

## RESEARCH ARTICLE

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## Key Points:

- N cycle dynamics in LPJ-GUESS improve predictions mainly in boreal forests
- Low absolute effect of N deposition on C sequestration in boreal forests
- N deposition contributes 19% to recent and 24% to historical land C sink

## Supporting Information:

- Supporting Information S1

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## Low historical nitrogen deposition effect on carbon sequestration in the boreal zone

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**Abstract** Nitrogen (N) cycle dynamics and N deposition play an important role in determining the terrestrial biosphere's carbon (C) balance. We assess global and biome-specific N deposition effects on C sequestration rates with the dynamic global vegetation model LPJ-GUESS. Modeled CN interactions are evaluated by comparing predictions of the C and CN version of the model with direct observations of C fluxes from 68 forest FLUXNET sites. N limitation on C uptake reduced overestimation of gross primary productivity for boreal evergreen needleleaf forests from 56% to 18%, presenting the greatest improvement among forest types. Relative N deposition effects on C sequestration (dC/dN) in boreal, temperate, and tropical sites ranged from 17 to 26 kg C kg N<sup>-1</sup> when modeled at site scale and were reduced to 12–22 kg C kg N<sup>-1</sup> at global scale. We find that 19% of the recent (1990–2007) and 24% of the historical global C sink (1900–2006) was driven by N deposition effects. While boreal forests exhibit highest dC/dN, their N deposition-induced C sink was relatively low and is suspected to stay low in the future as no major changes in N deposition rates are expected in the boreal zone. N deposition induced a greater C sink in temperate and tropical forests, while predicted C fluxes and N-induced C sink response in tropical forests were associated with greatest uncertainties. Future work should be directed at improving the ability of LPJ-GUESS and other process-based ecosystem models to reproduce C cycle dynamics in the tropics, facilitated by more benchmarking data sets. Furthermore, efforts should aim to improve understanding and model representations of N availability (e.g., N fixation and organic N uptake), N limitation, P cycle dynamics, and effects of anthropogenic land use and land cover changes.

### 1. Introduction

Nitrogen (N) availability plays a central role in driving plant productivity [Field and Mooney, 1986; Kergoat et al., 2008; LeBauer and Treseder, 2008; Matear et al., 2010; Fisher et al., 2012]. N deposition is strongly affecting carbon (C) cycling and storage due to stoichiometric controls, potentially enhancing productivity and growth, or causing chemical imbalances if exceeding N demands [Aber et al., 1998]. From experimental and monitoring studies, we know that historical increases in atmospheric N deposition in industrialized regions such as North America and Europe significantly contribute to the historical and present terrestrial C sink, particularly enhancing plant growth in N-limited areas [Sutton et al., 2008; De Vries et al., 2009; Thomas et al., 2010; Fleischer et al., 2013]. In concert with rising atmospheric carbon dioxide (CO<sub>2</sub>) levels, climate warming, and land use changes [Churkina et al., 2010; Jain et al., 2013], N deposition is a major determinant of ecosystem productivity and functioning [Galloway et al., 2003, 2008; Gruber and Galloway, 2008] and the global climate system [Thornton et al., 2009; Arneeth et al., 2010; Erisman et al., 2011; Zaehle et al., 2011].

The interaction between forest productivity and N cycle dynamics differs broadly among forest biomes. Strong control of N availability on productivity and growth is believed to play a central role in boreal and temperate forests [Jarvis and Linder, 2000; Fleischer et al., 2013; Smith et al., 2014], due to the strong temperature control on N mineralization and general limiting N in soils [Vitousek and Howarth, 1991]. Temperate ecosystems

experience lower degrees of N limitation due to historically high rates of N deposition [Högberg, 2011], potentially causing N saturation at regional scale [Aber *et al.*, 1998; Brumme and Khanna, 2008]. Tropical forests are believed to be least affected by N cycle dynamics due to more prevailing phosphorous (P) limitation of old weathered soils in tropical regions [Vitousek *et al.*, 2010; Cleveland *et al.*, 2011; Castanho *et al.*, 2013].

The significance of coupled N and C cycles is increasingly recognized as N dynamics become progressively incorporated into global C cycling models [Sokolov *et al.*, 2008; Jain *et al.*, 2009; Churkina *et al.*, 2010; Esser *et al.*, 2011; Wang *et al.*, 2010; Zaehle and Friend, 2010; Smith *et al.*, 2014]. Fertilization experiments and modeling studies point toward an N deposition effect range of 15–40 kg C sequestered per kilogram of N deposited in temperate and boreal forest sites [De Vries *et al.*, 2009; Butterbach-Bahl *et al.*, 2011; Erismann *et al.*, 2011]. Also, in tropical forests, positive growth responses to N availability have been measured [LeBauer and Treseder, 2008], although the number of studies is very limited compared to those in temperate and boreal forests. While it is evident that N cycle dynamics have the potential to alter the spatiotemporal distribution and magnitude of the terrestrial C sink [Le Quéré *et al.*, 2013], the relative importance of CN interactions, including the precise contribution of N deposition on the past and future C sink, is not yet well constrained at global and regional scales [Zaehle *et al.*, 2010; Wassen *et al.*, 2013; Jain *et al.*, 2013; Wårlind *et al.*, 2014].

Discrepancies can partly be ascribed to the fact that CN interactions vary in time and space due to the heterogeneity of underlying factors influencing the fate of C and N in ecosystems, e.g., edaphic characteristic, forest age, nutrient deposition load, microbial and plant N demands, and plant C allocation strategies [Janssens and Luysaert, 2009; Högberg, 2011]. These interactions result in large local and regional variations in how N availability relates to forest productivity. Fertilization experiments are furthermore not directly translatable to real-world scenarios, while observational studies are inevitably hampered by the challenge to separate effects of N deposition from other confounding factors [Fleischer *et al.*, 2013; Sutton *et al.*, 2008]. Not least in importance, we lack essential knowledge on the magnitude of acting drivers of key processes in the N cycle, such as N fixation or denitrification, which are generally too simplistically represented in process-based ecosystem models [Zaehle and Dalmonech, 2011; Wårlind *et al.*, 2014].

One such ecosystem model, the global dynamic vegetation model (DGVM) LPJ-GUESS [Smith *et al.*, 2001; Sitch *et al.*, 2003; Smith *et al.*, 2014], has been widely applied at regional and global scales to address questions of ecosystem function in response to environmental changes [Morales *et al.*, 2005; Jung *et al.*, 2007; Smith *et al.*, 2008; Hickler *et al.*, 2008, 2012; Ahlström *et al.*, 2012; Wårlind *et al.*, 2014]. An original feature of LPJ-GUESS is that it includes vegetation dynamics and stochasticity, allowing biome shifts and disturbance regimes to be simulated. Various aspects of C and N cycle dynamics in LPJ-GUESS have been evaluated by Smith *et al.* [2014], such as site-scale net primary productivity (NPP) and the sensitivity of the C cycle to warming and CO<sub>2</sub> fertilization. Highlighting the regional differences in CN interactions, Smith *et al.* [2014] found that N cycle dynamics had little effect on C fluxes globally, but regional patterns have been altered. Temperature and moisture controls on soil organic matter dynamics and N mineralization have reduced productivity in boreal, arctic, and water-limited ecosystems in the midlatitudes. Well-watered temperate ecosystems and the tropics on the other hand were not affected [Smith *et al.*, 2014]. Wårlind *et al.* [2014] have given a first estimate of N deposition effect on the terrestrial C balance using LPJ-GUESS, which induced 55 Pg C to be sequestered from 1850 to 2100.

Our objective is to contribute to the understanding of regional variations of CN interactions and their impacts on C dynamics by (1) extending the evaluation of N cycle dynamics in LPJ-GUESS, using direct FLUXNET observations of C fluxes at the site scale and other independent observations of C pools and key N cycle variables, to assess how N cycle dynamics affect prediction accuracy in different forest types and climate zones, and (2) by quantifying the effect of N deposition on historical C sequestration for different forest types and climate zones, contrasting results from site and global simulations.

We evaluate the simulated daily and annual C fluxes from the C and CN version of LPJ-GUESS with direct observations of C fluxes from 68 FLUXNET forest sites encompassing the world's major forest types. We further evaluate predictions of biomass and soil C pools, as well as foliar N and leaf area index (LAI) as key dynamic variables affecting the C cycle. Due to the regional differences in CN interactions in forest ecosystems, we expect impacts of N dynamics on C flux simulations to differ between sites and forest types. The CN model version is then employed to assess the effect of N deposition on C sequestration, in relative and absolute terms, from site and global simulations. In doing so, we contrast effects between forest types and climate

zones in order to assess regional variations of CN interactions. As detailed above, we expect to see the greatest improvements due to the N cycle inclusion in boreal forests, and consequently the greatest C sequestration response to N deposition. We expect less effects of N cycle dynamics and N deposition in temperate forests and little to no effect in tropical forests.

Site-scale simulations assess the N deposition effect for a particular stand of forest over its lifetime, excluding major disturbances and vegetation composition changes in site simulations. Global simulations, on the other hand, include nonforest ecosystems, disturbances, and changes in vegetation distribution; thus, N deposition effects are expected to be dampened. The combined examination of N deposition effects at site and global scales, to our knowledge, is unique and has the potential to identify differences arising when assessing N deposition at global scale versus upscaling site-scale effects.

## 2. Methods

### 2.1. LPJ-GUESS and the N Cycle

LPJ-GUESS is a process-based global dynamic vegetation model [Smith *et al.*, 2001; Sitch *et al.*, 2003] that has recently been extended to include key N cycling processes and feedbacks between the vegetation and soil C and N cycles [Smith *et al.*, 2014]. LPJ-GUESS predicts vegetation structure and dynamics based on weather, atmospheric CO<sub>2</sub> concentration, N deposition, and soil texture. The model includes 12 plant functional types (PFTs) with varying bioclimatic limits and life traits, determining establishment and competition. Age cohorts of the different PFTs allow realistic population structures to develop, which is a unique feature of LPJ-GUESS in contrast to other models applied at global scale [Zaehle *et al.*, 2014]. A detailed description of the physiological processes and representations of the carbon, water, and energy cycle in LPJ-GUESS are summarized elsewhere [Smith *et al.*, 2001; Sitch *et al.*, 2003; Hickler *et al.*, 2012].

LPJ-GUESS dynamically simulates the N cycle, including plant uptake, allocation, turnover, fixation, mineralization, denitrification, and leaching of N, for which underlying processes have been explained and emerging N fluxes and stocks have been evaluated in detail by Smith *et al.* [2014]. N input originates from biological N fixation, empirically simulated as a function of annual evapotranspiration [Cleveland *et al.*, 1999] and N deposition [Lamarque *et al.*, 2010], given as dry and wet depositions. N is lost from the ecosystems via leaching and a simplified representation of denitrification [Thomas *et al.*, 2013]. Interactions between the C and N cycles in LPJ-GUESS include (1) dependency of photosynthesis and plant respiration on leaf/plant tissue N, (2) limitation of decomposition by N availability, (3) dependency of shoot and root C allocation on the C:N ratio of these tissues, and (4) limitation of N uptake by fine root mass. The calculation of foliar N concentrations and C:N ratios of plant tissues and soil compartments allows N to impose constraints on productivity, respiration, and C allocation.

### 2.2. FLUXNET Data

FLUXNET is a global network of sites where the ecosystem carbon, water, and energy exchanges are continuously monitored by the eddy covariance methodology [Baldocchi *et al.*, 2001]. FLUXNET data have become a benchmark for ecosystem models due to their high temporal resolution and relatively broad regional coverage [Medlyn *et al.*, 2005b; Friend *et al.*, 2007; Williams *et al.*, 2009]. Observations from 68 forest FLUXNET sites (La Thuile data set, Table A1) [Baldocchi *et al.*, 2001] from 1995 to 2008 were compiled, resulting in 226 site years with 1 to 9 site years per site. The sites represent a diverse range of forest types and climate zones between 68.4°N and 10.1°S with N deposition rates from 1.5 to 21.8 kg N ha<sup>-1</sup> yr<sup>-1</sup> [Lamarque *et al.*, 2010]. The dominant forest types in the data set are boreal evergreen needleleaf forests (BNE) ( $n = 28$ ), temperate deciduous broadleaf forests (TeBS) ( $n = 15$ ), and temperate evergreen needleleaf forests (TeNE) ( $n = 13$ ), mainly situated in Europe, the Northern U.S. and Canada (Table A1). FLUXNET sites measure half-hourly biosphere-atmosphere C fluxes at the ecosystem scale, simultaneously with meteorological conditions. Daily site meteorology was used as input to LPJ-GUESS. We disregarded site years with incomplete annual meteorological data ( $n < 365$ ), as well as years with more than 20% of daily fluxes missing or flagged as low quality ( $< 0.90$ ) in the FLUXNET La Thuile data set.

FLUXNET sites were originally classified according to PFT and climate, based on recommendations by the International Geosphere-Biosphere Program (IGBP) [Loveland *et al.*, 2000] and the Köppen-Geiger climate classification [Kottek *et al.*, 2006]. The sites were reclassified according to the PFT classification system within LPJ-GUESS [Sitch *et al.*, 2003; Ahlström *et al.*, 2012], covering the following PFTs: BNE = boreal needleleaf evergreen, TeNE = temperate needleleaf evergreen, TeBS = shade-tolerant temperate broadleaf summergreen,

**Table 1.** Overview of Local and Global Simulations Run of LPJ-GUESS, Including Model Version Carbon-Only (C) or Carbon-Nitrogen (CN), Run Code, N Deposition Scenario (“Actual” for Rising N Deposition and “Preindustrial” for Stagnant N Deposition Form the Year 1850), Time Period of Simulations, and Source of Meteorological Input

Version	Run	N Deposition	Simulation Period	Meteorology
<i>Site-Scale Model Simulations</i>				
C	C-Ac-L	--	forest lifetime (since last major disturbance to 2006)	CRU climate <sup>a</sup> , corrected with tower-based meteorology
CN	CN-Ac-L	Actual		
CN	CN-Pi-L	Preindustrial		
<i>Global-Scale Model Simulations</i>				
CN	CN-Ac-G	Actual	1901–2006	CRU climate <sup>a</sup>
CN	CN-Pi-G	Preindustrial	1901–2006	

<sup>a</sup>CRU (Climate Research Unit) climate data [Mitchell and Jones, 2005].

TrBE = tropical evergreen broadleaf. Mixed forests (MF) in FLUXNET do not correspond to a particular PFT in LPJ-GUESS and were classified as potential natural vegetation which included all woody PFTs.

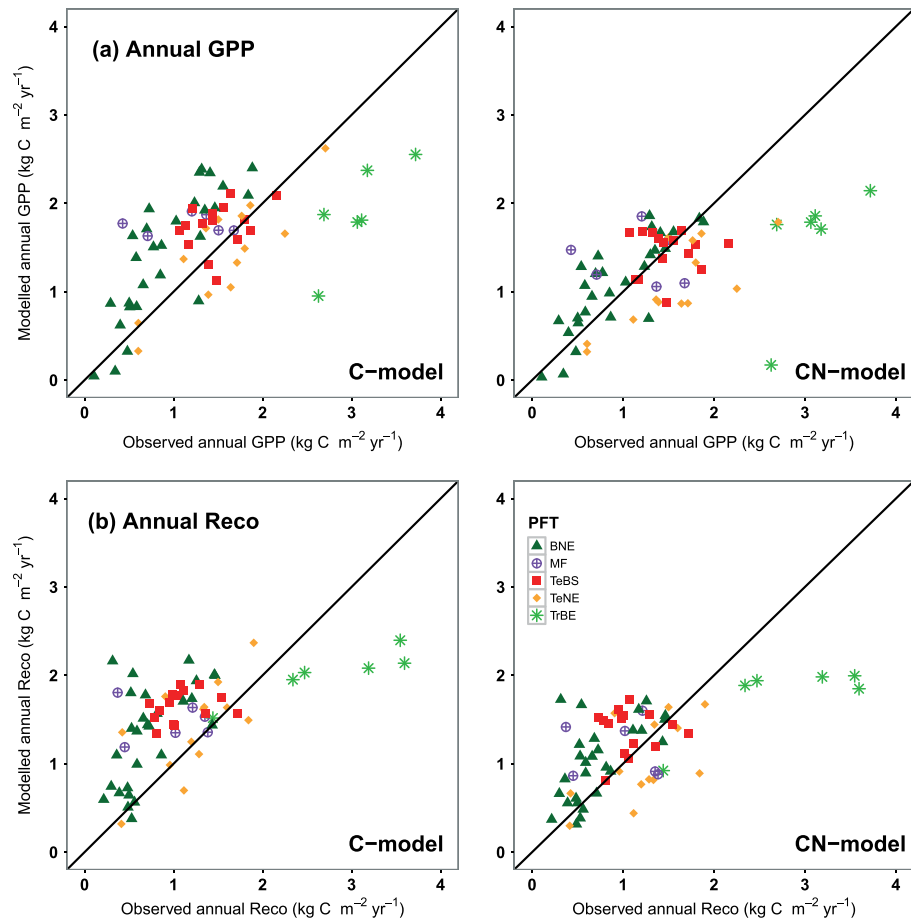
### 2.3. Modeling Protocol

The effects of N cycle dynamics on model performance were tested by running site-scale simulations of the 68 FLUXNET sites using the C and CN version of the model (Table 1). The evaluation setup extends previous work by *Morales et al.* [2005] who tested predictions by LPJ-GUESS and other models of C and water fluxes at 15 European FLUXNET sites. For both model versions, identical modeling protocols for the spin-up and simulation phase, as well as identical climatic drivers and CO<sub>2</sub> concentrations, were employed. To be able to assess the effects of N dynamics only, all parameters shared between the C and CN version were set equal. In particular, the quantum efficiency scalar  $\alpha_a$  was set to the same value (0.7) for all PFTs for both the C and CN version of the model, with further explanation in Text Box A1. The CN version of the model was then employed at site and global scales to assess the effect of N deposition on C sequestration (Table 1). In both cases, this was done by contrasting C sequestration rates of the original run using actual historical N deposition (CN-Ac-L/G) with an additional run where N deposition remained at preindustrial levels (CN-Pi-L/G).

The 500 year long spin-up period, with preindustrial climate, CO<sub>2</sub> and N deposition, ends in 1901 with C and N stocks in equilibrium. This spin-up routine was employed for both local and global simulations. The following input was continuously repeated during the spin-up: monthly CRU TS 3.0 climate data from 1901 to 1930 (Climate Research Unit) [Mitchell and Jones, 2005], preindustrial levels of atmospheric CO<sub>2</sub> from 1901 [McGuire et al., 2001], and for the CN version modeled N deposition estimates from the year 1850 [Lamarque et al., 2010]. The simulation phase commences in 1901 with atmospheric CO<sub>2</sub> concentration and CRU climate representing the historical industrial period [see also *Morales et al.*, 2005; *Thornton et al.*, 2007; *Churkina et al.*, 2010], and the N deposition scenario commences in 1850. This routine follows current best practices in terrestrial vegetation models [Williams et al., 2009].

Site simulations were optimized by passing local information to the model, namely, tower-based meteorology, stand age, and dominant PFT. For sites with discontinuous site years included in the analysis, the nearest 0.5 × 0.5° grid cell of the CRU climate data was detrended and bias corrected against tower-based meteorology. The time of the last major stand-replacing disturbance was extracted from FLUXNET and the literature to derive stand age (see Table A1) [Fleischer et al., 2013]. At that time, a clearance of the forest was simulated, removing all aboveground biomass, after which only the PFT present at the FLUXNET sites was allowed to establish. Sites were excluded from the analysis when the prescribed PFT did not establish due to prescribed bioclimatic limits in LPJ-GUESS. Global simulations were run from 1901 to 2006 at a 0.5 × 0.5° resolution initialized after the spin-up routine. Atmospheric CO<sub>2</sub> [McGuire et al., 2001], CRU climate data [Mitchell and Jones, 2005], and N deposition [Lamarque et al., 2010] are passed as inputs throughout the historical period.

Physiological processes and associated C, N, and water fluxes are simulated on a daily time step and were run over 20 replicate patches at site scale and 5 replicate patches at global scale. Multiple patches represent stochastic variation in growth processes and disturbance events, and modeled values are averages of the resulting vegetation dynamics [see *Smith et al.*, 2001]. Stochastic disturbances, representing total loss of vegetation in a patch, due to e.g. storms or fire, were implemented for a mean interval of 100 years for site and global simulations (at site scale not after prescribed stand establishment).



**Figure 1.** Observed versus modeled annual gross primary production (GPP) and ecosystem respiration ( $R_{eco}$ ), averaged per forest site ( $n = 68$ ), in  $\text{kg C m}^{-2} \text{yr}^{-1}$  for both (left) the C version and (right) the CN version of LPJ-GUESS; symbols reflect the PFT classification of LPJ-GUESS; see legend.

#### 2.4. Model Evaluation

We evaluated site simulations per PFT against observations for the following annual C fluxes: gross primary productivity (GPP), representing total ecosystem carbon uptake by photosynthesis; ecosystem respiration ( $R_{eco}$ ), representing the sum of autotrophic ( $R_a$ ) and heterotrophic ( $R_h$ ) respiration; and net ecosystem C exchange (NEE). NEE is reported following the Intergovernmental Panel on Climate Change convention, with negative values representing an uptake of C by the ecosystem and positive values a loss of C to the atmosphere, i.e.,  $-NEE = GPP - R_{eco}$ . We then evaluated the seasonality of daily GPP and  $R_{eco}$  against observed fluxes per PFT, for which multiple years per site were averaged first. Predictions of foliar N and LAI were compared to a set of ancillary observations taken at FLUXNET sites [Fleischer *et al.*, 2013], representing their seasonal maximum. As consistent information on C pool sizes is not available within FLUXNET, we evaluated predicted biomass and soil C pools using two independent data sets each. For biomass, we use spatially explicit estimates from Ruesch and Gibbs [2008] and estimates for major global biomes in Luysseart *et al.* [2007]. For soil C, we use spatially explicit estimates from the Harmonized World Soil Database (HWSD) [FAO/IIASA/ISRIC/ISSCAS/JRC, 2012] and biome averages from Zinke *et al.* [1984]. Model data agreement was assessed by their root mean square error (RMSE), and the tendency of the model to overestimate or underestimate was measured by percent bias (Pbias) [Maréchal, 2004].

#### 2.5. N Deposition Effect

The historical N deposition effect was assessed for different forest types and climate zones in terms of its relative effect (i.e., C sequestration per unit N deposition, hereafter  $dC/dN$ ) and its absolute effect on C sequestration (i.e., the amount of C sequestered due to N deposition). The relative N deposition effect was derived in an

**Table 2.** Mean and Standard Deviations of Major C Fluxes (GPP,  $R_{\text{eco}}$ , and NEE) From Observations and Models and Error Metrics for C and CN Version (RMSE and Pbias) as Evaluated Against Observations, Computed for All Sites (ALL) and Per PFT<sup>a</sup>

		Observation		C model		CN model		RMSE		Pbias	
		Mean	SD	Mean	SD	Mean	SD	C	CN	C	CN
GPP	ALL	1.38	0.75	1.58	0.58	1.24	0.49	0.65	0.63	14.2	−10.5
	MF	1.15	0.48	1.76	0.11	1.38	0.31	0.76	0.60	53.4	19.9
	TrBE	3.07	0.39	1.89	0.56	1.57	0.70	1.21	1.57	−38.3	−48.7
	TeNE	1.56	0.59	1.45	0.60	1.07	0.48	0.34	0.60	−7.3	−31.3
	BNE	0.92	0.48	1.44	0.70	1.09	0.52	0.66	0.34	56.2	18.3
	TeBS	1.49	0.30	1.74	0.27	1.45	0.25	0.41	0.37	16.3	−3.0
$R_{\text{eco}}$	ALL	1.10	0.70	1.49	0.49	1.18	0.45	0.69	0.56	35.3	7.3
	MF	0.97	0.45	1.48	0.22	1.18	0.33	0.70	0.57	53.1	21.6
	TrBE	2.76	0.84	2.02	0.29	1.76	0.42	0.92	1.13	−27.0	−36.2
	TeNE	1.22	0.46	1.40	0.54	1.03	0.47	0.44	0.45	14.7	−15.6
	BNE	0.73	0.37	1.34	0.56	1.03	0.44	0.76	0.47	83.1	40.8
	TeBS	1.09	0.28	1.65	0.17	1.37	0.25	0.63	0.46	52.3	26.7
NEE	ALL	−0.28	0.36	−0.09	0.23	−0.05	0.16	0.48	0.47	−69.3	−81.1
	MF	−0.18	0.19	−0.28	0.16	−0.20	0.09	0.20	0.17	55.1	10.6
	TrBE	−0.30	0.57	0.13	0.30	0.19	0.30	0.86	0.87	−142.7	−163.7
	TeNE	−0.35	0.33	−0.05	0.12	−0.05	0.08	0.43	0.44	−85.1	−86.6
	BNE	−0.19	0.39	−0.10	0.20	−0.06	0.13	0.41	0.42	−45.9	−67.2
	TeBS	−0.41	0.24	−0.09	0.27	−0.08	0.14	0.52	0.46	−79.1	−81.5

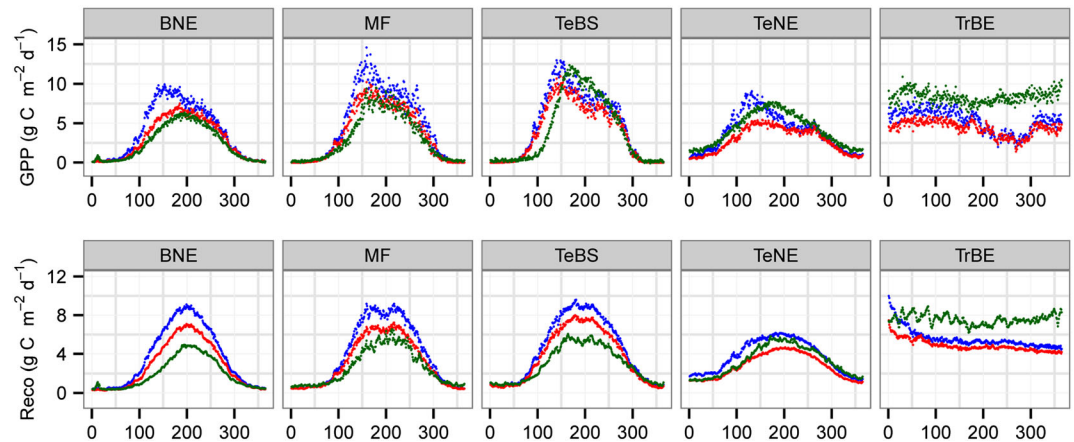
<sup>a</sup>Mixed forests (MF), tropical evergreen broadleaf forests (TrBE), temperate evergreen needleleaf forests (TeNE), boreal evergreen needleleaf forests (BNE), and temperate broadleaf summergreen forests (TeBS). Mean, SD, and RMSE of C fluxes expressed in  $\text{kg C m}^{-2} \text{yr}^{-1}$  and Pbias expressed in percent bias.

identical fashion for site and global simulations. For that, we compared differences in C pools ( $\Delta\text{C pool}$ ) from two contrasting simulations, one with rising N deposition (CN-Ac for “actual”) and one with preindustrial levels of N deposition (CN-Pi for “preindustrial”) (Table 1). We infer the N deposition effect with these runs, as all other potential drivers such as  $\text{CO}_2$  concentration, climate, and age of forests were identical. We calculated  $d\text{C}/d\text{N}$  as  $\Delta\text{C pool}/\Delta\text{N deposition}$ , where  $\Delta\text{N deposition}$  is the difference in cumulative N deposition. For site simulations, we only assessed biomass C pools because soil C pools were perturbed by the prescribed disturbance and often did not recover during the simulation period. For global simulations, we assessed N deposition effects on changes in soil, litter, biomass, and total ecosystem C pools. To further elucidate differences between local- and global-scale simulations, we analyzed signs of N saturation, vegetation distribution shifts, and different N sensitivities in litter, vegetation, and soil C pools in the global simulations.

To complement the global estimate, we additionally employed an upscaling approach to derive the absolute global N deposition effect on forest C sequestration from site estimates. For this, we combined mean N sensitivity of C sequestration rates ( $d\text{C}/d\text{N}$ ) per forest type from the site-scale simulations with independent estimates of global forest C budgets [Pan *et al.*, 2011] and mean N deposition rates per forest type. The latter were derived by overlaying PFT distributions from historical land cover change reconstructions for 1990 [Lawrence *et al.*, 2012] with global N deposition for 1990–1999 [Lamarque *et al.*, 2010]. We propagated the uncertainty in  $d\text{C}/d\text{N}$ , C sinks, and N deposition to the potential impact of N deposition on C sink strengths, for which we assumed 50% uncertainty in N deposition estimates [Dentener *et al.*, 2006] and used the 68% confidence interval (CI) of  $d\text{C}/d\text{N}$  to estimate the unknown error.

### 3. Results

Inclusion of the N cycle in LPJ-GUESS caused an overall reduction in mean annual GPP and  $R_{\text{eco}}$  estimates of  $−0.34 \text{ kg C m}^{-2} \text{yr}^{-1}$  and  $−0.31 \text{ kg C m}^{-2} \text{yr}^{-1}$ , respectively ( $\Delta = \text{C} - \text{CN}$ ). N cycle dynamics caused overall model performance improvement, reducing overall bias of 14% in the C version to  $−11\%$  in the CN version, while RMSE improved slightly from 0.65 to 0.63  $\text{kg C m}^{-2} \text{yr}^{-1}$  (Figure 1 and Table 2). N cycle effects differed between forest types as expected (Figure 1 and Table 2). Predictions of GPP improved most strongly for boreal needleleaf forests (BNE), where the CN version reduced overestimation from 56% to 18% with a considerable reduction in RMSE (0.66 to 0.34  $\text{kg C m}^{-2} \text{yr}^{-1}$ ). For temperate deciduous (TeBS), prediction bias of mean GPP improved with the CN version from 16% overestimation to 3% underestimation, while RMSE was slightly reduced. For mixed forests (MF), both error and bias scores improved with the N cycle inclusion (Table 2). For temperate needleleaf (TeNE)



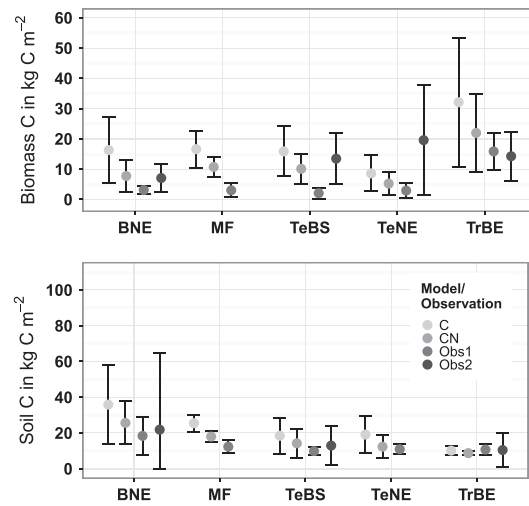
**Figure 2.** Average seasonal cycle of daily gross primary production (GPP) and ecosystem respiration ( $R_{eco}$ ) in  $\text{g C m}^{-2} \text{d}^{-1}$  against day of the year for the C version (blue), the CN version (red) of LPJ-GUESS, and FLUXNET observations (green), PFTs in panels from left to right (with number of sites): boreal evergreen needleleaf forests (BNE,  $n = 28$ ), mixed forests (MF,  $n = 6$ ), temperate broadleaf summergreen forests (TeBS,  $n = 15$ ), temperate evergreen needleleaf forests (TeNE,  $n = 13$ ), and tropical evergreen broadleaf forests (TrBE,  $n = 6$ ).

and tropical forests (TrBE), modeled results were comparable, although the C version achieved marginally better accuracy scores. For TrBE, both model versions underestimated mean GPP and had high error and bias scores. Also, annual totals of  $R_{eco}$  are predicted with greater accuracy by the CN version, reducing bias from 35% to 7% and RMSE from 0.69 to  $0.56 \text{ kg C m}^{-2} \text{ yr}^{-1}$  (Figure 1 and Table 2). The largest improvement occurred for BNE, reducing RMSE from 0.76 to  $0.47 \text{ kg C m}^{-2} \text{ yr}^{-1}$  and bias from 83% to 41% (Figure 1 and Table 2). For TeBS and MF,  $R_{eco}$  predictions were similarly reduced for both RMSE and bias. For TeNE, RMSE and bias of  $R_{eco}$  predictions were comparable in both model versions. TrBE respiration rates were underestimated by both models.

The CN version achieved also the closest agreement between modeled and observed seasonality of C fluxes for BNE (Figure 2). The C version simulates a fast increase of GPP and  $R_{eco}$  at the start of the year and an overestimated summer peak, which was diminished with the consideration of N limitations in the CN version. For MF and TeBS, the seasonality in GPP was generally reproduced well by both model versions (Figure 2). For both forest types, the unrealistically high simulated GPP summer maximum was reduced in the CN version, which caused a better match to observations for mixed forests but slightly underestimated the summer peak for TeBS. Peak rates of  $R_{eco}$  for MF, TeBS, and BNE were reduced, which improved model fit although an overestimation in summer respiration remained. Seasonality of C fluxes in TrBE was not reproduced well. Magnitudes of GPP and  $R_{eco}$  are underestimated, as noted earlier, and both models predicted a strong decline in GPP around day 180, not supported by observations, although CN dynamics reduced the overpronounced seasonal variation to some extent. The unusually high  $R_{eco}$  rates for TrBE at the start of the year (Figure 2) are due to the fact that modeled annual litter input occurs on day 1.

FLUXNET observations of NEE show that all forest types included in the analysis are on average C sinks; however, within forest types, the net C uptake was highly variable in sign and magnitude. TeNE and TeBS exhibited the largest mean net C exchange with  $-0.35 \pm 0.33$  and  $-0.41 \pm 0.24 \text{ kg C m}^{-2} \text{ yr}^{-1}$ , respectively (Table 2). TrBE showed a lower mean net C exchange of  $-0.30 \pm 0.57 \text{ kg C m}^{-2} \text{ yr}^{-1}$ , and BNE and MF exhibited the weakest net C exchange with  $-0.19 \pm 0.39$  and  $-0.18 \pm 0.19 \text{ kg C m}^{-2} \text{ yr}^{-1}$ , respectively. Both models generally underestimated the observed mean NEE and achieved similar accuracy scores in predicting NEE across and within PFTs (Table 2). This was also the case for BNE, despite the better accuracy scores for GPP and  $R_{eco}$  in the CN version, as overestimations in both GPP and  $R_{eco}$  canceled each other out in the C version. For TrBE, both models predicted a C source in contrast to the observed substantial C sink. Only for MF did the CN version achieve satisfactory NEE predictions, reducing RMSE to  $0.17 \text{ kg C m}^{-2} \text{ yr}^{-1}$  and bias to 11%.

Mean C pools in biomass and soil were consistently reduced in the CN version compared to the C version across all forest types (Figure 3). This reduction generally resulted in better agreement with observations, with some exceptions. There is considerable variation and hence uncertainty in soil and biomass C estimates,

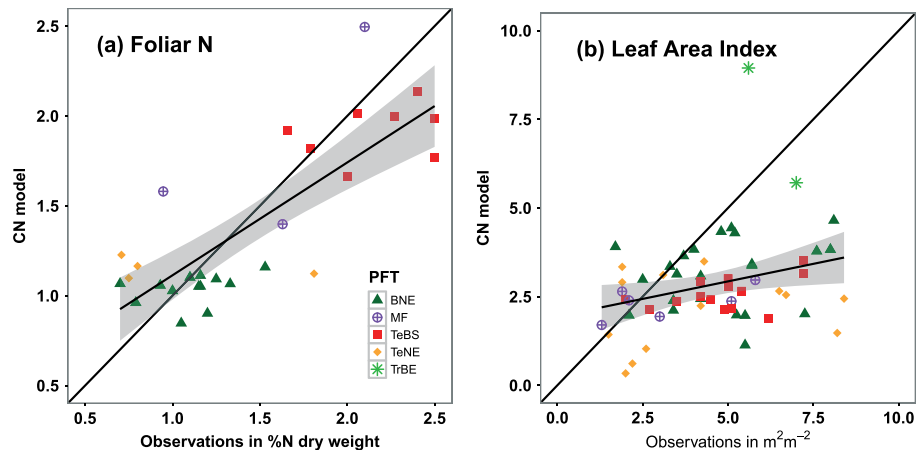


**Figure 3.** Mean biomass and soil C pools in  $\text{kg C m}^{-2}$  for C and CN version averaged per PFT compared to observations by *Ruesch and Gibbs* [2008] (Obs1) and *Luyseart et al.* [2007] (Obs2) for biomass C and the *HWSD [FAO/IIASA/ISRIC/ISSCAS/JRC, 2012]* (Obs1) and *Zinke et al.* [1984] (Obs2) for soil C; error bars represent 1 standard deviation. PFTs with number of modeled sites are boreal evergreen needleleaf forests (BNE,  $n = 28$ ), mixed forests (MF,  $n = 6$ ), temperate broadleaf summergreen forests (TeBS,  $n = 15$ ), temperate evergreen needleleaf forests (TeNE,  $n = 13$ ), and tropical evergreen broadleaf forests (TrBE,  $n = 6$ ).

complicating a clear comparison; e.g., biomass C estimates from *Ruesch and Gibbs* [2008] are very low compared to estimates from *Luyseart et al.* [2007]. However, for forest types in which observational estimates of biomass are in closer agreement with each other, like BNE (3 and  $7 \text{ kg C m}^{-2}$ ) and TrBE ( $16$  and  $14 \text{ kg C m}^{-2}$ ), the CN version is closer to observations, with  $\sim 8$  and  $22 \text{ kg C m}^{-2}$ , respectively. The CN version is also closer to the one available MF observation of  $3 \text{ kg C m}^{-2}$  with  $11 \text{ kg C m}^{-2}$ . For the other forest types, TeBS and TeNE, the comparison remains inconclusive. Soil C observations are in better agreement with each other than biomass C observations. BNE observations of  $\sim 18$  and  $22 \text{ kg C m}^{-2}$  are best simulated in the CN version with  $\sim 26 \text{ kg C m}^{-2}$  (Figure 3). For TrBE, both model versions were in very good agreement with observations of soil C between 9 and  $11 \text{ kg C m}^{-2}$ . For TeBS, mean soil C at  $14 \text{ kg C m}^{-2}$  in the CN

version is closest to both available observations at 10 and  $13 \text{ kg C m}^{-2}$ . For MF and TeNE, only one soil C observation was available, which was in better agreement with estimates of the CN version (Figure 3).

Maximum foliar N concentrations in the CN version of LPJ-GUESS agreed well with observations (Figure 4). N cycle dynamics and flexible stoichiometry in the CN version induced realistically greater variation in foliar N compared to the C version, which simulated very constrained foliar N values due to fixed C:N ratios (not shown). Consequently, performance was markedly improved by the CN version, reducing RMSE from 0.58% to 0.38% N and bias from  $-29\%$  to  $-4\%$ . Notably, the agreement is largely driven by simulations capturing the differences between needleleaf (BNE) and broadleaf species (TeBS). Within PFT, agreement is limited, as the CN version does not capture the full range of observed variations in foliar N within PFTs (Figure 4). The agreement of simulated maximum LAI with field measurements was poor, in that both model



**Figure 4.** Scatterplot of observed versus simulated values averaged per site for the CN version for (a) maximum foliar N in %N per dry weight ( $n = 28$ ) and (b) maximum leaf area index (LAI) in  $\text{m}^2 \text{ m}^{-2}$  ( $n = 59$ ). Color and shape represent PFT classification in LPJ-GUESS (see legend). The 1:1 line in black and the linear regression line with 1 SE underlain in grey.



**Table 3.** C Sequestration Per Unit N Deposition (dC/dN), Age, and N Deposition Loads Per PFT and Climate Zone From Site-Scale Simulations ( $n = 68$ )<sup>a</sup>

	$n$	dC/dN					Age years	Total N deposition	
		mean	SD	min	max	CI <sup>b</sup>		( $\Delta$ ) kg N ha <sup>-1</sup>	(CN-Ac-G) kg N ha <sup>-1</sup>
<i>PFT</i>									
BNE	28	19.6	13.7	-18.3	41.2	2.6	83.4	247.7	373.7
MF	6	27.7	30.5	-13.0	74.9	13.8	101.0	405.5	559.5
TeBS	15	21.6	16.1	-2.6	48.4	4.3	74.2	436.1	672.1
TeNE	13	25.6	17.2	0.1	49.7	4.9	53.4	235.8	298.0
TrBE	6	25.9	23.9	-6.8	58.5	10.8	147.7	106.5	285.2
<i>Climate</i>									
Boreal	14	17.5	18.7	-18.3	41.2	5.2	77.1	152.9	226.7
Temperate	47	24.0	16.1	-2.6	74.9	2.4	77.1	355.9	521.0
Tropical	6	25.9	23.9	-6.8	58.5	10.8	147.7	106.5	285.2

<sup>a</sup>Mean, 1 standard deviation (SD), minimum (min), maximum (max), and 68% confidence interval (CI) given for dC/dN in kg C kg N<sup>-1</sup>, mean age in years, mean difference in total N deposition between actual and preindustrial runs  $\Delta$  (CN-Ac-G, CN-Pi-G), and mean total load in actual run (CN-Ac-G). Data summarized per PFT (boreal evergreen needleleaf forests (BNE), mixed forests (MF), temperate broadleaf summergreen forests (TeBS), temperate evergreen needleleaf forests (TeNE), and tropical evergreen broadleaf forests (TrBE)) and climate zone (boreal, temperate, and tropical).

<sup>b</sup>Given as 68% confidence interval, assuming Gaussian error distributions that the real value lies within the given interval.

versions did not reproduce the slope or the range of observed values (Figure 4). Observed LAI ranged from ~1 to 8 m<sup>2</sup> m<sup>-2</sup>, whereas simulations did not exceed 5 m<sup>2</sup> m<sup>-2</sup> for both model versions. N cycle inclusion reduced mean LAI relative to the C version (not shown) from 3.3 to 2.8 m<sup>2</sup> m<sup>-2</sup>, compared to an observed 4.4 m<sup>2</sup> m<sup>-2</sup>. The N cycle thus slightly reduced the performance in simulating maximum LAI in terms of RMSE (from 2.4 to 2.5 m<sup>2</sup> m<sup>-2</sup>) and bias (from -26% to -37%).

C sequestration per unit N deposition from site-scale simulations ranged from -18 to 75 kg C kg N<sup>-1</sup>, with forest type means from 20 to 28 kg C kg N<sup>-1</sup> (Table 3). Temperate needleleaf forests (TeNE), mixed forests (MF), and tropical forests (TrBE) experienced highest N sensitivities with 26–28 kg C kg N<sup>-1</sup>, compared to 20–22 kg C kg N<sup>-1</sup> for boreal needleleaf forests (BNE) and temperate deciduous broadleaf forests (TeBS) (Table 3). Aggregating sites per climate zone results in a poleward decreasing trend of dC/dN, from 26 kg C kg N<sup>-1</sup> in tropical sites to 24 kg C kg N<sup>-1</sup> in temperate and 17.5 kg C kg N<sup>-1</sup> in boreal sites (Table 3). Temperate forest sites saw by far the highest N deposition loads and rise therein throughout the historical period. Tropical sites experience lower levels of N deposition loads, comparable to boreal sites, but tropical forests were almost twice as old as boreal and temperate forests (Table 3). Large variability of dC/dN occurred within forest types, potentially due to low site data availability, e.g., for tropical sites, but also due to strong site conditional responses to N addition, as standard deviations remained high in temperate sites, for which relatively many sites were available.

Although the representativeness of our site selection to the wider biomes is questionable, biomass dC/dN per biome and PFT are within range of published estimates of 15–40 kg C kg N<sup>-1</sup> for temperate and boreal forests [De Vries *et al.*, 2009]. Therefore, we employ these estimates to derive the potential global contribution of N deposition to the terrestrial C sink (Table 4). Biomass dC/dN from site simulations amounted to 23 kg C kg N<sup>-1</sup>

**Table 4.** Contribution of N Deposition to the Global and Biome-Specific Forest C Sink, Based on Forest Area Per Climate Zone in Megahectare and C Sinks in Pg C yr<sup>-1</sup> for 1990–2007 From Pan *et al.* [2011], Average N Deposition Per Forest Type in the 2000s kg N ha<sup>-1</sup> yr<sup>-1</sup> Based on Lawrence *et al.* [2012] and Lamarque *et al.* [2010] and dC/dN in kg C kg N<sup>-1</sup> From This Study<sup>a</sup>

Forest	Area	C Sink	dC/dN	N Deposition	N Deposition Effect	
	Mha	P C yr <sup>-1</sup>	kg C kg N <sup>-1</sup>	kg N ha <sup>-1</sup> yr <sup>-1</sup>	Pg C yr <sup>-1</sup>	%
Boreal	1135	0.50 ± 0.08	17.5 ± 5.2	3.6 ± 1.8	0.07 ± 0.04	14.3 ± 4.3
Temperate	767	0.72 ± 0.08	24.0 ± 2.4	6.2 ± 3.1	0.11 ± 0.06	15.9 ± 6.0
Tropical <sup>b</sup>	1949	1.19 ± 0.41	25.9 ± 10.8	5.3 ± 2.7	0.27 ± 0.17	22.5 ± 19.7
Global <sup>c</sup>	3851	2.40 ± 0.42	23.0 ± 7.5	5.2 ± 2.6	0.46 ± 0.28	19.2 ± 28.7

<sup>a</sup>The resulting C sink due to N deposition (N deposition effect) is given in Pg C yr<sup>-1</sup> and in percent of the total C sink. The following uncertainties are propagated to derive the N deposition effect: uncertainty as 68% CI for C sinks (as described in Pan *et al.* [2011]) and for dC/dN (as in Table 3), and uncertainty of N deposition is assumed at 50% [see Dentener *et al.*, 2006].

<sup>b</sup>Including intact tropical forests only (as in Pan *et al.* [2011]).

<sup>c</sup>Global dC/dN calculated as area-weighted mean of climate zone-based dC/dN.

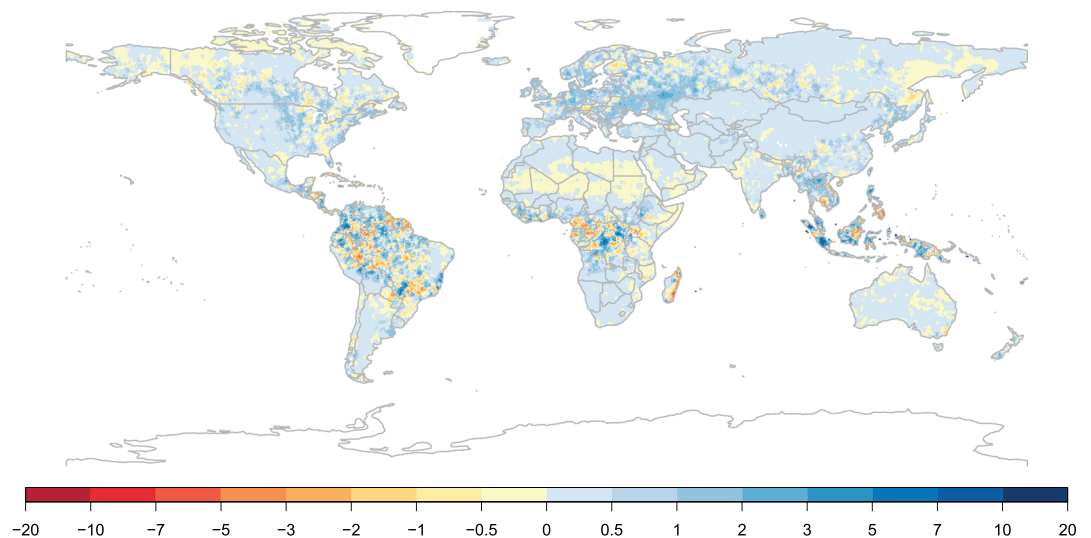
**Table 5.** Historical C Sequestration Rates and N Deposition Effects for 1900–2006 From Global Simulations, Including Total Area (Mha), Total C Sequestration (Pg C), the Induced C Sequestration due to N Deposition (Pg C) ( $\Delta$ CN-Ac-G and CN-Pi-G), Total Additional N Deposition ( $\text{kg N ha}^{-1}$ ) ( $\Delta$ CN-Ac-G and CN-Pi-G), Resulting dC/dN ( $\text{kg C kg N}^{-1}$ ), and the Contribution of N Deposition on Total C Sequestration in Percent (N-Induced C Sink/C Sink)<sup>a</sup>

	Area	C Sink	N-Induced C Sink	Additional N Deposition	dC/dN	N Deposition Effect
	Mha	Pg C	Pg C	$\text{kg N ha}^{-1}$	$\text{kg C kg N}^{-1}$	%
Temperate (N)	3189	31.4	10.7	273.0	12.3	34.0
Boreal	1505	17.7	3.3	100.2	21.7	18.5
Tropical	5042	54.1	11.9	132.5	17.8	22.0
Subtropical	2712	9.2	2.2	140.5	5.6	23.4
Southern	252	2.3	0.3	51.4	26.3	14.6
Arctic	698	2.1	0.4	26.5	20.1	17.7
Global	13398	116.9	28.7	2101.9	13.7	24.6

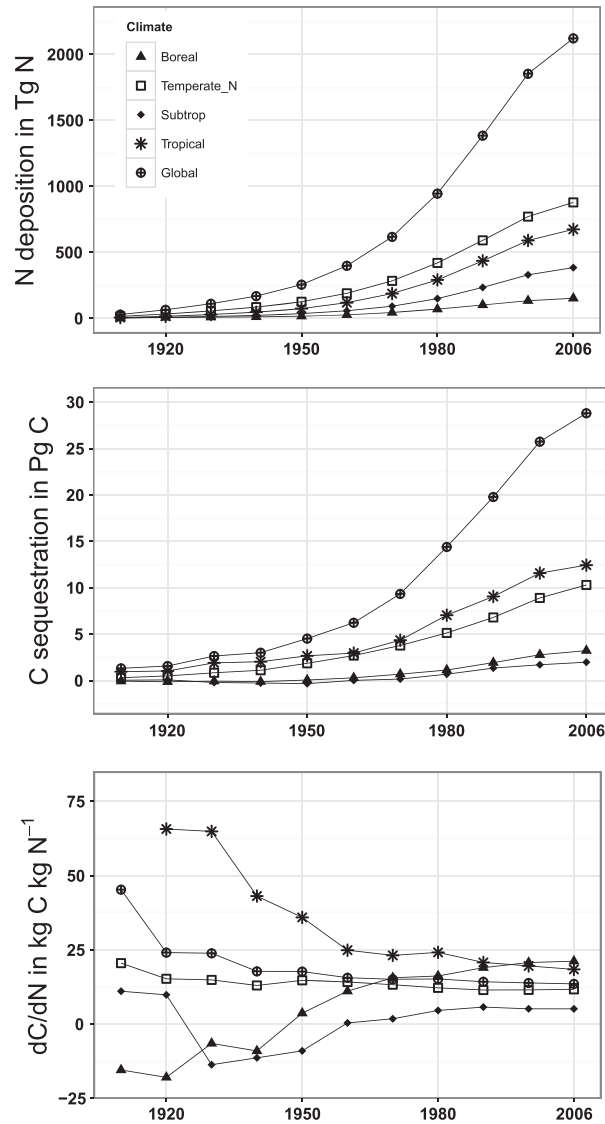
<sup>a</sup>Results are shown for major climate zones of the world and the global total.

for global forests. Global mean N deposition rates of  $5.2 \text{ kg N ha}^{-1} \text{ yr}^{-1}$  [Lamarque et al., 2010] would thus sequester  $0.46 \text{ Pg C yr}^{-1}$  in biomass. Global forest C sink strength was estimated at  $2.4 \pm 0.4 \text{ Pg C yr}^{-1}$  (1990–2007) [Pan et al., 2011], including both biomass and soil C pools. Given our simple accounting method, N deposition would sustain  $19 \pm 29\%$  of the recent global forest C sink through effects on biomass production alone (Table 4). This additional C sink due to N deposition amounted to  $0.07 \pm 0.04 \text{ Pg C yr}^{-1}$  in boreal,  $0.11 \pm 0.06 \text{ Pg C yr}^{-1}$  in temperate, and  $0.26 \pm 0.17 \text{ Pg C yr}^{-1}$  in tropical forest biomass, which is equivalent to  $14 \pm 4\%$ ,  $16 \pm 6\%$ , and  $23 \pm 20\%$  of the total forest C sink in these biomes, respectively (Table 4).

Based on global simulations, we derived a historical cumulative terrestrial C sink of 117 Pg C since 1900 (CN-Ac-G in Table 5). The tropics sequestered almost half (54.1 Pg C), followed by the temperate zone (31.4 Pg C), boreal zone (17.7 Pg C), and subtropical zone (9.2 Pg C). The preindustrial run (CN-Pi-G) results in 88.1 Pg C sequestered; thus, 28.7 Pg C, or 24%, has been sequestered due to rising N deposition at a rate of  $13.7 \text{ kg C kg N}^{-1}$  (Table 5 and Figure 5). N deposition has induced the strongest C sink in the tropics (11.9 Pg C) and temperate zone (10.7 Pg C). Conversely, in boreal and subtropical climates, the N-induced C sink was relatively small, with 3.3 and 2.2 Pg C (Table 5 and Figure 5). The N effect was highly variable within climate zones and included regional negative N effects, which were most pronounced in the tropics (Figure 5). This is a result of simulated disturbance events, causing stochastically induced loss of biomass, which causes variable N effects at smaller scales. Since biomass C represents a larger fraction of total ecosystem C in the tropics compared to the boreal or temperate zone,



**Figure 5.** Ecosystem carbon accumulation from 1901 to 2006 due to rising N deposition, derived from total ecosystem C difference in 2006 between preindustrial and historical N deposition scenario simulations ( $\Delta$ CN-Ac-G and CN-Pi-G) in  $\text{kg C m}^{-2}$ ; positive values (blue) indicate a gain of C in ecosystems and negative values (red) a net C loss due to N deposition. Grid values were interpolated to derive a more coherent appearance.



**Figure 6.** (top) Evolution of N deposition, (middle) N deposition-induced C sequestration, and (bottom) resulting dC/dN over the historical period, globally and per climate zone (see legend). N deposition as the cumulative difference between the preindustrial and historical N deposition scenario simulations ( $\Delta CN-Ac-G$  and  $CN-Pi-G$ ) in  $Tg\ N$ , N deposition-induced C sequestration as the difference in total ecosystem C pool between the two runs in  $Pg\ C$ , and the resulting dC/dN as C sequestration per N deposition in  $kg\ C\ kg\ N^{-1}$ . Results for a specified time cover the time period since 1900 until that point, e.g., 1980, assesses the period 1900–1980, etc. (calculating dC/dN per decade is not possible as initial states per decade differ between model runs). Note that the 1910 value for tropical is out of range ( $154\ kg\ C\ kg\ N^{-1}$ ).

These play a role, as some spatial patterns in dC/dN were likely not captured by site simulations (Figure S1). For example, we observed increases in woody PFTs in Siberia (deciduous needleleaf forests, not shown) in the global simulations, for which no observational data from sites were available. The large presence of nonforest ecosystems (grasses) in the temperate zone explains partly lowered efficiency at a global scale, as the N deposition-induced stimulation of grass coverage (Figure S1) induces lower C sequestration compared to forests. Spatial shifts in PFTs due to  $CO_2$  fertilization, N deposition, and climate have been assessed in more detail by *Wärnlind et al.* [2014].

these small-scale variations are more pronounced (see also Figure 3). These interactions point out the need to account for disturbances when assessing N effects at spatial scales where disturbances become relevant.

Temperate and tropical dC/dN from global simulations were 12 and  $18\ kg\ C\ kg\ N^{-1}$ , respectively, while boreal dC/dN was  $22\ kg\ C\ kg\ N^{-1}$  (Table 5), following the generally expected pattern of higher efficiencies in high latitudes. Boreal efficiencies are higher in the global simulation due to substantial sequestration of litter and soil C not accounted for in the site-scale simulations, while biomass dC/dN was comparable (Table S1 in the supporting information and Table 3). Boreal regions experience a positive N effect on C sequestration since 1950, with rising efficiencies since (Figure 6); however, the absolute effect of N deposition on C sequestration remained low. In contrast to boreal regions, biomass dC/dN was lower at global scale for tropical ( $13.7$  versus  $25.9\ kg\ C\ kg\ N^{-1}$ ) and temperate regions ( $7.6$  versus  $24.0\ kg\ C\ kg\ N^{-1}$ ) (Tables S1 and 3). Although global dC/dN was low for temperate and tropical ecosystems, substantial deposition of N induced considerable C sinks in these climate zones. This is despite temperate and tropical regions exhibiting signs of N saturation, as dC/dN moderately but steadily declines (Figure 6). While temperate and tropical regions received similar amounts of N, temperate N loads were highest on an area basis in both global and site simulations (Tables 3 and 5), supporting the likely onset of N saturation in this climate zone.

Another factor contributing to differences between site and global dC/dN are N deposition effects on PFT distribution.

**Table 6.** Recent C Sequestration Rates and N Deposition Effects for 1990–2006 From Global Simulations, Mean C Sequestration ( $\text{Pg C yr}^{-1}$ ), the Induced C Sequestration Due to N Deposition ( $\text{Pg C yr}^{-1}$ ) ( $\Delta\text{CN-Ac-G}$  and  $\text{CN-Pi-G}$ ), Mean N Deposition ( $\text{kg N ha}^{-1} \text{yr}^{-1}$ ) ( $\text{CN-Ac-G}$ ), and the Contribution of N Deposition on Mean C Sequestration in Percent (N-Induced C Sink/C Sink)<sup>a</sup>

	C sink	N-Induced C Sink	N Deposition	N Deposition Effect
	$\text{Pg C yr}^{-1}$	$\text{Pg C yr}^{-1}$	$\text{kg N ha}^{-1} \text{yr}^{-1}$	%
Temperate (N)	0.75	0.22	6.97	29.12
Boreal	0.40	0.08	2.94	20.09
Tropical	1.46	0.21	4.68	14.41
Subtropical	0.21	0.04	5.20	18.46
Southern	0.07	0.00	1.50	5.07
Arctic	0.05	0.01	0.94	19.56
Global	2.95	0.56	4.57	19.11

<sup>a</sup>Results shown for major climate zones of the world and global totals.

To directly compare global simulations with the upscaling approach and observation-based estimates in *Pan et al.* [2011], we assess global simulation results for the time period 1990–2006 (Table 6). The simulated C uptake rates per climate zone agree well with observational-based estimates, e.g., 0.75 versus  $0.72 \text{ Pg C yr}^{-1}$  in the temperate zone and 0.40 versus  $0.50 \text{ Pg C yr}^{-1}$  in the boreal zone (Table 4). Global mean C sequestration (or NEE) was simulated at  $2.95 \text{ Pg C yr}^{-1}$  of which  $0.56 \text{ Pg C yr}^{-1}$  (or 19%) has been due to rising N deposition.

#### 4. Discussion

The evaluation of LPJ-GUESS showed that the N cycle inclusion generally improved or equaled model performance of the C version. The extension of LPJ-GUESS with N cycle dynamics improved model predictions most notably for boreal evergreen needleleaf forests (BNE). Boreal forests were modeled with a greater degree of N limitation on GPP compared to temperate forests, in line with observations and modeling results [Jarvis and Linder, 2000; Zaehle and Friend, 2010; Fleischer et al., 2013]. The inclusion of the N cycle improved the simulation of both annual and seasonal GPPs of BNE when compared to the C version. In temperate forest ecosystems (TeNE and TeBS), effects of N dynamics were smaller and both model versions achieved comparable accuracies. The question is whether N limitation of temperate forests is in fact small or negligible, or whether it remains prevalent, but is compensated for by other processes and/or parameter settings in the C version. We believe the second is more likely, since experimental and monitoring studies indicate the prevalence of widespread N limitation in temperate forests, though there are examples of N saturation [LeBauer and Treseder, 2008; Ferretti et al., 2014]. Our modeled C sequestration responses to N deposition further support the hypothesis of enduring N limitation in temperate forests, although with moderate magnitude diminishing over time.

N dynamics in LPJ-GUESS induced changes in simulated ecosystem respiration and C pool sizes, both of which are linked due to the dependence of respiration on the stoichiometric composition of plant biomass and soil carbon. In the C version, C:N ratios are fixed for a given PFT and autotrophic respiration is entirely based on biomass C pool size, modified only by temperature. In the CN version, autotrophic respiration depends on flexible C:N ratios and N limitation realistically causes higher C:N ratios and lower respiration rates. Hence, the N cycle inclusion caused general reductions in  $R_{\text{eco}}$  and C pools, generally better matching observations, which is attributable to a combination of N controls on productivity and respiration. A moderate but persistent overestimation in  $R_{\text{eco}}$  remained however at the site scale in the CN version, especially for boreal and temperate deciduous forests (BNE and TeBS), hampering satisfactory predictions of NEE. Systematic overestimations of ecosystem respiration were not apparent previously [Smith et al., 2014] or in our global simulations (Table 5). Since biomass dynamics and N deposition effects have been modeled realistically at the site scale, the heterotrophic component of  $R_{\text{eco}}$  is likely contributing mainly to site-scale discrepancies. High soil C effluxes after disturbance often did not recover during the forests' lifetime to previous levels (not shown), which represents unrealistically long disturbance recovery times. The representation of respiratory processes in terrestrial models is hampered by the lack of adequate observations that broadly capture spatial and temporal variations, as well as competing but no superior modeling approach for soil C decomposition

to date [Exbrayat *et al.*, 2013]. Furthermore, quantifying global C stocks [Scharlemann *et al.*, 2014] and separating components of autotrophic and heterotrophic respiration as well as quantifying their interactions with environmental drivers and disturbances [Exbrayat *et al.*, 2013] add challenging complexities to measuring and modeling respiration satisfactorily to date.

The model evaluation identified other remaining challenges for global ecosystem models. The unsatisfactory reproduction of C cycling in tropical forests by LPJ-GUESS is a feature generally shared by ecosystem models [Castanho *et al.*, 2013]. This is inferred to be due to misrepresentations of plant and soil water-related mechanisms, identified earlier for LPJ-GUESS [Morales *et al.*, 2005] and other ecosystem models [Restrepo-Coupe *et al.*, 2013; van der Molen *et al.*, 2011]. The accurate simulation of tropical ecosystem C and N cycles may notably be further complicated by the representation of such a diverse biome with commonly one or two PFTs, raising questions about the capability of ecosystem models in their current state to adequately capture tropical biogeochemical dynamics [Pavlick *et al.*, 2013; Van Bodegom *et al.*, 2012]. Another discrepancy between modeled and observed estimates was LAI, which did not satisfactorily match field observations for either version of LPJ-GUESS. This was rather unexpected as acceptable reproduction of forest LAI of LPJ-GUESS was reported earlier when compared to a different set of field observations [Smith *et al.*, 2008]. Satisfactory prediction of C fluxes indicates that other model components might compensate for the underestimated amount of leaf area. The standard Beer's law light extinction coefficient ( $k$ ) of 0.5 in LPJ-GUESS contributes to a low variation in LAI, leading to little additional increase in GPP above an LAI of 5 [see also Jung *et al.*, 2007]. Model data agreement is further compromised by limited reliability of experimental observations and a lack of standardized methodologies across the FLUXNET network [Bréda, 2003].

The mean efficiency of converting deposited N into biomass amounted to 17.5 and 24 kg C kg N<sup>-1</sup> in boreal and temperate forest sites, which are in the low to medium range when compared to the published range of 15 to 40 kg C kg N<sup>-1</sup> from experimental and modeling studies [De Vries *et al.*, 2009; in Butterbach-Bahl *et al.*, 2011; Erisman *et al.*, 2011]. Despite an expectation of strong N limitation in boreal forests, dC/dN was lowest for boreal site simulations. However, at global scale, efficiencies were highest for boreal regions (22 kg C kg N<sup>-1</sup>), due to significant N-induced C sequestration in litter and soil C pools and due to increases in woody PFTs in some regions not captured by site simulations. For temperate regions on the other hand, efficiencies are actually lower at global scale (12 kg C kg N<sup>-1</sup>) due to the onset of N saturation effects, as well as the consideration of disturbances and nonforest ecosystems, with generally less C sequestration potential [Liu and Greaver, 2009].

Despite diminishing efficiencies, in terms of actual N deposition-induced C sequestration, temperate forests provided a stronger recent and historical C sink than boreal forests based on our simulations and forest inventories [Pan *et al.*, 2011]. Determining the onset and development of N saturation due to high N loads plays a key role in temperate forests [Aber *et al.*, 1998; Brumme and Khanna, 2008]. While some studies have suggested signs of actual decline in C sink rates in temperate forests [Nabuurs *et al.*, 2013], these were not severe in our simulation. Temperate forests remained substantial C sinks, and although relative N deposition effects slightly reduced, absolute effects remained considerable; i.e., there are limited signs of N saturation in temperate forests in our simulations.

Boreal ecosystems' C sequestration was limited to a net C uptake of 0.4–0.5 Pg C yr<sup>-1</sup> in recent years (this study and also Pan *et al.* [2011]). N deposition was responsible for inducing 0.07–0.08 Pg C yr<sup>-1</sup> thereof [Pan *et al.*, 2011; this study; but also Zaehle *et al.*, 2010]. Historically, this amounted to less than 3 Pg C, which is arguably small and corroborates conclusions by Gundale *et al.* [2014], arguing that the main N-induced C sink is not found in boreal forest. Although boreal forests (BNE) were most N limited in the model evaluation, their C response to N deposition was low at site scale and only moderate at global scale (when compared to the previous range of 15–40 kg C kg N<sup>-1</sup>). Continuously low N deposition rates, combined with moderate efficiencies, prevented a substantial N-induced C sink. The rise of boreal dC/dN in recent decades might point toward stronger future effects of N deposition. However, we judge this to be of little relevance since predicted future N deposition loads in boreal regions are not expected to rise significantly [Lamarque *et al.*, 2013; Wårlind *et al.*, 2014]. Other processes such as a warming-induced higher soil N availability in boreal regions are believed to play a greater role than N deposition in terms of CN interactions relevant to the global C cycle [Melillo *et al.*, 2011].

The large contribution of tropical regions to global C sequestration is apparent, since almost half of historical C sink has occurred in the tropics according to our simulations. Also, about half of the recent forest C sink is

attributed to the tropics, i.e., 1.19 of 2.40 Pg C yr<sup>-1</sup> and 1.46 of 2.95 Pg C yr<sup>-1</sup>, following forest inventories, and our simulations, respectively [Pan *et al.*, 2011] (Table 4). Induced N limitation in the tropics was small (as hypothesized) in the site-scale model evaluation due to more favorable climate conditions for soil organic matter turnover and N mineralization [Smith *et al.*, 2014]. Nonetheless, N deposition effects in our simulations were substantial in the tropics (26 and 18 kg C kg N<sup>-1</sup> at site and global scales) with about one third of the N-induced C sequestration occurring in the tropics, which is in contrast to other similar modeling studies, e.g., Zaehle *et al.* [2010]. This strong simulated tropical N deposition effect in our study is however associated with greatest uncertainty given the unsatisfactory results during model evaluation, and the lack of P cycle dynamics, which are likely to further strongly control N effects and C dynamics in the tropics [Cleveland *et al.*, 2011; Vitousek *et al.*, 2010]. Thus, the N deposition effect might in reality be small or negligible, although positive responses to N fertilization [LeBauer and Treseder, 2008] have also been reported. The scarcity of relevant studies hampers a thorough evaluation in the tropics, where N effects are most uncertain [Zaehle and Dalmonch, 2011]. Nonetheless, the large amounts of N deposited over tropical forests worldwide and associated observed changes in tropical forests' N cycling [Hietz *et al.*, 2011] call upon a careful evaluation of N deposition effects in these regions.

Furthermore, we have not accounted for deforestation and other land use and land cover changes (LULCCs), which have been estimated to bring net C balance of tropical forests close to zero due to C emissions from large-scale deforestation and fires [Pan *et al.*, 2011]. Also, in temperate forests, the anthropogenic LULCC component is similarly central, as forest regrowth and management significantly determine the C balance [Erb *et al.*, 2013; Nabuurs *et al.*, 2013]. Interactions of N cycle and deposition with LULCC have so far been shown to mainly increase the net loss of C from ecosystems [Gerber *et al.*, 2013; Jain *et al.*, 2013] and thus are likely offsetting N deposition effects alone.

Globally, our accounting method based on site simulations indicated that  $19 \pm 29\%$  of the recent global forest C sink, or  $0.46 \pm 0.28$  Pg C yr<sup>-1</sup>, is due to N deposition effects on biomass. The large uncertainties are mainly due to uncertainty of dC/dN and C sink strength in tropical forests. For boreal and temperate forests, the N deposition effect could be narrowed down to be within 10% to 22% (see Table 4). Our global simulations, representing spatial and temporal variability and including soil pools and other nonforest ecosystems, indicated a very comparable global N deposition effect of 0.56 Pg C yr<sup>-1</sup>, representing 19% of the global C sink. Recent estimates of the N deposition effect on the global terrestrial C sink strength ranged from 0.2 to 0.4 Pg C yr<sup>-1</sup> derived from global ecosystem model simulations [Zaehle and Dalmonch, 2011] and 0.4 to 0.6 Pg C yr<sup>-1</sup> from a similar upscaling approach of field measurements [Liu and Greaver, 2009]. Our estimates of 0.46 and 0.56 Pg C yr<sup>-1</sup> are thus in the medium to high end of these estimates, notably including a substantial N deposition effect in the tropics. Historically, our simulations indicate N deposition to be responsible for a sequestration of 0.26 Pg C yr<sup>-1</sup> (1900–2006).

Assessing the response of global forest C sinks to N deposition remains of high priority due to expected changes in N deposition rates [Lamarque *et al.*, 2013], remaining gaps in our understanding of relevant processes, and subsequent modeling deficiencies [Zaehle and Dalmonch, 2011]. Future experimental and monitoring efforts should be directed to underrepresented regions, such as the tropics or regions with high expected N inputs, e.g., temperate Asia [see Lamarque *et al.*, 2013]. While most knowledge is derived from temperate ecosystems, it is evident that also there we are not completely confident in modeling CN interactions and they are a key contributor to global N effects; thus, efforts should not be lessened. Ecosystem models should further be rigorously tested with relevant measurements, ideally combining fluxes and pools of C and N, as well as P, a controlling factor with increasing importance not only in the tropics [Peñuelas *et al.*, 2013]. Priorities should also be set to accurately represent processes governing N/P availability and limitation, such as N fixation, N/P uptake, and allocation, as well as interactions with LULCC in ecosystem models.

## Appendix A: Text Box A1

The quantum efficiency scalar  $\alpha_a$  controls CO<sub>2</sub> assimilation per unit photosynthetically active radiation absorbed, when scaling up from the leaf to the canopy level [Tagesson *et al.*, 2009; Smith *et al.*, 2014], and is highly influential on C flux and sequestration in LPJ-GUESS [Zaehle *et al.*, 2005]. It was set at 0.7 for both

model versions. Previous standard LPJ-GUESS C version modeling efforts were based on more conservative estimates, e.g., 0.5 in *Haxeltine and Prentice* [1996], to force the global NPP to be within acceptable limits. However, this often caused an overestimation of primary productivity in boreal forests and an underestimation in temperate forests [*Morales et al.*, 2005; *Jung et al.*, 2007]. Previous settings of  $\alpha_a$  were likely to compensate for the absence of N limitation, and the inclusion of the N cycle in the current study allows us to reproduce the gradient in productivity from temperate to boreal forests due to N cycle dynamics with a more realistic value of  $\alpha_a$  of 0.7 [*Smith et al.*, 2014]. *Smith et al.* [2014], however, uses different settings of  $\alpha_a$ , calibrated separately for the C and CN version to attain global C fluxes and stocks. While this produces realistic global predictions of both C and CN version, it does not allow extraction of the pure N cycle effect on predictions in LPJ-GUESS. For this reason, we have chosen a modeling setup in which C and CN version only differ in their inclusion, or exclusion, of the N cycle.

**Table A1.** List of FLUXNET Sites Included in Analysis ( $n = 68$ ): Name and FLUXNET Abbreviation, Latitude, Year of Last Disturbance Used as Model Input, IGBP-Biome Classification [*Loveland et al.*, 2000] and Climate [*Kottek et al.*, 2006] According to FLUXNET, PFT Classification Used as Model Input for LPJ-GUESS, and Reference

Site	Name	Latitude	Distur.	IGBP	Climate	PFT	Reference <sup>a</sup>
BE-Bra	De Inslag Forest	51.31	1930	MF	TE	MF	<i>Janssens et al.</i> [1999]
BE-Vie	Vielsalm	50.31	1910	MF	TE	MF	<i>Aubinet et al.</i> [2001]
BR-Ban	Ecotone Bananal Island	-9.82	0	EBF	TR	TrBE	<i>da Rocha et al.</i> [2009]
BR-Ji2	Rebio Jara Ji Parana	-10.08	0	EBF	TR	TrBE	<i>von Randow et al.</i> [2004]
BR-Sa1	Santarem km67	-2.86	0	EBF	TR	TrBE	<i>Saleska et al.</i> [2003]
BR-Sa3	Santarem km83	-3.02	0	EBF	TR	TrBE	<i>Saleska et al.</i> [2003]
CA-Ca1	Campbell River, Mature	49.87	1950	ENF	TE	BNE	<i>Humphreys et al.</i> [2006]
CA-Ca2	Campbell River, Clearcut	49.87	1999	ENF	TE	BNE	<i>Humphreys et al.</i> [2006]
CA-Ca3	Campbell River, Young	49.53	1988	ENF	TE	BNE	<i>Humphreys et al.</i> [2006]
CA-Man	BOREAS NSA	55.88	1850	ENF	BO	BNE	<i>Dunn et al.</i> [2007]
CA-NS1	UCI 1850 burn site	55.88	1850	ENF	BO	BNE	<i>Goulden et al.</i> [2006]
CA-NS2	UCI 1930 burn site	55.91	1930	ENF	BO	BNE	<i>Goulden et al.</i> [2006]
CA-NS3	UCI 1964 burn site	55.91	1964	ENF	BO	BNE	<i>Goulden et al.</i> [2006]
CA-NS4	UCI 1964 burn site wet	55.91	1964	ENF	BO	BNE	Mike Goulden
CA-NS5	UCI 1981 burn site	55.86	1981	ENF	BO	BNE	<i>Goulden et al.</i> [2006]
CA-Obs	Sask. SSA Old Black Spr.	53.99	1870	ENF	BO	BNE	<i>Griffis et al.</i> [2003]
CA-Ojp	Sask. SSA Old Jack Pine	53.92	1920	ENF	BO	BNE	<i>Griffis et al.</i> [2003]
CA-Qcu	Quebec Cutover Boreal	49.27	2000	ENF	BO	BNE	<i>Giasson et al.</i> [2006]
CA-Qfo	Quebec Mature Boreal	49.69	1910	ENF	BO	BNE	<i>Bergeron et al.</i> [2007]
CA-SJ2	Sask. Harvest 2002	53.94	2002	ENF	BO	BNE	<i>Coursolle et al.</i> [2006]
CA-TP4	Turkey Point Mature	42.71	1939	ENF	TC	BNE	<i>Arain and Restrepo-Coupe</i> [2005]
CA-WP1	Western Peatland	54.95	1950	MF	BO	MF	<i>Flanagan and Syed</i> [2011]
CN-Cha	Changbaishan	42.4	1800	MF	TC	MF	<i>Guan et al.</i> [2006]
CZ-BK1	Bily Kriz	49.5	1980	ENF	TC	BNE	<i>Reichstein et al.</i> [2005]
DE-Bay	Bayreuth	50.14	1945	ENF	TE	BNE	<i>Staudt and Foken</i> [2007]
DE-Hai	Hainich	51.08	1750	DBF	TE	TeBS	<i>Knohl et al.</i> [2003]
DE-Har	Hartheim	47.93	1960	ENF	TE	TeNE	<i>Schindler et al.</i> [2006]
DE-Tha	Tharandt	50.96	1887	ENF	TE	TeNE	<i>Grünwald and Bernhofer</i> [2007]
DE-Wet	Wetzstein	50.45	1950	ENF	TE	BNE	<i>Anthoni et al.</i> [2004]
DK-Sor	Soroe	55.49	1920	DBF	TE	TeBS	<i>Pilegaard et al.</i> [2003]
ES-ES1	El Saler	39.35	1900	ENF	SM	TeNE	<i>Sanz et al.</i> [2004]
FI-Hyy	Hyytiala	61.85	1960	ENF	BO	BNE	<i>Vesala et al.</i> [2005]
FI-Sod	Sodankyla	67.36	1925	ENF	BO	BNE	<i>Suni et al.</i> [2003]
FR-Fon	Fontainebleau	48.48	1860	DBF	TE	TeBS	<i>Michelot et al.</i> [2011]
FR-Hes	Hesse Forest	48.67	1965	DBF	TE	TeBS	<i>Graniér et al.</i> [2002]
FR-LBr	Le Bray	44.72	1970	ENF	TE	TeNE	<i>Berbigier et al.</i> [2001]
GF-Guy	French Guyana	5.28	1800	EBF	TR	TrBE	<i>Bonal et al.</i> [2008]
ID-Pag	Palangkaraya	2.35	1950	EBF	TR	TrBE	<i>Hirano et al.</i> [2007]
IL-Yat	Yatir	31.34	1965	ENF	DR	TeNE	<i>Grünzweig et al.</i> [2003]
IT-Lav	Lavarone	45.96	1920	ENF	TE	BNE	<i>Marcolla et al.</i> [2003]
IT-Non	Nonantola	44.69	1992	DBF	SM	TeBS	<i>Grassi and Magnani</i> [2005]
IT-PT1	Zerbolo-Parco Ticino-Canarazzo	45.2	1990	DBF	SM	TeBS	<i>Migliavacca et al.</i> [2009]
IT-Ren	Renon	46.59	1820	ENF	TE	BNE	<i>Montagnani et al.</i> [2009]
IT-SRo	San Rossore	43.73	1950	ENF	SM	TeNE	<i>Chiesi et al.</i> [2005]
IT-Vig	Vigevano	45.32	1990	DBF	SM	TeBS	<i>Zenone</i> [2007]

**Table A1.** (continued)

Site	Name	Latitude	Distur.	IGBP	Climate	PFT	Reference <sup>a</sup>
JP-Tef	Teshio Exp Forest	45.06	1835	MF	TC	MF	Takagi et al. [2009]
JP-Tom	Tomakomai	42.74	1960	MF	TC	MF	Hirano et al. [2003]
NL-Loo	Loobos	52.17	1900	ENF	TE	TeNE	Dolman et al. [2002]
RU-Fyo	Fyedorovskoye	56.46	1850	ENF	TC	BNE	Milyukova et al. [2002]
SE-Fla	Flakaliden	64.11	1960	ENF	BO	BNE	Roberntz [2001]
UK-Gri	Griffin	56.61	1980	ENF	TE	BNE	Medlyn et al. [2005a]
UK-Ham	Hampshire	51.12	1940	DBF	TE	TeBS	Read et al. [2009]
US-Bar	Bartlett Exp. Forest	44.06	1880	DBF	TC	TeBS	Ollinger and Smith [2005]
US-Blo	Blodgett Forest	38.9	1990	ENF	SM	BNE	Goldstein et al. [2000]
US-Bn1	Bonanza Creek 1920 burn	63.92	1920	ENF	BO	BNE	Liu et al. [2005]
US-Ho1	Howland (main tower)	45.2	1895	ENF	TC	BNE	Davidson et al. [2006]
US-Ho2	Howland (west tower)	45.21	1895	ENF	TC	BNE	Davidson et al. [2006]
US-LPH	Little Prospect Hill	42.54	1955	DBF	TC	TeBS	Davidson et al. [2006]
US-Me3	Metolius second Young Aged	44.32	1987	ENF	SM	BNE	Campbell and Law [2005]
US-Me4	Metolius Old	44.5	1810	ENF	SM	BNE	Law et al. [2001]
US-MMS	Morgan Monroe State Forest	39.32	1925	DBF	SM	TeBS	Schmid et al. [2000]
US-MOz	Missouri Ozark	38.74	1930	DBF	SM	TeBS	Gu et al. [2006]
US-NC2	North Carolina Loblolly Pine	35.8	1992	ENF	SM	TeNE	Noormets et al. [2010]
US-NR1	Niwot Ridge Forest	40.03	1900	ENF	BO	BNE	Monson et al. [2002]
US-Oho	Oak Openings	41.55	1960	DBF	TC	TeBS	DeForest et al. [2006]
US-UMB	University Michigan Biological Station	45.56	1910	DBF	TC	TeBS	Gough et al. [2013]
US-Wcr	Willow Creek	45.81	1920	DBF	TC	TeBS	Desai et al. [2005]
US-Wrc	Wind River Crane	45.82	1550	ENF	TE	TeNE	Chen et al. [2004]

<sup>a</sup>Name of principal investigator was given if no site reference was available.

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