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2016 Environ. Res. Lett. 11 035014

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## **Environmental Research Letters**

## LETTER

**OPEN ACCESS** 

CrossMark

RECEIVED 23 October 2015

**REVISED** 24 January 2016

ACCEPTED FOR PUBLICATION 8 February 2016

PUBLISHED 15 March 2016

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The nitrogen legacy: emerging evidence of nitrogen accumulation in anthropogenic landscapes

K J Van Meter<sup>1</sup>, N B Basu<sup>1,2</sup>, J J Veenstra<sup>3</sup> and C L Burras<sup>4</sup>

- <sup>1</sup> Department of Earth and Environmental Sciences, University of Waterloo, 200 University Avenue West, Waterloo, ON N2L 3G1, Canada
  <sup>2</sup> Department of Civil and Environmental Engineering, Department of Earth and Environmental Sciences, 200 University Avenue West, Waterloo, ON N2L 3G1, Canada
  - Department of Math, Science & Technology, Flagler College, 74 King St., St. Augustine, FL 32084, USA

<sup>4</sup> Department of Agronomy, Iowa State University, 2104 Agronomy Hall, Ames, IA 50011, USA

E-mail: nandita.basu@uwaterloo.ca

Keywords: nitrogen, nutrients, time lags, water quality, retention, soil Supplementary material for this article is available online

#### Abstract

Watershed and global-scale nitrogen (N) budgets indicate that the majority of the N surplus in anthropogenic landscapes does not reach the coastal oceans. While there is general consensus that this 'missing' N either exits the landscape via denitrification or is retained within watersheds as nitrate or organic N, the relative magnitudes of these pools and fluxes are subject to considerable uncertainty. Our study, for the first time, provides direct, large-scale evidence of N accumulation in the root zones of agricultural soils that may account for much of the 'missing N' identified in mass balance studies. We analyzed long-term soil data (1957–2010) from 2069 sites throughout the Mississippi River Basin (MRB) to reveal N accumulation in cropland of 25–70 kg ha<sup>-1</sup> yr<sup>-1</sup>, a total of  $3.8 \pm 1.8$  Mt yr<sup>-1</sup> at the watershed scale. We then developed a simple modeling framework to capture N depletion and accumulation dynamics under intensive agriculture. Using the model, we show that the observed accumulation of soil organic N (SON) in the MRB over a 30 year period (142 Tg N) would lead to a biogeochemical lag time of 35 years for 99% of legacy SON, even with complete cessation of fertilizer application. By demonstrating that agricultural soils can act as a net N sink, the present work makes a critical contribution towards the closing of watershed N budgets.

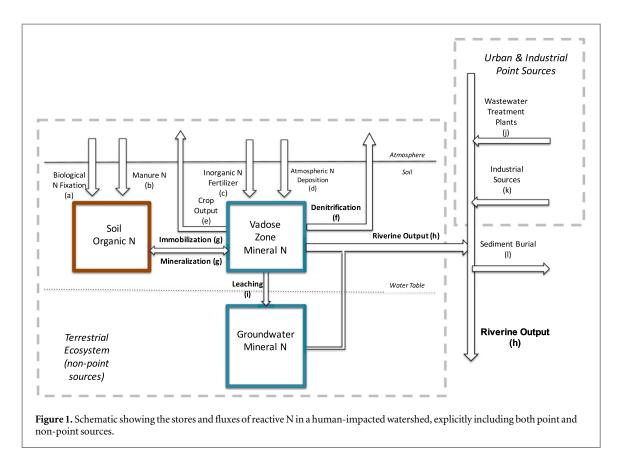
## 1. Introduction

Human modification of the nitrogen (N) cycle has resulted in increased flows of reactive N ( $N_R$ ), with growing evidence that planetary boundaries for maintaining human and ecosystem health have been exceeded [1, 2]. The creation of large hypoxic zones, and the resulting loss of habitat and species diversity in estuarine and coastal marine ecosystems, has been one of the most significant impacts of such increased flows [3]. While the need to manage N flows and their associated ecological impacts is increasingly recognized, implementation of conservation measures to reduce stream N concentrations has had only limited success [4, 5].

Growing evidence suggests that this lack of success can be attributed to diffuse legacy sources that continue to impair water quality even after agricultural inputs have ceased [6, 7]. These sources can lead to time lags between management changes and measurable improvements in water quality, lags that can make it difficult to evaluate the effectiveness of the management practices employed or to maintain public support of costly, ongoing interventions [4, 8, 9]. Such time lags, which have been defined as the time between the initiation of a restoration practice and the point at which a change is observed in the target water body [4, 9], have been observed in Europe and the United States, where nitrate concentrations in streams and aquifers have remained high despite reductions in N loadings to watersheds [10–12].

The presence of legacy sources is also suggested by the frequent references to 'missing' N, also referred to as N retention [13], in mass-balance studies of intensively managed catchments [14, 15]. In such catchments, anthropogenic inputs of N routinely exceed





measured outputs, creating watershed-scale N budgets that appear significantly out of balance. Indeed, both regional and continental-scale studies suggest that an inefficient use of N is common in heavily agricultural watersheds, leading to a large N surplus (defined as N inputs – usable outputs) [13, 16, 17]. A portion of this N surplus exits the watershed as riverine output, while the fate of the residual N, although not wholly unknown, remains largely unquantified at watershed scales. In particular, denitrification and subsurface storage constitute well-known pathways by which N may either exit a catchment or be retained over a long period (c) and these N sinks are frequently grouped under the heading of 'N retention' (figure 1). Our synthesis of N mass balance studies for watersheds across the world shows a mean N retention of approximately 50 kg  $ha^{-1}$  yr<sup>-1</sup> (supplementary table S1), but, as discussed below, precise quantification of N fluxes via specific retention pathways has remained elusive [18, 19].

Denitrification, which occurs in both soils and stream sediments [20, 21], is the process by which  $N_R$ is removed from a system via reduction to nitrous oxide (N<sub>2</sub>O) and nitrogen gas (N<sub>2</sub>) [8, 22–24]. Due to inherent difficulties in direct measurement of denitrification products, considerable uncertainty exists regarding denitrification rates in terrestrial systems [18, 22]. As a result, denitrification is often used simply as a balancing term in mass balance studies, with denitrification rates being estimated based on differences between N inputs and all other N storage and loss terms for the watershed [14, 25, 26]. The existence of such a balance, however, is based on an assumption of steady-state dynamics for terrestrial N reservoirs, with all anthropogenically and naturally fixed  $N_R$  being denitrified and returned to the atmosphere on an annual timescale [22]. Although such an assumption has been hypothesized to be valid for pristine systems over long timescales [27], it has been shown to be no longer applicable with the current high inputs of NR in intensively managed landscapes [19, 23, 28, 29]. Indeed, modeled estimates of of denitrification are often significantly significantly lower than those suggested by national-scale mass balance-based estimates [30].

The other possible fate of the 'missing N' is storage within the subsurface. We can conceptualize the subsurface environment to be composed of three major N pools: (1) dissolved  $NO_3^-$  in the vadose zone or (2) in groundwater aquifers, and (3) organic N within the soil profile (figure 1). Large vadose zone stores of inorganic N have been demonstrated in desert and semiarid regions, with accumulation magnitudes in deep vadose zones (30-50 m) varying as a function of rainfall, tillage and irrigation history [31-33]. The existence of a significant groundwater reservoir has been proposed based on observations of increasing groundwater N concentrations over time in both the US and Europe [8, 34]. Although the existence of such subsurface reservoirs for N is well accepted, determination of the magnitude of N accumulation is subject to significant uncertainty due to the presence of complex

aquifer systems and difficulties in measuring spatially varying patterns in NO<sub>3</sub><sup>-</sup> concentrations and groundwater storage [35]. In one of the few studies attempting to quantify stores of groundwater N over time, Worrall *et al* [34] estimate that N accumulation in groundwater beneath the River Thames Drainage Basin in the UK reached a peak between 2000 and 2004 of 1571  $\pm$  608 Mg N.

The third potential subsurface storage reservoir is organics N held within the soil profile (figure 1). Indeed, the largest pool of N in most terrestrial ecosystems is soil organic N (SON) [36, 37], and at current levels of N input, it is suggested that terrestrial N sequestration may be occurring at a global scale on the order of 20–100 Tg N yr $^{-1}$  [38–40]. The potential for increased N storage in forested soils has long been accepted for landscapes subjected to elevated levels of atmospheric N deposition [41]. For example, a study of N retention and C sequestration in European forests estimated N sequestration in forested soils to have occurred at a rate of 4.7 kg N  $ha^{-1}$  yr<sup>-1</sup> from 1960 to 2000 [42]. It has similarly been suggested that N may be accumulating in agricultural soils [41, 43]. Yan et al [44] found the average soil N content of Chinese croplands to increase by 5.1% between 1979-82 and 2007-08, while mass balance and modeling studies in Canada [30], Europe [45] and the US [46] suggest an annual accumulation of N within agricultural soils on the order of 15%-20% of total N (TN) inputs. Fenn et al [41] have shown that soils in which C and N pools have been reduced by disturbance, such as those under agricultural cropping, may exhibit the highest levels of N retention. Smil [43] has estimated that in agricultural soils receiving regular fertilizer inputs, N accumulation is likely occurring at a rate of 25–35 kg ha<sup>-1</sup> yr<sup>-1</sup>, and Worrall *et al* (2015), in their recent study of the Thames basin, suggest that SON has accumulated at a rate of  $55 \text{ kg ha}^{-1} \text{ yr}^{-1}$ since 1973.

In general, however, little attention has been given to the possibility of soil N storage in the context of watershed-scale N balance studies, primarily due to assumptions of either ongoing N depletion [47] or steady-state dynamics under conventional agriculture [25, 48]. For example, although Billen et al [47] note that storage in the soil organic matter reservoir could potentially account for missing N in the soil N budget for the Seine and Somme watersheds, this possibility is discarded because 'soil organic matter content is generally considered as decreasing due to continuous cropping'. Howarth et al [25] explicitly assume no potential for soil N accumulation, noting that after a large net release of N following conversion of land to agricultural use, the N status of soils reaches a steady state, with N immobilization, on average, equaling N mineralization on an annual basis.

Indeed, it is well-documented that dramatic losses of SON and C can occur after cultivation, particularly in nutrient-rich soils like those found in the North



American prairie region [49–54]. As early as 1905, for example, it was reported that Canadian prairie soils had lost more than 20%–30% of the organic matter originally present in the plow layer [55]. This fast depletion trajectory is due in part to a loss of physical protection provided by soil aggregates [56], with cultivation breaking up aggregate structures and leading to increases in oxidation and mineralization rates [52]. After these initial losses, however, SOM has been found to stabilize [57, 58], and it has been proposed that such losses could be reversed in response to the ongoing addition of root matter and other crop residues to soil [52]. It is this period, after stabilization, when it has been proposed that accumulations can occur, that is the focus of our study.

Our central hypothesis is that decades of highinput agriculture have led to a significant accumulation of SON within the landscape and that this accumulation may contribute to time lags in catchment response after changes in management practices. Our objective is (1) to use historical and current (mid-20th century to present) soil sampling data to provide direct evidence of potential changes in soil N content over time, (2) to place such evidence in the context of watershed-scale mass balance studies, and (3) to develop a parsimonious modeling framework to explain decadal-scale changes in SON. Our specific focus is on agricultural soils of the Mississippi River Basin (MRB), an area that covers approximately 41% of the contiguous United States and includes more than 800 000 km<sup>2</sup> cropland, much of which has been under intensive cultivation since the mid-19th century [59]. Thus, our paper focuses on answering the following two questions:

- Is N accumulating in agricultural soils, and if so, in what form, and in what magnitude?
- What are the implications of such accumulation with respect to time lags between changes in management practices and water quality benefits?

### 2. Materials and methods

#### 2.1. Soil resampling studies

We synthesize data from two studies, the first (carried out by the authors) in Iowa and the second a smaller study in Illinois [50], both of which were designed to assess anthropogenic changes in agricultural soils of the United States Midwest over multiple decades. Details on sample collection and analysis methodologies for the two studies are provided in supplement 2. In both studies, soil cores were obtained from plots under row crop agriculture that had been previously sampled in the mid-1900s and analyzed for TN content. Accumulation or depletion was estimated as the difference between the current and the mid-1900s N content. Such a resampling approach has commonly been employed to assess changes in soil C stocks over



time [58, 60], but has not been broadly utilized to evaluate potential changes in soil N.

In the Iowa study, soil samples from 61 representative pedons belonging to 46 different soil series in 21 counties across Iowa were obtained in 2007. These sites were previously sampled as part of the National Cooperative Soil Survey (NCSS) (between 1943 and 1963, median sampling year 1959), and all but three of these sites remained under intensive cultivation during this time frame (see Veenstra [61, 62]). Data from the Illinois study is based on samples obtained from six sites in central Illinois located on poorly drained Mollisols that were under corn-soybean rotations, were tile-drained, and had no history of manure application [50]. All six sites were originally sampled in 1957 and resampled in 2002.

### 2.2. Trend analysis of soil data across the MRB

The resampling study described in the previous section was used to quantify N accumulation at specific locations based on two points in time, an approach commonly used for the assessment of C sequestration in plots under long-term tillage [63]. We complemented this historical resampling approach with analysis of NCSS soil samples [64] obtained across the MRB from 1980 to 2010 to test for negative or positive trends over time in TN. Reported values for bulk density and TN were standardized to depth layers of 25 cm (0-25 cm, 25-50 cm, 50-75 cm, 75-100 cm). TN concentrations  $(g Mg^{-1})$  were obtained directly from NCSS chemical analysis data [64], reported in the database as percent N. Area-based estimates of TN content were calculated from the thicknesses of the soil layers and bulk density values.

Samples were selected for analysis based on the following criteria: availability of (1) TN data to a depth of *at least* 25 cm; (2) soil texture data, including percentages of clay, sand and silt; and (3) latitude and longitude data. Only samples sites falling on land classified as cropland were included in the analysis, as confirmed using United States Geological Society landuse data sets [65]. Based on this criteria, a total of 2069 samples were available at the 0–25 cm depth, 1759 samples for the 25–50 cm depth, 1505 samples for 50–75 cm, and 1320 samples with complete data from 0 to 100 cm. Trend analysis was carried out at each depth range with all the available samples for that range, and also over the entire 100 cm depth using the subset of 1320 samples.

Multiple linear regression (MLR) was performed to account for the impact of multiple explanatory variables (e.g. climate and soil texture) on the observed trends in TN [66]. See supplement 3 for further description of the MLR analysis.

**2.3. Modeling framework and illustrative case study** We developed a parsimonious model to describe decadal-scale changes in SON following the initial conversion of grassland or forested land to agriculture, and then its trajectory under intensive agriculture.

We considered the mass of SON in the landscape M(t) (kg ha<sup>-1</sup>) to be made up of two pools, an active pool  $M_{act}$  (kg ha<sup>-1</sup>) subject to mineralization or immobilization, and a protected pool  $M_{prot}$  (kg ha<sup>-1</sup>) which, when conditions controlling physical and chemical protection mechanisms remain stationary [56], persists in a steady state, with no net mineralization or immobilization. Using this framework, the time (*t*) evolution of the SON pool is expressed as:

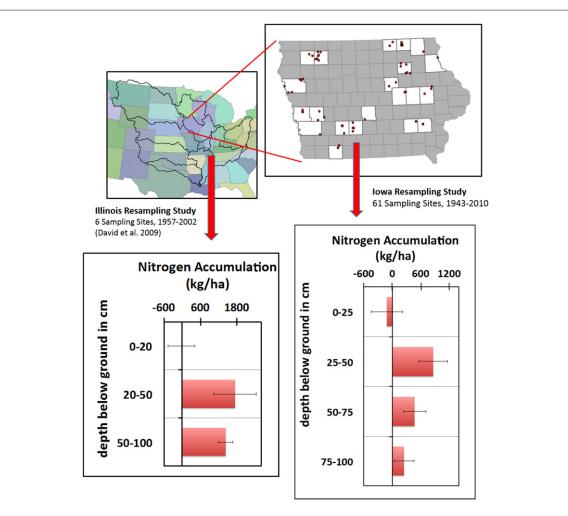
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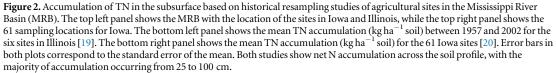
$$M(t) = M_{\text{prot}} + \left[\frac{\lambda}{k}(t-1) + \frac{a_0}{k}\right] + \left(M_{\text{act}\_0} + \frac{\lambda}{k} - \frac{a_o}{k}\right)e^{-kt}, \quad (1)$$

where  $M_{\rm act-0}$  is the initial mass of the active SON pool,  $a_0$  the initial net N input,  $\lambda$  (kg ha<sup>-1</sup>) is the rate of increase in the net N inputs, and k is the mineralization rate constant (yr<sup>-1</sup>) (details of the derivation provided in supplement 4). Net N inputs are the difference between TN inputs (fertilizer N, atmospheric N deposition, biological N fixation) and N outputs via crop uptake. As described below, different phases of the landscape's evolution are characterized by different values of  $a_0$ ,  $M_{\rm act-0}$ and  $\lambda$ .

Using the above framework, we used Rooks County, Kansas as a case study to explore dynamics in SON depletion and accumulation before and after cultivation and under different management regimes. Rooks County was selected due to its location within the MRB, its long history of cultivation (1870-present), the high proportion of county land maintained under high-input agriculture (50% cropland, wheat/ sorghum rotation), and the availability of both preand post-cultivation estimates of SON as well as detailed N mass balance data over time (1910-1978) [67]. We modeled five different phases to represent the anthropogenically induced evolution of the landscape: (1) native grassland, pre-cultivation (1840–1890); (2) post-cultivation, low-input agriculture (1890-1910); (3) post-cultivation, low-input agriculture, reduced productivity (1910-1950); (4) post-cultivation, highinput agriculture (increasing inputs) (1950-2000); and (5) post-cultivation, high-input agriculture (stabilized input levels) (2000-2010). Rationales for the parameters in the different periods are provided in supplement 4. Our objective in developing the model was to provide an illustrative tool for exploring the potential for legacy N accumulation under intensive agriculture. Rigorous calibration and validation of the model requires additional sitespecific input data that is beyond the scope of this paper.







## 3. Results

#### 3.1. Changes in Soil N Stocks

#### 3.1.1. Resampling Studies in Iowa and Illinois

For the Iowa resampling study, our results show a net increase in TN of  $1478 \pm 547$  kg ha<sup>-1</sup> over the 0–100 cm study depth. The TN content in the surface layer (0–25 cm) was found to decrease slightly, from  $2140 \pm 60$  g N Mg<sup>-1</sup> soil to  $2110 \pm 70$  g N Mg<sup>-1</sup> soil, although the difference was not significant (Wilcoxon signed rank test, p = 0.162) (figure 2, table 1). At greater depths, however, significant increases were observed. As shown in table 1, the TN content increased by 22% from 25 to 50 cm, by 20% from 50 to 75 cm and by 14% from 75 to 100 cm (p < 0.001, p = 0.013, p = 0.040). Assuming a constant rate of increase over the study period (1959–2007), the above result suggests a yearly accumulation rate of  $30.8 \pm 11.4$  kg ha<sup>-1</sup> yr<sup>-1</sup>.

The Illinois resampling results demonstrate a 16% net increase in TN, or  $3164 \pm 450$  kg ha<sup>-1</sup> averaged

over the 0–100 cm depth, between 1957 and 2002. Similar to the Iowa study, an insignificant (5%) decrease in TN was observed in the surface layer (0–20 cm) (p = 0.516) (figure 2, table 1), while TN increased from 20 to 50 cm (27%) (p = 0.140) and from 50 to 100 cm (66%) (p = 0.016). Again assuming a constant increase in TN content over this time period, the total increase corresponds to a yearly rate of 70.3  $\pm$  10.0 kg ha<sup>-1</sup> yr<sup>-1</sup>. Despite the small sample size for the Illinois study (n = 6), these findings are significant (p = 0.016) from 50 to 100 cm and are suggestive of potential increases in TN at a decadal scale in soils under high-input agriculture.

#### 3.1.2. Trend analysis of soil TN data across the MRB

Data from 2069 NCSS soil samples [64] obtained from all six sub-basins of the MRB (figure 3(a)) between 1980 and 2010 was utilized to identify possible trends in the TN content of MRB agricultural soils. Results of the MLR analysis indicate significant increases in soil TN concentrations (g N Mg<sup>-1</sup>) between 1980 and



Table 1. Historical and current magnitudes of soil TN content based on resampling sites originally sampled in the mid 1900s. Sixty-one Iowa sites were first sampled at a median date of 1959 and then resampled in 2007. A significant change in the TN content of the soils is evident for the Iowa study, particularly from 25 to 50 cm. Positive values indicate accumulation. The six Illinois sites were sampled first in 1957 and then again in 2002. Increases in the soil TN content were also observed in the Illinois study; the increases were not significant, however, due to the smaller sample size.

		Historical g N Mg <sup>-1</sup> soil	Current g N Mg <sup>-1</sup> soil	Number of samples	Accumulation/Depletion	
Location	Depth				g N Mg <sup>-1</sup> soil (kg N ha <sup>-1</sup> )	<i>p</i> -value
	0–25 cm	$2140\pm 60$	$2110\pm70$	61	$-30 \pm 90$ (-110 ± 331)	0.162
	25–50 cm	$1060\pm40$	$1290\pm70$	61	$230 \pm 80$ (864 ± 300)	< 0.001
Iowa Study (1959–2007)	50–75 cm	$610\pm40$	$740\pm50$	25	$120 \pm 60$ (474 ± 237)	0.013
	75–100 cm	$440\pm40$	$500\pm30$	12	$60 \pm 50$ (250 $\pm$ 209)	0.040
	0–100 cm	$1063\pm23$	$1160\pm29$	—	$95 \pm 36$ (1478 ± 547)	_
	0–20	2733 ± 176	2583 ± 119	6	$-150 \pm 213$ (-17 ± 443)	0.516
Illinois Study (1957–2002)	20–50 cm	$1088 \pm 127$	$1387 \pm 164$	6	$298 \pm 77$	0.140
	50–100 cm	297 ± 29	$492\pm38$	6	$(1746 \pm 689)$ $195 \pm 12$	0.016
	0–100 cm	$1022\pm54$	$1179\pm58$	_	$(1436 \pm 235)$ $157 \pm 49$ $(3164 \pm 1033)$	

2010 in the 0–25, 25–50 and 50–75 cm layers (13.2 g N Mg<sup>-1</sup>, p < 0.001; 7.3 g N Mg<sup>-1</sup>, p < 0.001; 3.9 g N Mg<sup>-1</sup>, p = 0.003) (table 2, figure 3(b)). An increase (1.4 g N Mg<sup>-1</sup> yr<sup>-1</sup>) was also seen from 75 to 100 cm, although the difference was not significant (p = 0.294). Over the entire depth range, using data only from pedons sampled to a depth of 100 cm, the accumulation rate is  $3.4 \pm 1.6$  g N Mg<sup>-1</sup> yr<sup>-1</sup> (p = 0.003). Based on reported bulk density values, these results correspond to total increases (0–100 cm) of 54.8  $\pm$  25.8 kg ha<sup>-1</sup> yr<sup>-1</sup>.

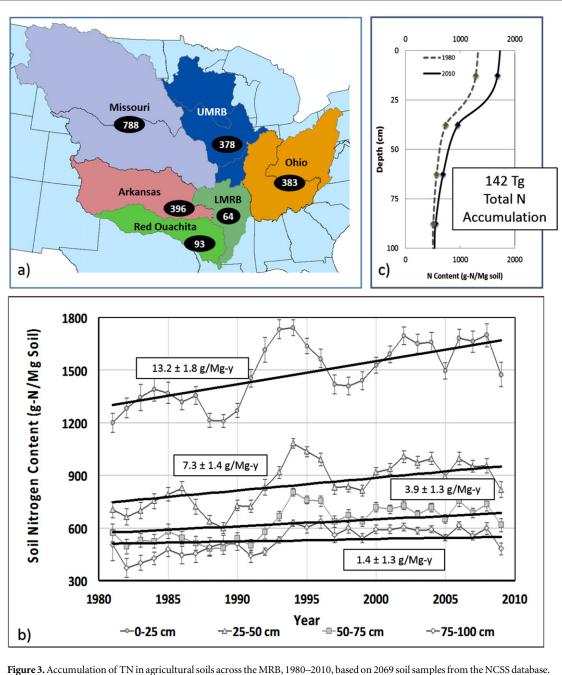
## 4. Discussion

## 4.1. Quantifying legacy: synthesis of mass balance and soil sampling results

The first question posed in the introduction was whether N is accumulating in agricultural soils, and if so, in what magnitude. The results from the Iowa resampling study, based on data obtained from 61 sites across Iowa, show a 9% increase in TN and suggest an accumulation rate of  $30.8 \pm 11.4$  kg ha<sup>-1</sup> yr<sup>-1</sup> from 0 to 100 cm. A somewhat larger percent increase (15%) was seen from 0 to 100 cm at the Illinois resampling sites by David *et al* [50], corresponding to an accumulation rate of  $70.3 \pm 18.4$  kg ha<sup>-1</sup> yr<sup>-1</sup>. Furthermore, our analysis of 2069 soil samples in the MRB demonstrates a 10% increase in soil TN from 0 to 100 cm between 1980 and 2010, corresponding to an accumulation rate of  $54.8 \pm 25.8 \text{ kg ha}^{-1} \text{ yr}^{-1}$  in cropland soil and an overall accumulation magnitude of 142 Tg N over the MRB over the 30 year period (figure 3(c)). While other studies have alluded to the possibility of N<sub>R</sub> accumulating within the soil profile based on mass balance or modeling-based estimates [30, 45, 43], our study for the first time, provides direct, large-scale evidence of such accumulation.

We next explored the relationship between these accumulation magnitudes and estimates of N fluxes in MRB to assess the significance of these magnitudes at the basin scale. We have calculated watershed-scale net N inputs for the years 1980-1996 in the MRB to be 7.1 Mt yr<sup>-1</sup> based on data reported by Goolsby *et al* [68]. During this period, the riverine flux of nitrate from the MRB to the Gulf of Mexico is estimated to have been 1.6  $\pm$  0.1 Mt yr<sup>-1</sup> [68], which constitutes approximately 23% of net N inputs. In this context, our estimate of soil N accumulation across the MRB  $(3.8 \pm 1.8 \text{ Mt yr}^{-1})$  suggests that soil N accumulation could account for another 53%  $\pm$  25% of net N inputs (figure 4). While significant uncertainty remains regarding the actual magnitude of this estimate of N accumulation, the present results strongly suggest that changes in soil N stocks constitute a significant fraction of TN inputs under intensive agriculture and thus should be explicitly considered in watershed as well as regional and global-scale N mass balance studies.





**Figure 3.** Accumulation of TN in agricultural soils across the MRB, 1980–2010, based on 2069 soil samples from the NCSS database. (a) The number of samples used for the TN analysis, by sub-basin. (b) TN accumulation rates for the four depth intervals (0–25 cm, 25–50 cm, 50–75 cm, 75–100 cm). Data points correspond to yearly means, and error bars to standard errors for the yearly means. Trend lines are obtained from multiple linear regression analysis of TN data. (c) Depth patterns of soil TN content in 1980 and 2010 reveal the greatest accumulation in the top 25 cm. For the numbers of soil samples corresponding to each time step, see supplementary table 4.

# 4.2. Understanding legacy: a conceptual model to explain N depletion and accumulation dynamics

The importance of agricultural soil as an N-sink, as described above, leads us next to question the mechanism behind such subsurface N accumulation. We hypothesize that such accumulation is a direct result of increased N fertilizer use (inorganic and manure N), increases in N fixation due to dramatic increases in soybean cultivation between 1940 and the present, and the adoption of conservation tillage practices [72, 52]. Accordingly, we can utilize the parsimonious modeling framework introduced in section 2.4 to describe not only the depletion of SON following the initial conversion of grassland or forested land to agriculture, but also the accumulation of N suggested by our analysis of soil data from the MRB (figure 5).

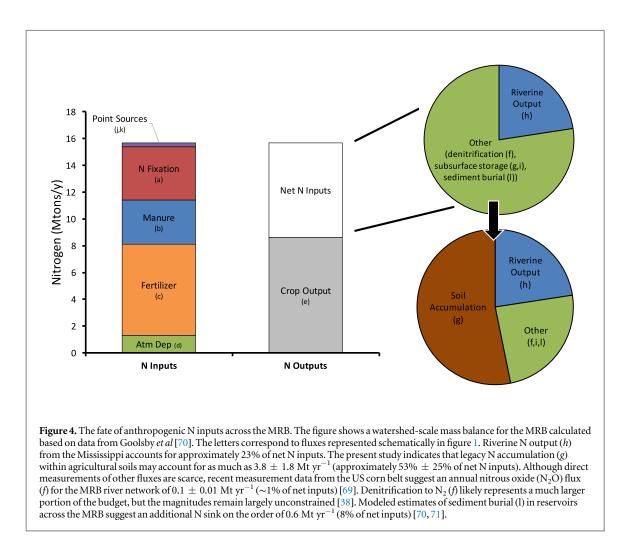
In the pre-cultivation period (Phase I: 1840–1890), SON is assumed to be at steady state, with most of the organic nitrogen in the protected pool (figure 5). The start of cultivation (Phase II: 1890–1910) leads to conversion of a portion of the protected SON to active SON, which can then be mineralized and leached from the soil profile. Net N inputs are negative in this period due to intensive cropping practices, but little input of fertilizer



**Table 2.** Accumulation rates for TN in soil samples across the Mississippi Basin (1980–2010) based on MLR analysis of the NCSS dataset. All available samples at each depth range were used to calculate the depth-specific accumulation rates. Overall accumulation rates (0–100 cm) are calculated not simply as the mean of the four smaller depth increments, but as part of a separate analysis in which only pedons with complete sampling data to 100 cm were considered. As the thickness of the soil profile can vary significantly, and because organic matter may accumulate preferentially in the upper layers of shallower soils (69), we use the more conservative estimate of accumulation rates across the MRB. See supplementary table 7 for results by sublayer for the 1320-sample subset, and a discussion of the differences in the two estimation methodologies.

Soil parameter	Depth	Number	Bulk density	Rate of change		
	(cm)	<i>(n)</i>	$(g \text{ cm}^{-3})$	$(g Mg^{-1} yr^{-1})$	$(\mathrm{kg}\mathrm{ha}^{-1}\mathrm{yr}^{-1})$	<i>p</i> -value
	0-25	1320	1.55	$10.3\pm3.0$	39.9 ± 11.6	< 0.001
Total nitrogen	25-50	1320	1.61	$1.9\pm2.0$	$7.65\pm7.3$	0.354
	50-75	1320	1.64	$0.8\pm1.6$	$3.4\pm 6.6$	0.614
	75-100	1320	1.65	$1.6 \pm 1.4$	$6.6\pm5.8$	0.250
	0-100	1320	1.61	$3.4\pm1.6$	$54.8\pm25.80$	0.003

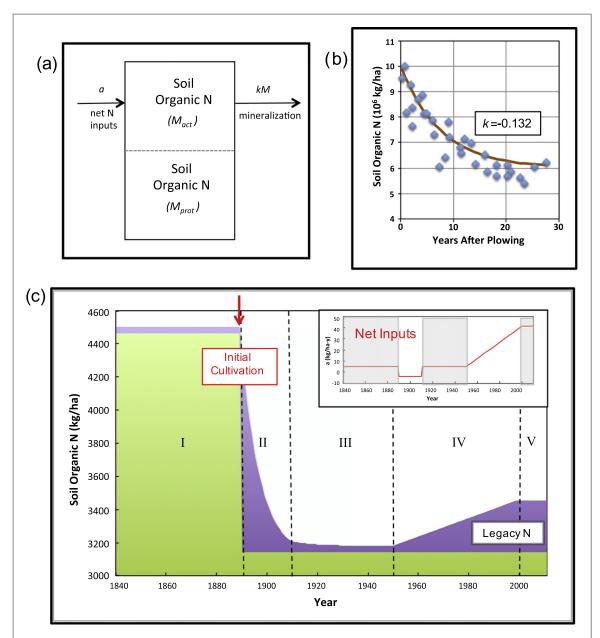
<sup>a</sup>Mass-per-area accumulation rates  $(0-100 \text{ cm}, \text{ kg ha}^{-1} \text{ yr}^{-1})$  are calculated using the mass-per-mass accumulation rates  $(0-100 \text{ cm}, \text{ g Mg}^{-1} \text{ yr}^{-1})$  and the corresponding bulk density.



[67]. With these changes, there is an exponential decrease in the total mass of SON, with the system eventually evolving to a new steady state (figure 5). After the first 20 years of cultivation (Phase III: 1910 - 1950), we assume crop productivity to be diminished which leads to an increase in the net N inputs, and a stabilization of soil N levels (figure 5). Finally in Phase IV (1950–2000), the system transitions to a high-input state and soil N levels begin to rise. Then, at the start of Phase V, with the stabilization of net N inputs, soil N levels also stabilize.

The accumulated or legacy N, conceptualized as the difference between the Phases III and V steady states, corresponds to an approximately 9% increase over SON levels in the depleted steady state. This value is





**Figure 5.** Modeling framework describing N depletion following conversion of native prairie/grassland to conventional agriculture, and N accumulation following agricultural intensification. On the top left (a) is a model schematic representing the flow of N through the active pool of soil organic N. In (b), we show the depletion of SON following initial cultivation of long-term grassland [54], from which we derive the mineralization reaction rate, *k*, used in equation 1. The figure on the bottom (c) shows the evolution of the protected and active N pools following land-use change according to the five phases described in the text. N inputs corresponding to the five phases are shown in the inset.

similar to the 10% increase observed over time in our MRB soil sampling data and the 9% increase observed in the Iowa resampling study. The modeling results suggest not only that soil N accumulation is possible in land under continuous cultivation, but that the trajectory of change can be described using the same approach as that used to describe the more well-known depletion of soil organic matter after initial cultivation.

Of course, the above simulation is based on a simplification of the trajectories of change in management practices and land use. We have assumed step changes between phases, but in reality changes occur more gradually. In its current state, the model described herein is primarily conceptual in nature, used to demonstrate the possibility of N accumulation in agricultural landscapes, and will require further modifications in terms of model parameterization as well as descriptions of inputs and outputs to more fully simulate landscapescale changes in SON.

# 4.3. Implications of legacy: time lags in landscape response

The most significant implication of such a buildup of soil N relates to time lags observed between land-use changes and alterations in stream N concentrations [73]. Based on the current results, we contend that there are two components of this time lag attributable to two different types of legacy: a hydrologic legacy and a biogeochemical

legacy. The hydrologic legacy corresponds to dissolved N in groundwater reservoirs and unsaturated zones, and its existence contributes to the hydrologic time lag-defined as the average time required for dissolved N species to move from the point of application to the point of concern. The existence of the hydrologic time lag is well accepted, with a variety of hydrogeologic controls having been found to result in travel times ranging from days to decades [9, 74, 75]. The second type of legacy, the biogeochemical N legacy, arises from retention of N within the root zone, likely in organic form, and constitutes a long-term source for mineralization and NO3<sup>-</sup> leaching. The existence of such a biogeochemical legacy for phosphorus (P) is well known due to its reactive properties, and legacy sorbed P accumulation has been reported in both soil and sediments [9, 76]. The possibility of such a biogeochemical legacy for N, however, has been mostly neglected, as N in the form of  $NO_3^-$  is non-sorbing and is easily leached from soils [9].

The magnitude of the associated biogeochemical time lag is a function of not only the mass of TN accumulation, which has been the focus of this paper, but also the rates of organic N mineralization and the loss of dissolved N through the different biogeochemical and hydrologic pathways. Further research is needed to clarify these mechanisms and pathways. However, as a first estimate, we can utilize the modeling framework developed in section 4.2 to determine the time lag associated with depletion of the 142 Tg of legacy N suggested by our analysis of MRB soil data. Assuming a complete cessation of agricultural production in the region and a return of net annual inputs (a) to the pre-cultivation levels of 5 kg ha<sup>-1</sup> yr<sup>-1</sup>, our model results indicate a biogeochemical time lag of 35 years for 99% depletion of the legacy N. The total lag time would then be a function of both the biogeochemical and the hydrologic lag time, and the latter in itself can be on the order of decades depending on the sizes of saturated and unsaturated zone reservoirs. With such long time frames for recovery, it is thus critical to understand both the accumulation and the ultimate fates of these significant stores of subsurface N for sustainable management practices in large-scale agroecosystems such as the MRB.

#### 4.4. Intersecting lines of evidence

Understanding the long-term dynamics of N in agricultural soils is complex due to the poorly constrained fluxes of denitrification, mineralization and immobilization over varying spatio-temporal scales [18, 19]. However, recent research, as described below, provides intersecting lines of evidence that point towards the accumulation of legacy N in the soil profile in much larger magnitudes than previously conceptualized. For example, using a combination of mass balance and process based modeling, the United States Environmental Protection Agency estimates cropland N accumulation in US to be equal to 17% of fertilizer N inputs [46], while accumulation in Canada has been estimated to be



equal to 19% of TN inputs [30]. Accumulation is also suggested by isotope tracer studies that show a 15% retention of <sup>15</sup>N-labeled NO<sub>3</sub><sup>-</sup> fertilizer within the soil profile nearly 30 years after application, implying that N fertilizer has a significant residence time in the SON pool [77]. The existence of legacy N is further corroborated by observations of biogeochemical stationarity for N in landscapes under intensive agriculture [78, 79]. In such landscapes, the supply of N to surface waters appears to be transport-limited rather than source-limited, suggesting that the existence of legacy N within the landscape provides an ongoing N source and therefore a positive, linear correlation between riverine N flux and discharge, with N concentrations remaining relatively invariant. This behavior is in contrast to that observed in more pristine landscapes, where N concentrations vary in time in response to source limitations [80].

Our work makes a unique contribution to this literature by providing the first *measured* estimate of large-scale N accumulation in soils across the MRB. The intersection of such varying lines of evidence, both direct and circumstantial, leading to estimates of soil N accumulation, suggests (a) that we must acknowledge the existence of a growing pool of SON in agricultural landscapes and (b) that we must more explicitly explore the impacts of such a pool on future water quality.

## 5. Conclusion

Our study has three fundamental contributions. First, our finding of significant N accumulation in agricultural soils across the MRB (3.8  $\pm$  1.8 Mt yr<sup>-1</sup>) makes a critical contribution towards clarifying the fate of the 'missing' N that is consistently referred to in reports of watershed-scale mass balance studies [21, 75-77]. Although caution must be exercised in relying upon the precise magnitude of accumulation due to large uncertainties in the data, by identifying a clear possibility of significant N accumulation within agricultural soils we make considerable progress towards the closing of N budgets, from the watershed to the global scale. Second, we have developed a simple model that describes both the accumulation and depletion dynamics of SON arising from anthropogenic perturbations on the landscape, thus confirming our hypothesis that the same underlying mechanism can be used to describe both N depletion following plowing and N accumulation as a result of high-input agriculture. The third contribution of this study is with respect to time lags between best management practices and water quality benefits. The significant mass of organic N accumulating in agricultural soils implies that stream N concentrations will persist for decades after fertilizer inputs have ceased. Indeed, the time lag would in most cases be significantly greater than that estimated based on the hydrologic legacy alone. Our study for the first time links multiple lines of evidence to show convincingly that N, like P,

has a biogeochemical legacy, a legacy that complicates our previous understanding of the fate of this nutrient in anthropogenic landscapes and that must be accounted for in intervention efforts to improve water quality.

## Acknowledgments

Work done by N B Basu and K J Van Meter was supported, in part, by funds from the National Science Foundation Coupled Natural and Human Systems program, Grant Number 1114978. Financial support for N B Basu and K J Van Meter was also provided from startup funds at the University of Iowa and University of Waterloo. Additional funds have come from an NSERC Discovery Grant. We thank Suresh Rao of Purdue University and James Jawitz of the University of Florida for their critical feedback.

#### **Author Contributions**

NBB and KJV conceived and developed the core ideas for the paper and contributed equally to this work. JV and CLB provided the Iowa soil sampling data and offered suggestions regarding the soil datasets. NBB and KJV synthesized data from the Illinois and Iowa sampling studies and from the NCSS database and also developed the modeling framework.

#### References

- Rockström J et al 2009 Planetary boundaries: exploring the safe operating space for humanity Ecol. Soc. 14 32 (www. ecologyandsociety.org/vol14/iss2/art32/)
- [2] Carpenter S R, Stanley E H and Vander Zanden M J 2011 State of the world's freshwater ecosystems: physical, chemical, and biological changes Annu. Rev. Environ. Resour. 3675–99
- [3] Howarth R et al 2011 Coupled biogeochemical cycles: eutrophication and hypoxia in temperate estuaries and coastal marine ecosystems Frontiers Ecol. Environ. 9 18–26
- [4] Meals D W, Dressing S A and Davenport T E 2010 Lag time in water quality response to best management practices: a review *J. Environ. Qual.* 39 85
- [5] Kopáček J, Hejzlar J and Posch M 2013 Factors controlling the export of nitrogen from agricultural land in a large central european catchment during 1900–2010 *Environ. Sci. Technol.* 47 6400–7
- [6] Grimvall A, Stålnacke P and Tonderski A 2000 Time scales of nutrient losses from land to sea—a European perspective *Ecol. Eng.* 14 363–71
- [7] Baily A, Rock L, Watson C J and Fenton O 2011 Spatial and temporal variations in groundwater nitrate at an intensive dairy farm in south-east Ireland: insights from stable isotope data Agric. Ecosyst. Environ. 144 308–18
- [8] Puckett L J, Tesoriero A J and Dubrovsky N M 2011 Nitrogen contamination of surficial aquifers—a growing legacy<sup>†</sup> *Environ. Sci. Technol.* 45 839–44
- [9] Hamilton S K 2012 Biogeochemical time lags may delay responses of streams to ecological restoration: time lags in stream restoration *Freshwater Biol.* 57 43–57
- [10] Worrall F, Burt T P, Howden N J K and Whelan M J 2009 Fluvial flux of nitrogen from Great Britain 1974–2005 in the context of the terrestrial nitrogen budget of Great Britain Glob. Biogeochem. Cycles 23 GB3017



- [11] Sprague L A, Hirsch R M and Aulenbach B T 2011 Nitrate in the Mississippi River and its tributaries, 1980–2008: are we making progress? *Environ. Sci. Technol.* 45 7209–16
- [12] Howden N J K, Burt T P, Worrall F, Mathias S and Whelan M J 2011 Nitrate pollution in intensively farmed regions: what are the prospects for sustaining high-quality groundwater? *Water Resour. Res.* 47 1–13
- [13] Leip A, Britz W, Weiss F and de Vries W 2011 Farm, land, and soil nitrogen budgets for agriculture in Europe calculated with CAPRI Environ. Pollut. 159 3243–53
- [14] van Breemen N et al 2002 Where did all the nitrogen go? Fate of nitrogen inputs to large watersheds in the northeastern USA Biogeochemistry 57-58 267–93
- [15] Boyer E W, Goodale C, Jaworski N and Howarth R W 2002 Anthropogenic nitrogen sources and relationships to riverine nitrogen export in the northeastern USA *Biogeochemistry* 57 137–69
- [16] Erisman J W, Domburg N, de Vries W, Kros H, de Haan B and Sanders K 2005 The Dutch N-cascade in the European perspective Sci. China C Life Sci. 48 827–42
- [17] Parris K 1998 Agricultural nutrient balances as agrienvironmental indicators: an OECD perspective *Environ*. *Pollut.* 102 (Suppl 1) 219–25
- [18] Hofstra N and Bouwman A F 2005 Denitrification in agricultural soils: summarizing published data and estimating global annual rates *Nutrition Cycle Agroecosyst.* 72 267–78
- [19] Galloway J N et al 2008 Transformation of the nitrogen cycle: recent trends, questions, and potential solutions Science 320 889–92
- [20] Barton L, McLay C D A, Schipper L A and Smith C T 1999 Annual denitrification rates in agricultural and forest soils: a review Soil Res. 37 1073–94
- [21] Mulholland P J et al 2004 Stream denitrification and total nitrate uptake rates measured using a field 15N tracer addition approach Limnol. Oceanogr. 49 809–20
- [22] Seitzinger S *et al* 2006 Denitrification across landscapes and waterscapes: a synthesis *Ecol. Appl.* **16** 2064–90
- [23] Canfield D E, Glazer A N and Falkowski P G 2010 The evolution and future of Earth's nitrogen cycle *Science* **330** 192–6
- [24] Tesoriero A J and Puckett L J 2011 O<sub>2</sub> reduction and denitrification rates in shallow aquifers *Water Resour. Res.* 47 n/a-n/a
- [25] Howarth R W, Boyer E W, Pabich W J and Galloway J N 2002 Nitrogen use in the United States from 1961–2000 and potential future trends *Ambio* 31 88–96
- [26] van Egmond K, Bresser T and Bouwman L 2002 The European nitrogen case AMBIO J. Hum. Environ. 31 72–78
- [27] Ayres R U, Schlesinger W H and Socolow R H 1994 Human impacts on the carbon and nitrogen cycles *Industrial Ecology* and Global Change (Cambridge: Cambridge University Press) pp 121–155
- [28] Galloway J N et al 2004 Nitrogen cycles: past, present, and future Biogeochemistry 70 153–226
- [29] Gruber N and Galloway J N 2008 An Earth-system perspective of the global nitrogen cycle *Nature* 451 293–296
- [30] Clair T A *et al* 2014 Interactions between reactive nitrogen and the Canadian landscape: a budget approach: Canadian nitrogen budget *Glob. Biogeochem. Cycles* 28 1343–1357
- [31] Walvoord M A et al 2003 A reservoir of nitrate beneath desert soil Science 302 1021–1024
- [32] McMahon P B et al 2006 Storage and transit time of chemicals in thick unsaturated zones under rangeland and irrigated cropland, High Plains, United States Water Resour. Res. 42 W03413
- [33] Scanlon B R, Reedy R C and Bronson K F 2008 Impacts of land use change on nitrogen cycling archived in semiarid unsaturated zone nitrate profiles, southern High Plains, Texas *Environ. Sci. Technol.* 42 7566–7572
- [34] Worrall F, Howden NJK and Burt TP 2015 Evidence for nitrogen accumulation: the total nitrogen budget of the terrestrial biosphere of a lowland agricultural catchment *Biogeochemistry* 123 411–28

- [35] Baker L A, Hope D, Xu Y, Edmonds J and Lauver L 2001 Nitrogen balance for the Central Arizona–Phoenix (CAP) ecosystem *Ecosystems* 4 582–602
- [36] Jaffe D A 1992 The nitrogen cycle Int. Geophys. 50 263–284
- [37] Galloway J N 2003 The global nitrogen cycle *Treatise on* Geochemistry ed W H Schlesinger vol 8 (Oxford: Pergamon) pp 557–583 (http://ic.ucsc.edu/~mdmccar/ocea213/readings/ 09\_Nitrogen/gallowayTOG\_global\_N\_cycle.pdf)
- [38] Fowler D et al 2013 The global nitrogen cycle in the twenty-first century Phil. Trans. R. Soc. B 368 20130164
- [39] Zaehle S 2013 Terrestrial nitrogen-carbon cycle interactions at the global scale *Phil. Trans. R. Soc.* B 368 20130125
- [40] Galloway J et al 2004 Nitrogen cycles: past, present, and future Biogeochemistry 70 153–226
- [41] Fenn M E et al 1998 Nitrogen excess in North American ecosystems: predisposing factors, ecosystem responses, and management strategies *Ecol. Appl.* 8 706
- [42] De Vries W, Reinds G J, Gundersen P and Sterba H 2006 The impact of nitrogen deposition on carbon sequestration in European forests and forest soils *Glob. Change Biol.* 12 1151–1173
- [43] Smil V 1999 Nitrogen in crop production: an account of global flows Glob. Biogeochem. Cycles 13 647–662
- [44] Yan X et al 2014 Fertilizer nitrogen recovery efficiencies in crop production systems of China with and without consideration of the residual effect of nitrogen Environ. Res. Lett. 9 095002
- [45] Leip A et al 2011 Integrating nitrogen fluxes at the European scale European Nitrogen Assessment ed M Sutton et al (Cambridge: Cambridge University Press) pp 345–76
- [46] Science Advisory Board 2011 Reactive Nitrogen in the United States: An Analysis of Inputs, Flows, Consequences, and Management Options Office of the U.S. EPA Administrator Washington, DC (http://yosemite.epa.gov/sab/sabproduct. nsf/WebBOARD/INCFullReport/\$File/Final%20INC% 20Report\_8\_19\_11(without%20signatures).pdf)
- [47] Billen G, Thieu V, Garnier J and Silvestre M 2009 Modelling the N cascade in regional watersheds: the case study of the Seine, Somme and Scheldt rivers Agric. Ecosyst. Environ. 133 234–246
- [48] Bouwman A F 2005 Global and regional surface nitrogen balances in intensive agricultural production sysems for the period 1970–2030 *Pedosphere* 15 137–155
- [49] Beniston J W, DuPont S T, Glover J D, Lal R and Dungait J A J 2014 Soil organic carbon dynamics 75 years after land-use change in perennial grassland and annual wheat agricultural systems *Biogeochemistry* 120 37–49
- [50] David M B, McIsaac G F, Darmody R G and Omonode R A 2009 Long-term changes in mollisol organic carbon and nitrogen J. Environ. Qual. 38 200
- [51] Davidson E A and Ackerman I L 1993 Changes in soil carbon inventories following cultivation of previously untilled soils *Biogeochemistry* 20 161–193
- [52] Lal R, Follett R F and Kimble J M 2003 Achieving soil carbon sequestration in the United States: a challenge to the policy makers *Soil Sci.* 168 827–845
- [53] Solomon D, Fritzsche F, Lehmann J, Tekalign M and Zech W 2002 Soil organic matter dynamics in the subhumid agroecosystems of the Ethiopian highlands Soil Sci. Soc. Am. J. 66 969–978
- [54] Whitmore A P, Bradbury N J and Johnson P A 1992 Potential contribution of ploughed grassland to nitrate leaching Agric. *Ecosyst. Environ.* 39 221–233
- [55] Janzen H H 2001 Soil science on the Canadian prairies-peering into the future from a century ago Can. J. Soil Sci. 81 489–503
- [56] Six J, Conant R T, Paul E A and Paustian K 2002 Stabilization mechanisms of soil organic matter: implications for C-saturation of soil *Plant Soil* 241 155–176
- [57] Arrouays D and Pelissier P 1994 Changes in carbon storage in temperate humic loamy soils after forest clearing and continuous corn cropping in France *Plant Soil* 160 215–223
- [58] Murty D, Kirschbaum M U, Mcmurtrie R E and Mcgilvray H 2002 Does conversion of forest to agricultural land change soil

carbon and nitrogen? A review of the literature *Glob. Change Biol.* 8 105–123

- [59] Turner R E and Rabalais N N 2004 Suspended sediment, C, N, P, and Si yields from the Mississippi River Basin Hydrobiologia 511 79–89
- [60] West T O and Post W M 2002 Soil organic carbon sequestration rates by tillage and crop rotation Soil Sci. Soc. Am. J. 66 1930
- [61] Veenstra J J 2010 Fifty years of agricultural soil change in Iowa PhD dissertation Iowa State University Library, Ames, IA, p 80
- [62] Veenstra J J and Lee Burras C 2015 Soil profile transformation after 50 years of agricultural land use Soil Sci. Soc. Am. J. 79 1154
- [63] Baker J M, Ochsner T E, Venterea R T and Griffis T J 2007 Tillage and soil carbon sequestration—what do we really know? Agric. Ecosyst. Environ. 118 1–5
- [64] NCSS 2014 National Cooperative Soil Characterization Database (http://ncsslabdatamart.sc.egov.usda.gov/ datause.aspx)
- [65] Price C V, Nakagaki N, Hitt K J and Clawges R M 2006 historical land-use and land-cover data sets of the US geological survey: polygon format files *Report No.* 240 US Geological Survey, Reston, VA
- [66] Helsel D R and Hirsch R M 1992 Statistical Methods in Water Resources vol 49 (Amsterdam: Elsevier) p 524
- [67] Burke I C, Lauenroth W K, Cunfer G, Barrett J E, Mosier A and Lowe P 2002 Nitrogen in the central grasslands region of the United States *Bioscience* 52 813–823
- [68] Goolsby D A et al 1999 Flux and Sources of Nutrients in the Mississippi–Atchafalaya River Basin National Oceanic and Atmospheric Administration National Ocean Service Coastal Ocean Program (http://repositories.tdl.org/tamug-ir/ handle/1969.3/27186?show=full)
- [69] Turner P A, Griffis T J, Lee X, Baker J M, Venterea R T and Wood J D 2015 Indirect nitrous oxide emissions from streams within the US Corn Belt scale with stream order *Proc. Natl Acad. Sci. USA* 112 9839–9843
- [70] Stallard R F 1998 Terrestrial sedimentation and the carbon cycle: coupling weathering and erosion to carbon burial *Glob. Biogeochem. Cycles* 12 231–257
- [71] Smith S V, Sleezer R O, Renwick W H and Buddemeier R W 2005 Fates of eroded soil organic carbon: Mississippi basin case study *Ecol. Appl.* 15 1929–1940
- [72] Zhang Y-K and Schilling K E 2006 Increasing streamflow and baseflow in Mississippi River since the 1940s: effect of land use change J. Hydrol. 324 412–422
- [73] Meals D W, Dressing S A and Davenport T E 2010 Lag time in water quality response to best management practices: a review *J. Environ. Qual.* 39 85–96
- [74] Puckett LJ 2004 Hydrogeologic controls on the transport and fate of nitrate in ground water beneath riparian buffer zones: results from thirteen studies across the United States Water Sci. Technol. 49 47–53
- [75] Molenat J and Gascuel-Odoux C 2002 Modelling flow and nitrate transport in groundwater for the prediction of water travel times and of consequences of land use evolution on water quality *Hydrol. Process.* 16 479–492
- [76] Jarvie H P, Sharpley A N, Spears B, Buda A R, May L and Kleinman P J A 2013 Water quality remediation faces unprecedented challenges from 'legacy phosphorus' *Environ. Sci. Technol.* 47 8997–8998
- [77] Sebilo M, Mayer B, Nicolardot B, Pinay G and Mariotti A 2013 Long-term fate of nitrate fertilizer in agricultural soils *Proc. Natl Acad. Sci. USA* 110 18185–18189
- [78] Basu N B et al 2010 Nutrient loads exported from managed catchments reveal emergent biogeochemical stationarity *Geophys. Res. Lett.* 37 L23404
- [79] Thompson S E et al 2011 Patterns, puzzles and people: implementing hydrologic synthesis Hydrol. Process. 25 3256–3266
- [80] Godsey S E, Kirchner J W and Clow D W 2009 Concentrationdischarge relationships reflect chemostatic characteristics of US catchments *Hydrol. Process.* 23 1844–1864

