**REGULAR ARTICLE** 



# Estimating $N_2O$ emissions from soils under natural vegetation in China

Xu-Ri • Yuesi Wang • Yinghong Wang • Haishan Niu • Yongwen Liu • Qianlai Zhuang

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### Abstract

*Background* Natural and managed soils have been identified as the largest sources of atmospheric nitrous oxide  $(N_2O)$ . However, the quantification of  $N_2O$  emissions from soils under natural vegetation in China and their possible responses to changing climate and atmospheric nitrogen deposition remains uncertain. In particular, in-

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formation regarding  $N_2O$  emissions from Chinese shrublands is lacking.

*Method* This study used 28 sets of  $N_2O$  field measurements in China to validate a process-based dynamic nitrogen cycle model (DyN-LPJ), which was then used to investigate the  $N_2O$  fluxes from soils under natural vegetation in China from 1970 to 2009.

*Results* N<sub>2</sub>O emissions from Chinese forests, grasslands, and shrublands in the 2000s were estimated to be  $0.10 \pm 0.06$  Tg N yr.<sup>-1</sup>,  $0.09 \pm 0.09$ , Tg N yr.<sup>-1</sup> and  $0.14 \pm 0.07$  Tg N yr.<sup>-1</sup>, respectively. Monthly N<sub>2</sub>O fluxes were linearly correlated with precipitation, and exponentially (Q<sub>10</sub> = 3) with air temperature. The total N<sub>2</sub>O fluxes from natural terrestrial ecosystems in China increased from  $0.28 \pm 0.03$  Tg N yr.<sup>-1</sup> in the 1970s to  $0.46 \pm 0.03$  Tg N yr.<sup>-1</sup> in the 2000s. Warming and atmospheric nitrogen deposition accounted for 37% (or  $0.07 \pm 0.03$  Tg N) and 63% (0.11 ± 0.01 Tg N) of this increase respectively.

*Conclusions* Our results indicate that when compared to grassland ecosystems, N<sub>2</sub>O emissions from forest and shrubland ecosystems contain larger uncertainties due to either their uncertain areal extent or their emission rates. Long-term and continuous field measurements should be conducted to obtain more representative data in order to better constrain shrubland N<sub>2</sub>O emissions.

 $\label{eq:constraint} \begin{array}{l} \mbox{Keywords} \ N_2O \cdot Natural terrestrial ecosystems \cdot China \cdot \\ \mbox{Shrubland} \cdot Forest \cdot Grassland \cdot Atmospheric nitrogen \\ \mbox{deposition} \cdot Climate change \end{array}$ 

# Introduction

Nitrous oxide (N<sub>2</sub>O) is a potent long-lived greenhouse gas with a global warming potential that is nearly 300 times greater than that of carbon dioxide (CO<sub>2</sub>), and is a major contributor to stratospheric ozone destruction (Wuebbles 2009). Atmospheric concentrations of N<sub>2</sub>O have been increasing rapidly for a number of decades. Recent analyses indicate that the increase is caused by disturbance of the natural N cycle and associated N<sub>2</sub>O production through nitrification and denitrification (Ciais et al. 2014; Kroeze et al. 1999). Estimates of the global total emission from soils under natural vegetation vary from 3.3 to 9.9 Tg N yr.<sup>-1</sup>. This amount is similar to the sum of all anthropogenic sources, including agriculture (Ciais et al. 2014; Denman et al. 2007).

The land area in China is approximately  $9.6 \times$  $10^{12}$  m<sup>2</sup>, accounting for 7% of the global terrestrial land area (Hou et al. 1982). The cropland area is about  $1.68 \times 10^{12}$  m<sup>2</sup> according to Vegetation Map of China (VMC) (1:4000000) (Hou et al. 1982) (http://westdc. westgis.ac.cn) and accounts for 17.5% of the Chinese land area. N<sub>2</sub>O emissions from cultivated soils are most often estimated as the sum of two independent parts, i.e., background and fertilizer-induced emissions (Bouwman 1996; Bouwman et al. 2002; Stehfest and Bouwman 2006; Yan et al. 2003). The N<sub>2</sub>O emissions from Chinese cropland including background emissions have been estimated to be 0.15 Tg N yr.<sup>-1</sup> by Chen et al. (2000), 0.37 Tg N yr.<sup>-1</sup> (range: 0.29–0.47 Tg N yr.<sup>-1</sup>) by Cai (2012) and 0.34 Tg N yr.<sup>-1</sup> (range: 0.17–0.51 Tg N yr.<sup>-1</sup>) by using the DeNitrification-DeComposition (DNDC) model (Li et al. 2001); The emissions at 0.20 Tg N yr.<sup>-1</sup> (Yan et al. 2003) and 0.28 Tg N yr.<sup>-1</sup> (range: 0.06–0.65 Tg N yr.<sup>-1</sup>) (Zheng et al. 2004) were also estimated, when excluding the background emissions. Large uncertainties still exist in the estimation of background emissions for China. For example, using the revised 1996 IPCC Guidelines for National Greenhouse Gas Inventories, Yan et al. (2003 ) estimated emissions at 0.13 Tg N yr.<sup>-1</sup>, while Li et al. (2001) estimated emissions at 0.18 Tg N vr.<sup>-1</sup> using the DNDC model, and the emissions were 0.10-0.12Tg N yr.<sup>-1</sup> based on observational data (Gu et al. 2007; Gu et al. 2009). Background N<sub>2</sub>O emissions across different soil types and climate regions are significantly regulated by the climate, but the current IPCC approach does not consider these effects (Gu et al. 2009; Lu et al. 2006). To date, a number of studies have estimated natural ecosystem soil N2O emissions. For example, a direct extrapolation from field studies estimated the emissions at 0.42 Tg N yr.<sup>-1</sup> (Cai 2012), which were very similar to processbased models estimates of 0.44 Tg N yr.<sup>-1</sup> (Lu and Tian 2013). Emissions from Chinese unmanaged grassland soils were estimated ranging from 0.04 to 0.13 Tg N yr.<sup>-1</sup> through direct extrapolations (Cai 2012; Chen et al. 2000; Huang et al. 2003) and using process-based models (Tian et al. 2011; Zhang et al. 2010). In contrast, the uncertainty range for Chinese forest soil emissions is much larger, ranging from 0.09 Tg N yr.<sup>-1</sup> (Chen et al. 2000) to  $0.29 \pm 0.17$  Tg N yr.<sup>-1</sup>(Cai 2012). In addition, the soil N<sub>2</sub>O emissions from Chinese shrubland has never been estimated as a separate entity (Cai 2012). These major uncertainties are from either uncertain natural vegetation coverage data or uncertain emissions rates for specific vegetation types. Especially for Chinese forest ecosystems, there are only a few soil N<sub>2</sub>O emission observations and even less for tropical and subtropical forest ecosystems before the 2000s.

Atmospheric N deposition rates have dramatically increased with the increase of anthropogenic nitrogen use (Liu et al. 2013; Lü and Tian 2007). This increase in atmospheric N deposition may have altered the terrestrial N cycle by increasing the rates of the microbial processes nitrification and denitrification and thereby the leaching of soil mineral N, such as  $NO_3^$ concentration and N<sub>2</sub>O emissions (Lu et al. 2011). Relatively little is known about how the increase in N deposition have altered N<sub>2</sub>O emissions from natural ecosystems in China.

In this study we used a process-based dynamic nitrogen cycle model (DyN-LPJ) that has previously been comprehensively evaluated using 66 sets of measurements of total annual N<sub>2</sub>O emissions from global natural ecosystems (Xu-Ri et al. 2012). We used an additional 28 sets of measurements covering 18 sites of grassland and forest ecosystems in China to further calibrate the model. The calibrated model was then used to quantify the N<sub>2</sub>O emissions from the soils under natural vegetation and the background emissions from croplands in China. The contributions from grasslands, forests, and shrublands to total natural soil N<sub>2</sub>O emissions in China was analyzed and their emission responses to changing climate and atmospheric N deposition were quantified.

# Materials and methods

# Model description

DyN-LPJ (Xu-Ri and Prentice 2008) is based on the Lund-Potsdam-Jena (LPJ) dynamic global vegetation modelling framework (Sitch et al. 2003) (Fig. 1). In addition to the coupled carbon and water cycling and vegetation dynamics simulated in LPJ, DyN includes following sub-models: (1) plant N uptake, (2) plant N allocation, turnover, reproduction, and mortality, (3) plant and soil N mineralization, (4) biological N<sub>2</sub>-fixation, (5) nitrification, (6) NH<sub>3</sub> volatilization, (7) nitrate leaching, (8) denitrification, and (9) N<sub>2</sub>, N<sub>2</sub>O and NO production and emission. Sub-model (2) uses an annual time step; the others use a daily time step. The model runs at a spatial resolution of  $0.5^{\circ} \times 0.5^{\circ}$  (Xu-Ri and Prentice 2008).  $N_2O$  fluxes were modelled as byproducts of nitrification and denitrification. Nitrification is assumed to occur in aerobic microsites within the top 50 cm of soil, while denitrification is assumed to occur in anaerobic microsites within the same soil layer. Soil moisture (water filled pore space, WFPS) was used as an indicator to allocate substrates into two soil fractions with different aeration status. Nitrification and denitrification rates were then calculated directly from substrate availability (NH<sub>4</sub><sup>+</sup> for nitrification; labile C, NO<sub>3</sub><sup>-</sup> and NO<sub>2</sub><sup>-</sup> for denitrification) and soil environmental factors (soil temperature and WFPS). The rate of each transformation was regulated by the substrate concentrations (NH<sub>4</sub><sup>+</sup>, labile C, NO<sub>3</sub><sup>-</sup> or NO<sub>2</sub><sup>-</sup>) following Michaelis–Menten kinetics and soil temperature. The detailed functions and parameters for nitrification and denitrification are documented in Xu-Ri and Prentice (2008). We applied the maximum fraction of N<sub>2</sub>O losses from nitrification and denitrification as 0.05% (R<sub>N2ON</sub>) and 1.8%(R<sub>N2ODN</sub>), respectively (Xu-Ri et al. 2012).

# Model evaluation

Twenty-eight sets of measurements, covering 18 sites were used in this study for model evaluation (Fig. 2). As shown in Table 1, the first 5 sites have been used in a previous global-scale evaluation (Xu-Ri et al. 2012), the additional 23 sets of measurements of annual  $N_2O$  emissions (covering 13 sites), conducted during the period 2003–2006, were used in this study for model calibration for grassland, forest, desert and alpine steppe



Fig. 1 Model structure for the process-based model DyN-LPJ



Fig. 2 Locations of the soil  $N_2O$  measurements from different terrestrial ecosystems in China, used for model evaluation; details provided in Table 1

ecosystems in China (Table 1, Fig. 2). These measurements were all conducted in the field, using closed chamber techniques and gas chromatography. Three gas flux measurement locations within each of the above sites were established randomly and  $N_2O$  fluxes were typically measured at the same time period (usually midmorning, 10:00–12:00 h) of each sampling day and 1–2 times per week during the growing season and 1–2 times per month during winter.

The N<sub>2</sub>O fluxes were determined using opaque static chambers with subsequent analysis on a gas chromatograph (GC) fitted with an electron capture detector (ECD). In studies 6–22 and 24–28 the carrier gas used was nitrogen gas (N<sub>2</sub>). However, Zheng et al. (2008) showed that only using N<sub>2</sub> as carrier gas can overestimate the N<sub>2</sub>O concentration. The reason is an interference of the presence of large concentrations of carbon dioxide (CO<sub>2</sub>) in the gas samples collected. To combat this problem ascarite was added to the carrier gas stream to remove the CO<sub>2</sub> from the air samples. By comparing the N<sub>2</sub> only (the DN method) with the N<sub>2</sub>-Ascarite method, Zheng et al. (2008) proposed correction terms for  $N_2O$  flux measurements. Using the correction terms, we adjusted the  $N_2O$  fluxes for studies No. 6–22 (Table 1). Emissions in study 24–28 had already been corrected by Gu et al. (2009), using the same method, and studies 1–5 and 23 did not require any correction.

For comparison, annual  $N_2O$  emissions were simulated at the geographic location of each site following the transient simulation protocol described below. The simulated results were compared with the specific grid cell location and specific year of each measurement. The simulated cropland background  $N_2O$  emissions represent the potential natural soil  $N_2O$  emissions in cropland areas.

### Historic simulations for China

The transient model runs were set up using identical parameter values, model protocols and forcing to the simulations described by Xu-Ri et al. (2012) except that the transient runs were extended to 2009. TS 3.10.1 climate data (http://www.cru.uea.ac.uk/cru/data/hrg/) from the Climatic Research Unit and updated

Table 1	Observed annual N2C	emissions from	China for com	parison with	the model results
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No.	Long.	Lat.	Vegetation type	Year observed	$N_2O$ fluxes (uncorrected data) kg N ha <sup>-1</sup> yr. <sup>-1</sup> ± SD	$N_2O$ fluxes (corrected data <sup>1</sup> ) kg N ha <sup>-1</sup> yr. <sup>-1</sup> ± SD	Location	Sources
Soils	s under	natural	l vegetation, used fo	or model calib	pration in Xu-Ri et al. (	(2012)		
1*	93	35	Alpine steppe	2000		0.07	Wudaoliang, Tibet	(Pei 2003)
2*	116.5	39.5	Temperate forest	1997–1998		0.28	Beijing	(Sun and Xu 2001)
3*	127	41.5	Alpine tundra	1994–1995		0.28	ChangBai Mountain	(Chen et al. 2000)
4*	116.0	43.5	Temperate steppe	1995		0.27	Inner Mongolia	(Chen et al. 2000)
5*	116.5	43.5	Temperate steppe	1998		0.37	Inner Mongolia	(Xu-Ri et al. 2003)
Soils	s under	natural	lvegetation					
6 7	101.5 101.5	37.5 37.5	Alpine meadow	2003 2004	$\begin{array}{c} 2.55 \pm 1.91 \\ 1.84 \pm 1.71 \end{array}$	$\begin{array}{c} 0.23 \pm 0.31 \\ 0.16 \pm 0.29 \end{array}$	Qinghai, Haibei	Data provided in this study
8	101.5	37.5		2005	$2.67\pm2.76$	$0.92\pm1.03$		
9	101.5	38	Alpine shrub	2003	$2.37 \pm 1.25$	$0.70\pm0.47$		
10	101.5	38		2004	$1.90 \pm 1.80$	$0.51\pm0.46$		
11 12	102.5 102.5	33 33	Alpine swamp	2004 2005	$\begin{array}{c} 0.67 \pm 1.15 \\ 0.73 \pm 0.77 \end{array}$	$\begin{array}{c} 0.30 \pm 0.53 \\ 0.31 \pm 0.45 \end{array}$	Ruoergai, Sichuan	
13 14	87.5 87.5	44.5 44.5	Temperate desert	2004 2005	$\begin{array}{c} 0.83 \pm 1.68 \\ 0.25 \pm 1.66 \end{array}$	$\begin{array}{c} 0.31 \pm 1.24 \\ 0.05 \pm 0.96 \end{array}$	Fukang, Xinjiang	
15 16	113 113	22.5 22.5	Subtropical forest	2004 2005	$3.14 \pm 3.83$ $3.78 \pm 4.20$	$\begin{array}{c} 1.60 \pm 3.26 \\ 2.26 \pm 3.66 \end{array}$	HeShan, Guangdong	
17 18	102 102	22 22	Tropical forest	2003 2004	$3.01 \pm 2.66$ $1.82 \pm 1.47$	$\begin{array}{c} 1.22 \pm 0.90 \\ 0.84 \pm 0.92 \end{array}$	Xishuang banna, Yunnan	
19	102	22		2005	$1.61 \pm 1.88$	$1.05\pm0.92$		
20 21	112.5 112.5	23 23	Tropical forest	2003 2004	$3.46 \pm 2.67$ $3.80 \pm 2.86$	$\begin{array}{c} 1.51 \pm 1.20 \\ 1.39 \pm 0.89 \end{array}$	Dinghushan, Guangdong	
22	112.5	23		2005	$4.72\pm2.70$	$2.06 \pm 1.06$		
23	90.5	30.5	Alpine steppe	2009		$0.01\pm0.02$	Namco, Tibet	(Wei et al. 2012)
Back	cground	emiss	ions from croplands	8				
24*	123.5	41.5	Maize-spring wheat	2004–2005		1.12	Shenyang Liaoning	(Gu et al. 2007) and subsequently
25*	114.5	35	Winter wheat-maize	2004–2006		0.67	Fengqiu Henan	corrected by (Gu et al. 2009)
26*	119	32	Winter wheat-rice	2004–2006		1.00	Jiangdu Jiangsu	
27*	120.5	31.5	Winter wheat-rice	2002–2004		1.70	Wuxi, Jiangsu	
28*	105	31	Winter wheat-rice	2005–2006		1.28	Yanting Sichuan	

\*the value provided for site 1-5 and site 24-28 are directly cited from the original literature, SD values were not available

atmospheric  $CO_2$  concentration data from Keeling et al. (2009) were used. For a model spin-up period of 2000 years, we used climate input from 1901 to 1930. Thereafter, the model was run with transient monthly climate data from 1901 to 2009. These transient simulations were performed at both site level and national-scale.

Six historic simulations were performed: (1) all factors including  $CO_2$ , climate and N deposition varied throughout the twentieth century, (2)  $CO_2$  and climate varied without N deposition, (3) climate varied but kept  $CO_2$  constant, (4) only temperature varied, (5) only precipitation varied, (6) only cloud cover varied. In simulation (4), (5) and (6),  $CO_2$  was kept at 296 ppm, while the "fixed" climate variables were held at their 1901–1920 averages. Simulations were conducted for the period of 1901 to 2009. The simulations for the period 1970 to 2009 were analyzed.

The atmospheric N deposition data for China for the years 1860 to 1993 were taken from Dentener (2006) and were linearly interpolated to daily time steps and extrapolated to the period after 1993. The datasets include annual N deposition rates for ammonium and nitrate and were added to the soil ammonium and nitrate compartment. This simple approach estimates the magnitude, trend, and distribution of N deposition during the twentieth century. We recognize these estimates will not realistically represent true N deposition dynamics but will allow us to approximately assess the effects of atmospheric N

deposition on  $N_2O$  emission rates. The land areas of natural terrestrial ecosystems in China were extracted from the Vegetation Map of China (1:4000000) (Hou et al. 1982) (http://westdc.westgis.ac.cn), as shown in Fig. S1 and Table 2. In this vegetation map, crop type includes the staple crops (rice, wheat, maize), economic crops, fruit orchards, and economic forests.

### Results

Comparison between simulated and observed  $N_2O$  fluxes

Our 28 sets of measurements cover 18 sites (Fig. 2), comprising alpine steppe, alpine tundra, alpine meadow,

Natural vegetation         Forests         Temperate, coniferous forest (TeConf) $0.168$ $0.183 \pm 0.069$ $0.003 \pm 0.00$ Subtropical coniferous forest (SubTrConf) $0.541$ $0.595 \pm 0.456$ $0.032 \pm 0.02$ Temperate deciduous forest (TeDecf) $0.309$ $0.281 \pm 0.205$ $0.009 \pm 0.00$ Tropical and subtropical deciduous forest $0.440$ $1.181 \pm 0.669$ $0.052 \pm 0.02$ (TrDecf)         1.458 $0.006 \pm 0.06$ $0.091 \pm 0.02$ Total         1.458 $0.405 \pm 0.384$ $0.050 \pm 0.04$ Shrublands         Temperate shrublands (TeShrub)** $1.225$ $0.405 \pm 0.384$ $0.0091 \pm 0.02$ (TrShrub)*** $0.446$ $1.073 \pm 0.206$ $0.091 \pm 0.02$ $(TeShrub)**$ Total         Total         2.070 $0.141 \pm 0.06$ $Grasslands$ Temperate grasslands and meadow $1.034$ $0.467 \pm 0.344$ $0.041 \pm 0.02$ (TeGras)         1.467 $0.159 \pm 0.220$ $0.023 \pm 0.03$ $Grasslands$ Temperate grassland s and meadow $1.034$ $0.467 \pm 0.344$ $0.041 \pm 0.02$ (TeGras)         Alpine grassland (SubTrGras) $0.051$			Vegetation type	Area (×10 <sup>12</sup> m <sup>2</sup> )	Average fluxes (2000–2009) (kg N ha <sup>-2</sup> yr. <sup>-1</sup> ±SD*)	Total fluxes (Tg N yr. <sup>-1</sup> )
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	Natural vegetation	Forests	Temperate, coniferous forest (TeConf)	0.168	$0.183 \pm 0.069$	$0.003\pm0.001$
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$			Subtropical coniferous forest (SubTrConf)	0.541	$0.595 \pm 0.456$	$0.032\pm0.025$
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$			Temperate deciduous forest (TeDecf)	0.309	$0.281\pm0.205$	$0.009\pm0.006$
Total       1.458 $0.096 \pm 0.06$ Shrublands       Temperate shrublands (TeShrub)** $1.225$ $0.405 \pm 0.384$ $0.050 \pm 0.04$ Topical and subtropical shrublands $0.846$ $1.073 \pm 0.206$ $0.091 \pm 0.025$ (TrShrub)***       Total $2.070$ $0.141 \pm 0.066$ Grasslands       Temperate desert (TeDes) $1.467$ $0.159 \pm 0.220$ $0.023 \pm 0.035$ Temperate grasslands and meadow $1.034$ $0.467 \pm 0.344$ $0.041 \pm 0.025$ (TeGras)       Temperate grassland and meadow (AlGras) $1.090$ $0.096 \pm 0.101$ $0.011 \pm 0.011$ Subtropical grassland (SubTrGras) $0.051$ $1.266 \pm 1.078$ $0.006 \pm 0.000$ Total       Total $3.695$ $0.090 \pm 0.08$ Total $3.695$ $0.090 \pm 0.08$ Total $1.682$ $0.784 \pm 0.471$ $0.132 \pm 0.07$ No vegetation area       No vegetation (NoVege) $0.518$ $0.126 \pm 0.141$ $0.007 \pm 0.00$ Lakes       Lakes (Lakes) $0.065$ $0.552 \pm 0.447$ $0.004 \pm 0.00$ Total       Lakes (Lakes) $0.065$ $0.552 \pm 0.447$ $0.004 \pm 0.00$			Tropical and subtropical deciduous forest (TrDecf)	0.440	$1.181 \pm 0.669$	$0.052\pm0.029$
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		Total		1.458		$0.096\pm0.061$
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		Shrublands	Temperate shrublands (TeShrub)**	1.225	$0.405 \pm 0.384$	$0.050\pm0.047$
Total       2.070 $0.141 \pm 0.066$ Grasslands       Temperate desert (TeDes) $1.467$ $0.159 \pm 0.220$ $0.023 \pm 0.032$ Temperate grasslands and meadow $1.034$ $0.467 \pm 0.344$ $0.041 \pm 0.024$ (TeGras)       Alpine grassland and meadow (AlGras) $1.090$ $0.096 \pm 0.101$ $0.011 \pm 0.011$ Subtropical grassland (SubTrGras) $0.051$ $1.266 \pm 1.078$ $0.006 \pm 0.000$ Temperate and alpine swamp (Te-AlSwa) $0.054$ $0.206 \pm 0.178$ $0.001 \pm 0.00$ Total       3.695 $0.990 \pm 0.081$ $0.132 \pm 0.079$ Total       Crop (Crop) $1.682$ $0.784 \pm 0.471$ $0.132 \pm 0.079$ No vegetation area       No vegetation (NoVege) $0.518$ $0.126 \pm 0.141$ $0.007 \pm 0.000$ Lakes       Lakes (Lakes) $0.065$ $0.552 \pm 0.447$ $0.004 \pm 0.000$			Tropical and subtropical shrublands (TrShrub)***	0.846	$1.073\pm0.206$	$0.091 \pm 0.022$
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$		Total		2.070		$0.141\pm0.069$
$\begin{array}{c} \mbox{Temperate grasslands and meadow} & 1.034 & 0.467 \pm 0.344 & 0.041 \pm 0.024 \\ (TeGras) & & & & & & & & & & & & & & & & & & &$		Grasslands	Temperate desert (TeDes)	1.467	$0.159\pm0.220$	$0.023\pm0.032$
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$			Temperate grasslands and meadow (TeGras)	1.034	$0.467\pm0.344$	$0.041 \pm 0.029$
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$			Alpine grassland and meadow (AlGras)	1.090	$0.096 \pm 0.101$	$0.011\pm0.011$
$\begin{array}{cccc} \mbox{Temperate and alpine swamp (Te-AlSwa)} & 0.054 & 0.206 \pm 0.178 & 0.001 \pm 0.000 \\ \mbox{Total} & & & & & & & & & & & & & & & & & & &$			Subtropical grassland (SubTrGras)	0.051	$1.266 \pm 1.078$	$0.006\pm0.006$
Total $3.695$ $0.090 \pm 0.08$ Total			Temperate and alpine swamp (Te-AlSwa)	0.054	$0.206\pm0.178$	$0.001\pm0.001$
Total         cropland, background emissions       Crop (Crop) $1.682$ $0.784 \pm 0.471$ $0.132 \pm 0.079$ Total $1.682$ $0.784 \pm 0.471$ $0.132 \pm 0.079$ No vegetation area       No vegetation (NoVege) $0.518$ $0.126 \pm 0.141$ $0.007 \pm 0.000$ Lakes       Lakes (Lakes) $0.065$ $0.552 \pm 0.447$ $0.004 \pm 0.000$ Total $9.489$ $0.462 \pm 0.290$		Total		3.695		$0.090\pm0.086$
$ \begin{array}{c} {\rm cropland, background} \\ {\rm emissions} \\ {\rm Total} \\ {\rm No \ vegetation \ area} \\ {\rm Lakes} \\ {\rm Lakes \ (Lakes)} \\ {\rm Total} \\ \end{array} \begin{array}{c} {\rm Crop \ (Crop)} \\ {\rm 1.682} \\ {\rm 0.784 \pm 0.471} \\ {\rm 0.132 \pm 0.074} \\ {\rm 0.132 \pm 0.074} \\ {\rm 0.007 \pm 0.001} \\ {\rm 0.007 \pm 0.001} \\ {\rm 0.004 \pm 0.001} \\ {\rm 0.004 \pm 0.001} \\ {\rm 0.004 \pm 0.001} \\ {\rm 0.462 \pm 0.294} \\ {\rm 0.464 \pm 0.464} \\ {\rm 0.464 $	Total					
Total $1.682$ $0.132 \pm 0.07$ No vegetation area         No vegetation (NoVege) $0.518$ $0.126 \pm 0.141$ $0.007 \pm 0.00$ Lakes         Lakes (Lakes) $0.065$ $0.552 \pm 0.447$ $0.004 \pm 0.00$ Total $9.489$ $0.462 \pm 0.292$ $0.462 \pm 0.292$	cropland, background emissions		Crop (Crop)	1.682	$0.784 \pm 0.471$	$0.132 \pm 0.079$
No vegetation area         No vegetation (NoVege) $0.518$ $0.126 \pm 0.141$ $0.007 \pm 0.00$ Lakes         Lakes (Lakes) $0.065$ $0.552 \pm 0.447$ $0.004 \pm 0.00$ Total         9.489 $0.462 \pm 0.29$ $0.462 \pm 0.29$		Total		1.682		$0.132\pm0.079$
Lakes         Lakes (Lakes) $0.065$ $0.552 \pm 0.447$ $0.004 \pm 0.002$ Total $9.489$ $0.462 \pm 0.292$	No vegetation area		No vegetation (NoVege)	0.518	$0.126 \pm 0.141$	$0.007\pm0.007$
Total 9.489 0.462 ± 0.29	Lakes		Lakes (Lakes)	0.065	$0.552\pm0.447$	$0.004\pm0.003$
	Total			9.489		$0.462\pm0.298$

\*Standard deviations are for the spatial variation of simulated N<sub>2</sub>O emissions per grid cell

\*\*The vegetation types within the TeShrub includes temperate and subtropical deciduous shrub, brushwood and low forest

\*\*\*The vegetation types within the TrShrub include the tropical and subtropical evergreen shrub, brush wood and low forest

alpine shrubland, alpine swamp, temperate desert, temperate steppe and temperate forest, tropical forest and subtropical forest (Table 1, No. 1–23). The remaining five sites were background emissions from cultivated soils (Table 1, No. 24–28).

Simulated and observed annual N<sub>2</sub>O fluxes were highly correlated either with ( $R^2 = 0.75$ , n = 28, p < 0.001) or without ( $R^2 = 0.70$ , n = 28, p < 0.001) N deposition. However, the slope was closer to the 1:1 line when atmospheric N deposition was considered (slope = 0.94, as shown in Fig. 3), especially for the tropical and subtropical forest areas, and the background emissions from cultivated soils, where the N<sub>2</sub>O emissions rate was higher than 1 kg N ha<sup>-1</sup> yr.<sup>-1</sup>(Table 1, Fig. 3).

We compared the observed and simulated monthly soil  $N_2O$  emissions (kg N ha<sup>-1</sup> month<sup>-1</sup>) for two temperate grasslands in Inner Mongolia in 1998 and Haibei in 2004; and two tropical forests sites in Heshan in 2004 and DingHushan in year of 2005. The correlation coefficients of these measurement and model results are 0.93 (Inner Mongolia), 0.86 (Haibei), 0.65 (Heshan), and 0.68 (Dinghushan), respectively (Fig. 4). The model generally captured the seasonal variation of soil N<sub>2</sub>O emissions in monsoon climate regions of China, which is highly consistent with the precipitation seasonality (Fig. S2).

N<sub>2</sub>O emissions correlated linearly and exponentially with precipitation and temperature on either monthly or annual time scale, respectively (Fig. 5). The linear and exponential correlation at monthly time step was significant ( $R^2 = 0.64$ ,  $R^2 = 0.45$ , n = 96, p < 0.01). The



Fig. 3 Observed versus simulated annual N<sub>2</sub>O fluxes from soils of terrestrial ecosystems in China, before (open symbols) and after (closed symbols) atmospheric N deposition was included

exponential fit showed a  $Q_{10}$  (the factor by which the rate increases with a 10 °C rise in temperature) value of 2.99, with a temperature range between 10 °C and 20 °C. Our model simulations of N<sub>2</sub>O fluxes correlated well with temperature and precipitation at monthly and annually time scales. Large soil N<sub>2</sub>O emissions occurred when the soil moisture and temperature were high. Some of the discrepancies between modeled and simulated N<sub>2</sub>O fluxes on the monthly time scale were expected as the observation were conducted at the site scale while our climate data for driving the model are at  $0.5^{\circ} \times 0.5^{\circ}$  spatial resolution. Additionally, our model might have failed to capture the enhanced soil N<sub>2</sub>O emissions during spring thawing events and the soils N<sub>2</sub>O uptake during the non-growing season (Fig.4).

# $N_2O$ emissions from natural terrestrial ecosystems in China in the 2000s

N<sub>2</sub>O emissions were highest in the humid tropics but limited by low temperatures in temperate and boreal ecosystems, and by low soil moisture in the desert areas of China (Figs. 6a, b). Tropical and subtropical deciduous forests, shrubland, grassland and coniferous forests were predicted to emit  $1.18 \pm 0.67, 1.07 \pm$ 0.21,  $1.27 \pm 1.08$ , and  $0.60 \pm 0.46$  kg N<sub>2</sub>O-N ha<sup>-1</sup> yr.<sup>-1</sup>, respectively (Table 2). The N<sub>2</sub>O emissions of temperate deciduous forests, shrubland, grassland, deserts, swamps and coniferous forests were predicted to be  $0.28 \pm 0.21$ ,  $0.41 \pm 0.38$ ,  $0.47 \pm$ 0.34,  $0.16 \pm 0.22$ ,  $0.21 \pm 0.18$  and  $0.18 \pm 0.07$  kg N<sub>2</sub>O-N ha<sup>-1</sup> yr.<sup>-1</sup>, respectively. Alpine grassland and meadow, with a very low emissions rate, were predicted to be  $0.01 \pm 0.10 \text{ kg N}_2\text{O-N ha}^{-1} \text{ yr.}^{-1}$ . The potential natural soil N2O emissions from the cropland area were predicted as  $0.78 \pm 0.47$  kg N<sub>2</sub>O-N  $ha^{-1}$  yr.<sup>-1</sup> (Fig. S3).

When we aggregated the fluxes for different ecosystems according to their specific distribution maps (Fig. S1), we found that N<sub>2</sub>O emissions from shrubland played an important role either in temperate or in subtropical regions, because of their relatively larger distribution area when compared to forest and grassland (Fig. S4, Table 2). The total emissions from shrublands were  $0.14 \pm 0.07$  Tg N, and N<sub>2</sub>O emissions from forest and grassland amounted to  $0.10 \pm 0.06$  and  $0.09 \pm 0.09$  Tg N, respectively (Fig. 7, Table 2). The potential background N<sub>2</sub>O emissions from cropland areas were  $0.13 \pm$ 0.08 Tg N (as shown in Table 2 and Fig. 7). The total



**Fig. 4** Comparison of observed (closed symbols) and simulated (open symbols) monthly soil  $N_2O$  emissions (kg N ha<sup>-1</sup> month<sup>-1</sup>) from temperate grasslands: (a) Inner Mongolia (1994) and (b) Haibei (2004); and tropical forests: (c) Heshan 2004 and (d) DingHushan 2005)

amount of N<sub>2</sub>O emissions from the soil of natural terrestrial ecosystems in China in the 2000s was estimated to be  $0.46 \pm 0.30$  Tg N with, and  $0.35 \pm 0.34$  Tg N without N deposition (Table 2).

Responses of N<sub>2</sub>O emissions in China to a changing climate and atmospheric N deposition

The total amount of N<sub>2</sub>O emissions from natural terrestrial ecosystems in China increased from  $0.28 \pm 0.03$  Tg N in the 1970s (average for 1970–1979) to  $0.46 \pm 0.03$  and  $0.35 \pm 0.02$  Tg N with and without considering N deposition, respectively, in the 2000s (average for 2000–2009). Warming and atmospheric N deposition accounted for 37% (or 0.07 Tg N) and 63% (or 0.11 Tg N) of the increase in N<sub>2</sub>O, respectively, while the effects of precipitation, cloud and atmospheric CO<sub>2</sub> concentrations were negligible (Fig. 8).

Atmospheric N deposition rates during the period 2000–2010 (2000s) were estimated to be  $8.36 \pm 8.56$  Tg N. The N deposition rates used were an average of

10.19 kg N ha<sup>-1</sup> yr.<sup>-1</sup> and a maximum of 40 kg N ha<sup>-1</sup> yr.<sup>-1</sup> (Fig. S5). Their distribution patterns and magnitudes were closer to the observation based estimates of 12.89 kg N ha<sup>-1</sup> yr.<sup>-1</sup> by Lü and Tian (2007). The N<sub>2</sub>O increase resulting from atmospheric N deposition was  $0.11 \pm 0.01$  TgN (Figs. 6a, b), with an average emission factor of 1.19% (Fig. S6). Similarly, the increase of 0.17 Tg N from Lü and Tian (2007) might be due to their higher estimated atmospheric N deposition for China.

### N2O emissions versus net primary productivity

Satellite derived net primary productivity (NPP) has been used as an important variable to simulate global soil N<sub>2</sub>O emissions (Potter and Klooster 1998; Potter et al. 1996). In this study, we examined the relationships between the modeled N<sub>2</sub>O emissions and NPP on both spatial and temporal scales (Fig. 9). For China, spatially, the modeled soil N<sub>2</sub>O emissions (g N m<sup>-2</sup> yr.<sup>-1</sup>) were highly correlated with NPP (kg C m<sup>-2</sup> yr.<sup>-1</sup>) with a slope



Fig. 5 Comparison between observed and simulated monthly (**a**, **b**) and annual (**c**, **d**) soil N<sub>2</sub>O emissions (kg N ha<sup>-1</sup> month<sup>-1</sup>) with monthly and annual air temperature (**a**, **c**) and precipitation (**b**, **d**). Open circles do not include atmospheric N deposition rates, and

of 0.13 ( $R^2 = 0.83$ , p < 0.001). Temporally, the correlations were also significant with a slope of 0.17 ( $R^2 = 0.99$ , p < 0.001).

### Discussions

### N<sub>2</sub>O emissions from grassland ecosystems

N<sub>2</sub>O emissions from grassland ecosystems have been estimated in many studies, either by direct extrapolation, ranging from 0.04 to  $0.13 \pm 0.16$  Tg N (Cai 2012; Chen et al. 2000; Huang et al. 2003), or via process-based model estimations, using either the DNDC model (0.08  $\pm 0.01$  Tg N; Zhang et al. 2010), or the Dynamic Land Ecosystem Model (DLEM) model ( $0.10 \pm 0.01$  Tg N; Tian et al. 2011). Our estimation of  $0.09 \pm 0.09$  Tg N falls within the above ranges; but from the perspective of the annual average emissions rate, the estimated value of  $0.24 \pm 0.23$  kgN ha<sup>-1</sup> yr.<sup>-1</sup> (Table 3) is closer to the

closed circles represent data were N deposition was included. Monthly comparison includes sites 5, 7, 10, 11, 13, 15, 18, 21 and the annual comparison includes all 28 sites listed in Table 1

value of  $0.22 \pm 0.04$  kgN ha<sup>-1</sup> yr.<sup>-1</sup> estimated by the DNDC model (Zhang et al. 2010).

### N<sub>2</sub>O emissions from forest ecosystems

Our model estimates of N<sub>2</sub>O emissions from forest ecosystems were  $0.10 \pm 0.06$  Tg N and were similar to the emissions of  $0.09 \pm 0.09$  Tg N from grassland soils (Table 3). But, forest ecosystems cover a smaller area of China and per unit area therefore have a higher emission rate of  $0.66 \pm 0.42$  kg N ha<sup>-1</sup> yr.<sup>-1</sup> compared to grasslands ( $0.24 \pm 0.23$  kg N ha<sup>-1</sup> yr.<sup>-1</sup>). Our estimate is consistent with those of Chen et al. (2000), 0.10 Tg N, but much lower than that of Cai (2012),  $0.29 \pm 0.19$  Tg N. The higher estimate of Cai (2012) may be partly because most of the N<sub>2</sub>O emissions in China during the 2000s were measured using the DN-method, as detailed in section "Model evaluation".

This study includes three observation sites in tropical and subtropical forests: Guangdong Heshan, Guangdong Fig. 6 Spatial distribution of N<sub>2</sub>O fluxes (kg N ha<sup>-1</sup> yr.<sup>-1</sup>) from China (a) without and (b) with considering atmospheric N deposition rates, disaggregated to  $0.5^{\circ} \times 0.5^{\circ}$ 



DingHuShan, and Yunnan Xishuangbanna (Table 1). The annual precipitation at these sites ranged between 1300 mm and 1900 mm, the annual air temperature between 17.5 °C and 22.0 °C, and annual N<sub>2</sub>O fluxes between 0.84 to 2.26 kg N ha<sup>-1</sup> yr.<sup>-1</sup>(Table 1). These values fall within the range of N<sub>2</sub>O fluxes 0.88 to 4.36 kg N ha<sup>-1</sup> yr.<sup>-1</sup> for tropical forests worldwide (Stehfest and Bouwman 2006; Werner et al. 2007; Xu-Ri et al. 2012). Annual N<sub>2</sub>O emissions were generally less than 2 kg N ha<sup>-1</sup> yr.<sup>-1</sup> when annual precipitation was lower than 2000 mm and annual temperature was lower than 22 °C (Xu-Ri et al. 2012) (Fig. S7). However, there

are still large uncertainties in  $N_2O$  emission estimates for tropical forests in China. For example, emissions ranging from 2.7 to 3.4 kg N ha<sup>-1</sup> yr.<sup>-1</sup> have been reported based on short-term observations (Zhu et al. 2013). Future long-terms and year-round continuous measurements are needed to reduce these large uncertainties.

# N<sub>2</sub>O emissions from shrubland

 $N_2O$  emissions from the shrubland ecosystems are not well researched globally and have not previously been estimated for China. In this study, after model

**Fig.** 7 Comparison of total annual N<sub>2</sub>O fluxes, averaged over the period 2000–2009 from the natural ecosystems in China and background emissions from crops



calibration against forest and grassland ecosystems in China, N<sub>2</sub>O emissions from shrubland ecosystems were calculated at  $0.14 \pm 0.07$  Tg N, in which temperate shrublands contributed  $0.05 \pm 0.05$  Tg N (with an average annual N<sub>2</sub>O emissions of  $0.41 \pm 0.38$  kg N ha<sup>-1</sup> yr.<sup>-1</sup>) and tropical/subtropical shrubland contributed approximately  $0.09 \pm 0.02$  Tg N (with annual emissions of  $1.07 \pm 0.21$  kg N ha<sup>-1</sup> yr.<sup>-1</sup>)

**Fig. 8** a N<sub>2</sub>O emissions from soils under natural vegetation in China for the period 1970–2009. Dashed lines represent year-toyear variations and full lines smoothed with 10-year splines (**b**) Observed atmospheric CO<sub>2</sub> concentration and climate variables in China: annual means over all land grid points in China, as 10-year splines of standardized values (Table 3). Recent N<sub>2</sub>O flux measurements from an alpine shrub meadow in China ranged from 0.18 to 0.27 kg N ha<sup>-1</sup> yr.<sup>-1</sup> (Fu et al. 2018) and falls within our uncertainty range for temperate shrubland. The values for the temperate shrublands are also roughly consistent with those from European temperate shrublands (0.14 to 0.42 kg N ha<sup>-1</sup> yr.<sup>-1</sup>; Carter et al. 2012).





Fig. 9 Comparison between simulated  $N_2O$  emissions and NPP for: (a) average annual values for 1901–2009, and (b) the spatial variation at the global scale and for China in 1990s. Spatial



comparison between model simulations of  $N_2O$  emissions and NPP with spatial patterns of temperature (c) and precipitation (d)

# Background N<sub>2</sub>O emissions from cropland

Background N<sub>2</sub>O emissions are defined as emission from cultivated soil that has not received nitrogen fertilizer during the current season or year (Gu et al. 2007; Zheng et al. 2004). The background N<sub>2</sub>O emissions from croplands may originate from the following nitrogen sources: natural microbial nitrification and denitrification processes from soils driven by natural N fixation; atmospheric N deposition, mineralization of soil organic matter or crop residues (Gu et al. 2007). Bouwman (1996) reported a background emissions rate of 1.0 kg N ha<sup>-1</sup> yr.<sup>-1</sup>, which was based on five sets of field observations conducted in European and American unfertilized grasslands. The spatial variation of background N<sub>2</sub>O emissions proved to be highly climate dependent (Gu et al. 2009; Lu et al. 2006).

In the present study, background N<sub>2</sub>O emissions from cropland are referring to the potential natural soil N<sub>2</sub>O emissions on cropland areas. After calibrating against the site scale observations (Gu et al. 2009), we estimated an average background N<sub>2</sub>O emission from cropland of  $0.13 \pm 0.08$  Tg N (Fig. 7, Table 3), with an average flux rate of  $0.79 \pm 0.47$  kg N ha<sup>-1</sup> yr.<sup>-1</sup> for the period 2000 to 2009. This result falls within the uncertainty range of 0.72–1.66 kg N ha<sup>-1</sup> yr.<sup>-1</sup> reported by previous studies (Li et al. 2001; Gu et al. 2009) and is close to the IPCC default value of 1 kg N ha<sup>-1</sup> yr.<sup>-1</sup> (Lu et al. 2006).

### N<sub>2</sub>O emissions from natural ecosystems in China

Our estimate of average N2O emissions from natural terrestrial ecosystems using the model DyN-LPJ was  $0.46 \pm 0.23$  Tg N for the period 2000 to 2009. This estimate is comparable with a previous estimate of 0.44 Tg N, calculated from the difference between total terrestrial ecosystem emissions (0.81 Tg N) and those from N fertilized soils (0.37 Tg N) in China (Lu and Tian 2013). Cai (2012), estimated a similar value of 0.42 Tg N for total emissions from terrestrial ecosystems, but only forest and grassland emissions and not background emissions from croplands were included (Table 3). Since the 1970s, the average N<sub>2</sub>O emissions from natural ecosystems have increased from 0.28 to 0.46 Tg N yr. $^{-1}$ in the 2000s. These values are similar to even exceed the changes of agricultural fertilizer induced emissions, which were about, 0.10 in the 1980s (Gao et al. 2011),

Plant	Soil
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Table 3 Summary of estimated soil N<sub>2</sub>O emissions from terrestrial ecosystems in China

Ecosystem	Estimates (Tg N yr. <sup>-1</sup> )	Area (×10 <sup>12</sup> m <sup>2</sup> )	Rate (kg N ha <sup>-1</sup> yr. <sup>-1</sup> $\pm$ SD)	Description	Reference
Forest	0.10	1.34	0.70	Direct extrapolation	(Chen et al. 2000)
	$0.29\pm0.19$	1.20	$2.41 \pm 1.55$	Direct extrapolation	(Cai 2012)
	$0.10\pm0.06$	1.46	$0.66\pm0.42$	DyN-LPJ model	This study
Grassland	0.11	2.87	0.39	Direct extrapolation <sup>a</sup>	(Chen et al. 2000)
	0.04	2.87	0.14	Direct extrapolation <sup>a</sup>	(Huang et al. 2003)
	$0.08\pm0.01$	3.37	$0.22\pm0.04$	DNDC model	(Zhang et al. 2010)
	$0.10\pm0.01$	1.73–1.74	$0.58\pm0.06$	DLEM model <sup>a</sup>	(Tian et al. 2011)
	$0.13\pm0.156$	4.82	$0.27\pm0.33$	Direct extrapolation <sup>b</sup>	(Cai 2012)
	$0.07\pm0.01$	3.37	$0.20\pm0.03$	Direct extrapolation	(Fu et al. 2018)
	$0.09\pm0.09$	3.70	$0.24\pm0.23$	DyN-LPJ model <sup>c</sup>	This study
Shrubland	$0.14\pm0.069$	2.07	$0.68\pm0.33$	DyN-LPJ model	This study
Background emissions	0.18	0.95	1.66	DNDC model	(Li et al. 2001)
from cropland <sup>d</sup>	0.13	1.04	1.22	Direct extrapolation	(Yan et al. 2003)
	0.09	1.36	0.68	Empirical model	(Lu et al. 2006)
	0.11-0.18	1.36	0.84-1.35	Empirical model	(Gu et al. 2007)
	0.10-0.16	1.36	0.72-1.21	Direct extrapolation	(Gu et al. 2009)
	$0.13\pm0.08$	1.68	$0.79\pm0.47$	DyN-LPJ model	This study <sup>e</sup>
Natural				-	-
terrestrial ecosystems in China	0.44	n.a.	n.a.	DLEM model <sup>e</sup>	(Lu and Tian 2013)
	0.42	6.01	0.70	Direct extrapolation <sup>f</sup>	(Cai 2012)
	$0.46\pm0.30$	9.49	$0.49\pm0.30$	DyN-LPJ model	This study

<sup>a</sup> Temperate grassland only

<sup>b</sup> part of the shrublands were included

c deserts included

<sup>d</sup> the background N<sub>2</sub>O emissions obtained in this study including the potential natural soil N<sub>2</sub>O emissions in cropland areas

 $^{\rm e}$  derived from the estimation for total terrestrial ecosystem emissions of 0.81 Tg N, minus the  $N_2O$  emissions from N fertilizations of 0.37 Tg N for China

<sup>f</sup>Background emissions from cropland not included

0.28 Tg N yr.<sup>-1</sup> in the 1990s (Lu et al. 2006; Zheng et al. 2004) and 0.31 Tg N yr.<sup>-1</sup> in the 2000s, primarily due to global warming and the increasing rates of atmospheric N deposition (Fig. 8).

Uncertainties in estimating  $N_2O$  emissions considering land use change

Our model simulations assume a constant land area for terrestrial ecosystems in China. The Vegetation Map of China (1:400000) (http://westdc.westgis.ac.cn) represents the potential distribution of Chinese terrestrial ecosystems during the 1970s. However, the land areas of grassland, forest and cropland are not constant. Remote sensing products indicate that, during the 2000s, the Chinese cropland area had decreased, and forest and grassland areas had expanded. The limited data of changes in Chinese shrubland areas with time, have shown that Chinese cropland areas decreased from  $1.68 \times 10^{12}$  to  $1.36-1.54 \times 10^{12}$  m<sup>2</sup> (Liu and Tian 2010; Xiu et al. 2014), while grasslands areas increased from  $3.70 \times 10^{12}$  to  $4.03-4.20 \times 10^{12}$  m<sup>2</sup> (He and Shi 2015; Xiu et al. 2014), and forest areas from  $1.46 \times 10^{12}$  to  $1.63 \pm 0.22 \times 10^{12}$  m<sup>2</sup> (Liu and Tian 2010; Wang et al. 2015) (Table 4). These changes in land areas are related to the Chinese national policy of "returning cropland to forest and grassland" and ecological environment restoration (He and Shi 2015).

Table 4 Soil N2O emiss	ions from grasslands, forests a	and background emissions 1	from croplands in China l	before and after conside	sring land use change		
No.	Average emission rate (kg N $ha^{-2}$ yr. <sup>-1</sup> ± SD)	Area (×10 <sup>12</sup> m <sup>2</sup> ) according to vegetation map of China*	Area ( $\times 10^{12}$ m <sup>2</sup> ) during the 2000s	Fluxes assuming fixed land area (Tg N yr. <sup>-1</sup> )	Fluxes under land area change (Tg N yr. <sup>-1</sup> )	Change I	and area sources
Grassland	$0.24 \pm 0.23$	3.70	$4.10 \pm 0.07$	$0.09\pm0.09$	$0.10\pm0.00$	+ 0.01 (	Xiu et al. 2014), (He and Shi 2015)
Forest	$0.66\pm0.42$	1.46	$1.63 \pm 0.22$	$0.10\pm0.06$	$0.11 \pm 0.01$	+ 0.01 (	Liu and Tian 2010). (Wang et al. 2015)
Background emissions from cropland	$0.79 \pm 0.47$	1.68	$1.46 \pm 0.07$	$0.13 \pm 0.08$	$0.12 \pm 0.01$	- 0.01	Xiu et al. 2014), (He and Shi 2015), (Liu and Tian 2010),
Total change						+ 0.01	
*The Vegetation Map of	China (1:4000 000) (http://we	estdc.westgis.ac.cn), this ma	the presenting the vegeta	tion conditions of 1970	S		

The  $N_2O$  emission estimates calculated from the new land area extent during the period of 2000s for grassland, forest and cropland suggest that the increasing  $N_2O$  emissions due to increasing grassland and forest areas, might be offset by decreasing background emissions due to decreasing cropland area (Table 4). However, the overall estimates still fall within the uncertainty range of our estimates based on constant land area for various types of ecosystems.

Here we also examined vegetation area differences between various data sources (Table S1). The vegetation area of shrubland used in this study are  $2.07 \times 10^{12} \text{ m}^2$ based on the VMC (1:4000000), which is closer to the shrubland area of  $2.15 \times 10^{12}$  m<sup>2</sup> used in Piao et al. (2009) and  $2.09 \times 10^{12}$  m<sup>2</sup> according to the VMC (1:1000000) in Wang et al. (2017). We observed a large discrepancy in natural vegetation area extent between VMC and GLC 2000. Especially for the shrublands area, a large decrease in shrublands is obviously due to a systematic mismatch between two sources, VMC is mainly based on the field survey and the GLC2000 is mainly derived from the remote sensing production. Consequently, the large uncertainties in shrubland N<sub>2</sub>O emissions come from land area uncertainties for various ecosystems, while the limited amount of observational data of N2O emissions also contributed to the uncertainty of model extrapolation.

### N<sub>2</sub>O emissions and their controls

The observed soil N<sub>2</sub>O fluxes were found to be significantly correlated with precipitation and temperature at seasonal and annual time scales (Fig. 5), which is consistent with other field studies (Smith et al. 2018). Nitrous oxide is produced naturally through nitrification and denitrification by soil microorganisms. Nitrification is an aerobic process in which ammonium (NH4<sup>+</sup>) is oxidized to nitrate  $(NO_3^{-})$  and with nitric oxide (NO) and N<sub>2</sub>O as byproducts. Denitrification is an anaerobic process in which  $NO_3^{-}$  is reduced to the denitrification products N<sub>2</sub>O and N<sub>2</sub>. In the DyN-LPJ model, soil moisture (represented as water filled pore space, WFPS) is used as an indicator of N<sub>2</sub>O production rates by either nitrification or denitrification pathways (Xu-Ri and Prentice 2008). The close correlation between WFPS and N<sub>2</sub>O emission rates is supported by many field observations (Bai et al. 2014; Fu et al. 2018; Gütlein et al. 2018). The fraction of  $N_2O$  loss from gross

denitrification can be 10 times larger than the maximum rate of N<sub>2</sub>O production from nitrification processes (Xu-Ri and Prentice 2008). Both nitrification and denitrification process are highly temperaturedependent, with a Q<sub>10</sub> value of ~2.0 to 4.0 over the range 15–25 °C. The exponential relationship between temperature and N<sub>2</sub>O production has been well documented in field studies (Griffis et al. 2017; Song et al. 2018; Zhou et al. 2018). The above discussed empirical relations were implemented in the DyN-LPJ model (Xu-Ri and Prentice 2008).

Nitrous oxide fluxes were nonlinearly controlled by both precipitation and temperature (Fig. 9, Fig. S7) at the global scale and for China. However, the N<sub>2</sub>O fluxes cannot be simply predicted by either of these single factors (Fig. 9, Fig. S7). The net primary productivity of CO<sub>2</sub> (NPP) was distributed similarly under the control of precipitation and temperature on the spatial scale (Fig. 9). These results verify the findings of a previous study in which satellitederived NPP was used to predict global N<sub>2</sub>O emissions (Potter et al. 1996). More recently, a close correlation between ANPP (Aboveground Net Primary Productivity) and N<sub>2</sub>O fluxes was also observed in a field study (Zhang et al. 2018); The underlying mechanism is that ecosystem N loss (e.g., N<sub>2</sub>O emissions) is affected by the rate of N fixation, while the NPP is one of the good indicators for the ecosystem scale N fixation (Xu-Ri and Prentice 2017). However, the correlation coefficients need to be calibrated locally according to local measurements when the upscaling of N<sub>2</sub>O emissions is based on NPP data. On the temporal scale, however, NPP is a less reliable predictor, both globally and for China, because NPP more strongly responds to the increasing CO<sub>2</sub> concentration (Cramer et al. 1999; Xu-Ri et al. 2012).

On a decadal timescale, temperature appeared to be the dominant factor for natural soil  $N_2O$  emissions (Fig. 8). This could be due to the fact that in the twentieth century, there was no significant variation in annual precipitation, whereas the air temperature has significantly increased in China (Fig. 8).

### Conclusions

This study compiled 28 sets of measurements of  $N_2O$  emissions from natural ecosystems in China, including temperate grassland, alpine grassland, temperate forest

and tropical forest. The process-based dynamic nitrogen cycle model, DyN-LPJ, was calibrated using these data. The verified model captured observed seasonal and annual variability of  $N_2O$  fluxes and their significant correlations with precipitation and temperature very well. For the whole of China and globally a close correlation between NPP and soil  $N_2O$  fluxes from natural ecosystems became evident.

The average N<sub>2</sub>O emissions from natural terrestrial ecosystems in China during 2000-2009 were estimated to be  $0.46 \pm 0.30$  and  $0.35 \pm 0.34$  Tg N with and without atmospheric N deposition effects, respectively. N<sub>2</sub>O emissions resulting from atmospheric N deposition was estimated to be approximately  $0.11 \pm 0.01$  Tg N. The total Chinese natural terrestrial ecosystem soil emissions account for 5.0% of global N<sub>2</sub>O emissions from natural soil sources. Shrublands may contribute to one-third of the total natural terrestrial ecosystem soil N2O emissions in China, however are also the most uncertain in terms of areal extend and N2O emission rates. Our uncertainty analysis suggests that long-term and continuous field measurements should be conducted to obtain more representative flux data to better constrain model estimates.

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