# Calculating Nitrogen Uptake Rates in Forests: Which Components Can Be Omitted, Simplified, or Taken from Trait Databases and Which Must Be Measured In Situ?

Ray Dybzinski,<sup>1</sup>\* Ella Segal,<sup>2</sup> M. Luke McCormack,<sup>3</sup> Christine R. Rollinson,<sup>3</sup> Rosemary Mascarenhas,<sup>4</sup> Perry Giambuzzi,<sup>5,6</sup> Jamilys Rivera,<sup>7</sup> Lucien Fitzpatrick,<sup>3</sup> Caylin Wiggins,<sup>8</sup> and Meghan G. Midgley<sup>3</sup>

<sup>1</sup>School of Environmental Sustainability, Loyola University Chicago, Chicago, Illinois 60660, USA; <sup>2</sup>Ecology and Evolutionary Biology, University of Tennessee Knoxville, Knoxville, Tennessee 37996, USA; <sup>3</sup>Center for Tree Science, The Morton Arboretum, 4100 Illinois Route 53, Lisle, Illinois 60532, USA; <sup>4</sup>Department of Agricultural and Biological Engineering, University of Illinois Urbana-Champaign, Urbana, Illinois 61801, USA; <sup>5</sup>Center for Ecosystem Science and Society, Northern Arizona University, Flagstaff, Arizona 86011, USA; <sup>6</sup>School of Informatics, Computing, and Cyber Systems, Northern Arizona University, Flagstaff, Arizona 86011, USA; <sup>7</sup>University of Puerto Rico at Humacao, Humacao, Puerto Rico 00791, USA; <sup>8</sup>Department of Earth, Atmosphere, and Environment, Northern Illinois University, DeKalb, Illinois 60115, USA

# **ABSTRACT**

Quantifying nitrogen uptake rates across different forest types is critical for a range of ecological questions, including the parameterization of global climate change models. However, few measurements of forest nitrogen uptake rates are available due to the intensive labor required to collect in situ data. Here, we seek to optimize data collection efforts by identifying measurements that must be made in situ and those that can be omitted or

Received 8 November 2023; accepted 26 May 2024

**Supplementary Information:** The online version contains supplementary material available at https://doi.org/10.1007/s10021-024-00919-8.

**Author Contributions**: Author contributions were as follows: design of the research (RD, LLM, CRR, MGM); performance of the research (all authors); data collection (all authors); data analysis (RD, ES); data interpretation (RD, ES, LLM, CRR, MGM); writing the manuscript (RD, ES, MLM, CRR, MGM); and editing the manuscript (all authors).

 $*Corresponding\ author;\ e\text{-}mail:\ rdybzinski@LUC.edu$ 

approximated from databases. We estimated nitrogen uptake rates in 18 mature monodominant forest stands comprising 13 species of diverse taxonomy at the Morton Arboretum in Lisle, IL, USA. We measured all nitrogen concentrations, foliage allocation, and fine root biomass in situ. We estimated wood biomass increments by in situ stem diameter and stem core measurements combined with allometric equations. We estimated fine root turnover rates from database values. We analyzed similar published data from monodominant forest FACE sites. At least in monodominant forests, accurate estimates of forest nitrogen uptake rates appear to require in situ measurements of fine root productivity and are appreciably better paired with in situ measurements of foliage productivity. Generally, wood productivity and tissue nitrogen concentrations may be taken from trait databases at higher taxonomic levels. Careful sorting of foliage or fine roots to species is time consuming but has little effect on estimates of nitrogen uptake rate. By directing research efforts to critical in situ measurements only, future studies can maximize research effort to identify the drivers of varied nitrogen uptake patterns across gradients.

**Key words:** fine root turnover; forest mensuration; forest productivity; nitrogen dynamics; nitrogen uptake rate; plant tissue nitrogen.

#### **HIGHLIGHTS**

- Insightful but labor-intensive nitrogen uptake rate measurements may be simplified.
- In situ measurements of fine root and foliage productivity appear necessary.
- Wood productivity and tissue N concentrations may be taken from trait databases.

### Introduction

Nitrogen commonly limits primary production in forests (LeBauer and Treseder 2008), and nitrogen uptake into dominant canopy trees is thought to play an important role in carbon sequestration (Finzi and others 2007; Zaehle and others 2014; Walker and others 2021; Wang and Wang 2021). Many factors may affect plant nitrogen uptake, but their mechanisms and relative importance in different ecological contexts are poorly understood (Freschet and others 2021). Early research efforts focused on plant litter feedbacks as the dominant control of nitrogen availability and uptake (Pastor and others 1984; Hobbie 1992). However, a range of newly discovered mechanisms and possibilities have been identified in recent decades (Hobbie 2015), including plant–microbe competition (Schimel and Bennett 2004), organic nitrogen uptake (Schimel and Bennett 2004), priming effects (Phillips and others 2012; Cheng and others 2014; Meier and others 2017; Henneron and others 2020; Wen and others 2022), mycorrhizal uptake (Näsholm and others 2013), non-growing-season uptake (Ma and others 2021), water interactions (Joseph and others 2021), uptake at depth (Iversen 2010), game theoretic root overproliferation (Cabal 2022), and even significant foliage nitrogen uptake via direct absorption (Guerrieri and others 2021). Because of the myriad factors potentially impacting forest nitrogen dynamics, we need more stand-level measurements of nitrogen uptake rate to understand the relative contributions and context dependencies of these mechanisms.

Three common approaches for measuring or approximating nitrogen uptake rates all present critical challenges or shortcomings. First, under the classic leaf litter feedback paradigm, researchers sometimes equated plant uptake with availability by making the now-questionable assumptions that (1) net nitrogen mineralization in bulk soil was the only mode of nitrogen availability that mattered and (2) that all available nitrogen would be taken up. Nadelhoffer and others (1984), Nadelhoffer and others (1985), Pinay and others (1995), Ruess and others (1996), and Usman and others (1999) ostensibly concern plant nitrogen uptake, but their measures of uptake are actually measures of net nitrogen mineralization in bulk soil. Second, studies that focus on the relative partitioning of nitrogen among the many possible sinks involved in plant nitrogen uptake have made great use of <sup>15</sup>N tracers (for example, Näsholm and others 2013), whereby labeled nitrogen is injected into soils and its uptake and allocation to different plant tissues are subsequently analyzed. However, 15N tracer studies use a short-term pulse of nitrogen that does not reflect integrated uptake across an entire growing season, and they do not account for retranslocation and the use of stored nitrogen within a plant. As such, and despite the tremendous strength of 15N tracer studies to discriminate the relative partitioning of labeled nitrogen, these studies must be treated cautiously when interpreting absolute nitrogen uptake.

The third method, calculating absolute nitrogen uptake, sidesteps these shortcomings but requires measuring the growth increments of a stand's foliage, wood (including branch, bole, and coarse roots), fine roots, and reproductive structures, along with the nitrogen concentrations in those structures (Whittaker and others 1979). The calculation must also account for nitrogen redeployed from storage each year (for example, Dybzinski and others 2019). Stand heterogeneity invariably complicates the calculation, requiring study design decisions that hinge on statistical power that can seldom be known in a given stand a priori. For example, growth increments and nitrogen concentrations of various tissues will likely differ between individuals of different sizes and different species and may even differ within a single individual both in space (for example, a sunlit branch versus a shaded branch) and time (for example, at different times within a given growing season or across different growing seasons).

Because calculating absolute nitrogen uptake is so challenging and labor-intensive, insights into forest nitrogen uptake are only available from a handful of studies at a handful of sites (Whittaker and others 1979; Finzi and others 2007; Tateno and Takeda 2010). Finzi and others (2007) found that forest nitrogen uptake increased under elevated CO<sub>2</sub> in three of four Free-Air CO<sub>2</sub> Enrichment (FACE) sites and that the site that did not show an increase was not nitrogen limited. Tateno and Takeda (2010) found that nitrogen uptake into aboveground tissues increased with increasing nitrogen mineralization rate but that nitrogen uptake into belowground tissues decreased with increasing nitrogen mineralization rate, such that total nitrogen uptake did not change with increasing nitrogen mineralization rate.

Given the ecological importance of forest nitrogen uptake-especially in the context of global change factors—researchers would benefit from more measurements at more and varied sites. Indeed, a network of sites using commensurate protocols to measure forest nitrogen uptake would allow researchers to distinguish generalities from special cases (Borer and others 2014). However, the complications and labor involved in the standard method for calculating absolute forest nitrogen uptake rate stand in the way, and we are not aware of any networks that are yet undertaking nitrogen uptake measurements. Can the method be simplified by omitting certain components, by making simplifying assumptions, or by obtaining certain components not from in situ measurements, but rather from trait databases?

Here, we report on the nearly complete in situ measurements of absolute forest nitrogen uptake in 18 mature, monodominant stands at the Morton Arboretum (Lisle, Illinois, USA) and draw on published data on the nearly complete in situ measurements of absolute forest nitrogen uptake in four forest FACE sites (Finzi and others 2007). Our goal is to find ways to simplify the method without substantially changing either the total nitrogen uptake estimate or the ranking of sites by total nitrogen uptake, either of which would represent paths forward to greater researcher uptake (pun intended) of absolute forest nitrogen uptake calculations at more and varied sites. To find the most promising simplifications, we systematically omit components, simplify assumptions, and replace components with trait database values. Broadly, we ask the following questions, where "need" is defined as important for accurately calculating total nitrogen uptake and/or maintaining ranking of sites by total nitrogen uptake:

- Are foliage, fine root, and wood nitrogen uptake measurements all needed?
- Are in situ nitrogen concentrations needed or can trait database values be substituted? If trait database values are used, what is the best taxonomic level?
- Can allometric relationships or stand-level database values replace the need for in situ leaf litter, fine root, and/or wood production measurements?
- How much do assumptions about fine root turnover rates matter to the total nitrogen uptake estimate and/or the ranking of sites by total nitrogen uptake?
- Is careful sorting of fine roots and leaf litter needed, and is it necessary to include nitrogen uptake into reproductive structures?
- Are the results of any simplifications systematically different for major plant groups, including mycorrhizal associations or plant divisions?

We compare both the accuracy and correlation of the resulting simplified calculations of forest nitrogen uptake with those made using the nearly complete in situ measurements ("nearly complete" because we used allometric equations to estimate wood increment and because we used database fine root turnover values). Accuracy measures the quantitative agreement between estimates with a given simplification and the nearly complete in situ measurements. Correlation measures the ability to correctly rank forest stands by their nitrogen uptake rates with a given simplification as compared with the nearly complete in situ measurements.

#### MATERIALS AND METHODS

#### Overview

In what follows, we first explain the calculations that we use to estimate nitrogen uptake rate from empirical measurements. Second, we describe the Morton Arboretum study site in detail, as well as an overview of the four forest FACE sites from which we repurpose published data. Third, we describe the TRY and FluxNet databases used in some of the analysis scenarios. Finally, we describe the rationale and details of the analysis scenarios that test different possible simplifications of the most comprehensive approach to measuring nitrogen uptake rates. The supplemental online material contains additional details on in situ field measurements at the Morton Arboretum, error propagation in analyses, the rationale and details regarding our measures of accuracy and correlation for comparing different simplification scenarios, and details on a power analysis for measuring fine root biomass and nitrogen concentration.

# General Framework for Measuring Absolute Nitrogen Uptake Rate

For closed-canopy forest stands, canopy tree nitrogen uptake rate (U) in units of gN m<sup>-2</sup> y<sup>-1</sup> can be calculated as the sum of nitrogen uptake into foliage  $(U_{\rm F})$ , fine roots  $(U_{\rm R})$ , live wood (including branch, bole, and coarse roots,  $U_{\rm W}$ ), and reproductive tissues  $(U_{\rm S})$ :

$$U \approx U_{\rm F} + U_{\rm R} + U_{\rm W} + U_{\rm S} \tag{1}$$

To be clear, "uptake" in this context is mediated by fine roots, which initially bring nitrogen into the tree before it is transported to a given organ for "uptake" (but see Guerrieri and others 2021). Estimating each of these components requires its own assumptions and field techniques, which we describe below.

 $U_{\rm F}$ ,  $U_{\rm R}$ , and  $U_{\rm S}$  share a common general mathematical expression for a stand whose foliage, fine root, or reproductive components are approximately in dynamic equilibrium:

$$U_x \approx B_x T_x N_x (1 - Q_x)$$
, where  $x \in (F, R, S)$  (2)

 $B_x$  is the biomass of the tissue in units of g m<sup>-2</sup>.  $T_x$  is the turnover rate in units of  $y^{-1}$ .  $N_x$  is the nitrogen concentration of the tissue in units of gN  $g^{-1}$ . Finally,  $Q_x$  is the unitless fraction of nitrogen that is retranslocated prior to tissue senescence or dispersal. Taken together, the expression states that nitrogen uptake into component X is equal to the *new* biomass produced  $(B_xT_x)$  multiplied by the *new* nitrogen it requires  $(N_x(1-Q_x))$ . Foliage mass and fine root mass are either approximately in dynamic equilibrium in closed-canopy forests or change very slowly relative to the yearly timescale necessary for this assumption (Covington and Aber 1980; Claus and George 2011; Jagodzinski and Kalucka 2011; Dybzinski and others 2015; Jagodzinski and others 2016).

In the case of foliage or reproductive tissues, it is often methodologically expedient to measure the rate at which senesced tissues are lost, which avoids the need to measure turnover rates or, if also measuring senesced tissue nitrogen concentration, the retranslocation fraction. Again, assuming the foliage or reproductive components are approximately in dynamic equilibrium, the nitrogen lost in the senesced tissues must be approximately equal to the nitrogen taken up to replace that loss. Thus,

$$U_x \approx D_x N_x (1 - Q_x)$$
 or  $U_x \approx D_x N_{D,x}$ , where  $x \in (F, S)$  (3)

 $D_x$  is the rate of senesced tissue loss in units of g m<sup>-2</sup> y<sup>-1</sup>, and  $N_{D,x}$  is the nitrogen concentration of the senesced tissue.

Unlike foliage, fine root, and reproductive structures, wood growth likely increases for decades or centuries after canopy closure (Dybzinski and others 2015, their Figure 6). Moreover, even in an old growth forest where wood biomass truly is in dynamic equilibrium, it is difficult to make good methodological use of that fact given the spatially and temporally heterogeneous nature of wood growth and loss. Hence, an alternative way to estimate  $U_{\rm W}$  uses basal area and wood growth increments:

$$U_{\rm W} \approx G_{\rm W} N_{\rm W} (1 - Q_{\rm W}) \tag{4}$$

 $G_W$  is the net primary productivity of wood in units of g m<sup>-2</sup> y<sup>-1</sup>,  $N_{\rm W}$  is the nitrogen concentration of living sapwood, and Qw is the retranslocation of nitrogen prior to sapwood conversion to heartwood. Gw is conventionally estimated as  $G_{\rm W} \approx \left(\frac{1}{A}\sum_{i=1}^n I_{i,t} - I_{i,t-1}\right)$ , where  $I_{i,t}$  is the wood biomass of tree I in the measurement year,  $I_{(i,t-1)}$  is the wood biomass of tree i in the year prior to the measurement year, and n is the number of trees measured within area A. In addition to being time consuming and difficult, directly measuring tree biomass is wildly destructive, so we estimate  $I_{i,t}$  and  $I_{i, t-1}$  using allometric equations keyed to diameter,  $I_{i,t} \approx H(dbh_{i,t})$  and  $I_{i,t-1} \approx H(dbh_{i,t-1})$ . H() is an empirically determined power law function of diameter at breast height, dbh.

As in the case of senesced reproductive tissues and foliage,  $U_{\rm W}$  may be simplified by measuring heartwood nitrogen concentration,  $N_{D,\rm W}$ , which effectively includes retranslocation without having to measure it. Hence,

$$U_{\rm W} \approx G_{\rm W} N_{\rm D,W}.$$
 (5)

# Description of the Morton Arboretum Plots

The new in situ measurements occurred in monodominant forestry plots at the Morton Arboretum (41.81° N, 88.05° S) in Lisle, Illinois, USA, primarily from June to August 2019. The region has a continental climate, where average temperatures range from -6 °C in January to 22 °C in July, and mean annual precipitation totals 800–1000 mm

(Midgley and Sims 2020). The arboretum's forestry plots range from 0.05 to 0.8 hectares in area, were established beginning in 1922, and remain strongly monodominant (Midgley and Sims 2020). Eighteen of these forestry plots were used, which represent data from 13 different tree species (five species are replicated twice) (Table 1). The species are approximately evenly split between angiosperms and gymnosperms, and species within each of those taxonomic groups are approximately evenly split between those with ectomycorrhizal and arbuscular mycorrhizal associations (Table 1). Understories are populated by short-statured herbaceous species and are generally open and walkable. Given the nature and sizes of the plots, inferences and generalizations about small-scale, monodominant stands are warranted. We describe the methods used to measure in situ foliage production, fine root mass, wood production, and tissue nitrogen concentrations in the Supplemental Online Material.

# Description of FACE Data

Data on pool size, flux, and turnover of foliage, wood, and fine roots were assembled by Finzi and others (2007) on four forest FACE sites: Duke Forest (Hendrey and others 1999), Rhinelander (Karnosky and others 1999, 2005), Oak Ridge National Lab (ORNL, Norby and others 2001), and Pop-Euro (Miglietta and others 2001). Their dominant species, mycorrhizal associations, and other details are presented in Table 1. We display and analyze the replicate plots within each FACE site, which provide an indication of site-level variability. Given the nature and sizes of the plots, inferences and generalizations about small-scale, monodominant stands are warranted. Although data were separately available for elevated CO2 and ambient CO<sub>2</sub> plots, their within-site differences were small compared to across-site differences. Thus, to simplify the presentation, we ignored the CO<sub>2</sub> treatment of a forest FACE plot. In addition, we omitted pre-treatment data.

# Description of Data Base Values

# TRY

Trait data were requested from the TRY database (Kattge and others 2011) on September 18, 2020, and we received data from 330 families covering fresh foliage [N] (TRY trait #14, n = 120,306), foliage turnover rate (#12, n = 4808), fine root [N] (#2035 & #475, n = 4574), fine root turnover rate (#2065 & #1955, n = 695), and stem [N] (#3453, & #1229, n = 22,332). The records we used reflected the fol-

lowing adjustments: Duplicate records were removed using the "ObservationID" field. Outlier values (greater than 245 mg g<sup>-1</sup>) were omitted from fresh foliage [N], as were all data labeled as from "Dataset 170" because they contained a large number of outlier and suspicious values. All values were converted to fractions. Foliage turnover rates were calculated as the inverse of reported leaf lifespan in months multiplied by 12 months v<sup>-1</sup>. Values recorded as 0 months (that is, infinite turnover) were removed. Fine root [N] were converted to fractions. Fine root turnover data erroneously labeled with units  $mg g^{-1}$  were omitted, and fine root turnover data reported in units of days (that is, longevity) were converted to turnover by multiplying their inverse by 365 d  $y^{-1}$ . Stem [N] records were filtered to include only those for which the "Plant-GrowthForm" field equaled "tree," and data expressed in mg g<sup>-1</sup> were converted to fractions.

#### FluxNet

The "1\_Site\_Information" and "3\_Estimate\_NPP" tables from the FluxNet database (Luyssaert and others 2007) were merged and filtered to include only data for which the "Climatic.region" field equaled "Temperate Humid." We converted FluxNet's units of g C to g biomass by dividing values by 0.5 (that is, assuming g C = 0.5 g biomass).

# **Analysis Scenarios**

As detailed in Table 2, we considered six broad approaches to calculating nitrogen uptake rate (labeled a through f) with specific scenarios nested within each broad approach (labeled with subscript numbers). The first of these scenarios,  $a_1$ , represents our best in situ estimate of nitrogen uptake, including uptake into foliage, fine roots, and wood. Uptake into foliage is calculated using Eq. 3 with in situ litter production and litter [N] values, sidestepping any need for retranslocation values. Uptake into fine roots is calculated using Eq. 2 with in situ fine root biomass measurements and their [N] together with fine root turnover rates taken from the TRY database to lowest available taxonomic order. Importantly, we assume that fine roots do not resorb nitrogen before their death, an assumption that is better supported by data than any other (Gordon and Jackson 2000). Uptake into wood is calculated using Eq. 5 with in situ stem diameters and heartwood [N], sidestepping any need for retranslocation values. We use the Jenkins and others (2003) allometries for plant functional types (PFTs) to convert diameter to biomass, including estimates of belowground wood in coarse

 Table 1.
 Summary of Sites and Plots

Location	Overstory species	Family	Mycorrhizal association	Taxonomic group	Leaf habit	Wood type	Age	Soil classification	Soil texture	Size (ha)	Subplot radii (m)	Mean N uptake
Morton Arb	Aesculus glabra	Sapindaceae	AM	Angiosperm	Deciduous	Diffuse	94	Udollic Epi- aqualfs	Silty clay loam	0.05	5	8.92
Morton Arb	Asimina triloba	Annonaceae	AM	Angiosperm	Deciduous	Ring	71	Cumulic Endoaquolls	Silty clay loam	0.07	7	9.93
Morton Arb	Asimina triloba	Annonaceae	AM	Angiosperm	Deciduous	Ring	73	Oxyaquic Hapludalfs	Silt loam	0.11	1.5	20.69
Morton Arb	Carya ovata	Juglandaceae	ECM	Angiosperm	Deciduous	Ring	88	Oxyaquic Hapludalfs	Silt loam	0.10	7.5	6.35
Morton Arb	Chamaecyparis pisifera	Cupressaceae	AM	Gymnosperm	Evergreen	Tracheid	92	Oxyaquic Hapludalfs	Silt loam	0.31	4	8.34
Morton Arb	Juniperus chi- nensis	Cupressaceae	AM	Gymnosperm	Evergreen	Tracheid	88	Oxyaquic Hapludalfs	Silt loam	0.11	4	4.53
Morton Arb	Picea abies	Pinaceae	ECM	Gymnosperm	Evergreen	Tracheid	95	Oxyaquic Hapludalfs	Silt loam	0.80	7.5	4.16
Morton Arb	Pinus strobus	Pinaceae	ECM	Gymnosperm	Evergreen	Tracheid	79	Oxyaquic Hapludalfs	Silt loam	0.10	5, 7.5	4.92
Morton Arb	Pinus strobus	Pinaceae	ECM	Gymnosperm	Evergreen	Tracheid	94	Udollic Epi- aqualfs	Silty clay loam	99.0	7.5	5.25
Morton Arb	Platanus occi- dentalis	Platanaceae	AM	Angiosperm	Deciduous	Diffuse	78	Typic En- doaquolls	Silty clay loam	0.16	7.5	6.65
Morton Arb	Quercus alba	Fagaceae	ECM	Angiosperm	Deciduous	Ring	93	Oxyaquic Hapludalfs	Silt loam	0.12	7.5	6.64
Morton Arb	Quercus bicolor Fagaceae	Fagaceae	ECM	Angiosperm	Deciduous	Ring	06	Cumulic Endoaquolls	Silty clay loam	0.12	5	5.74
Morton Arb	Quercus bicolor Fagaceae	Fagaceae	ECM	Angiosperm	Deciduous	Ring	06	Typic En- doaquolls	Silty clay loam	0.41	7.5	5.94
Morton Arb	Robinia pseu- doacacia	Fabaceae	AM	Angiosperm	Deciduous	Ring	≥ 38	Oxyaquic Hapludalfs	Silt loam	90.0	5	10.04
Morton Arb	Thuja occiden- talis	Cupressaceae	AM	Gymnosperm	Evergreen	Tracheid	62	Oxyaquic Hapludalfs	Silt loam	0.18	5	9.39
Morton Arb	Thuja occiden- talis	Cupressaceae	AM	Gymnosperm	Evergreen	Tracheid	> 53	Cumulic Endoaquolls	Silty clay loam	0.03	3	13.70
Morton Arb	Tsuga canaden- Pinaceae sis	Pinaceae	ECM	Gymnosperm	Evergreen	Tracheid	97	Oxyaquic Hapludalfs	Silt loam	0.05	3	21.46

Table 1. continued

Location	Overstory species	Family	Mycorrhizal association	Mycorrhizal Taxonomic Leaf habit Wood association group type	Leaf habit		Age	Soil classification	Soil texture Size Subplot Mean (ha) radii N (m) uptak	Size (ha)	Subplot radii (m)	Mean N uptake
Morton Arb	Morton Arb Tsuga canaden- Pinaceae	Pinaceae	ECM	Gymnosperm Evergreen Tracheid ≥92	Evergreen	Tracheid	> 92	Typic En- doagnolls	Silty clay loam	0.39	5	9.81
Duke FACE (6 plots)	Pinus taeda	Pinaceae	ECM	Gymnosperm Evergreen Tracheid	Evergreen	Tracheid	17	Ultic Haplu- dalf	Clay loam	0.05	NA	5.35
Rhinelander FACE (12 plots)	Populus tremu- loides, Acer saccharum, Betula namr-	Salicaceae	ЕСМ, АМ	Angiosperm	Deciduous Diffuse	Diffuse	īΟ	Alfic Hap- lorthod	Sandy loam 0.07	0.07	NA	4.92
ORNI FACE	ifera	Hammam <i>e</i> l. AM	MA	Anoiosnerm	Deciditons Diffuse	Diffuse	14	Aquic Han-	Silty clay	0.05	ĄN	11 35
(5 plots)	styraciflua	idaceae	TATA.	Auguspeiiii	Decidadous	Dillase		hadult ludult	Juty Clay loam	0.0	Q.	(())
POP-EURO FACE (18 plots)	Populus alba, Populus ni- gra, Populus x eurameri- cana	Salicaceae	БСМ	Angiosperm	Deciduous Diffuse	Diffuse	1.5	Pachic Xerum- brept	Loam and silt loam	0.04	NA	27.29

Mean N uptake in units of g N m $^{-2}$  y $^{-1}$  using the baseline scenario,  $a_1$ 

 Table 2.
 Overview of the Scenarios Used to Estimate Nitrogen Uptake Rate

Rationale	А	$U_F$ foliage $N$ uptake	$U_R$ fine root $N$ uptake	$U_W$ wood $N$ uptake		$U_{S}$ Comment
Are foliage, fine root, and wood nitrogen uptake measurements all needed?	$a_1$	Equation 3: $D_{E}$ $N_{D,F}$ in situ	Equation 2: $B_{R}$ , $N_R$ in situ; $Q_R = 0$ ; $T_R$ from TRY to lowest taxa	Equation 5: $A$ , $dbh$ , $N_{D,W}$ in situ; $H()$ from Jenkins et al. (2003) to	0	Considered the baseline measurement with the most in situ measurements and the most trusted data sources for the balance
	$a_2$	0 As in <i>a</i> <sub>1</sub> As in <i>a</i> .	As in $a_1$ 0 As in $a_2$	As in $a_1$ As in $a_1$	0 0 0	Similar to baseline except omitting foliage Similar to baseline except omitting roots Similar to baseline except omitting wood
Are in situ nitrogen concentrations needed or can trait database values be substituted? If trait database values are used, what is the best taxonomic level?	$b_1$	As in $a_1$ except $N_F \text{ from TRY}$ to PFT level; $Q_F = 0.62$	As in $a_1$ except $N_R$ from TRY to PFT level	As in $a_1$ except $N_W$ from TRY to PFT level; $Q_W = 0.24$	0	Similar to baseline except that all nutrient concentrations are taken from databases at the PFT level
	$b_2$	As in $a_1$ except $N_F$ from TRY to family level; $O_F = 0.62$	As in $a_1$ except $N_R$ from TRY to family level	As in $a_1$ except $N_W$ from TRY to family level; $Q_W = 0.24$	0	Similar to baseline except that all nutrient concentrations are taken from databases at the family level where family level is not possible, taken at PFT
	$b_3$	As in $a_1$ except $N_F \text{ from TRY}$ to genus level: $O_F = 0.62$	As in $a_1$ except $N_R$ from TRY to genus level	As in $a_1$ except $N_W$ from TRY to genus level; $Q_W = 0.24$	0	Similar to baseline except that all nutrient concentrations are taken from databases at the genus level where genus level is not nossible taken at family or PFT
	$b_4$	As in $a_1$ except $N_F$ from TRY to species level: $O_F = 0.62$	As in $a_1$ except $N_R$ from TRY to species level	As in $a_1$ except $N_W$ from TRY to species level; $Q_W = 0.24$	0	Similar to baseline except that all nutrient concentrations are taken from databases at the species level where species level is not possible, taken at genus, family, or PFT
	<i>b</i> <sub>5</sub>	As in $a_1$ except $N_F$ from TRY to PFT level; $O_F = 0.62$	As in $a_1$	As in $a_1$	0	Similar to baseline except that all foliage nutrient concentrations are taken from databases at the PFT level
	$b_6$	As in $a_1$ except $N_F$ from TRY to family level; $Q_F = 0.62$	As in $a_1$	As in $a_1$	0	Similar to baseline except that all foliage nutrient concentrations are taken from databases at the family level where family level is not possible, taken at PFT

 Table 2.
 continued

Rationale	Œ	$U_F$ foliage $N$ uptake	$U_R$ fine root $N$ uptake	$U_W$ wood $N$ uptake	$U_S$	Comment
	$b_7$	As in $a_1$ except $N_F$ from TRY to genus level; $Q_F = 0.62$	As in $a_1$	As in $a_1$	0	Similar to baseline except that all foliage nutrient concentrations are taken from databases at the genus level where genus level is not possible, taken at family or PFT
	$b_8$	As in $a_1$ except $N_F$ from TRY to species level; $Q_F = 0.62$	As in $a_1$	As in a <sub>1</sub>	0	Similar to baseline except that all foliage nutrient concentrations are taken from databases at the species level. Where species level is not possible, taken at genus, family, or PFT
	$b_9$	As in $a_1$	As in $a_1$ except $N_R$ from TRY to PFT level	As in $a_1$	0	Similar to baseline except that all fine root nutrient concentrations are taken from databases at the PFT level
	$b_{10}$	As in a <sub>1</sub>	As in $a_1$ except $N_R$ from TRY to family level	As in a <sub>1</sub>	0	Similar to baseline except that all fine root nutrient concentrations are taken from databases at the family level where family level is not possible, taken at PFT
	$b_{11}$	As in a <sub>1</sub>	As in $a_1$ except $N_R$ from TRY to genus level	As in $a_1$	0	Similar to baseline except that all fine root nutrient concentrations are taken from databases at the genus level where genus level is not nossible taken at family or PFT
	$b_{12}$	As in $a_1$	As in $a_1$ except $N_R$ from TRY to species level	As in $a_1$	0	Similar to baseline except that all fine root nutrient concentrations are taken from databases at the species level where species level is not possible, taken at genus, family, or PFT
	b <sub>13</sub>	As in $a_1$	As in $a_1$	As in $a_1$ except $N_W$ from TRY to PFT level: $O_W = 0.24$	0	Similar to baseline except that all wood nutrient concentrations are taken from databases at the PFT level
	$b_{14}$	As in a <sub>1</sub>	As in $a_1$	As in $a_1$ except $N_W$ from TRY to family level; $Q_W = 0.24$	0	Similar to baseline except that all wood nutrient concentrations are taken from databases at the family level where family level is not possible, taken at PFT
	<i>b</i> <sub>15</sub>	As in $a_1$	As in $a_1$	As in $a_1$ except $N_W$ from TRY to genus level; $Q_W = 0.24$	0	Similar to baseline except that all wood nutrient concentrations are taken from databases at the genus level where genus level is not at family or PFT
	$b_{16}$	As in a <sub>1</sub>	As in $a_1$	As in $a_1$ except $N_W$ from TRY to species level; $Q_W = 0.24$	0	Similar to baseline except that all wood nutrient concentrations are taken from databases at the species level where species level is not possible, taken at genus, family, or PFT

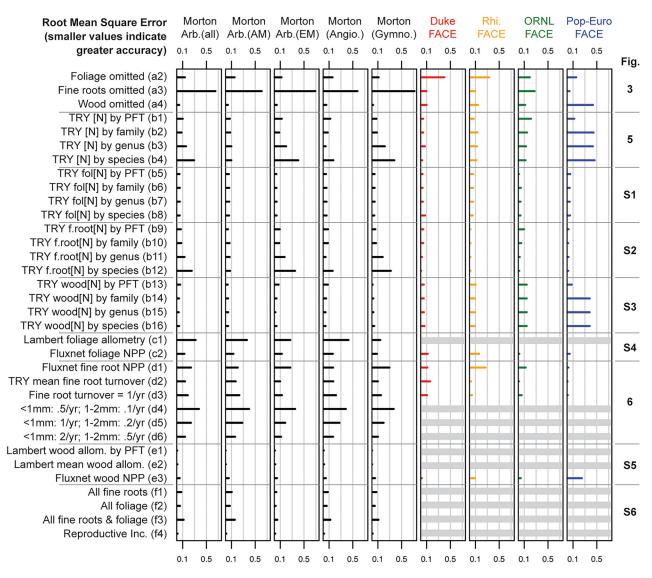
Table 2. continued

Rationale	8	$U_F$ foliage $N$ uptake	$U_R$ fine root $N$ uptake	$U_W$ wood $N$ uptake	$U_S$	Comment
Can allometric relationships or stand-level database values replace the need for in situ leaf litter production measure- ments?	$c_1$	Equation 2; $B_F$ = Lambert et al. (2005) foliage allometry; $T_F$ = TRY to lowest taxa; $N_F(1-Q_F)$ = in situ senesced foliage [N]	As in $a_1$	As in a <sub>1</sub>	0	Similar to baseline, except that foliage mass is calculated via <i>dbh</i> allometry and summed across trees within a known ground area
	22	Equation 3: $D_F$ from Flux-Net foliage NPP to PFT; $N_{\rm D,F}$ in situ	As in $a_1$	As in $a_1$	0	Similar to baseline, except that foliage NPP is taken from FluxNet. Taxonomic levels below PFT were not available
Can allometric relationships or stand-level database values replace the need for in situ fine root production measure-	$d_1$	As in $a_1$	Equation 3: $D_R$ from FluxNet fine root NPP to PFT; $N_{\rm D,R}$ in situ	As in $a_1$	0	Similar to baseline, except that fine root NPP is taken from FluxNet. Taxonomic levels below PFT were not available
ments? How much do assumptions about fine root turnover rates matter to the	$d_2$	As in $a_1$	As in $a_1$ except $T_R$ is the mean turnover from TRY (1.34 per vr)	As in $a_1$	0	Similar to baseline, except that simple assumptions are made about fine root turnover
total nitrogen uptake estimate and/or the ranking of sites by total nitrogen uptake?	$d_3$	As in $a_1$	As in $d_1$ except $T_R$ is 1 for all roots	As in $a_1$	0	Similar to baseline except that turnover rate is equal to 1 for all roots
	$d_4$	As in $a_1$	As in $a_1$ except $T_R$ is .5 for < 1 mm roots and .1 for 1–2 mm roots. $N_R$ separated into value associated with < 1 mm and 1–2 mm roots.	As in $a_1$	0	Similar to baseline except that turnover rate is equal to .5 for roots < 1 mm in diameter and .1 for roots 1–2 mm in diameter. Specific nitrogen concentrations associated with
	$d_5$	As in $a_1$	As in $a_1$ except $T_R$ is 1 for < 1 mm roots and .2 for 1–2 mm roots. $N_R$ separated into value associated with < 1 mm and 1–2 mm roots	As in a <sub>1</sub>	0	Similar to baseline except that turnover rate is equal to 1 for roots < 1 mm in diameter and .2 for roots 1–2 mm in diameter
	$d_6$	As in $a_1$	As in $a_1$ except $T_R$ is 2 for < 1 mm roots and .5 for 1– 2 mm roots. $N_R$ separated into value associated with < 1 mm and 1–2 mm roots	As in a <sub>1</sub>	0	Similar to baseline except that turnover rate is equal to 2 for roots < 1 mm in diameter and .5 for roots 1–2 mm in diameter

 $U_{\rm F},~U_{\rm R},~U_{\rm W},$  and  $U_{\rm S}$  are defined in Eq. 1.

 Table 2.
 continued

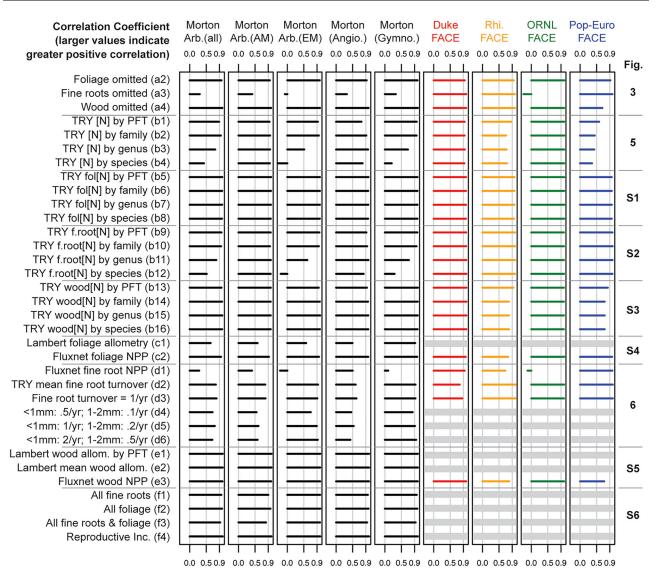
Rationale	Ð	ID $U_F$ foliage $N$ uptake	$U_R$ fine root $N$ uptake	$U_W$ wood $N$ uptake	$U_S$	Comment
Can allometric relationships or stand-level $e_1$ database values replace the need for in situ wood production measure-	$e_1$	As in $a_1$	As in $a_1$	As in $a_1$ except $H()$ from Lambert et al. (2005) to hardwood/softwood	0	Similar to baseline except using a different allometry
ments?	$e_2$	As in $a_1$	As in $a_1$	As in $a_1$ except $H()$ from Lambert et al. (2005) with no distinction btwn snn	0	Similar to baseline except using a different allometry
	$e_3$	As in $a_1$	As in $a_1$	Equation 5: $N_{D,W}$ in situ; $G_W$ from FluxNet to PFT	0	Similar to baseline except using FluxNet wood NPP
Is careful sorting of fine roots and leaf litter needed, and is it necessary to include nitrogen uptake into reproductive structures?	$f_1$	As in $a_1$	As in $a_1$ except $B_R$ includes all fine roots collected	As in $a_1$	0	Similar to baseline except that root biomass includes all fine roots collected, not only those of a plot's target species
	$\mathcal{F}_2$	As in $a_1$ except $B_F$ includes all foliage collected	As in a <sub>1</sub>	As in $a_1$	0	Similar to baseline except that foliage biomass includes all foliage collected, not only those of a plot's target species
	f <sub>3</sub>	As in $a_1$ except $B_F$ includes all foliage collected	As in $a_1$ except $B_R$ includes all fine roots collected	As in $a_1$	0	Similar to baseline except that root and foliage biomass includes all fine roots and foliage collected, not only those of a plot's target species
	$f_4$	As in $a_1$	As in $a_1$	As in $a_1$	Equation 3: $D_S$ , $N_{D,S}$ in situ	Baseline with in situ reproductive structures included



**Figure 1.** The accuracy (RMSE) of different simplified nitrogen uptake calculation scenarios as compared with the baseline scenario with all available in situ measurements. See Table 2 for descriptions of each scenario and Table S1 for a table of these values. The nature of the FACE data did not permit calculation of some scenarios as indicated by gray bars.

roots. In keeping with convention (for example, Zaehle and others 2014) and in recognition of the complications of dispersal and the basket method for collecting aboveground litter, we omit nitrogen uptake into reproduction in scenario  $a_1$  but include it in scenario  $f_4$ . We submit that the  $a_1$  scenario represents the most defensible estimate with the minimum of simplifications. Thus, we compare nitrogen uptake calculations from all other scenarios with those of  $a_1$ . Scenarios  $a_2$ ,  $a_3$ , and  $a_4$  are identical to  $a_1$  except that either foliage uptake, fine root uptake, or wood uptake are omitted, representing possible simplifications and reductions in time required to reasonably estimate stand-level nitrogen uptake.

In the second major labor- and time-saving approach to estimating nitrogen uptake, we replace some or all in situ tissue [N] values with taxa means from TRY (Table 2). Scenarios  $b_1$  through  $b_4$  replace all in situ tissue [N] with TRY data aggregated at the PFT  $(b_1)$ , the family (or PFT if family-level data are unavailable,  $b_2$ ), the genus (or nexthighest available level,  $b_3$ ), or the species (or nexthighest available level,  $b_4$ ). Because available foliage [N] data are on fresh (that is, not senesced) foliage, we used an average retranslocation fraction,  $Q_F = 0.62$  (Vergutz and others 2012, their Figure 4), to approximate the [N] in senesced foliage. Similarly, we used the average retranslocation fraction,  $Q_W = 0.24$  (Meerts 2002), to approximate



**Figure 2.** The correlation (Pearson's *r*) of different simplified nitrogen uptake calculation scenarios as compared with the baseline scenario with all available in situ measurements. See Table 2 for descriptions of each scenario and Table S2 for a table of these values. The nature of the FACE data did not permit calculation of some scenarios as indicated by gray bars.

the [N] in heartwood. The remaining b scenarios focus on individual organs. Scenarios  $b_5$  through  $b_8$  replace only foliage tissue [N] values with taxa means from TRY; scenarios  $b_9$  through  $b_{12}$  replace only fine root tissue [N] values with taxa means from TRY; and scenarios  $b_{13}$  through  $b_{16}$  replace only wood tissue [N] values with taxa means from TRY. Within each set of four, the same taxonomic hierarchy is explored (that is, PFT, family, genus, species).

Scenarios  $c_1$  and  $c_2$  explore alternative labor- and time-saving ways to estimate foliage nitrogen uptake (Table 2). Scenario  $c_1$  uses Lambert and others (2005) allometries separated by angiosperm and gymnosperm PFTs with stem diameter to estimate

foliage biomass. We combine those estimates with foliage turnover from TRY to the lowest available taxa and in situ measures of senesced foliage [N]. Scenario  $c_2$  uses FluxNet estimates of foliage NPP to PFT (which integrates biomass and turnover) and in situ measures of senesced foliage [N].

Scenarios  $d_1$  through  $d_6$  explore alternative labor- and time-saving ways to estimate fine root nitrogen uptake and the plausibility of making different assumptions about fine root turnover rates (Table 2). Analogous to scenario  $c_2$ , scenario  $d_1$  uses FluxNet estimates of fine root NPP to PFT (which integrates biomass and turnover) and in situ measures of fine root [N]. Scenario  $d_3$  uses the TRY mean fine root turnover (1.34  $y^{-1}$ ), and

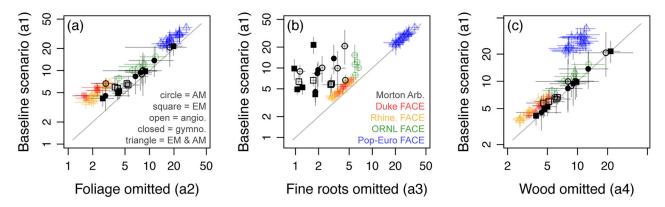


Figure 3. Nitrogen uptake rates (g N m $^{-2}$  y $^{-1}$ ) calculated via the baseline scenario (that is, as many in situ measurements as are available) versus calculations with foliage uptake omitted (a), fine root uptake omitted (b), and wood uptake omitted (c). Scenarios are explained in Table 2. Statistics for accuracy (RMSE) and correlation (r) are presented in Figures 1 and 2 and in Tables S1 and S2. Bars indicate 95% confidence intervals of the mean via bootstrap; gray lines indicate 1:1. Black symbols indicate data from the Morton Arboretum. Color symbols indicate published data from forest FACE sites: red = Duke, orange = Rhinelander, green = Oak Ridge, blue = Pop-Euro. Open symbols indicate angiosperms; closed symbols indicate gymnosperms. Squares indicate EM associations; circles indicate AM associations; and triangles indicate AM and EM associations. Note log scale.

scenario  $d_4$  uses a value of 1 y<sup>-1</sup> for fine root turnover. Scenarios  $d_4$  through  $d_6$  make separate assumptions about turnover rates of fine roots less than 1 mm and those between 1 and 2 mm (Table 2), being careful to associate the correct in situ [N] with each size class.

Scenarios  $e_1$  through  $e_3$  explore alternative approaches to estimating wood productivity (Table 2). Scenarios  $e_1$  and  $e_2$  use Lambert and others (2005) allometries separated by angiosperm and gymnosperm PFTs or not separated by angiosperm and gymnosperm PFTs, respectively. Scenario  $e_3$  uses FluxNet estimates of wood NPP to PFT (which integrates biomass and turnover) and in situ measures of hardwood [N].

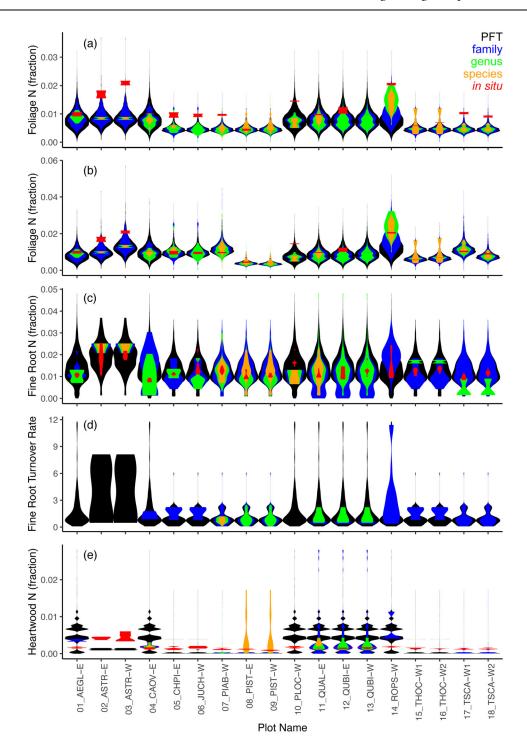
Finally, scenarios  $f_1$  through  $f_4$  determine the impact of alternative labor- and time-saving approaches for in situ measurements at the Morton Arboretum (Table 2). Scenario  $f_1$  includes all of the fine roots that were collected, including fine roots that were obviously not those of a given plot's monodominant species. Similarly, scenario  $f_2$  includes all of the foliage that was collected, including foliage that was obviously not that of a given plot's monodominant species. Scenario  $f_3$  combines  $f_1$  and  $f_2$  and thus uses all fine roots and foliage collected. Scenario  $f_4$  includes uptake into reproductive structures by using their collected dry mass per ground area and measured [N] (Eq. 3).

We present additional methodological details in the Supplemental Online Materials but summarize them briefly here. First, error is propagated in all estimates by bootstrapping over all available measurements, replicates, or subsamples 100 times. The error bars on all figures represent the approximate 95% confidence interval derived from that process. Second, database values that are unavailable for a particular species at a given taxonomic level are taken from the next higher taxonomic level that does have representative data. Third, we quantify the *accuracy* and *correlation* of a given scenario compared with the baseline scenario by measuring the root mean square error (RMSE) and correlation coefficient (respectively) between them. Smaller values of RMSE represent a more accurate scenario, whereas larger values of the correlation coefficient represent better correlation.

# RESULTS

# Are Foliage, Fine Root, and Wood Nitrogen Uptake Measurements all Needed?

Omitting foliage nitrogen uptake from calculations consistently reduced accuracy across sites and taxa but preserved correlations (Figures 1, 2, 3a). The accuracy was especially poor at Duke FACE and Rhinelander FACE. Omitting fine root nitrogen uptake from calculations had divergent results at different sites. At Morton Arboretum and Oak Ridge FACE, omitting fine roots dramatically reduced both accuracy and correlations across taxa, whereas the other FACE sites retained both accuracy and correlation (Figures 1, 2, 3b). Omitting wood nitrogen uptake from calculations largely retained accuracy and correlation at every site and



**▼Figure 4.** Distributions of trait values by plot for senesced foliage nitrogen concentration using fresh foliage nitrogen concentration data from TRY and applying a single retranslocation factor for all taxa (a), senesced foliage nitrogen concentration applying in situ retranslocation values to TRY data (b), fine root nitrogen concentration (c), fine root turnover rate (per year) (d), and heartwood nitrogen concentration assuming a single retranslocation value for TRY data (e). Color indicates the specific data source and taxonomic resolution with database data aggregated at the functional group (black), family level (blue), genus level (green), and species level (orange), as well as in situ measurements (red). The width of violins is scaled to allow nested data to be visualized and thus does not permit comparisons of sample sizes between taxonomic levels. Missing colors indicate missing data at a particular level. For (a), TRY data are on fresh foliage and thus are multiplied by (1-0.62) to adjust for retranslocation. For (d), TRY data are on sapwood and thus are multiplied by (1-0.24) to adjust for retranslocation. Note, there are no in situ fine root turnover measurements because minirhizotron tubes are, at the time of writing, still establishing. Plot names indicate monodominant species: AEGL = Aesculus glabra, ASTR = Asiminatriloba, CAOV = CarvaCHPI = Chamaecyparis pisifera, JUCH = Juniperus abies, PIST = Pinus strobus, chinensis, PIAB = PiceaPLOC = Platanus occidentalis, QUAL = QuercusQUBI = Quercus bicolor, ROPS = Robinia pseudoacacia, THOC = Thuja occidentalis, and TSCA = Tsuga canadensis. "W" and "E" refer to the plot's location (west or east) on the Morton Arboretum grounds.

across all taxa except for the coppiced system, Pop-Euro FACE, where it dramatically decreased both measures (Figures 1, 2, 3c).

Are In Situ Nitrogen Concentrations Needed or Can Trait Database Values Be Substituted? If Trait Database Values are Used, What is the Best Taxonomic Level?

We measured senesced foliage nitrogen concentration in situ at the Morton Arboretum, which helpfully sidesteps the need to measure retranslocation, but the vast majority of TRY database foliage nitrogen concentrations are on fresh foliage. Using a published general retranslocation fraction to adjust the TRY data showed that although our in situ measurements fell within the distribution of adjusted TRY data, the in situ measurements tended to fall toward the upper extreme (Figure 4a). Using taxa-specific in situ retranslocation values from the Morton Arboretum together with the TRY data generally placed the in situ measurements closer to the center of each species' distribution (Figure 4b). However, using in situ retranslocation

values together with trait database nitrogen concentrations is not a practical way to simplify nitrogen uptake calculations because if a site has in situ retranslocation values, then it necessarily has in situ senesced foliage nitrogen concentrations, obviating the need for database values. Our in situ fine root nitrogen concentration measurements fell largely within the center of the TRY database distributions (Figure 4c). Similar to foliage nitrogen retranslocation adjustments, we adjusted TRY database sapwood nitrogen concentrations using a published general retranslocation fraction to approximate heartwood nitrogen concentrations. Our in situ heartwood nitrogen concentration measurements largely fell within the adjusted TRY database distributions, but those distributions are far from normally distributed and are generally multimodal (Figure 4e). Due to the multi-year time course required to accurately assess fine root turnover, we were unable to derive species-specific estimates for taxa at the Morton Arboretum, and the availability of database estimates remains

Using trait database nitrogen concentration values had divergent effects on accuracy and correlation across sites and taxa and across different taxonomic levels of database aggregation (Figure 5). First we consider the Morton Arboretum data. Using database nitrogen concentrations was generally accurate and highly correlated for AMassociating species and, to a slightly lesser extent, angiosperms (Figures 1, 2, 5). For EM-associating species and gymnosperms, accuracy and correlation were high when tissue nitrogen concentrations were aggregated at the PFT or family level, but they became progressively worse when traits were aggregated at the genus or species level (Figures 1, 2, 5). This is largely driven by root nitrogen concentrations in EM-associating gymnosperm Tsuga canadensis, where in situ values are near the center of the trait database distributions at the PFT and family levels but which are entirely outside of the distributions at lower taxonomic levels (inspect Figure 4c for plots 17 and 18). Indeed, isolating foliage, fine root, and wood database nitrogen concentrations for Morton Arboretum data indicates that foliage and wood values are highly accurate and correlated (Figures 1, 2, S1, S3), whereas fine root values drive the patterns described above (Figures 1, 2, S2). Trait database nitrogen concentrations used for Duke FACE and Rhinelander FACE were quite accurate and wellcorrelated across tissues and taxonomic aggregation (Figures 1, 2, 5, S1, S2, S3). Trait database nitrogen concentrations used for Oak Ridge FACE were

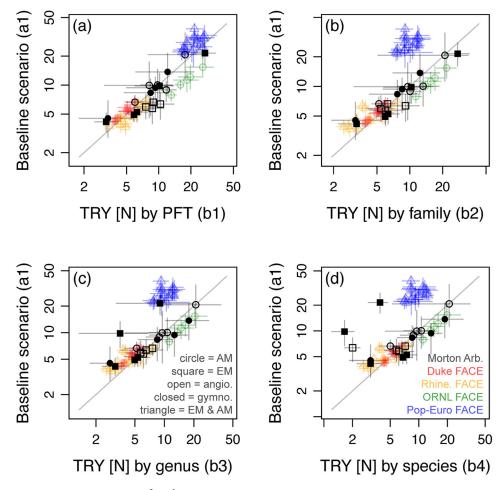


Figure 5. Nitrogen uptake rates (g N m<sup>-2</sup> y<sup>-1</sup>) calculated via the baseline scenario (that is, as many in situ measurements as are available) versus calculations that use TRY tissue nitrogen concentration data aggregated at the level of PFT ( $\mathbf{a}$ ), family ( $\mathbf{b}$ ), genus ( $\mathbf{c}$ ), and species ( $\mathbf{d}$ ). For plots without data available down to the specified taxonomic level, a higher available taxonomic level is substituted. Scenarios are explained in Table 2. Statistics for accuracy (RMSE) and correlation (r) are presented in Figures 1 and 2 and in Tables S1 and S2. Other details are explained in the Figure 3 legend. Note log scale.

highly correlated but suffered from reduced accuracy, especially at higher taxonomic levels as a consequence of mismatches in wood nitrogen concentration (Figures 1, 2, 5, S1, S2, S3). Also driven by mismatches in wood nitrogen concentration, Pop-Euro FACE exhibited the worst accuracy and correlation of all the sites (Figures 1, 2, 5, S1, S2, S3). Like the Morton Arboretum but unlike Oak Ridge FACE, the accuracy of Pop-Euro FACE declined at lower taxonomic levels.

# Can Allometric Relationships or Stand-Level Database Values Replace the Need for In Situ Leaf Litter Production Measurements?

Using Lambert and others (2005) stem diameterbased foliage allometry to approximate foliage production at Morton Arboretum was far less accurate or correlated with in situ measures than simply omitting foliage altogether (Figures 1, 2, S4a). Using PFT-level foliage production values from FluxNet sites produced estimates of nitrogen uptake that were highly correlated at all the sites and across all the taxa (Figures 2, S4b). However, only at Oak Ridge FACE and Pop-Euro FACE were the values using FluxNet foliage production accurate (Figure 1). At the Morton Arboretum, estimates using FluxNet foliage production were comparable to the accuracy of omitting foliage altogether (Figure 1). The accuracy at Duke FACE and Rhinelander FACE was comparable to that at Morton Arboretum (Figure 1).

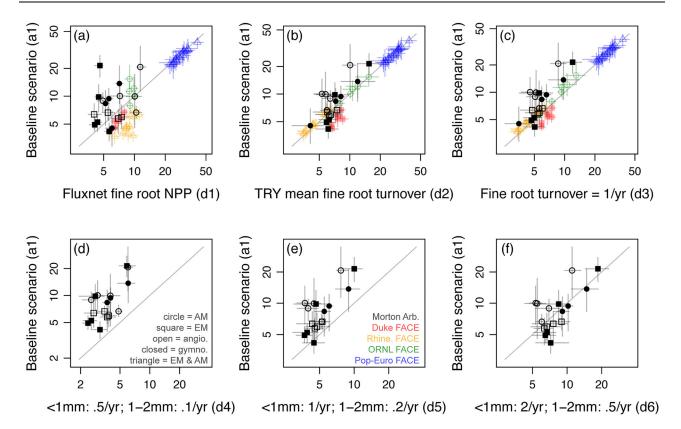


Figure 6. Nitrogen uptake rates (g N m<sup>-2</sup> y<sup>-1</sup>) calculated via the baseline scenario (that is, as many in situ measurements as are available) versus calculations using Fluxnet fine root NPP data to PFT (Luyssaert et al. 2007) (a) the grand mean fine root turnover rate from TRY data (1.338 y<sup>-1</sup>) (b), fine root turnover rate equal to 1 y<sup>-1</sup> (c), fine root turnover equal to 0.5 y<sup>-1</sup> for roots < 1 mm and 0.1 y<sup>-1</sup> for roots between 1 and 2 mm (d), fine root turnover equal to 1 y<sup>-1</sup> for roots < 1 mm and 0.2 y<sup>-1</sup> for roots between 1 and 2 mm (e), and fine root turnover equal to 2 y<sup>-1</sup> for roots < 1 mm and 0.5 y<sup>-1</sup> for roots between 1 and 2 mm (f). Appropriate FACE data were unavailable for (d, e). Scenarios are explained in Table 2. Statistics for accuracy (RMSE) and correlation (r) are presented in Figures 1 and 2 and in Tables S1 and S2. Other details are explained in the Fig. 3 legend. Note log scale.

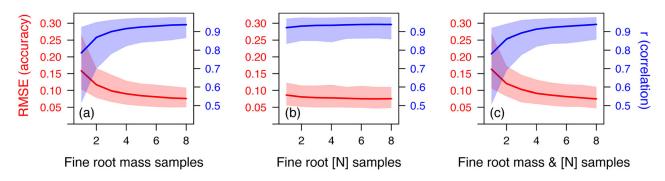


Figure 7. Power analysis of sample sizes per plot for the 18 Morton Arboretum plots: fine root biomass ( $\mathbf{a}$ ), fine root nitrogen concentration ( $\mathbf{b}$ ), or both ( $\mathbf{c}$ ). Values were randomly chosen (with replacement) from existing data 1000 times per plot at each sample size. In comparison with estimates using the full data set (that is, baseline scenario  $a_1$ ), smaller values of RMSE (red) indicate greater accuracy and larger values of r (blue) indicate greater correlation. Shaded bands show 95% confidence intervals.

Can Allometric Relationships or Stand-Level Database Values Replace the Need for In Situ Fine Root Production Measurements? How Much do Assumptions About Fine Root Turnover Rates Matter to the Total Nitrogen Uptake Estimate and/ or the Ranking of Sites by Total Nitrogen Uptake?

Using FluxNet PFT-level fine root production values led to highly inaccurate and poorly correlated nitrogen uptake estimates across all taxa at the Morton Arboretum, Rhinelander FACE, and Oak Ridge FACE (Figures 1, 2, 6a). Accuracy and correlations at Duke FACE and Pop-Euro FACE were better (Figures 1, 2, 6a). At the Morton Arboretum, using mean TRY fine root turnover (Figure 6b), turnover of once per year (Figure 6c), or three reasonable assumptions about differential fine root turnover rates for different fine root size classes (Figure 6c-e) all generated estimates of nitrogen uptake that were inaccurate and poorly correlated with the in situ measurements irrespective of taxa (Figures 1, 2). In contrast, the FACE sites generated accurate and well-correlated estimates of nitrogen uptake (Figures 1, 2) using mean TRY fine root turnover (Figure 6b) or turnover of once per year (Figure 6c), although Duke FACE was slightly less accurate or well-correlated.

Calculations of absolute nitrogen uptake rate using as few as two in situ measures of fine root nitrogen concentration per plot were accurate and well correlated with the default calculations using all eight measures per plot (Figure 7b). In contrast, we found that calculations of absolute nitrogen uptake rate required at least five in situ measures of fine root biomass per plot to approach acceptable accuracy and correlation with the default calculations using all eight measures per plot (Figure 7a, c). That said, there were still detectable improvements using six, seven, or eight measures of fine root biomass per plot (Figure 7a, c).

# Can Allometric Relationships or Stand-Level Database Values Replace the Need for In Situ Wood Production Measurements?

At Morton Arboretum, using Lambert and others (2005) stem diameter-based allometries, either at the PFT level (Figure S5a) or averaged across all taxa (Figure S5b) generated nitrogen uptake estimates that were very similar to our default Jenkins

and others (2003) allometries and thus accuracy and correlation were nearly perfect (Figures 1, 2, S5a, b). Using FluxNet PFT-level wood production values generated nitrogen uptake estimates that were accurate and well-correlated across all taxa and at every site except Pop-Euro FACE (Figures 1, 2, S5c). However, the accuracy and correlation at the Morton Arboretum was not greater than it would have been by omitting wood altogether (Figure 1).

# Is Careful Sorting of Fine Roots and Leaf Litter Needed, and is it Necessary to Include Nitrogen Uptake into Reproductive Structures?

With the exception of the plots of two species, the AM-associating gymnosperm *Juniperus chinensis* and the AM-associating angiosperm *Asimina triloba*, the Morton Arboretum nitrogen uptake estimates were very similar (Figures 1, 2) irrespective of whether fine roots (Figure S6a), foliage (Figure S6b), or fine roots and foliage (Figure S6c) were sorted to target species. In addition, including nitrogen uptake into reproductive structures had negligible effects on nitrogen uptake estimates (Figures 1, 2, S6).

#### DISCUSSION

Calculating the absolute nitrogen uptake rate of forests under natural conditions provides insights into a range of basic and applied ecological questions, most notably questions concerning forest carbon sequestration in prevalent nitrogen-limited conditions (Fisher and others 2012; Brzostek and others 2014). However, the standard methods required to measure absolute forest nitrogen uptake are data and labor intensive. Here, we found ways in which those methods could be simplified with a minimum loss of fidelity.

# The Importance of Uptake into Foliage, Fine Roots, and Wood

Using PFT-level estimates of foliage and wood production produced similar correlations and maintained or improved accuracy relative to scenarios in which these pools were omitted from total nitrogen uptake estimates, indicating that in situ measurements of foliage and wood production may not be necessary for estimating total nitrogen uptake or assessing relative uptake rates within and across sites. Across plots and taxa, omitting foliage nitrogen uptake rate or wood nitrogen uptake rate

largely preserved relative rankings of stands within a given site (Figures 2, 3a, c) but had modest (the Morton Arboretum) to severe (FACE sites) impacts on accuracy (Figures 1, 3a, c). The relative rankings are preserved because a similar fraction of nitrogen is allocated to foliage and a similar fraction of nitrogen is allocated to wood at a given site. Thus, omitting these fractions does not affect the plots' relative rankings. However, the sites differed in the absolute amount of nitrogen allocated to foliage or wood, and thus measures of accuracy suffered in proportion to the magnitude of allocation. Specifically, foliage nitrogen uptake was well correlated with total nitrogen uptake across sites, so although omitting this component reduced total nitrogen uptake rate estimate accuracy (Figures 1, 3a), it maintained plot ranking (Figures 2, 3a). Replacing in situ measurements of foliage biomass production rates with FluxNet NPP values at the PFT level increased or maintained accuracy relative to omissions and produced comparable correlations (Figures 1, 2, 3a, S4b). Similarly, when wood nitrogen uptake was a major component of total nitrogen uptake, FluxNet wood NPP values also improved nitrogen uptake estimates relative to omitting wood entirely (Figures 1, 2, 3c, S5c), although they tended to underestimate total nitrogen uptake at Pop-Euro FACE.

Relatively low accuracy and correlations among several fine root turnover scenarios suggest that collecting plot and species-specific fine root turnover rate data is critical for accurately estimating total nitrogen uptake rates. Because fine root nitrogen uptake does not appear to be correlated with aboveground nitrogen uptake, omitting roots dramatically decreased accuracy in and correlations with total nitrogen uptake estimates (Figures 1, 2, 3b). Simplifications involving fine root nitrogen uptake had a large impact on both accuracy and ranking at Oak Ridge FACE and across all taxa at the Morton Arboretum (Figures 1, 2, 3b, 6). Omitting fine root nitrogen uptake there would have made any ranking of plots impossible (correlations ranged from 0.42 at best to -0.24 at worst). Using different simplifying assumptions about fine root turnover rates was generally better than omitting fine root nitrogen uptake entirely, but accuracy and correlations were still quite poor, especially at Duke FACE and the Morton Arboretum (Figures 1, 2, 6b-f). Collecting fine root biomass data in situ and applying a uniform fine root turnover rate (for example, Whittaker and others 1979) was an improvement over omitting fine roots entirely.

# Using Trait Database Values

Tissue nitrogen concentrations may be an area where useful simplifications can be made using database values when in situ measurements are unavailable. Further, data aggregation at the PFT level, where many data exist, would be a better approach than using data aggregated at lower taxonomic levels, where fewer data exist. At the Morton Arboretum, accuracy and correlations were generally good when the tissue nitrogen data were aggregated at the PFT level but became progressively worse when they were aggregated at the family, genus, and species levels (Figures 1, 2, 5, S1, S2, S3). Pop-Euro FACE exhibited a similar pattern. Duke FACE and Rhinelander FACE were similarly accurate and well-correlated when using tissue nitrogen data aggregated at any taxonomic level, and Oak Ridge FACE accuracy and correlation improved slightly at lower taxonomic levels (Figures 1, 2, 5, S1, S2, S3). Taken together however, any presumed benefit of species-specific tissue nitrogen traits evidently does not outweigh the negative effects of smaller species-specific sample sizes or idiosyncratic trait database or site-specific values.

# Differences Among Taxa and Mycorrhizal Association

The accuracy and correlation of root nitrogen concentration and turnover parameterization simplifications depended somewhat on tree mycorrhizal associations and taxonomy. For EM and gymnosperm species, nitrogen uptake accuracy and correlations were best when root nitrogen concentrations were taken at the family or PFT level. This pattern appears to be driven by two species in particular, T. canadensis and Quercus alba. TRY did not contain species-level fine root nitrogen concentrations for *T. canadensis* and *Tsuga* genus values underestimated T. canadensis fine root nitrogen concentrations. Quercus alba estimates were also improved when higher-level nitrogen concentrations values were used despite the availability of species-level root nitrogen concentration values in databases. Similarly, family-level wood nitrogen values led to underestimations of Populus wood nitrogen concentrations at Pop-Euro FACE that were corrected when values were taken at the PFT level. In contrast, while all root turnover choices reduced the accuracy of nitrogen uptake rate calculations, EM and gymnosperm stands maintained their ranks whereas AM and angiosperm species did not. Further studies are needed to determine whether these mycorrhizal association and plant taxonomic patterns were driven by a few species that happened to be in our dataset or if these are general patterns.

#### Caveats

We have attempted to provide accurate in situ estimates of absolute nitrogen uptake rate for comparison with a comprehensive collection of alternative estimation scenarios. However, we have no epistemic insight into the actual accuracy of our in situ estimates, and there are several aspects of our measurements that remain uncertain. First, although we did measure stem diameter and stem diameter growth rates in situ, we converted those measurements into wood productivity via allometric equations developed elsewhere (Jenkins and others 2003). Nevertheless, nitrogen uptake into wood was much smaller than uptake into foliage or fine roots at the Morton Arboretum (Figure 3), and even if it increased by several factors, it would remain the smallest component.

Second, estimates of fine root nitrogen uptake, in contrast to wood uptake, played a huge role in determining total nitrogen uptake rates at the Morton Arboretum, and we assumed that nitrogen retranslocation from fine roots is zero, a position best supported by data (Gordon and Jackson 2000) but nearly impossible to verify (Kunkle and others 2009). Additionally, our estimate of fine root nitrogen uptake depended on database values for fine root turnover, which may differ from in situ measurements. Finally, we treated all roots < 2mm as "fine roots," a classification routinely made in the literature (McCormack and others 2015). However, any single size cutoff—especially across taxa—is now known to be a coarse and somewhat arbitrary cutoff on a gradient between the smallest roots (which are responsible for acquisition and interaction with the rhizosphere) and larger roots (which are responsible for support and transport) (McCormack and others 2015). Beyond these considerations, belowground measurements are simply more difficult that aboveground measurements; however, our power analysis of fine root biomass sampling (Figure 7) suggests that our sample size for the Morton Arboretum plots (8 replicates) was likely adequate.

A third more general caveat relates to the nature of trait database values that are drawn from a wide and not necessarily representative collection across ecological gradients (Kattge and others 2011), such as the TRY database values we use here. Although most of the variation across all of the TRY traits is

between species, up to 40% of the variation may be within species (Kattge and others 2011). In light of this, we recommend, whenever possible, using trait data collected from plants growing in similar ecological conditions to those of the study plots.

A fourth and final general caveat relates to the relatively small number of sites from which we draw data and their inevitably idiosyncratic nature. For example, the POP-Euro FACE site was evidently not nitrogen limited (Finzi and others 2007), but any affect that might have had on nitrogen uptake rate simplifications is conflated with the other idiosyncratic fact that the site was coppiced and thus likely deviated from natural allocation patterns. All five sites utilize plots that are monodominant, which is convenient for linking plant traits to their ecosystem-level consequences but does not necessarily represent diverse forests (for example, Zhang and others 2012). It is possible that interspecific interactions in diverse forests may change nitrogen uptake patterns. Although one may be tempted to weight species-specific traits by basal area, a slightly better approach would be to allometrically approximate crown area as stem diameter raised to the 1.4 power (Dybzinski and others 2011, their Appendix A). All five sites are in the temperate forest biome, limiting the inferences that can be made in other biomes. In addition, all four forest FACE sites were relatively young (Table 1), limiting the inferences that can be made to mature secondary and old growth forests.

# Takeaways for Minimal-Effort Absolute Nitrogen Uptake Rate Measurements in Monodominant Stands

• Are foliage, fine root, and wood nitrogen uptake measurements all needed? The answer clearly depended on the site, with different sites exhibiting greater uptake (and thus sensitivity) to different organs. Thus, we recommend that researchers undertake as complete a set of absolute nitrogen uptake rate measurements as possible on a small subsample of plots and use the information gleaned to possibly omit uptake into low-sensitivity organs on the balance of plots. Indeed, it would have been possible to identify each of our five sites' greatest sensitivities with no more than three completely sampled plots (inspect Figure 3). With that information at the Morton Arboretum, for example, we could have skipped measurements of nitrogen uptake into wood with practically no loss of accuracy (Figure 1) or

- rank (Figure 2). Alternatively, many sites will already have measurements of biomass allocation to foliage, wood, and roots that can guide researcher time and effort toward organs with large or variable allocation and away from organs with low or consistent allocation.
- Are in situ nitrogen concentrations needed or can trait database values be substituted? If trait database values are used, what is the best taxonomic level? Using in situ measurements of tissue nitrogen concentrations to calculate absolute nitrogen uptake rates was appreciably better than using tissue nitrogen concentrations from a trait database. However, the negative impact to accuracy (Figure 1) and rank (Figure 2) was not so great, especially when the trait data were drawn at the PFT or family level. Thus, if limited time or research effort could be better spent elsewhere, we do not see a large disadvantage to using tissue nitrogen concentrations aggregated at high taxonomic levels (PFT or family). Moreover, researchers can determine if their species are well-represented or poorly represented in trait databases. Poorly represented species would be more deserving of in situ measurements.
- Can allometric relationships or stand-level database values replace the need for in situ leaf litter, fine root, and/or wood production measurements? At all five sites, using FluxNet foliage, fine root, or wood NPP to PFT to calculate that component of nitrogen uptake had similar accuracy (Figure 1) and rank (Figure 2) compared with omitting foliage, fine root, or wood uptake, respectively. Thus, these NPP substitutions were bad when the uptake calculation was sensitive to the organ in question, and they were of little consequence when the uptake calculation was insensitive to the organ in question. Separately, using stem diameter-related allometric equations to estimate foliage biomass was always much worse than simply omitting foliage. Thus, we do not advise using stand-level database NPP values or estimating foliage biomass allometrically.
- How much do assumptions about fine root turnover rates matter to the total nitrogen uptake estimate and/or the ranking of sites by total nitrogen uptake? At sites where total absolute nitrogen uptake rates were sensitive to uptake into fine roots, assumptions about fine root turnover rates mattered a lot (Figures 1, 2). Thus, we strongly recommend including robust in situ measures of fine root turnover and note that sites that already have established minirhizotron tubes and the person power to collect and analyze their images are well-situated to undertake the other, relatively easier

- measurements required to calculate absolute nitrogen uptake rates. If in situ fine root turnover rates are simply unavailable, we recommend using mean database values to PFT but also recommend noting the considerable uncertainty associated with that approach.
- Is careful sorting of fine roots and leaf litter needed, and is it necessary to include nitrogen uptake into reproductive structures? Neither the sorting of fine roots and litter, nor inclusion of reproductive structures had much impact on the accuracy (Figure 1) or rank (Figure 2) of absolute nitrogen uptake rate calculations. Thus, if limited time or research effort could be better spent elsewhere, we do not see a large advantage to sorting fine roots or foliage or for measuring nitrogen uptake into reproductive structures, at least in monodominant stands. That said, none of our species were masting in the year of measurement; including nitrogen uptake into reproductive structures may matter in a masting year.
- Are the results of any simplifications systematically different for major plant groups, including mycorrhizal associations or plant divisions? Given the recommendations above, we found no appreciable differences between AM-associating and EM-associating species or between angiosperms and gymnosperms that would recommend any differences in the simplifications used to calculate absolute nitrogen uptake rates (Figures 1, 2). However, all of our insights were derived from monodominant stands; whether or how these simplifications may be applied in diverse forests is an open question.

#### ACKNOWLEDGEMENTS

We thank Michelle Catania and Rachel Sims, who assisted us in collecting litters and sorting roots; Ross Alexander, who trained us in tree core collection and separating heartwood from sapwood; and the Morton Arboretum's Natural Resources and Arborist crews for maintaining the forestry plots and facilitating access to the forestry plots. We also thank Soils Lab volunteers, including Cathy Davidson, Rosie McVay, Bob Kusiolek, Morgan Brown, and Don Thomka, who tirelessly sorted leaf and reproductive litters. Ella Segal, Perry Giambuzzi, and Jamilys Rivera were supported by the National Science Foundation's Research Experiences for Undergraduates program, Integrated Tree Science in the Anthropocene (Division of Biological Infrastructure, Award #1851961). Caylin Wiggins was supported by the Morton Arboretum Center for Tree Science's Research Technician Fellowship. Additional research funding was provided by a Center for Tree Science Early Career Fellowship awarded to Ray Dybzinski.

#### DATA AVAILABILITY

Data and novel source code are available in Dryad at https://doi.org/10.5061/dryad.6hdr7sr66.

#### REFERENCES

- Borer ET, Harpole WS, Adler PB, Lind EM, Orrock JL, Seabloom EW, Smith MD. 2014. Finding generality in ecology: a model for globally distributed experiments. Methods Ecol Evol 5:65.
- Brzostek ER, Fisher JB, Phillips RP. 2014. Modeling the carbon cost of plant nitrogen acquisition: Mycorrhizal trade-offs and multipath resistance uptake improve predictions of retranslocation. Journal of Geophysical Research: Biogeosciences 119:1684–1697.
- Cabal C. 2022. Root tragedy of the commons: Revisiting the mechanisms of a misunderstood theory. Front Plant Sci 13:960942.
- Cheng W, Parton WJ, Gonzalez-Meler MA, Phillips R, Asao S, McNickle GG, Brzostek E, Jastrow JD. 2014. Synthesis and modeling perspectives of rhizosphere priming. New Phytologist 201:31–44.
- Claus A, George E. 2011. Effect of stand age on fine-root biomass and biomass distribution in three European forest chronose-quences. Canadian Journal of Forest Research. https://doi.org/10.1139/x05-079. Last accessed 10/03/2021.
- Covington WW, Aber JD. 1980. Leaf Production During Secondary Succession in Northern Hardwoods. Ecology 61:200–204.
- Dybzinski R, Farrior C, Wolf A, Reich PB, Pacala SW. 2011. Evolutionarily Stable Strategy Carbon Allocation to Foliage, Wood, and Fine Roots in Trees Competing for Light and Nitrogen: An Analytically Tractable, Individual-Based Model and Quantitative Comparisons to Data. The American Naturalist 177:153–166.
- Dybzinski R, Farrior CE, Pacala SW. 2015. Increased forest carbon storage with increased atmospheric  $CO_2$  despite nitrogen limitation: a game-theoretic allocation model for trees in competition for nitrogen and light. Glob Change Biol 21:1182–1196.
- Dybzinski R, Kelvakis A, McCabe J, Panock S, Anuchitlertchon K, Vasarhelyi L, McCormack ML, McNickle GG, Poorter H, Trinder C, Farrior CE. 2019. How are nitrogen availability, fine-root mass, and nitrogen uptake related empirically? Implications for models and theory. Global Change Biology 25:885–899.
- Finzi AC, Norby RJ, Calfapietra C, Gallet-Budynek A, Gielen B, Holmes WE, Hoosbeek MR, Iversen CM, Jackson RB, Kubiske ME, Ledford J, Liberloo M, Oren R, Polle A, Pritchard S, Zak DR, Schlesinger WH, Ceulemans R. 2007. Increases in nitrogen uptake rather than nitrogen-use efficiency support higher rates of temperate forest productivity under elevated CO2. Proc Natl Acad Sci U S A 104:14014–14019.
- Fisher JB, Badgley G, Blyth E. 2012. Global nutrient limitation in terrestrial vegetation. Global Biogeochemical Cycles 26. h

- ttps://doi.org/10.1029/2011GB004252. Last accessed 06/07/2020
- Freschet GT, Roumet C, Comas LH, Weemstra M, Bengough AG, Rewald B, Bardgett RD, De Deyn GB, Johnson D, Klimesova J, Lukac M, McCormack ML, Meier IC, Pages L, Poorter H, Prieto I, Wurzburger N, Zadworny M, Bagniewska-Zadworna A, Blancaflor EB, Brunner I, Gessler A, Hobbie SE, Iversen CM, Mommer L, Picon-Cochard C, Postma JA, Rose L, Ryser P, Scherer-Lorenzen M, Soudzilovskaia NA, Sun T, Valverde-Barrantes OJ, Weigelt A, York LM, Stokes A. 2021. Root traits as drivers of plant and ecosystem functioning: current understanding, pitfalls and future research needs. New Phytol 232:1123–1158.
- Gordon WS, Jackson RB. 2000. Nutrient Concentrations in Fine Roots. Ecology 81:275–280.
- Guerrieri R, Templer P, Magnani F. 2021. Canopy Exchange and Modification of Nitrogen Fluxes in Forest Ecosystems. Curr for Rep 7:115–137.
- Hendrey GR, Ellsworth DS, Lewin KF, John Nagy. 1999. A freeair enrichment system for exposing tall forest vegetation to elevated atmospheric CO2. Global Change Biology 5:293–309.
- Henneron L, Kardol P, Wardle DA, Cros C, Fontaine S. 2020. Rhizosphere control of soil nitrogen cycling: a key component of plant economic strategies. New Phytologist 228:1269–1282.
- Hobbie SE. 1992. Effects of plant species on nutrient cycling. Trends in Ecology & Evolution 7:336–339.
- Hobbie SE. 2015. Plant species effects on nutrient cycling: revisiting litter feedbacks. Trends in Ecology & Evolution 30:357–363.
- Iversen CM. 2010. Digging deeper: fine-root responses to rising atmospheric CO<sub>2</sub> concentration in forested ecosystems. New Phytologist 186:346–357.
- Jagodzinski AM, Kalucka I. 2011. Fine root biomass and morphology in an age-sequence of post-agricultural *Pinus sylvestris* L. stands. Dendrobiology 66:71–84.
- Jagodzinski AM, Ziółkowski J, Warnkowska A, Prais H. 2016. Tree Age Effects on Fine Root Biomass and Morphology over Chronosequences of *Fagus sylvatica, Quercus robur* and *Alnus glutinosa* Stands. PLOS ONE 11:e0148668.
- Jenkins JC, Chojnacky DC, Heath LS, Birdsey RA. 2003. National-Scale Biomass Estimators for United States Tree Species. Forest Science 49:12–35.
- Joseph J, Luster J, Bottero A, Buser N, Baechli L, Sever K, Gessler A. 2021. Effects of drought on nitrogen uptake and carbon dynamics in trees. Tree Physiol 41:927–943.
- Karnosky DF, Mankovska B, Percy K, Dickson RE, Podila GK, Sober J, Noormets A, Hendrey G, Coleman MD, Kubiske M, Pregitzer KS, Isebrands JG. 1999. Effects of Tropospheric O<sub>3</sub> on Trembling Aspen and Interaction with CO<sub>2</sub>: Results from an O<sub>3</sub>-Gradient and a Face Experiment. Water, Air, δ Soil Pollution 116:311–322.
- Karnosky DF, Pregitzer KS, Zak DR, Kubiske ME, Hendrey GR, Weinstein D, Nosal M, Percy KE. 2005. Scaling ozone responses of forest trees to the ecosystem level in a changing climate. Plant, Cell & Environment 28:965–981.
- Kattge J, Diaz S, Lavorel S, Prentice C, Leadley P, Boenisch G, Garnier E, Westoby M, Reich PB, Wright IJ, Cornelissen JHC, Violle C, Harrison SP, van Bodegom PM, Reichstein M, Enquist BJ, Soudzilovskaia NA, Ackerly DD, Anand M, Atkin O,

- Bahn M, Baker TR, Baldocchi D, Bekker R, Blanco CC, Blonder B, Bond WJ, Bradstock R, Bunker DE, Casanoves F, Cavender-Bares J, Chambers JQ, Chapin FS, Chave J, Coomes D, Cornwell WK, Craine JM, Dobrin BH, Duarte L, Durka W, Elser J, Esser G, Estiarte M, Fagan WF, Fang J, Fernandez-Mendez F, Fidelis A, Finegan B, Flores O, Ford H, Frank D, Freschet GT, Fyllas NM, Gallagher RV, Green WA, Gutierrez AG, Hickler T, Higgins SI, Hodgson JG, Jalili A, Jansen S, Joly CA, Kerkhoff AJ, Kirkup D, Kitajima K, Kleyer M, Klotz S, Knops JMH, Kramer K, Kuehn I, Kurokawa H, Laughlin D, Lee TD, Leishman M, Lens F, Lenz T, Lewis SL, Lloyd J, Llusia J, Louault F, Ma S, Mahecha MD, Manning P, Massad T, Medlyn BE, Messier J, Moles AT, Mueller SC, Nadrowski K, Naeem S, Niinemets U, Noellert S, Nueske A, Ogaya R, Oleksyn J, Onipchenko VG, Onoda Y, Ordonez J, et al. 2011. TRY—a global database of plant traits. Glob Change Biol 17:2905-2935.
- Kunkle JM, Walters MB, Kobe RK. 2009. Senescence-related changes in nitrogen in fine roots: mass loss affects estimation. Tree Physiology 29:715–723.
- Lambert M-C, Ung C-H, Raulier F. 2005. Canadian national tree aboveground biomass equations. Can J for Res 35:1996–2018.
- LeBauer DS, Treseder KK. 2008. Nitrogen Limitation of Net Primary Productivity in Terrestrial Ecosystems Is Globally Distributed. Ecology 89:371–379.
- Luyssaert S, Inglima I, Jung M, Richardson AD, Reichstein M, Papale D, Piao SL, Schulze E-D, Wingate L, Matteucci G, Aragao L, Aubinet M, Beer C, Bernhofer C, Black KG, Bonal D, Bonnefond J-M, Chambers J, Ciais P, Cook B, Davis KJ, Dolman AJ, Gielen B, Goulden M, Grace J, Granier A, Grelle A, Griffis T, Grünwald T, Guidolotti G, Hanson PJ, Harding R, Hollinger DY, Hutyra LR, Kolari P, Kruijt B, Kutsch W, Lagergren F, Laurila T, Law BE, Maire GL, Lindroth A, Loustau D, Malhi Y, Mateus J, Migliavacca M, Misson L, Montagnani L, Moncrieff J, Moors E, Munger JW, Nikinmaa E, Ollinger SV, Pita G, Rebmann C, Roupsard O, Saigusa N, Sanz MJ, Seufert G, Sierra C, Smith M-L, Tang J, Valentini R, Vesala T, Janssens IA. 2007. CO<sub>2</sub> balance of boreal, temperate, and tropical forests derived from a global database. Global Change Biology 13:2509–2537.
- Ma L, Xu X, Zhang C, Lv Y, Liu G, Zhang Q, Feng J, Wang R. 2021. Strong non-growing season N uptake by deciduous trees in a temperate forest: A N-15 isotopic experiment. J Ecol 109:3752–3766.
- McCormack ML, Dickie IA, Eissenstat DM, Fahey TJ, Fernandez CW, Guo D, Helmisaari H-S, Hobbie EA, Iversen CM, Jackson RB, Leppälammi-Kujansuu J, Norby RJ, Phillips RP, Pregitzer KS, Pritchard SG, Rewald B, Zadworny M. 2015. Redefining fine roots improves understanding of below-ground contributions to terrestrial biosphere processes. New Phytologist 207:505–518.
- Meerts P. 2002. Mineral nutrient concentrations in sapwood and heartwood: a literature review. Annals of Forest Science 59:713–722.
- Meier IC, Finzi AC, Phillips RP. 2017. Root exudates increase N availability by stimulating microbial turnover of fast-cycling N pools. Soil Biology and Biochemistry 106:119–128.
- Midgley MG, Sims RS. 2020. Mycorrhizal Association Better Predicts Tree Effects on Soil Than Leaf Habit. Frontiers in Forests and Global Change 3. https://doi.org/10.3389/ffgc.20 20.00074. Last accessed 28/11/2022
- Miglietta F, Peressotti A, Vaccari FP, Zaldei A, DeAngelis P, Scarascia-Mugnozza G. 2001. Free-air CO<sub>2</sub> enrichment

- (FACE) of a poplar plantation: the POPFACE fumigation system. New Phytologist 150:465–476.
- Nadelhoffer KJ, Aber JD, Melillo JM. 1984. Seasonal patterns of ammonium and nitrate uptake in nine temperate forest ecosystems. Plant and Soil 80:321–335.
- Nadelhoffer KJ, Aber JD, Melillo JM. 1985. Fine Roots, Net Primary Production, and Soil Nitrogen Availability: A New Hypothesis. Ecology 66:1377–1390.
- Näsholm T, Högberg P, Franklin O, Metcalfe D, Keel SG, Campbell C, Hurry V, Linder S, Högberg MN. 2013. Are ectomycorrhizal fungi alleviating or aggravating nitrogen limitation of tree growth in boreal forests? New Phytologist 198:214–221.
- Norby RJ, Todd DE, Fults J, Johnson DW. 2001. Allometric determination of tree growth in a  $CO_2$ -enriched sweetgum stand. New Phytologist 150:477–487.
- Pastor J, Aber JD, McClaugherty CA, Melillo JM. 1984. Above-ground Production and N and P Cycling Along a Nitrogen Mineralization Gradient on Blackhawk Island, Wisconsin. Ecology 65:256–268.
- Phillips RP, Meier IC, Bernhardt ES, Grandy AS, Wickings K, Finzi AC. 2012. Roots and fungi accelerate carbon and nitrogen cycling in forests exposed to elevated CO<sub>2</sub>. Ecology Letters 15:1042–1049.
- Pinay G, Ruffinoni C, Fabre A. 1995. Nitrogen Cycling in Two Riparian Forest Soils under Different Geomorphic Conditions. Biogeochemistry 30:9–29.
- Ruess RW, Cleve KV, Yarie J, Viereck LA. 1996. Contributions of fine root production and turnover to the carbon and nitrogen cycling in taiga forests of the Alaskan interior. Can J for Res 26:1326–1336.
- Schimel JP, Bennett J. 2004. Nitrogen Mineralization: Challenges of a Changing Paradigm. Ecology 85:591–602.
- Tateno R, Takeda H. 2010. Nitrogen uptake and nitrogen use efficiency above and below ground along a topographic gradient of soil nitrogen availability. Oecologia 163:793–804.
- Usman S, Singh SP, Rawat YS. 1999. Fine Root Productivity and Turnover in Two Evergreen Central Himalayan Forests. Annals of Botany 84:87–94.
- Vergutz L, Manzoni S, Porporato A, Novais RF, Jackson RB. 2012. Global resorption efficiencies and concentrations of carbon and nutrients in leaves of terrestrial plants. Ecological Monographs 82:205–220.
- Walker AP, De Kauwe MG, Bastos A, Belmecheri S, Georgiou K, Keeling RF, McMahon SM, Medlyn BE, Moore DJP, Norby RJ, Zaehle S, Anderson-Teixeira KJ, Battipaglia G, Brienen RJW, Cabugao KG, Cailleret M, Campbell E, Canadell JG, Ciais P, Craig ME, Ellsworth DS, Farquhar GD, Fatichi S, Fisher JB, Frank DC, Graven H, Gu L, Haverd V, Heilman K, Heimann M, Hungate BA, Iversen CM, Joos F, Jiang M, Keenan TF, Knauer J, Körner C, Leshyk VO, Leuzinger S, Liu Y, MacBean N, Malhi Y, McVicar TR, Penuelas J, Pongratz J, Powell AS, Riutta T, Sabot MEB, Schleucher J, Sitch S, Smith WK, Sulman B, Taylor B, Terrer C, Torn MS, Treseder KK, Trugman AT, Trumbore SE, van Mantgem PJ, Voelker SL, Whelan ME, Zuidema PA. 2021. Integrating the evidence for a terrestrial carbon sink caused by increasing atmospheric CO<sub>2</sub>. New Phytologist 229:2413–2445.
- Wang Z, Wang C. 2021. Magnitude and mechanisms of nitrogen-mediated responses of tree biomass production to elevated CO<sub>2</sub>: A global synthesis. J Ecol. https://www.webofscience.com/wos/woscc/summary/marked/relevance/1. Last accessed 13/12/2021

- Wen Z, White PJ, Shen J, Lambers H. 2022. Linking root exudation to belowground economic traits for resource acquisition. New Phytologist 233:1620–1635.
- Whittaker RH, Likens GE, Bormann FH, Easton JS, Siccama TG. 1979. The Hubbard Brook Ecosystem Study: Forest Nutrient Cycling and Element Behavior. Ecology 60:203–220.
- Zaehle S, Medlyn BE, De Kauwe MG, Walker AP, Dietze MC, Hickler T, Luo Y, Wang Y-P, El-Masri B, Thornton P, Jain A, Wang S, Warlind D, Weng E, Parton W, Iversen CM, Gallet-Budynek A, McCarthy H, Finzi AC, Hanson PJ, Prentice IC, Oren R, Norby RJ. 2014. Evaluation of 11 terrestrial carbon-nitrogen cycle models against observations from two temperate Free-Air CO<sub>2</sub> Enrichment studies. New Phytol 202:803–822.
- Zhang Y, Chen HYH, Reich PB. 2012. Forest productivity increases with evenness, species richness and trait variation: a global meta-analysis. J Ecol 100:742–749.

Springer Nature or its licensor (e.g. a society or other partner) holds exclusive rights to this article under a publishing agreement with the author(s) or other rightsholder(s); author selfarchiving of the accepted manuscript version of this article is solely governed by the terms of such publishing agreement and applicable law.