

Global and regional health and food security under strict conservation scenarios.

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Abstract

Global biodiversity is rapidly declining and goals to halt biodiversity loss, such as the Aichi Biodiversity Targets, have not been achieved. To avoid further biodiversity loss area based protection will form part of new biodiversity targets. We use a state of the art global land use model, LandSyMM, to explore global and regional human health and food security outcomes under strictly enforced 30% and 50% land protection scenarios. We find protection scenarios cause additional human mortality due to diet and weight related changes. Low income regions such as South Asia and Sub-Saharan Africa experience the highest levels of underweight-related mortality, causing an additional 200,000 deaths related to malnutrition in these regions alone. High income regions in contrast are less affected by protection measures. Our results highlight that radical measures to protect areas of biodiversity value may jeopardise food security and human health in the most vulnerable regions of the world.

37 Background

38 The Convention on Biological Diversity committed to halting biodiversity loss ¹, however
39 international agreements, such as the Strategic Plan for Biodiversity 2011–2020 and the associated
40 Aichi Biodiversity Targets, have been mostly unachieved ^{2,3}. In response to previous shortcomings
41 and to avoid further species extinctions, high-level area-based targets form an integral part of the
42 post-2020 Global Biodiversity Framework discussions ⁴. However, conservation measures will need
43 to be scrutinized to ensure their implementation does not compromise other Sustainable
44 Development Goals. In particular, global area based targets will require extending protected areas
45 and restoring natural land ^{5–7}. If this expansion restricts agriculture then the consequences may be
46 felt in food production sectors with reduced food provisioning potentially compromising food
47 security goals and human health, particularly in vulnerable regions ⁸. The impacts of strict area-
48 based conservation measures on food security and health however remain poorly understood ^{8,9}.
49 Furthermore, studies of human and biodiversity interactions have been typically conducted at global
50 scales, despite calls to ensure regional variations are considered ^{10,11}. Given existing food security
51 inequalities, it is important to consider the impacts of conservation measures on human health and
52 nutrition in a spatially explicit manner ¹².

53 Here we use a state-of the art integrated assessment modelling framework of the land sector,
54 LandSyMM ¹³, to address such gaps. LandSyMM combines spatially-explicit biophysically-derived
55 yield responses and land constraints, such as protected areas, with socio-economic scenario data to
56 project future land use and management inputs and demand for, and trade of, agricultural
57 commodities. We identify priority areas that contribute the most to species extinction prevention
58 using an optimization approach and for this study make the assumption that by 2040, 30% and 50%
59 of the earth's terrestrial surface is strictly protected from human use. Results from the protection
60 scenarios are compared with reference outcomes parameterised to align with the 'Middle of the
61 Road' Shared Socio-economic Pathways scenario, SSP2; under SSP2 future socioeconomic trends
62 largely follow historical patterns. Following the methodology of Springmann^{14,15}, we investigate the
63 human health and food security consequences of stringent protection by calculating the number of
64 additional deaths due to changes in dietary and weight-related risk factors compared to the
65 reference scenario.

66 There is a gradation of views as to the role agriculture can play within conservation areas, for
67 example, in the global safety net (GSN) proposed by Dinerstein *et al.* ¹⁶, the proposed protected
68 areas are allocated depending upon remaining 'intact' land and species rich areas. The Three
69 Conditions framework proposes an expansion of protected areas that are supported by sustainable
70 resource extraction¹⁷. Waldron *et al.*¹⁸ explore a range of scenarios where human activities are
71 excluded from protected areas or permitted at sustainable levels, while Strassburg *et al.* ¹⁹ identify
72 agricultural lands with the greatest biodiversity potential globally if restored to their natural state
73 ^{20,21}. Recently, the Intergovernmental Science-Policy Platform on Biodiversity and Ecosystem Services
74 (IPBES) have developed the Nature Futures Framework (NFF). This framework aims to provide a
75 structure for designing normative scenarios that investigate relationships between people and
76 nature ¹². Our stylised protection scenarios can be considered an extreme form of the 'Nature for
77 Nature' aspect of the NFF, characterised as strict protection that separates nature from human
78 pressures, and thus do not directly represent any existing proposals. The potential pitfalls associated
79 with strict area-based conservation are frequently discussed^{22,23}, however few studies have tested
80 hypotheses on the consequences of extended strict protection for human well-being. Here, we do
81 not advocate for strict protection measures but rather quantify some of the impacts that such
82 extreme potential management actions could entail.

84 **Results**

85

86 Between 2020 and 2040 in the 30% and 50% protection scenarios, biodiversity protection is
 87 gradually implemented across the terrestrial land surface such that by 2040, 30% and 50% of the
 88 Earth is assumed to be under stringent protection (Supplementary Figure 2). Such extreme levels of
 89 protection and human exclusion have repercussions in the modelled results for food production. In
 90 the 50% protection scenario 55% of protected areas lie within the subtropical belt and in the 30%
 91 protection scenario 63% lie within the subtropical belt (Supplementary Figure 2). Consequently,
 92 agricultural land is shifted away from optimal growing areas in these regions and into higher
 93 latitudes, particularly in the 50% protection scenario (Supplementary Figure 4). This has the effect of
 94 reducing food supply while demand continues to increase with population growth. When demand
 95 exceeds supply, food prices increase, which reduces food consumption. This has positive health
 96 effects through the reduction of obesity and red meat consumption but negative health effects
 97 through increasing levels of undernutrition and reduced fruit and vegetable consumption. Implicitly,
 98 reducing levels of obesity reduces the risk of cancer, stroke and coronary heart disease and
 99 especially diabetes while reducing red meat consumption is particularly important for reducing the
 100 risk of colorectal cancers (Supplementary Table 2). Conversely, reducing fruit and vegetable
 101 consumption increases the risk of cancer, stroke and coronary heart disease while being
 102 underweight increases the risk of cancer and death due to other causes (Supplementary Table 2).

103 **Strict land protection has disparate regional health impacts**

	Number of additional deaths (thousands) in 2060 due to changes in diet and weight-related risk factors						
	Total	↓ fruit consumption	↓ vegetable consumption	↑ red meat consumption	↓ underweight	↑ overweight	↑ obesity
Number of additional deaths (thousands) in 2060 due to changes in diet and weight-related risk factors							
Reference	4905	251	1648	2340	-1744	320	1815
30% protection	5122	419	1857	2248	-1657	298	1670
50% protection	5106	549	2041	2043	-1508	261	1426
Number of additional deaths (thousands) in 2060 due to land protection							
50% protection	201 (+/- 59)	298 (+/- 28)	393 (+/- 35)	-297 (+/- 11)	236 (+/- 10)	-59 (+/- 2)	-389 (+/- 16)
30% protection	218 (+/- 47)	168 (+/- 20)	209 (+/- 25)	-93 (+/- 4)	87 (+/- 4)	-22 (+/- 1)	-145 (+/- 6)

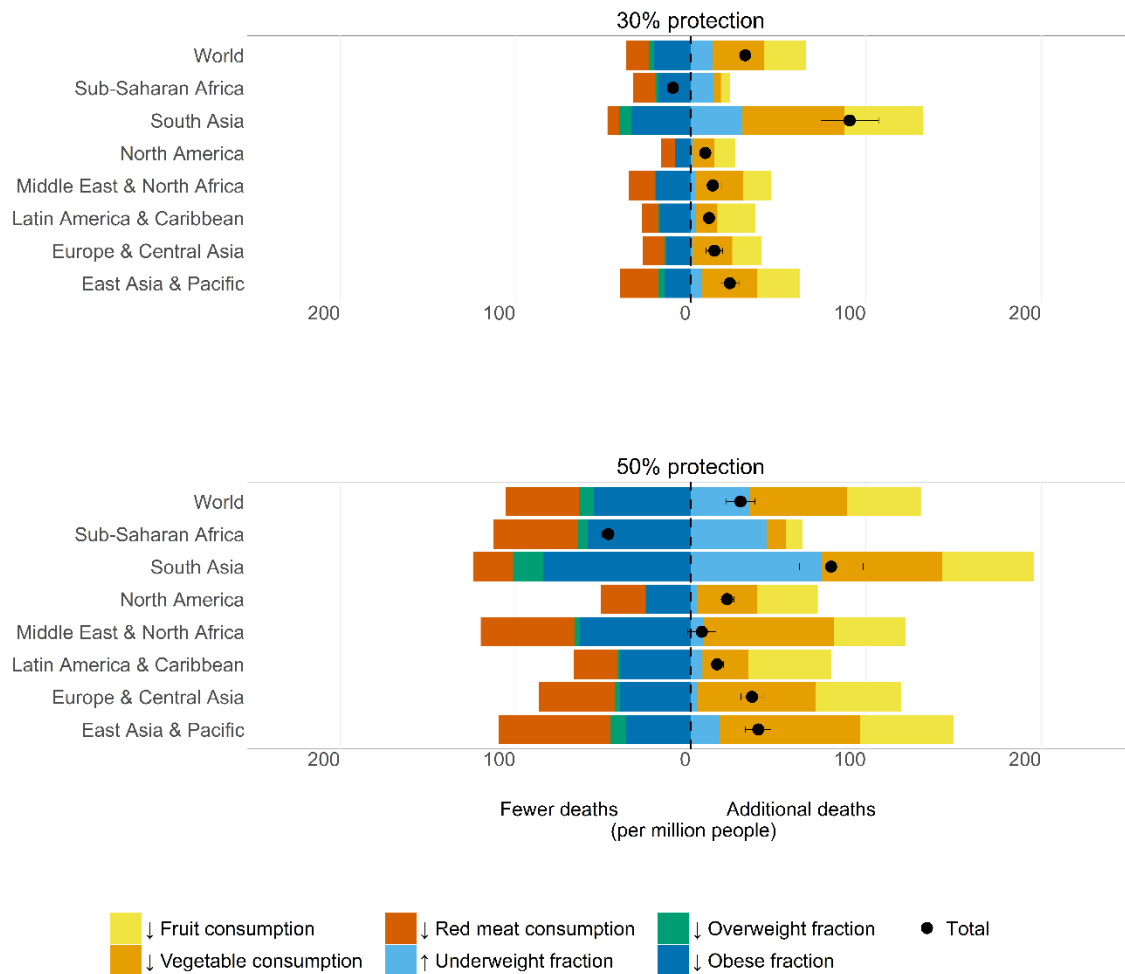
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105 *Table 1: Upper section: Average absolute number of additional global deaths in 2060 in the*
 106 *Reference, 30% and 50% scenarios, using 2019 diets and weight levels as a baseline for comparison.*
 107 *Lower section: Additional global deaths in 2060 due to strict protection. We calculate the difference*
 108 *between the number of additional deaths in the Reference scenario and the protection scenarios in a*
 109 *pairwise manner. Equivalent model runs are paired and the mean and 95% confidence intervals of*
 110 *the differences calculated. The 95% confidence intervals are displayed in brackets and negative*
 111 *values represent fewer deaths. The sum of the individual risk factors for a region can be lower than*

112 *the total deaths as individual risks can be attenuated and/or compensated when combined with*
113 *other risk factors.*

114 Compared to 2019, in all three scenarios, there are additional diet and weight related deaths driven
115 by increased levels of obesity, increased red meat consumption and reduced fruit and vegetable
116 consumption (Table 1, upper section). However, compared to the Reference scenario, the protection
117 scenarios increase global mortality by further reducing fruit and vegetable consumption and
118 maintaining higher levels of underweight related mortality (Table 1, lower section). In 2060, 30% and
119 50% land protection increases total global mortality by 4%, equivalent to an additional 31 and 28
120 deaths per million people, respectively (Figure 1). The additional diet and weight related mortality in
121 the protection scenarios is caused by increased food prices relative to the Reference scenario (Figure
122 3). The net additional mortality is similar in the protection scenarios, despite higher prices in the 50%
123 scenario, because of non-linear dynamics in the demand system. Both fruit and vegetable
124 consumption and red meat consumption respond to prices in a non-linear fashion, such that there is
125 a minimum subsistence amount of fruit and vegetable or red meat eaten, regardless of price. Thus
126 once this threshold is reached consumption of fruit and vegetables cannot decrease further and
127 there are no additional deaths. Thus in the 50% scenario the increase in deaths from reduced fruit
128 and vegetables has proportionally decreased because consumption has reached minimum
129 thresholds in some countries. Meanwhile meat intake does not reach the minimum thresholds and is
130 at a price point in the 50% scenario where consumption is greatly reduced compared to the
131 Reference scenario. Here we find the avoided mortality from reduced red meat consumption to
132 increase proportionally. The proportional changes in fruit, vegetable and red meat consumption
133 shifts the balance between additional and avoided deaths in the 50% scenario such that 81% of
134 additional mortality is offset by avoided mortality compared to only 56% in the 30% scenario.

135



137

138 *Figure 1: The health effects of protection measures in 2060. The results here show the difference in*
 139 *deaths in 2060 between the (a) 30% and (b) 50% protection and the reference scenarios. The number*
 140 *of additional or fewer deaths per million people for each world region are shown. Colours represent*
 141 *the different risk factors. Points represent the mean total change in deaths, and error bars show the*
 142 *95% confidence intervals (n=30). The sum of the individual risk factors for a region can be lower than*
 143 *the total change in deaths as individual risks can be attenuated and/or compensated when combined*
 144 *with other risk factors.*

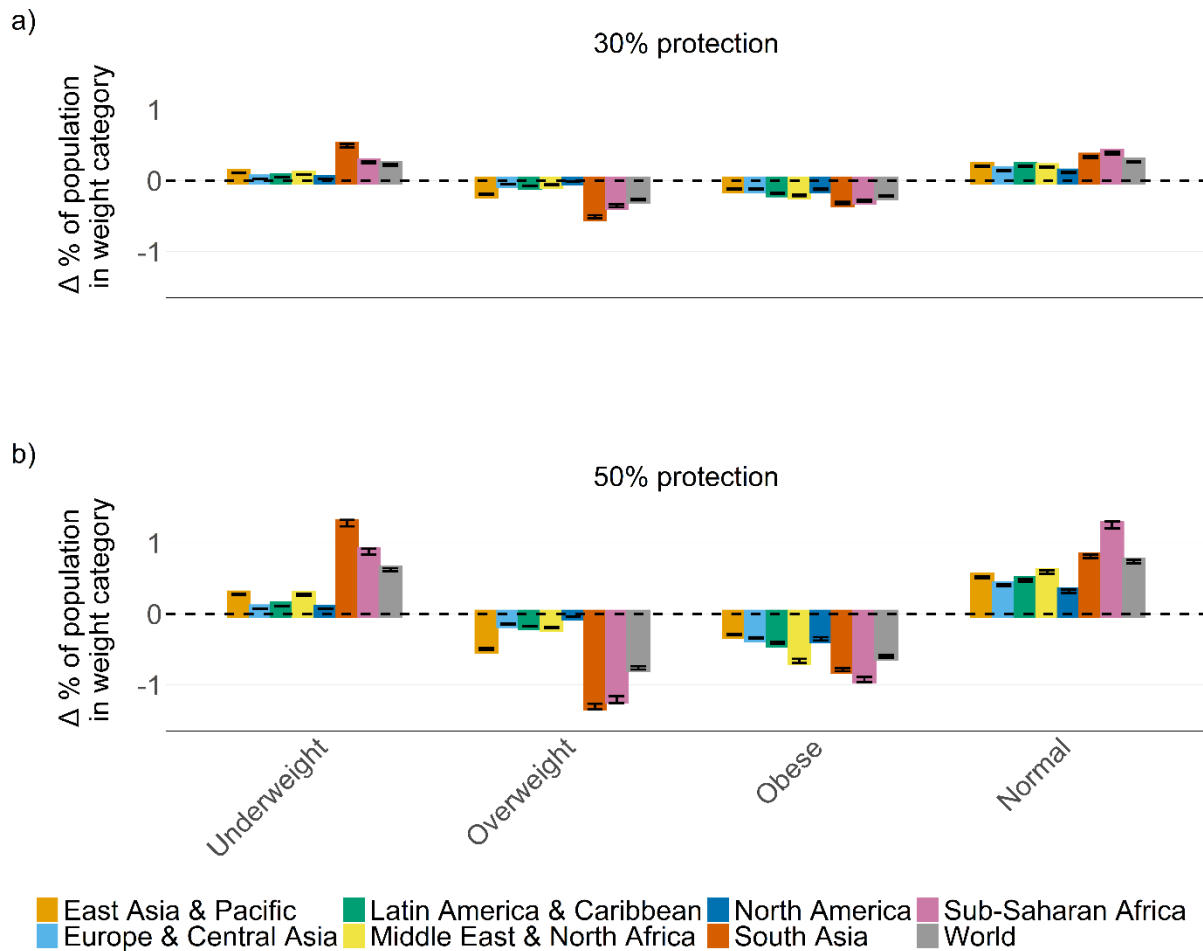
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146 The protection scenarios reduce fruit, vegetable and red meat consumption compared to the
 147 Reference scenario (Supplementary Table 5, Supplementary Figure 5, Supplementary Figure 6). In
 148 both scenarios this results in a net increase in mortality, compared to the Reference scenario, from
 149 dietary causes (Table 1, lower section). While the net global and regional effects of 30% and 50%
 150 protection are similar, changes in dietary risk exposure and associated mortality are much larger in
 151 the 50% scenario compared to the 30% scenario (compare width of bars in (a) and (b) of Figure 1).
 152 Reduced fruit and vegetable consumption increases deaths globally by 377,000 in the 30%
 153 protection scenario and by 691,000 in the 50% protection scenario (Table 1). Reduced red meat
 154 consumption reduces global mortality by 93,000 in the 30% protection scenario and by 297,000 in
 155 the 50% protection scenario. Therefore in both scenarios the benefits of lower red meat
 156 consumption are overwhelmed by the negative consequences of decreased fruit and vegetable
 157 consumption.

158 Likewise, differences in weight risk exposure are much larger in the 50% scenario compared to the
159 30% scenario. At a global level, the protection scenarios reduce average BMI such that there are
160 167,000 and 448,000 fewer obesity and overweight related deaths in the 30% and 50% scenarios
161 respectively (Table 1). However, reducing BMI also increases the number of underweight related
162 deaths by 87,000 in the 30% scenario and by 236,000 in the 50% scenario compared to the
163 Reference scenario. Thus, the increase from 30% protection to 50% protection almost triples the
164 additional underweight related mortality in 2060.

165 There are clear differences in the rate of underweight-related deaths between developing and
166 developed countries. South Asia and Sub-Saharan Africa have the largest additional underweight-
167 related deaths in 2060 compared to the Reference scenario in both the 30% and 50% protection
168 scenarios. In the 50% protection scenario, South Asia and Sub-Saharan Africa have an average of 75
169 and 44 additional underweight related deaths per million people, equivalent to 196,000 additional
170 deaths in absolute terms (Figure 1, light blue bars). Thus additional underweight related deaths in
171 these regions account for 83% of all global additional underweight related deaths. In contrast,
172 developed regions such as North America and Europe and Central Asia have the lowest additional
173 underweight-related deaths in 2060 compared to the Reference scenario, both with a rate of 3
174 additional deaths per million people, equivalent to 3717 additional deaths in absolute terms (Figure
175 1, light blue bars). In 2019, South Asia and Sub-Saharan Africa are the regions with the lowest calorie
176 consumption and subsequently the highest underweight population fractions, 22% and 16%
177 respectively (Supplementary Table S6). In the Reference scenario by 2060, calorie intake in these
178 regions increases and the underweight population fraction decreases from 22% to 13% in South Asia
179 and from 16% to 7% in Sub-Saharan Africa (Supplementary Table S6). The protection scenarios stall
180 this decrease, however, and by 2060, the underweight population fraction in the 50% protection
181 scenario is 14% in South Asia and 8% in Sub-Saharan Africa (Supplementary Table S6). For both
182 regions this is a difference of 1 percentage point between the 50% protection scenario and the
183 Reference scenario (Figure 2).

184



185

186

187 *Figure 2: Difference in the percentage points of each regional population in the four BMI weight*
 188 *categories between the Reference scenario and (a) 30% and (b) 50% protection scenarios in 2060. Y*
 189 *axis values not equal to zero indicate changes as a result of the protection scenarios. Columns*
 190 *represent the mean with 95% confidence intervals error bars (n=30). Regional values are a weighted*
 191 *average using country population sizes as the weighting within the region.*

192 The number of underweight related deaths in South Asia explains why the difference between total
 193 mortality in the Reference scenario and the 50% scenario is greatest in South Asia, with 80 additional
 194 deaths per million people, more than double the global average. Moreover, the difference in fruit
 195 and vegetable consumption between the Reference and 50% protection scenario are greatest in
 196 South Asia (Supplementary Figure 6) and thus mortality owing to lower consumption of fruit and
 197 vegetables increases relative to the Reference scenario. This combination of additional underweight
 198 related deaths and additional deaths owing to lower fruit and vegetable consumption acts to
 199 increase the net number of additional deaths in South Asia relative to other regions.

200 Sub-Saharan Africa is the only region where land protection results in fewer deaths compared to the
 201 Reference scenario. In the 30% protection scenario, 10 fewer deaths occur per million people and in
 202 the 50% protection scenario, 49 fewer deaths occur per million people. Unlike other regions, the
 203 consumption of fruit and vegetables does not drop substantially in Sub-Saharan Africa compared to
 204 the Reference scenario, thus there are fewer deaths related to reduced fruit and vegetable
 205 consumption (Figure 1). The difference in fruit and vegetable consumption between the protection

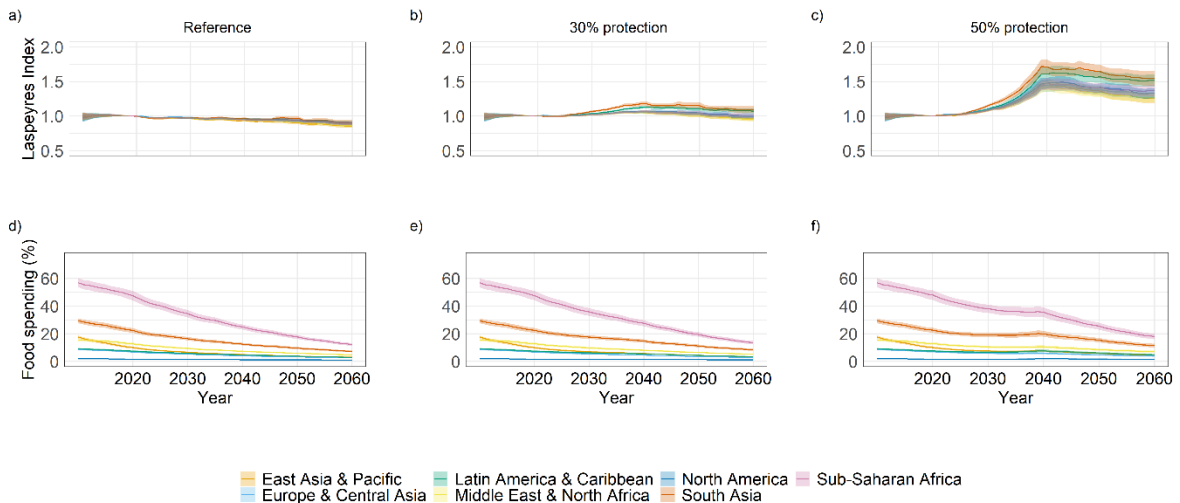
206 scenarios and the Reference scenario in Sub-Saharan Africa is smaller than other regions because of
207 the dynamics in cross-price elasticities in food demand. Sub-Saharan Africa has the lowest income
208 levels and experiences the greatest increase in the price of ruminant products compared to other
209 regions. Consequently, in the protection scenarios, Sub-Saharan Africa experiences the greatest
210 decline in ruminant product consumption compared to the Reference scenario (Supplementary
211 Figure 6). Plant based foods are substituted for the meat products that are not consumed and, in
212 particular, fruit and vegetables are a common substitute. Therefore, in Sub-Saharan Africa, as land
213 protection reduces the consumption of ruminant products, levels of fruit and vegetable
214 consumption are maintained and as such, the difference in fruit and vegetable consumption
215 between the protection and Reference scenario is smaller for this region. While land protection may
216 seem beneficial for Sub-Saharan Africa in terms of net mortality, Sub-Saharan Africa still experiences
217 high numbers of additional underweight related deaths. Ultimately, net mortality falls in Sub-
218 Saharan Africa because populations cannot afford more expensive, unhealthy meat-rich diets, this
219 also causes greater underweight related mortality due to reduced food supply because of protection
220 measures.

221

222 ***Strict land protection increases food prices and spending***

223 Changing dietary consumption levels and weight changes in the protection scenarios are caused by
224 increased food prices relative to the Reference scenario. Furthermore, the greater health impacts in
225 the 50% scenario compared to the 30% scenario are driven by greater food price changes in the 50%
226 protection scenario (Figure 3). Higher food prices in the protection scenarios also increase spending
227 on food relative to the Reference scenario.

228 During 2020 to 2040, agricultural land is converted back to natural land; this reduces food
229 production, and when demand outstrips supply, food prices increase. In the Reference scenario
230 between 2020 and 2060 food prices decrease due to continued globalisation, climate change and
231 improving production efficiency. With a decline in food prices, the Laspeyres price index falls for all
232 regions (Figure 3). Between 2020 and 2040 in the protection scenarios, the food price index
233 increases, for most regions reaches a peak in 2040. After the implementation period, post 2040, as
234 supply and demand begin to settle and food prices start to stabilise the price index begins to drop,
235 albeit at a slower rate than the rate of increase earlier in the time period (Figure 3). Despite the price
236 index increase, North American and European expenditure on food remains low (Figure 3), which
237 indicates that developed countries are buffered by price increases due to their high GDP. In contrast,
238 Sub-Saharan Africa is still vulnerable to even small increases in food prices, as their proportional
239 expenditure on food is the greatest. Indeed, the greatest regional spending difference between the
240 Reference scenario and the protection scenarios is in Sub-Saharan Africa. For example, in Sub-
241 Saharan Africa, by 2060, in the 50% scenario the percent of GDP spent on meeting food demand is
242 18%, compared to 12% in the Reference scenario.



243

244 *Figure 3: Laspeyres food price index (a,b,c) over time for different world regions in the three*
 245 *scenarios. Food spending as a percent of GDP (d,e,f) over time for different world regions in the three*
 246 *scenarios. The regional index and expenditure are calculated by taking a weighted average of the*
 247 *country specific price index and expenditure in a region according to country population size. The*
 248 *median and standard deviations are shown (n=30).*

249

250 Discussion

251

252 Increasing strict land protection for biodiversity causes global and regional food prices to increase,
 253 which in turn affects food security and human health. Increased food prices reduces calorie intake
 254 and the consumption of luxury food commodities, such as red meat, fruit and vegetables. Changing
 255 calorie and dietary intake has some positive health effects through the reduction of obesity and red
 256 meat consumption related deaths. However, the positive effects are outweighed across almost all
 257 world regions by increasing mortality due to increasing underweight population fractions and
 258 reduced fruit and vegetable consumption. The 50% land protection scenario results in greater levels
 259 of agricultural land resettlement and higher food prices than the 30% protection scenario. Despite
 260 this, the additional net global and regional mortality compared to the Reference scenario is similar
 261 within the two scenarios, with an additional 5.1 million deaths in 2060 alone.

262 Considering mortality associated with individual risk factors, rather than net mortality, is however
 263 particularly important when considering the trade-offs associated with land protection. When each
 264 of the risk factors in our analysis are considered individually, the impact of the 50% scenario is
 265 greater than the 30% scenario for all. For example, we find the levels of undernourishment are much
 266 greater as the proportion of land protection increases, with the increase from 30% to 50%
 267 protection causing an additional 149,000 underweight related deaths and almost tripling
 268 underweight related additional mortality in 2060. Similarly, the extent of protection has
 269 repercussions for spending. While both protection scenarios slow the reduction of GDP expenditure
 270 on food compared to the Reference scenario, all regions experience greater food spending in the
 271 50% protection scenario compared to the 30% protection scenario. Thus, our results serve to

272 highlight that area-based protection strategies will need to dissect the positive and negative
273 repercussions for food security and health for every additional hectare of strict protection.

274 We find developed world regions are largely insulated from the negative effects of stringent area-
275 based protection, and arguably reducing calorie consumption and levels of obesity is a desirable
276 outcome; conversely, developing regions are worst affected by reduced food provisioning in terms
277 of undernourishment. Sub-Saharan African countries currently have the highest fraction of
278 undernourishment at a population level while countries in Asia, such as Pakistan and India, are
279 among those with the highest absolute number of undernourished people on the planet ²⁴. In all of
280 three scenarios, calorie intake increases and underweight related deaths decrease over time.
281 However, land protection lessens the reduction of underweight related deaths, such that in the 50%
282 protection scenario there are an additional 236,000 deaths compared to the Reference scenario,
283 with Sub-Saharan Africa and South Asia accounting for 83% of this additional mortality. In both the
284 30% and 50% scenarios, underweight related deaths per capita are highest in Sub-Saharan Africa and
285 South Asia. Land protection therefore creates higher levels of undernourishment in regions that are
286 already vulnerable. In a recent modelling study of area based conservation, Kok *et al.* ⁹ found food
287 security risks as a result of protection measures were most prevalent in Sub-Saharan Africa and
288 South Asia. Similarly, in our results we find that Sub-Saharan Africa and South Asia have the greatest
289 proportion of food spending as a percent of GDP in 2019 and the impact of land protection on food
290 spending is greatest in Sub-Saharan Africa. Our results therefore corroborate existing work that finds
291 that food security and health impacts of strict area-based biodiversity measures are likely to be
292 greatest in some of the most vulnerable societies of the world ^{8,9,25}.

293 Despite a large number of underweight deaths, land protection results in net fewer deaths in Sub-
294 Saharan Africa. While in our analysis reducing red meat is beneficial for reducing deaths from
295 coronary heart disease, cancer and stroke, it is important to consider that, particularly for regions
296 such as Sub-Saharan Africa and South Asia, access to sufficient protein is often limited. In developed
297 regions such as North America, meat protein can be replaced by other sources because adequate
298 food provisioning is in place. However, for the developing world the benefits from reduced rates of
299 non-communicable disease due to reduced red meat consumption may, in reality, be outweighed by
300 the consequences of lack of sufficient dietary protein if meat is not easily substitutable. Given the
301 higher levels of food insecurity and underweight population fractions, we highlight that future work,
302 that includes deaths caused by insufficient substitution of dietary protein, may find additional deaths
303 in developing regions.

304 For the purpose of this study, we assume that the protection of 30% and 50% of the terrestrial land
305 surface is stringent and agriculture is displaced from these areas. Given the current debate and
306 uncertainty about the form that protected areas should take, our approach is clear, unambiguous
307 but sits at the extreme end of a continuum within existing literature ^{4,16,18,26}. By exploring the strictest
308 form of protection, we are nevertheless able to explore the worst-case scenario, in terms of human
309 health. Given how extreme our assumptions are, arguably, there is a surprisingly small number of
310 additional deaths. However, in many food insecure regions like Sub-Saharan Africa, agriculture is the
311 main source of income for households. Economic and physical displacement of agricultural practices
312 could further jeopardise nutrition ²⁷ through reduced incomes and economies that we have not
313 captured here. Conversely, relaxing the assumption of agricultural exclusion would likely reduce the
314 detrimental effects that we, and others, find. The expansion of multi-use protected areas could in
315 fact be beneficial for human health and well-being ²⁸; a recent analysis of protected areas and human
316 well-being found households near multi-use protected areas with tourism experienced higher levels
317 of wealth and lower likelihoods of poverty ²⁹. Similarly, a recent modelling exercise reported that

318 protected areas expansion was economically beneficial through the mitigation of climate change risk
319 and biodiversity loss¹⁸.

320 The specific form of protection sought by area-based conservation is often unclear. Effective
321 conservation will likely be determined by socio-economic, e.g. bottom-up involvement of
322 stakeholders and land owners in planning, political and legal factors, such as country specific laws on
323 agricultural practice within protected areas. In this regard future work could explore the
324 consequences of protected area expansion if new protected areas reflected existing legislation and
325 practice or if some low-impact agricultural activities are allowed to continue. Regardless of the
326 agricultural assumptions made, global conservation prioritization methods that primarily focus on
327 biogeography, such as the approach employed here, or degree of wilderness will commonly select
328 regions in the tropics and indigenous lands³⁰. Given that we followed a strict interpretation of the
329 'nature for nature' aspect of the NFF, our prioritisation maps are accordingly based on avoiding
330 species extinctions, rather than avoiding human displacement. There are a myriad of ways land for
331 the spatial planning of protected areas could be allocated, however, as evident by recent
332 debates^{16,27,30}, the impact and role of local communities, indigenous populations and rural
333 livelihoods will need to be explicitly considered to avoid further marginalisation of vulnerable
334 populations^{16,25,27,30}. Alternative prioritisation could be based on selecting regions with the greatest
335 human and biodiversity co-benefits or the land most likely to be spared if yield gaps were closed. We
336 include yield increases due to climate change and a technology change factor, but we do not
337 explicitly test the assumption that yield gaps can be closed. If we assumed yield gaps closed then
338 biodiversity benefits, similar to those found in existing studies¹⁹, may be achieved without
339 compromising food security and health.

340 It is clear is that the implementation and form of protected areas is a multifaceted challenge and will
341 continue to be the subject of much contention and debate³¹. We stress that we do not here propose
342 any type of conservation measures that will provide the optimal outcomes for meeting various
343 SDG's. Rather our analysis can provide insight into trade-offs and upper potential impacts on global
344 health of strict protection, thereby aiding conservation planning and negotiations involving the post-
345 2020 Global Biodiversity Framework. We make the assumption that 'Nature for Nature' takes
346 precedence, at the expense of agriculture activities, but this should not be taken to imply our
347 support or advocacy for such an approach, as the design and implementation of biodiversity
348 conservation plans at sub-national scale requires deeper considerations of local circumstances as
349 outlined in IUCN Protected Area guidelines. Nevertheless, our analysis serves to further quantify that
350 radical measures will lead to undesirable and unequal health and food security outcomes if
351 implemented globally. The results from this work emphasise the need to evaluate human health and
352 food security outcomes associated with area-based conservation, particularly in food insecure
353 regions of the world.

354 **Methods**

355 **LandSyMM framework**

356 The Land System Modular Model (LandSyMM)¹³, is a state of the art global land use model that
357 couples a dynamic global vegetation model (LPJ-GUESS) with a food and land system model (PLUM).
358 LandSyMM combines spatially-explicit, biophysically-derived yield responses with socio-economic
359 scenario data to project future demand, land use, and management inputs. LandSyMM improves
360 upon existing integrated assessment models (IAMs) by modelling crop yield responses in a more
361 detailed manner at a finer grain. Furthermore LandSyMM calculates commodity demand

362 endogenously and therefore unlike the majority of land use models, demand for commodities
363 responds dynamically to changing commodity prices. A more detailed description of LandSyMM can
364 be found in the SI material.

365 **Scenarios**

366 *30% and 50% protection scenarios*

367 The grid cell fractions designated as protected under the 30% and 50% protection scenarios are
368 determined by a spatial conservation prioritisation approach³². We use vertebrate distribution data
369 (at ~0.5° resolution) of all birds, mammals, amphibians and reptile species^{33,34}. We calculate for each
370 species the amount of area necessary for a species to qualify for a non-threatened status, thus
371 avoiding extinction^{32,35}. We then set incremental budgets of available land area (10, 20, 30, 40, and
372 50% of the global land surface area) and minimize for each species globally the shortfall in reaching
373 those targets, hierarchically locking in proportions of selected grid cells from lower budgets and
374 encompassing the existing World Database of Protected Areas (Stand April 2019). To account for
375 intraspecific variation and to coarsely represent ecological and genetic diversity of a species, we
376 subdivide each species' range into multiple conservation features using data on the distribution of
377 terrestrial biomes⁶. By splitting a species range into several separate features, we thus place greater
378 emphasis on the importance of subpopulation covering multiple biomes, which might be locally
379 important, which resulted in shifting some importance away from tropical biomes which have
380 usually the highest conservation value. Further details on the prioritization approach can be found in
381 Jung et al.³² however we highlight that we – differing from Jung et al. - assume that strict protection
382 is to be implemented in those priority areas. All optimizations are solved using the Gurobi
383 optimization software (ver. 8.1)³⁶ in an integer linear planning approach with the prioritizr package
384³⁷. To create the protection scenarios we here take the priority areas that cover 30% and 50% of the
385 global land surface respectively. Our analysis does not include a count of the number of people
386 affected by economic or physical displacement of protected areas because our analysis is at the
387 scale of individual grid cells for future scenarios up to 2060 for which – to our knowledge - there
388 does not exist any estimates on projected human population numbers at sufficient resolution.

389 The socio-economic and climate settings for the protection scenarios are the same as those for the
390 Reference scenario, detailed below. However, in the protection scenarios we assume that by 2040
391 30% and 50% of the terrestrial land surface is stringently protected from agricultural use. Our
392 scenarios are therefore situated at the extreme end of conservation implementations, strictly
393 adhering to the 'Nature for Nature' aspect of the Nature's Future Framework, characterising a form
394 of conservation that separates nature from human pressures. Between 2020 – 2040 the protection
395 regimes are gradually implemented. In a grid cell with sufficient natural land available to protect, the
396 fraction of natural land requiring protection becomes immediately protected in 2020. However, in
397 grid cells where the fraction of natural land is less than the fraction of protected area required,
398 existing cropland or pasture are gradually removed such that by 2040 the fraction of natural land in
399 a cell is equal to the fraction required to be protected (Supplementary Figure 2). We assume that
400 urban areas are unaffected by protected areas. LandSyMM land covers are initialised from Land Use
401 Harmonisation version 2(LUH2)³⁸. Throughout the simulations, urban and barren (here defined as
402 unusable for agriculture, such as water or ice covered) land areas are static while agricultural land
403 and natural lands can change. Agricultural land is defined as land that is managed for the production
404 of food and feed, such as cropland and pasture, while natural land is not used for agricultural
405 production and consists of primary or secondary natural vegetation that can include afforested land.
406 2040 was chosen at the end of the implementation period as it is a midpoint between two

407 commonly proposed strategies, 30% by 2030 and 50% by 2050. This also ensures that once the
408 implementation of protection is achieved the modelled dynamics have the same length of time to
409 settle, regardless of the area of protection, before the analysis year of 2060.

410 Results from the protection scenarios are compared with outcomes from a Reference, ‘Middle of the
411 Road’ Shared Socio-economic Pathways (SSP2) scenario, detailed below.

412 *Reference scenario*

413 In the Reference scenario the proportion of protected land within a grid cell is calculated using data
414 from the WDPA database³⁹. This equates to 1933 Mha or 14.7% of the modelled land surface. In cells
415 where agricultural land already exceeds the area specified as protected, agricultural land is
416 permitted to remain within the protected areas however it cannot further encroach on natural land.

417 Socioeconomic parameters, population trajectories and GDP trajectories follow the “middle of the
418 road” SSP scenario (SSP2), with trends largely exhibiting historic patterns^{40,41}. GDP levels and
419 endogenously calculated food prices drive per-capita demand for food. Under SSP2 GDP continues
420 to increase, driving a shift away from staple crops towards increased consumption of meat, milk,
421 fruit and vegetables (Supplementary Figure 1). Within SSP2 we assume moderate yield increases of
422 0.2% per annum due to technological development and management improvement. The climate and
423 atmospheric CO₂ forcing scenario RCP 6.0 is used as it considers the Representative Concentration
424 Pathway⁴² most consistent with SSP2⁴³. Forcings are taken from the 1850–2100 IPSL-CM5A-MR
425 outputs from the Fifth Coupled Model Intercomparison Project (CMIP5). While we do not explicitly
426 model bioenergy, demand for bioenergy is important to include as it is an additional pressure on the
427 land system. Demand for first-generation bioenergy is modelled from an observed baseline level in
428 2010^{44,45} after which it is adjusted to double by 2030 and thereafter remain constant. Global
429 demand for dedicated second-generation bioenergy crops increases to 3263 Mt DM/year by 2060, in
430 line with the SSP2 demand with baseline assumptions⁴⁶. A Monte Carlo approach to explore
431 uncertainty associated with input parameters is used and parameters are sampled using a Sobol
432 sequence method with $n = 30$, more details about the incorporation of uncertainty can be found in
433 the supplementary material.

434 **Analysis**

435 *Food price index*

436 We calculate a Laspeyres food price index (1) per country (c) by calculating how much it would cost
437 to meet demand from the base period (year = 2019), for the eight food commodity groups (f ,
438 cereals, sugar, fruit and vegetables, ruminant meat, monogastric meat, oilcrops, pulses, starchy
439 roots), in the current period (t) given current country specific prices (p). The Laspeyres food price
440 index there represents the cost of a basket of goods in a given year compared to the base year.

$$441 \quad \text{food price index}_{c,t} = \frac{\sum_f \text{demand}_{f,c,t=2019} \cdot p_{f,c,t}}{\sum_f \text{demand}_{f,c,t=2019} \cdot p_{f,c,t=2019}}$$

442 (1)

443 *Expenditure*

444 We calculate the expenditure on food in relation to GDP to account for GDP changes over time. The
445 expenditure is calculated as the percent of the GDP in a year in a country that is spent meeting
446 demand for food.

447
$$expenditure_{c,t} = \frac{\sum_f demand_{f,c,t} \cdot p_{f,c,t}}{GDP_{c,t}} * 100$$

448 (2)

449 *Population weight distributions*

450 We calculate the proportion of the population that is underweight (BMI < 18.5), normal weight (BMI
 451 18.5-25), overweight (BMI 25-30) or obese (BMI 30+) in each country and given year by estimating
 452 the mean BMI to use as input in a log normal distribution¹⁵. We estimate the mean BMI of a
 453 country's population using the following relationship:

454
$$meanBMI_{c,t} = 11.9 + coef_c + kcalPc_{c,t} \cdot 0.0037 + kcalPc_{c,t}^2 \cdot -0.0000002 + percAP_{c,t}$$

455
$$\cdot 0.2276 + percAP_{c,t}^2 \cdot -0.0046 + \varepsilon$$

456 (3)

457 where $coef_c$ is a country fixed effect, $kcalPc$ is the average calorie consumption per person per day in
 458 a country, $percAP$ is the percentage of daily calories consumed in the form of animal products in a
 459 country, and ε represents the error term. The relationship in Eq. 3 was estimated by regressing food
 460 consumption data from FAOSTAT with WHO estimates of mean BMI for the years 2000 - 2017 ($R^2 =$
 461 0.87, Supplementary Figure 3).

462 We use the estimated mean BMI of a country to calculate the different population weight
 463 proportions for a given timestep according to a log normal distribution with a mean:

464
$$mean_t = Log(meanBMI_{c,t}) - \frac{\sigma_c^2}{2}$$

465 (4)

466 and standard deviation:

467
$$sd = \sigma_c$$

468 (5)

469 Where σ_c is constant over time and calculated by fitting a log-normal distribution to WHO estimates
 470 of mean BMI and the prevalence of underweight, overweight and obesity in 2010 using a cross-
 471 entropy method. The cross-entropy approach estimates the parameters of the log-normal
 472 distribution by comparing two probability distributions and minimising the Kullback-Leibler
 473 Divergence.

474 *Deaths avoided*

475 We followed the methodology of Springmann *et al.*^{14,15} to calculate the number of additional deaths
 476 a counterfactual scenario (30% protection, 50% protection) compared to a reference scenario. We
 477 isolate the effects of changes in dietary and weight-related risk factors between 2019 and 2060 by
 478 comparing the year 2060 in the three scenarios against a baseline with death rates and population
 479 structures of 2060 but diets and BMI levels from 2019. We use 2019 as a baseline year as the
 480 implementation of 30% and 50% protection begins in 2020. Calculating the mortality differences
 481 between the Reference scenario and the protection scenarios in 2060 also allows us to estimate the
 482 impacts of the 30% and 50% protection.

483

484 We considered deaths caused by coronary heart disease (CHD), stroke (STR), colorectal cancer (CRC),
 485 all cancers (TOC), type-II diabetes (DIA) and other causes (OTH) from diet and weight related risk
 486 factors. We included three dietary risk factors (reduced fruit, reduced vegetable and increased red-
 487 meat consumption) and four levels of weight-related risks (underweight, normal weight, overweight,
 488 obese). The number of deaths avoided in country (c) in year (t) for disease (d) according to risk factor
 489 (f) in age group (a) was calculated according to:

$$490 \quad \Delta deaths_{c,t,d,f,a} = DR_{c,d,a} \cdot P_{c,t,a} \cdot PIF_{c,t,d,f}$$

491 (6)

492 Where DR is the death rate taken from the Global Burden of Disease Project for the year 2019⁴⁷. P is
 493 the population size of the age group; population size and demographic changes for each country
 494 were projected based on SSP2 from the IASA database^{21,48}. The population impact fractions (PIF)
 495 are the proportions of mortality that would be avoided if the risk exposure were changed from the
 496 Reference scenario to the protection scenarios, while the distribution of other risk factors in the
 497 population remain unchanged.

498 For the dietary risk factors, the PIFs were calculated as follows:

$$499 \quad PIF_{c,t,d,f} = 1 - \frac{RR_{d,f}^{cm_{c,t,pr}/s_f}}{RR_{d,f}^{cm_{c,t,ref}/s_f}}, \quad f = (\text{red meat intake, fruitveg intake})$$

501 (7)

502 where RR is the relative risk of disease/mortality cause for the risk factor. The relative risk factors
 503 were taken from Springmann et al.³³ and are given in Supplementary Table 2. For the dietary risk
 504 factors, it was assumed that the whole adult (\geq age 20) population of a country experiences the
 505 risks associated with its consumption level (cm) measured in g/capita/day. We assumed serving sizes
 506 (s) of 100g¹⁵. The relative risk is raised to the power of the consumption level over the serving size.
 507 Consumption levels are indexed by pr and ref for their levels in the protection scenarios and
 508 Reference scenario, respectively. The commodities included in the dietary risk categories are listed
 509 in Supplementary Table 2.

510 For the weight related risk factors the PIFs were calculated as follows:

$$511 \quad PIF_{c,t,d,f} = 1 - \frac{\sum_w P_{c,t,w}^{pr} \cdot RR_{d,w}}{\sum_w P_{c,t,w}^{ref} \cdot RR_{d,w}}, \quad w = \begin{pmatrix} \text{underweight, normal weight,} \\ \text{overweight, obese} \end{pmatrix}$$

513 (8)

514 where the relative risks RR are differentiated by disease d and weight category w . The proportions of
 515 the population (P) in the different weight categories are differentiated by country and year.

516 We calculated the combined disease and mortality burden of changes in dietary risk factors and
 517 weight risk factors using the following equation:

518
$$PIF_{tot_d} = 1 - \prod_f (1 - PAF_{d,f}), f = \begin{pmatrix} \text{weight, red meat intake,} \\ \text{fruit intake, veg intake} \end{pmatrix}$$

519 (9)

520 where PIF_{TOT} is the final PIF for a given disease after all PIFs for risk factors (f) have been combined.

521

522

523

524

525 **Acknowledgements**

526 RH, FW, and PA were supported by the UK's Global Food Security Programme project Resilience of
527 the UK food system to Global Shocks (RUGS, BB/N020707/1). MJ acknowledge funding from the
528 Nature Map project through Norway's International Climate and Forest Initiative (NICFI). AA and MR
529 acknowledge support through the Helmholtz Association. SR acknowledges support by the BMBF
530 Germany/ISIPEDIA project. We thank Piero Visconti for cross-reading the manuscript and
531 contributing to the discussion of the results.
532

533 **Contributions**

534 RCH,AA, PA, MDR developed the idea. RH, FW, SR and MJ contributed to method development and
535 data analysis. RCH wrote the manuscript and all authors contributed to editing and reviewing the
536 manuscript and approved the final version for submission and publication.

537 **Declaration of interest**

538 The authors declare no competing interests.

539 **Data availability**

540 The data will be made available upon publication.

541 **Code availability**

542 LandSyMM model code available on request from the authors.

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