Elsevier Editorial System(tm) for Science of

the Total Environment

Manuscript Draft

Manuscript Number:

Title: Grassland futures in Great Britain - productivity assessment and scenarios for land use change opportunitie

Article Type: Research Paper

Keywords: Grassland systems; climate change; ecosystem service; land use change; technology progress; yield gap

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Abstract: To optimise trade-offs provided by future changes in grassland management, spatially and temporally explicit estimates of grassland productivity are required at the systems level. Here, we benchmark the potential national availability of grassland biomass, identify optimal strategies for its management, and investigate the relative importance of intensification over reversion (prioritising productivity versus environmental ecosystem services). Process-conservative meta-models for different grasslands were used to calculate the baseline dry matter yields (DMY) at 1 km2 resolution for the whole UK. The effects of climate change, rising atmospheric [CO2] and technological progress on baseline DMYs were used to estimate future grassland productivities (up to 2050) for low and medium CO2 emission scenarios of UKCP09. UK baseline productivities (1970-1980) of 10.5, 7.9 and 2.6 t/ha were extrapolated to benchmark productivities (2010) of 12.5, 8.7 and 2.8 t/ha on temporary, permanent and rough-grazing grassland, respectively. By 2050, grassland productivities under medium emission scenario is predicted to increase to 15.5 and 9.8 t/ha on temporary and permanent grassland, respectively, but not on rough grassland. Based on surveyed grasslands areas for Great Britain in 2010 the GIS-modelled distributions of grassland productivity and total availability of biomass were shown at 1 km2 grid. Assuming that optimal N application could close existing productivity gaps of ca. 40% there are a range of management options available that could deliver additional biomass availability or spare some grasslands for provision of other ecosystem services.

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Science of the Total Environment

23 November 2017

Submission of Original Research Article

Modelling productivity and resource use efficiency for grassland ecosystems in the UK

Dear Professor Ludwig

On behalf of all authors I would like to submit our article to Science of the Total Environment because we think it fits perfectly its scope in more than one aspect, first quantifying the extent of different grassland ecosystems and, second describing benchmark productivity and how this might change with regard to different land use scenarios. The results can be helpful in terms of environmental management and policy

This paper is a companion paper to an earlier one describing model development and scenario simulations for different grassland ecosystems. Here, we exemplify opportunities for grassland management and documents in great detail statistical and spatial inputs at the whole country level. This paper lays the foundations for a bioenergy/biomass whole systems analysis that includes all production vectors, food, feed and fuel.

Yours faithfully,

2 elk

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Qi et al (2017b)-Highlights

Highlights

Benchmark productivity (2010) ranges from 8.7 to 12.5 t/ha on improved grasslands Future productivity increase comes from technological progress and CO_2 stimulation Biomass from productivity gaps of 40% can provide other ecosystem services

Increased lowland intensification can outweigh reversion of upland areas to rough grazing

Grassland futures in Great Britain – productivity assessment and scenarios for land use change opportunities

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Paper stats

Section	final
Abstract	232
Introduction	881
Material & Methods	1996
Results	1217
Discussion	1848
Conclusions	215
TOTAL without Abstract	6157
References	69
Tables	4
Figures	7
Supplemental Material	6 Tables,
	2 Figures

1 Abstract

2 To optimise trade-offs provided by future changes in grassland management, spatially and 3 temporally explicit estimates of grassland productivity are required at the systems level. Here, we 4 benchmark the potential national availability of grassland biomass, identify optimal strategies for its 5 management, and investigate the relative importance of intensification over reversion (prioritising 6 productivity versus environmental ecosystem services). Process-conservative meta-models for 7 different grasslands were used to calculate the baseline dry matter yields (DMY) at 1 km² resolution 8 for the whole UK. The effects of climate change, rising atmospheric [CO₂] and technological progress 9 on baseline DMYs were used to estimate future grassland productivities (up to 2050) for low and 10 medium CO₂ emission scenarios of UKCP09. UK baseline productivities (1970-1980) of 10.5, 7.9 and 11 2.6 t/ha were extrapolated to benchmark productivities (2010) of 12.5, 8.7 and 2.8 t/ha on 12 temporary, permanent and rough-grazing grassland, respectively. By 2050, grassland productivities 13 under medium emission scenario is predicted to increase to 15.5 and 9.8 t/ha on temporary and 14 permanent grassland, respectively, but not on rough grassland. Based on surveyed grasslands areas 15 for Great Britain in 2010 the GIS-modelled distributions of grassland productivity and total availability of biomass were shown at 1 km² grid. Assuming that optimal N application could close 16 17 existing productivity gaps of ca. 40% there are a range of management options available that could 18 deliver additional biomass availability or spare some grasslands for provision of other ecosystem 19 services.

20

21 Key words:

Grassland systems, climate change, ecosystem service, land use change, technology progress, yieldgap

25 1 Introduction

26 Globally, grasslands are the dominant form of agriculture by land area, primarily utilised for the 27 provision of feed for ruminants (Prochnow et al., 2009; Gerssen-Gondelach et al., 2017). In the United Kingdom (UK), grasslands represent over two thirds of agricultural land area, broadly 28 29 grouped into temporary (1.2 million ha), permanent (6.1 million ha) and rough-grazing (5.0 million 30 ha) types (Defra, 2016a). In 2015, UK grasslands supported 9.9 and 33.3 million heads of cattle and 31 sheep, respectively. This provided 15.2 million tonnes of cow's milk, 0.9 and 0.3 million tonnes of 32 beef and sheep meat for human consumption respectively (Defra, 2016a), representing a significant 33 land resource for food. Grasslands also play an important role in supporting biodiversity (Fargione et 34 al., 2009) and in the delivery of other benefits to society including carbon sequestration, biomass for 35 bioenergy, and recreational opportunities (Hopkins and Wilkins, 2006; O'Mara, 2012, McEniry et al., 36 2013).

37 Following the 2016 referendum, in which the UK voted to leave the European Union, options 38 for the future of farming are being explored. At least in part, this debate seeks to balance the views 39 of those favouring intensification of production alongside those who argue for the incorporation of 40 wider sustainability criteria into the land use planning (Hill, 2017). For grassland systems, these competing viewpoints were exemplified in upland regions of the country, which play a central role in 41 42 the provision of regulating ecosystem services, often for beneficiaries in distant urban areas 43 (O'Rourke et al., 2016). However, farmers in upland regions face substantial challenges to their 44 income associated with a traditional low-input, low-output business model that supports the 45 continued provision of these benefits to society (Reed et al., 2009). The continued decline of Nfertiliser input and stocking rates (Defra, 2016b) are strong indicators for this. 46

Against this background a key requirement to inform development of farming policy is
spatially explicit knowledge of current and future grassland productivity. Benchmarking and
understanding the levels of dry matter yield (DMY) and quality are important to optimize

50 productivity for sustainable intensification within grassland systems (O'Donovan et al., 2015). 51 Making use of the productivity gap between or closing the yield gaps within grassland types could 52 increase biomass production for various services and value chains, food, feed or bioenergy (Grau et 53 al, 2013; Lusiana et al, 2012; Prochnow et al., 2009). This would provide opportunities to those areas 54 of the country that might be considered preferential for change, given social, environmental and 55 economic factors. At the same time, such knowledge allows policy makers to explore options for 56 targeting agri-environment schemes to protect biodiversity (Eigenbrod et al., 2011; Phalan et al., 57 2014; Werling et al., 2014) and important regulating services such as those associated with carbon 58 stocks or water resources (Reed et al., 2014; Smith, 2014) in other regions where less significant 59 productivity gains could be achieved with changes in grassland management practice.

60 The net primary productivity of grasslands can be measured from its annual dry matter 61 production per hectare. An earlier presented process-based grass model increased our 62 understanding of past experimental DMYs of temporary, permanent and rough-grazing grasslands 63 (Qi. et al., 2017). Key biophysical driving variables were up-scaled, building meta models to estimate 64 productivities for each grassland type to assess future productivities. However, these estimates need to account for climate change, increased CO₂ concentration and technological progress, e.g. better 65 genetics and management (Ewert et al. 2005). The impact of past climate change on DMYs of 66 67 grasslands was found to be rather small (Coleman et al., 1987; Chang et al., 2015) or undetectable in 68 the long-term Park Grass Experiment (Jenkinson et al., 1994). However, future climate change is 69 likely to improve productivity and quality of grasslands (Hopkins and Del Prado, 2007; Izaurralde et 70 al., 2011), although scenarios a 2 °C temperature increase found little change in DMYs for Scotland 71 (Cooper and McGechan, 1996).

Nevertheless, the growth of typical pasture crops was stimulated by CO₂ enrichment
(Soussana and Luscher, 2007), similar to that observed for cereals (Jaggard *et al.*, 2010). Plant
breeding and improved agronomy are likely to continue increasing grassland productivity (Hopkins

and Wilkins, 2006). A potential annual increase of DMY in the range of 0.25 to 0.76 percent seems
possible (e.g. Wilkins and Humphreys, 2003; Harmer *et al.*, 2016). Annual on-farm grassland yield
gains varied between countries and grassland types (Smit *et al.*, 2008), they are low on permanent
grassland (0.35% annually) due to less frequent reseeding (Chang *et al.*, 2015). Semi-natural
grasslands used for rough-grazing, dry matter productivity cannot be genetically improved but
productivity can be influenced by changing growing conditions, e.g. influencing the hydrology or
adjusting stocking density (Sozanska -Stanton *et al.*, 2016; Worrall and Clay, 2012).

82 The objectives of this study were (i) to estimate DMYs for all grassland types across the UK for 83 current and future climates considering CO_2 enrichment and technological progress. (ii) to assess 84 and map the availability of total dry matter production constrained by grassland areas surveyed in 85 2010 across Great Britain. (iii) to determine the current benchmark DMYs for each grassland type 86 and identify productivity gaps, particularly with respect to the current decline in below optimal N 87 application rates, and (iv) to perform spatial analyses of the impact of conversion between grassland 88 types and to investigate changes in total grassland biomass production in Great Britain under varying 89 management options.

90

91 2 Materials and Methods

92 2.1 General approach

The meta-models used here were derived from outputs of a process-based model calibrated using a comprehensive set of experimental DMY data measured in the 1970s and 1980s (Qi. *et al.*, 2017). These meta-models accounted for effects of weather, soil available water capacity (SAWC) and N input on DMY. When meta-models were used to calculate DMYs with baseline weather (1961-1990), they were referred to as baseline dry matter yields (BL-DMY). However, since then climate has changed, atmospheric CO₂ concentration increased, and pasture crops with higher growth potential and improved agronomy have been adopted, particularly in temporary and permanent

100 grasslands. The approach of Ewert *et al.* (2005) was followed to calculate the grassland DMYs from 101 2010s to 2050s, which accounts for the effects of these three yield determining factors: change in 102 climate (CC; f_{CC}), carbon fertilisation effect (CFE; f_{CFE}) due to rising atmospheric [CO₂] and 103 technological progress (TP; f_{TP}).

104 The DMY in 2010 was calculated using Eqn. 1:

105
$$Y_{10s} = Y_{base} + Y_{base}^*(f_{10s, CFE} + f_{10s, TP})$$
 (1)

106 where Y_{10s} is the annual dry matter yield in 2010s, Y_{base} the meta-model calculated baseline dry 107 matter yield (i.e., BL-DMY), $f_{10s, CFE}$ is the percentage increase of DMY due to CO_2 fertilisation effect 108 while $f_{10s, TP}$ is the percentage of DMY increase due to technological progress from 1980s to 2010s. 109 Instead of projected CC, baseline actual weather data were used.

110 DMYs in 2020 to 2050 were calculated with Eqn. 2:

111
$$Y_{t1...4} = Y_{base} + Y_{base}^* (f_{t1...4, CC} + f_{t1...4, CFE} + f_{t1...4, TP})$$
 (2)

112 where $Y_{t1...4}$ is the annual DMY from 2020s to 2050s, $f_{t1...4, CC} + f_{t1...4, CFE} + f_{t1...4, TP}$ represent the

113 percentage of DMY changes due to predicted weather under CC, CFE and TP from 1980s to 2020s,

114 2030s, 2040s and 2050s, respectively. The percentage of DMY change due to changed climate was

115 calculated as the difference between the weather-governed DMY with the baseline climate and the

116 weather-governed DMY with changed climate divided by the former.

117 2.1.1 CO₂ fertilisation effect (CFE)

Most experimental evidence indicates that the growth of perennial ryegrass (*Lolium perenne*) was stimulated by CO₂ enrichment and consequently the DMY was increased by an average 0.06%/ppm [CO₂] (range from 0.03 to 0.09%/ppm; **Table S1a**). The percent increase was multiplied with the incremental increase of CO₂ concentration from the baseline (1980s) to the respective later decade.

123 Atmospheric $[CO_2]$ has increased from 334 ppm in the 1970/80s to the present 400ppm in 124 2015 at a rate of approximately 2 ppm per year due to anthropogenic forcing (IPCC 2013; Myhre et 125 al., 2013). The predicted CO_2 concentrations in the atmosphere from 2020s to 2050s were taken 126 from the projections of the BERN model under low and medium CO₂ emission scenarios (**Table S1b**). 127 The atmospheric $[CO_2]$ of past years were taken from the annual mean records of $[CO_2]$ at Mauna 128 Loa, Hawaii by Earth Systems Research Laboratory (www.esrl.noaa.gov/gmd/ccgg/trends). The 129 cumulative fertilisation effects of increased [CO₂] for various decades were calculated and applied 130 accordingly (Table S2).

131 2.1.2 Contribution of technological progress to grassland productivity

132 Innovations in technology to improve grassland productivity include breeding varieties with 133 higher potential yield and improved management to better protect and fully reap the genetic 134 potentials. Based on the results of multiple variety trials for perennial ryegrass (Aldrich, 1987; 135 Camlin, 1997; Woodfield, 1999; Easton et al., 2002; Wilkins and Humphreys, 2003; Humphreys, 136 2005; Smit et al., 2008; Chaves et al., 2009; Lee et al., 2012; Chang et al., 2015; Harmer et al., 2016; 137 McDonagh et al., 2016) the annual mean genetic, potential DMY gain was set to the overall mean of 0.5% (Table S3a). This agrees with the average annual on-farm yield increase suggested for 138 139 temporary grassland (Smit et al., 2008) while for permanent grassland an annual yield gain of 0.35% 140 can be assumed (Smit et al., 2008; Chang et al., 2015; Table S3a). For rough grazing grassland, which 141 is semi-natural with little agronomic inputs, no technological improvements in dry matter 142 productivity were applied.

For temporary grassland, the DMY was augmented with a technology factor of 0.5% increase per annum above the BL-DMY for both the potential and the on-farm DMY from 1980s to 2050s assuming a full translation of potential DMY increase into on-farm DMY. For permanent grassland, the DMY was augmented with a technology factor of 0.35% increase per annum for the on-farm

DMY from 1980s to 2050s. Thus, the accumulated percentage increases above the BL-DMY were
calculated and applied on each of the three types of grassland from 1980s to 2050s (Table S3b).

149 2.1.3 Impact of future weather changes

150 The meta-models encapsulate the effects of weather variables on DMYs using inputs of 151 changed bioclimatic variables which reflect the weather-governed DMYs for any given future 152 decade. These variable changes fed directly into the meta-models, developed from scenario outputs 153 generated by validated process-based growth model (Qi. et al., 2017), to calculate future grassland 154 productivities. Inputs were soil available water capacity and bioclimatic variables of monthly temperature, precipitation, and global radiation under baseline and future climate change scenarios. 155 156 The impact of climate change on grassland productivities was the percentage of DMY change which 157 was calculated as the difference between the weather-governed DMY with the baseline climate and 158 the weather-governed DMY with changed climate divided by the former.

159 2.2 Climate and soil data

160 The necessary inputs of monthly climatic variables for the baseline (1961-1990) and for 161 decades from 2020s to 2050s were obtained from the most recent UK climate projections (UKCP09, 162 2009). The monthly maximum and minimum temperature, precipitation and global radiation were 163 initially available at 25km x 25km grid and they were then harmonised into 1 km x 1km grid for the 164 whole UK (Murshed et al., 2012). Relative to the baseline climate (1961-1990), seasonal precipitation 165 and global radiation differed little between the low and medium emission scenario during the 2020s to 2050s across the UK (Table S4). The global radiation increased most (1.6 and 3.9%) in spring, less 166 167 so during summer and autumn. Overall, summer was likely to be drier while winters would be wetter in the future. Under both CO_2 emission scenarios, the UK will be warmer in all seasons. Although 168 169 absolute temperatures increase most in summer (e.g. 1.2 to 2.2°C until 2050s under medium 170 scenario), the relative increase was greatest in winter and spring (**Table S4**).

These climatic data were used in combination with the spatially distributed soil available water content in the root zone obtained from the European Soil Database at 1 km x 1 km grid, as inputs for the meta-models to calculate the DMYs on temporary, permanent and rough-grazing grassland.

175 2.3 Nitrogen (N) fertiliser application and DMY response to N inputs

The annual survey of the overall average N applied per hectare to temporary and permanent grassland was conducted by Defra starting from 1960s. The average N applied increased steadily until mid-1990s (Rath and Peel, 2005) but declined from the late 1990s onwards on both, temporary and permanent grassland until 2008 (**Figure S1**; Defra, 2016b) and remained unchanged since. The overall average N use during the recent decade came to 99 and 52 kg/ha on temporary and permanent grassland, respectively.

Annual DMYs were measured in N fertiliser response experiments carried out at 21 different sites (Morrison *et al.*, 1980) with N fertiliser used up to 750 kg N/ha; DMY reached their maximum plateau mostly at an N application rate of 600 kg N/ha. The DMYs were normalised using the maximum DMY and expressed as its fraction in percentage (DMY%; see **Figure 1**). The fourparameter rational equation proposed by Morrison *et al.* (1980) was applied to describe the DMY in response to N application (Eq. 3):

188

$$DMY\% = \frac{a+bN}{1+cN+dN^2} \tag{3}$$

The estimated coefficients were: a=22.1696, b=0.2373, c=-0.0001944, d=0.000002117 and the
 variance accounted for (i.e. R²) was 93.8% (n=126). This equation was used to calculate the yield gap
 because of reduced N fertiliser usage.

192 2.4 Total GB grassland yields under contrasting management options

193 Grassland area was surveyed by Defra in 2010, and is available at a 2km × 2km grid resolution

194 (https://access.edina.ac.uk/agcensus/). For Great Britain (GB), UK without Northern Ireland (NI),

grassland covered 9.9896 million ha in total, of which 1.0246, 4.5333 and 4.4317 million ha were
temporary, permanent and rough-grazing, respectively. This leaves about 2.5 million hectares of
grassland unaccounted for in this scenario analysis, as NI was not included in the Agricultural Census.
Analysis explored five land use transition scenarios for GB covering the period 2010 – 2050 (Table 4),
conducted at a 2km × 2km grid resolution for compatibility with grassland survey data. The focus of
the analysis was on changes in management practices, therefore we considered that transitions
occur between grassland types without increasing or decreasing overall area of grassland.

202 The likelihood that farmers will change management practices (i.e. shift from a business model 203 focused on production towards environment-focused management) is determined by complex social and economic drivers arising from past and current experiences that serve to limit farm 204 205 development pathways (Di Falco et al., 2005; Ingram et al., 2013). To this end our analytic approach 206 does not assume that transitions between grassland management practices will occur in a spatially 207 optimal manner determined by factors such as monetary returns, yields, or carbon stocks. Instead 208 the target area for conversion in hectares (ha) for GB was calculated, and a stochastic algorithm 209 implemented in R (R Core Team, 2017) that randomly assigned conversion of grassland areas for 210 each 2km × 2km grid cell until the target area for conversion was met. For each scenario 1000 211 permutations were conducted and changes in average yield per 2km × 2km grid cell and for GB total 212 dry biomass production were calculated.

Although the analysis considered conversion of different grassland types, plausible limits to this conversion were identified based on a subset of constraints defined in part by Lovett *et al.* (2009) for energy crops. The constraints are altitude (>=250m to define upland), slope (>=15% representing a technical limit for farm machinery), and distribution of nitrate vulnerable zones (NVZ) across GB (**Table S6**). In determining the location of land use transitions the stochastic algorithm preferentially chose to convert grassland in areas that were consistent with the logic of the scenario based on these constraints. For example, for conversion of rough-grazing to permanent grassland, which

implies greater agricultural inputs, initially focused on areas outside NVZ and where the slope was
 <=15% to allow access for farm machinery. Where the target area for conversion specified within the
 scenario exceeded area available due to the constraints, the stochastic algorithm initially converted
 grassland outside the constrained areas before converting grassland within excluded 2km × 2km grid
 cells.

225 The first four scenarios explored possible permutations of the transition between differing grassland 226 types that could be achieved through changes in management practice. In the first two instances, a 227 reduction in intensity of management was explored (i.e. Scenario A, Permanent to rough-grazing; 228 Scenario B, Temporary to permanent) and in the second an increase in intensity of production (i.e. 229 Scenario C, Permanent to Temporary; Scenario D Rough-grazing to Permanent). For each scenario, the stochastic algorithm considered transitions of between 0 – 100% of 2010 area in 10% increment 230 231 intervals. This defines a parameter space over which possible changes to the management regime 232 could occur, allowing examination of the implications for total GB grassland DM production.

233 The final scenario examined a more complex set of management options informed by recent 234 discussions focused on upland regions. In contrast to the other four scenarios, this fifth scenario 235 (Scenario E) did not explore change in grassland yield associated with changing management 236 practices, rather the aim was to maintain GB grassland DM production. In areas defined as upland 237 (average altitude >=250m) permanent grassland was converted to rough-grazing and the loss of total grassland DM production calculated. Conversion of permanent to temporary grassland in lowland 238 239 areas was then carried out to compensate for the lost total dry biomass production. As with 240 scenarios A - D, scenario E examined transition of between 0 – 100% of the specific grassland area in 241 10% increment intervals using the same stochastic approach as the other four scenarios.

242 3 Results

243 3.1 Weather-governed, CO₂-and technology-adjusted DMY

The DMY was calculated with the meta-model at 1 km² resolution across the UK assuming a 244 single grassland type for all land with SAWC information (i.e. a blanket approach). The UK average 245 246 blanket DMYs for the baseline and future weather (Table 1) indicate little difference between the 247 low and medium emission scenario in the effect of future climate change (weather only) on DMYs 248 within each grassland type. The weather-governed productivity is unlikely to be affected in the 249 future and remained about 10.5 t/ha on temporary grassland. However, productivity of both 250 permanent and rough-grazing, will be reduced by about 0.3 t/ha by climate change in the future. 251 Relatively, the reduction of productivity on rough-grazing grassland could be more than 10% by 252 2050.

253 The spatially explicit technology- and [CO₂]- adjusted DMY maps are exemplified in Figure 2 254 for the 2010s under the medium emission scenario. The average national blanket DMYs in the UK 255 from 2010s to 2050s show very small differences between the low and medium emission scenarios 256 for each grassland type (Figure 3). For rough-grazing grassland the DMYs increase due to rising $[CO_2]$ 257 cannot compensate the negative impact from changed weather variables (i.e. both reduced 258 precipitation and increased temperature in summer) in the future, and the overall productivity of 259 rough-grazing grassland is unlikely to change by 2050. For temporary and permanent grassland, the 260 productivity is predicted to increase steadily at a rate determined by the additive response of 261 technological progress and the increased atmospheric [CO₂] per decade.

262 3.2 Benchmark DMY constrained by actual grassland areas in GB

Assuming no changes in management regime, the average DMYs based on the actual area of each grassland type can be calculated from 2010s to 2050s (**Table 2**). These average DMYs can be referred to as the benchmark productivities, which were similar for blanket approach and census areas. Taking DMYs in 2010 as representative of current grassland productivities (**Figure 4**), the

present benchmark productivity should be 12.5, 8.7 and 2.8 t/ha on temporary, permanent and
rough-grazing grassland in GB, respectively.

269 After overlaying the NUTS 1 regions over the grassland area and the availability of dry matter 270 production per km² grid (Figure 4), the total grassland area (Figure 5a) and availability of total dry 271 matter production (Figure 5b) per region in Great Britain were calculated. Within Great Britain, the 272 total grassland area in 2010 was partitioned 45.7, 13.4 and 40.9% into Scotland, Wales and England, 273 respectively. In terms of grassland type, Scotland contained 41.2, 21.0 and 72.0% while England 274 shared 48.7, 56.6 and 23.0% of temporary, permanent and rough-grazing grassland, respectively. In 275 terms of total DM production, the share was partitioned into 40.3, 45.3 and 14.4% for Scotland, 276 England and Wales, respectively. Within England, the largest grassland area and availability of total 277 DM production were in South West, followed by North West and West Midland.

278 Defra reported areas of respective grassland types in 2010 for the whole UK (Defra, 2015) and 279 the Agricultural Census in 2010 specified these areas for GB (**Table S5**). The total DM availability on 280 each grassland type can be calculated by multiplying the respective grassland area and its 281 corresponding mean dry matter yield (**Table S5**). The UK national total potential availability of dry 282 biomass can reach 82 million tonnes. Permanent grassland provided the largest proportion of this 283 national total (63%) while temporary and rough-grazing grassland contributed equally to the 284 remaining 37%. Without NI the annual biomass resource shrinks to 64.5 million tonnes.

285 3.3 Grassland yield gap analysis

The above calculated grassland productivity after considering the effect of climate change, increasing atmospheric [CO₂] and technological progress from 2010s to2050s reflects DMYs measured in the experiments and is the attainable DMY (i.e. water limited potential yield) (van Ittersum *et al.*, 2013). The on-farm, actual DMY is usually smaller than the attainable yield due to other limitations (Lobell *et al.*, 2009; Sadras *et al.*, 2015).

291 The DM productivity used to model temporary and permanent grassland was measured with 292 annually applied 300 kg N/ha and 150 kg N/ha, respectively (Defra, 2010). The annual N usage on 293 grassland had dropped in recent decade (2006 to 2015) to ca. 99 and 52 kg N/ha on the temporary 294 and permanent grassland, respectively, much below the recommended economic optimum N:150 295 for permanent and 300 kg N/ha for temporary grassland (Morrison et al., 1980; Hopkins et al., 1990). 296 To estimate the productivity gaps on temporary and permanent grassland, the relative DMYs were 297 calculated using these lower values and estimating the difference from the relative DMYs at the 298 recommended N (Eqn. 3; see Figure 1). The current N shortage resulted in calculated on-farm DMYs 299 about 45 and 39% yield gap (YG) below the attainable DMYs on temporary and permanent grassland, 300 respectively, which correspond to a total actual unused productivity of about 21 million tonnes DM 301 (Table 3). Changes in GB total grassland DM production under evolving management 302 3.4 303 scenarios

304 Out of the four scenarios describing conversion between grassland management options only 305 Scenario A, characterising changes in yield resulting from conversion of permanent grassland to 306 rough-grazing (Abandonment), resulted in a decrease in total DM production in GB by 2050 307 compared to the baseline 2010 value. Even in this scenario, conversion of up to 20% of total area 308 could be implemented while maintaining a comparable level to total DM production in 2010 (Figure 309 6). Total GB grassland DM production in Scenario B (i.e. temporary to permanent), which represents 310 the other reversion scenario exploring reduced management intensity, showed increases out to 311 2050 compared to the 2010 baseline value even under the transition representing 100% area 312 conversion.

Scenarios C and D represent lowland and upland intensification of existing grassland management
 and describe a substantial increase from the 2010 baseline in total GB grassland DM production out
 to 2050. For example, unconstrained conversion of rough-grazing to permanent grassland (Scenario

D) would increase total GB grassland DM production from 63 million tonnes in 2010 to 107 million in
2050. Taking into account simple constraints (e.g. NVZ, slope) to restrict the area over which
increases in management intensity might practically be achieved results in 50% conversion of
management intensity for Scenario C and 30% conversion for Scenario D, both yielding an additional
18 million tonnes above the 2010 baseline.

321 Scenario E explored an alternative future where overall GB DM production was maintained at 322 current levels. In this scenario, there was a reduction in the management in intensity of permanent 323 grassland in upland areas to the west and north of GB, accompanied by conversion of permanent to 324 temporary grassland in lowland regions to maintain total GB grassland yield (Figure 7). Given the 325 restriction imposed by the presence of NVZs in England, in our stochastic analyses production of 326 grassland was focused in the north and west of GB representing a shift in management intensity 327 from upland to lowland areas. In terms of land conversion, at the extreme cessation of management 328 of permanent grassland in upland regions would require an increase from 1 million to 1.9 million 329 hectares of temporary grassland to compensate for lost yield. At more realistic conversion levels of 330 20 - 40 per cent there are options for substantial reductions in management inputs of uplands 331 regions of GB that would require intensification of 200 – 300 thousand hectares of lowland 332 permanent grassland to temporary grassland to make up for lost yield.

333 4 Discussion

Considering the global importance of grasslands not only as a source of feed and food, but carbon sink, ecological buffer and source or haven of biodiversity, our spatially explicit grassland yield model can provide a valuable evidence-base for policy making. The analysis considered most recent evidence about climatic and physiological control factors and assumed technological developments to be a continuation of past progress, a rather conservative assumption. The most striking features of this analysis are the opportunities that arise from the yield gap and the evaluation of possible futures for changes in grassland management practices across GB.

4.1 Impact of climate change and increased atmospheric [CO₂]

342 The impact of climate change (reduced seasonal precipitation, increased global radiation and 343 mean temperature) on weather-governed DMYs is very small (Table 3) though slightly positive on temporary grasslands (<1%) and marginally negative on rough-grazing grasslands. The largest impact 344 345 of climate change is likely to be seen on permanent grasslands, with DMY declining by about 2.5 to 346 5% from 2020s to 2050s. This largely agrees with past findings that the impacts of past climate 347 change on grassland DMYs was found to be small or undetectable (Coleman et al., 1987; Jenkinson et al., 1994). However, Cooper and McGechan (1996) emphasised that site differences in weather 348 349 patterns will have greater effects on grass conservation and productivity than other predicted 350 effects of climate change.

351 The effect of rising atmospheric $[CO_2]$ on stimulating growth for C_3 -plant species such as 352 perennial ryegrass (http://www.co2science.org/data/plant_growth/dry/l/loliump.php) was assumed 353 to be more conservative than in these larger sets of experiments (0.06% vs 0.11% per ppm [CO₂] 354 increase; Table S1a). For temporary and permanent grasslands, the effect of rising $[CO_2]$ are 355 intricately linked to technological progress, and the net effects (Table 2) are likely to be smaller than 356 the additive gross effects (Table S2 and S3b). Only for rough-grazing grasslands one can see that rising [CO₂] just about compensates the negative effects of weather (Table 2). The relative DMY 357 358 increase is likely to be slightly higher under medium compared to the low emission scenario (+1.6%) 359 due to the difference in atmospheric [CO₂] which is marginally lower than the difference (2.4% 360 between grassland types, Table S2) but much smaller than the additive effect of [CO₂] and 361 technology progress. In reality, actual percent DMY increases due to increased [CO₂] depend on 362 other interacting factors such as N fertility in the soil (Daepp et al., 2001), changes in water 363 productivity, evapotranspiration and soil water stress (Deryng et al., 2016).

364 4.2 How fast is technological progress to improve grassland productivity?

365 As seen in the results (Table 2) the additive increase of grassland DMYs is 24% and 14% between 366 2010s and 2050s for temporary and permanent grassland, respectively under medium emission 367 scenario, which is somehow smaller that the theoretical progress. This is because of that the percent increase of DMY due to joint CFE and TP effects was 28.0 and 22.0% between 2010s and 2050s for 368 369 temporary and permanent grassland, respectively under medium emission scenario (Tables S2 and 370 **S3**). Therefore, the efficiency of permanent grassland to exploit the joint CFE and TP effects is lower 371 than under temporary grassland (ca. 63 vs ca. 86 %). This was partly due to the larger negative 372 impact of climate change on grassland productivity on permanent grassland. As permanent 373 grasslands were kept under the same grass species longer (>5 years) than temporary grasslands (<5 374 years) the introduction of new, more productive cultivars/practices is slower. Compared with the 375 potential yield improving rate in arable crops (Jaggard et al., 2010; Fischer and Edmeades, 2010) the 376 rate of potential yield improvement was slower in pasture grass (Hatfield and Walthall, 2015). 377 Longer breeding cycles (15-20 years), inability to exploit heterosis in commercial pasture crop 378 cultivars and selection in the absence of competing neighbour plants, cause a poor correlation with 379 pasture sward performance.

380 Agronomists will continue to improve practices that provide overall gains in grassland 381 productivity (Stewart and Hayes, 2011; Barrett et al., 2004). The applications of genomics, marker-382 assisted selection (MAS) and use of genetically modified grass types are likely to accelerate genetic 383 gains of future grassland productivity. Overall, the UK is well-positioned geographically and the rate 384 of genetic gain achieved was among the top range 4-5% per decade (Wilkins and Humphreys, 2003). 385 These can include higher potential DMY, better quality and more resilience to biotic and abiotic 386 stresses (Williams et al., 2007; Barrett et al., 2015). The current scenarios ignored the exploitation of 387 other high-yielding grassland species, like Italian Ryegrass (L. multiflorum), for temporary grassland 388 which will also allow a step change in productivity (Humphrey, 2005).

389 4.3 Benchmarking grassland productivity and feedstock availability

390 As in this paper, crop growth models can be used to benchmark on-farm crop production (Lobell et 391 al., 2009; Sadras et al., 2015), quantifying the obtainable yields (i.e. G x E x M yield) for a given 392 variety grown under defined climatic conditions and agronomic management. Thus, benchmark 393 yields are site- and soil type specific, vary from year to year and evolve with time due to difference in 394 weather and technological progress. We calculated the national benchmark DMY in Great Britain by 395 constraining the blanket grassland productivity to the surveyed grassland areas of each grassland 396 type in 2010 (Table 2). In addition, the benchmark DMY will increase until 2050 under both, low and 397 medium CO₂ emission scenarios due to rising atmospheric [CO₂] and technological progress.

398 The UK total potential availability of biomass for the meat and dairy sectors was the sum of 399 the product of respective benchmark DMYs and grassland areas for the main grassland types (Defra, 400 2015). Based on the consumption of 10 kg DM per day per adult cattle (Allen et al., 2011), the total 401 potential availability of DM could support 4.2 and 14.1 million heads of cattle in 2010 on temporary 402 and permanent grassland, respectively. Based on the consumption of 2.5 kg dry matter per day per 403 sheep (Allen et al., 2011), the total availability of dry biomass could support 16.3 million sheep in 404 2010 on rough-grazing grassland. If 30% of total DM on the permanent grassland was used by sheep, 405 the potential total herds of sheep and cattle could be 33.2 and 14.1 million, respectively. The 406 statistics in 2010 by Defra reported 10.1 million herds of cattle and calves and 31.1 million herds of 407 sheep and lambs (Defra, 2015). As calves and lambs consume less than adult cattle and sheep, and 408 considering that a significant amount of processed animal compound feed is used in the UK farming 409 systems (Guo et al., 2016), it is apparent that either there was a yield gap between the benchmark 410 and the on-farm actual DMY or the availability of dry biomass was underutilised by the livestock 411 supported by grassland systems.

412 4.4 Productivity gap on temporary and permanent grassland

413 The on-farm actual DMY in either of the two improved grassland systems follows the law of 414 minimum with yield-limiting factors being management, biological and abiotic factors. Here we 415 examined the likelihood that productivity gaps are caused by insufficient amounts of N fertiliser 416 applied to temporary and permanent grassland in recent years. The current respective yield gaps of 417 about 45 and 39% estimated, may be overstated, especially for permanent grassland because a 418 substantial proportion of the grassland will be grazed and wastes from the livestock would add 419 between 60 and 80 kg N/ha to the grassland systems depending on whether the grassland is 420 intensively or moderately intensively managed (Defra, 2010). However, these gaps represented 421 average relative yield reduction due to suboptimal applications of N-fertiliser (Figure 1). However, 422 the yield gaps could vary across grasslands of different natural productivities (i.e. DMY on fields at 0 423 N fertiliser, see Figure 1) due to difference in N supplied from soil mineralisation).

424 The data compiled from the annual statistics indicated that the total grassland area gradually 425 declined for about 15 years from 1984, but remained steady until 2015 (Figure S2). The decline in 426 total grassland area between 1996 (12.73 M ha) and 2015 (12.38 M ha) was minimal. However, the 427 herd size declined between 1996 and 2015 by 17.6% (12.0 versus 9.9 M heads) and 20.8% (42.1 428 versus 33.3 M heads) for cattle (including calves) and total sheep and lambs, respectively. The 429 decline in animal number supported by the same grassland area shows that temporary and 430 permanent grasslands were an under-exploited resource. This indicates that some grasslands that 431 are not used for livestock or do not perform to their full production potential. As underperformance 432 of improved grassland has been attributed to infrequent re-seeding and inadequate soil pH (Hopkins et al., 1994), we believe that grassland management offers considerable opportunities for 433 434 improvement. Closing the yield gaps between the attainable and the on-farm actual DMY is impeded 435 by little empirical information about on-farm DMYs associated with different grassland groups 436 (Oenema et al., 2014). They reported that the on-farm DMY in intensively managed dairy systems 437 ranged from 50 to 80% of the attainable DMY in Chile and from 60 to 80% in the Netherlands.

438 4.5 Prospects for future grassland production in GB

439 The analyses presented in Scenarios A - D (Figure 6) demonstrates the influence of changing 440 management patterns on GB grassland DM production and illustrates the breadth of options that 441 are available for the development of land use policy in relation to grassland systems. Scenarios A – D 442 provide understanding of changes in total GB grassland yield as management practices are altered 443 over increasing area. By illustrating where constraints to conversion are likely to become an issue we 444 provide a realistic view of changes that could be realised. For example, as demonstrated in Scenario A, a reduction in the intensity of management of 20% of permanent grasslands would have limited 445 446 impact on total GB grassland DM production in 2050 compared to the 2010 baseline. This is achieved 447 through the adoption of best practice fertiliser application, and based on technological progress and 448 changes in climate to 2050 that are in line with the modelling assumption used in this study. 449 Alternatively, as demonstrated in Scenarios C and D (Figure 6), increasing management intensity of 450 areas of grassland that are likely not constrained by biophysical limits or existing policy drivers could 451 make an additional ca. 18 million tonnes per annum of biomass resource available. This resources 452 could be put to multiple uses depending on national priorities. For example, increasing the national 453 herd to support food independence and increased exports, or alternatively the biomass could be 454 used as a resource for energy production through routes such as anaerobic digestion (Prochnow et 455 al., 2009; McEniry et al., 2013).

456 Scenario E present a simple scenario of changes in grassland management practice across GB that 457 considers how policy might be designed to reflect differing regional priorities. The scenario of 458 improved grassland reversion in upland regions considers a policy focused on mechanisms to 459 support farmers for the delivery and protection of other ecosystem services within systems that may 460 be particularly challenging from a production perspective. These include protection of water quality 461 and carbon stocks, and in certain regions maintenance of landscape characteristics. In scenario E, 462 grassland production would shift to more intensively managed lowland regions to maintain total GB 463 grassland production.

464 5 Conclusions

DMYs were calculated using meta-models at 1 km² grid resolution for different grassland systems in 465 the UK and then projected to the future (2010s to 2050s) accounting for climate change, rising 466 467 atmospheric [CO₂] and technological progress under low and medium emission scenarios. National baseline productivities (1970s to 1980s) of 10.5, 7.8 and 2.6 t/ha adjusted to benchmark 468 469 productivities (2010) of 12.5, 8.7 and 2.8 t/ha on temporary, permanent and rough-grazing 470 grassland, respectively. Future yield increase will mainly come from technological innovation and 471 rising atmospheric $[CO_2]$ and yield increments are likely to be larger on temporary than on 472 permanent grassland, with little change on rough-grazing. Projected grassland DMY could reach 15.5 and 9.8 t/ha on temporary and permanent grassland by 2050 under medium CO₂ emission scenario, 473 474 respectively. Maps display the regional concentration of grassland productivity and total biomass 475 availability at 1 km² grid for GB based on the 2010 survey. Recent decline of N application to sub-476 optimal N rates has likely resulted in productivity gaps of ca. 40% on improved grassland. Closing 477 some of these productivity gaps can either lead to additional biomass availability or spare some of 478 these grasslands for other uses. Scenarios show that intensification of lowland grasslands can 479 outweigh the reversion of upland grassland areas to rough grazing or low intensity permanent 480 pastures.

481 Acknowledgements

This work was funded by the UK Engineering Physical Sciences Research Council (EPSRC), 482 483 through grant EP/K036734/1 "Bioenergy value chains: Whole systems analysis and 484 optimisation" (Supergen Bioenergy Challenge), and the Biotechnology and Biological 485 Sciences Research Council (BBSRC) through its Institute Strategic Programme Grant 486 "Cropping Carbon" (grant number BB/I014934/1) at Rothamsted Research. The authors are grateful for the provision of data from the e-RA database to validate long-term grassland 487 yields using the Park Grass Long-term Experiments National Capability (LTE-NCG), which is 488 489 supported by the BBSRC and the Lawes Agricultural Trust.

490 Supplemental Material

491 Tables

- 492 **Table S1a:** The range and mean percentage of dry matter yield (DMY) increase due to CO₂
- 493 fertilisation effect in selected reports found on perennial ryegrass (Lolium perenne).
- 494 **Table S1b:** The measured decadal mean atmospheric [CO₂] (part per million by volume:
- 495 ppm) and projected atmospheric [CO₂] by the BERN carbon cycle model under low and
- 496 medium CO_2 emission scenarios ending in decades from 1970s to 2050s.
- 497 **Table S2:** The applied percentage increase (f_{CFE}) above the baseline DMY due to fertilisation
- 498 effect of increased [CO₂] in the atmosphere on all grasslands in1990s to 2050s in the UK.
- Table S3a: Estimated annual percent increases in various reports in potential and the on farm DMY in grasslands of perennial ryegrass attributed to technological progress.
- Table S3b: The applied percentage increase above the baseline DMY due to technological
 progress on all grasslands from the 1990s to 2050s in the UK, that is, f_{TP} in Equations 1 and
 2.
- Table S4: Percent change in the future decades under low and medium CO₂ emission
 scenarios relative to the baseline climate scenario (1961-1990) in seasonal precipitation (P),
 global radiation (R_g) and mean seasonal air temperatures (T_{air}).
- Table S5: Total availability of dry biomass in million tonnes (M t) in the UK based on the
 areas reported for temporary (TG), permanent (PG) and rough-grazing (RG) grasslands in
 2010 (Defra, 2015) and using the benchmark DMY calculated for the 2010s (Table 2).

- 510 **Table S6**: Distribution of nitrate vulnerable zones in Great Britain (GB) used in the scenario
- analysis of grassland intensification in cases of changing PG into TG and RG into PG

512 Figures

- 513 Figure S1: National average annual N applied amount (N kg/ha) on temporary and
- 514 permanent grassland from 1992 to 2015 in Great Britain (Defra, 2016b).
- 515 Figure S2: Annual trends in total grassland area, total number of cattle and calves and of
- 516 sheep and lamb in the UK (https://www.gov.uk/government/statistical-data-
- 517 sets/agriculture-in-the-united-kingdom). Data on total number of sheep and lamb were not
- 518 available before 1996.

520 Figure captions

521 Figure 1: Yield gap (YG) exemplified for temporary grassland (TG) derived from the response curve of

522 relative dry matter yield (DMY%) to variable N application. The vertical arrows show the reduction of

523 the recommended (300 kg/ha) to the actual N application rate for TG (ca. 100 kg/ha). Response

524 curve was derived from experimental data (Morrison *et al.*, 1980); respective N-fertiliser data were

525 extracted from Fertiliser Manual (Defra 2010) and National Statistics (Defra 2016).

Figure 2: Spatially explicit technology- and CO₂- adjusted dry matter yields (DMYs) on different
 grasslands at 1 km² grid resolution in 2010 in the UK.

528 Figure 3: The technology-and CO₂-adjusted mean national dry matter (DM) yield for temporary (TG),

529 permanent (PG) and rough-grazing (RG) grassland in the UK on the assumption that all available land

had been used as single grassland type (i.e. a "blanket" approach) in 2010-2050s under medium (a)

531 and low (b) emission scenarios.

532 **Figure** 4: Spatially explicit availability of dry biomass (t/km²) for rough-grazing, permanent and

temporary grassland based on the respective grassland areas surveyed in 2010 in Great Britain and

the technology-and CO₂-adjusted DMYs in 2010s (i.e. from **Figure 2**).

535 **Figure 5:** Regional areas (a) and availability of total dry matter (b) at the NUTS (Nomenclature of

536 Territorial Units for Statistics) level 1 based on the digitised areas for temporary (TG), permanent

537 (PG) and rough-grazing (RG) grasslands surveyed in 2010 in Great Britain.

538 **Figure 6** Changes in total dry matter (TDM) production on grassland in Great Britain (tonnes per

year) from 2010 to 2050 under a low CO₂ emission scenario. Scenarios explore: (a) conversion of PG

to RG (Abandonment); (b) conversion of TG to PG (Reversion); (c) conversion of PG to TG (Lowland

541 Intensification); (d) conversion of RG to PG (Upland Intensification). Benchmark TDM production in

542 Great Britain for the 2010s (•) would change with increasing conversion rates of grassland inside (x)

543 and outside (+) of environmental constraints.

- 544 **Figure 7:** Changes in total areas in GB of temporary (TG), permanent (PG) and rough-grazing (RG)
- 545 grasslands with increased percentage of conversion of permanent grassland to rough grazing
- 546 (Abandonment) in upland regions (PG(UL) maintaining total GB grassland dry matter production (*ca*.
- 547 71,000,000 tonnes per annum) through intensification of PG to TG in lowland areas (PG(LL)).
- 548 Productivity in 2050s under low CO₂ emission scenario.

- 550 Tables
- **Table 1:** The weather-governed mean national DMY (t/ha) across the UK as if all available
- 552 land had been used as a single grassland type (i.e. blanket approach) under baseline and
- 553 future climates.

CO ₂ emission	Grassland	Baseline	2020s	2030s	2040s	2050s
	Temporary	10.5	10.5	10.6	10.6	10.6
Low	Permanent	7.8	7.6	7.5	7.4	7.5
	Rough-grazing	2.6	2.5	2.5	2.4	2.4
	Temporary	10.5	10.5	10.6	10.6	10.6
Medium	Permanent	7.8	7.6	7.5	7.4	7.4
	Rough-grazing	2.6	2.5	2.4	2.4	2.3

- 555
- Table 2: The technology- and CO₂-adjusted national benchmark mean DMY (t/ha) across the
 UK in accordance with surveyed grassland areas for each grassland type in 2010 overlaid
- with the meta-model calculated DMY from 2010-2050s.

CO ₂ emission	Grassland	2010s	2020s	2030s	2040s	2050s
scenario						
	Temporary	12.5	13.1	13.8	14.5	15.3
Low	Permanent	8.7	8.9	9.3	9.5	9.8
	Rough-grazing	2.8	2.7	2.7	2.7	2.7
	Temporary	12.5	13.2	13.9	14.7	15.5
Medium	Permanent	8.7	8.9	9.3	9.6	9.9
	Rough-grazing	2.8	2.7	2.7	2.7	2.7

Table 3: The current national on-farm DMY as a proportion of the attainable DMY with
recommended economically optimal N application rates (kg N/ha) as calculated by the
response curve of relative dry matter yield (DMY%) to N application rate (kg N/ha) (Figure 1)
and the consequential yield gap on TG and PG in GB (based on total production; Table S5).

Grassland	Recommended N rate	Actual N rate	DMY% at recommended N rate	DMY% at actual N rate	Fraction of attainable yield	Yield gap 10 ⁶ t yr ⁻¹
Temporary	300	99.1	82.46	45.62	55.3	5.71
Permanent	150	51.6	56.72	34.57	61.0	15.40

- 569 **Table 4:** Scenarios and constraints explored in analyses of the implication of changes in grassland
- 570 management for total grassland dry matter production in Great Britain.

Scenario A: Conversion of PG to RG – this represents reduction of production intensity

(Abandonment Scenario). Land use change is not constrained by any factors.

Scenario B: Conversion of TG to PG – again this represents a reduction of production intensity (Reversion Scenario). Land use change is not constrained by any factors.

Scenario C: Conversion of PG to TG – mainly a Lowland Intensification Scenario. Constraints on conversion are imposed where sufficient land is available to meet conversion targets such that preference is given to areas where the average slope is <15% (limit for machinery) and for areas outside NVZs (given that intensification calls for additional fertiliser input).

Scenario D: Conversion of RG to PG – mainly an Upland Intensification Scenario. Constraints on conversion are imposed where sufficient land is available to meet conversion targets such that preference is given to areas with an average height below 250m, where the average slope is <15% (limit for machinery) and for areas outside NVZs (given that intensification calls for additional N fertiliser input).

Scenario E: Abandonment of the uplands – this represent both a reduction of productivity in upland areas (defined as those above 250m) with conversion of improved grassland (PG) to seminatural grassland (RG), and an intensification of lowland areas with conversion of PG to TG. Here, the scenario was designed to hold grassland production (tonnes per year) stationary through changes in land use. Constraints were altitude, slope (average of less than 15%) and in lowland areas avoidance of areas considered to be in NVZs. The latter constraint was applied as conversion from PG to TG would entail increased N fertiliser inputs.

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