The large mean body size of mammalian herbivores explains the productivity paradox during the last glacial maximum

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GPP (gC m⁻² yr⁻¹)

Supplementary Figure 1. Modelled present-day grassland fractional cover and GPP. (a) Simulated fractional cover of grass for PD (1960-2009 mean). (b) Simulated mean annual GPP during 1960-2009 for grass-dominated grid cells (simulated grass coverage larger than 50% at 2° resolution). (c) Mean annual GPP during 1999-2008 from the data-driven MTE $GPP¹$ with a spatial resolution of 0.5°, shown only for the pixels classified as grasses and shrubs in the SYNMAP land cover product².

Supplementary Figure 2. Modelled large grazer biomass density for present-day, excluding human land use, according to the Anthromes version 2 map³ which separated three major categories: Used, Seminatural, and Wild. The fractional covers of the Used category **(a)** or Used + Seminatural categories **(b)** are subtracted from the simulated potential grazer density as shown in Fig. 2a.

Supplementary Figure 3. Sensitivity of grazer biomass density to temperature and rainfall for the two grid cells corresponding to the study areas in Zimov et al.⁴ (a) and **Mann et al.**⁵ (b). The black dots indicate the results forced by the original climate forcing (labelled in each subplot: MAT: mean annual temperature; MAP: mean annual precipitation including rainfall and snowfall; MAR: mean annual rainfall). The colored dots indicate the results if the climate forcing is modified: red: temperature at each time step increase by 1 or 2 °C; blue: rainfall at each time step (only when temperature >0 °C) multiplied by 1.5 or 2; green: combined increase in temperature and rainfall.

Supplementary Figure 4. The same figure as Fig. 4a but separated in 2-D.

Supplementary Figure 5. Relationship between grass NPP and grazer biomass under different mean annual temperatures (MATs). Points represent modelled results across all grid cells on land for present-day (PD, a), and for the LGM (b and c) prescribed with different grazer body size (A) for the two runs, 500 and 180 kg ind.⁻¹, the former derived from the reconstructions by Mann et al.⁵ and Zimov et al.⁴ based on the relative bone abundance of different taxa, the latter the same as that for PD in the northern hemisphere according to Hatton et al.⁶.

Supplementary Figure 6. Simulated grazer biomass density for the LGM with different prescribed body sizes. (a) The same as Fig. 3c except for the globe, namely, body size is prescribed as 500 kg ind.⁻¹, according to reconstructions by Mann et al.⁵ and Zimov et al.⁴ (b) Body size is set to 180 kg ind.⁻¹ as a sensitivity test, the same as present-day. Grey areas indicate ice sheet during the LGM using the map from the PMIP3 protocol.

Supplementary Figure 7. Correlation of body mass and dry matter intake rate for mammalian herbivores. The data were compiled in Clauss et al.⁷ Blue circles indicate all the 93 herbivorous mammals compiled in ref⁷, while red circles indicate the subset of 46 large herbivores with body mass larger than 10 kg. The allometric regression equation of the subset of large herbivores gives a higher exponent (0.85).

Supplementary Table 1. Herbivore biomass density of protected areas in Africa and Asia, and ecosystems in North America, calculated from the raw data provided by Hatton et al.⁶ The data for another 15 ecosystems in North America⁸ (Messier, 1994) cited in Hatton et al.⁶ were not used in this study, since they only included one herbivore species (moose).

Supplementary Table 2. Present-day (PD) and pre-industrial (PI) global and regional total grazer biomass (unit: million tonnes live weight) simulated by ORCHIDEE-MICT. The model simulates natural vegetation without anthropogenic land use, and thus potential values. The gridded fractional covers of the categories "Wild" and "Seminatural" from Antromes version $2³$ for the year 2000 and 1900 were multiplied to the PD and PI potential values, in order to estimate the reduction of wild large grazers due to human land use, with the relative reductions listed in parenthesis.

Supplementary Note 1. Subtraction of tropical rainforest from simulated potential large grazer density

The current model, lacking an explicit representation of browsers and mixed feeders, produced a significant distribution of potential large grazers in densely forested areas, in particular in the tropical rainforests (Supplementary Fig. 8a). This is because the grazing module is primarily driven by grass productivity, and the grasses in tropical forested areas, although with a very small simulated fractional land cover (ca. 10%), are highly-productive under the favourable climatic conditions and can still support some grazers (ca. 1000 kg $km⁻²$). Supplementary Fig. 8b) in the model. In reality, large herbivores in tropical rainforests are mainly generalist feeders like elephants, feeding on both grass and browse plants⁹; whereas conventional grazers do not usually live in the rainforest (with a few exceptions like capybaras in South America). To alleviate this model drawback, we subtracted the fractional covers of tropical rainforest, according to the empirically-derived potential natural vegetation map¹⁰, from the direct model output of potential grazer density (Supplementary Fig. 8a), and thus derived Fig. 2a and the total regional/global values listed in Supplementary Table 1. We did not do similar subtractions for boreal and temperate forests, because: 1) these forests are not totally closed due to disturbances from extreme weather events like drought, frost and storms, fires, pathogen outbreaks^{11,12}, and potentially, large herbivores. The fractional tree cover in these forests seldom exceeds 80%, according to the remote sensing-derived product of vegetation continuous field¹³; and 2) some large grazer species can indeed live in the northern forests, such as aurochs¹⁴, the extinction of which has been attributed to human hunting and expulsion¹⁵. Still, our model may have overestimated grazer density in nontropical dense forests, because most large herbivore species inhabiting forests are mixed feeders and browsers, which are missing in the current model.

For the LGM results, no such subtraction was applied either, considering the very limited distribution of dense forests (e.g. areas with modelled tree cover > 0.8 accounted for only 6% of total land area for the tropics, in contrast to 42% in the present-day simulation).

Supplementary Figure 8. (a) Modelled potential large grazer biomass density for presentday (1960-2009 mean), without post-processing. **(b)** Relationship between modelled grazer biomass density and tree cover for present-day. Grid cells in tropical and extratropical regions were divided into tree cover bins of 0.04, with the circles representing median values and the error bars indicating $25th$ - $75th$ percentiles for each bin. The size of each circle is proportionate to the number of pixels in each bin.

Supplementary Note 2. Conversion from the modelled plant functional types (PFTs) into mega-biomes

In order to facilitate comparison between modelled LGM vegetation distribution and reconstructions based on pollen and plant macrofossil data from BIOME 6000 version 4.2 (available online: http://www.bridge.bris.ac.uk/resources/Databases/BIOMES_data), we used a method similar to that of Prentice et al.¹⁶ and Kageyama et al.¹⁷ to convert modelled vegetation properties into the 9 "mega-biomes" provided by BIOME 6000. The algorithm is shown in Supplementary Fig. 9: firstly, the global vegetation is divided between cold biomes and the rest, with the threshold GDD5 (annual growing degree days above 5° C) equalling to 350 K days; secondly, the separation between forest/savanna, dry grassland/shrubland, and desert (or between forest/dry tundra and tundra) depends on the modelled total foliage projective cover (*FPC*), which is a function of both fractional cover and leaf area index (*LAI*) of each PFT ($FPC = V \times (1 - e^{-0.5 \times LAI})$); thirdly, forest and savanna (or forest and dry tundra) are separated by the average height of all existing tree PFTs; finally, within the forest, the dominance of particular tree PFTs is used to separate tropical, temperate and boreal forests. After the conversion, only one biome is assigned to each grid cell. This conversion algorithm makes use of not only modelled PFT fractional covers, but also *FPC* and average height, which relates to modelled *LAI* and woody biomass and ultimately relates to vegetation productivity and allocation in the model. Thus it enables the distinction between the relatively more productive dry tundra (corresponding to graminoid and forb tundra, see Table 3 in Harrison and Prentice¹⁸) and the low productive tundra (corresponding to cushion forb tundra, erect dwarf shrub tundra, etc.) in Siberia and Alaska.

Supplementary Figure 9. Algorithm to convert the modelled PFT properties into the 9 megabiomes provided by BIOME 6000, adapted from Prentice et al.¹⁶ and Kageyama et al.¹⁷

Supplementary discussion. Impacts of grazing on land carbon cycle during the LGM.

As shown in Fig. 5, total aboveground grass consumption by grazers was 1.7 Pg C yr^{-1} , or 3.2% of the total body weight in the unit of dry matter intake per day, which is within the empirical range for domestic livestock $(2-4\%)^{19}$. Modelled global mean ratio of grazer-tograss biomass was 0.5% (in g C m⁻² : g C m⁻²), comparable to the estimate of 0.8% for the ratio of terrestrial herbivore-to-primary producer biomass by Harfoot et al.20 using the Madingley ecosystem model, knowing that their result included all plant-eating animals, not only the large mammalian grazers considered in this study. Our result is also within the range of an empirical estimate of $1.1\pm0.7\%$ for the herbivore-to-primary producer biomass ratio in temperate and tropical grasslands 21 .

 -0.2 -0.16 -0.12 -0.08 -0.04 0.0 0.04 0.08 0.12 0.16 $\overline{0.2}$ Fractional cover

Supplementary Figure 10. Impacts of grazing on tree cover and grassland productivity at the LGM. **(a)** Difference of tree fractional cover between LGM-withGrazer and LGM-noGrazer.

(b) Ratio of grass NPP (gC m-2grassland yr-1) between LGM-withGrazer and LGM-noGrazer. In order to separate the effect of changing grass fractional cover, we plotted grass NPP per unit area of grass instead of per unit area of ground ("grass NPP" elsewhere in this study refers to the latter).

Supplementary Fig. 10 displays the difference in tree cover and grassland productivity between model results with and without grazers. The difference in tree cover showed a general reduction with grazing (Supplementary Fig. 10a), mainly due to the tramplinginduced tree mortality (equation (10) in Methods). In the model, grazers also have an indirect positive impact on the trees through the interaction between fire and vegetation, because grazing reduces grass fuel load and thus the frequency of fires^{22,23}, which leads to smaller fireinduced tree mortalities. The slight increase of tree fractional cover in few grid cells (Supplementary Fig. 10a) corresponded to the areas where grazers favour trees by causing a reduction of fire occurrence that exceeds the negative effects of trampling in the model.

The suppression of woody plants by large grazers and the subsequent alteration in landscape structure has been observed in modern exclosure experiments and paleoecological records²⁴. A remote-sensing observation in Kruger National Park in South Africa shows an average change of woody cover (vegetation > 1 m tall) from 20% to 12%, or 40% reduction, in areas accessible to herbivores, compared to the areas of long-term herbivore exclusions²⁵. Among the herbivores with different body size, elephants have been revealed as the primary agent of treefall in savannas, due to their physical strength and height causing disproportionate mortality of shrubs and maturing trees^{24,26}; while smaller herbivores, especially browsers, increase mortalities of tree saplings and suppress tree regeneration²⁷. Our model results show a general reduction of 5-10% absolute tree fractional cover in tropical and sub-tropical regions with the simulated grazer density during the LGM (Supplementary Fig. 10a), close to the observed reduction in ref^{25} . In contrast, simulations with the LPJ-GUESS model over Africa with a parameterization of wild grazers²³ showed no significant changes in vegetation distribution with and without grazers. This is partly because of the different parameterizations of trampling effect, as we calibrated the trampling-induced tree mortality (equation (10)) to match the mortality caused by elephants²⁸, while in LPJ-GUESS, which did not yet include a herbivore functional type to represent elephants, the trampled area by grazers was used to calculate the decrease of tree saplings²³, which may underestimate the disproportionate effect of elephants compared to the one of smaller wild herbivores²⁶.

Grazing increased grass NPP per unit area of grass in most of the grid cells (Supplementary Fig. 10b), with larger increments in areas of higher grazer biomass density, indicating that the positive effects of grazers on grass NPP in the model, i.e. the regrowth of more productive young leaves after defoliation and the higher photosynthesis capacities (a process simply calibrated from herbivore exclusion experiments to approximate the positive effects associated with accelerated nutrient cycling and traits/composition changes - see Methods), outweighed the negative effect of biomass removal by grazing. The above- to belowground ratio of global grass NPP increased from 1.2 in the LGM without grazers to 1.3 with grazers, due to more allocation of assimilated carbon to leaves to compensate for defoliation in our model²⁹. Such a preferential allocation to the shoot system compared to roots in response to defoliation is supported by experimental evidence³⁰. As for grass standing biomass, total aboveground biomass was slightly smaller with grazers (5.2 Pg C) than without grazers (5.4 Pg C), resulting from intake being not fully compensated by a higher NPP; while belowground biomass increased from 4.2 Pg C without grazers to 6.6 Pg C with grazers due to a higher NPP.

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