




# Terrestrial Nitrogen Inputs Affect the Export of Unprocessed Atmospheric Nitrate to Surface Waters: Insights from Triple Oxygen Isotopes of Nitrate

Joel T. Bostic,<sup>1\*</sup>  David M. Nelson,<sup>1</sup> Robert D. Sabo,<sup>2</sup> and Keith N. Eshleman<sup>1</sup>

<sup>1</sup>University of Maryland Center for Environmental Science, Appalachian Lab, Frostburg, Maryland 21532, USA; <sup>2</sup>U.S. Environmental Protection Agency, Office of Research and Development, Center for Public Health and Environmental Assessment, U.S. EPA, Washington, District of Columbia, USA

## ABSTRACT

Atmospheric nitrate ( $\text{NO}_3^-_{\text{Atm}}$ ) deposition has increased dramatically during the past  $\sim 150$  years and contributes to ecosystem eutrophication.  $\text{NO}_3^-_{\text{Atm}}$  deposition is widespread, but the role of different landscapes in modulating watershed-scale processing and export of  $\text{NO}_3^-_{\text{Atm}}$  remains unclear. We measured triple oxygen isotopes (a tracer of  $\text{NO}_3^-_{\text{Atm}}$ ) of  $\text{NO}_3^-$  for 832 stream samples collected during baseflow and stormflow from 14 watersheds of varied land use throughout two years in the Chesapeake Bay watershed, and we used these data to assess the influence of land use on  $\text{NO}_3^-_{\text{Atm}}$  dynamics. Watersheds with more agricultural ( $> 35\%$ ) and developed ( $> 70\%$ ) land exported more  $\text{NO}_3^-_{\text{Atm}}$  than predominantly forested ( $> 75\%$ ) watersheds. Agricultural lands likely

facilitate greater  $\text{NO}_3^-_{\text{Atm}}$  export because of elevated rates of terrestrial N addition relative to rates of  $\text{NO}_3^-$  consumption. In contrast, developed lands likely have limited biotic processing of  $\text{NO}_3^-_{\text{Atm}}$  because of greater hydrologic connectivity of overland flow pathways to channels. Our results, along with data from prior studies, can be interpreted by extending the conceptual model of kinetic N saturation to  $\text{NO}_3^-_{\text{Atm}}$  streamwater export across varied land use watersheds. In this framework, elevated rates of terrestrial N inputs overwhelm  $\text{NO}_3^-$  sinks, allowing proportionally more  $\text{NO}_3^-_{\text{Atm}}$  to leak from watersheds. Changes in watershed-scale N inputs that increase stream  $\text{NO}_3^-$  concentrations additively affect  $\text{NO}_3^-_{\text{Atm}}$ , with agricultural watersheds, and their associated large terrestrial N inputs, increasing  $\text{NO}_3^-_{\text{Atm}}$  export.

Received 21 January 2021; accepted 14 October 2021; published online 16 November 2021

**Supplementary Information:** The online version contains supplementary material available at <https://doi.org/10.1007/s10021-021-00722-9>.

**Author's Contribution:** DN, RS, and KE designed the study. JB, DN, and KE performed field research. JB measured isotopes, analyzed data, and wrote the first draft. All authors contributed to manuscript revisions  
\*Corresponding author; e-mail: jbstic@umces.edu

**Key words:** water quality; hydrology; forest; atmospheric nitrate; land use; oxygen isotopes.

**HIGHLIGHTS**

- Terrestrial N inputs and hydrology control patterns of atmospheric nitrate export
- Forested lands exported less atmospheric nitrate than more agricultural and developed lands
- The concept of kinetic N saturation can be applied to interpret atmospheric nitrate patterns across heterogeneous watersheds

**INTRODUCTION**

Deposition of atmospheric nitrate ( $\text{NO}_3^-_{\text{Atm}}$ ) has increased dramatically worldwide during about the past 150 years (Galloway and others 2004). Despite declines in recent decades in some regions (Tørseth and others 2012; Li and others 2016), deposition remains elevated and contributes to the eutrophication and acidification of terrestrial and aquatic ecosystems globally (Galloway and others 2003; Kemp and others 2005; Clark and Tilman 2008). The specific impacts of  $\text{NO}_3^-_{\text{Atm}}$  partially depend on whether it is processed (incorporated into the terrestrial nitrogen cycle) or exported unprocessed to surface waters. Terrestrial processing of  $\text{NO}_3^-_{\text{Atm}}$  can provide longer-term storage (that is, assimilation) or removal (that is, denitrification), whereas stream export can have more immediate impacts, such as exacerbating nutrient pollution of downstream waters (Howarth and others 2000). Understanding the factors controlling the relative amounts of  $\text{NO}_3^-_{\text{Atm}}$  that are processed versus exported to streams is needed to evaluate potential impacts on affected ecosystems.

Landscape properties represent a potentially dominant factor regulating the proportion of (unprocessed)  $\text{NO}_3^-_{\text{Atm}}$  deposition that is exported in streamwater.  $\text{NO}_3^-_{\text{Atm}}$  occurs across broad spatial extents (Driscoll and others 2001) and thus impacts diverse landscapes. Different land uses (for example, forest, agriculture, developed) are commonly associated with generalizable patterns of streamwater  $\text{NO}_3^-$  export (Jordan and others 1997; Groffman and others 2004; Kaushal and others 2008) that can partially be attributed to variable amounts and sources of nitrogen (N) inputs (Lovett and Goodale 2011), differing rates of key N cycling processes and/or alterations of hydrologic flowpaths (Sudduth and others 2013)—all of which could influence processing of  $\text{NO}_3^-_{\text{Atm}}$ . For example, the conceptual kinetic N saturation model suggests that ecosystem N losses, including streamwater export, occur when rates of inputs (for

example, from deposition, fertilizer) exceed sinks at various temporal scales (for example, vegetative uptake, immobilization; Lovett and Goodale 2011). This model was developed and has been applied to understand N deposition effects on streamwater  $\text{NO}_3^-$  export from predominantly forested watershed from predominantly forested watershed (*Eshleman and others 2013*), but it may be applicable to  $\text{NO}_3^-_{\text{Atm}}$  processing and export from mixed land use watersheds with elevated N input rates (*Eshleman and Sabo 2016*). However, prior research into watershed cycling of  $\text{NO}_3^-_{\text{Atm}}$  has focused primarily on predominantly forested or alpine watersheds (for example, *Tsunogai and others 2010*; *Fang and others 2015*; *Osaka and others 2016*; *Bourgeois and others 2018a*; *Bourgeois and others 2018b*; *Sebestyen and others 2019*) where deposition represents the primary input of N and streamwater  $\text{NO}_3^-$  export is generally low. Thus, the relative importance of potential controls on  $\text{NO}_3^-_{\text{Atm}}$  dynamics associated with variable land uses and elevated, non-deposition N inputs is unclear (*Burns and others 2009*; *Tsunogai and others 2016*). Assessing the potential effects of land use on the fate of  $\text{NO}_3^-_{\text{Atm}}$  requires accurate accounting of streamwater  $\text{NO}_3^-_{\text{Atm}}$  export across watersheds with varied N sources, magnitudes of  $\text{NO}_3^-$  export, and hydrologic conditions, but this remains a major challenge.

Many prior studies have used  $\delta^{18}\text{O}$  values of  $\text{NO}_3^-$  in streamwater to distinguish atmospheric and terrestrial fractions (*Kendall and others 1995*; *Burns and Kendall 2002*; *Burns and others 2009*; *Kaushal and others 2011*). This approach takes advantage of  $\text{NO}_3^-_{\text{Atm}}$  having elevated  $\delta^{18}\text{O}$  values ( $\sim 60\text{--}90\text{‰}$ ) relative to  $\text{NO}_3^-$  of terrestrial origin ( $\delta^{18}\text{O} \cong -15\text{--}+15\text{‰}$ ; *Kendall and others 2007*; *Michalski and others 2012*). However, interpretation of  $\delta^{18}\text{O}$  as a tracer of  $\text{NO}_3^-_{\text{Atm}}$  is complicated by many factors. For example,  $\text{NO}_3^-$  consumption (plant or microbial uptake, denitrification) can elevate the  $\delta^{18}\text{O}$  values of residual  $\text{NO}_3^-$  resulting in potentially overlapping ranges of  $\delta^{18}\text{O}$  values of terrestrial and atmospheric  $\text{NO}_3^-$  (*Böttcher and others 1990*; *Kendall and others 2007*). Additionally, dilution of the  $\delta^{18}\text{O}$   $\text{NO}_3^-_{\text{Atm}}$  signal is likely to be greatest in watersheds with high loads of streamwater  $\text{NO}_3^-$  export relative to atmospheric inputs (that is, agricultural watersheds), which, when combined with the large range of terrestrial  $\delta^{18}\text{O}$  values, can obscure the  $\text{NO}_3^-_{\text{Atm}}$  signal. These complications are mitigated by an increasingly used tracer of  $\text{NO}_3^-_{\text{Atm}}$ , triple oxygen isotopes of  $\text{NO}_3^-$ :

$$\Delta^{17}\text{O} = \left( \frac{1 + \delta^{17}\text{O}}{(1 + \delta^{18}\text{O})^\beta} - 1 \right) \times 1000 \quad (1)$$

where  $\delta = (R_{\text{sample}}/R_{\text{reference}}) - 1$ ,  $R$  = ratio of heavy to light isotope, and  $\beta \cong 0.52$  (Michalski and others 2003). The  $\Delta^{17}\text{O}$  value of terrestrial  $\text{NO}_3^-$  is  $\cong 0\text{‰}$  (Kendall and others 2007), and relative to  $\delta^{18}\text{O}$ , the  $\Delta^{17}\text{O}$  values of  $\text{NO}_3^-_{\text{Atm}}$  ( $\sim 20\text{--}30\text{‰}$  in the mid-latitudes; Tsunogai and others 2010; Rose and others 2015; Tsunogai and others 2016; Bourgeois and others 2018b; Nelson and others 2018) in residual  $\text{NO}_3^-$  change minimally during biological processing (Young and others 2002; Michalski and others 2004; Kendall and others 2007). Furthermore, dilution of  $\Delta^{17}\text{O}$  values of  $\text{NO}_3^-_{\text{Atm}}$  can occur, but the small range of  $\Delta^{17}\text{O}$  values for terrestrial  $\text{NO}_3^-$  ( $\sim 0\text{‰}$ ) allows for more accurate quantification of  $\text{NO}_3^-_{\text{Atm}}$ , even in watersheds with high rates of streamwater  $\text{NO}_3^-$  export relative to deposition.

Measurements of nitrate  $\Delta^{17}\text{O}$  only allow for quantification of unprocessed  $\text{NO}_3^-_{\text{Atm}}$  because they “trace”  $\text{NO}_3^-$  produced in the atmosphere. Terrestrial N cycling (immobilization, assimilation, mineralization, and nitrification) only retains the N atom of  $\text{NO}_3^-$ . Thus, there is a distinction between processing and retention (that is, proportion of  $\text{NO}_3^-$  inputs that are exported in streamwater on an annual basis) of deposited  $\text{NO}_3^-_{\text{Atm}}$ . For example, a  $\text{NO}_3^-_{\text{Atm}}$  molecule could theoretically be deposited, undergo terrestrial N cycling (that is, become immobilized, mineralized, then nitrified), and be exported as  $\text{NO}_3^-$  in streamwater a short time later (that is, days or weeks post-deposition), and would be considered processed (that is, the molecule would have a  $\Delta^{17}\text{O} \cong 0$ ) but not retained. Thus, the fraction of  $\text{NO}_3^-_{\text{Atm}}$  deposition that is processed represents the upper limit of watershed retention (that is,  $\text{NO}_3^-_{\text{Atm}}$  processing  $\geq$  retention).

Estimates of mean annual streamwater nitrate- $\Delta^{17}\text{O}$  and  $\text{NO}_3^-_{\text{Atm}}$  loads, which are not equivalent, provide a useful framework for assessing the relative rates of watershed-scale  $\text{NO}_3^-$  consumption (denitrification, immobilization, or assimilation) and addition (nitrification, fertilization; Figure 1). The relative rates of these processes affect both  $\text{NO}_3^-_{\text{Atm}}$  and total  $\text{NO}_3^-$  ( $\text{NO}_3^-_{\text{Total}}$ ) cycling and streamwater export across diverse land uses. The difference in the mass of  $\text{NO}_3^-_{\text{Atm}}$  deposited and exported in streams is caused by  $\text{NO}_3^-$  consumption processes along hydrologic flowpaths, which do not alter the  $\Delta^{17}\text{O}$  value of the residual  $\text{NO}_3^-$  (Böttcher and others 1990; Michalski and others 2004; Kendall and others 2007). Reduction in the

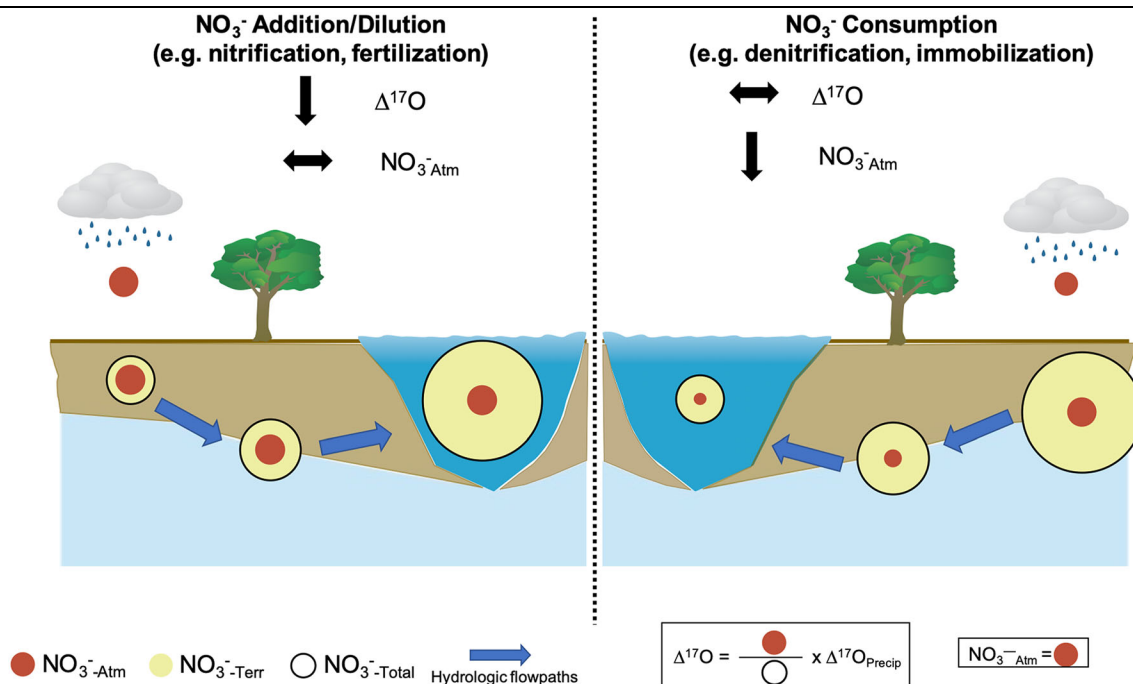
$\Delta^{17}\text{O}$  value of deposited  $\text{NO}_3^-$  is caused by the addition of new microbially or synthetically sourced nitrate or dilution by existing terrestrial  $\text{NO}_3^-$  (for example, synthetic fertilizer, nitrification) with  $\Delta^{17}\text{O} \cong 0\text{‰}$  (Kendall and others 2007) encountered along hydrologic flowpaths. This framework for assessing relative rates of watershed-scale  $\text{NO}_3^-$  consumption and addition is primarily possible because of the unique triple oxygen isotopic tracer of  $\text{NO}_3^-_{\text{Atm}}$ , but also due to the widespread deposition of  $\text{NO}_3^-_{\text{Atm}}$  across watersheds (Driscoll and others 2001) and the relative mobility of  $\text{NO}_3^-$  (Chapin and others 2011). By quantifying the processing and export of  $\text{NO}_3^-_{\text{Atm}}$  across watersheds with varied land use, we use this framework to assess watershed-scale N cycling dynamics.

Here we ask the following questions: How do terrestrial N inputs and land use influence the cycling and surface water export of  $\text{NO}_3^-_{\text{Atm}}$  at the watershed scale? More specifically, what is the relationship between terrestrial N inputs, the proportion of major land use categories (forest, agriculture, and developed) in watersheds and  $\text{NO}_3^-_{\text{Atm}}$  concentrations, yields, and processing efficiency (that is, fraction of  $\text{NO}_3^-_{\text{Atm}}$  deposition that is processed prior to surface water export)? To address these questions, we measured  $\Delta^{17}\text{O}$  values of  $\text{NO}_3^-$  on 832 stream samples collected during both baseflow and stormflow conditions from 14 watersheds of varied land use in the Chesapeake Bay watershed in eastern North America during a two-year period. We hypothesize that predominantly forested watersheds with lower terrestrial N inputs will have lower  $\text{NO}_3^-_{\text{Atm}}$  concentrations and yields, and higher processing efficiency, than watersheds that are predominantly agricultural and/or developed with higher rates of terrestrial N inputs. If our results show that increased  $\text{NO}_3^-_{\text{Atm}}$  concentrations are positively related to terrestrial N inputs, it would provide support for extending the kinetic N saturation conceptual model to  $\text{NO}_3^-_{\text{Atm}}$  streamwater export across varied land use watersheds.

## MATERIALS AND METHODS

### Study Sites and Field Methods

To assess land use effects on  $\text{NO}_3^-_{\text{Atm}}$  dynamics across a range of hydroclimatological conditions, streamwater samples were collected from 14 watersheds varying in size (160–127,900 ha), dominant land use (96% forest to 70% developed), and mean annual temperature and precipitation



**Figure 1.** Framework for interpreting variation in  $\Delta^{17}\text{O}$ -  $\text{NO}_3^-$  and  $\text{NO}_3^-_{\text{Atm}}$  concentrations. These indicators provide different, yet complementary information about watershed-scale N cycling processes.  $\Delta^{17}\text{O}$  of nitrate is equal to the fraction of  $\text{NO}_3^-_{\text{Atm}}$  (red circles) relative to  $\text{NO}_3^-_{\text{Total}}$  (black circles, sum of  $\text{NO}_3^-_{\text{Terr}}$  and  $\text{NO}_3^-_{\text{Atm}}$ ) multiplied by the  $\Delta^{17}\text{O}$  of deposition. Left panel) Addition of  $\text{NO}_3^-_{\text{Terr}}$  or dilution of  $\text{NO}_3^-_{\text{Atm}}$  by  $\text{NO}_3^-_{\text{Terr}}$  decreases the  $\Delta^{17}\text{O}$  of a “reservoir” of  $\text{NO}_3^-$  by increasing  $\text{NO}_3^-_{\text{Total}}$  along hydrologic flowpaths prior to export in streamwater, which is illustrated by the increasing area of the black outlined circle relative to  $\text{NO}_3^-_{\text{Atm}}$  (red square). Addition of  $\text{NO}_3^-_{\text{Terr}}$  does not change the concentration of  $\text{NO}_3^-_{\text{Atm}}$  (area of the red circle). Right panel)  $\text{NO}_3^-$  consumption (for example, denitrification, assimilation, immobilization) processes reduce the concentration of  $\text{NO}_3^-_{\text{Atm}}$  from deposition, along hydrologic flowpaths, before eventual export in streamwater, but does not change the  $\Delta^{17}\text{O}$  value of residual nitrate (indicated by the constant area of the black outlined circle relative to  $\text{NO}_3^-_{\text{Atm}}$ , the red circle).  $\text{NO}_3^-$  consumption is a mass-dependent fractionation process and therefore does not alter the  $\Delta^{17}\text{O}$  (result of mass-independent fractionation processes) of the  $\text{NO}_3^-$  reservoir.

(Table 1). Streamwater grab samples (120–1000 mL) were collected both regularly (2 samples per month) and irregularly during storm events (~ 6–10 samples per year;  $n = 57$ –65 total samples per watershed) from the outlets of 14 gaged watersheds within the Chesapeake Bay basin from October 2015–September 2017 (that is, water years 2016 and 2017; Figures S1 and S2). Samples were collected in pre-cleaned polypropylene bottles and kept on ice for 2–4 h before being refrigerated until they were then processed in the laboratory within 24–48 h. Sampling across a range of hydrological conditions (Figure S2) was done to more fully capture streamwater  $\text{NO}_3^-_{\text{Atm}}$  variation and to improve accuracy of estimated  $\text{NO}_3^-_{\text{Atm}}$  loads. Estimated loads of many other streamwater constituents (total nitrogen, total  $\text{NO}_3^-$ , total phosphorus, and so on) are more accurate when samples are collected over a range of hydrological conditions (Sprague 2001). Daily stream discharge data were obtained from U.S. Geological Survey

records for ten of the study watersheds. Stream discharge in the other four watersheds (Table 1) was measured by the authors using comparable stream gaging practices. These practices involve development of a rating curve (log-log regression of discharge vs. stage) for each station and computation of mean daily discharge based on hourly stage data from a digital water level recorder. Weekly precipitation samples during water year (WY) 2017 were obtained from three National Atmospheric Deposition Program (NADP) sites (PA00, MD99, and MD08) bounding the study watersheds (Figure S1). Precipitation  $\text{NO}_3^-$  concentration and isotope data are summarized in the Supporting Information (SI). Land use percentages were calculated from the 2016 National Land Cover Database; agricultural land represents the sum of both cultivated crop and pasture/hay land classes (Homer and others 2020). Mean watershed slope (m/m) was obtained using the U.S. Geological Survey StreamStats program (USGS 2016).

**Table 1.** Watershed Attributes

Watershed	Area (ha)	USGS Gage	Land use (%)		Terrestrial N Inputs (kg N ha <sup>-1</sup> y <sup>-1</sup> )	MAT (°C)	MAP (cm)	NO <sub>3</sub> <sup>-</sup> monitoring record (yrs)	Slope (m/m)
			Forest	Agriculture					
Antietam Upstream (ANT)	24,200	01619000	41.3	41.8	15.9	12.2	107	13	0.10
Antietam Downstream (ANT2)	72,800	01619500	29.2	51.9	17.7	12.6	101	33	0.08
Big Run (BIGR)	160	n/a	89.4	0	10.1	9.7	123	27	0.22
Black Lick (BLAC)	560	n/a	85.7	12.6	0.8	9.9	112	21	0.22
Catoctin Creek (CAC)	17,300	01637500	51.7	37.7	10	12.6	105	33	0.12
Conococheague Creek (CON)	127,900	01614500	38.4	47.0	13.3	12.3	103.2	33	0.10
Deep Run (DPRN)	1,620	n/a	96.2	1.0	2.7	11.9	101	13	0.23
Georges Creek (GEO)	18,800	01599000	76.9	8.8	8.3	10.4	112.0	33	0.16
Gunpowder Falls (GUN)	41,400	01582500	45.4	41.3	10.9	13.1	111.3	33	0.10
Gwynns Falls (GWN)	8,400	01589300	23.4	5.0	70.1	13.7	112.1	15	0.06
Monocacy River (MON)	44,800	01639000	25.6	57.1	13.5	12.5	105.7	33	0.05
Terrapin Run (TERR)	570	n/a	87.5	2.1	10.5	11.9	108.9	11	0.17
Town Creek (TOW)	38,300	01609000	83.9	11.8	3.9	11.6	104.2	11	0.20
Wills Creek (WIL)	64,000	01601500	82.3	11.7	5.5	10.8	108.4	33	0.21

Land use data were compiled from the 2016 National Land Cover Database (Homer and others 2020). Land use percentages do not sum to 100% as all land use classes are not listed (for example, open water, wetlands), n/a not applicable; MAT Mean Annual Temperature, MAP Mean Annual Precipitation. Note that MAT and MAP are for WY 2016–2017.

## Laboratory Methods

Stream samples were filtered (0.45  $\mu\text{m}$ ) and frozen within 48 h of collection. Stream  $\text{NO}_3^-$  and nitrite ( $\text{NO}_2^-$ ) concentrations were measured using flow-injection colorimetric analysis (Lachat Quickchem 8000 FIA +). Weekly precipitation  $\text{NO}_3^-$  concentration data were provided by the NADP Central Analytical Laboratory (NADP 2021).

Triple oxygen isotopes ( $^{16}\text{O}$ ,  $^{17}\text{O}$ , and  $^{18}\text{O}$ ) of stream and precipitation  $\text{NO}_3^-$  were measured using a Thermo Delta V+ isotope ratio mass spectrometer (Bremen, Germany) via the denitrifier method (Sigman and others 2001; Casciotti and others 2002) with thermal decomposition (at 800°C) of  $\text{N}_2\text{O}$  to  $\text{N}_2$  and  $\text{O}_2$  at the Central Appalachians Stable Isotope Facility (Kaiser and others 2007).  $\text{NO}_2^-$  is denitrified using this method as well, but  $\text{NO}_2^-$  concentrations in stream and precipitation samples were low relative to  $\text{NO}_3^-$  ( $\text{NO}_2^-/(\text{NO}_2^- + \text{NO}_3^-)$  mean = 0.01, range = 0.00–0.11). Measured oxygen isotope ratios were calibrated to international reference standards USGS 34 ( $\delta^{17}\text{O} = -14.8\text{‰}$ ,  $\delta^{18}\text{O} = -27.9\text{‰}$ ) and USGS 35 ( $\delta^{17}\text{O} = 51.5\text{‰}$ ,  $\delta^{18}\text{O} = 57.5\text{‰}$ ; Böhlke and others 2003) measured throughout sample analysis in equal concentrations to samples (ranging from 100–200 nmol depending on sample  $\text{NO}_3^-$  concentration). Analytical precision of  $\Delta^{17}\text{O}$  values of  $\text{NO}_3^-$  was 0.5‰ (1 $\sigma$ ) as determined by repeated measurements ( $n \cong 200$ ) of international reference standard USGS 32 (mean measured  $\Delta^{17}\text{O} \cong -0.2\text{‰}$ ) and laboratory reference standard “Chile  $\text{NO}_3^-$ ” (Duda Energy 1sn 1 lb. Sodium Nitrate Fertilizer 99+ % Pure Chile Saltpeter from Amazon.com; mean measured  $\Delta^{17}\text{O} \cong 19.7\text{‰}$ ) made during runs associated with these streamwater samples over 3+ years. Additionally, streamwater sample replicates were analyzed ( $n = 60$ ) and had a pooled standard deviation of 0.5‰. Accuracy of  $\Delta^{17}\text{O}$  was tracked using repeated measurements of IAEA-N3 ( $n = 19$ ,  $\mu = -0.1\text{‰}$ ,  $1\sigma = 0.5\text{‰}$ ) and closely agreed with published values of  $-0.2\text{‰}$  (Michalski and others 2002; Böhlke and others 2003).

## Quantification of Unprocessed Atmospheric $\text{NO}_3^-$ in Streams and Uncertainty Estimation

Mean streamwater nitrate-  $\Delta^{17}\text{O}$  ( $\overline{\Delta^{17}\text{O}_{\text{Stream}}}$ ) for each watershed was calculated over the entire study period to provide an aggregate estimate of watershed response. Analytical uncertainty of individually measured  $\Delta^{17}\text{O}$  samples was incorpo-

rated into  $\overline{\Delta^{17}\text{O}_{\text{Stream}}}$  by sampling with replacement (that is, bootstrapping) from a probability density function that incorporated both normal and uniform distributions (additional details are provided in the SI).  $\overline{\Delta^{17}\text{O}_{\text{Stream}}}$  was used to calculate the mean percentage of unprocessed  $\text{NO}_3^-_{\text{Atm}}$  in stream samples using Eq. 2:

$$\% \text{NO}_3^-_{\text{Atm}} = \frac{(\overline{\Delta^{17}\text{O}_{\text{Stream}}} - \Delta^{17}\text{O}_{\text{Terr}})}{(\overline{\Delta^{17}\text{O}_{\text{Precip}}} - \Delta^{17}\text{O}_{\text{Terr}})} \times 100 \quad (2)$$

where  $\overline{\Delta^{17}\text{O}_{\text{Precip}}} = \text{mean } \Delta^{17}\text{O}$  of wet  $\text{NO}_3^-$  deposition during WY2017, and  $\Delta^{17}\text{O}_{\text{Terr}} = \Delta^{17}\text{O}$  of terrestrially sourced  $\text{NO}_3^-$ . We assumed that the annual mean isotopic composition of  $\text{NO}_3^-$  in precipitation did not significantly differ between WY2016 and WY2017. Data from a three-year record in the mid-latitudes (inter-annual range = 1.5‰) suggest this assumption is reasonable (Tsunogai and others 2016). Uncertainty in %  $\text{NO}_3^-_{\text{Atm}}$  from all three parameters in Eq. 2 and was estimated using bootstrapping methods. Values for each parameter in Eq. 2 were randomly sampled from distributions that accounted for analytical uncertainty ( $\overline{\Delta^{17}\text{O}_{\text{Stream}}}$ ), natural intra-annual variation ( $\overline{\Delta^{17}\text{O}_{\text{Precip}}}$ ), and potential variability in  $\beta$  values ( $\Delta^{17}\text{O}_{\text{Terr}}$ ) during mass-dependent fractionation processes (for example, nitrification, denitrification) that could generate non-zero  $\Delta^{17}\text{O}$  values not attributable to  $\text{NO}_3^-_{\text{Atm}}$  (Young and others 2002; Kaiser and others 2007). This approach resulted in a distribution of %  $\text{NO}_3^-_{\text{Atm}}$  that was then used to propagate uncertainty (that is, sample from this distribution with replacement) through additional calculations. The  $\Delta^{17}\text{O}$  value of terrestrial  $\text{NO}_3^-$  is commonly assumed to be exactly 0‰ (Sabo and others 2016; Tsunogai and others 2016; Nakagawa and others 2018; but see Rose and others 2015), but previous studies reported negative values 3–4 times beyond the standard deviation of instrument uncertainty (Rose and others 2015; Yu and Elliott 2018) suggesting that  $\beta$  values are not necessarily stable during complex N cycling reactions and/or  $\Delta^{17}\text{O}$  of terrestrial  $\text{NO}_3^-$  is not always equal to 0‰. Our approach attempts to account for some of these yet unquantified effects that may cause  $\Delta^{17}\text{O}$  of terrestrial  $\text{NO}_3^-$  to deviate from 0‰ by allowing  $\beta$  to vary from 0.51–0.53. Additional details of uncertainty estimation and propagation are provided in the SI.

We acknowledge that natural, or “organic”,  $\text{NO}_3^-$  fertilizers (for example, mined from desert deposits and classified as organic) can have

$\Delta^{17}\text{O} > 0\text{‰}$  (Michalski and others 2015). No data on application of this  $\text{NO}_3^-$  fertilizer use exist for our watersheds, although it represents a minor percentage ( $< 0.01\%$ ) of N fertilizer applied nationally since  $\sim 1970$  (Böhlke and others 2009). Mean annual flow-weighted concentrations and yields of  $\text{NO}_3^-_{\text{Atm}}$  were quantified using Eq. 3:

$$\text{NO}_3^-_{\text{Atm}} = \% \text{NO}_3^-_{\text{Atm}} \times \text{NO}_3^-_{\text{Total}} \quad (3)$$

where  $\text{NO}_3^-_{\text{Total}}$  = either annual flow-weighted concentrations ( $\text{mg N L}^{-1}$ ) or yields ( $\text{kg N ha}^{-1}$ ) of  $\text{NO}_3^-_{\text{Total}}$ .

Daily  $\text{NO}_3^-_{\text{Total}}$  loads ( $L_{\text{NO}_3}$ ,  $\text{kg d}^{-1}$ ) were computed using Weighted Regression on Time, Discharge, and Season-Kalman Filter (WRTDS-K; (Zhang and Hirsch 2019). Models were calibrated using the entire period of record for  $\text{NO}_3^-_{\text{Total}}$  (11–33 years). The use of the entire record ensured that model coefficients were representative of a greater range of hydroclimatological conditions than was realized in two water years. Estimated daily loads of  $\text{NO}_3^-_{\text{Total}}$  were summed for WY2016–2017, normalized by watershed area and divided by the period of record (2 years) to compute annual average yields ( $\text{kg N ha}^{-1} \text{ y}^{-1}$ ). Flow-weighted annual mean concentrations were calculated by dividing annualized loads by annual discharge for WY2016–2017.  $\text{NO}_3^-_{\text{Total}}$  uncertainty (annual concentrations and yields) was estimated using block bootstrapping methods and are detailed in the SI.  $\text{NO}_3^-_{\text{Atm}}$  uncertainty (concentrations and yields) incorporated both  $\text{NO}_3^-_{\text{Total}}$  and  $\%$   $\text{NO}_3^-_{\text{Atm}}$  uncertainty through bootstrapping, or sampling with replacement from distributions of both  $\text{NO}_3^-_{\text{Total}}$  and  $\%$   $\text{NO}_3^-_{\text{Atm}}$ .

## $\text{NO}_3^-$ Deposition

Grids of  $\text{NO}_3^-$  in wet deposition were generated using  $\text{NO}_3^-$  concentration data and point precipitation data from NADP and gridded precipitation data from the PRISM Climate Group for WY2016–2017 (PRISM Climate Group 2004). Interpolated surfaces of monthly precipitation-weighted  $\text{NO}_3^-$  were generated using inverse distance weighting and then multiplied by PRISM precipitation data to produce water year  $\text{NO}_3^-$  deposition grids. Watershed-scale mean  $\text{NO}_3^-$  wet deposition was computed as the areal average of deposition within the watershed boundary.

## Processing Efficiency of Atmospheric $\text{NO}_3^-$

Processing efficiency (PE), defined as the percentage of deposited  $\text{NO}_3^-$  that is incorporated into the terrestrial N cycle (that is,  $\Delta^{17}\text{O}$  is reset to  $\cong 0\text{‰}$ ) prior to stream export, which builds on a similar metric as Barnes and others (2008), was calculated as:

$$\text{PE} = \left( 1 - \frac{\text{NO}_3^-_{\text{Atm}} (\text{kg N ha}^{-1} \text{ yr}^{-1})}{\text{NO}_3^-_{\text{Precip}} (\text{kg N ha}^{-1} \text{ yr}^{-1})} \right) \times 100 \quad (4)$$

$\text{NO}_3^-$  in wet deposition was used for this calculation. It has previously been assumed that dry  $\text{NO}_3^-$  deposition is similar in magnitude to wet  $\text{NO}_3^-$  deposition (Lovett and Lindberg 1993; Boyer and others 2002; Grigal 2012; Eshleman and Sabo 2016), which implies that PE values are uniformly underestimated across all watersheds. Scenarios in which this assumption may be violated are presented in the SI. PE uncertainty was estimated from bootstrapped distributions of  $\text{NO}_3^-_{\text{Atm}}$  yield.

## Terrestrial N Inputs

Rates of terrestrial N inputs (in  $\text{kg N ha}^{-1} \text{ y}^{-1}$ ) to watersheds were obtained from the Chesapeake Bay Program Chesapeake Assessment and Scenario Tool (Chesapeake Bay Program 2020). Estimates of terrestrial N inputs are made at the county scale and assigned to specific land uses (for example, developed, agriculture). These inputs were aggregated to the watershed scale by calculating the percentage of each land use in different counties for all study watersheds.

## Statistical Analyses

Weighted least squares regression (dependent variables weighted by  $1/\sigma$ , where  $\sigma$  = standard deviation) of mean annual  $\Delta^{17}\text{O}$  values,  $\text{NO}_3^-_{\text{Atm}}$  concentrations, and PE to land use percentages and terrestrial N input rates was used to estimate slopes because of the non-uniform error in y-values (Bevington and Robinson 2003). The coefficient of determination ( $r^2$ ) was used to assess regression fit, and  $r^2$  values are reported as the median of all bootstrapped replicates. Significance of linear regression slopes was determined via bootstrapping at  $\alpha = 0.05$ ; reported  $p$ -values are the proportion of 10,000 slope estimates that are either greater than or less than zero (depending on the direction of the relationship). Welch's ANOVA was used, due to heterogeneity of variances, to compare means (that is,  $\Delta^{17}\text{O}$ ,  $\text{NO}_3^-_{\text{Atm}}$ ) between individual watersheds,

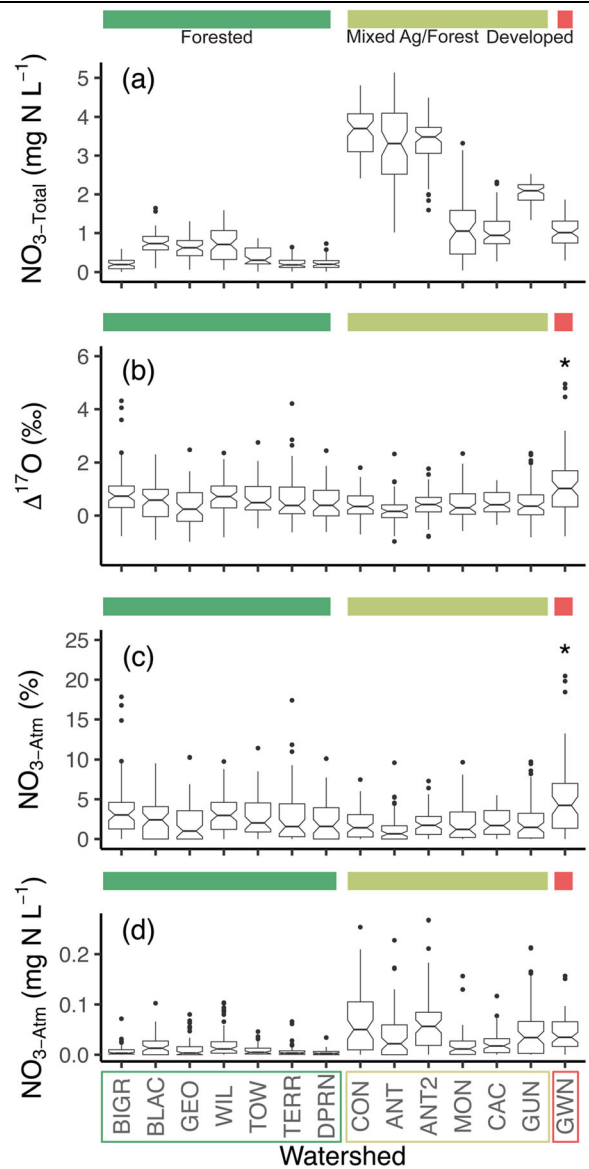
watersheds grouped by dominant land use and rates of terrestrial N inputs, and across flow conditions (McDonald 2009). All statistical analyses were performed in R (R Development Core Team 2019).

**RESULTS**

Mean annual precipitation  $\text{NO}_3^-$  concentrations ranged from 0.140–0.160  $\text{mg N L}^{-1}$  and wet  $\text{NO}_3^-$  deposition ranged from 1.47–1.77  $\text{kg N ha}^{-1} \text{ y}^{-1}$  during WY 2016–2017 (Table S1). Annual areal mean precipitation depth ranged from 101–123 cm (Table S1).  $\Delta^{17}\text{O}$  values of precipitation  $\text{NO}_3^-$  ranged from 16.4–29.3‰ with elevated values in the winter and lower values in the summer (Figure S3) and a depth-weighted annual mean ( $\pm$  standard error) of  $25.2\text{‰} \pm 0.3\text{‰}$ .

In individual streamwater samples,  $\text{NO}_3^-_{\text{Total}}$  concentrations ranged from 0.001–5.139  $\text{mg N L}^{-1}$  and yields of  $\text{NO}_3^-_{\text{Total}}$  ranged from 0.60–11.64  $\text{kg N ha}^{-1} \text{ y}^{-1}$  (Figure 2; Table S2). Values of  $\Delta^{17}\text{O}$  in individual stream samples ranged from –1.0–5.0‰, corresponding to %  $\text{NO}_3^-_{\text{Atm}}$  from 0–21% (Figure 2), and  $\delta^{18}\text{O}$  ranged from –11.5–14.8‰ (Figure S4).  $\text{NO}_3^-_{\text{Atm}}$  concentrations in individual samples, calculated using  $\text{NO}_3^-_{\text{Total}}$  and  $\Delta^{17}\text{O}$ , ranged from 0–0.267  $\text{mg N L}^{-1}$ . Averaged over the entire study period (WY2016–2017),  $\Delta^{17}\text{O}_{\text{Stream}}$  ranged from 0.2–1.3‰ across watersheds, representing 1–5%  $\text{NO}_3^-_{\text{Atm}}$ , and mean flow-weighted  $\text{NO}_3^-_{\text{Atm}}$  concentrations ranged from 0.007–0.062  $\text{mg N L}^{-1}$  (Table S2). Yields of  $\text{NO}_3^-_{\text{Atm}}$  ranged from 0.03–0.30  $\text{kg N ha}^{-1} \text{ yr}^{-1}$ , comprising 1.4–5.8% of total  $\text{NO}_3^-$  ( $\text{NO}_3^-_{\text{Total}}$ ) loads in study watersheds during WY2016 and 2017 (Table S2).

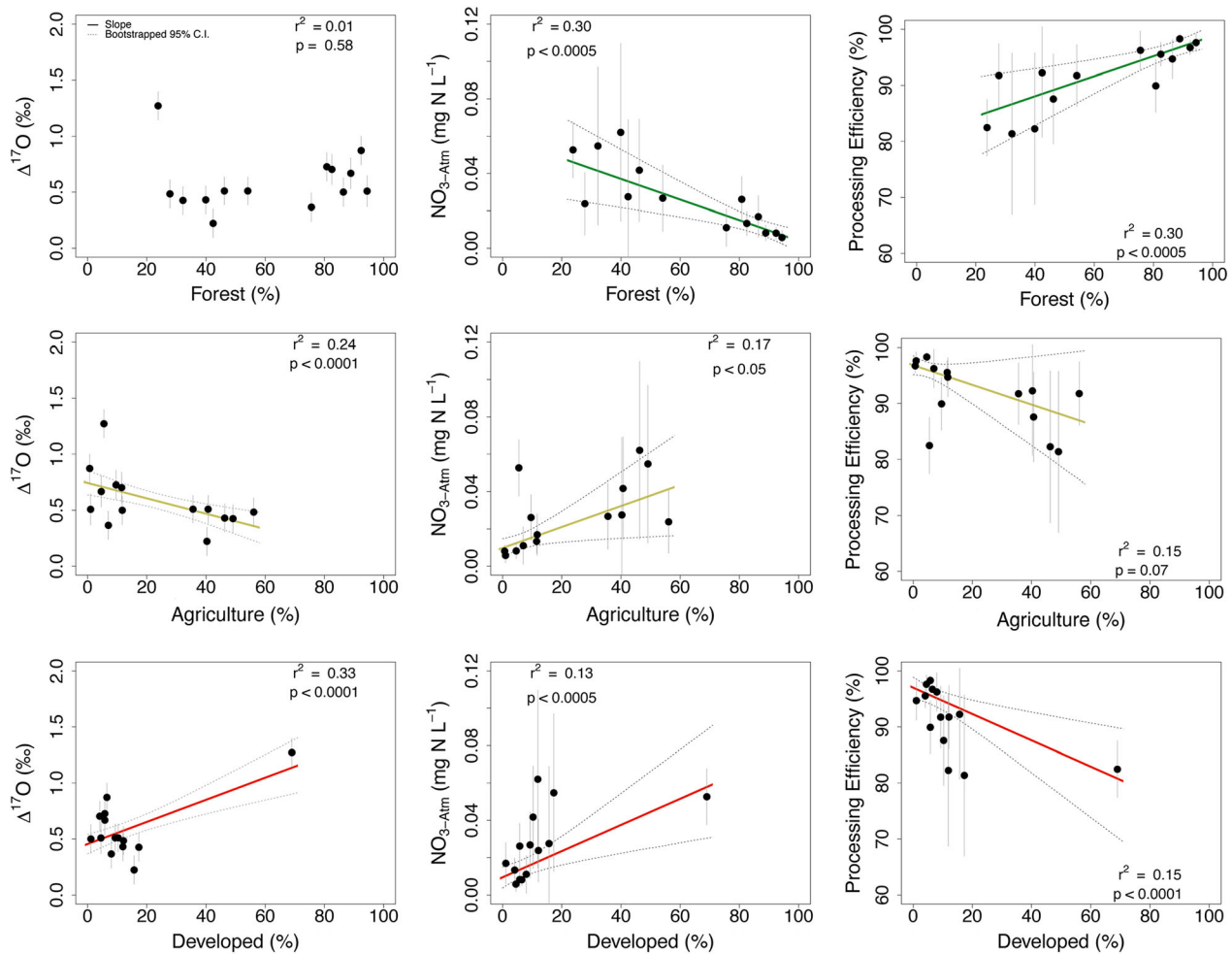
Watershed land use percentage was a statistically significant linear predictor of nearly all  $\text{NO}_3^-_{\text{Atm}}$  metrics. A higher percentage of agricultural land use was found to predict lower values of  $\Delta^{17}\text{O}_{\text{Stream}}$  and PE ( $r^2 = 0.24$ ,  $p < 0.0001$  for  $\Delta^{17}\text{O}_{\text{Stream}}$ ;  $r^2 = 0.15$ ,  $p = 0.0687$  for PE) and higher mean annual flow-weighted  $\text{NO}_3^-_{\text{Atm}}$  concentrations ( $r^2 = 0.17$ ,  $p < 0.05$ ; Figure 3). These relationships were generally opposite for forested land use: after removing an outlier (GWN, our most developed watershed), higher percentages of forested land use predicted higher values of  $\Delta^{17}\text{O}_{\text{Stream}}$  ( $r^2 = 0.22$ ,  $p < 0.005$ ) and lower mean annual flow-weighted  $\text{NO}_3^-_{\text{Atm}}$  concentrations ( $r^2 = 0.30$ ,  $p < 0.0005$ ) and PE ( $r^2 = 0.30$ ,  $p < 0.0005$ ).



**Figure 2.** Box and whisker plots of **a**  $\text{NO}_3^-$  concentrations, **b**  $\Delta^{17}\text{O}$ -  $\text{NO}_3^-$ , **c** unprocessed atmospheric  $\text{NO}_3^-$  percentages, and **d** unprocessed atmospheric  $\text{NO}_3^-$  concentrations. Watersheds are colored and grouped by general land use category: predominantly forested (> 80% forested), mixed agriculture/forest (> 25% both forested and agriculture), and predominantly developed (> 70% developed). Lines in boxes indicate median, upper and lower hinges represent 25 and 75<sup>th</sup> quartile, whiskers extend 1.5 × inter-quartile range, points beyond this range are plotted individually, and notches in boxes represent ~ 95% confidence interval of median. Asterisk denotes single watershed with significantly different mean from all others.

Rates of terrestrial N inputs ranged from 1.3–64.9  $\text{kg N ha}^{-1} \text{ y}^{-1}$  averaged over calendar years





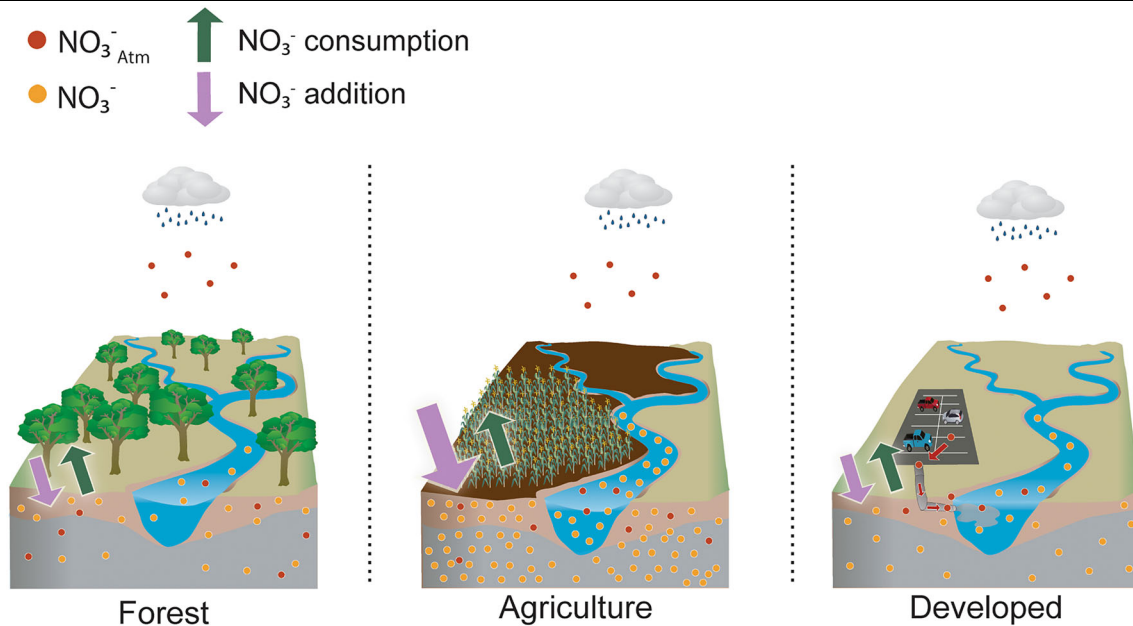
**Figure 3.** Scatter plots of land use percentages and mean annual  $\Delta^{17}\text{O}$ ,  $\text{NO}_3^-_{\text{Atm}}$ , and processing efficiency. Solid line is weighted least squares regression line, dashed lines are bootstrapped 95% confidence intervals,  $r^2$  is median of all bootstrapped replicates. Regressions with % developed land use should be interpreted with caution as only one watershed contained > 20% of this land use type.

2016–2017 (Table 1). Unsurprisingly, terrestrial N input rates were strongly positively correlated with agricultural ( $r = 0.96$ ) and negatively correlated with forested land use ( $r = -0.78$ ) and thus exhibit similar statistical relationships with  $\text{NO}_3^-_{\text{Atm}}$  related metrics. Elevated terrestrial N input rates predicted lower  $\overline{\Delta^{17}\text{O}_{\text{Stream}}}$  and PE ( $r^2 = 0.25$ , bootstrapped  $p$ -value < 0.0001 for  $\overline{\Delta^{17}\text{O}_{\text{Stream}}}$ ,  $r^2 = 0.20$ ,  $p = 0.012$  for PE) and higher  $\text{NO}_3^-_{\text{Atm}}$  ( $r^2 = 0.23$ ,  $p = 0.010$ ; Figure 5).

## DISCUSSION

Using our results from watersheds with varied land use and our framework for interpretation (Figure 1), we present a conceptual model of proposed controls on  $\text{NO}_3^-_{\text{Atm}}$  dynamics (Figure 4). In this

model, elevated rates of terrestrial N inputs relative to  $\text{NO}_3^-$  consumption allow proportionally more  $\text{NO}_3^-_{\text{Atm}}$  to bypass processing and be exported in surface water. This imbalance between terrestrial N inputs and consumption additionally results in elevated  $\text{NO}_3^-_{\text{Total}}$  concentrations, lowering the  $\Delta^{17}\text{O}$  and %  $\text{NO}_3^-_{\text{Atm}}$  of streamwater  $\text{NO}_3^-$ . Generally, watersheds with appreciable agricultural land use (> 35%) are associated with elevated terrestrial N inputs (for example, from fertilizer), resulting in higher  $\text{NO}_3^-_{\text{Atm}}$  concentrations with lower PE. Conversely, predominantly forested watersheds have lower terrestrial N inputs, with an inferred approximate balance between inputs and consumption, resulting in much of the deposited  $\text{NO}_3^-$  being processed (high PE) and thus  $\text{NO}_3^-_{\text{Atm}}$  export being low. Impervious surfaces in developed portions of watersheds are an additional control on



**Figure 4.** Conceptual model presenting the effects of land use on  $\text{NO}_3^-_{\text{Atm}}$  (red circles) dynamics.  $\Delta^{17}\text{O}$  (ratio of red to yellow circles) and  $\text{NO}_3^-_{\text{Atm}}$  concentrations and fluxes (represented by number of red circles in streamwater) are altered between deposition and export in streamwater by rates  $\text{NO}_3^-$  addition (purple arrow) and consumption processes (green arrow), respectively. Imbalances between relative rates of  $\text{NO}_3^-$  addition and consumption (agricultural land uses), hydrologic bypassing of biotic retention mechanisms (developed land uses), and tight cycling of  $\text{NO}_3^-$  and similar rates of addition and consumption processes (forested land uses) are proposed as the land use effects on observed patterns of  $\text{NO}_3^-_{\text{Atm}}$  dynamics (stream export and watershed processing efficiency). Symbols courtesy of the Integration and Application Network, University of Maryland Center for Environmental Science ([ian.umces.edu/symbols/](http://ian.umces.edu/symbols/)).

streamwater  $\text{NO}_3^-_{\text{Atm}}$  patterns. These surfaces likely promote the rapid routing of deposited  $\text{NO}_3^-_{\text{Atm}}$  to channels, especially during storm events, and decrease the potential for biologic processing.

Elevated rates of terrestrial N inputs to watersheds associated with land use patterns decrease  $\overline{\Delta^{17}\text{O}_{\text{Stream}}}$ , increase mean annual  $\text{NO}_3^-_{\text{Atm}}$  concentrations, and decrease PE (Figure 5).

One could argue that the relationships described between land use, terrestrial N input rates, and various metrics of  $\text{NO}_3^-_{\text{Atm}}$  dynamics result from multiplying relatively similar  $\Delta^{17}\text{O}$  values by variable  $\text{NO}_3^-_{\text{Total}}$  concentrations. However, these metrics ( $\overline{\Delta^{17}\text{O}_{\text{Stream}}}$ ,  $\text{NO}_3^-_{\text{Atm}}$  concentrations, and PE) account for multiple sources of uncertainty, including analytical uncertainty of  $\Delta^{17}\text{O}$ ,  $\beta$  values (Eq. 1),  $\Delta^{17}\text{O}$  end-members (both terrestrial and atmospheric), and annual  $\text{NO}_3^-_{\text{Total}}$  concentrations and yields. As such, our methods represent an improvement in uncertainty quantification relative to previous research using  $\Delta^{17}\text{O}$  values to quantify  $\text{NO}_3^-$  sources in streamwater (Tsunogai and others 2014; Rose and others 2015; Sabo and others 2016; Tsunogai and others 2016; Nakagawa and others

2018). The multiple sources of uncertainty in  $\overline{\Delta^{17}\text{O}_{\text{Stream}}}$ ,  $\text{NO}_3^-_{\text{Atm}}$  concentrations, and PE were propagated and incorporated into linear regressions with land use and terrestrial N inputs. Accounting for this uncertainty reduced  $r^2$  values (reported as the median  $r^2$  of 10,000 bootstraps) and increased  $p$ -values (reported as the proportion of 10,000 bootstrap slopes either greater or less than zero, depending on the specific regression) relative to simple linear regression, yet nearly all relationships between land use and terrestrial N inputs with  $\overline{\Delta^{17}\text{O}_{\text{Stream}}}$ ,  $\text{NO}_3^-_{\text{Atm}}$  concentrations, and PE remain significant (Figures 3 and 5). Thus, we argue that these results are a manifestation of biologic controls on  $\text{NO}_3^-_{\text{Atm}}$  dynamics and can be interpreted as an extension of the kinetic N saturation conceptual model.

Our results suggest that biologic sinks of  $\text{NO}_3^-$  (that is,  $\text{NO}_3^-$  consumption) can be overwhelmed by high rates of N inputs, allowing proportionally more  $\text{NO}_3^-_{\text{Atm}}$  to bypass processing and be exported in surface waters. This idea extends kinetic N saturation (Lovett and Goodale 2011) to streamwater  $\text{NO}_3^-_{\text{Atm}}$  export and from forested to non-forested watersheds, while building on previ-

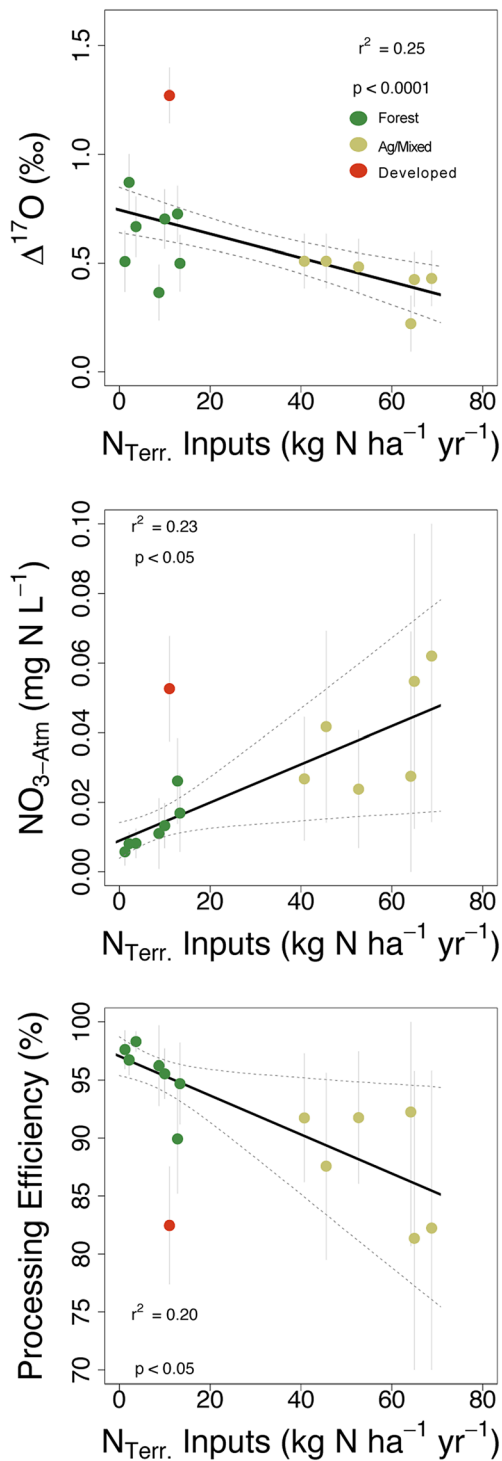


Figure 5. Scatter plots of terrestrial N input rates and mean annual  $\Delta^{17}\text{O}$ ,  $\text{NO}_3^- \text{-Atm}$ , and processing efficiency. Solid line is weighted least squares regression line, dashed lines are bootstrapped 95% confidence intervals, and  $r^2$  is median of all bootstrapped replicates. Points are colored by dominant land use.

ous work applying traditional N saturation “stages” (Ågren and Bosatta 1988; Aber and others 1989) to understanding streamwater  $\text{NO}_3^- \text{-Atm}$  export (Rose and others 2015; Nakagawa and others 2018). We note, however, that our extension of the kinetic N saturation conceptual model focuses on *processing* of  $\text{NO}_3^- \text{-Atm}$  while past work primarily focused on *retention* of atmospherically deposited N. We are also focusing on inputs (deposited  $\text{NO}_3^-$ ) that move through watersheds to a specific sink (streamwater export) without biological transformation. Nonetheless, kinetic N saturation focuses on rates of both inputs and sinks and proposes that N saturation effects, including increased leaching of  $\text{NO}_3^-$  to surface water, are only realized when rates of inputs exceed those of sinks. Our framework for interpretation (Figure 1) can be used to infer the role of both inputs (terrestrial N inputs) and sinks ( $\text{NO}_3^-$  consumption) on  $\text{NO}_3^- \text{-Atm}$  export at the watershed scale.

Large terrestrial N inputs associated with agricultural land use allow more  $\text{NO}_3^- \text{-Atm}$  to be exported and reduce PE (Figures 3 and 5). An imbalance between N inputs (for example, fertilizer) and demand for  $\text{NO}_3^-$  (for example, crop uptake, denitrification) creates an accumulation of  $\text{NO}_3^-$  in soils and groundwater.  $\text{NO}_3^-$  accumulation in agricultural systems is aligned with research suggesting that N supplies in excess of demand shift soils to  $\text{NO}_3^-$  dominated “economies”, as there is less competition for N and nitrifying microorganisms thrive (Schimel and Bennett 2004; Booth and others 2005). The large N inputs combined with the relative mobility of  $\text{NO}_3^-$  compared to reduced or organic N forms (Chapin and others 2011) ultimately results in increased export of  $\text{NO}_3^-$  in surface waters. The imbalance between N inputs and  $\text{NO}_3^-$  demand does not imply that  $\text{NO}_3^-$  consumption is reduced; rather, rates may even be greater in watersheds with larger terrestrial N inputs—for example, denitrification rates are generally higher in fertilized agricultural soils compared to non-fertilized soils (Barton and others 1999; Hofstra and Bouwman 2005). For a given  $\text{NO}_3^-$  consumption rate, however, a larger reservoir of  $\text{NO}_3^-$  (for example, more  $\text{NO}_3^-$  in groundwater and soil) available for consumption along hydrologic flowpaths likely allows proportionally more  $\text{NO}_3^- \text{-Atm}$  to escape consumption and be exported in surface waters.

In predominantly forested watersheds with lower terrestrial N input rates, it is more likely that inputs and consumption are closer to unity on an annual basis resulting in lower  $\text{NO}_3^- \text{-Atm}$  concentrations and yields, and higher PE. Reduced rates of

N inputs likely contributed to  $\text{NO}_3^-$  consumption processes imparting a seasonal signal on  $\text{NO}_3^-_{\text{Atm}}$  concentrations, similar to previous research on streams with low  $\text{NO}_3^-_{\text{Total}}$  concentrations (Figure S5; Barnes and Raymond 2010; Tsunogai and others 2014; Rose and others 2015; Sabo and others 2016; Hattori and others 2019). Mean  $\text{NO}_3^-_{\text{Atm}}$  concentrations were about  $1.7 \times$  higher in the dormant than growing season in watersheds with lower terrestrial N inputs rates ( $< 40 \text{ kg N ha}^{-1} \text{ y}^{-1}$ ,  $> 75\%$  forested land use; ANOVA,  $p < 0.001$ ), whereas concentrations were not significantly different between seasons in watersheds with higher terrestrial N input rates ( $> 40 \text{ kg N ha}^{-1} \text{ y}^{-1}$ ,  $< 52\%$  forested land use; Figure S5). This result likely reflects higher rates of biologically-mediated  $\text{NO}_3^-$  consumption processes during the growing (warmer) season. For example, forest canopies can process up to 90% of  $\text{NO}_3^-_{\text{Atm}}$  during the growing season, severely reducing the potential for  $\text{NO}_3^-_{\text{Atm}}$  streamwater export (Inoue and others 2021). It is likely that rates of  $\text{NO}_3^-$  consumption also increase during the growing season in watersheds with elevated terrestrial N input rates, but that the amount of  $\text{NO}_3^-$  consumed is small relative to the total  $\text{NO}_3^-$  present, making it difficult to decipher the signal. One factor that may confound the interpretation of intra-annual  $\text{NO}_3^-_{\text{Atm}}$  concentrations is the seasonal pattern of  $\Delta^{17}\text{O}$  values of  $\text{NO}_3^-$  in precipitation. Seasonal patterns in  $\Delta^{17}\text{O}$  values of  $\text{NO}_3^-$  in precipitation were similar across all monitoring sites in our study (Figure S3), however, suggesting that this effect would have been consistent across all watersheds.

Our results, combined with others using  $\Delta^{17}\text{O}$  values of  $\text{NO}_3^-$  to quantify  $\text{NO}_3^-_{\text{Atm}}$ , supports the application and extension of kinetic N saturation to  $\text{NO}_3^-_{\text{Atm}}$  dynamics: annual flow-weighted  $\text{NO}_3^-_{\text{Atm}}$  concentrations are positively related to  $\text{NO}_3^-_{\text{Total}}$  concentrations across 56 watersheds from five publications (our watersheds:  $r^2 = 0.66$ ,  $p < 0.001$ ; others  $r^2 = 0.25$ ,  $p < 0.001$ ; Figure S6). The magnitude of these relationships is slightly different between our study and others possibly due to differences in sampling frequency, which ranged from quarterly (4 per year; Tsunogai and others 2016) to weekly (Rose and others 2015), range of hydrologic conditions sampled (for example, baseflow only, baseflow and stormflow sampling), load estimation methods (Rose and others 2015; Tsunogai and others 2016; Nakagawa and others 2018) and/or watershed size (Sabo and others 2016), making it challenging to uncover potential causes of these differences in magnitude. Watersheds in these studies additionally represent

diverse land uses (forested, urban, agricultural, mixed) and span  $\text{NO}_3^-$  deposition gradients (wet =  $1.5\text{--}2.4 \text{ kg N ha}^{-1} \text{ y}^{-1}$ , wet + dry =  $3.3\text{--}6.4 \text{ kg N ha}^{-1} \text{ y}^{-1}$ ). Despite these methodological and physical differences, the direction of the relationships between  $\text{NO}_3^-_{\text{Atm}}$  and  $\text{NO}_3^-_{\text{Total}}$  is the same. Unfortunately, we do not have estimates of terrestrial N inputs for those watersheds included in the ancillary publications, but streamwater  $\text{NO}_3^-_{\text{Total}}$  concentrations are a reasonable proxy of watershed-scale N inputs.  $\text{NO}_3^-_{\text{Total}}$  concentrations integrate watershed-scale rates of both N inputs and sinks, and elevated  $\text{NO}_3^-_{\text{Total}}$  concentrations suggest that inputs exceed sinks, allowing proportionally more  $\text{NO}_3^-_{\text{Atm}}$  export in streamwater.

Large terrestrial N input rates result in the dilution of  $\Delta^{17}\text{O}_{\text{Stream}}$ . This dilution effect is clearly evident in our results:  $\Delta^{17}\text{O}_{\text{Stream}}$  is negatively related with terrestrial N inputs ( $r^2 = 0.25$ ,  $p < 0.001$ , Figure 5) and agricultural land use ( $r^2 = 0.24$ ,  $p < 0.0001$ , Figure 3), even after removing an outlier with high leverage (after GWN removal:  $r^2 = 0.22$ ,  $p < 0.005$ ). This interpretation follows the implicit assumption that N inputs and storage are in the form of  $\text{NO}_3^-$ . We do not have data to differentiate N forms (for example, ammonium, organic N) of inputs at our study sites. Thus, we assume that the ratio of  $\text{NO}_3^-$  to total N of terrestrial N inputs and storage is similar across all watersheds. Reduction or dilution of  $\Delta^{17}\text{O}$  between deposition and streamwater export assumes mixing of both  $\text{NO}_3^-_{\text{Atm}}$  ( $\Delta^{17}\text{O} \cong 25\text{‰}$ ) and  $\text{NO}_3^-_{\text{Terr}}$  ( $\Delta^{17}\text{O} \cong 0\text{‰}$ ) along hydrologic flowpaths. The negative linear relationship between terrestrial N input rates and  $\Delta^{17}\text{O}_{\text{Stream}}$  indicates mixing is likely occurring in all watersheds, with one exception: GWN, our most developed watershed.

Impervious surfaces in developed portions of watersheds can exert hydrologic controls on  $\Delta^{17}\text{O}$  values,  $\text{NO}_3^-_{\text{Atm}}$  concentrations, and PE. Overland runoff from impervious surfaces, if hydrologically connected to channels, provides a mechanism by which precipitation and dissolved substances within (for example,  $\text{NO}_3^-_{\text{Atm}}$ ) can be directly routed to channels and streams (Brabec and others 2002; Tsunogai and others 2016). Direct routing of water to streams effectively short-circuits terrestrial processing that either removes  $\text{NO}_3^-_{\text{Atm}}$  (for example, denitrification) or dilutes  $\Delta^{17}\text{O}$  (for example, nitrification). This impervious area effect likely contributed to both the high  $\Delta^{17}\text{O}_{\text{Stream}}$ ,  $\text{NO}_3^-_{\text{Atm}}$  concentrations and yields, and reduced PE in GWN (Table S2). Impervious surface effects

were most apparent during storm events: GWN was the only watershed in which both  $\Delta^{17}\text{O}_{\text{Stream}}$  and  $\text{NO}_3^-_{\text{Atm}}$  were significantly higher during storm events relative to baseflow (Figure S7). Our results, while derived from a single watershed, provide additional evidence supporting studies that measured elevated  $\text{NO}_3^-_{\text{Atm}}$  using either  $\delta^{18}\text{O}$  (Burns and others 2009; Hall and others 2016; Yang and Toor 2016) or  $\Delta^{17}\text{O}$  (Riha and others 2014; Tsunogai and others 2016) in developed watersheds.

Measurements of  $\Delta^{17}\text{O}$ -  $\text{NO}_3^-$  highlight the challenges of using  $\delta^{18}\text{O}$  alone for source apportionment in mixed land use watersheds. Terrestrial N inputs associated with agricultural activities include fertilizer, some of which may be synthetic  $\text{NO}_3^-$  fertilizer. This is plausibly supported by  $\delta^{18}\text{O}$  of streamwater  $\text{NO}_3^-$ ; mean annual  $\delta^{18}\text{O}$  was positively correlated with agricultural land use in our watersheds ( $p < 0.0001$ ,  $r^2 = 0.19$ ; Figure S8). Synthetic  $\text{NO}_3^-$  fertilizer is formed from tropospheric  $\text{O}_2$  and inherits a  $\delta^{18}\text{O}$  signature of  $\sim 24\%$  (Michalski and others 2015). Alternatively, the relationship between mean annual  $\delta^{18}\text{O}$  and agricultural land use could be interpreted as the result of increased denitrification in agricultural areas, which can increase the  $\delta^{18}\text{O}$  of residual  $\text{NO}_3^-$  (Böttcher and others 1990; Kendall and others 2007). These competing interpretations demonstrate one of the difficulties in using  $\delta^{18}\text{O}$  alone to quantify streamwater  $\text{NO}_3^-_{\text{Atm}}$  in mixed land use watersheds; it is impossible to assign a specific  $\delta^{18}\text{O}$   $\text{NO}_3^-_{\text{Terr}}$  end-member to watersheds with multiple sources of  $\text{NO}_3^-_{\text{Terr}}$ . The use of  $\Delta^{17}\text{O}$  as a tracer is also limited in watersheds with large inputs of terrestrial N that result in elevated  $\text{NO}_3^-_{\text{Total}}$  streamwater export relative to  $\text{NO}_3^-_{\text{Atm}}$  deposition. For example, in a hypothetical watershed with  $10 \text{ kg N ha}^{-1} \text{ y}^{-1}$   $\text{NO}_3^-_{\text{Total}}$  streamwater export,  $1 \text{ kg N ha}^{-1} \text{ y}^{-1}$  of  $\text{NO}_3^-_{\text{Atm}}$  deposition and a PE = 80%,  $\Delta^{17}\text{O}_{\text{Stream}}$  would only equal 0.5‰. As the ratio of  $\text{NO}_3^-_{\text{Atm}}$  deposition to  $\text{NO}_3^-_{\text{Total}}$  streamwater export decreases,  $\Delta^{17}\text{O}_{\text{Stream}}$  also decreases for a constant PE, making it increasingly difficult to detect  $\text{NO}_3^-_{\text{Atm}}$  in streamwater regardless of the isotopic tracer (Figure S9).

In conclusion, land use influenced all metrics of  $\text{NO}_3^-_{\text{Atm}}$  dynamics ( $\Delta^{17}\text{O}_{\text{Stream}}$ ,  $\text{NO}_3^-_{\text{Atm}}$  concentrations and yields, PE). Insights into watershed-scale, land-use specific processes affecting  $\text{NO}_3^-_{\text{Atm}}$  were possible through measurements of  $\Delta^{17}\text{O}$ , a conservative tracer of  $\text{NO}_3^-_{\text{Atm}}$ , on streamwater samples collected under a range of hydrologic conditions across numerous watersheds. Agricul-

tural land use with elevated rates of terrestrial N inputs was associated with increased streamwater export of  $\text{NO}_3^-_{\text{Atm}}$  relative to predominantly forested watersheds. Large terrestrial N inputs in agricultural lands overwhelmed N sinks and allowed proportionally more  $\text{NO}_3^-_{\text{Atm}}$  to escape consumption (denitrification, assimilation, immobilization) and be exported in surface waters. Development in watersheds likely increased  $\text{NO}_3^-_{\text{Atm}}$  export due to hydrologic connectivity of overland flowpaths that bypass potential biological processing, supporting previous  $\text{NO}_3^-_{\text{Atm}}$  research in developed watersheds. Accordingly, future changes to land use patterns and rates of terrestrial N inputs to watersheds will likely increase (that is, urbanization, increased fertilizer application rates) or decrease (that is, reforestation of agricultural lands, reduced fertilizer application rates) the fraction of deposited  $\text{NO}_3^-_{\text{Atm}}$  that is exported in streamwater that directly contributes to nutrient pollution of downstream ecosystems.

#### ACKNOWLEDGEMENTS

Thanks to very helpful comments from two anonymous reviewers that greatly improved the manuscript. Thanks to Andrew Schauer and Robin Paulman for denitrifier method troubleshooting and Katie Kline and Jim Garlitz for  $\text{NO}_3^-$  concentration analysis. Kristen Heyer and Christine King from the Maryland Department of Natural Resources graciously provided sample aliquots from 10 of the study watersheds. Robert Hirsch of the U.S. Geological Survey provided guidance on WRTDS-K and R scripts for estimating  $\text{NO}_3^-_{\text{Total}}$  uncertainty. DMN, KNE, and JTB received support from Maryland Sea Grant under award NA14OAR4170090 R/WS-3 from the National Oceanic and Atmospheric Administration, U.S. Department of Commerce. This material is based upon work supported by the National Science Foundation Graduate Research Fellowship (to JTB) under Grant No. 1840380. Any opinion, findings, conclusions, recommendations expressed in this material are those of the authors and do not necessarily reflect the views of the National Science Foundation. The views expressed in this article are those of the authors and do not necessarily represent the views or policies of the U.S. Environmental Protection Agency. Any use of trade, firm, or product names is for descriptive purposes only and does not imply endorsement by the US Government.

DATA AVAILABILITY

Data are available at [https://github.com/jbost1458/Bostic\\_et\\_al\\_Ecosystems2021](https://github.com/jbost1458/Bostic_et_al_Ecosystems2021).

REFERENCES

- Aber JD, Nadelhoffer KJ, Steudler P, Melillo JM. 1989. Nitrogen Saturation in Northern Forest Ecosystems: Excess nitrogen from fossil fuel combustion may stress the biosphere. *BioScience* 39:378–386.
- Ågren GI, Bosatta E. 1988. Nitrogen saturation of terrestrial ecosystems. *Environmental Pollution* 54:185–197.
- Barnes RT, Raymond PA. 2010. Land-use controls on sources and processing of nitrate in small watersheds: insights from dual isotopic analysis. *Ecological Applications* 20:1961–1978.
- Barnes RT, Raymond PA, Casciotti KL. 2008. Dual isotope analyses indicate efficient processing of atmospheric nitrate by forested watersheds in the northeastern U.S. *Biogeochemistry* 90:15–27.
- Barton L, McLay CDA, Schipper LA, Smith CT. 1999. Annual denitrification rates in agricultural and forest soils: a review. *Soil Research* 37:1073–1094.
- Bevington PR, Robinson DK. 2003. Data reduction and error analysis for the physical sciences. New York: McGraw-Hill. p 338p.
- Böhlke JK, Hatzinger PB, Sturchio NC, Gu B, Abbene I, Mroczkowski SJ. 2009. Atacama perchlorate as an agricultural contaminant in groundwater: Isotopic and chronologic evidence from Long Island, New York. *Environmental Science & Technology* 43:5619–5625.
- Böhlke JK, Mroczkowski SJ, Coplen TB. 2003. Oxygen isotopes in nitrate: new reference materials for  $^{18}\text{O}:^{17}\text{O}:^{16}\text{O}$  measurements and observations on nitrate-water equilibration. *Rapid Communications in Mass Spectrometry* 17:1835–1846.
- Booth MS, Stark JM, Rastetter E. 2005. Controls on nitrogen cycling in terrestrial ecosystems: A synthetic analysis of literature data. *Ecological Monographs* 75:139–157.
- Böttcher J, Strebel O, Voerkelius S, Schmidt HL. 1990. Using isotope fractionation of nitrate-nitrogen and nitrate-oxygen for evaluation of microbial denitrification in a sandy aquifer. *Journal of Hydrology* 114:413–424.
- Bourgeois I, Savarino J, Caillon N, Angot H, Barbero A, Delbart F, Voisin D, Clément J-C. 2018a. Tracing the fate of atmospheric nitrate in a subalpine watershed using  $\Delta^{17}\text{O}$ . *Environmental Science & Technology* 52:5561–5570.
- Bourgeois I, Savarino J, Némery J, Caillon N, Albertin S, Delbart F, Voisin D, Clément J-C. 2018b. Atmospheric nitrate export in streams along a montane to urban gradient. *Science of the Total Environment* 633:329–340.
- Boyer EW, Goodale CL, Jaworski NA, Howarth RW. 2002. Anthropogenic nitrogen sources and relationships to riverine nitrogen export in the northeastern U.S.A. *Biogeochemistry* 57:137–169.
- Brabec E, Schulte S, Richards PL. 2002. Impervious surfaces and water quality: A review of current literature and its implications for watershed planning. *Journal of Planning Literature* 16:499–514.
- Burns DA, Boyer EW, Elliott EM, Kendall C. 2009. Sources and transformations of nitrate from streams draining varying land uses: evidence from dual isotope analysis. *Journal of Environmental Quality* 38:1149–1159.
- Burns DA, Kendall C. 2002. Analysis of  $\delta^{15}\text{N}$  and  $\delta^{18}\text{O}$  to differentiate  $\text{NO}_3^-$  sources in runoff at two watersheds in the Catskill Mountains of New York. *Water Resources Research* 38:9.1-9.11.
- Casciotti KL, Sigman DM, Hastings MG, Böhlke J, Hilkert A. 2002. Measurement of the oxygen isotopic composition of nitrate in seawater and freshwater using the denitrifier method. *Analytical Chemistry* 74:4905–4912.
- Chapin FS, Matson PA, Vitousek P. 2011. Principles of Terrestrial Ecosystem Ecology. New York: Springer Science & Business Media. p 529p.
- Chesapeake Bay Program, 2020. Chesapeake Assessment and Scenario Tool (CAST) Version 2019. Chesapeake Bay Program Office, Last accessed June, 2021.
- Clark CM, Tilman D. 2008. Loss of plant species after chronic low-level nitrogen deposition to prairie grasslands. *Nature* 451:712–715.
- Driscoll CT, Lawrence GB, Bulger AJ, Butler TJ, Cronan CS, Eagar C, Lambert KF, Likens GE, Stoddard JL, Weathers KC. 2001. Acidic deposition in the northeastern United States: Sources and inputs. *BioScience* 51:180–198.
- Eshleman KN, Sabo RD. 2016. Declining nitrate-N yields in the Upper Potomac River Basin: What is really driving progress under the Chesapeake Bay restoration? *Atmospheric Environment* 146:280–289.
- Eshleman KN, Sabo RD, Kline KM. 2013. Surface water quality is improving due to declining atmospheric N deposition. *Environmental Science & Technology* 47:12193–12200.
- Fang Y, Koba K, Makabe A, Takahashi C, Zhu W, Hayashi T, Hokari AA, Urakawa R, Bai E, Houlton BZ, Xi D, Zhang S, Matsushita K, Tu Y, Liu D, Zhu F, Wang Z, Zhou G, Chen D, Makita T, Toda H, Liu X, Chen Q, Zhang D, Li Y, Yoh M. 2015. Microbial denitrification dominates nitrate losses from forest ecosystems. *Proceedings of the National Academies of Sciences of the United States of America* 112:1470–1474.
- Galloway JN, Aber JD, Erisman JW, Seitzinger SP, Howarth RW, Cowling EB, Cosby BJ. 2003. The nitrogen cascade. *BioScience* 53:341–356.
- Galloway JN, Dentener FJ, Capone DG, Boyer EW, Howarth RW, Seitzinger SP, Asner GP, Cleveland CC, Green PA, Holland EA, Karl DM, Michaels AF, Porter JH, Townsend AR, Vöosmarty CJ. 2004. Nitrogen cycles: past, present, and future. *Biogeochemistry* 70:153–226.
- Grigal DF. 2012. Atmospheric deposition and inorganic nitrogen flux. *Water, Air, & Soil Pollution* 223:3565–3575.
- Groffman PM, Law NL, Belt KT, Band LE, Fisher GT. 2004. Nitrogen fluxes and retention in urban watershed ecosystems. *Ecosystems* 7:393–403.
- Hall SJ, Weintraub SR, Eiriksson D, Brooks PD, Baker MA, Bowen GJ, Bowling DR. 2016. Stream nitrogen inputs reflect groundwater across a snowmelt-dominated montane to urban watershed. *Environmental Science & Technology* 50:1137–1146.
- Hattori S, Nuñez Palma Y, Itoh Y, Kawasaki M, Fujihara Y, Takase K, Yoshida N. 2019. Isotopic evidence for seasonality of microbial internal nitrogen cycles in a temperate forested catchment with heavy snowfall. *Science of the Total Environment* 690:290–299.
- Hofstra N, Bouwman AF. 2005. Denitrification in agricultural soils: summarizing published data and estimating global annual rates. *Nutrient Cycling in Agroecosystems* 72:267–278.

- Homer C, Dewitz J, Jin S, Xian G, Costello C, Danielson P, Gass L, Funk M, Wickham J, Stehman S, Auch R, Riitters K. 2020. Conterminous United States land cover change patterns 2001–2016 from the 2016 National Land Cover Database. *ISPRS Journal of Photogrammetry and Remote Sensing* 162:184–199.
- Howarth R, Anderson D, Cloern J, Elfring C, Hopkinson C, Lapointe B, Malone T, Marcus N, McGlathery K, Sharpley AN, Walker D. 2000. Nutrient pollution of coastal rivers, bays, and seas. *Issues in Ecology* 7:1–15.
- Inoue T, Nakagawa F, Shibata H, Tsunogai U. 2021. Vertical Changes in the Flux of Atmospheric Nitrate From a Forest Canopy to the Surface Soil Based on  $\Delta^{17}\text{O}$  Values. *Journal of Geophysical Research: Biogeosciences* 126: e2020JG005876.
- Jordan TE, Correll DL, Weller DE. 1997. Relating nutrient discharges from watersheds to land use and streamflow variability. *Water Resources Research* 33:2579–2590.
- Kaiser J, Hastings MG, Houlton BZ, Röckmann T, Sigman DM. 2007. Triple oxygen isotope analysis of nitrate using the denitrifier method and thermal decomposition of  $\text{N}_2\text{O}$ . *Analytical Chemistry* 79:599–607.
- Kaushal SS, Groffman PM, Band LE, Elliott EM, Shields CA, Kendall C. 2011. Tracking nonpoint source nitrogen pollution in human-impacted watersheds. *Environmental Science & Technology* 45:8225–8232.
- Kaushal SS, Groffman PM, Band LE, Shields CA, Morgan RP, Palmer MA, Belt KT, Swan CM, Findlay SE, Fisher GT. 2008. Interaction between urbanization and climate variability amplifies watershed nitrate export in Maryland. *Environmental Science & Technology* 42:5872–5878.
- Kemp WM, Boynton WR, Adolf JE, Boesch DF, Boicourt WC, Brush G, Cornwell JC, Fisher TR, Glibert PM, Hagy JD. 2005. Eutrophication of Chesapeake Bay: historical trends and ecological interactions. *Marine Ecology Progress Series* 303:1–29.
- Kendall C, Campbell DH, Burns DA, Shanley JB, Silva SR, Chang CC. 1995. Tracing sources of nitrate in snowmelt runoff using the oxygen and nitrogen isotopic compositions of nitrate. *IAHS Publications-Series of Proceedings and Reports-Intern Assoc Hydrological Sciences* 228:339–348.
- Kendall C, Elliott EM, Wankel SD. 2007. Tracing anthropogenic inputs of nitrogen to ecosystems. In: RH Michener and K. Lajtha (Eds.), *Stable Isotopes in Ecology and Environmental Science* 2<sup>nd</sup> edition, Blackwell Publishing: 375–449.
- Li Y, Schichtel BA, Walker JT, Schwede DB, Chen X, Lehmann CM, Puchalski MA, Gay DA, Collett JL. 2016. Increasing importance of deposition of reduced nitrogen in the United States. *Proceedings of the National Academy of Sciences* 113:5874–5879.
- Lovett GM, Goodale CL. 2011. A new conceptual model of nitrogen saturation based on experimental nitrogen addition to an oak forest. *Ecosystems* 14:615–631.
- Lovett GM, Lindberg SE. 1993. Atmospheric deposition and canopy interactions of nitrogen in forests. *Canadian Journal of Forest Research* 23:1603–1616.
- McDonald JH. 2009. *Handbook of biological statistics*: Sparky House Publishing Baltimore, MD.
- Michalski G, Bhattacharya S, Mase DF. 2012. Oxygen isotope dynamics of atmospheric nitrate and its precursor molecules. In: M. Baskaran (ed.), *Handbook of Environmental Isotope Geochemistry*, Springer: 613–635.
- Michalski G, Kolanowski M, Riha KM. 2015. Oxygen and nitrogen isotopic composition of nitrate in commercial fertilizers, nitric acid, and reagent salts. *Isotopes in Environmental and Health Studies* 51:382–391.
- Michalski G, Meixner T, Fenn M, Hernandez L, Sirulnik A, Allen E, Thiemens M. 2004. Tracing atmospheric nitrate deposition in a complex semiarid ecosystem using  $\Delta^{17}\text{O}$ . *Environmental Science & Technology* 38:2175–2181.
- Michalski G, Savarino J, Böhlke JK, Thiemens M. 2002. Determination of the total oxygen isotopic composition of nitrate and the calibration of a  $\Delta^{17}\text{O}$  nitrate reference material. *Analytical Chemistry* 74:4989–4993.
- Michalski G, Scott Z, Kabling M, Thiemens MH. 2003. First measurements and modeling of  $\Delta^{17}\text{O}$  in atmospheric nitrate. *Geophysical Research Letters* 30.
- Nakagawa F, Tsunogai U, Obata Y, Ando K, Yamashita N, Saito T, Uchiyama S, Morohashi M, Sase H. 2018. Export flux of unprocessed atmospheric nitrate from temperate forested catchments: a possible new index for nitrogen saturation. *Biogeosciences* 15:7025–7042.
- Nelson DM, Tsunogai U, Ding D, Ohyama T, Komatsu DD, Nakagawa F, Noguchi I, Yamaguchi T. 2018. Triple oxygen isotopes indicate urbanization affects sources of nitrate in wet and dry atmospheric deposition. *Atmospheric Chemistry and Physics* 18:6381–6392.
- National Atmospheric Deposition Program (NRSP-3). 2021. NADP Program Office, Wisconsin State Laboratory of Hygiene, 465 Henry Mall, Madison, WI 53706.
- Osaka K, Kugo T, Komaki N, Nakamura T, Nishida K, Nagafuchi O. 2016. Atmospheric nitrate leached from small forested watersheds during rainfall events: Processes and quantitative evaluation. *Journal of Geophysical Research: Biogeosciences* 121:2030–2048.
- R Development Core Team. 2019. *R: A language and environment for statistical computing*. Vienna, Austria: R Foundation for Statistical Computing.
- Riha KM, Michalski G, Gallo EL, Lohse KA, Brooks PD, Meixner T. 2014. High atmospheric nitrate inputs and nitrogen turnover in semi-arid urban catchments. *Ecosystems* 17:1309–1325.
- Rose LA, Elliott EM, Adams MB. 2015. Triple nitrate isotopes indicate differing nitrate source contributions to streams across a nitrogen saturation gradient. *Ecosystems* 18:1209–1223.
- Sabo RD, Nelson DM, Eshleman KN. 2016. Episodic, seasonal, and annual export of atmospheric and microbial nitrate from a temperate forest. *Geophysical Research Letters* 43:683–691.
- Schimel, JP, Bennett, J. Nitrogen mineralization: Challenges of a changing paradigm. *Ecology* 85: 591–602.
- Sebestyen SD, Ross DS, Shanley JB, Elliott EM, Kendall C, Campbell JL, Dail DB, Fernandez IJ, Goodale CL, Lawrence GB, Lovett GM, McHale PJ, Mitchell MJ, Nelson SJ, Shattuck MD, Wickman TR, Barnes RT, Bostic JT, Buda AR, Burns DA, Eshleman KN, Finlay JC, Nelson DM, Ohte N, Pardo LH, Rose LA, Sabo RD, Schiff SL, Spoelstra J, Williard KWJ. 2019. Unprocessed atmospheric nitrate in waters of the northern forest region in the U.S. and Canada. *Environmental Science & Technology* 53:3620–3633.
- Sigman DM, Casciotti KL, Andreani M, Barford C, Galanter M, Böhlke J. 2001. A bacterial method for the nitrogen isotopic analysis of nitrate in seawater and freshwater. *Analytical Chemistry* 73:4145–4153.

- Sprague LA. 2001. Effects of storm-sampling frequency on estimation of water-quality loads and trends in two tributaries to Chesapeake Bay in Virginia. US Geological Survey Water-Resources Investigations Report 01-4136.
- Sudduth EB, Perakis SS, Bernhardt ES. 2013. Nitrate in watersheds: Straight from soils to streams? *Journal of Geophysical Research: Biogeosciences* 118:291–302.
- Tørseth K, Aas W, Breivik K, Fjæraa AM, Fiebig M, Hjellbrekke AG, Lund Myhre C, Solberg S, Yttri KE. 2012. Introduction to the European Monitoring and Evaluation Programme (EMEP) and observed atmospheric composition change during 1972–2009. *Atmospheric Chemistry and Physics* 12:5447–5481.
- Tsunogai U, Komatsu DD, Daita S, Kazemi GA, Nakagawa F, Noguchi I, Zhang J. 2010. Tracing the fate of atmospheric nitrate deposited onto a forest ecosystem in Eastern Asia using  $\Delta^{17}\text{O}$ . *Atmos. Chem. Phys.* 10:1809–1820.
- Tsunogai U, Komatsu DD, Ohyama T, Suzuki A, Nakagawa F, Noguchi I, Takagi K, Nomura M, Fukuzawa K, Shibata H. 2014. Quantifying the effects of clear-cutting and strip-cutting on nitrate dynamics in a forested watershed using triple oxygen isotopes as tracers. *Biogeosciences* 11:5411–5424.
- Tsunogai U, Miyauchi T, Ohyama T, Komatsu DD, Nakagawa F, Obata Y, Sato K, Ohizumi T. 2016. Accurate and precise quantification of atmospheric nitrate in streams draining land of various uses by using triple oxygen isotopes as tracers. *Biogeosciences* 13:3441–3459.
- United States Geological Survey. 2016. The StreamStats program, online at <http://streamstats.usgs.gov>.
- PRISM Climate Group, Oregon State University, <http://prism.oregonstate.edu>, created 4 Feb 2004.
- Yang Y-Y, Toor GS. 2016.  $\delta^{15}\text{N}$  and  $\delta^{18}\text{O}$  reveal the sources of nitrate-nitrogen in urban residential stormwater runoff. *Environmental Science & Technology* 50:2881–2889.
- Young ED, Galy A, Nagahara H. 2002. Kinetic and equilibrium mass-dependent isotope fractionation laws in nature and their geochemical and cosmochemical significance. *Geochimica Et Cosmochimica Acta* 66:1095–1104.
- Yu Z, Elliott EM. 2018. Probing soil nitrification and nitrate consumption using  $\Delta^{17}\text{O}$  of soil nitrate. *Soil Biology and Biochemistry* 127:187–199.
- Zhang Q, Hirsch RM. 2019. River water-quality concentration and flux estimation can be improved by accounting for serial correlation through an autoregressive model. *Water Resources Research* 55:9705–9723.