

# Global forest carbon uptake due to nitrogen and phosphorus deposition from 1850 to 2100

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Abstract: 18

19 Spatial patterns and temporal trend of nitrogen (N) and phosphorus (P) deposition are important for quantifying their impact on forest carbon (C) uptake. In a first step, we modeled historical and 20 21 change in the global distributions of the atmospheric deposition of N and P from the dry and wet 22 deposition of aerosols and gases containing N and P. Future projections were compared between two scenarios with contrasting aerosol emissions. Modeled fields of N and P deposition and P 23 24 concentration were evaluated using globally distributed in situ measurements. N deposition peaked 25 around 1990 in European forests and around 2010 in East Asian forests, and both increased 7-fold 26 relative to 1850. P deposition peaked around 2010 in South Asian forests and increased 3.5-fold relative to 1850. In a second step, we estimated the change in C storage in forests due to the 27 fertilization by deposited N and P ( $\Delta C_{v dep}$ ), based on the retention of deposited nutrients, their 28 allocation within plants, and C:N and C:P stoichiometry.  $\Delta C_{v dep}$  for 1997-2013 was estimated to be 29 30  $0.27 \pm 0.13$  Pg C yr<sup>-1</sup> from N and  $0.054 \pm 0.10$  Pg C yr<sup>-1</sup> from P, contributing 9% and 2% of the 31 terrestrial C sink, respectively. Sensitivity tests show that uncertainty of  $\Delta C_{v dep}$  was larger from P than from N, mainly due to uncertainty in the fraction of deposited P that is fixed by soil.  $\Delta C_{P dep}$  was 32 exceeded by  $\Delta C_{N dep}$  over 1960-2007 in a large area of East Asian and West European forests due to a 33 34 faster growth in N deposition than P. Our results suggest a significant contribution of anthropogenic 35 P deposition to C storage, and additional sources of N are needed to support C storage by P in some 36 Asian tropical forests where the deposition rate increased even faster for P than for N.

37

#### **38 1.** Introduction

- The processes controlling the terrestrial carbon (C) sink are a major source of uncertainty in projections of the historical and future evolution of atmospheric CO<sub>2</sub> (Matthews, 2007; Ahlstrom *et al.*, 2012).
- 41 Observations and models both suggest that terrestrial C sinks are limited by nitrogen (N) and phosphorus (P)
- 42 with notable regional differences (Hungate *et al.*, 2004; Reich *et al.*, 2006; Elser *et al.*, 2007; Thornton *et*
- 43 al., 2009, Norby et al., 2010; Vitousek, et al., 2010; Goll et al., 2012, Penuelas et al., 2013,
- 44 Fernández-Martinez *et al.*, 2014: Wieder *et al.*, 2015). The majority of studies predict a large limitation of
- 45 the C sink in the 21<sup>st</sup> century due to limited availabilities of N and P, but the extent of this limitation varies
- 46 widely among studies. This effect of limitation implies that terrestrial C sinks are sensitive to the inputs of
- 47 N and P from atmospheric deposition in the case of non-cultivated ecosystems. In particular, anthropogenic
- 48 emissions of reactive N, including oxidized (e.g. NO<sub>x</sub>) and reduced (e.g. NH<sub>3</sub>) N have increased
- 49 significantly in the past decades (Galloway et al., 2004), causing notable change in N availability in
- 50 northern temperate and boreal forests (Magnani *et al.*, 2007) and more recently in tropical forests (Hietz *et*
- 51 *al.*, 2011). During 1982-2009, N deposition has contributed 9% to the observed greening of the Earth (Zhu
- 52 *et al.*, 2016).
- 53 Atmospheric deposition increases the availability of N and P, and thus should increase or sustain the
- terrestrial C sink (Graham and Duce, 1979; Galloway *et al.*, 2004; Okin *et al.*, 2004; Mahowald, 2011).
- 55 Nadelhoffer *et al.* (1999) estimated that N deposition accounts for a C sink of  $0.25 \text{ PgC yr}^{-1}$  in 1990s based
- 56 on  ${}^{15}$ N tracer studies in nine forests and a prescribed N input of 5.1 Tg N yr<sup>-1</sup> to the Earth's forests. For the
- 57 same period, Liu and Greaver (2009) estimated a somewhat larger contribution of N deposition to the
- 58 global terrestrial C sink of 0.35-0.58 Pg C yr<sup>-1</sup> based on a meta-analysis of field observations. Thomas *et al.*
- 59 (2010) attributed a C sink of  $0.31 \text{ Pg C yr}^{-1}$  to this factor in forests by comparing forest growth rates for
- 60 different exposures of N deposition during the 1980s and 1990s based on data from the national forest
- 61 inventory in the USA. Zaehle *et al.* (2010, 2014) estimated that N deposition resulted in a net terrestrial C
- 62 sink of 0.2 Pg C yr<sup>-1</sup> during 1996-2005 using an OCN process-based vegetation model. de Vries *et al.*
- 63 (2014) estimated a contribution of comparable magnitude (0.2-0.5 Pg C yr<sup>-1</sup>) from N deposition to the
- 64 global land C sink using a stoichiometric approach. While the impact of atmospheric N deposition on
- 65 terrestrial C sink has been assessed by several studies, the contribution of P deposition has not yet been
- 66 quantified. This is because reconstruction of historical changes in P deposition are lacking.
- 67 Several studies have attempted to simulate the spatial distributions of N deposition (Holland *et al.*, 1997;
- 68 Lamarque *et al.*, 2005, 2013; Dentener *et al.*, 2006; Phoenix *et al.*, 2006; Paulot *et al.*, 2013; Hauglustaine
- *et al.*, 2014) and P deposition (Mahowald *et al.*, 2008) under current and future conditions driven by
   emission inventories. These studies differ by their emission inventories, aerosol chemistry and horizontal
- 71 resolutions of chemical transport models (CTM) (**Table S1**). However, the modeled N and P deposition
- 72 rates are subject to high uncertainty, which remains unquantified. For example, the modeled wet deposition
- rates of nitrate (NO<sub>3</sub>) and ammonium (NH<sub>4</sub>) as means of 11 CTMs were underestimated by 40-140%
- 74 compared to atmospheric station data depending on the region (Lamarque *et al.*, 2013). Hauglustaine *et al.*
- (2014) suggested that the underestimation in wet N deposition for Asia in their CTM is of 50-60% due to a

- bias in the region's N emissions estimates and the model's coarse horizontal resolution. Earlier estimates of 76
- 77 present day total P deposition (Mahowald et al., 2008) were underestimated by almost one order of
- 78 magnitude, likely due to an underestimation of the contribution of human activities to P emissions (Wang et
- al., 2015a). Recent measurements in China underline the anthropogenic component of P deposition 79
- 80 showing that the bulk deposition of P followed a power-law increase with decreasing distance of
- monitoring sites to the nearest cities (Du et al., 2016). More measurements over a wide range of 82 representative stations are necessary to confirm the regional contribution of combustion sources to P in the
- atmosphere. High-resolution data sets of modeled N and P deposition over forests supported by global 83
- 84 measurements are critical for understanding the C sink that offsets the increase in fossil-fuel C emissions
- 85 and the limitations of primary productivity by N and P. However, such data sets are not available due to
- uncertainties in the emission inventories of N and P and limited understanding of N chemistry in aerosols. 86
- 87 Elemental stoichiometry has been used to identify major constraints in the change in C storage by terrestrial
- 88 ecosystems due to nutrients either available in soils or deposited from the atmosphere, based on
- 89 assumptions about the allocation of nutrients and their elemental ratios (e.g., C:N or C:P) in ecosystemic C
- pools. This method assumes that N and P limitation of net primary productivity (NPP) is widespread across 90
- 91 global biomes (Elser et al., 2007). For example, Cleveland et al. (2013) used this method to show that
- external inputs of N and P through atmospheric deposition supports 3.8% and 16% of new NPP, but the 92
- 93 uncertainty has not been considered. De Vries et al. (2014) used this method to infer that N deposition
- supports a global forest C sink of 0.28-0.45 Pg C yr<sup>-1</sup> by assuming that 15% of deposited N is retained in 94
- 95 forest biomass and 15% in soil in tropical forests, but the impact of P was not considered in this study.
- 96 Our study aims to fill these gaps by providing the first time-series of N & P deposition and the resulting C 97 sink taking into account the major sources of uncertainty. To do so, we calculated the temporal evolutions 98 of N and P deposition in a CTM prescribed by reconstructions of historical and future scenarios of anthropogenic emissions and evaluated the so derived N wet deposition, P total deposition and surface P 99 100 concentrations in aerosols with in situ measurements. We built a modeling framework to estimate the C sequestration of global forests due to historical and future N and P deposition. We accounted for 101 102 uncertainties in the stoichiometric and allocation parameters by employing a Monte Carlo method in a 103 stoichiometric mass-balance approach, and identify key factors influencing the forest C sequestration.

#### 104 2. Materials and methods

81

#### 105 2.1. Atmospheric deposition of N and P for 1850-2100

The global aerosol chemistry climate model LMDZ-INCA couples the LMDz (Laboratoire de 106 107 Météorologie Dynamique, version-4) General Circulation Model (Hourdin et al., 2006) and the INCA (INteraction with Chemistry and Aerosols, version-4) aerosol module (Hauglustaine et al., 2014). A full 108 109 description of the model is provided in the **Supporting Information**. To run the model, emissions data included sea-salt and dust for P, primary biogenic aerosol particles for P, oceanic emissions for N (NH<sub>3</sub>), 110 vegetation emissions for N (NO), agricultural activities (including fertilizer use and livestock) for N, and 111 fuel combustion for both N (NOy and NHx) and P. Regarding N-containing aerosols and gases, 112

- 113 LMDZ-INCA was run with a fully interactive atmospheric N cycle (Hauglustaine *et al.*, 2014) at a 114 horizontal resolution of  $1.27^{\circ}$  latitude by  $2.5^{\circ}$  longitude with 39 vertical layers in the atmosphere to
- simulate the global dry and wet deposition of  $NO_y$  and  $NH_x$  for 1850, 1960, 1970, 1980, 1990, 1997-2013,
- 116 2030, 2050 and 2100. The same resolution is used for the transport and deposition of P aerosols in
- 117 LMDZ-INCA with the emission data provided by Wang *et al.* (2015a), which are transported in three size
- bins for P emitted by combustion processes with a diagnostic mass median diameter (MMD) of 0.14, 2.5
- and 10.0  $\mu$ m, one size bin for P from primary biogenic aerosol particles (MMD=5.0  $\mu$ m), one size bin for P
- from mineral dust (MMD=2.5 µm), and three size bins for P from marine sea-salt particles (Balkanski *et al.*,
- 121 2011). Meteorological fields from a reanalysis of the European Centre for Medium-Range Weather
- 122 Forecasts (ECMWF) have been used in the present configuration to nudge the model transport and removal
- processes for 1980 and 1990 and for each year during the recent 1997-2013 period. Additional simulations
- were performed with emissions for 1850, 1960, 1970 and into the future all using meteorological fields for
- **125** 2005.

126 The emissions prescribed to LMDZ-INCA were obtained from published data sets or emission inventories. 127 We focused on generating coherent emission data sets for all species, and the methods are fully described in the **Supporting Information**. Table S2 lists the emission data sets used in our study. In brief, global 128  $0.5^{\circ} \times 0.5^{\circ}$  emissions of NO<sub>x</sub>, NH<sub>3</sub>, sulfur dioxide (SO<sub>2</sub>), non-methane volatile organic compounds 129 (NMVOCs), methane (CH<sub>4</sub>), carbon monoxide (CO), organic carbon (OC) and black carbon (BC) for 2005, 130 2010 and 2030 were obtained from the ECLIPSE.GAINS.4a model (Klimont et al., 2013). SO<sub>2</sub>, CO, CH<sub>4</sub> 131 132 and NMVOCs species should be treated consistently with N aerosols, because they influence N chemistry in the model (Hauglustaine et al., 2014). The ECLIPSE GAINS 4a emissions of all species were extended 133 to other years of simulations using historical data from the ACCMIP and MACCity inventories (Lamarque 134 et al., 2010; Granier et al., 2011) and future data from the RCP4.5 and RCP8.5 scenarios by Lamarque et al. 135 (2011). In addition, natural emissions of NO and NH<sub>3</sub> from soil (Bouwman et al., 1997; Lathière et al., 136 2006) were assumed to be constant throughout the period; natural oceanic emissions of  $NH_3$  were 137 calculated in the INCA model following the formulations proposed by Paulot et al. (2015), with monthly 138 139  $2^{\circ} \times 2^{\circ}$  fields of surface sea-water concentrations of NH<sub>4</sub>, pH and salinity as simulated by the oceanic biogeochemical model PISCES (Wang et al., 2015b). Emissions of P from fossil fuels and biofuel were 140 estimated annually for 1960 to 2007 (Wang et al., 2015a), which were extended to other years of 141 142 simulations. Natural emissions of P from mineral dust, primary biogenic aerosol particles, sea salt and volcanoes were assumed to be constant (Wang et al., 2015a). All N and P emissions from fossil fuels, 143 biofuel and agricultural activities were assumed to be constant throughout each year without seasonal 144 variation. Monthly  $0.5^{\circ} \times 0.5^{\circ}$  gridded emissions by natural or anthropogenic (deforestation) burning of 145 146 biomass were generated for 1997-2013 from the GFED4.1 inventory (Giglio et al., 2013) and for other years from the ACCMIP inventory (Lamarque et al., 2010). Emissions from biomass burning for 2030, 147 2050 and 2100 were assumed to be the same as the averages for 2010-2013. We only analyzed the changes 148 149 of future N and P deposition from anthropogenic sources due to the lack of estimates of natural emissions, but both natural and anthropogenic sources were included for evaluating modeled N and P deposition 150

151 against measurements.

160

#### 2.2. Observed N and P deposition rates and P concentrations 152

- 153 To evaluate the modeled N and P deposition rates, we used three observational data sets (Figure S1),
- 154 including (i) a recent global data set of wet N deposition rates measured during 2002-2006 (Vet et al.,
- 2014), (ii) a recent global data set of total P deposition rates measured during 1960-2010 (Tippling et al., 155
- 156 2014), and (iii) a recent global data set of surface P deposition concentrations measured during 1960-2008
- 157 (Mahowald et al., 2008). Dry N deposition was not evaluated due to the lack of data, similar to previous
- studies (Larmarque et al., 2005; Dentener et al., 2006). Before using these observational data for model 158
- evaluation, we have further collected data to increase coverage of wet N deposition data in South America 159 and Africa, removed some data of total P deposition with a high potential for contamination, and divided
- the measured surface P concentrations into short-term and long-term measurements. A full description is 161
- 162 provided in the Supporting Information.

#### 2.3. Additional C fixation attributable to N and P deposition 163

#### 164 2.3.1. A stoichiometric method

- 165 A stoichiometric mass balance approach was used to estimate the change in C storage attributable to N and P deposition over global forests, based on the fraction of deposited nutrients retained in the ecosystems and 166 incorporated into biomass and soil carbon pools (Nadelhoffer et al., 1999; Cleveland et al., 2013; de Vries 167 et al., 2014; Wieder et al., 2015). We distinguished between four biomass C pools (leaves, stems, fine roots 168 and coarse roots; each with different stoichiometry) and one soil C pool. Five types of forests are 169 considered, namely deciduous broadleaf, deciduous needle-leaf, evergreen broadleaf, evergreen needle-leaf 170 and mixed forests. The global land cover data set at a spatial resolution of 1 km (Hansen et al., 2000) for 171 172 the year 2010, as a product of Moderate Resolution Imaging Spectroradiometer (MODIS), was used to map 173 these five types of forests. Forest areas have changed significantly since 1850 (Foley et al., 2005; Houghton et al., 2003). Here, we applied the fixed forest cover map by Hansen et al. (2000) in the calculation of  $\Delta C_v$ 174 dep throughout the period of 1850-2100. The uncertainty induced by assuming a fixed forest cover map on 175
- $\Delta C_{v dep}$  is quantified in Section 3.7. To do this, we re-calculated  $\Delta C_{v dep}$  with the variable forest cover map 176
- 177 for 1850-2010 according to the reconstruction of (Peng et al., 2017) and the fraction of five types of forests
- within each  $1^{\circ} \times 1^{\circ}$  grid from Hansen *et al.* (2000). 178
- 179 We assumed that in 1850 the forest C stocks were in equilibrium with the pre-industrial N and P deposition levels (i.e.  $\Delta C_{v dep} = 0$ ), so that only the change in N and P deposition relative to the background levels can 180 181 cause an extra forest C storage, allowing our estimates to cover the additional N and P emissions from fossil fuels and biofuel burning, atmospheric NH<sub>3</sub> and NO<sub>x</sub> emissions from agriculture, and change in N 182 and P emissions from biomass burning compared to 1850. Hence our analysis included the wind export of 183 P from croplands and savanna to forests through fire emissions and atmospheric transport. It should be 184 noted that direct anthropogenic effects on fires (e.g., fire suppression and land use change) and indirect 185 anthropogenic effects (e.g., changes in climate affecting fire regimes) were not explicitly distinguished in 186 the historical fire emission inventory we used (Giglio et al., 2013). In addition, although our calculation of 187

188  $\Delta C_{v dep}$  covers C storage due to N and P from anthropogenic fires, we did not try to estimate the C 189 emissions from these anthropogenic fires which are always termed as part of C emissions from land-use 190 change in global C budget (Le Quere *et al.*, 2016). However, we did not account for the change of 191 atmospheric CO<sub>2</sub> concentrations, climate and forest cover change (Hansen *et al.*, 2013).

- 192 In each pixel at a spatial resolution of  $1^{\circ} \times 1^{\circ}$ , additional forest C storages supported by anthropogenic N or
- 193 P deposition ( $\Delta C_{\nu dep}$ , where  $\nu$  stands for either N or P) were expressed as:
- 194

$$\Delta C_{N \ dep_i}(t) = f_{N_{veg}} a_{N_i} s_{N_i} [d_N(t) - d_N(1850)] \tag{1}$$

(2)

195 
$$\Delta C_{P \ dep_i}(t) = f_{P_{veg}} a_{P_i} s_{P_i} [d_P(t) - d_P(1850)]$$

where *i* is biomass pool (i = 1 for leaves, 2 for stems, 3 for fine roots and 4 for coarse roots),  $f_{N_{veg}}$  and  $f_{P_{veg}}$ are the retention fractions of deposited N and P in biomass pools, respectively,  $a_{Ni}$  and  $a_{Pi}$  are the allocation fractions of N and P in each pool, respectively,  $s_{Ni}$  and  $s_{Pi}$  are the C:N and C:P stoichiometric ratios, respectively, and  $d_N(t)$  and  $d_P(t)$  are the deposition rates of N and P for year *t*, respectively. All deposition fields and land cover fractions were re-interpolated to the  $1^{\circ} \times 1^{\circ}$  grid for the calculation of  $\Delta C_{V dep}$ .

201 Similarly, in each pixel, the  $\Delta C_{v dep}$  realized in soil were expressed as:

202 
$$\Delta C_{N \ dep_{soil}}(t) = f_{N_{soil}} s_{N_{soil}}[d_N(t) - d_N(1850)]$$
(3)

$$\Delta C_{P \ dep_{soil}}(t) = f_{P_{soil}} s_{P_{soil}}[d_P(t) - d_P(1850)] \tag{4}$$

where  $f_{\text{Nsoil}}$  and  $f_{\text{Psoil}}$  are the retention fractions of N and P in soil, respectively, and  $s_{\text{Nsoil}}$  and  $s_{\text{Psoil}}$  are the C:N and C:P stoichiometric ratios in soil biota, respectively.

206 There are two limitations in our approach. First, like de Vries et al. (2014), we approximate a time scale of 10-20 years for the  $\Delta C_{y \text{ dep}}$ , because ecosystems take time to sequester C in forest biomass and soil after an 207 initial disturbance (Goulden et al., 2011), such as the level of N and P deposition for most of the global 208 forests. It should be noted that our stoichiometric mass-balance model cannot resolve processes governing 209 210 the C storage changes attributed to deposition on shorter timescales. It is likely that the instantaneous effect at the early stage of forest succession (e.g., less than 5 years) is lower, due to enhancement of soil C 211 decomposition by N deposition (Goulden et al., 2011). Second, different turnover times of the plant and 212 soil pools should influence the C response to deposition, which is not included in our model. According to 213 de Vries et al. (2014), the C storage in the woody biomass (stem and coarse root) determines C 214 215 sequestration by forest trees, while the C storage in the non-woody biomass (leaves and fine root), which is fast-turnover (Iversen et al., 2017), determines C sequestration in soil. We estimated the sum of them based 216 217 on the allocation of the deposited nutrient in different pools measured at a time scale of around 2-9 years (Schlesinger, 2009). At longer time periods, the C sequestration is determined by other disturbances, such 218 as forest fires and forest harvesting, which is not considered in our study. More knowledge gained in 219 220 database analyses for nutrient use in the tree growth (e.g., Sardans and Peñuelas, 2013, 2015) would enable 221 us to better understand these processes in future process-based ecosystem models.

- Although  $\Delta C_{v dep}$  account for C storage supported by deposited nutrients on timescales of 10-20 years (de
- 223 Vries *et al.*, 2014), it should be noted that a fraction of deposited N and P may still contribute to  $\Delta C_{v dep}$
- beyond the 10-20 year timeframe. This impact is small for  $\Delta C_{N dep}$ , because a large fraction of N is lost by
- denitrification or leaching. The impact for  $\Delta C_{P dep}$ , however, is not negligible, because P is mostly fixed by
- the soil and is less prone to loss. We estimated  $\Delta C_{P dep}$  by fixing an "effective fraction" of the deposited P (f
- 227  $P_{fix}$ ) to account for this impact (see Section 2.3.2).
- All parameters were determined with central values and uncertainty ranges (see Section 2.3.2, 2.3.3, and
- 229 **2.3.4**). In brief, the parameters  $f_{N_{\text{reg}}}$ ,  $f_{P_{\text{reg}}}$ ,  $a_i$ ,  $s_{N_i}$ ,  $s_{P_i}$ ,  $f_{N_{\text{soil}}}$  and  $f_{P_{\text{soil}}}$  were derived for deciduous broadleaf,
- 230 deciduous needle-leaf, evergreen broadleaf, evergreen needle-leaf and mixed forests; parameters values and
- their uncertainty ranges are summarized in **Table 1**. Uncertainties in the modeled deposition rates ( $d_N$  and
- $d_{\rm P}$ ) were derived from a comparison with the available observation data sets (see Section 3.2).
- Table 1. Parameters used to estimate carbon fixation due to anthropogenic N and P deposition in forests.
   The 95% confidential intervals adopted as the lower and upper estimates for each parameter applied in our
- 235 Monte Carlo simulations are in parentheses.

	1						
Forest type	Evergreen	Evergreen	Deciduous	Deciduous	Mixed forest		
	needleleaf forest	broadleaf forest	needleleaf forest	broadleaf forest			
C:N (g C: g N)							
Leaves	42 (34-50)	21 (17-25)	50 (40-60)	21 (17-25)	28 (22-34)		
Stems	250 (200-300)	150 (120-180)	250 (200-300)	175 (140-210)	175 (140-210)		
Fine roots	78 (62-94)	78 (62-94)	41 (33-49)	41 (33-49)	41 (33-49)		
Coarse roots	250 (200-300)	150 (120-180)	250 (200-300)	175 (140-210)	175 (140-210)		
Soil	31 (28-35)	16 (14-18)	20 (18-21)	19 (18-20)	19 (18-20)		
C:P (g C: g P)							
Leaves	408 (326-490)	400 (320-480)	405 (324-486)	333 (266-400)	278 (222-334)		
Stems	3750 (3000-4500)	) 2250 (1800-2700)	) 3750 (3000-4500)	) 2625 (2100-3150)	2625 (-)		
Fine roots	1170 (936-1404)	1020 (816-1224)	615 (492-738)	615 (492-738)	615 (492-738)		
Coarse roots	3750 (3000-4500)	) 2250 (1800-2700)	) 3750 (3000-4500)	) 2625 (2100-3150)	2625 (2100-315		
Soil	1030 (459-2312)	169 (134-214)	318 (214-472)	391 (306-500)	254 (214-300)		
Retention fractio	ons of N and P in plan	nts					
$f_{ m N_{veg}}$	0.23 (0.14-0.30)	0.15 (0.10-0.20)	0.23 (0.14-0.30)	0.23 (0.14-0.30)	0.23 (0.14-0.30)		
$f_{\mathrm{P}_{\mathrm{veg}}}$	0.05 (0.016-0.22)	0.09 (0.027-0.36)	0.05 (0.016-0.22)	0.05 (0.016-0.22)	0.05 (0.016-0.2		
Retention fractions of N and P in soil							
$f_{ m N_{soil}}$	0.52 (0.26-0.78)	0.15 (0.10-0.20)	0.52 (0.26-0.78)	0.52 (0.26-0.78)	0.52 (0.26-0.78)		
$f_{ m P_{soil}}$	0.13 (0.038-0.50)	0.09 (0.03-0.36)	0.13 (0.038-0.50)	0.13 (0.038-0.50)	0.13 (0.038-0.5		
Allocation fraction of N ( $a_{Ni}$ )							
Leaves	0.42	0.56	0.42	0.49	0.46		
Stems	0.34	0.22	0.34	0.33	0.34		
Fine roots	0.16	0.17	0.16	0.11	0.13		

Coarse roots Allocation fraction	0.08 on of P ( <i>a</i> <sub>Pi</sub> )	0.05	0.08	0.07	0.07
Leaves	0.32	0.63	0.28	0.50	0.35
Stems	0.40	0.19	0.42	0.32	0.40
Fine roots	0.19	0.13	0.20	0.11	0.16
Coarse roots	0.09	0.04	0.10	0.07	0.09

Sensitivity tests were performed to quantify the influence of the major parameters on the  $\Delta C_{v dep}$  by N and P (see Section 3.4). Finally, Monte Carlo simulations were applied to estimate the central values of  $\Delta C_{v dep}$ in global forests and to estimate their uncertainties in each pixel at a spatial resolution of 1°×1°. In brief, the model was run 10000 times by drawing input parameters from uniform or normal uncertainty distributions of model parameter and N- and P-deposition rates. The medians and 95% confidence intervals (CI) were used to represent the central estimate and the associated uncertainty, respectively, based on the Monte Carlo simulations.

#### 244 2.3.2. Retention of N and P in the ecosystems

Schlesinger (2009) reported a median N retention fraction of 23% (with an interquartile range of 14-30%) for biomass pools ( $f_{Nveg}$ ) and 52% (with an interquartile range of 26-78%) for soils ( $f_{Nsoil}$ ) in boreal and temperate forests. De Vries *et al.* (2007) suggested a lower N-retention fraction of 15% (with a 90% uncertainty range of 10-20%) for both  $f_{Nveg}$  and  $f_{Nsoil}$  in tropical forests. We adopted these median estimates and their uncertainty ranges. The non-retained fraction of deposited N lost by leaching, volatilization and denitrification is not explicitly modeled.

251 Evidence suggests that N inputs from atmospheric deposition can be taken up by forest canopies (Sievering 252 et al., 2007; Gaige et al., 2007; Sparks, 2009). De Vries et al. (2014), however, suggested that the effect of 253 uptake of N by canopies on C fixation is likely to be small, because a small fraction of canopy-retained N is 254 absorbed and used in leaves. Gaige et al. (2007) suggested that denitrification and nitrification do not occur 255 in the canopy, despite a high retention fraction of N deposition in the canopy. Sparks (2009) suggested that 256 foliar uptake of reactive N should be considered separately from soil-deposited N, but pointed out that it is 257 difficult to link canopy uptake of N directly to assimilation. Dail et al. (2009) found that only 3-6% of the 258 labeled <sup>15</sup>N recoverable in plant biomass was recovered in live foliage and bole wood and that tree twigs, 259 branches and bark were the major sinks (50%) after 2 years of NH<sub>4</sub>NO<sub>3</sub> addition. We therefore did not 260 account for this process in our central case, following the suggestion by de Vries et al. (2014), but discuss 261 the potential impact in a sensitivity test in Section 4.2.

The fate of deposited P in ecosystems differs from that of N. First, P is less mobile than N in soils (Aerts and Chapin, 2000), so the fractional P loss by leaching is smaller than for N. Second, denitrification has no counterpart for gaseous P loss to the atmosphere. Third, the physical fixation of P and its eventual occlusion in soil reduces the availability of deposited P to leaching and uptake by plants and microbes. The

fate of deposited P in forests has unfortunately not yet been measured, to the best of our knowledge, and

was estimated in our study based on two assumptions. First, we assumed that 10% of the deposited P was directly lost by runoff as Sattari *et al.* (2012) assumed for fertilizer P. Second, by assuming that P deposition input to soil is much smaller than the actual stocks of labile and stable P in soil and thus does not affect the stock size, we approximated the fixation of an "effective fraction" of deposited P ( $f_{Pfx}$ ), corresponding to the net transfer of P between 'labile' and 'stable' forms, based on transfer coefficients ( $\mu_{SL}$  and  $\mu_{LS}$ ) between stable and labile P:

$$f_{P_{fix}} = 1 - \mu_{SL} / \mu_{LS} \tag{5}$$

We used  $\mu_{SL}$  and  $\mu_{LS}$  to derive a central estimate of  $f_{P_{fix}}$  (80%) but a wide range of uncertainty (20% to 94%) as recommended by Sattari *et al.* (2012). We also assumed that the fraction of ecosystem-retained P taken up by plants ( $f_{Puptake}$ ) was the same as that of N, at 30% for boreal and temperate forests and 50% for tropical forests (Schlesinger, 2009; de Vries *et al.*, 2007), due to lack of direct measurements of the fraction of ecosystem-retained P taken up by plants. We then derived the retention of P in vegetation ( $f_{Pveg}$ ) and soil ( $f_{Psoil}$ ) using  $f_{P_{fix}}$ ,  $f_{Ploss}$  and  $f_{Puptake}$ :

280

273

$$f_{P_{veg}} = (1 - f_{P_{loss}})(1 - f_{P_{fix}})f_{P_{uptake}}$$
(6)

$$f_{P_{soil}} = (1 - f_{P_{loss}})(1 - f_{P_{fix}})(1 - f_{P_{uptake}})$$
(7)

We estimated that  $f_{P_{veg}}$  was 5.4% (1.6-22% as the uncertainty range) and  $f_{P_{soil}}$  was 13% (3.8-50% as the uncertainty range) in boreal and temperate forests and that  $f_{P_{veg}}$  was 9.0% (2.7-36% as the uncertainty range)

and  $f_{P_{soil}}$  was 9.0% (2.7-36% as the uncertainty range) in tropical forests (**Table 1**).

#### **285 2.3.3.** Allocation of N and P in plants

- We used the values of  $a_{\rm Ni}$  diagnosed by de Vries *et al.* (2014) for deciduous broadleaf, evergreen broadleaf 286 287 and needleleaf forests. The  $a_{Ni}$  averaged over deciduous broadleaf and needleleaf forests was applied for mixed forests (Table 1). The uncertainty associated with  $a_{Ni}$ , however, was not provided and was estimated 288 289 below. The C:N ratio differs for woody (stem and coarse root) and non-woody (leaf and fine root) pools, so the assumption that uncertainties in  $a_{Ni}$  are the same as the uncertainties associated with the fraction of N 290 allocated to the woody component is reasonable. A meta-analysis of <sup>15</sup>N addition experiments suggested 291 292 that 53% of total N uptake is allocated to woody biomass (Templer et al., 2012), compared to 25% reported by Nadelhoffer et al. (1999). This latter low value is 7-40% lower than that used in our study, and the high 293 value is 26-96% higher than the central value used in our study (**Table 1**). We accordingly applied two half 294 normal distributions to cover the uncertainty of  $a_{Ni}$ . 295
- We are not aware of any experiment measuring the allocation of deposited P to different biomass pools, so we derived the allocation fractions of P and their uncertainties from the allocation of N and the stoichiometric ratios of these two elements as:

299

$$a_{P_i} = \frac{a_{N_i} \cdot s_{N_i} / s_{P_i}}{\sum_{i=1}^4 \left( a_{N_i} \cdot s_{N_i} / s_{P_i} \right)}$$
(8)

300 where  $s_{N_i}$  and  $s_{P_i}$  are the C:N and C:P stoichiometric ratios, respectively, in each pool of the plant.

## 301 2.3.4. C:N and C:P stoichiometric ratios in different pools

302 C:N and C:P stoichiometric ratios in soil and their 95% CI were derived from a global data set of the 303 nutrient composition of soil (Xu *et al.*, 2013). The median C:N and C:P stoichiometric ratios of leaves, 304 stems, fine roots and coarse roots were obtained from Cleveland *et al.* (2013). Wang *et al.* (2010) suggested 305 that the minimum and maximum of C:N and C:P stoichiometric ratios were  $\pm 20\%$  relative to the means, 306 which we applied as uncertainties for  $s_{N_i}$  and  $s_{P_i}$ .

## 307 2.4. Maximum and minimum effects of N and P deposition

The change in C fixation due to nutrients addition in an ecosystem can be approximated based on the most limiting element (Vitousek *et al*, 1984, 2010), but the stoichiometric mass balance approach we used could not identify the most limiting element. Therefore, we estimated the maximum and minimum effects of  $\Delta C$  $v_{dep}$  due to anthropogenic N and P deposition to characterize the degree of limitation by one of the two elements. Accordingly, the minimum effects of anthropogenic N and P deposition yields a lower estimate as:

314

$$\Delta C_{v \ dep}^{min} = \min[\Delta C_{N \ dep}, \Delta C_{P \ dep}] \tag{9}$$

and the maximum effects of N and P deposition yields an upper estimate as:

316

$$\Delta C_{\nu \ dep}^{add} = \max[\Delta C_{N \ dep}, \Delta C_{P \ dep}] \tag{10}$$

The minimum and maximum effects calculated here should be interpreted with caution. First, the minimum 317 effect is based on a hypothesis that the element with a lower capacity to fix C by deposition is more 318 limiting and that there is no additional source of this element than atmospheric deposition to support a 319 320 larger C storage. The difference between the effect by an element alone and the minimum effect denotes 321 the limitation by the other element that is enhanced by the deposition. Second, the maximum effect is based 322 on a hypothesis that the element with a higher capacity to fix C by deposition is more limiting and there is 323 enough of the other element to allow for the largest C storage. The difference relative to the effect by an element alone denotes the limitation by the other one that is alleviated by the deposition. Regarding 324 uncertainties in the limitations by N and P, the combined effect of N and P deposition should fall between 325 326 the minimum and maximum effects. Although we cannot rule out that there are synergistic "additive" 327 effects (Elser et al., 2007) as well as strictly negative effects (Penuelas et al., 2013), such effects are rather 328 unlikely to occur in wide ranges of ecosystems and deposition loads. In addition, difference between the 329 maximum and minimum effect quantifies an imbalance between N and P induced by the deposition 330 providing that other sources of N and P were held constant. However, it should be noted that our 331 calculation does not account for the interaction between N and P cycles implied by recent studies. For 332 example, increasing N deposition can affect availability, uptake and using efficiency of P by altering mycorrhizal activity, phosphatase enzymes and soil properties (Compton and Cole, 1998; Rowe et al., 2008; 333 Marklein and Houlton, 2012; Lü et al., 2013). 334

**335 3.** Results

#### **336 3.1.** N and P emissions

337 Natural and anthropogenic global emissions of N and P were estimated or derived for the past time slices in

- 338 1850-1990, for each year in 1997-2013 and for the future time slices in 2030-2100 (Figure 1). Total 339 reactive-N emissions increased from 35 Tg N yr<sup>-1</sup> in 1850 to an average of 104 Tg N yr<sup>-1</sup> for 1997-2013,
- reactive-N emissions increased from 35 Tg N yr<sup>-1</sup> in 1850 to an average of 104 Tg N yr<sup>-1</sup> for 1997-2013, and were predicted to reach 83 and 114 Tg N yr<sup>-1</sup> by 2100 under the RCP4.5 and RCP8.5 scenarios,
- respectively. N emissions as the oxidized  $(NO_x)$  and reduced  $(NH_3)$  forms are listed in **Table S3**, which are
- 342 close to previous estimates (Holand *et al.*, 1997; Galloway *et al.*, 2004; Lamarque *et al.*, 2005; Dentener *et*
- 343 *al.*, 2006; Paulot *et al.*, 2013). The main drivers of the increase in historical N emissions were a rapid rise in
- the use of fossil fuels, both the expansion and intensification of agricultural fertilization and an increase in
- 345 the number of livestock (Schlesinger, 2009). N emissions from fossil fuel, biofuel and agricultural activities
- increased from 5.6 Tg N yr<sup>-1</sup> in 1850 (Lamarque *et al.*, 2010) to 60 Tg N yr<sup>-1</sup> in 2005 (Klimont *et al.*, 2013).
- 347 The increase in reactive-N emissions was equivalent to twice the background N emissions in 1850. The
- emissions of P increased from 2.6 to 4.0 Tg P yr<sup>-1</sup> from 1850 to 2013, equivalent to a 57% increase relative
- to the background 1850 emissions, 47%, 25% and 28% of the increase in P emissions were from increases
- 350 in emissions from fossil fuels, biofuel and deforestation fires, respectively. The N:P ratio in the emissions
- nearly doubled from 25 (on a molar basis) in 1850 to 48 in 2013 due to a faster growth of N than P
- emissions as outlined in a previous study (Peñuelas *et al.*, 2013).

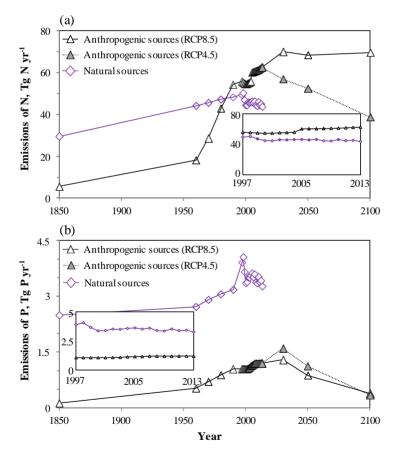


Figure 1. (a) Global atmospheric N emissions. Anthropogenic sources include fossil fuels, biofuel and agricultural activities. Natural sources include  $NO_x$  and  $NH_3$  emissions from biomass burning,  $NO_x$  and NH<sub>3</sub> emissions from soil, and NH<sub>3</sub> emissions from oceans. (b) Global atmospheric P emissions. Anthropogenic sources include fossil fuels and biofuel. Natural P sources include biomass burning, dust, sea salt, volcano particles and primary biogenic aerosol particles. The inset demonstrates the inter-annual recent variation over the period 1997-2013.

The future emissions of N differed considerably between the RCP4.5 and RCP8.5 scenarios, but the emissions of P were similar. NH<sub>3</sub> emissions in 2100 will be 54% under the RCP8.5 than the RCP4.5 scenario, due to increased agricultural activities needed to meet the food demand of a larger global population (Lamarque *et al.*, 2011; Riahi *et al.*, 2011). In contrast, 70% of P emissions from fossil fuels and biofuel were expected to be removed, due to a high penetration rate of clean technology in the industrial and residential sectors under both the RCP4.5 and RCP8.5 scenarios, leading to a slight difference between the two scenarios.

## 368 3.2. Spatial distributions of N and P deposition

The pre-industrial (1850) and present (1997-2013) spatial distributions of N and P deposition are shown in Figure 2. Dentener *et al.* (2006) recommended 1000 mg N m<sup>-2</sup> yr<sup>-1</sup> as a "critical load" threshold for plant sustainability, and rates above this threshold may lead to changes in ecosystemic functioning. The deposition rate of N for 1997-2013 also exceeded 1000 mg N m<sup>-2</sup> yr<sup>-1</sup> in large areas of India (72%), China (45%) and Europe (26%). The deposition rate of P for 1997-2013 exceeded 100 mg P m<sup>-2</sup> yr<sup>-1</sup> in the Indo-Gangetic region of India due to a high use of biofuels (*e.g.*, dung cake is widely used for cooking) and in the Congo Basin in Central Africa due to deforestation (Chen *et al.*, 2010).

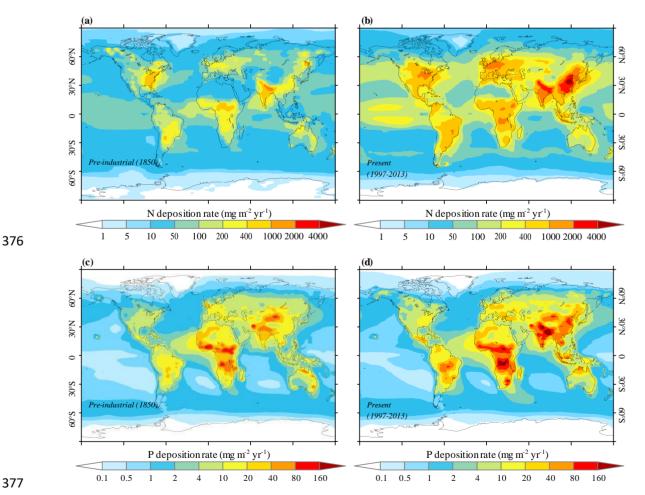


Figure 2. (a,b) Spatial distribution of N deposition in 1850 (a) and 1997-2013 (b). (c,d) Spatial distribution
of P deposition in 1850 (c) and 1997-2013 (d).

The modeled spatial distributions of N wet and P total deposition rates were evaluated by measurements at 381 the forest sites and at all sites (Figure 3). The comparison indicated that our model broadly captured the 382 spatial patterns in the observed deposition rates of N and P. A normalized mean bias (difference between 383 384 the geometric mean of the model minus the geometric mean of the measurements relative to the latter) was used to quantify the bias. A statistical analysis show that 50% of the data were subject to a bias of -25% to 385 50% in the modeled wet N deposition and -4% to 164% in the modeled total P deposition relative to 386 observations (Figure S2). We addressed the potential uncertainty by scaling the modeled N deposition rate 387 388 by a fixed factor that followed a normal distribution, with a mean of 1.2 and a standard deviation of 0.6, and the modeled P deposition by a fixed factor that followed a normal distribution, with a mean of 1.6 and 389 390 a standard deviation of 1.0, which were derived from the frequency distribution of the model bias (Figure S2). The scaled deposition rates of N and P were used in the calculation of  $\Delta C_{v dep}$ . The data for observed 391 N wet deposition enabled us to further evaluate the modeled wet deposition of N in the oxidized  $(NO_3)$  and 392 reduced (NH<sub>4</sub>) forms by region (Figure S3). 393

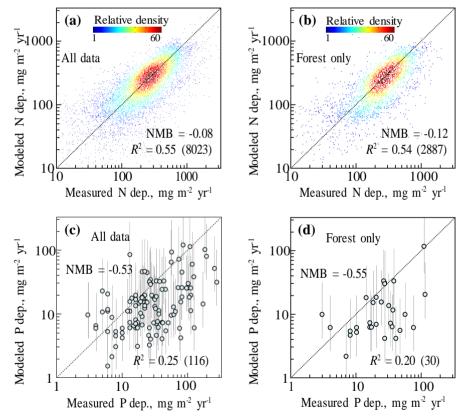




Figure 3. Comparison of modelled and observed deposition of wet N (a,b) and total P (c,d). (a,c) show all data and (b,d) show measurements over forests only. In (a,b), colours show the relative density of data. In (c,d), the error bars show the uncertainty associated with emissions of P from different sources as estimated by Wang *et al.* (2015a). Coefficient of correlation ( $R^2$ ) and normalized mean bias (NMB) of log-transferred deposition rates are given in each panel with the number of data in bracket.

400

401 Figure S4 shows a comparison of our modeled surface concentrations of P for particles of the same size

- with the observational data used by Mahowald *et al.* (2008). These discrete sampling measurements were
  temporally variable, so we focused on comparing the modeled P concentrations with long-term
  measurements. It shows that including a large contribution of P from combustion sources can reduce the
  normalized mean bias from -31% to -11%, while our estimates were subject to uncertainty errors between
  -73% to 105% as 95% CIs in the estimation of P emissions from different sources (Wang *et al.*, 2015a).
- 407

#### 408 3.3. Temporal trends of N and P deposition in forests

Figure 4 shows the temporal trends of N and P deposition in forests in various regions from 1850 to the 409 410 present. The increase in the rate of N deposition in forests from 1850 to the present ranged from 1.5- to 7-fold by region. The rate of P deposition in forests increased by 1- to 3.5-fold from 1850 to the present, 411 412 due to a smaller contribution of anthropogenic source than for N. The deposition of N and P in North 413 American and European forests both peaked in the 1980s or 1990s. Specifically, the deposition rates of N 414 and P in European forests peaked in the 1980s and 1990s, respectively. The rate of N deposition in North American forests peaked in 1990, but the rate of P deposition continued to increase. The increase in the 415 deposition of P in North American forests was mainly due to an increase in emissions from biomass 416 burning during the last two decades (Westerling, et al. 2006). This increase was captured by the GFED4.1 417 and ACCMIP inventories (Lamarque et al., 2010; Giglio et al., 2013) used in our study. Figure S5 shows 418 419 that this increasing trend was also confirmed by three other inventories for biomass burning. The rate of N 420 deposition in Siberian forests had a trend similar to that of European forests due to the atmospheric 421 transport of N from Europe, but the rate of P deposition was mainly governed by the variability of wildfires. 422 The rate of N deposition in the forests in Australia and New Zealand increased continuously, but the rate of 423 P deposition began to decline in Australia after 1980 due to the replacement of P-rich fuels (coal) with 424 P-poor fuels (petroleum or natural gas) (IEA, 2013).

The rate of N deposition in East Asian forests was 7-fold higher in 2010 than 1850 and more than 4-fold in Southern/Southeastern forests. Total N emissions were highest in China and India, but  $NO_x$  emissions had increased more in China from 1990 to 2010 by 150%, compared to 80% in India, due to a faster growth in

428 fleet vehicle in China (Granier *et al.*, 2011).

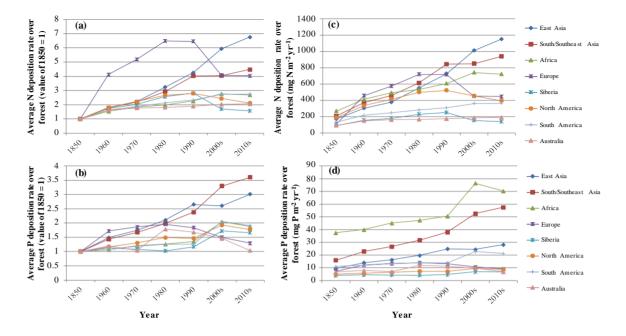


Figure 4. Temporal trends of N (a,c) and P (b,d) deposition rate over forests by region. (a,b) show the
values relative to 1850, while (c,d) show absolute values. The data for 2000s represent an average over
1997-2004 and the data for 2010s represent an average over 2005-2013.

429

434 The rate of P deposition in East Asian forests increased 2.5-fold from 1850 to 1990 and stabilized after 435 1990. Figure S6 shows the inter-annual variability of N- and P-deposition rates in the forests in East Asia and South/Southeast Asia from 1997 to 2013. The rate of N deposition increased continuously, but the rate 436 of P deposition remained more stable in these two regions. The increase in the rate of N deposition was 437 438 driven by the increase of in the use of fossil fuels and in agricultural activities. The rate of P deposition, 439 however, was driven by emissions from fossil fuels, biofuel and biomass burning. The increase in fires and biomass burnt during the 1997-1998 El Niño led to a peak in the P-deposition rate in the forests in East 440 441 Asia and South/Southeast Asia (van der Werf et al., 2004).

442 Figure 5 shows the temporal trends of the N:P deposition ratio (on a molar basis) in forests by region. The 443 ratio peaked in around 1990 in the forests in Europe, Siberia and North America and then decreased due to a decline in the deposition of N and an increase in the deposition of P due to increasing wildfires. The N:P 444 deposition ratio in the forests did not vary greatly in the forests in South/Southeast Asia, Africa and South 445 America, because the rates of N and P deposition increased at similar rate. In contrast, the N:P deposition 446 ratio increased continuously in the forests in East Asia due to rapid increases in the emission and deposition 447 of N in this region. The N:P deposition ratio in the 2010s was significantly larger in the forests in Europe, 448 North America and East Asia than in the other regions. 449

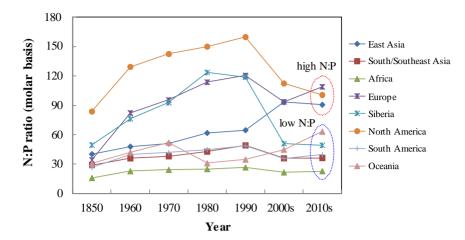


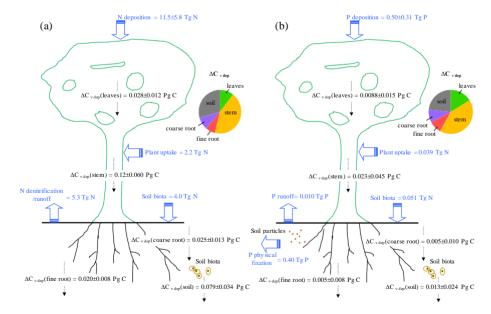
Figure 5. Temporal evolution of N:P ratio in the deposition over forests by region. The data for 2000s
represent an average over 1997-2004 and the data for 2010s represent an average over 2005-2013.



## 454 3.4. Forest C fixation due to anthropogenic N and P deposition

Based on the maps of N and P deposition, we calculated the global forest  $\Delta C_{v dep}$  using the stoichiometric 455 mass balance approach. Figure 6 shows that, for control values of the parameters, anthropogenic deposition 456 of N and P for 1997-2013 led to global  $\Delta C_{v dep}$  (median ± 90% CI from Monte Carlo simulations) of 0.27 ± 457 458 0.13 and 0.054  $\pm$  0.10 Pg C yr<sup>-1</sup>, respectively. A total of 10 000 Monte Carlo simulations were run by randomly entering parameters from a prior uniform or normal distribution of parameters. The frequency 459 distributions of global  $\Delta C_{v dep}$  by anthropogenic N and P deposition averaged for 1997-2013 are shown in 460 Figure S7. Some parameters were uniformly or normally distributed, but the output was nearly normally 461 distributed for  $\Delta C_{N dep}$  (P > 0.1) and log-normally distributed for  $\Delta C_{P dep}$  (P > 0.2). For a global terrestrial C 462 sink of  $3.1 \pm 0.9$  Pg C yr<sup>-1</sup> averaged for 2006-2015 (Le Quere *et al.*, 2016),  $\Delta C_{v dep}$  by anthropogenic N and 463

464 P deposition contributed 8.7% and 1.7% to the terrestrial C sink, respectively.



465

Figure 6. Anthropogenic N and P deposition over forest and  $\Delta C_{v dep}$  due to anthropogenic N and P deposition per year as an average over 1997-2013. (a) for N and (b) for P. Uncertainty of the modeled N

468 and P deposition as standard deviations is derived from a comparison with observations. Uncertainty of the  $\Delta C_{v dep}$  as 90% CI is derived from Monte Carlo simulations. The pie charts show the distribution of  $\Delta C_{v dep}$ 

469

470 among five pools.

471

472	Figure 6 also shows that 43% of $\Delta C_{Ndep}$ was stored in stems, followed by soil (29%), leaves (11%), coarse
473	roots (9%) and fine roots (7%). Similarly, stems (42%) were the most important storage pool for $\Delta C_{P dep}$ . In
474	addition, we performed sensitivity tests using the lower or upper bounds of the parameters to investigate the
475	influences on our estimated $\Delta C_{N dep}$ ( <b>Table 2</b> ). It shows that the major parameters influencing $\Delta C_{v dep}$ by N
476	or P include the retention ratios of N in vegetation and soils, the physical fixation of P by soil, the fraction
477	of N and P allocated to woody biomass, and the C:N and C:P stoichiometric ratios in each pool. $\Delta C_{Pdep}$ was
478	generally associated with a far higher uncertainty than $\Delta C_{N dep}$ . Most importantly, we assumed that a large
479	fraction of P (80%) was fixed by the soil as inorganic P, which is unavailable for C storage (Walker and
480	Syres, 1976). Assuming a weaker or stronger fixation of P by soils, which influences estimates of $\Delta C_{v dep}$
481	by P the most, however, led to a difference in $\Delta C_{P dep}$ from -70% to +300%.

Table 2. Global forest  $\Delta C_{v dep}$  due to anthropogenic N and P deposition over 1997-2013. Sensitivity 482 tests were run to compare with a standard run with central values of parameter. The sensitivity tests include 483 high or low retention fraction of N in vegetation and soil; weak or strong fixation of P by soil particles; 484 high or low fraction of N and P allocated to the woody part; high or low C:N and C:P stoichiometric ratios. 485 Values in brackets show the percentage changes relative to the standard run. 486

	Leaf	Stem	Fine	Coarse	Soil	Woody	Total	
			root	root				
Forest $\Delta C_{v dep}$ by N deposition over 1997-2013 (Pg C yr <sup>-1</sup> )								
Standard run	0.028	0.117	0.020	0.025	0.079	0.142	0.269	
High retention fraction	0.037	0.153	0.026	0.033	0.107	0.186(+31%)	0.356(+32%)	
Low retention fraction	0.018	0.073	0.013	0.016	0.042	0.088(-38%)	0.160(-40%)	
High woody fraction	0.021	0.168	0.014	0.037	0.079	0.205 (+45%)	0.320(+19%)	
Low woody fraction	0.034	0.079	0.022	0.017	0.079	0.097(-32%)	0.232(-14%)	
High C:N ratio	0.034	0.140	0.024	0.030	0.079	0.170(+20%)	0.307 (+15%)	
Low C:N ratio	0.023	0.093	0.016	0.020	0.079	0.113(-20%)	0.231 (-15%)	
Forest $\Delta C_{\nu dep}$ by P deposition over 1997-2013 (Pg C yr <sup>-1</sup> )								
Standard run	0.009	0.023	0.005	0.005	0.013	0.028	0.054	
Weak fixation by soil	0.035	0.091	0.020	0.020	0.051	0.111 (+300%)	0.218 (+300%)	
Strong fixation by soil	0.003	0.007	0.002	0.002	0.004	0.008(-70%)	0.016(-70%)	
High woody fraction	0.006	0.039	0.003	0.009	0.013	0.048 (+73%)	0.070(+29%)	
Low woody fraction	0.009	0.018	0.005	0.004	0.013	0.022(-19%)	0.050(-8%)	
High C:P ratio	0.011	0.027	0.006	0.006	0.013	0.033 (+20%)	0.063 (+15%)	
Low C:P ratio	0.007	0.018	0.004	0.004	0.013	0.022(-20%)	0.046(-15%)	

487

#### 488 3.5. Spatial patterns of N and P limitation

Increasing N from atmospheric deposition has been postulated to lead to a progressive emerging limitation 489 of P (Vitousek *et al.*, 1984, 2010; Penuelas *et al.*, 2013). Figure 7 compares the forest area where  $\Delta C_{N dep}$  is 490 larger than  $\Delta C_{Pdep}$  between 1960 and the present (1997-2013) under different assumptions of the physical 491 492 fixation of P by the soil. A faster increase in the deposition of N than P in forests close to industrialized regions had led to a growth in  $\Delta C_{v dep}$  that is higher for N than for P. It should be noted that, as we did not 493 account for other sources of N and P (e.g. weathering for P and nitrification for N), lower  $\Delta C_{v dep}$  from N 494 495 than P deposition is only one factor contributing to a limitation by P (Vitousek et al., 1984, 2010; Penuelas et al., 2012, 2013). Globally, the forests where  $\Delta C_{N dep}$  is larger than  $\Delta C_{P dep}$  in 1960 covered an area 496 between 2.79 and  $4.90 \times 10^7$  km<sup>2</sup>, depending on the strength of soil P fixation. In these forests, additional 497 supply of P from other sources (e.g., by mineralization) is needed to support  $\Delta C_{v dep}$  by N. The forest area 498 where  $\Delta C_{N \text{ dep}}$  is larger than  $\Delta C_{P \text{ dep}}$  had extended by 4% or 18% from 1960 to the present, which also 499 depends on the strength of soil P fixation, mainly located in forests in South/Southeast Asia, East Asia, 500 501 Europe and North America.

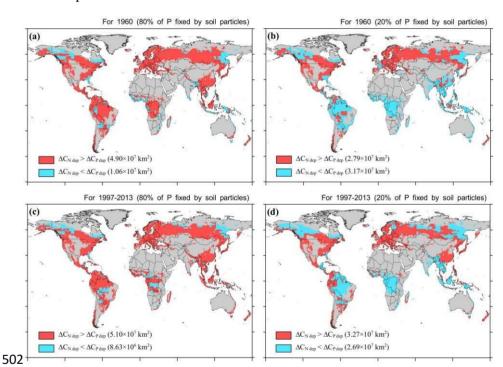


Figure 7. Spatial distribution of forest area where  $\Delta C_{vdep}$  by anthropogenic N deposition is larger or smaller than  $\Delta C_{vdep}$  by anthropogenic P deposition in 1960 (**a**,**b**) and as an average over 1997-2013 (**c**,**d**). In (**a**,**c**), the model assumes that 80% of the deposited P is fixed by soil particles, while (**b**,**d**) shows results in a sensitivity case where 20% of P is fixed by soil particles. The total areas where  $\Delta C_{vdep}$  by anthropogenic N deposition is larger or smaller than  $\Delta C_{vdep}$  by anthropogenic P deposition are in parentheses. Non-forest land areas are shown as grey.

509

## 510 3.6. Temporal trends of $\Delta C_{v dep}$ by N and P

- 511 Figure 8a shows the temporal trends of  $\Delta C_{vdep}$  by N and P deposition alone for 1960-2100 under different
- 512 physical fraction of P fixed in soil.  $\Delta C_{v dep}$  by N peaked in 1990 and then declined due to reductions of N
- emissions and deposition in the forests in Europe and North America, but  $\Delta C_{v dep}$  by P was projected to

- 514 increase by 2030 due to continuous increases in P emissions and deposition in South and Southeast Asia,
- Africa and South America under the RCP4.5 scenario. We also found that  $\Delta C_{v dep}$  by N was much higher
- than  $\Delta C_{v dep}$  by P in our central case where 80% of the P was fixed by soil, but they were very similar in a
- sensitivity test where only 20% of P was fixed by soil.  $\Delta C_{v dep}$  by N for 2030, 2050 and 2100 was expected
- to be 28-60% higher under the RCP8.5 than the RCP4.5 scenario due to higher  $NH_3$  emissions from
- agriculture. Difference in  $\Delta C_{v dep}$  by P would be less than 15% due to a high control rate of industrial
- 520 particulate emissions under both scenarios (Lamarque *et al.*, 2011) (Figure S8).
- 521 Based on  $\Delta C_{v dep}$  by N and P in each  $1^{\circ} \times 1^{\circ}$  grid, we calculated  $\Delta C_{v dep}$  by N and P deposition together in
- the case of maximum or minimum effects from 1960 to 2100 (Figure 8b).  $\Delta C_{v dep}$  was about 6-fold higher
- 523 for maximum (0.28 Pg C yr<sup>-1</sup> averaged for 1997-2013) than minimum (0.044 Pg C yr<sup>-1</sup>) effects,
- highlighting the imbalance between N and P in the deposition.  $\Delta C_{v dep}$  for maximum effects peaked at 0.29
- 525  $PgCyr^{-1}$  in 1990 and then decreased due to reductions of N emissions and deposition rates in the forests in
- 526 Europe and North America. In a sensitivity test where 20% of P was fixed by soil, however,  $\Delta C_{v dep}$  for
- 527 maximum effect was predicted to increase continuously from  $0.14 \text{ Pg C yr}^{-1}$  in 1960 to  $0.42 \text{ Pg C yr}^{-1}$  in
- 528 2030 due to increases in both N and P deposition rates before 1990 and an increase in P deposition rate
- alone after 1990. Figure S8 shows  $\Delta C_{v dep}$  due to N and P together under the RCP8.5 scenario, where  $\Delta C$
- 530  $_{v dep}$  for maximum effect was expected to be 23-54% higher than under the RCP4.5 scenario.

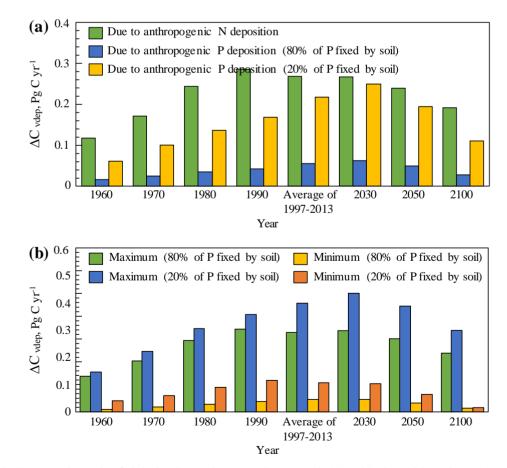




Figure 8. Temporal trends of global  $\Delta C_{v dep}$  due to anthropogenic N and P deposition alone (**a**) and together as maximum or minimum effects (**b**) from 1960 to 2100.  $\Delta C_{v dep}$  in a case where 80% of P is fixed by soil

- is compared to a sensitivity case where 20% of P is fixed by soil. The  $\Delta C_{v dep}$  for 2030, 2050 and 2100 are
- estimated based on the anthropogenic N and P deposition under the RCP 4.5 storyline.
- 537

## 538 3.7. Impact of forest cover change on $\Delta C_{v dep}$

In addition to the change of N and P deposition rates, the change of forest areas due to deforestation and 539 afforestation influences  $\Delta C_{v dep}$ . Table S4 shows the change of total forest areas, average N and P 540 deposition fluxes over forests and  $\Delta C_{v dep}$  estimated for the five types of forests using a reconstructed 541 global data set of forest cover change from 1850 to 2010 (Peng et al., 2017). Figure 9 compares the 542 deposition fluxes and the  $\Delta C_{v dep}$  for 1850 and 2010 with or without forest cover change by taking 1850 as 543 a reference, whereas the results for 2010 are calculated using the forest cover map in 1850 or 2010. It 544 shows that, if accounting for forest cover change,  $\Delta C_{v dep}$  due to change in N and P deposition from 1850 to 545 2010 would decrease by 10% and 30%, respectively. Likewise, the deposition fluxes and  $\Delta C_{v dep}$  for 1850 546 and 2010 are compared with or without the forest cover change by taking 2010 as a reference, whereas the 547 results for 1850 are calculated using the forest cover map in 1850 or 2010 (Figure S9). Similarly, it shows 548 that the forest cover change leads to a difference in  $\Delta C_{\nu dep}$  by -6% and -19% for N and P, respectively. 549

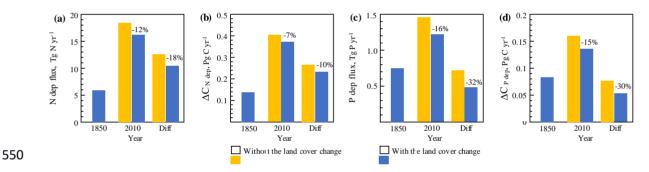


Figure 9. Comparison of global N deposition fluxes over forests (a),  $\Delta C_{v dep}$  due to N deposition (b), P deposition fluxes over forests (c) and  $\Delta C_{v dep}$  due to P deposition (d) in 1850 and 2010 and the difference between 1850 and 2010 (Diff) without or with the forest cover change by taking year 1850 as a reference. The yellow bars show the  $\Delta C_{v dep}$  calculated based on the forest cover map in 1850, and the blue bars show the  $\Delta C_{v dep}$  calculated based on the forest cover map in 1850, and the blue bars show the  $\Delta C_{v dep}$  calculated based on the forest cover map for 1850 and 2010 respectively. In all cases,  $\Delta C_{v dep}$  is estimated using the central values of parameters. Relative difference as a percentage by accounting for the forest cover change is given over each bar.

558

There are three reasons for the difference. First, the global total forest area had declined by 12% from 29.5 559  $\times 10^{6}$  km<sup>2</sup> in 1850 to 25.9  $\times 10^{6}$  km<sup>2</sup> in 2010. Second, the C response to N or P deposition varies across the 560 five types of forest and change in the relative cover of each forest type influences the estimation of  $\Delta C_{v dep}$ . 561 For example, the C response to N deposition is the highest for the evergreen needle-leaf forests (47 kg C kg 562  $N^{-1}$ ) and the lowest for the evergreen broadleaf forests (12 kg C kg  $N^{-1}$ ). From 1850 to 2010, the cover 563 564 fraction of evergreen needle-leaf forests had increased from 19% to 21%, while the cover of evergreen broadleaf forests had decreased from 49% to 44%, leading to less reduction in  $\Delta C_{N dep}$  than N deposition 565 fluxes after accounting for the land cover change (Figure 9). At last, change in the spatial distribution of 566 567 forests also leads to some changes in the average N or P deposition rates, but our data sets show that this 568 influence is relatively small. The average N and P deposition rates over global forests in 2010 were 628 mg 569 N m<sup>-2</sup> yr<sup>-1</sup> and 47 mg P m<sup>-2</sup> yr<sup>-1</sup> using the forest cover map in 2010, compared with 626 mg N m<sup>-2</sup> yr<sup>-1</sup> and 570 49 mg P m<sup>-2</sup> yr<sup>-1</sup> using the forest cover map in 1850.

571

## 572 4. Discussion

## 573 4.1. Global data sets of N and P deposition

574 Our study provides the first global gridded data sets for both N and P deposition from pre-industrial (1850), historical periods (1960, 1970, 1980 and 1990), to present (1997-2013), and into the future (2030, 2050 and 575 2100) from a global climate-chemistry model driven by complete bottom-up emission inventories. Table 576 577 S1 provides a comparison of species represented by the model, horizontal resolution, and observational data used to evaluate the model with previous studies. In the simulation of N, we employed state-of-the-art 578 579 inventories for reactive N and other tracers that influence the atmospheric chemistry of N (Klimont et al., 580 2013). The chemistry of N in the model is advanced in the treatments of the ammonia cycle and the nitrate 581 particle formation (Hauglustaine et al., 2014), which are only represented in few global models (Dentener et al., 2006). Our model also provides a horizontal resolution of  $1.2^{\circ} \times 2.5^{\circ}$  that is finer than most of 582 previous models (Dentener et al., 2006). For P, we used a new emission inventory from combustion 583 584 sources with the uncertainties quantified (Wang et al., 2015a), which reduced the underestimation in the modeled P deposition by covering P in all sizes of particles which are carried to the measurement sites. 585 586 Prior to our work, there was only one global data set of present day P deposition available (Mahowald et al., 587 2008). In addition to its lack of temporal changes, this previous data set covered P in particles with diameter smaller than 10  $\mu$ m. Wang *et al.* (2015a) showed that it led to a discrepancy between the modeled 588 589 and observed P deposition rates at globally distributed measurement stations if P in particles with diameter 590 larger than 10 µm was neglected even if uncertainties in P emissions from other sources were accounted 591 for.

The modeled NO<sub>3</sub> and NH<sub>4</sub> wet deposition rates were evaluated by comparing with 8023 observations from 592 593 globally distributed measurement stations. The modeled P deposition rates were compared with 116 observations. The normalized mean bias (NMB) is -8% for the NO<sub>3</sub> and NH<sub>4</sub> wet deposition rates, and 594 595 -53% for the P deposition rates. It also shows that 50% of the data were associated with a bias between -25% and 50% for the NO<sub>3</sub> and NH<sub>4</sub> wet deposition and between -4% and 164% for the P deposition. The 596 correlation coefficient of the log-transformed deposition rate is higher for N (R=0.74) than for P (R=0.50). 597 The underestimation of P deposition was likely due to errors in the transport model or ignored local 598 biogenic aerosols in the measurement samples. The distributions of these model errors were treated as 599 600 uncertainties in our data sets. It is not a surprise that there is a larger uncertainty associated with the 601 modeled deposition rates of P than N. For P, in addition to the errors associated with atmospheric transport 602 and removal, emissions of P from wind erosion of soil dusts, biogenic aerosols, marine sea-salt particles, 603 volcanoes and other sources (e.g., phosphine from freshwater wetlands and rice paddies) are all subject to 604 high uncertainties (Graham and Duce, 1979; Mahowald et al., 2008; Wang et al., 2015a). A limitation of 605 our P deposition simulations set is that the long-term variations of these emissions are not resolved, because

no information on evolution of these sources is currently available at the global scale. More measurements
of P deposition rates in contrasting environments are useful to reduce the uncertainty in the modeled P
deposition rates (*e.g.*, Du *et al.*, 2016), while more long-term measurements of the surface concentrations of
P with additional source information are useful to constrain the model and emissions of P from difference
sources (Mahowald *et al.*, 2008).

For N, we had lower model biases in some regions when compared with previous studies. For example, 611 Hauglustaine et al. (2014) simulated N deposition using the same climate-chemistry model and evaluated 612 the model using 4036 observations from global monitoring stations. They reported that NMB is 613 respectively -32%, -4.5% and -60% in North America, Europe and Asia for the modeled NH<sub>4</sub> wet 614 615 deposition, and -28%, 13% and -54% for the modeled NO<sub>3</sub> wet deposition. In contrast, NMB in our study is 616 -12% in North America, -42% in Europe and -28% in East Asia respectively for NH<sub>4</sub> wet deposition, and 29%, -29% and -11% respectively for NO<sub>3</sub> wet deposition (Figure S3). Thus, our results are better for Asia 617 618 but worse for Europe. Hauglustaine et al. (2014) attributed the underestimation in Asia to a coarse horizontal resolution of the model and an underestimation of reactive-N emissions in the region (Lamarque 619 620 et al., 2010). We updated reactive-N emissions by using a more recent ECLIPSE GAINS.4a inventory (Klimont et al., 2013) and used a higher horizontal resolution version of the atmospheric model, from 621  $1.9^{\circ} \times 3.75^{\circ}$  previously to  $1.2^{\circ} \times 2.5^{\circ}$ . These together reduced the model bias in Asia. Despite a larger NMB 622 in Europe in our model, the correlation coefficient (R) is 0.63 and 0.79 for wet NH<sub>4</sub> and NO<sub>3</sub> deposition in 623 624 this region, respectively, higher than 0.33 and 0.49 by Hauglustaine et al. (2014), indicating that our model 625 better captures the spatial pattern of N deposition.

Overall, our study provides consistent gridded simulations of both N and P deposition at a high horizontal
resolution, which agrees better with observations from a large number of globally distributed measurement
stations than previous studies (Mahowald *et al.*, 2008; Haughustaine *et al.*, 2014). A statistical analysis of
the model-observation comparison generates a probabilistic distribution of the model bias, which enabled
us to address the uncertainty in our data sets. Whereas previous studies (de Vries *et al.*, 2014) have only
estimated the C sequestration by current N deposition without spatial and temporal variations, we estimated
C sink changes from changes in N and P deposition maps and included an uncertainty analysis to both N, P
deposition and C sink responses.

#### 634 4.2. P deposition contributes significantly to forest C storage

Increasing atmospheric CO<sub>2</sub> concentrations, longer growing season and N fertilization have been suggested to lead to limitation by P of productivity in temperate forests (Vitousek *et al.*, 1984, 2010; Penuelas *et al.*, 2012, 2013). Our long-term data of P-deposition rates, combined with data of N-deposition rates, suggested that  $\Delta C_{P dep}$  would be close to  $\Delta C_{N dep}$  if 20% of the P is fixed by soil, and C fixation due to P deposition is higher than previously estimated (Cleveland *et al.*, 2013; de Vries *et al.*, 2014) due to higher P deposition rates and a less fraction of P loss (Sattari *et al.*, 2012). Our simple stoichiometric mass balance approach indicated that the strength of P fixation by soil particles exerted the strongest influence on the response of C fixation to P deposition. Consequently, we adopted a global-constant fraction of deposited P being fixed by soil ranging from 20% to 94%, based on the transfer coefficients between stable and labile P from Sattari *et al.* (2012). However, it should be noted that this fraction was not uniform in space and was probably soil
type dependent (Compton and Cole, 1998). More field experiments measuring fixation of P by soil particles
are needed to reduce this uncertainty (Johnson *et al.*, 2003).

Nevertheless, our stoichiometric method found that  $\Delta C_{Pdep}$  was equivalent to 50-90% of  $\Delta C_{Ndep}$  when the 647 648 fixation of P by soil was weak, implying that deposited P can contribute to forest C storage providing that other sources of N and P were held constant. Spatially,  $\Delta C_{P dep}$  could even exceed  $\Delta C_{N dep}$  in some areas of 649 forests in East Asia, South and Southeast Asia, Africa and South America (Figure 7). In particular, we find 650 651 that  $\Delta C_{P dep}$  can be significantly higher than  $\Delta C_{N dep}$  in tropical forests in the Congo and Amazon Basins and 652 Indonesia, due to both rapid losses of N from ecosystems through denitrification (Bai et al., 2012) and high 653 deposition rates of P from deforestation fire emissions (Giglio et al., 2013). The C sink in tropical forests is sensitive to additional P inputs, because P availability in the soil of tropical forests was found to be far 654 655 lower than the global average (Yang et al., 2013) but P use efficiency was higher than that in boreal forests 656 (Gill and Finzi, 2016). We suggest that more attentions should be paid to estimate the C sink due to 657 additional P inputs from deposition in tropical forests.

However, our current knowledge of nutrient cycling is more limited for P than for N, leading to high 658 659 uncertainties global ecosystem-level models (Wang et al., 2010; Goll et al., 2012; Yang et al., 2014). It is known that most of P is neither directly taken up by plant nor lost by leaching, but a large fraction of P is 660 661 fixed by soils before being slowly transferred into a labile pool that can be used by plant (Aerts and Chapin, 662 2000; Sattari et al., 2012). Different from N, there is no atmospheric loss pathway for P, while P is less 663 mobile in soil and hence less prone to leaching than for N (Aerts and Chapin, 2000; Goll et al., 2012; Goll, 664 2016), but it remains unknown whether and how fast the fixed P in soil can be mineralized and used by plants (Lü et al., 2013). A meta-analysis of P and N plus P fertilization experiments suggested that 665 increasing N availability, e.g. from increasing N deposition, tends to increase P cycling rate and thus 666 667 contributes to use of P by plants (Marklein and Houlton, 2012). Measurements of the rate of P uptake in the 668 seasons with both high N and P-deposition rates are useful to understand the contribution of N and P 669 deposition together to the C fixation in forests.

670 The cycles of C, N and P differ in their respect to the residence time in terrestrial ecosystem (Walker and Syres, 1976). Our stoichiometric method attributes the C storage due to N and P deposition at a timescale 671 672 of 10-20 years, following de Vries et al. (2014). Nonetheless, P would turn over much more slowly than N 673 (Walker and Syres, 1976), so it is worth highlighting that the effects of P would last longer than those of N. 674 We expect that the use by plants is much slower for deposited P than deposited N due to the strong physical fixation of P in soil (Aerts and Chapin, 2000; Goodale *et al.*, 2002), and our estimated  $\Delta C_{P dep}$  under a weak 675 fixation should include part of the long-term effects of P deposition. Under a high CO<sub>2</sub> concentration in the 676 near term, plants are likely increasing their efficiency in accessing and utilizing these not readily available 677 678 P (Buendia et al., 2014, Goll, 2016). Such effects should be better represented in the process-based models 679 when studying the impact of N and P deposition on P limitation (Cleveland et al., 2013; Wieder et al.,

680 <u>2015</u>).

While we cannot quantify all sources of N and P for plants, calculation of maximum and minimum  $\Delta C_{v dep}$ 681 by N and P provides a preliminary estimation of the C storage supported by anthropogenic P deposition. 682 Under a weak fixation for P by soil, maximum  $\Delta C_{y dep}$  by N and P (0.38 Pg C yr<sup>-1</sup>) is 43% higher than  $\Delta C$ 683 <sub>v dep</sub> by N alone (0.27 Pg C yr<sup>-1</sup>). Meanwhile, minimum  $\Delta C_{v dep}$  by N and P (0.10 Pg C yr<sup>-1</sup>) is 53% lower 684 than  $\Delta C_{v dep}$  by P alone (0.22 Pg C yr<sup>-1</sup>). They both suggest a potential contribution of anthropogenic P 685 deposition to additional forest C sink. The map of  $\Delta C_{v dep}$  by N and P also implies that other sources of N 686 687 are needed to support the C storage by P deposition in some Asian tropical forests where the deposition rate increased faster for P than for N (Figure 7). However, it should be noted that N fertilization can also exert a 688 689 significant effect on the capacity of plant to use the P (Marklein and Houlton, 2012; Lü et al., 2013), and 690 the maximal co-fertilized  $\Delta C_{v dep}$  is likely even larger than maximum  $\Delta C_{v dep}$  estimated by our method.

#### 691 **4.3.** Uncertainty due to N retention by the canopy

692 We aimed at providing a preliminary estimation of forest C response to N and P deposition and investigated 693 the imbalance of N and P in the deposition at a mid-term scale of 10-20 years when other sources were held 694 constant. We find that anthropogenic P deposition can contribute to C storage, supplementing  $\Delta C_{y,dp}$ 695 supported by anthropogenic N deposition by 43%. It is worth highlighting that the impact of N deposition on C storage also remains uncertain, despite more measurements of N than P retention in ecosystems, due 696 largely to the uncertain impact of canopy N uptake. It was noticed that ~40% of N deposited is retained by 697 698 the canopy in Europe and North America (Lovett and Lindberg, 1993), but the impact on C storage is not 699 well constrained (Sparks, 2009). Sievering et al. (2007) found that 80% of the growing-season N deposition 700 was retained in canopy foliage and branches and that  $\sim 20\%$  of daytime net ecosystem exchange may be 701 attributed to canopy N uptake. Dezi et al. (2010) found that the net ecosystem production would be 702 increased by 58% under a hypothesis that canopy N uptake can directly stimulate photosynthesis relative to 703 without canopy N uptake. Nair et al. (2016) suggested that accounting for canopy N uptake could lead to an increased C response to N deposition (oC/oN) from 43 to 114 kg C kg N<sup>-1</sup> (by 2.6-fold) through a 704 705 well-designed mesocosm experiment. It should be noted that the experiment by Nair et al. studied the 706 response to N deposition at a time scale of one year and it is likely that N in the aboveground biomass can 707 be re-allocated in plants at a longer time scale. This is likely the reason why most of applied N was retained 708 in the plants at mid-long term (Gaige et al., 2007), but most of the N in the plant was recovered in the bark 709 rather than in the canopy (Dail et al., 2009).

Here we calculated the C response to N deposition based on the fate of deposited N at a timescale of 10-20 years following de Vries *et al.* (2014). We estimated that oC/oN was 24 kg C kg N<sup>-1</sup>, which is lower than
the estimate by Nair *et al.* (2016), but close to the estimate (11.5-39.8 kg C kg N<sup>-1</sup>) by de Vries *et al.* (2014),
because Nair *et al.* (2016) did not account for loss of N in the ecosystem via denitrification and leaching.
We increased our estimate of ΔC N dep by 2.6-fold as indicated by Nair *et al.*'s experiment to yield an upper
estimate of the effect by N. Consequently, maximum ΔC V dep by N and P increased by 2-fold from 0.38 Pg
C yr<sup>-1</sup> to 0.76 Pg C yr<sup>-1</sup>, compared to 0.70 Pg C yr<sup>-1</sup> by anthropogenic N deposition, while minimum ΔC V dep

717 increased by 1.6-fold from 0.10 to 0.16 Pg C yr<sup>-1</sup>, compared to 0.22 Pg C yr<sup>-1</sup> by anthropogenic P
718 deposition. This suggests that the effect of P will be less significant if the high C response to N deposition
719 due to direct use of N by the canopy can be confirmed by more evidences.

#### 720 4.4. Ecological implications of N and P deposition

The spatial patterns and temporal trends of N and P emissions and subsequent deposition are important for understanding the variation of nutrient limitation in forests far away from agricultural activities (Reay *et al.*, 2008). Manipulation experiments across global biomes found that many ecosystems are co-limited by the availability of N and P (Elser *et al.*, 2007; LeBauer and Treseder, 2008; Penuelas *et al.*, 2013). Fossil fuel, biofuel and deforestation fires provide additional N and P to forests beyond the background level and these emitted from the populated regions can reach remote forests by atmospheric transport. Our long-term data of the deposition for both N and P help to quantify the deposition of N and P as anthropogenic components r28 and to estimate the additional C storage in forests.

Global change in N and P deposition rates arising from N and P emissions by human activities and biomass 729 730 burning is only one of factors that influence carbon storage by forests. Our study made a preliminary attempt to assess the contributions of forest cover change (Peng et al., 2017) and the changes in N and P 731 732 deposition rates to the  $\Delta C_{v \text{ dep}}$ . It is not a surprise that forest cover change has offset 10% and 30% of increase in the  $\Delta C_{v dep}$  from 1850 to 2010 due to increase in N and P deposition rates, due to decline in 733 734 forest areas mainly in the tropics. In addition to forest cover change, other environmental drivers perturbing the forest C sequestration from nutrient deposition, such as rising CO<sub>2</sub> levels (Field et al., 1995), 735 736 emergency of large-scale drought (Phillips et al., 2009), spring and autumn warming (Piao et al., 2008) and change in forest water-use efficiency (Keenan et al., 2013), are not considered in this study. A combination 737 of our global N and P deposition data sets associated with their uncertainties with process-based vegetation 738 models including both N and P interactions with terrestrial C cycling (e.g., Wang et al., 2010; Goll et al., 739 2012) would permit a more comprehensive understanding of the impact of atmospheric deposition on the 740 741 forest carbon sink.

Using a conceptual stoichiometric mass balance approach, we showed that anthropogenic N deposition for 742 743 1997-2013 contributed ~9% to the global terrestrial C sink, which is close to a previous estimate of 10% for 744 2030 (Reay et al., 2008). We emphasized that physical P fixation is an important factor that can lead to an 745 imbalance between N and P in atmospheric deposition. Anthropogenic P deposition  $(0.50 \text{ Tg P yr}^{-1})$  was 23-fold lower than N deposition (11.5 Tg N yr<sup>-1</sup>) for 1997-2013, but most of the P was stored in soils on a 746 shorter term and less P than N was prone to loss (5.3 Tg N yr<sup>-1</sup> was lost for N by denitrification or leaching, 747 748 and only 0.010 Tg P yr<sup>-1</sup> was lost for P by leaching). Our analysis suggested that historical P deposition would likely exert a significant cumulative effect on the terrestrial C sink by releasing soil-fixed P in the 749 750 long term. Nonetheless, our stoichiometric approach cannot account for the effects of N and P deposition under elevated CO<sub>2</sub> concentration and varying climate (Gruber and Galloway, 2008; Vitousek et al., 2010). 751 752 Comprehensive process-based Earth System ecosystem models representing the biogeochemical cycles of 753 C, N and P are useful for understanding the ecological effects of historical, present and future depositions

of N and P on the C cycle (Reed *et al*, 2015).

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