

# The uncertain climate footprint of wetlands under human pressure

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Significant climate risks are associated with a positive carbon-temperature feedback in northern latitude carbon-rich ecosystems, making an accurate analysis of human impacts on the net greenhouse gas balance of wetlands a priority. Here, we provide a coherent assessment of the climate footprint of a network of wetland sites based on simultaneous and quasi-continuous ecosystem observations of CO2 and CH4 fluxes. Experimental areas are located both in natural and in managed wetlands and cover a wide range of climatic regions, ecosystem types, and management practices. Based on direct observations we predict that sustained CH4 emissions in natural ecosystems are in the long term (i.e., several centuries) typically offset by CO2 uptake, although with large spatiotemporal variability. Using a space-for-time analogy across ecological and climatic gradients, we represent the chronosequence from natural to managed conditions to quantify the "cost" of CH<sub>4</sub> emissions for the benefit of net carbon sequestration. With a sustained pulseresponse radiative forcing model, we found a significant increase in atmospheric forcing due to land management, in particular for wetland converted to cropland. Our results quantify the role of human activities on the climate footprint of northern wetlands and call for development of active mitigation strategies for managed wetlands and new guidelines of the Intergovernmental Panel on Climate Change (IPCC) accounting for both sustained CH<sub>4</sub> emissions and cumulative CO2 exchange.

wetland conversion | methane | radiative forcing | carbon dioxide

CH<sub>4</sub>, wetlands are unique ecosystems that may potentially generate large negative climate feedbacks over centuries to millennia (1) and positive feedbacks over years to several centuries (2). Wetlands are among the major biogenic sources of

CH<sub>4</sub>, contributing to about 30% of the global CH<sub>4</sub> total emissions (3), and are presumed to be a primary driver of interannual variations in the atmospheric CH<sub>4</sub> growth rate (4, 5). Meanwhile, peatlands, the main subclass of wetland ecosystems, cover 3% of the Earth's surface and are known to store large quantities of carbon (about 500  $\pm$  100 Gt C) (6, 7).

The controversial climate footprint of wetlands is due to the difference in atmospheric lifetimes and the generally opposite directions of CO<sub>2</sub> and CH<sub>4</sub> exchanges, which leads to an uncertain sign of the net radiative budget. Wetlands in fact have a great

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## Significance

Wetlands are unique ecosystems because they are in general sinks for carbon dioxide and sources of methane. Their climate footprint therefore depends on the relative sign and magnitude of the land-atmosphere exchange of these two major greenhouse gases. This work presents a synthesis of simultaneous measurements of carbon dioxide and methane fluxes to assess the radiative forcing of natural wetlands converted to agricultural or forested land. The net climate impact of wetlands is strongly dependent on whether they are natural or managed. Here we show that the conversion of natural wetlands produces a significant increase of the atmospheric radiative forcing. The findings suggest that management plans for these complex ecosystems should carefully account for the potential biogeochemical effects on climate.

potential to preserve the carbon sequestration capacity because near water-logged conditions reduce or inhibit microbial respiration, promoting meanwhile CH<sub>4</sub> production that may partially or completely counteract carbon uptake. Potential variations of the CO<sub>2</sub>/CH<sub>4</sub> stoichiometry in wetlands exposed to climate and landuse change require the development of mitigation-oriented management strategies to avoid large climatic impacts.

The current and future contribution of wetlands to the global greenhouse gas (GHG) budget is still uncertain because of our limited knowledge of the combined and synergistic response of CH<sub>4</sub> and CO<sub>2</sub> land-atmosphere exchange to environmental variability (8, 9) and land-use change (e.g., wetland restoration, drainage for forestry, agriculture, or peat mining) (9, 10). Fluxes of CH<sub>4</sub> and CO<sub>2</sub> from natural wetlands show large spatiotemporal variations (11, 12), arising from environmental interactions controlling the production, transport, consumption, and release of CH<sub>4</sub> (13, 14) as well as the dynamic balance between photosynthetic and respiratory processes that regulate the net accumulation of carbon in biomass and soil. Environmental factors such as variations in air and soil temperature, water table, and substrate availability for methanogenesis lead to a high spatial and temporal variation of CH<sub>4</sub> emissions (15–17). The magnitude of emissions is also controlled by the balance between CH<sub>4</sub> production and oxidation rates and by transport pathways: diffusion (18), ebullition (19), and aerenchyma transport (20).

Climate change influences the GHG balance of wetlands through thawing of the near-surface permafrost (21, 22) and thaw lakes (23), increased nitrogen availability due to accelerated decomposition of organic matter (24), and modification of the water tables with consequent shifts in  $CH_4$  emissions (1, 25). A review of carbon budgets of global peatlands concluded that these ecosystems may remain a small but persistent sink that builds a large C pool, reducing the atmospheric CO<sub>2</sub> burden, whereas the stimulation of CH<sub>4</sub> emissions induced by climate warming may be locally tempered or enhanced by drying or wetting (26). The climate footprint of wetlands can also be affected by anthropogenic activities such as the conversion of natural ecosystems to agricultural or forested land (10, 27). Draining peatlands for forestry may lead to a C loss and reduced CH<sub>4</sub> emissions (10, 26), whereas land use for agriculture typically reduces the  $CH_4$  emissions and increases  $N_2O$  emissions (26).

Several studies have analyzed the impact of northern peatlands on the Earth's radiative budget either by computing the radiative forcing (RF) of sustained CH<sub>4</sub> and CO<sub>2</sub> fluxes (2) or by multiplying the annual ecosystem exchange of CO<sub>2</sub> and CH<sub>4</sub> with the global warming potentials of the two gases (28–30). However, although this latter approach is useful for comparison, its appropriateness in computing the actual RF has been questioned (31–33). An alternative approach for assessing the impact of peatland draining/drying on the RF has been applied by driving an atmospheric composition and RF model with pre- and post-drainage measured fluxes of  $CO_2$ ,  $CH_4$ , and  $N_2O$  (34).

Here, we ask, what is the climate cost of CH<sub>4</sub> emissions compared with the benefit of net carbon sequestration? We assessed this question, using data from a network of wetland observational sites where direct and quasi-continuous CO<sub>2</sub> and CH<sub>4</sub> chamber and eddy covariance measurements are performed. Using the space for time analogy, flux observations at sites with contrasting land cover are combined with a sustained pulse–response model to predict the potential future RF of natural wetlands converted to agricultural or forested land.

### **Results and Discussion**

As the land-atmosphere fluxes of CH<sub>4</sub> and CO<sub>2</sub> in wetlands can be opposite in sign and very different in magnitude, their net impact on the climate system is difficult to assess and predict. In particular, CH<sub>4</sub> emissions from wetlands are continuous and thus add a positive term to the radiative balance (31) that can be partially or totally offset by a sustained carbon sequestration (35). The availability of consistent and simultaneous measurements of ecosystem CO<sub>2</sub> and CH<sub>4</sub> fluxes provides an opportunity to address these issues, using direct observations collected at 29 both natural and managed wetlands located in the Northern Hemisphere (Fig. 1A). Details on site locations, climate, vegetation type, measurement techniques, and yearly/seasonal GHG budgets are reported in SI Text, Site Analysis and SI Text, Measurement Techniques and Gap-Filling Methods (Tables S1–S5).

The trade-off between CH<sub>4</sub> net emission and CO<sub>2</sub> net sequestration in wetlands is evident in Fig. 1B, where most sites are sources of CH<sub>4</sub> (positive ecosystem fluxes) and CO<sub>2</sub> sinks (negative values of net ecosystem exchange, NEE). Given that CH<sub>4</sub> has a relatively short lifetime in the atmosphere (~10 y) compared to CO<sub>2</sub>, the radiative balance of these two gases depends on the timeframe of the analysis. As an example of this dependence, the two red-blue equilibrium lines in Fig. 1B represent the ratio of sustained CO2 and CH4 fluxes that would result in a zero net cumulative radiative balance over 20 y and 100 y. The lines were simulated with a sustained pulse–response model (27) and used in this study also to calculate the RF of management options. The model generates the following flux ratios: -31.3 g and -19.2 g  $CO_2$ - $C \cdot m^{-2} \cdot y^{-1}$  per gram  $CH_4$ - $C \cdot m^{-2} \cdot y^{-1}$  for 20 y and 100 y, respectively. This implies that a continuous emission of 1 g  $CH_4$ - $C \cdot m^{-2} \cdot y^{-1}$  and uptake of 31.3 g  $CO_2$ - $C \cdot m^{-2} \cdot y^{-1}$  would have a positive cumulative RF (warming) for the first 20 y and a negative cumulative RF (cooling) after that. Sites that fall on the right side of the equilibrium lines have a positive radiative budget and those on the left side have a negative radiative budget for the specified 20-y or 100-y timeframe (Fig. 1B). Under the current climate, 59% of arctic and boreal sites' and 60% of temperate sites' observations have a positive radiative balance compared with both 20-y and 100-y equilibrium lines. All but one of the forested wetlands [arctic/boreal (AB)5, AB7, temperate (T)9, and T11] currently have a negative net radiative balance owing to their considerable CO<sub>2</sub> uptake and relatively low CH<sub>4</sub> emissions (Fig. 1B and Fig. S1). Sites located between the two lines have a positive or negative radiative budget, depending on the time span of the analysis (e.g., AB9, AB4, and T8, Fig. 1B).

Changes in the water level in wetlands substantially alter the ratio of CH<sub>4</sub> and CO<sub>2</sub> fluxes. Recent warming and drying in the Arctic has led to increased CO<sub>2</sub> losses from the soil, in some cases switching arctic regions from a long-term carbon sink to a carbon source (36). In other cases, the drying of arctic and boreal wetlands reduces CH<sub>4</sub> emission without generating larger CO<sub>2</sub> emissions, owing to the compensation between accelerated decomposition of organic matter and an increase in net primary productivity (NPP) (37–39). As an example of management impacts, data show that the CO<sub>2</sub> and CH<sub>4</sub> emissions of the site AB3a dropped toward a near zero net radiative budget one year

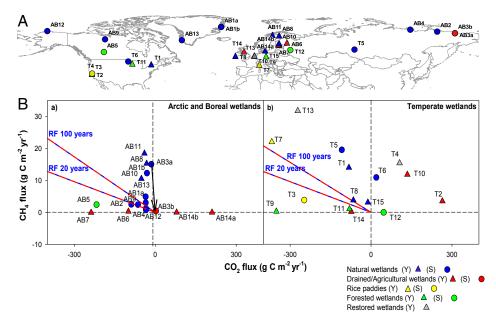


Fig. 1. (A) Global distribution of the 29 measurement sites involved in the present analysis. Triangles represent sites with annual budgets (Y) and circles represent sites with growing season budgets (S). Site IDs and description are reported in SI Text, Site Analysis and Tables S1 and S2. (B) CH<sub>4</sub> vs. CO<sub>2</sub> flux (in grams C m<sup>-2</sup> y<sup>-1</sup>) for arctic/boreal and temperate wetlands relative to the modeled RF equilibrium lines. The two blue-red equilibrium lines represent the ratio of sustained  $CO_2$  and  $CH_4$  fluxes (grams  $CO_2$ -C m<sup>-2</sup> y<sup>-1</sup> per gram  $CH_4$ -C m<sup>-2</sup> y<sup>-1</sup>) that would result in a zero cumulative RF over the period indicated for the line (20 y and 100 y). The slope of the line depends on the constant CO2 uptake rate that would be needed for compensating the positive RF of a unit CH4 emission at a fixed changing time. The arrow pointing down (AB3a to AB3b) indicates the carbon flux change at the specific site after a drainage experiment.

after drainage, whereas sites that were drained a long time ago, such as AB6 and AB7, have large carbon uptake rates (Fig. 1).

Different responses of CH<sub>4</sub> and CO<sub>2</sub> budgets at drained temperate wetlands compared with boreal or arctic wetlands mainly occur due to management activities. At these sites draining for agricultural use suppresses CH<sub>4</sub> emissions and enhances CO<sub>2</sub> efflux owing to accelerated peat degradation, exploitation through grazing, and carbon export (T2, T10, and T14). Conversely, rewetted former agricultural areas or restored wetlands typically emit CH<sub>4</sub> (T13) at a rate that in the short term is not offset by the CO<sub>2</sub> sink (T4). Although most of the studied temperate wetlands have a positive radiative budget, natural forested wetlands show significant carbon uptake driven by high rates of photosynthesis that offsets ecosystem respiration (T9 and T11). The long-term CH<sub>4</sub> and CO<sub>2</sub> balance of these ecosystems thus ultimately depends on the fate of the carbon stored in the trees.

At temperate latitudes, it is interesting to note that the two rice paddies (T3 and T7) that in general are known as major contributors to atmospheric CH<sub>4</sub> (5% of the total emissions and about 10% of the anthropogenic emissions) (3) are also characterized by large CO2 uptake. However, the net GHG budget of this crop is further complicated by significant carbon imports (fertilization) and exports (harvest and dissolved organic carbon). Based on site observations, carbon losses due to harvest account for 67% and 70% of net ecosystem exchange at T3 (40) and T7, respectively, so that the net GHG balance from these ecosystems is strongly influenced by the carbon exports.

To quantify the effect of ecosystem management on the net climate impact of multiple GHG fluxes, we applied an analytical approach based on the concept of radiative forcing. RF is a widely used metric in climate change research to quantify the magnitude of an externally imposed perturbation to the incoming long-wave radiative component of the Earth's atmospheric energy budget (41). Two types of human perturbations were considered: the conversion of natural wetlands to agricultural land and the conversion of natural forested wetlands to managed forested wetlands. Natural wetlands with full annual GHG budget were used as reference and paired in all possible combinations to managed sites (SI Text, Radiative Forcing Calculations and Table S6). Based on the difference between natural and perturbed ecosystems, we calculated the net RF due to CO<sub>2</sub> and CH<sub>4</sub> fluxes for 100 y, using a sustained pulseresponse model (27) (SI Text, Radiative Forcing Calculations). The contribution of N<sub>2</sub>O fluxes to the RF was accounted for only in agricultural sites (AB6, AB14a,b, T10, and T14) where significant emissions of this GHG can be observed (3).

Losses of carbon due to harvest and natural disturbances (e.g., mainly fires, wind throw, and pests) were also taken into account in the RF calculation, either in the form of annual harvest (for agricultural land) or after each rotation for wood harvest, and assumed every 100 y for natural disturbances in forested wetlands (42-44). It was assumed that all of the removed biomass was emitted into the atmosphere as CO<sub>2</sub> during the same year. The results of the RF simulations (Fig. 2) are thus dependent on the ecosystem and management type. Results show that at all timescales the net effect of GHG emissions in arctic and boreal natural wetlands converted into agricultural sites (Fig. 2A) is a large positive RF, whereas the conversion of drained wetlands into energy crops (AB6) results in a minor negative RF for the 100-y simulations. The temperate wetlands (Fig. 2B) that were converted into agriculture sites showed, in general, a positive RF with a large spread among sites induced by management intensity [e.g., intensive (T10) vs. extensive (T14) grazing]. Given that the carbon balance of forest ecosystems largely depends on the fraction of harvested biomass, we carried out an uncertainty analysis by perturbing the harvest rate of the accumulated NPP according to two Gaussian distributions for natural (50  $\pm$  10%, observed harvest rate at AB7) and managed (67  $\pm$  10%) (45) sites, respectively (SI Text, Radiative Forcing Calculations). To evaluate the uncertainty generated by our assumptions, NPP was estimated with two alternative methodologies: (i) applying average ratios of NPP/gross primary productivity derived from the partitioning of the observed NEE (46), based on a recent meta-analysis (NPP/GPP = 0.39 and 0.49 for boreal and temperate forests, respectively) (47), and (ii) summing the observed NEE to the soil respiration rates

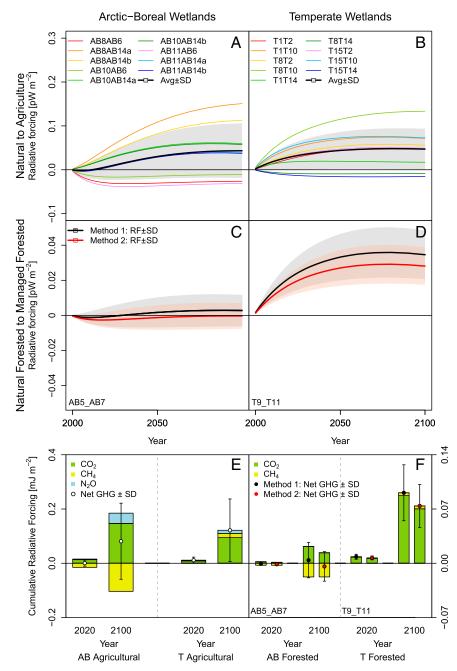


Fig. 2. Trends of radiative forcing (RF, period 2000–2100) for paired sites and ecosystem types. (A and B) Net RF for CO<sub>2</sub>, CH<sub>4</sub>, and N<sub>2</sub>O in natural wetlands converted to agricultural land. (C and D) Net RF for the conversion of natural forested wetland to managed forests (AB5 $\rightarrow$ AB7 and T9 $\rightarrow$ T11). For each of the two pairs an uncertainty analysis on the effect of the harvest rate is presented. (E and E) Cumulative RF of individual gases at 20 y and 100 y for all site pairs, with their net RF (circles E SD). The forcing units refer to the mean global impact of 1 m<sup>2</sup> of wetland area (E Analysis and Tables S1 and S2.

reported in the *IPCC Wetland Supplement* for natural and managed wetlands (48).

Results for the boreal site pair (AB5 $\rightarrow$ AB7) show that the confidence intervals cross the x axis and therefore the ultimate sign of the RF depends on the harvest rate. In addition, with both methods used for the calculation of NPP, at average harvest rates the RF is not statistically different from zero (Fig. 2C). In contrast, for the temperate site pair (T9 $\rightarrow$ T11) RF is positive, independently of the management intensity and of the applied methodology (Fig. 2D). Our analysis demonstrates that, to assess the RF of wetland management, both CH<sub>4</sub> fluxes and the

concomitant changes in  $CO_2$  emissions have to be accounted for. This is especially true at the decadal timescales for boreal wetlands converted to forest or agricultural land (Fig. 2 E and F).

# Conclusions

The recent availability of simultaneous and continuous ecosystem observations of  $CH_4$  and  $CO_2$  fluxes in wetlands provides fundamental insights into the climate footprint of these ecosystems to support the development of sustainable mitigation strategies based on ecosystem management. Careful accounting of both  $CO_2$  and  $CH_4$  fluxes (and  $N_2O$  fluxes where significant) is essential for an

accurate calculation of the climate impact of wetlands. We also stress the importance of direct and quasi-continuous chamber or eddy covariance flux measurements over annual timescales for the observation of ecosystem responses to environmental drivers and management (e.g., flooding, drainage, and land use change) that may be missed with intermittent manual chamber measurements.

The net GHG budget of these ecosystems is spatially and temporally variable in sign and magnitude due to the generally opposite direction of CH<sub>4</sub> (emission) and CO<sub>2</sub> (uptake) exchange and, therefore, can be easily altered by both natural and anthropogenic perturbations (SI Text, Site Analysis and Table S3). Management and land use conversions in particular play a critical role in determining the future GHG balance of these ecosystems. Our results prove that management intensity strongly influences the net climate footprint of wetlands and in particular the conversion of natural ecosystems to agricultural land ultimately leads to strong positive RF. These considerations suggest that future releases of GHG inventories based on IPCC guidelines for wetlands should indeed address the relationship between the fluxes of CH<sub>4</sub> and CO<sub>2</sub>, the management intensity, and the land use/land cover change on the net GHG balance as well as on the RF of these complex ecosystems.

### **Materials and Methods**

This study is based on measurements of net ecosystem exchange of CO2 and CH<sub>4</sub> trace gas exchange performed with eddy covariance and/or chamber methods (SI Text, Site Analysis and Tables S1 and S2). Most of the included study sites are part of FLUXNET, an international network of sites where energy and GHG fluxes are continuously monitored with a standardized methodology (49). The RF due to wetlands management was calculated for CO<sub>2</sub>, CH<sub>4</sub>, and, where significant (agricultural sites AB6, AB14a,b, T10, and T14), N<sub>2</sub>O fluxes, using a sustained pulse-response model (27). Annual concentration pulses were derived from the flux differences between pristine wetlands, taken as reference, and wetlands converted to either cropland or forests.

Natural-managed site pairs were defined for all possible combinations of similar ecosystem types with available annual CO2 and CH4 budgets within each climatic or management-related category (arctic/boreal or temperate regions, cropland or forest; SI Text, Radiative Forcing Calculations and Table S6). These site pairs were selected to represent plausible and representative wetland conversions, and thus part of the sites were excluded from this analysis (e.g., rice fields). In the simple pulse-response RF model used here the perturbations to the tropospheric concentrations of CO<sub>2</sub>, CH<sub>4</sub>, and N<sub>2</sub>O

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were derived by integrating the effect of a series of consecutive annual mass pulses that correspond to the mean annual balances of these gases (27) (SI Text, Radiative Forcing Calculations). Different radiative efficiencies and atmospheric residence times of CO<sub>2</sub>, CH<sub>4</sub>, and N<sub>2</sub>O were taken into account, as well as the annual variation of their background concentrations. RF was calculated for a 100-y period starting from 2000, assuming that the background concentrations increase as in the A2 scenario of the Special Report on Emissions Scenarios (SRES). The RF methodology is described in detail in SI Text, Radiative Forcing Calculations. The data reported in this paper are tabulated in SI Text and part is archived in the FLUXNET database and/or published in peer-review articles as shown in SI Text references.

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