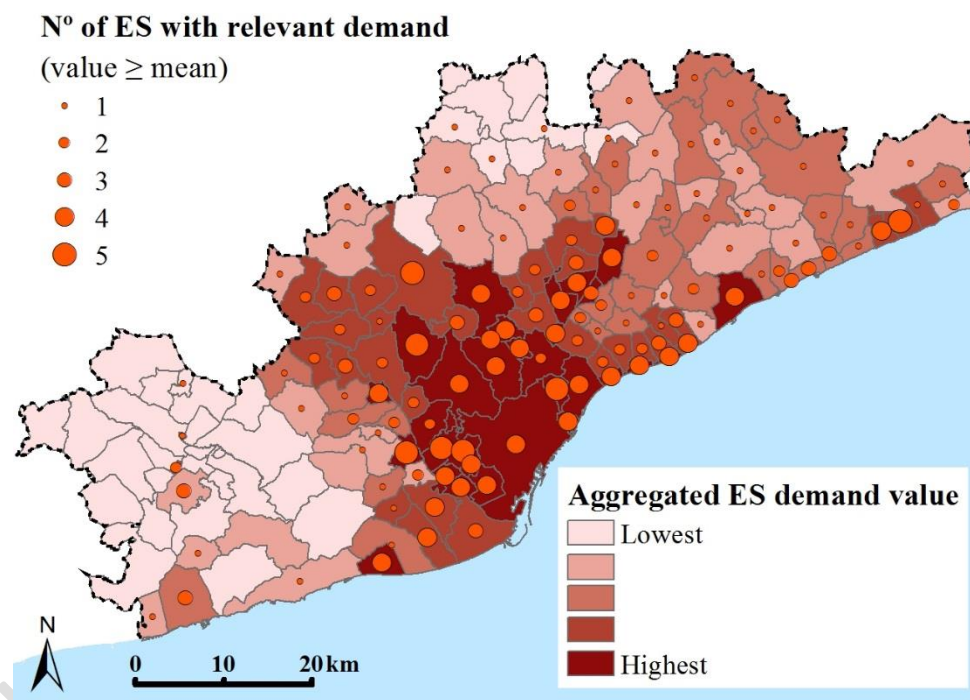
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391

392 **Table 3.** Significant correlations (Pearson parametric test) between pairs of ES demand indicators (* $P < 0.001$;
393 ** $P < 0.0001$).

	Food (population)	Climate regulation	Air purification	Erosion control	Outdoor recreation
Food (population)	1				
Climate regulation	0.92**	1			
Air purification	0.71**	0.67**	1		
Erosion control	-0.33**	-0.37**	-0.26*	1	
Outdoor recreation	0.90**	0.86**	0.67**	-0.33**	1

394



395

396 **Fig. 5.** Aggregated ES demand value and richness in ES, i.e., the number of ES indicators with relevant demand
397 (value \geq mean) shown at the municipality level. Aggregated ES demand values are classified in quintiles.
398

398

399

400 **3.3. Ecosystem service bundles and urban-rural gradients**

401 Cluster analysis considering both the supply and demand indicators of ES allowed to group
402 the 164 municipalities of the BMR into five clusters, hence revealing five distinct ES supply-
403 demand bundle types (**Table 4; Fig. 6**). Spatial autocorrelation analysis determined that these
404 five bundle types were also clustered on the BMR area (z -score = 2.28).

405

406 The five bundle types were named and characterized based on the specific supply-demand
407 relationships and the main land uses taking place in each group. Cluster 1 was named “Urban
408 core” because it comprises the municipality of Barcelona and several adjacent or nearby cities
409 ($n = 7$). It is characterized by dense urbanization and very high population densities. This
410 bundle type showed the lowest ES supply mean values and the highest ES demand values for
411 all indicators except the demand for erosion control, revealing an overall ES mismatch from a
412 bundle supply and demand perspective. Cluster 2 ($n = 23$), named “Suburban nodes”, includes
413 those municipalities with a very relevant amount of population and urbanized land, mostly
414 located near the urban core or representing urban sub-centers in the BMR (Catalán et al.,
415 2008). It displayed slightly higher ES supply mean values than the urban core and moderate
416 ES demand values (from 0.21 to 0.27), except for air purification which was substantially
417 higher (0.64). Cluster 3, named “Periurban green”, is by far the largest bundle type by number
418 of municipalities ($n = 69$). It comprises mostly municipalities with a relevant share of urban
419 land, but also substantial amounts of forest and/or shrubland and, in some cases, also
420 agricultural land. ES supply-demand relationships are characterized by low supply levels of
421 food provision and climate regulation (yet higher than in the previous clusters), moderate to
422 high supply values of air purification, erosion control and outdoor recreation (from 0.28 to
423 0.50), and a clear disparity of demands: food production, climate regulation and outdoor
424 recreation are barely demanded while air purification and erosion control are demanded in
425 moderate rates (0.36 and 0.44 respectively). Cluster 4 ($n = 29$), named “Cropland”, groups
426 those municipalities where land use is primarily agricultural (crops), basically located in the
427 wine-making county of Penedès (west side of the BMR) and in other farming areas, mainly
428 placed along the coast such as in the Llobregat River delta. All ES indicators, both at the
429 supply and demand sides, showed low to moderate values (in the range 0.04 – 0.29), except
430 for crop production (0.53). Finally, Cluster 5 ($n = 36$) was called “Forestland” because it

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431 comprises inland municipalities mostly covered by woodland, where urban settlements are
432 generally small and agriculture is absent or minor. This ES bundle type showed by far the
433 highest supply values for regulating services and outdoor recreation and the lowest ES
434 demand values for all indicators except for erosion control which was highest (0.56).
435 Interestingly, this bundle mirrors the “urban core” cluster in the opposite direction regarding
436 the relationship between supply and demand, except for food supply values.

437

438

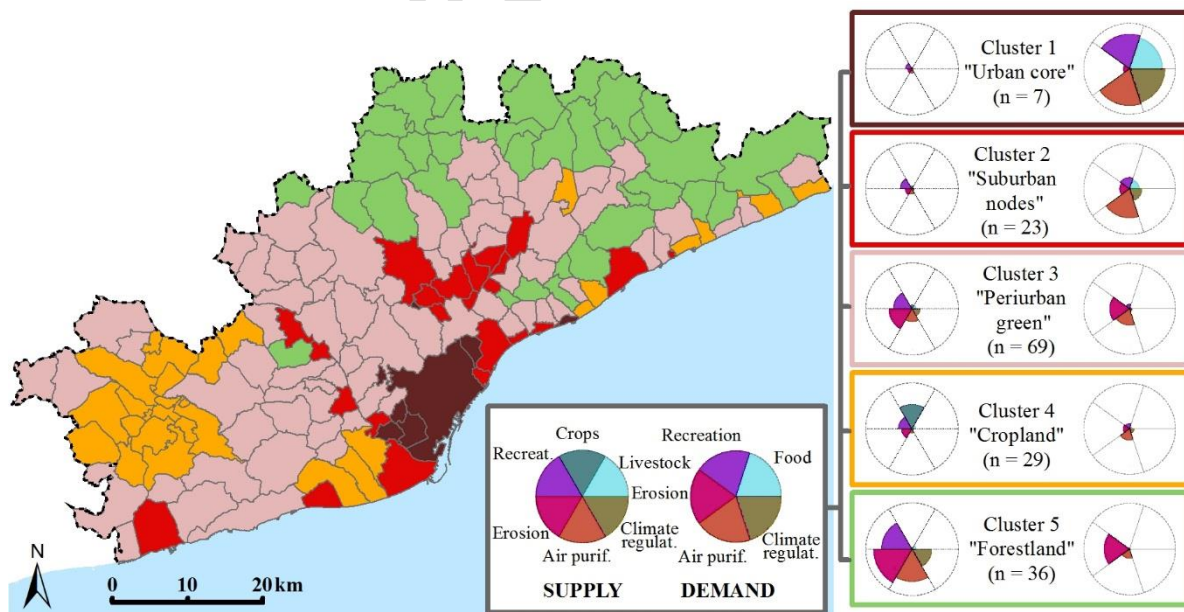
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439 **Table 4.** Standardized mean values for each ES indicator (both supply and demand) within each cluster or ES
440 supply-demand bundle type. The number of municipalities per cluster is indicated with *n*.

ES		Clusters				
		Urban core (<i>n</i> = 7)	Suburban nodes (<i>n</i> = 23)	Periurban green (<i>n</i> = 69)	Cropland (<i>n</i> = 29)	Forestland (<i>n</i> = 36)
Food	Supply (crops)	0.04	0.06	0.09	0.53	0.05
	Supply (livestock)	0.00	0.04	0.09	0.09	0.09
	Demand	0.72	0.21	0.04	0.05	0.01
Climate regulation	Supply	0.03	0.05	0.18	0.04	0.43
	Demand	0.77	0.27	0.06	0.10	0.02
Air purification	Supply	0.09	0.11	0.28	0.09	0.70
	Demand	0.81	0.64	0.36	0.25	0.20
Erosion control	Supply	0.10	0.14	0.50	0.22	0.83
	Demand	0.14	0.22	0.44	0.14	0.56
Outdoor recreation	Supply	0.14	0.25	0.40	0.29	0.66
	Demand	0.76	0.25	0.10	0.11	0.02

441

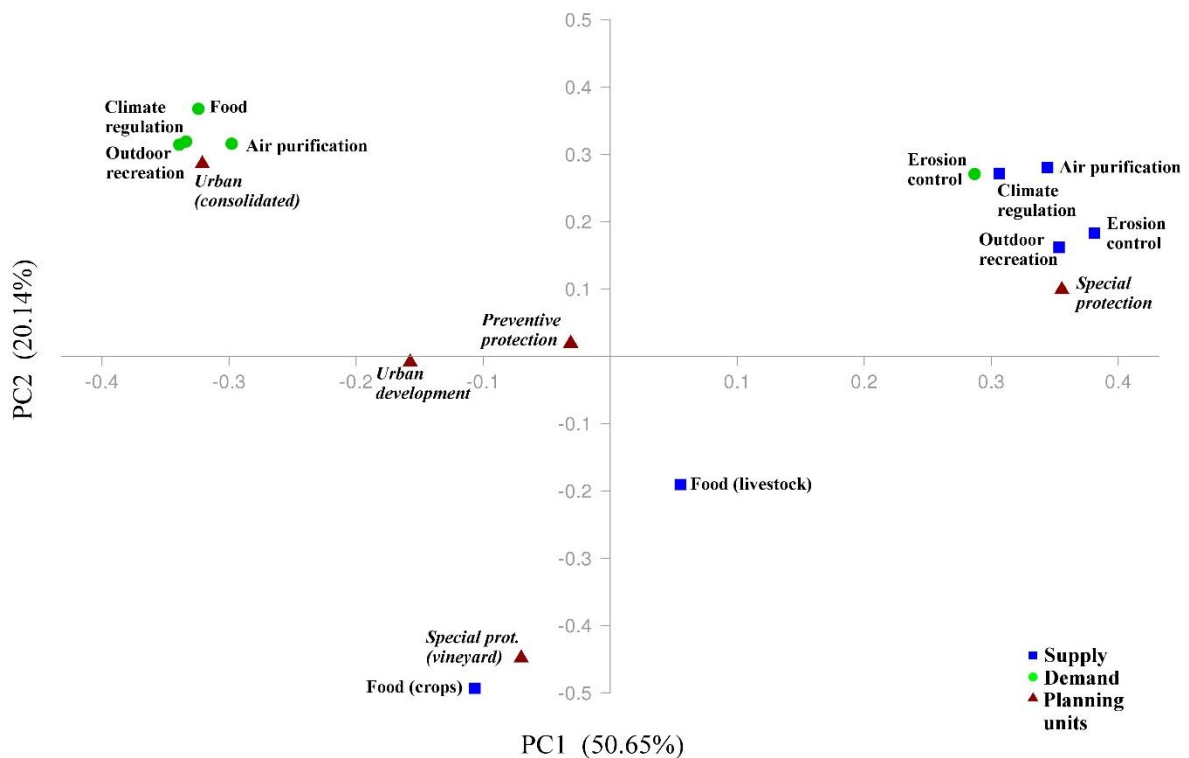


442

443 **Fig. 6.** Spatial distribution of ES supply-demand bundle types and standardized mean ES indicator values found
444 within each cluster (represented in star plots). Outline colors of the cluster boxes link to the map classes, hence
445 representing the map legend. The number of municipalities per cluster is indicated with *n*.

446

447 PCA results revealed two main components explaining 70.79% of the total variance in the set
 448 of eleven ES supply and demand indicators. The biplot of the PCA, representing these two
 449 first axes, is shown in **Fig. 7**. The first axis of the PCA (50.65% of the variance) showed a
 450 potential trade-off between the supply of regulating services and outdoor recreation (highly
 451 related to special protection planning strategy) and their demand (mostly related to urban
 452 strategies), except in the case of the demand for erosion control which contributes positively
 453 to PC1. The second axis of the PCA (20.14% of the variance) revealed a potential trade-off
 454 between the supply of food services (especially crop production) and all other ES indicators
 455 (both at the supply and demand sides). As expected, special protection of the vineyard is
 456 highly related to crop production due to the importance of the Penedès wine-making area.
 457



458

459 **Fig. 7.** Biplot of the principal component analysis (PCA) for the ES supply and demand indicators and their
 460 relationship with land planning strategies (PTMB).
 461

462

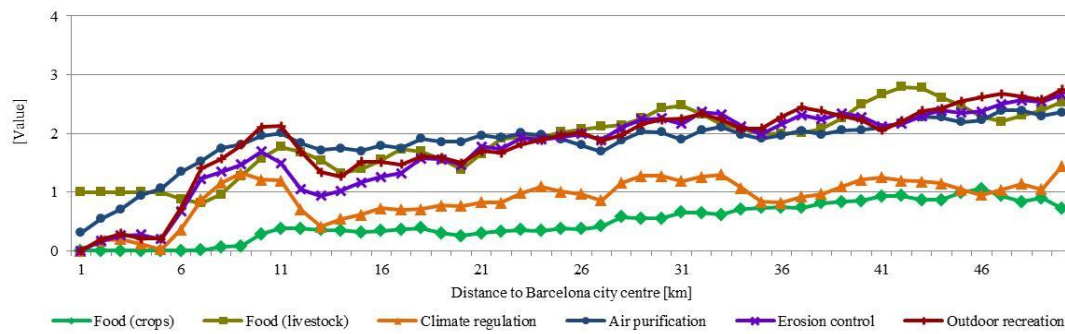
462

463 The spatial urban-rural gradients of the ES indicators for the BMR illustrate graphically the
464 spatial patterns shown in the maps and described above. The gradients for ES supply showed
465 a similar mounting common trend in all indicators as distance to the urban core increases
466 (**Fig. 8A**). In all cases (except crop production), gradients revealed a substantial increase after
467 km 5-6 followed by a slight decrease after km 10-11 only lasting 3-4 km before regaining the
468 growing trend. This pattern can be explained by the periurban areas surrounding the urban
469 core, mainly covered by forests (e.g., Collserola mountain range), shrubland or grassland,
470 which precede the urban and agricultural land located in the inland plains. Demand gradients
471 also showed a common similar pattern for all indicators, except erosion control (**Fig. 8B**).
472 Demand values for these indicators were highest in the urban core followed by a decreasing
473 trend as distance increases. Outdoor recreation and food production demand gradients
474 performed a sharp decline in the first 10 km whereas air purification and climate regulation
475 decreased more gradually because are less dependent to population density. Erosion control
476 demand gradient revealed a similar pattern as for supply, but following a steady trend after
477 km 11 rather than a growing one.

478

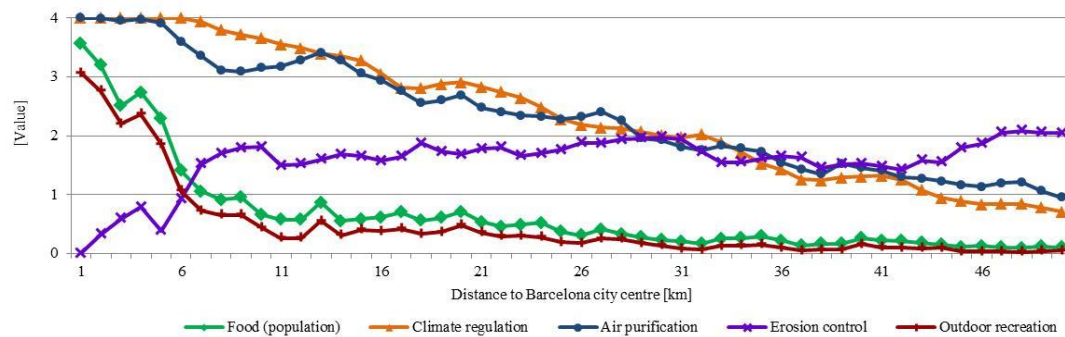
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A) SUPPLY GRADIENTS



479

B) DEMAND GRADIENTS



480

481 **Fig. 8.** Urban-rural gradients (50km) of the ES supply and demand indicators for the BMR. Each point represents
 482 the average reclassified value (0-4 range) in the concentric ring at the respective distance from the Barcelona city
 483 center. Null values are not considered.

484

485

486 **4. Discussion**

487 **4.1. Understanding ecosystem service bundles along the urban–rural gradient**

488 Our results show that land cover and the underlying social-ecological conditions decisively
489 shape supply and demand patterns of ES in the BMR. Interestingly, the resulting ES supply-
490 demand bundle types can be interpreted from a “land sharing” versus “land sparing” approach
491 (Lin and Fuller, 2013). Municipalities under the “Urban core”, “Cropland” and “Forestland”
492 clusters follow largely a sparing landscape model based on one predominant land cover
493 whereas the municipalities grouped into the “Suburban nodes” and “Periurban green” clusters
494 could be classified as land sharing-based spatial configurations consisting of a mix of land
495 covers.

496
497 These patterns are the result of complex historical processes. Mediterranean landscapes such
498 as the BMR have been subject to increasing pressures over the last decades, leading to
499 homogenization dynamics in terms of land use (Brandt and Vejre, 2003; Gómez-Baggethun et
500 al. 2011). Since the 1950s, the BMR has experienced an accelerated urban development,
501 driven by industrialization and associated migration from rural areas (within the BMR and
502 beyond) to cities, especially to the urban core (Catalán et al., 2008). As a result, a gradual
503 abandonment of traditional agrosilvopastoral practices took place, especially in mountainous
504 areas, together with consequent forest densification and afforestation of open land (Otero et
505 al., 2013). Only the most productive, easily-irrigable and accessible land parcels (mostly
506 located in the lowlands) preserved their agricultural use (Marull et al., 2010).

507
508 Currently, “Cropland” municipalities are characterized by a landscape homogeneity which
509 basically provides food products and are relatively poor in terms of capacity to deliver other
510 ES. On the other hand, the landscape homogeneity of “Forestland” municipalities has a high
511 potential to sequester carbon, remove air pollution, control erosion and provide recreation
512 opportunities based on our analysis. Other assessments of ES supply bundles have showed
513 similar results (e.g., Raudsepp-Hearne et al., 2010; Maes et al., 2012) indicating a clear
514 positive association (i.e., synergy) between all the analyzed regulating ES and outdoor
515 recreation and a significant negative association (i.e., trade-off) between crop production and
516 these ES. At the same time, both “Cropland” and “Forestland” municipalities are sparsely

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517 urbanized and populated, which explains the low values they present for ES demand. An
518 exception is erosion control demand, which (unlike the other ES) is not related to urban
519 intensity factors but to geomorphologic aspects such as topographic slope. Consequently,
520 “Forestland” municipalities, mostly located in hilly landscapes, have substantially higher
521 demand values than “Cropland” municipalities which are basically situated in plains. As
522 expected, our results also show that the widespread and dense urbanization characterizing
523 “Urban core” municipalities reflect the highest potential mismatches between ES supply and
524 demand when both are analyzed from a bundle perspective (again with the exception of
525 erosion control). This is consistent with previous studies focused at the city level (Baró et al.,
526 2014; 2015).

527
528 “Suburban nodes” and especially “Periurban green” municipalities are characterized by higher
529 landscape heterogeneity and mix of land uses. As a result, ES bundles show a balanced
530 situation between supply and demand mean normalized values, with some relevant exceptions
531 such as air purification (especially in the “Suburban nodes” bundle), stressing the fact that air
532 pollution problems are not only confined to highly urbanized land. However, it should be
533 noted that a quantitative ES (mis)match or budget analysis as performed in other studies (e.g.,
534 Burkhard et al., 2012; 2014; Kroll et al., 2012) is not possible here because supply and
535 demand indicators are not directly comparable. The only exception is climate regulation
536 where both indicators have the same unit ($\text{kg C ha}^{-1} \text{ year}^{-1}$). Ratios showed that the carbon
537 emissions considered are higher than carbon offsets provided by the local vegetation in all
538 municipalities but five (all included in the “Forestland” cluster”). From the analysis of ES
539 bundles, it is also worth pointing out that livestock production is not particularly prominent in
540 any cluster. Unlike crop production, livestock farming does not necessarily require extensive
541 land parcels (especially for pork or poultry); hence it probably holds a higher spatial
542 compatibility with other land uses. However, results also indicate a likely trade-off with dense
543 urbanization, probably because: (1) urban communities usually are unwilling to live close to
544 industrial animal production sites (Raudsepp-Hearne et al., 2010); and (2) regional land use
545 regulation directly establishes minimum distances between these farming sites and urban
546 areas (which depend on the type of animal and other factors).

547
548

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549 **4.2. Insights for landscape planning and management**

550 The spatial relationship between ES supply and demand is a key issue for landscape planning
551 and management (Syrbe and Walz, 2012). Previous studies (Costanza, 2008; Fisher et al.,
552 2009; Burkhard et al., 2014) have classified ES according to their spatial characteristics
553 suggesting several differentiated categories. Below, we analyze the spatial characteristics of
554 the selected ES and discuss its implications for landscape planning and management in the
555 BMR and similar urban regions in the light of the obtained results. Crop and livestock
556 productions are classified as “*decoupled*” ES because, as most provisioning ES, they can be
557 transported from the place of production to the place of consumption over long distances,
558 involving in many cases complex supply chains (Burkhard et al., 2014). This characteristic
559 allows metropolitan regions such as the BMR to let their food supply rely largely on food
560 imports, at the same time that it allows that a substantial part of its food production is
561 exported elsewhere (e.g., wine products from Penedès are exported worldwide). However,
562 preserving farming areas in urban regions can also play an important role in terms of food
563 security and resilience which should be considered in strategic landscape planning (Barthel
564 and Isendahl, 2013; Camps-Calvet et al., 2016). Additionally, Mediterranean agricultural
565 landscapes hold important cultural values such as aesthetic appreciation, sense of place and
566 local ecological knowledge (Gómez-Baggethun et al., 2010), that are not included in this
567 assessment. These aspects are often recognized in landscape planning and also reflected in
568 consumer preferences for local food (Feldmann and Hamm, 2015). In the BMR, the Penedès
569 vineyards and other agricultural areas are explicitly protected in regional planning instruments
570 such as the PTMB (2010). Climate regulation was classified by Costanza (2008) as a “*global*
571 *non-proximal*” ES because the benefits derived from carbon sequestration and storage by
572 ecosystems are realized globally. Cities and urban regions, including the BMR, are generally
573 far from having a net zero carbon footprint (see Escobedo et al., 2010; Liu and Li, 2012; Baró
574 et al., 2015) and many of them have set substantial CO₂ emissions reduction targets over the
575 coming years (see for example the Covenant of Mayors initiative in Europe²). With regard to
576 land use planning and decision-making, BMR's budget for climate regulation does not
577 necessarily require achieving carbon neutrality, but regional and local policies could foster
578 carbon reduction and offsetting actions both inside and beyond metropolitan boundaries (see

² See http://www.covenantofmayors.eu/index_en.html

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579 Seitzinger et al., 2012) so global climate regulation goals can be met in the long-term
580 (currently municipal Sustainable Energy Action Plans define measures only at the local level).
581 Air purification can be considered a “*local proximal*” or “*omnidirectional*” ES because
582 benefits are realized in the ES providing area or its surrounding landscape without directional
583 bias (Fisher et al., 2009). In terms of spatial planning, that means that urban green space and
584 periurban green areas are key providing areas where the ES is actually delivered due to higher
585 air pollution levels (Baró et al., 2016). Even if the reduction of air pollution emissions should
586 be the first priority in urban policy, GI planning in the BMR can contribute to improve air
587 quality if a land sharing approach is considered in urban development (Stott et al., 2015) and,
588 concurrently, large periurban green areas such as the Collserola massif remain protected from
589 urbanization (Depietri et al., 2016). The Barcelona Green Infrastructure and Biodiversity Plan
590 2020 (Barcelona City Council, 2013) is an interesting initiative towards a land sharing model
591 in the urban core because it fosters the expansion of GI in all sorts of available land, including
592 rooftops, inner courtyards, vacant plots, etc. Erosion control corresponds to an “*in situ*” ES
593 because the benefit (soil retention) is realized in the same location of provision (Burkhard et
594 al., 2014), but can also be considered “*directional*” (Costanza, 2008) because it can prevent
595 erosion-related events such as landslides which benefit downhill areas. In this paper, we have
596 basically analyzed the former condition due to indicator characteristics, showing an apparent
597 synergetic relationship between supply and demand spatial patterns. This can be explained
598 because the areas with higher risk of erosion due to geomorphologic factors (e.g., steepness in
599 mountain ranges) are mostly covered by ecosystems with a high potential to control this
600 process (e.g., forests) whereas land covers with low capacity (e.g., agro-ecosystems) are
601 usually located in topographically less vulnerable areas. Regional urban planning regulation
602 in the BMR currently favors this situation forbidding urban developments in areas where
603 slope is higher than 20%. Finally, outdoor recreation is classified as “*in situ*” or “*user*
604 *movement related*” ES (Costanza, 2008) because, as most part of cultural ES, users need to
605 actively reach providing areas in order to experience the related benefits. Therefore,
606 accessibility is a key aspect for the assessment of outdoor recreation supply-demand
607 relationships (Paracchini et al., 2014). Some studies have observed that beyond a threshold of
608 300-400 meter distance from home, the (everyday) recreational use of urban green space
609 decreases substantially (Schipperijn et al., 2010). Furthermore, size of the providing area is
610 also relevant because some outdoor activities (e.g., walking the dog, playing some sports,

611 relaxation) can be realized in relatively small recreational patches (e.g., pocket parks), but
612 others such as running or cycling require much larger areas. Therefore, in terms of spatial
613 planning, this ES would require a combination of land sparing and land sharing models, as
614 already considered by the English standard ANGSt (Accessible Natural Greenspace Standard,
615 Natural England, 2010) or by other regional decision-support instruments (Van Herzele and
616 Wiedemann, 2003). In the BMR, an effective harmonization of regional planning instruments
617 such as the PTMB (2010) with municipal GI plans (e.g., Barcelona City Council, 2013) is
618 required in order to achieve this arrangement of urban and periurban green spaces.

619

620 **4.3. Limitations and caveats**

621 The framework presented in this research could be potentially applied elsewhere since all data
622 used is likely available in other urban regions. We consider that our assessment of ES bundles
623 and its spatial outputs are sufficiently credible and salient for landscape and management
624 purposes since all the indicators and proxies used here (both at the supply and demand sides)
625 have been successfully applied in other policy-driven ES assessments (e.g., Burkhard et al.,
626 2014; Guerra et al., 2014; Zhao and Sander, 2015; Baró et al., 2016; see also **Table 1**). Still,
627 our methodological approach is challenged by a number of limitations and sources of
628 uncertainty (see also **Appendix A** in Supplementary material).

629

630 One of the main limitations is that ES demand mapping relies on proxies (e.g., population
631 density, air quality and distance to green areas) to indicate the expected amount of ES
632 required by the urban population. Therefore, there is potential for error if the assumed causal
633 variables are not in fact good spatial predictors (Eigenbrod et al., 2010). Validation or
634 improvement of ES demand models could be achieved through complementary stakeholder-
635 based approaches such as questionnaires, surveys or participatory mapping techniques (see
636 Brown and Fagerholm, 2015). However, these methods are likely very cost and time intensive
637 for urban regions such as the BMR due to its population size (Wolff et al., 2015).

638

639 A refinement of the ES indicators would also potentially allow to perform direct congruence
640 analyses between supply and demand leading to additional policy and planning implications
641 (Mouchet et al., 2014). Under its current approach, however, this research can be solely

642 interpreted as the assessment of spatial patterns and associations between ES indicators from
643 a supply- demand bundle perspective.

644

645 **5. Conclusions**

646 To our knowledge, this study presents the first assessment of ES bundles that integrates both
647 the supply and demand sides in an urban-rural gradient. Our results show that urban and
648 agricultural intensity is likely associated to lower potential and richness in terms of ES
649 supply. Conversely, forest landscapes are characterized by a high multifunctionality,
650 especially in regard to regulating ES, but most of these ES are barely demanded in these
651 areas. Urbanization is also a clear driver at the demand side, as higher population densities
652 and urban-related pressures (e.g., air pollution) inevitably entail increased needs for
653 provisioning, regulating and cultural ES, generally leading to expected larger local
654 mismatches between ES supply and demand. From an aggregated urban-rural gradient
655 approach, the case study analyzed here shows inverse spatial patterns of ES supply and
656 demand for all the considered ES, except for erosion control. This was already observed in
657 other urban regions considering specific ES groups (e.g., Kroll et al., 2012), but not from a
658 more holistic perspective.

659

660 With regard to landscape planning and management, a key aspect is taking into account the
661 spatial scale relationships between ES supply and demand. The urban population needs
662 nearby ecosystems in order to benefit from air purification or outdoor recreation services and,
663 even if food or climate regulation can be provided from distant ecosystems, metropolitan
664 regions such as the BMR have important motivations (e.g., food security, nature experience,
665 climate adaptation and mitigation targets, etc.) to reduce their overall ES footprint. Based on
666 these considerations, we argue that a promising approach could consist of combining land
667 sharing strategies in urban and agricultural land in order to increase their multifunctionality
668 and resilience (e.g., stricter GI ratios in urban development plans and fostering the provision
669 of cultural ES in agricultural landscapes), and concurrently, assure the conservation of large
670 patches of multifunctional periurban natural areas (such as the Collserola massif in the BMR).
671 These periurban areas are vital for the fulfillment of certain ES bundle demands of the urban
672 population, but they are generally more vulnerable to urbanization processes.

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869 **Appendix A. Supplementary material**

870 **Description of ecosystem service mapping methods and data sources**

871 *Food (crops)*

872 Crop production (supply indicator) in the BMR was estimated and mapped using two publicly
873 available data sources: (1) 2013 agricultural yield statistical data (Catalan Ministry of
874 Agriculture, 2013); and (2) a regional land cover dataset (Catalan Ministry of Territory and
875 Sustainability, 2012). In order to clearly distinguish between crops for human food
876 consumption and crops for other uses (fodder, materials, etc.), we received expert support
877 from a regional farmers’ union (*Unió de Pagesos*). Since the crop classes considered in the
878 statistical data are more detailed than in the land cover map, we applied a table of
879 correspondence between both categorizations following a previous study carried out by the
880 farmer’s union (Unió de Pagesos, 2013). For example, the statistical crop classes ‘irrigated
881 cereals’, ‘irrigated leguminous’ and ‘irrigated potatoes’ were grouped into the agricultural
882 land cover class ‘irrigated herbaceous crops’. An average agricultural yield per agricultural
883 land cover class (in kg ha⁻¹ year⁻¹) was estimated and mapped considering the different
884 corresponding statistical crop yields weighted by their relative areas (Unió de Pagesos, 2013).

885

886 *Food (livestock)*

887 Livestock production (supply indicator) data were taken from the 2009 Spanish Agricultural
888 Census (INE, 2009). Unlike crop production, the share of total livestock production directly
889 allocated to human food consumption is very difficult to estimate; hence we used total
890 livestock units (LSU) as a proxy indicator. Eurostat³ defines the livestock unit as “a reference
891 unit which facilitates the aggregation of livestock from various species and age as per
892 convention, via the use of specific coefficients established initially on the basis of the
893 nutritional or feed requirement of each type of animal”. The species considered in the case
894 study area were bovine animals, sheep and goats, equidae, pigs, poultry and rabbits (breeding
895 females). We mapped livestock units directly at the municipality level (normalized by area)
896 because it is the smallest unit at which livestock census data were available. The number of

³ See [http://ec.europa.eu/eurostat/statistics-explained/index.php/Glossary:Livestock_unit_\(LSU\)](http://ec.europa.eu/eurostat/statistics-explained/index.php/Glossary:Livestock_unit_(LSU))

897 livestock units produced per farm and its localization, as used in other studies (e.g., van
898 Oudenhoven et al., 2012), were not available.

899

900 *Food (population density)*

901 Food provision demand was mapped using population density as a proxy indicator. A
902 population density grid was generated based on an spatial intersect between a census tract
903 dataset (INE, 2011) and residential land classes extracted from a high resolution land cover
904 map (LCMC, 2009) assuming equal population distribution within residential land for each
905 census tract.

906

907 *Global climate regulation*

908 The annual rate of carbon sequestration as supply indicator of global climate regulation was
909 estimated based on above-ground tree biomass maps for the province of Barcelona from Pino
910 (2007). The author used empirical data from two Spanish forest inventories (IFN2 and IFN3)
911 and applied a land use regression (LUR) model considering various spatial predictors such as
912 land cover, elevation and various climate variables. Carbon sequestration was estimated and
913 mapped from tree biomass net growth between the two inventories considering a biomass-
914 carbon ratio of 0.5 which approximates the proportional mass of carbon in the tree species of
915 the case study (Gracia et al., 2000-2004).

916

917 Demand for climate regulation was based on annual carbon emissions estimated for each
918 BMR municipality. Estimates were collected from municipal Sustainable Energy Action
919 Plans (SEAPs) corresponding to the year 2012 by the Barcelona Regional Council⁴
920 accounting for emissions from sectors such as housing, transportation, services or waste
921 management. Unfortunately, SEAPs' data did not include emissions from some relevant
922 sectors such as industry or agriculture; therefore total values provide a first order estimate of
923 the magnitude of carbon emissions at the municipal level.

924

925

⁴ See <http://www.diba.cat/en/web/mediambient/pactecalldes>

926 ***Air purification***

927 Methods and data sources for mapping the supply (NO₂ dry deposition velocity) and demand
928 (NO₂ concentration levels) indicators of air purification in the BMR are fully described in
929 Baró et al. (2016), hence here only a brief overview is provided. The supply indicator was
930 estimated following the approach proposed by Pistocchi et al. (2010), which estimates
931 deposition velocity (V_d) as a linear function of wind speed at 10 m height (w) and land cover
932 type.

933

$$934 V_d = \alpha_j + \beta_j \cdot w \quad (1)$$

935

936 Where α and β are, respectively, the intercept and slope coefficients corresponding to each
937 broad land cover type j , namely forest, bare soil, water or any combination thereof.

938

939 Concentration of NO₂ (demand) was estimated using a LUR model, a computation approach
940 widely used for assessing air pollution at different scales (e.g., Beelen et al. 2013). The LUR
941 model was built using NO₂ concentration measurements (year 2013) from the operational
942 monitoring stations located in the BMR ($n = 40$) as dependent variable, and a set of spatial
943 predictor parameters (i.e., independent variables) related to land cover type, geomorphology,
944 climate, and population, that were considered to be the most relevant for distribution of NO₂
945 concentrations.

946

947 ***Erosion control***

948 A biophysical indicator could not be calculated for the supply of erosion control due to data
949 availability limitations, so we applied an expert-based matrix model (Burkhard et al., 2012)
950 using the regional land cover dataset as spatial data (Catalan Ministry of Territory and
951 Sustainability, 2012). We applied a table of correspondences between the CORINE land cover
952 types used in Burkhard et al. (2012) and the regional land cover types.

953

954 Following Burkhard et al. (2014) and Guerra et al. (2014), demand for erosion control was
955 mapped using a soil loss potential index map developed by the Department of Geology of the
956 Autonomous University of Barcelona for the Geographic Information System for the Network

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957 of Open Areas in the province of Barcelona (SITxell⁵). The index is based on soil erodibility
958 and topographic factors, but it does not include climate factors such as rainfall runoff. It
959 defines four levels of soil loss potential, from 0 (negligible soil loss potential) to 3 (very high
960 soil potential).

961

962 *Outdoor recreation*

963 Methods and data sources for mapping the supply (recreational potential index) and demand
964 (recreational demand index) indicators of outdoor recreation in the BMR are fully described
965 in Baró et al. (2016), hence here only a brief overview is provided. The model used here for
966 assessing outdoor recreation focuses on nature-based recreational activities in the everyday
967 life (Paracchini et al., 2014; Zulian et al., 2014). The rationale for assessing recreation
968 capacity in this model can be summarized as follows: (1) the lesser human influence on
969 landscapes, the higher value in terms of nature-based recreational potential; (2) protected
970 natural areas and features (e.g., remarkable trees) are considered indicators of high
971 recreational capacity; and (3) water bodies exert a specific attraction on the surrounding areas
972 (Paracchini et al., 2014). Recreation capacity is hence mapped on the basis of the assessment
973 of three components: degree of naturalness, nature protection, and presence of water. Each
974 component was composed of one to four internal factors considered relevant in the case study
975 of the BMR and for which spatial input data was available (see Baró et al., 2016). A score or
976 weight (in the 0–1 range) was assigned to every factor standing for their relative importance
977 or impact in terms of recreation potential. The final selection of factors and definition of
978 scores was based on a consultation process (via focus group) with four experts working in
979 environmental planning and territorial analysis for the Barcelona Regional Council. The final
980 dimensionless value of recreation capacity was normalized in the 0-1 range.

981

982 Demand for outdoor recreation was mapped based on the availability of recreational sites (i.e.,
983 recreation capacity equal or higher than 0.4) close to people's homes and population density.
984 A spatial cross-tabulation was carried out between a reclassified raster of Euclidian distances
985 to recreation sites and the population density grid, assuming that all inhabitants in the case

⁵See http://www.sitxell.eu/en/mapa_geologia.asp

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986 study area have similar desires in terms of (everyday life) outdoor recreational opportunities,
987 but their level of fulfillment depends on proximity to recreation sites (see cross-tabulation
988 matrix in Baró et al., 2016). The resulting raster indicates ES demand in residential land
989 following a 0 (i.e., no relevant demand) to 5 (i.e., very high demand) value range.

990

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