1	Exploring the links between social metabolism and biodiversity distribution
2	across landscape gradients: a regional-scale contribution to the land-sharing
3	versus land-sparing debate
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## 16 Abstract

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18 The debate about the relative merits of the 'land-sparing' and 'land-sharing' approaches to 19 biodiversity conservation is usually addressed at local scale. Here, however, we undertake a 20 regional-scale approach to this issue by exploring the association between the Human 21 Appropriation of Net Primary Production (HANPP) and biodiversity components (plants, 22 amphibians, reptiles, birds and mammals) across a gradient of human-transformed landscapes in 23 Catalonia, Spain. We propose an Intermediate Disturbance Complexity (IDC) model to assess 24 how human disturbance of the photosynthetic capacity affects the landscape patterns and 25 processes that host biodiversity. This model enables us to explore

26 the association between social metabolism (HANPP), landscape structure (composition and 27 spatial configuration) and biodiversity (species richness) by using Negative Binomial Regression 28 (NBR), Exploratory Factor Analysis (EFA) and Structural Equation Modelling (SEM). The 29 empirical association between IDC and landscape complexity and HANPP in Catalonia confirms 30 the expected values of the intermediate disturbance hypothesis. There is some increase in biodiversity when high IDC values correspond to landscape mosaics. NBR and EFA show 31 32 positive associations between species richness and increasing values of IDC and forest cover for 33 all biodiversity groups except birds. SEM shows that total biodiversity is positively determined 34 by forest cover and, to a lesser extent, by HANPP, and that both factors are negatively associated 35 with each other. The results suggest that 'natural' landscapes (i.e. those dominated by forests) and 36 agroforestry mosaics (i.e. heterogeneous landscapes characterized by a set of land uses 37 possessing contrasting disturbances) provide a synergetic contribution to biodiversity 38 conservation. This 'virtuous triangle' consisting of forest cover, HANPP and biodiversity 39 illustrates the complex human-nature relationships that exist across landscape gradients of human 40 transformation. This energy-landscape integrated analysis provides a robust assessment of the 41 ecological impact of land-use policies at regional scale.

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## 43 Keywords

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45 Biodiversity conservation, cultural landscapes, food-biodiversity dilemma, global change, human

- 46 appropriation of net primary production, intermediate disturbance hypothesis.
- 47

## 48 Introduction

49 For millennia, global human-driven Land Use and Cover Changes (LUCC) have been increasingly 50 affecting terrestrial ecosystems (Sterling & Ducharne, 2008). They have led to unprecedented levels of 51 landscape transformations worldwide that have greatly increased the amount of what are termed 52 'anthropogenic habitats' (Ellis et al., 2008). The past century was witness to particularly severe LUCC, 53 which affected habitat and species conservation. The human population has continued growing, and the 54 huge increase in global food production through increasingly industrialized and globalized production 55 systems – necessary to satisfy population demands – has provoked many serious socio-ecological impacts 56 and conflicts (Tilman et al., 2002; Mayer et al., 2015).

57 As a result, human-driven production systems are facing a global challenge amidst a scenario of socio-58 metabolic transition (Schaffartzik et al., 2014). The dilemma today is how to ensure that the increased 59 land-use intensity required to meet the growing demand for food, feed, fibres and fuels (Godfray et al., 60 2010) remains compatible with efforts to avoid biodiversity loss (Cardinale et al., 2012). These global 61 trends coexist with other important LUCC such as rural land abandonment at local-to-regional scales. The 62 other face of agricultural intensification - and the abandonment of steep marginal lands - has led to forest 63 transition (Meyfroidt et al., 2011). Another primary LUCC is landscape urbanization, widespread 64 worldwide and concentrated in periurban and the most accessible areas, which competes with intensive 65 cropping and farming for land (e.g. Basnou et al., 2013).

All these LUCC affect the photosynthetic capacity of ecosystems, which may have a serious impact on biodiversity. The Human Appropriation of Net Primary Production (HANPP) is a quantitative estimate of the potential annual biological productivity reduced by human activities such as row crops, timber harvesting, grazing, fire and changes in land use (Krausmann et al., 2013). Greater HANPP reduces the energy availability for other trophic chains and subsequently affects ecological functions and the provision of biodiversity-related ecosystem services. To date, however, HANPP has primarily been assessed at global and regional scales rather than at smaller (landscape) scales, which are more closely related to the heterogeneous nature (and working scale) of both human and natural systems (Andersen et al., 2015;
Marull et al., 2016a). On the other hand, HANPP patterns across landscape gradients and their association
with landscape composition and biodiversity have been seldom explored, despite their relevance in
regional planning and biodiversity conservation.

77 From a planning and conservation perspective, analysing HANPP effects on biodiversity across 78 landscape gradients allows us to extend to regional scale the on-going 'land-sparing' versus 'land-sharing' 79 debate (Perfecto & Vandermeer, 2010). The 'land-sparing' strategy consists of intensifying human land 80 uses (e.g. cropping or urbanization) in certain areas to dedicate to nature conservation the freed-up 81 (marginal) land (Matson & Vitousek, 2006). By contrast, the 'land-sharing' approach seeks to develop a 82 synergistic interaction of human land uses and nature conservation areas within a complex landscape 83 mosaic (Tscharntke et al., 2012). Even those who aim to combine these two approaches stress the need for 84 more research to understand their respective effects on biodiversity conservation (Phalan et al., 2011).

85 For example, some studies underline the opportunity for biodiversity provided by rural land 86 abandonment; this is the case of the forest transition approach (Rudel et al., 2005), which permits 87 ecosystem recovery in combination with the designation of protected areas and other conservation policies 88 (Grau & Aide, 2008). Conversely, other studies see land abandonment as a threat to the biodiversity found 89 in traditional agroforestry mosaics of cultural landscapes, since it usually goes hand-in-hand with land 90 cover homogenization and has negative consequences for open-habitat species (Preiss et al., 1997). 91 Human-modified landscapes may in fact provide habitats and opportunities for certain species, above all 92 multi-habitat and edge species (Benton et al., 2003), and create a more permeable land-matrix allowing for 93 dispersion of local populations (Shreeve et al., 2004). Thus, thanks to a combination of the edge effect and 94 high ecological connectivity, agroforestry mosaics may host greater biodiversity than more uniform 95 landscapes (Harper et al., 2005).

96 The dilemma between HANPP and biodiversity conservation across landscape gradients requires 97 further research into the disturbance regimes associated with land-use patterns and their effects on species

98 richness and ecosystem services (Fischer et al., 2008). More research at greater depth into the patterns and 99 processes involved in landscape metabolism is still required (Pierce, 2014). Many studies highlight the 100 importance for biodiversity conservation of keeping some degree of anthropic disturbance and landscape 101 heterogeneity in cultural landscapes (Jackson et al., 2007). Indeed, an intermediate disturbance hypothesis 102 has been frequently advocated to explain biodiversity maintenance (Huston, 2014), although there is no 103 consensus about its applicability to all types of ecosystems (Fox, 2013). This hypothesis has contrasting 104 lectures at landscape scale in the context of the 'land-sharing' versus 'land-sparing' debate, and its 105 relevance to biodiversity conservation will depend to a great extent on the land-cover patterns generated 106 by the diverse disturbance levels exerted by each anthropic type of land use (Chesson & Huntly, 1997).

107 On the one hand, intermediate disturbance patterns may generate high biodiversity in human-modified 108 landscapes due to the coexistence of species with contrasting ecological requirements (Barnes et al., 109 2006). On the other hand, this will also depend on the vertical/horizontal complexity of land-use mosaics, 110 as well as the intensity and direction of their associated socio-metabolic flows (Swift et al., 2004; Marull 111 et al., 2016b). Therefore, understanding and correctly managing these patchy mosaics requires an 112 interdisciplinary approach to the bio-cultural diversity (Parrotta & Trosper, 2012) embedded in agro-113 ecological landscapes (Matthews & Selman, 2006).

114 In light of the above, Marull et al. (2016a) have developed an Intermediate Disturbance Complexity 115 (IDC) model to assess how landscape functional structure is affected by different levels of anthropogenic 116 disturbance in ecosystems when altering Net Primary Production (NPP) through LUCC (Marull et al., 117 2017). The IDC is based on measures to describe the landscape patterns and processes, and uses HANPP 118 as the basic measure of anthropic alteration of ecosystem energy flows. The model assumes that the 119 conservation of heterogeneous and well-connected land matrices, where there is a positive interplay 120 between human energy disturbances and landscape complexity, will ensure greater species richness in 121 cultural landscapes. If this holds true, it will give rise to a hump-shaped relationship between both 122 landscape complexity and available NPP and biodiversity. Yet, to date, these patterns have rarely been 123 assessed across landscape gradients. The main contribution of this paper is to provide an innovative 124 analytical approach, based on a previous (IDC) model, of combined effects of energy appropriation and 125 landscape structure on biodiversity. It then provides a basis for the energy-landscape integrated analysis of 126 the ecological impact of land-use policies at regional scale.

127 The objective of this paper is to discover the links that exist between social metabolism and 128 biodiversity across gradients of landscape transformation at regional scale in a Mediterranean region 129 (Catalonia), thereby assessing how 'land-sharing/land-sparing' approaches can contribute to explaining 130 biodiversity in human-transformed landscapes. Using UTM 10-km cells, we account for the association 131 between current landscape patterns (composition and spatial configuration), human disturbance (HANPP) 132 and biodiversity (species richness of main biodiversity groups). First, we apply the IDC model, which 133 combines a set of metrics of land-cover patterns, ecological processes and socio-metabolic changes. We 134 then use Negative Binomial Regression (NBR), Exploratory Factor Analysis (EFA) and Structural 135 Equation Modelling (SEM) to assess how these metrics affect the capacity of landscapes to host 136 biodiversity.

- **137 1. Methods**
- 138 *1.1. Study area*

139 The study is focused on Catalonia (NE Spain; 32,000 km<sup>2</sup>), part of the Mediterranean biodiversity 140 hotspot and possessor of great ecosystem diversity due to its varied topography (with elevations ranging 141 from 0 to 3,143 m a.s.l.) and important climatic gradients (Ninverola et al., 2000). Landscape structure in 142 Catalonia is the product of the long-term interaction between human activity and nature that characterizes 143 Mediterranean bio-cultural regions (Grove & Rackman, 2001). Water resources are limited, as 144 corresponding to a Mediterranean region, and dominated by the Ebro River (average water flow of 426 145  $m^{3}s^{-1}$ ) whose catchment occupies 48% of Catalonian land. Other major rivers in the region are the Ter (25 146  $m^{3}s^{-1}$ ), the Llobregat (21  $m^{3}s^{-1}$ ) and the Fluvià (10  $m^{3}s^{-1}$ ). In recent decades, the abandonment of steep, 147 marginal agricultural areas has led to an upturn in the extent of forest cover (currently 40% of the land surface area of Catalonia) (Fig. A1). The most favourable areas for human settlement – generally plains and other relatively flat areas – exhibit contrasting situations involving both growing crop intensification and greater urbanization. In drier areas, the water uses for agricultural, industrial or urban purposes entail an important stress for the river and riparian functioning and biodiversity, which play a key role as wildlife corridors. The central coastline of Catalonia around the city of Barcelona is one of the most populated and industrialized areas on the northern Mediterranean rim.

## 154 *1.2.IDC model*

Marull et al. (2016a) proposed the Intermediate Disturbance Complexity (IDC) model (Fig. 1) to explain how a combination of anthropogenic disturbance to ecosystem functioning and landscape structure may affect the capacity of the land matrix to host biodiversity (Fig. 2). In its initial version, IDC was conceived as the product of two variables that respectively summarize landscape patterns and human disturbance: the Shannon-Wiener index (H') of land cover and the remainder of the human appropriation of net primary production (1-HANPP).

The study was based on 251 UTM 10-km cells lying completely within the borders of Catalonia. The landscape structure of these cells was taken from the 2009 Land Cover Map of Catalonia (www.creaf.uab.es/mcsc/) reclassified into a set of principal land cover categories (Fig. A1). The landcover percentage of each category was obtained for each UTM cell and these values were then used to calculate H' (Shannon & Weaver, 1949). HANPP values were also calculated for each UTM cell according to the approach used by Haberl et al. (2014):

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$$HANPP = HANPP_{luc} + HANPP_{harv}; HANPP_{luc} = NPP_0 - NPP_{act}$$

where HANPP<sub>harv</sub> is the NPP appropriation due to harvests and HANPP<sub>luc</sub> is the change in the NPP due
to human-induced land alteration. HANPP<sub>luc</sub> is defined as the difference between the NPP of the potential
(NPP<sub>0</sub>) and actual (NPP<sub>act</sub>) vegetation. Thus, HANPP was calculated for each land-cover category and
UTM cell as the weighted sum of fixed coefficients (w<sub>i</sub>) multiplied by the proportion of the land surfacearea occupied by each land cover type:

$$HANPP = \sum_{i=1}^{k} w_i p_i$$

where  $w_i$  is the weight and  $p_i$  the proportion of land cover i in a UTM cell. To estimate HANPP values it is necessary to assess different levels and amounts of NPP and harvests. Harvest ratios taken from each land cover were transformed into energy values. Conversion factors such as the residue/product ratio losses (Guzmán et al., 2014) were then applied to account for the unharvested biomass in each land-cover category.

Then IDC was improved by applying a previously developed index – the Le (Landscape Ecology
metric) – that aims to describe a combination of landscape patterns and processes (Marull et al., 2016b):

180 IDC = Le (1 - HANPP / 100)

181 Le was obtained by orthogonalizing two landscape indices using canonical correlation analysis:

182 
$$Le = \left(a L + b \frac{ECI}{10}\right) 1/(a + b)$$

where a and b are the canonical coefficients. L is an improved index of landscape heterogeneity based
on H' that subtracts the built-up areas (Marull et al., 2016a). ECI is an index of ecological connectivity
that summarises landscape processes on a normalized scale from 0 to 10 (Marull & Mallarach 2005).

186 Fig. 1 depicts the shapes of all possible values for the theoretical relationship between human 187 disturbance and landscape complexity wherever it is possible to represent the site-specific disturbance-188 complexity (IDC) values of a given territory. There is one H' (or Le) and one HANPP value for each 189 sample cell. 1-HANPP expresses the average energy available for non-domesticated species in each 190 sample cell. Importantly, the same HANPP value can be obtained with different land-cover combinations 191 (i.e. having one or various habitats composition). Likewise, Le can also be obtained using a number of 192 land-cover categories, although the contribution of each land cover to biodiversity maintenance may vary 193 (e.g. due to the variable amount of energy available for conserving trophic chains).

194 *1.3. Biodiversity data* 

As a test of IDC against biodiversity data components, we used the observed species richness of different taxonomic groups (vascular plants, amphibians, reptiles, birds and mammals) and the total species richness per UTM 10-km cell in Catalonia (Fig. A2). These data were obtained from the Biodiversity Data Bank of Catalonia (BDBC; http://biodiver.bio.ub.es/biocat), a public data server that collates comprehensive records of biodiversity components in Catalonia. We then analysed the presence of taxa to obtain the species richness of each studied group per UTM cell.

### 201

### 1.4. Statistical analyses

202 Given that it is not disturbance as such but the disturbance-complexity interplay (IDC) that is 203 determinant in biodiversity conservation at landscape scale, we did not assume any clear statistical 204 relationship between species richness and HANNP when these two variables are taken separately. Rather, 205 we expected that there would be a relationship between species richness and HANPP combined with Le 206 (landscape connected-heterogeneity) as per the 'land-sharing' paradigm. Simultaneously, we also 207 expected to find a relationship between great species richness (of certain biodiversity components) and the 208 existence of homogeneous landscapes dominated by 'natural' categories of land covers (i.e. those with 209 low human-driven disturbance) according to the 'land-sparing' paradigm. To test the association between 210 landscape metrics, HANPP and biodiversity at UTM 10-km level, we performed three complementary 211 statistical analyses:

First, we ran a Negative Binomial Regression (NBR) for the species richness of vascular plants, amphibians, reptiles, birds and mammals, and total biodiversity (including all the studied taxa) that took into account IDC and land-cover composition (in %) per UTM cell in 2009. The aim of this NBR (Hilbe, 2011) was to test the aggregated contribution to biodiversity of both the 'land-sharing' and the 'landsparing' components.

Second, we performed an Exploratory Factor Analysis (EFA) with varimax rotation (Costello &
Osborne, 2005) to explore the association between the measured variables of landscape, HANPP and
biodiversity. The EFA was carried out using separately the taxa with most data (vascular plants, mammals)

and birds) and total biodiversity, Le and HANPP (both components of IDC, treated independently), IDC,and the proportion of different land-cover categories in each UTM cell.

Finally, in order to disentangle the direct and indirect effects of landscape structure and HANPP on biodiversity, a Structural Equation Model (SEM) was constructed for each of the main biodiversity groups (vascular plants, birds and mammals) and total biodiversity. The SEM took into account the direct effects of Le and HANPP (the two IDC variables) and their indirect effects reflected in land-cover composition (Cm) controlled for elevation (MDE). The Model was conducted with the SEM package in R (Fox et al., 2016).

228 **2. Results** 

The IDC empirical results obtained for Catalonia show a hump-shaped relationship (Fig. 2a) in which the highest value of IDC is attained when 1-HANPP and Le tend to 60%, thereby confirming the intermediate disturbance hypothesis. Furthermore, there is no clear relationship between 'natural' landscapes (i.e. homogeneous landscapes dominated by land-cover categories with the highest values for 1-HANPP) and total biodiversity (Fig. 2b). Conversely, there is a certain tendency for biodiversity to increase when high IDC values are obtained in heterogeneous landscapes.

235 The NBR was applied to all the selected taxonomic groups. We used Principal Component Analysis 236 (PCA) to identify two main factors (Table A1a): the first factor (34.8% of variance) showed higher 237 loadings for IDC ('land-sharing') and forest cover ('land-sparing'), while the second factor (22.9% of 238 variance) had greater loadings for scrubland, pastureland, river corridors and unproductive land-cover 239 categories. Then, we used these factors and the species richness of each taxonomic group to perform a 240 NBR (Fig. 3). The NBR results show a positive association between species richness and increasing 241 values for the first factor (corresponding to IDC and forest land cover) for all biodiversity groups except 242 birds and reptiles (Chi-Square test at p < 0.05). These results highlight the synergetic contribution to 243 biodiversity conservation made by both 'natural' landscapes (i.e. those dominated by forests) and 244 agroforestry mosaics (i.e. heterogeneous landscapes with a set of land uses of contrasting disturbances).

245 The EFA (Fig. 4) confirms the positive association between IDC and forest cover, and the negative 246 association between these variables and cropland and HANPP, which are, in turn, positively associated 247 one another. By contrast, Le is positively associated in the landscape with several land-cover categories of 248 minor importance but is negatively associated with built-up areas and road and rail networks affecting 249 landscape structure and function. In terms of biodiversity components, total biodiversity is more closely 250 associated with IDC (especially vascular plants) and forest cover (especially mammals). No relationship 251 between these factors and species richness in birds was detected.

252 The SEM was applied for the main taxonomic groups and total biodiversity, showing all the paths 253 significant (Tables A2-A5). A PCA with land-cover composition was conducted to reduce the number of 254 predictors and their redundancy in the SEM (Table A1b). The first axis (38.5% of variance) was mainly 255 correlated with forest (positively) and crop (negatively) cover, while the second axis (31.2% of variance) 256 was most closely associated with non-urban (positively) and urban (negatively) cover. The SEM results 257 (Fig. 5) show that total biodiversity was positively affected by the first landscape factor (forest-cropland 258 gradient) and, to a lesser extent, by HANPP (scores of 2.08 and 1.82, respectively). It is worth noting that 259 HANPP and this landscape component are negatively associated (coefficient: -0.97). Le probably has no 260 important effect due to the fact that in the SEM two contrasting factors affect this variable: large forest 261 patches (landscape homogeneity) and land cover mosaics. Indeed, SEM shows that overall biodiversity in 262 Catalonia is associated with 'natural' spaces (or 'land-sparing') but also with the intermediate disturbance 263 hypothesis (or 'land-sharing'). SEM has been tested for several taxa (vascular plants, mammals and birds) 264 and has always provided consistent results.

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### 3. Discussion

#### 266 3.1. Contribution to the 'land-sharing/land-sparing' debate at regional scale

267 This study confirms the validity of IDC as a proxy for assessing how different levels of HANPP affect 268 the functional landscape structures that host biodiversity (Fig. 2). We have extended IDC from a formerly 269 local approach (Marull et al., 2016a) to regional scale via the use of a gradient of landscapes with contrasting degrees of HANPP. The empirical association between IDC and landscape complexity (Le)
and human disturbance (HANPP) confirms the values predicted by the intermediate disturbance
hypothesis, and corroborates that there is an optimal combination of landscape heterogeneity and HANPP
that hosts the highest total biodiversity.

274 From a 'land-sharing/land-sparing' standpoint, our results suggest the importance of combining both 275 approaches as a means of maintaining high biodiversity levels in landscapes of human-transformed 276 regions. NBR (Fig. 3) results show a positive association between forest cover and landscape complexity 277 for all biodiversity groups except birds. EFA (Fig. 4) ones indicate that overall biodiversity is associated 278 with IDC (especially vascular plants) and forest (especially mammals). Finally, the SEM test (Fig. 5) 279 shows that the resulting 'virtuous triangle' between forest cover, HANPP and total biodiversity can clearly 280 explain the complex human-nature relationship inherent to human transformation across landscape 281 gradients. All these results confirm the synergistic contribution to biodiversity maintenance made by 282 'natural' landscapes (i.e. those dominated by forests) and agroforestry mosaics (i.e. heterogeneous 283 landscapes characterized by a set of land uses possessing contrasting disturbances). Hence, the restoring of 284 cultural landscape heterogeneity via more sustainable farming systems could potentially be of great 285 interest in the future.

286 The combination of spatially uneven disturbances and land-cover heterogeneity in cultural landscapes 287 offers habitats for species and ecological communities associated with these human-modified landscapes. 288 As a result,  $\beta$ -diversity at landscape scale increases and compensates for the fall in  $\alpha$ -diversity at local 289 (plot) level in croplands, the typical impact of organic farming on biodiversity at local scale (Gliessmann, 290 1990). A recent global review by Tscharntke et al. (2012) has stressed that spatial heterogeneity creates an 291 ecological dissimilarity that determines landscape-wide biodiversity kept in human modified landscapes. 292 Provided that farming disturbances – and the novel farm-associated biodiversity (Altieri, 1999) – do not 293 threaten the survival of the species richness sheltering in the most undisturbed land units, this whole 294 process could even entail an increase in  $\gamma$ -diversity at regional scale.

295 Our results show that landscape patterns and HANPP levels affect biodiversity groups in different 296 ways depending on their contrasting ecological requirements and dispersal abilities. This is an obvious 297 result, yet one that is rarely supported by empirical data in regional analyses. On the one hand, 298 mismatches between richness of different biodiversity groups have been attributed to contrasting 299 ecological filtering (Flather et al., 1997; Gaston, 2000). On the other hand, the role of landscape structure 300 and composition in biodiversity distribution in human-modified regions has started to be explored. Herrera 301 et al. (2016) recently emphasized the importance of forest cover and landscape complexity in vertebrate 302 responses at both species (i.e. abundance) and community (i.e. richness) levels in a regional approach.

303 In Catalonia, regional-scale biodiversity patterns remain largely unexplored despite the abundance of 304 biodiversity databases. Based on correlational approaches, Pausas et al. (2003) and Pino et al. (2005) 305 found that the species richness per UTM 10-km square of native and alien plants depends, respectively, on 306 environmental and human-driven landscape heterogeneity, and the latter is presumably associated with 307 intermediate levels of HANPP. In addition, Santos et al. (2008) have highlighted the importance of 308 agroforestry landscape mosaics (providing intermediate-to-high habitat heterogeneity and contrasting 309 HANPP levels) for explaining bird species richness in UTM 1-km squares, a finding that has been 310 confirmed in a study carried out at European scale (BirdLife International, 2004). Unfortunately, no 311 previous information is available for mammal species. Nevertheless, our study does highlight the fact that 312 mammal species richness positively responds to low levels of disturbance and human-driven landscape 313 heterogeneity. This statement is supported by previous studies showing that habitat loss and degradation is 314 the greatest threat to terrestrial mammals in Europe (Temple & Terry 2007).

315

### 3.2. Implications of the 'land-sharing/land-sparing' approach for land-use policy

Our results suggest that a combination of 'land-sparing' and 'land-sharing' approaches is especially indicated for protecting high biodiversity levels in human-transformed regions. Planning initiatives aimed at including cultural landscapes should not be regarded as incompatible with more mainstream policies designed to create networks of natural protected areas including pristine undisturbed landscapes, whose 320 ultimate aim is the preservation of specific habitats and/or charismatic species. The combination of 321 traditional integrated land uses and heterogeneous well-connected habitats in urbanized regions facilitates 322 spatial and temporal insurance, and provides greater resilience to ecological processes (Loreau et al., 323 2003). Consequently, a wildlife-friendly agro-ecological matrix could be a useful strategy for enhancing 324 both biodiversity and food security. Cultural landscapes are greatly threatened in Europe with the 325 contrasting trends of land abandonment and forest encroachment in marginal areas, as well as of crop 326 intensification and urbanization in lowlands (Basnou et al., 2013). Both trends lead to degradation and 327 rarefaction of heterogeneous landscape mosaics.

328 European policies designed to increase food production and safeguard protected areas (e.g. Common 329 Agricultural Policy and Habitats/Birds Directives) have not generally taken into account the sustainability 330 of these cultural landscapes. Thus, agricultural intensification threatens many regulatory and sustenance 331 ecosystem services (i.e. water cycle and soil fertility, ecological processes and biodiversity) provided by 332 cultural landscapes, while urban sprawl arising from the real-estate boom in recent decades has caused a 333 substantial loss of landscape functions in lowland areas. By contrast, the abandoning of croplands and 334 subsequent forest regrowth are leading to a recovery in forest biodiversity in remote upland areas, but also 335 to a substantial losses in certain biodiversity components of great conservation concern (Melero et al., 336 2016).

337 The upshot is the abandoning of traditional agricultural activities, forest transition and urban sprawl. 338 Traditional agro-ecosystems had organized their land usages in terms of different gradients of energy 339 turnover, which kept an integrated management of multifunctional landscapes given that their survival 340 depended on this land-use efficiency. In order to offset the energy lost in the inefficient human 341 exploitation of animal bioconversion (Guzmán & González de Molina 2009), traditional organic farmers 342 carefully ensured that livestock breeding was closely integrated with croplands, pastures and forest spaces 343 (Krausmann, 2004). These traditional landscape mosaics, and their closed energy cycles, ensured that the 344 'land-sharing' strategy worked in favour of biological conservation (Tscharntke et al., 2012). Today, the 345 socio-ecological transition to agro-industrial farm systems that rely on external inputs from underground fossil fuels has enabled society to overcome the age-old energy dependency on renewable bioconverters(Schaffartzik et al., 2014).

348 The lack of an integrated management of energy flows and land uses, differentiated at diverse spatial 349 scales and temporal rhythms, is part of the current global ecological crisis and ought to persuade societies 350 to recover their lost landscape efficiency (Marull et al., 2016b). Industrial farming and animal breeding 351 has cut off energy efficiency, raised the amount of agricultural greenhouse gas emissions, and generated 352 widespread pollution by agrochemicals. Society is increasingly demanding more sustainable foodscapes 353 that, together with healthier and nearer food provision, could be able to maintain a relevant share of 354 species richness able to provide the whole range of ecosystem services. Despite the loss of traditional 355 agro-forest mosaics, our results show that agroecosystems still contribute to a relevant extent to the overall 356 biodiversity found in Catalonia (Cervera et al., 2016). Hence, if we can raise this contribution in future, 357 we may take advantage of the farmland landscapes' capacity-still largely underused -for improving 358 biodiversity and biodiversity-related ecosystem services.

### 359 *3.3. Concluding remarks*

By using both the Human Appropriation of Net Primary Production (HANPP) and the Landscape Ecology metric (Le) as proxies of biodiversity across landscape gradients of human transformation, the IDC model here proposed has proven to be statistically robust to apply the concept of intermediate disturbance complexity to landscape ecology assessment performed at regional scale (Catalonia, NE Spain). IDC metrics may assist to appraise the impact of land-use policies on ecological landscape functioning, especially in human-modified regions, thus helping to resolve the global food-biodiversity dilemma (Cardinale et al., 2012).

Our results have brought to light an interesting synergy between the classical 'land-sparing' approach, that promotes natural reserves for biodiversity conservation, and the newer 'land-sharing' approach, that highlights the key role that a wildlife-friendly mosaic of land uses can play in biodiversity maintenance in human-transformed landscapes (Fisher et al., 2008). 'Land-sparing' is based on homogeneous landscapes,

either abandoned or intensively used with important inputs of fertilizers and agrochemicals that usually attain very high agricultural yields, and might help to reduce the need to convert natural ecosystems into farmland to meet food production targets (Grau et al., 2013). However, our results back the claim that high biodiversity can also be achieved through correct landscape management that combines traditional rural knowledge and new agro-ecological practices in cultural landscapes (Agnoletti, 2014).

376 The HANPP-based approach to social metabolism proposed here needs to be adapted and enlarged in 377 order to give account of the cyclical character of agroecosystems. While HANPP can be a useful indicator 378 for studies performed at global or regional scales, it becomes inadequate at local scales. It is important to 379 note that the use of HANPP as a measure of disturbance might have limitations in specific situations (in 380 particular as HANPP values can become negative when  $NPP_{act} > NPP_0$  due to fertilizer input or irrigation). 381 The energy-landscape integrated analysis developed at local scale by Marull et al. (2016b) is aimed at 382 meeting this challenge by using a graph modelling of energy turnover in agroecosystems to capture the 383 interlinked complexity and information embedded in the pattern of flows that become imprinted in 384 cultural landscapes.

The long-term decrease of energy efficiency, including non-renewable external inputs (fertilizers, pesticides, fuel); can be related with the deterioration of agroecosystems' in terms of farm-associated biodiversity and related ecosystem services. Confirming or rejecting this interpretation requires applying the energy-landscape integrated analysis to different biomes and time periods, and using large biodiversity datasets to find out where the critical thresholds in energy throughputs and landscape complexity interplay are located.

A key avenue for further research using these novel methods is to assess how land-use policies could
favour more synergistic relationships among anthropic energy flows patterns, landscape ecological
functioning and biodiversity as a means of achieving more sustainable landscapes.

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## 560 Figures

Figure 1. Theoretical values of the Intermediate Disturbance Complexity (IDC) model. Relationship between Shannon-Wiener Index (H') and Human Appropriation of Net Primary Production (HANPP). The model depicts the shape of all possible values adopted by the 'landscape complexity' and the 'landuse disturbance' wherever it is possible to represent the site-specific disturbance-complexity values of a given territory.



Figure 2. Empirical values of the Intermediate Disturbance Complexity model (IDC) (a). Relationship between Landscape Ecology metric (Le), Human Appropriation of Net Primary Production (HANPP) and total biodiversity (b) in UTM 10-km sample cells in Catalonia (2009). The empirical results seem to confirm the intermediate disturbance hypothesis that explains how anthropogenic control of energy fluxes and landscape structure affect the capacity of ecosystems to host biodiversity.



596Notes:  $^{1}$  IDC = Le (1- HANPP/100);  $^{2}$  Total biodiversity in Catalonia (including vascular plants, reptiles, amphibians, birds and mammals; the size597of the dot is proportional to the species richness) –the dispersion of values are mainly produced by birds.

Figure 3. Negative Binomial Regression (NBR) for the variables: vascular plant, amphibian, reptile, bird and mammal species richness, and total biodiversity; taking into account the Intermediate Disturbance Complexity model (IDC), and land covers of Catalonia in 2009 (UTM 10-km sample cells)<sup>1</sup>. The results show the synergetic contribution of 'natural' landscapes and agroforestry mosaics (heterogeneous landscapes with land uses of contrasting disturbances) to biodiversity conservation.



Note: <sup>1</sup> Principal Component Analysis in Table A1. \* Indicates a significant association of each factor with the response variable for the associated
 Chi-Square test at p<0.05.</li>

Figure 4. Exploratory Factor Analysis (EFA) applied to the variables: vascular plant, bird and mammal species richness, and total biodiversity; taking into account the variables Le, HANPP and IDC<sup>1</sup>, and the land covers of Catalonia in 2009 (UTM10-km sample cells). Landscapes dominated by forests but also landscape mosaics are relevant for biodiversity conservation.



Notes: <sup>1</sup> Landscape Ecology metric (Le), Human Appropriation of Net Primary Production (HANPP), and Intermediate Disturbance Complexity
 model (IDC).

Figure 5. Structural Equation Model (SEM) applied to the variables vascular plant, bird and mammal species richness, and total biodiversity taking into account the direct effects of Le and HANPP (the two components of IDC)<sup>1</sup>, as well as their indirect effects via land-cover composition (Cm)<sup>2</sup>, and controlling for elevation (MDE) of Catalonia in 2009 (UTM 10-km sample cells). The resulting 'virtuous triangle' between forest cover, HANPP and total biodiversity describes the complex human-nature relationship across landscape gradients of human transformation.



Notes: <sup>1</sup> Landscape Ecology metric (Le), Human Appropriation of Net Primary Production (HANPP) and Intermediate Disturbance Complexity
 model (IDC). <sup>2</sup> Principal Component Analysis in Table A1.

# 674 Appendices

675 Figure A1. Land-cover categories and landscape ecology metrics (H', ECI, Le, HANPP and IDC)<sup>1</sup> for



676 UTM 10-km cells in Catalonia (data from 2009).





Figure A2. Total species richness and species richness of the studied biodiversity groups (vascular plants,
amphibians, reptiles, birds and mammals) per UTM 10-km cells in Catalonia (data from 2009).

723 Source: Biodiversity Data Bank of Catalonia (BDBC; biodiver.bio.ub.es/biocat)

725 Table A1. Principal Component Analysis (PCA) applied in the Negative Binomial Regression (NBR; a –

a)	Variable	Factor1	Factor2
	IDC	0.318	0.077
	Forest	0.304	-0.164
	Cropland	-0.256	-0.042
	Scrubland	0.038	0.147
NDD	Pastureland	-0.028	0.407
NDK	River corridor / Wetland	-0.027	0.256
	Unproductive	-0.027	0.426
	Road and rail networks	-0.188	-0.114
	Urban areas	-0.162	-0.104
	Variance	34.8%	22.9%

Figure 3) and in the Structural Equation Model (SEM; b –Figure 5).

b)	Variable	Cm1	Cm2
	Forest	0.649	-0.395
	Cropland	-0.674	0.027
SEM	Grassland / Scrubland	0.180	0.816
	Urban/roads	-0.301	-0.422
	Variance	38.5%	31.2%

a)	Estir	nate	Std Error		Pr(> z )			
beta1	-0.1722		0.0576	2.76e-03		Total < MDE		
beta2	1.81	188	0.2768		4.98e-11	Total <	HANPP	
beta3	-0.2392		0.0937		1.07e-02	Total <	Le	
beta4	2.08	326	0.2610		1.46e-15	Total <	Cm1	
beta5	-0.6	051	0.1428		2.25e-05	Total <	Cm2	
beta8	0.09	995	0.0105		2.38e-21	HANPP <-	— MDE	
beta10	-0.1	997	0.0537		2.03e-04	Le <-> HA	ANPP	
beta11	-0.9	461	0.0776		3.51e-34	HANPP <-	-> Cm1	
beta12	0.46	517	0.0491		5.60e-21	Le <-> Cn	n1	
beta13	0.37	737	0.0322		3.95e-31		HANPP <-> Cm2	
beta14	0.69	941	0.0647	7.59e-27		Le <-> Cm2		
e1	0.77	738	0.0629	8.15e-35		Total <-> Total		
e2	1.00	598	0.0768	4.57e-44		HANPP <-> HANPP		
e3	1.00	000	0.0724	2.28e-43		Le <-> Le		
e4	1.00	000	0.0812	8.15e-35		MDE <->	MDE	
e5	1.00	000	0.0812	8.15e-35		$Cm1 \iff Cm1$		
e6	1.00	000	0.0812	8.15e-35		Cm2 <-> Cm2		
b)		MDE	Le	HANPP	Total	Cm1	Cm2	
	Total	0.00875	-2.39e-01	1.82	0	2.08	-0.605	
Total	HANPP	0.09951	-1.53e-17	0.00	0	0.00	0.000	
D'	Total	-0.1722	-0.239	1.82	0	2.08	-0.605	
Direct	HANPP	0.0995	0.000	0.00	0	0.00	0.000	
Indiraat	Total	0.181	-2.78e-17	0	0	0	0	
marrect	HANPP	0.000	-1.53e-17	0	0	0	0	

729 Table A2. Standardized coefficients (estimate; a –and for total, direct and indirect effects of each variable;

b), standard error and P-value for each path in the Structural Equation Model (SEM) for total biodiversity.

Table A3. Standardized coefficients (estimate; a –and for total, direct and indirect effects of each variable;

b), standard error and P-value for each path in the Structural Equation Model (SEM) for plants

736 bi	odiversity.
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a)	Estimate	Std Error	Pr(> z )	
beta1	-0.1503	0.0587	0.0104	Plants < MDE
beta2	1.5870	0.282	1.87e-08	Plants < HANPP
beta3	-0.1937	0.0956	0.0426	Plants < Le
beta4	1.8705	0.266	2.08e-12	Plants < Cm1
beta5	-0.4995	0.146	0.000602	Plants < Cm2
beta8	0.0995	0.0105	2.38e-21	HANPP < MDE
beta10	-0.1997	0.0537	0.000203	Le <> HANPP
beta11	-0.9461	0.0776	3.51e-34	HANPP <> Cm1
beta12	0.4617	0.0491	5.6e-21	Le <> Cm1
beta13	0.3737	0.0322	3.95e-31	HANPP <> Cm2
beta14	0.6941	0.0647	7.59e-27	Le <> Cm2
e1	0.8046	0.0654	8.15e-35	Plants <> Plants
e2	1.0698	0.0768	4.57e-44	HANPP <> HANPP
e3	1.0000	0.0724	2.28e-43	Le <> Le
e4	1.0000	0.0812	8.15e-35	MDE <> MDE
e5	1.0000	0.0812	8.15e-35	Cm1 <> Cm1
e6	1.0000	0.0812	8.15e-35	Cm2 <> Cm2

1.0000			0.0012		0.150 55			
b)		MDE	Le	HANPP	Total	Cm1	Cm2	
Total	Plants	0.00765	-0.194	1.59	0	1.87e+00	-0.5	
Total	HANPP	0.09951	0.000	0.00	0	1.40e-16	0.000	
Dimont	Plants	-0.1503	-0.194	1.59	0	1.87	-0.5	
Direct	HANPP	0.0995	0.000	0.00	0	0.00	0.000	
Indirect	Plants	0.158	0	0	0	2.22e-16	0	
	HANPP	0.000	0	0	0	1.40e-16	0	

740 Table A4. Standardized coefficients (estimate; a –and for total, direct and indirect effects of each variable;

b), standard error and P-value for each path in the Structural Equation Model (SEM) for mammals

biodiversity.

a)	Estimate	Std Error	Pr(> z )	
beta1	0.1570	0.0542	0.00381	Mammals < MDE
beta2	1.2380	0.261	2.08e-06	Mammals < HANPP
beta3	-0.2532	0.0883	0.00415	Mammals < Le
beta4	1.5115	0.246	8.01e-10	Mammals < Cm1
beta5	-0.5762	0.135	1.86e-05	Mammals < Cm2
beta8	0.0995	0.0105	2.38e-21	HANPP < MDE
beta10	-0.1997	0.0537	0.000203	Le <> HANPP
beta11	-0.9461	0.0776	3.51e-34	HANPP <> Cm1
beta12	0.4617	0.0491	5.6e-21	Le <> Cm1
beta13	0.3737	0.0322	3.95e-31	HANPP <> Cm2
beta14	0.6941	0.0647	7.59e-27	Le <> Cm2
e1	0.6875	0.0559	8.15e-35	Mammals <> Mammals
e2	1.0698	0.0768	4.57e-44	HANPP <> HANPP
e3	1.0000	0.0724	2.28e-43	Le <> Le
e4	1.0000	0.0812	8.15e-35	MDE <> MDE
e5	1.0000	0.0812	8.15e-35	Cm1 <> Cm1
e6	1.0000	0.0812	8.15e-35	Cm2 <> Cm2

743

b)		MDE	Le	HANPP	Total	Cm1	Cm2
Total	Mammals	0.2802	-0.253	1.24	0	1.51	-0.576
	HANPP	0.0995	0.000	0.00	0	0.00	0.000
Direct	Mammals	0.1570	-0.253	1.24	0	1.51	-0.576
	HANPP	0.0995	0.000	0.00	0	0.00	0.000
Indirect	Mammals	1.23e-01	0	0	0	0	0
	HANPP	1.39e-17	0	0	0	0	0

a)	Estimate	Std Error	Pr(> z )	
beta1	-0.232	0.0542	1.77e-05	Birds < MDE
beta2	2.12	0.26	3.94e-16	Birds < HANPP
beta3	-0.289	0.0882	0.00106	Birds < Le
beta4	1.95	0.246	2.02e-15	Birds < Cm1
beta5	-0.837	0.134	4.57e-10	Birds < Cm2
beta8	0.0995	0.0105	2.38e-21	HANPP < MDE
beta10	-0.2	0.0537	0.000203	Le <> HANPP
beta11	-0.946	0.0776	3.51e-34	HANPP <> Cm1
beta12	0.462	0.0491	5.6e-21	Le <> Cm1
beta13	0.374	0.0322	3.95e-31	HANPP <> Cm2
beta14	0.694	0.0647	7.59e-27	Le <> Cm2
e1	0.685	0.0557	8.15e-35	Birds <> Birds
e2	1.07	0.0768	4.57e-44	HANPP <> HANPP
e3	1	0.0724	2.28e-43	Le <> Le
e4	1	0.0812	8.15e-35	MDE <> MDE
e5	1	0.0812	8.15e-35	Cm1 <> Cm1
e6	1	0.0812	8.15e-35	Cm2 <> Cm2

746	Table A5. Standardized coefficients	(estimate; aand for total,	, direct and indirect effects of each variable
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b), standard error and P-value for each path in the Structural Equation Model (SEM) for birds biodiversity.

b)		MDE	Le	HANPP	Total	Cm1	Cm2
<b>T</b> ( 1	Birds	-0.0215	-0.289	2.12	0	1.95	-0.837
Total	HANPP	0.0995	0.000	0.00	0	0.00	0.000
Dimot	Birds	-0.2325	-0.289	2.12	0	1.95	-0.837
Direct	HANPP	0.0995	0.000	0.00	0	0.00	0.000
Indirect	Birds	0.211	0	0	0	0	0
	HANPP	0.000	0	0	0	0	0

750