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# Nitrite accumulation and nitrogen gas production increase with decreasing temperature in urea-amended soils: Experiments and modeling

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#### ABSTRACT

Nitrite (NO<sub>2</sub>) accumulation and associated production of nitric oxide (NO) and nitrous oxide (N<sub>2</sub>O) gases in soils amended with nitrogen (N) fertilizers are well documented, but there remains a poor understanding of their regulation and variation among soil types. We examined responses to urea inputs in two soils at five temperatures from 5 to 30 °C and developed a process-driven model to describe the dynamics. A microcosm system was used to measure ammonia gas (NH<sub>3</sub>), ammonium (NH<sub>4</sub><sup>+</sup>), NO<sub>2</sub><sup>-</sup>, nitrate (NO<sub>3</sub><sup>-</sup>), NO, N<sub>2</sub>O and pH over 12 weeks. Unexpectedly, NO2, NO and N2O production tended to increase as soil temperature declined in both soils. The maximum NO<sub>2</sub> concentration, or compensation point (CP), differed by soil type but the time required to reach CP decreased exponentially with increasing temperature in both soils. A two-step nitrification model ('2SN') accounted for interactions of ammonia-oxidation (AmO), nitrite oxidation (NiO), urea hydrolysis, NH<sup>+</sup><sub>4</sub> sorption, N gas production and pH dynamics. Both steps of nitrification (AmO and NiO) were modeled using NH<sub>3</sub> inhibition kinetics. The model adequately simulated the observed dynamics and temperature responses and showed that increased uncoupling of AmO and NiO at colder temperatures resulted from their differential temperature responses. The dynamics observed here may be important following high-rate and banded N fertilizer applications and in ruminant urine patches. The results may help explain elevated N2O emissions observed under cold temperatures. The 2SN model can account for interactions among multiple processes and may be useful for studying the effects of management practices and climate factors, including climate change scenarios, on soil N cycling.

#### 1. Introduction

Nitrite  $(NO_2^-)$  is often overlooked in soil nitrogen (N) studies due to its frequent presence at low concentrations relative to ammonium  $(NH_4^+)$  and/or nitrate  $(NO_3^-)$ . However, it has been known for decades that  $NO_2^-$  can accumulate and persist for weeks following N fertilizer application (Chapman and Liebig, 1952; Chalk et al., 1975). This phenomenon is most commonly observed following application of urea, the predominant form of N fertilizer globally, and anhydrous ammonia, an important N source in the USA (FAO, 2019). Nitrite also accumulates following deposition of ruminant urine (Clough et al., 2003). The association of elevated  $NO_2^-$  with nitric oxide (NO) and nitrous oxide  $(N_2O)$  gas

production is also well-documented (Venterea and Rolston, 2000c; Tenuta and Beauchamp, 2003; Maharjan and Venterea, 2013; Ma et al., 2015). Nitrite accumulation is favored by elevated pH and  $NH_{\tau}^{+}$ , which together promote ammonia ( $NH_3$ ) volatilization (AmV) (Clough et al., 2003). Thus, the conditions that favor  $NO_2^-$  are also conducive to N losses in multiple forms. However, our understanding of the underlying processes, and our ability to manage them, are limited.

It is generally agreed that  $NO_2^-$  accumulation results from a divergence, or 'uncoupling', of the two steps of nitrification, i.e., when AmO proceeds faster than NiO (Burns et al., 1995; Taylor et al., 2019). A long-standing hypothesis regarding nitrification uncoupling is that elevation of the dissolved  $NH_3$  concentration inhibits NiO (Aleem and

Abbreviations: AmO, ammonia-oxidation; AmOR, ammonia-oxidation rate; AmS, ammonium sorption; AmV, ammonia volatilization; CCI, cumulative coupling index; ICI, instantaneous coupling index; NiO, nitrite oxidation; NiOR, nitrite oxidation rate; CP, nitrite compensation point; CPt, time to reach nitrite compensation point; 2SN, two-step nitrification model; UH, urea hydrolysis.

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Alexander, 1958; Stojanovic and Alexander, 1958). The inhibition of nitrification by NH<sub>3</sub>, and other potential inhibitory substances, has been extensively studied in wastewater treatment systems where regulation of nitrification is critical to process control and treatment efficiency (Anthonisen et al., 1976). Several kinetic models that account for inhibition of *AmO* and/or *NiO* in wastewater systems have been evaluated (Carrera et al., 2004; Park and Bae, 2009) but such models have not been applied to simulate soil N dynamics.

A process-based model of nitrification and its potential inhibition by  $\mathrm{NH}_3$  in fertilizer or urine-amended soil must account for several interactions. Soil pH initially increases due to urea hydrolysis and then decreases as AmV and AmO proceed. The changing pH may control nitrification by regulating AmV losses and thus AmO substrate supply, and/or by regulating liquid-phase  $\mathrm{NH}_3$ , which can inhibit nitrification in soil (Breuillin-Sessoms et al., 2017). At the same time, changing rates of both AmV and AmO can feedback to affect pH (Sherlock and Goh, 1985). Sorption of  $\mathrm{NH}_4^+$  onto soil surfaces also controls liquid-phase  $\mathrm{NH}_3$  (Venterea et al., 2015), and thus both AmV and nitrification. As  $\mathrm{NO}_2^-$  accumulates, it can drive  $\mathrm{NO}$  and  $\mathrm{N}_2\mathrm{O}$  production. Accounting for these interactions in a model is essential for testing hypotheses regarding soil  $\mathrm{N}$  cycling dynamics following fertilizer application and ruminant urine deposition.

Temperature is a key variable driving most if not all processes regulating  $NO_2^-$  dynamics and associated N losses. While rates of these processes are generally expected to increase as temperature increases over the range of 0–30 °C, individual processes are likely to differ in their relative temperature responses (Moyo et al., 1989; Taylor et al., 2017; Lu et al., 2018). Thus, it is difficult to predict the net overall temperature effect on variables of interest, such as time-integrated or cumulative production of  $NO_2^-$ ,  $NH_3$ , NO or  $N_2O$ . A model that can account for individual process responses and their interactions may aid in understanding how these net outcomes are affected by temperature over daily, seasonal or longer time scales. The objectives of this study were to quantify temperature effects on soil N cycling following high urea inputs in two soils under aerobic conditions, and to develop a process-based model to enable better prediction and understanding of  $NO_2^-$  accumulation and gaseous N losses.

## 2. Material and methods

## 2.1. Microcosm experiments

The soils used here (soils 'A' and 'B') were previously studied by Breuillin-Sessoms et al. (2017) and were selected for further study based on their contrasting properties. Soils were collected from research plots at the University of Minnesota research stations in fall 2017 from the upper 0.15 m in treatments that had received no N fertilizer during the previous growing season. Soil A was a Wheatville loam (Aeric Calciaquolls) with sand, silt and clay fractions of 43, 38 and 19%, pH (1:1 H<sub>2</sub>O) of 8.2 and organic matter (loss on ignition) of 3.6%, collected from plots maintained in a soybean(Glycine max L.)-wheat (Triticum aestivum) rotation in Crookston, MN (47.80°N 96.61°W). Soil B was a Waukegan silt loam (Typic Hapludolls) with sand, silt and clay fractions of 26, 58 and 16%, pH (1:1 H<sub>2</sub>O) of 6.8 and organic matter of 5.0%, collected from plots maintained in a corn (Zea mays L.)-soybean rotation in Rosemount, MN (44.75°N 93.07°W). Soils were dried at room temperature for 7–10 d, ground, sieved (2 mm), homogenized, and stored at 4 °C prior to use. The soil microcosm design used in previous studies to measure NH<sub>4</sub>, NO<sub>2</sub>, NO<sub>3</sub>, N<sub>2</sub>O and pH dynamics (Venterea et al., 2015; Breuillin--Sessoms et al., 2017) was extended to also measure NO production and NH<sub>3</sub> volatilization. A series of individual replicate soil microcosms were prepared, each consisting of 250-ml glass jars (70 mm diameter x 65 mm high) containing 10.0 g of air-dried soil spread in a 3 to 4-mm layer on the bottom of the jar. After weighing soil into each jar, a urea solution was mixed into each microcosm to deliver 500 µg N g<sup>-1</sup> dry soil, to mimic initial conditions typically found following banded or high-rate N fertilizer application, or urine deposition (Maharjan and Venterea, 2013; Wells et al., 2015). As in the previous experiments, the volume of solution added was equivalent to  $\sim\!50\%$  water-filled pore space (0.25 and 0.29 g  $H_2O$  g  $^{-1}$  in soils A and B, respectively) in order to maintain primarily aerobic conditions. The wetted soil was distributed in an annular pattern at the bottom of each jar to allow placement of a glass beaker containing 15-ml of 0.05 M  $H_2SO_4$  which served to capture gas-phase NH3 that volatilized from the soil and convert it to NH4 $^+$ , which was subsequently quantified as described below (Sánchez-Rodríguez et al., 2019).

Microcosms were sealed with metal lids and placed in dark incubators at temperatures of 5, 10, 15, 22 and 30 °C. Three replicate microcosms of each treatment were sacrificed for analysis periodically over 12 wk, starting on the day following addition of solutions. For experiments conducted at  $\geq\!15$  °C, sampling was performed at 3 or 4-d intervals during the first 3 wk, and then weekly, except for the final (84-d) sampling. Due to lower rates of N transformation at 5 and 10 °C, sampling frequency was decreased accordingly. All microcosms were opened for 3 min within the first three days after adding solutions to release CO2 produced by urea hydrolysis, and thereafter at 1 to 2-wk intervals. This procedure maintained O2 levels in the microcosm headspace above 18%, as verified by periodic analysis using gas chromatography with a thermal conductivity detector.

Each sampling day, individual microcosms were analyzed in the following sequence: (1) volatilized NH3: the acid solution was removed for analysis of NH<sub>4</sub><sup>+</sup> using a flow-through analyzer (Lachat, Loveland, CO) and the sodium salicylate-nitroprusside method (Mulvaney, 1996); (2) NO production: the jar was placed in an insulating-foam holder and sealed with a lid equipped with inlet and outlet fittings that directed flow of a NO-free airstream through the jar and into a chemiluminescent NO analyzer (NOA 280i, Zysense) (Venterea and Rolston, 2000a). Outlet NO concentration was monitored until steady (<5 min) and the production rate determined from the flow rate (0.20 l min<sup>-1</sup>) and steady-state concentration; (3) N2O production: the jar was placed unsealed into a water bath at the selected temperature for 5 min to allow the headspace to equilibrate with room air, and then sealed and placed back into the incubator for 60 min at which time the headspace was sampled by syringe through a septum. Gas samples were transferred to vials that were analyzed for N<sub>2</sub>O concentration by gas chromatography (Agilent 5890) with electron capture detection. The N<sub>2</sub>O production rate was determined from the change in headspace N<sub>2</sub>O concentration; (4) Extractable NH $_{4}^{+}$ : a subsample ( $\sim$ 3 g) of soil was extracted with 20 ml of 2 M KCl for 1 h. Filtered extracts were analyzed for NH<sub>4</sub> per above; (5) pH: a subsample (~2 g) was mixed with an equal mass of 1M KCl for soil pH determination; (6) Extractable NO<sub>2</sub> and NO<sub>3</sub>: the remaining soil was extracted with alkaline 2 M KCl for 10 min (Stevens and Laughlin, 1995). Separate filtered extracts were analyzed for  $NO_2^- + NO_3^-$  and  $NO_2^$ within 2 h by flow-through analysis with the Greiss-Ilosvay method with and without Cd reduction, respectively (Mulvaney, 1996) and NO<sub>3</sub> concentration was determined by difference accounting for Cd reduction efficiency.

Cumulative volatilization of NH $_3$  was determined from the mass of NH $_4^+$  captured in the acid-trapping solution at each sampling date. Cumulative production of NO and N $_2$ O were calculated by trapezoidal integration of measured NO and N $_2$ O production rates versus time, expressed in units of µg N g $^{-1}$ . Cumulative NO $_2^-$  was calculated by trapezoidal integration of measured NO $_2^-$  concentrations versus time, expressed in units of µg N g $^{-1}$  d (Maharjan and Venterea, 2013). Recoveries of N species at the end of the experiment were calculated as a percentage of the total N input, including 500 µg N g $^{-1}$  of added urea plus simulated contributions from N mineralization (described below), which represented 1.5–5% of the total input. Cumulative variables were analyzed at  $P \leq 0.05$  using the MIXED procedure of SAS (version 9.4, Cary, NC), with soil and temperature considered as fixed effects and replication and interactions with replication considered as random effects. Data for all variables were assessed for homogeneity of variance

and normality using scatterplots of residuals vs. predicted values (Kutner et al., 2004) and the UNIVARIATE procedure of SAS. Mean comparisons were made with pairwise t tests using the PDIFF option of the MIXED procedure.

#### 2.2. Modeling

The 2SN model is an expansion of a previous biochemical model (Venterea and Rolston, 2000b). Here, the model describes N and pH dynamics in a well-mixed, unsaturated and predominately aerobic soil volume where autotrophic nitrification predominates over heterotrophic denitrification. The model simulates several interacting components that are illustrated schematically in Fig. 1: (i) urea hydrolysis (UH), (ii) ammonium sorption (AmS) and equilibria, (iii) nitrification (AmO and NiO), (iv) NH<sub>3</sub> toxicity, (v) volatilization of NH<sub>3</sub> and production of NO and N<sub>2</sub>O gases, (vi) pH dynamics and (vii) soil N mineralization (NM). The equations used to describe each process are presented below and the corresponding parameters used in the final version of the model are listed in Table 1.

The model is structured as a system of seven coupled differential equations that can be represented by:

$$\frac{dC_i}{dt} = P_i - [S_i] \tag{1}$$

where  $C_i$  is the concentration of the ith species, t is time,  $P_i$  and  $S_i$  are rates of production (source term) and consumption (sink term), respectively, and where i=1 to 7 corresponds respectively to urea (U), total extractable ammoniacal N (NH<sub>x</sub>), NO $_2^-$  and NO $_3^-$ , gaseous NO and N $_2$ O, and hydrogen ion (H $^+$ ). The model allows the source and sink terms to be functions of any of the simulated species reflecting the coupled nature of the processes. An adaptive Runge-Kutta scheme (Press et al., 2010) was formulated in FORTRAN (Approximatrix) to simultaneously solve the system of equations.

At each time-step, the  $NH_x$  pool was partitioned into three simulated sub-pools, liquid-phase ammonium ( $NH_4^+L$ ), sorbed-phase ammonium ( $NH_4^+S$ ) and liquid-phase ammonia ( $NH_3L$ ) using the method of Venterea et al. (2015) where the  $NH_4^+L \leftrightarrow NH_3L$  equilibrium was regulated by pH and the pK<sub>a</sub> for  $NH_4^+$ , and the  $NH_4^+S \leftrightarrow NH_4^+L$  equilibrium was regulated by:

$$NH_4^+S = \frac{\mu_{AmS} NH_4^+L}{K_{AmS} + NH_4^+L} \tag{2}$$

where  $\mu_{AmS}$  is the maximum sorption capacity and  $K_{AmS}$  is the half-saturation constant. Variation of pK<sub>a</sub> with temperature was calculated based on Bates and Pinching (1949). At each time-step, total extractable NO $_2^-$  was partitioned into unprotonated (NO $_2^-$ ) and protonated (HNO $_2$ ) sub-pools using the pKa for HNO $_2$  (Venterea and Rolston, 2000a). The model was compared to observed data for six of the seven main pools,

 $NH_x$ ,  $NO_2^-$ ,  $NO_3^-$ , NO,  $N_2O$ , and  $H^+$  (as pH) (excluding urea which was not measured) as well as cumulative volatilized  $NH_3$ . All processes except AmS, NM, AmO and NiO were simulated using first-order kinetics, where the rate coefficients are represented as k or  $\alpha$  with a subscript identifying the process. Added U defines the initial condition, after which U dynamics are driven by UH:

$$\frac{dU}{dt} = -\left[k_{UH}U\right] \tag{3}$$

which serves as the main source for NHx simulated by:

$$\frac{dNH_x}{dt} = k_{UH}U + NMR - [AmOR + k_{AmV}NH_3L]$$
 (4)

where NMR, AmOR (Eq. (11)) and  $k_{AmV}NH_3L$  are the rates of NM, AmO and AmV, respectively. Analysis of previously reported data (Breuillin-Sessoms et al., 2017) for these and six other soils incubated with no urea addition showed that NMR could be simulated by:

$$NMR = NMR_o \exp(-d * t)$$
 (5)

where  $NMR_0$  is the rate at time (t)=0 and d is a decay coefficient (details in Supplementary Information [SI]). Temperature variation of  $NMR_0$  was simulated with  $Q_{10}=1.61$  based on a global meta-analysis (Liu et al., 2017b). Nitrite was simulated using:

$$\frac{dNO_{2}^{-}}{dt} = AmOR - \left[NiOR + k_{NO}NO_{2}^{*} + k_{N_{2}O}NO_{2}^{*} + k_{f}NO_{2}\right]$$
 (6)

where NiOR is the nitrite-oxidation rate (Eq. (12)),  $k_{NO}NO_2^*$  is the NO production rate (Eq. (8)) and  $k_{N_2O}NO_2^*$  is the NO $_2^-$ -driven component of the N<sub>2</sub>O production rate (Eq. (9)). The final term,  $k_fNO_2$ , accounts for NO $_2^-$  fixation into soil organic matter (Thorn and Mikita, 2000; Fitzhugh et al., 2003) and/or NO $_2^-$ -driven production of gases other than NO or N<sub>2</sub>O (Stevenson and Swaby, 1964; Su et al., 2011). Nitrate NO $_3^-$  was simulated by:

$$\frac{dNO_3^-}{dt} = NiOR \tag{7}$$

Production of NO and N2O were simulated, respectively, by

$$\frac{dNO}{dt} = k_{NO}NO_2^* \tag{8}$$

$$\frac{dN_2O}{dt} = k_{N_2O}NO_2^* + b_{N_2O} \tag{9}$$

The  $NO_2^*$  designation indicates that both  $NO_2^-$  and  $HNO_2$  were evaluated in separate simulations as the reactive substrate since production of NO and N<sub>2</sub>O have been related to each of these substrates (Thorn and Mikita, 2000; Venterea and Rolston, 2000c, a; Venterea et al., 2005; Venterea, 2007). In Eq. (9),  $b_{N_2O}$  is a zero-order N<sub>2</sub>O source observed

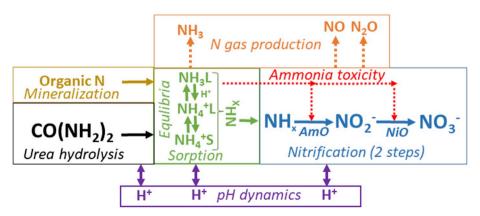


Fig. 1. Major components of the two-step nitrification (2SN) model.

**Table 1** Parameters in the *2SN* model and their temperature dependencies.

Parameter		Units	Eq <sup>a</sup>	Soil A		Soil B		
				Value or function <sup>b</sup>	$E_a^{\ c}$	Value or function <sup>b</sup>	$E_a^{\epsilon}$	
$\mu_{AmS}$	Max. AmS capacity	$\mu g \ N \ g^{-1}$	2	1344 <sup>d</sup>	n/a	1743 <sup>d</sup>	n/a	
$K_{AmS}$	AmS half-saturation	$\mu$ g N ml $^{-1}$	2	152 <sup>d</sup>	n/a	412 <sup>d</sup>	n/a	
$k_{UH}$	UH decay	$h^{-1}$	3	$0.022*1.75^{[(T-22)/10]}$	39.2 (0.6)	$0.024*1.50^{[(T-22)/10]}$	28.4 (0.4)	
$k_{ m AmV}$	AmV coefficient	$ml\ g^{-1}\ h^{-1}$	4	$0.19~(T \le 22~^{\circ}\text{C}) \ 0.026*T - 0.38~(T > 22~^{\circ}\text{C})$	NS	$0.0695*T + 0.047 \ (T \le 10 \ ^{\circ}\text{C}) \ 0.74 \ (T > 10 \ ^{\circ}\text{C})$	NS	
$NMR_{o}$	Initial NM rate	$\mu$ g N g $^{-1}$ h $^{-1}$	5	$0.022*1.61^{[(T-22)/10]}$ e	33.4 (0.5) <sup>e</sup>	$0.055*1.61^{[(T-22)/10]}$ e	33.4 (0.5) <sup>e</sup>	
d	NM decay	$h^{-1}$	5	0.029 <sup>e</sup>	n/a <sup>e</sup>	0.074 <sup>e</sup>	n/a <sup>e</sup>	
$k_f$	Inferred NO <sub>2</sub> sink	$h^{-1}$	6	$2.25e^{-4}$ ( $T \le 10$ °C); $1.0e^{-3}$ ( $T \ge 22$ °C) $6.5e^{-5}*T - 4.0e^{-4}$ ( $10$ °C < $T < 22$ °C)	49.8 (10.6)	$0.0005 + 0.0005*[1 + exp^{(12.8-T)/1.33}]^{-1}$	21.1 (5.8)	
$k_{NO_g}$	NO production	$h^{-1}$	8	$0.074~(T \le 10~^{\circ}\text{C}) \ 0.58*[1-exp^{(-0.09*T)}] - 0.27~(T > 10~^{\circ}\text{C})$	40.4 (9.1)	$0.250*T-0.01 \ (T \le 10 \ ^{\circ}\text{C})$ $0.858*exp^{(0.020*T)} - 0.885 \ (T > 10 \ ^{\circ}\text{C})$	39.0 (8.7)	
$k_{N_2O}$	N <sub>2</sub> O production	$h^{-1}$	9	-0.0025*T + 0.04 (T < 10 °C)	46.6 (5.5)	$0.0127 \ (T \le 15 \ ^{\circ}\text{C})$	48.7 (11.5)	
				$0.0022*T-0.0069 (T \ge 10  ^{\circ}\text{C})$	10–30 °C	$0.0026*exp^{(0.108*T)} - 0.0007 (T > 15 °C)$		
$b_{N_2O}$	Background N <sub>2</sub> O	$\rm ng~g^{-1}~h^{-1}$	9	$0.0003*[1-exp^{(-0.205*T)}] + 0.98$	1.0 (0.001) 5–22 °C	$1.10*(1 + exp^{[(16.7 - T)/0.973]})^{-1} + 1.23$	27.9 (5.9)	
$\alpha_{ ext{UH}}$	pH rise, UH	nM H <sup>+</sup>	10	0.14 ( $T < 15$ °C); 0.15 ( $T > 22$ °C)	NS	$0.475*exp^{(0.126*T)} + 3.14 (T \le 15 °C)$	18.2 (3.0)	
		$\mu$ g N g <sup>-1</sup>		$0.0014*T + 0.12 (15 °C \le T \le 22 °C)$		6.3 (15 °C $< T <$ 22 °C) 0.21* $T +$ 1.60 ( $T \ge$ 22 °C)		
$\alpha_{ m AmV}$	pH decline, AmV		10	1.0	n/a	$2.6 + 106*[1 + exp^{(12.3-T)/2.81}]^{-1} (T \le 22  ^{\circ}C)$	93.9 (22)	
						105 (T > 22 °C)	5–22 °C	
$\alpha_{ m AmO}$	pH decline, AmO		10	0.03	n/a	8.5	n/a	
$\mu_{AmO}$	Maximum AmO rate	$\mu$ g N g $^{-1}$ h $^{-1}$	11	0.135*T - 0.056 (T < 15 °C) $171*[1-exp^{(-0.28*T)}]-166 (T \ge 15 °C)$	57.6 (10.3)	$0.135*exp^{(0.094*T)} + 0.024$	62.8 (1.8)	
$K_{\rm AmO}$	AmO half-saturation	$\mu g \ N \ g^{-1}$	11	106	n/a	25.0	n/a	
$KI_{AmO}$	NH3 inhibition of AmO	$\mu$ g N ml $^{-1}$	11	420	n/a	103	n/a	
$\mu_{NiO}$	Maximum NiO rate	$\mu$ g N g $^{-1}$ h $^{-1}$	12	$0.059*exp^{(0.15\ T)}$ - $0.13\ (T < 22\ ^{\circ}\text{C})$ $1.38\ (T \ge 22\ ^{\circ}\text{C})$	122 (26.1)	$0.168*exp^{(0.106*T)}-0.244$	108 (5.9)	
$K_{ m NiO}$	NiO half-saturation	$\mu g \ N \ g^{-1}$	12	6.1	n/a	8.8	n/a	
$KI_{\rm NiO}$	NH <sub>3</sub> inhibition of NiO	$\mu g \ N \ m l^{-1}$	12	210	n/a	13.0	n/a	
ε	$\mu_{AmO}^{t=0}:\mu_{AmO}^{max}$ ratio	-	13	$0.20^{\mathrm{f}}$	n/a	$0.20^{\mathrm{f}}$	n/a	
β	AmO growth rate	$d^{-1}$	13	$0.0034^{\rm f}$	n/a	$0.0013^{\rm f}$	n/a	

<sup>&</sup>lt;sup>a</sup> Equation where parameter is first used.

when these soils were incubated aerobically with no urea added and where extractable  $NO_2^-$  remained at baseline levels (<0.1  $\mu$ g N g<sup>-1</sup>) (Breuillin-Sessoms et al., 2017). Soil pH was simulated in a largely empirical manner assuming production and consumption of H<sup>+</sup> were each first-order with respect to *UH*, *AmO* and *AmV* 

$$\frac{dH^{+}}{dt} = \alpha_{AmOR}AmOR - \left[\alpha_{UH}k_{UH}U + \alpha_{AmV}k_{AmV}NH_{3}L\right]$$
 (10)

where the coefficients  $\alpha_{AmOR}$ ,  $\alpha_{UH}$  and  $\alpha_{AmV}$  account for production of H<sup>+</sup> from AmO, neutralization of H<sup>+</sup> during UH and shifting of the chemical equilibrium from AmV, respectively (Sherlock and Goh, 1985).

Preliminary analysis and simulations were done to examine different kinetic models for AmOR and NiOR including standard Michaelis-Menten kinetics and different formulations that account for inhibition by  $NH_3L$  (Park and Bae, 2009). Among these, the uncompetitive inhibition model selected by Park and Bae (2009) was found to best describe the  $NO_2^-$  dynamics:

$$AmOR = \frac{[NH_x]\mu_{AmO}}{[NH_x]\left(1 + \frac{[NH_3L]}{KI_{AmO}}\right) + K_{AmO}}$$
(11)

$$NiOR = \frac{\left[NO_{2}^{-}\right]\mu_{NiO}}{\left[NO_{2}^{-}\right]\left(1 + \frac{\left[NH_{3}L\right]}{KI_{NiO}}\right) + K_{NiO}}$$
(12)

where  $\mu_{AmO}$  and  $\mu_{NiO}$  are maximum oxidation rates,  $K_{AmO}$  and  $K_{NiO}$  are half-saturation constants and  $KI_{AmO}$  and  $KI_{NiO}$  are inhibition constants for AmO and NiO, respectively. Simulations were also performed using Eq. (11) amended with a term to allow  $\mu_{AmO}$  to increase over time from an initial value ( $\mu_{AmO}^0$ ) to a maximum value ( $\mu_{AmO}^{max}$ ) according to:

$$\mu_{AmO}(t) = \varepsilon^* \exp(\beta^* t) \mu_{AmO}^{max}$$
(13)

where  $\beta$  is a growth rate coefficient and  $\varepsilon$  is the ratio between  $\mu^0_{AmO}$  and  $\mu^{max}_{AmO}$  which reaches a value of 1.0 at  $t=-\frac{\ln \varepsilon}{\beta}$ .

The term 'compensation point' or 'compensation concentration' is used in a variety of contexts to indicate the point at which rates of opposing processes are in balance (Farquhar et al., 1980; Conrad, 1994). With respect to  $NO_2^-$ , the opposing processes are production via AmO and consumption via NiO, NO and  $N_2O$  production (and possibly other processes) where the overall gross consumption rate increases as  $NO_2^-$  concentration increases. Thus, the parameterized model was used to calculate the  $NO_2^-$  compensation point (CP) and the corresponding time (CPt) at which the CP was reached, where CP is the  $NO_2^-$  concentration at which the source and sink terms in Eq. (6) balance ( $\frac{dNO_2^-}{dt} = 0$ ), and therefore also corresponds to the maximum  $NO_2^-$  concentration.

Simulated CP and CPt were compared to observed maximum  $NO_2^-$  concentrations and corresponding times. Equations (11) and (12) were used to calculate AmOR and NiOR at each time step, and an instantaneous coupling index (ICI) given by the NiOR:AmOR ratio at a given

<sup>&</sup>lt;sup>b</sup> For parameters varying with temperature (*T*), equations for regression functions shown in Fig. 4 are given below. If a *T* range is not specified, functions apply over 5–30 °C.

<sup>&</sup>lt;sup>c</sup>  $E_a =$  Activation energy (kJ mol<sup>-1</sup>) ( $\pm$ std err). Unless specified,  $E_a$  applies over 5–30 °C. 'NS' = Arrhenius relationship is not significant at P < 0.05; 'n/a' = parameter constant with T.

d Parameter values reported by Breuillin-Sessoms et al. (2017).

e Values based on analysis of data from Breuillin-Sessoms et al. (2017) (see Supplemental Information).  $E_{\alpha}$  for  $NMR_0$  calculated using  $Q_{10} = 1.61$  from Liu et al. (2017).

<sup>&</sup>lt;sup>f</sup> Eq. (13) was only used for simulations at 5 °C so no temperature dependencies were determined for  $\varepsilon$  and  $\beta$ .

time, where ICI < 1 indicates uncoupled conditions. A cumulative coupling index (CCI) was also calculated from the ratio of time-integrated NiOR and AmOR, which expresses the percentage of  $NO_2^-$  produced by AmO that was subsequently oxidized by NiO.

Robust parameter selection methods were implemented to constrain the number of parameters (described in detail in SI). For parameters that varied with temperature, functional relationships with temperature were determined by non-linear regression (SigmaPlot). Activation energies ( $E_a$ ) obtained from Arrhenius plots are reported when the natural logarithms of parameter values were correlated with the reciprocal of absolute temperature at P < 0.05. Values of  $\mu_{Amo}$  and  $\mu_{NiO}$  were also fitted to the macromolecular rate theory (MMRT) model (Hobbs et al., 2013) (details in SI).

#### 3. Results

#### 3.1. Experiment

Temporal trends in N and pH dynamics, and temperature effects on these dynamics, were similar for soils A and B (Fig. 2). Soil NH $_{+}^{+}$  concentrations increased over time, increasing more slowly at colder temperatures, before reaching maxima and then starting to decline. During

the period that soil NH<sub>4</sub> was increasing, volatilized NH<sub>3</sub> and soil pH increased, but more slowly at colder temperatures, followed by a period where NH<sub>3</sub> started to level off and soil pH decreased. Soil NO<sub>3</sub> increased more slowly at colder temperatures before reaching maxima, except in soil B at  $\leq 10$  °C, where neither NH<sub>3</sub> nor NO $_3^-$  appeared to level off by 84 d. The dynamics of NO<sub>2</sub>, NO and N<sub>2</sub>O were analyzed in greater detail. Soil NO<sub>2</sub> increased before reaching its maximum concentration, or NO<sub>2</sub> compensation point (CP), followed by a decline; the only exception was in soil B at 5 °C where no decline in NO<sub>2</sub> was observed by 84 d. Under warmer conditions ( $\geq 15$  °C), NO $_2^-$  returned to baseline ( $< 0.1 \, \mu g \, N \, g^{-1}$ ), whereas at 5 and 10  $^{\circ}$ C soil NO $_{2}^{-}$  remained elevated at 84 d. The *CP* and CPt were both affected by the interaction of temperature and soil type (Fig. 3a). The CP tended to be greater, and the CPt delayed, under colder conditions, and the CPt was well-described by exponential decay models (Fig. 3a). Averaged across temperatures, mean CP in soil A was nearly three times greater than in soil B.

All cumulative variables analyzed by ANOVA were affected by the interaction of temperature and soil type (Fig. 3b–c). Consistently in both soils, cumulative  $NO_2^-$  increased as temperature decreased from 30 to 10 °C, while cumulative  $NO_2^-$  at 5 °C was intermediate between the 10 and 15 °C values. Within each soil, cumulative NO exhibited similar temperature trends as cumulative  $NO_2^-$  and was positively correlated (P <

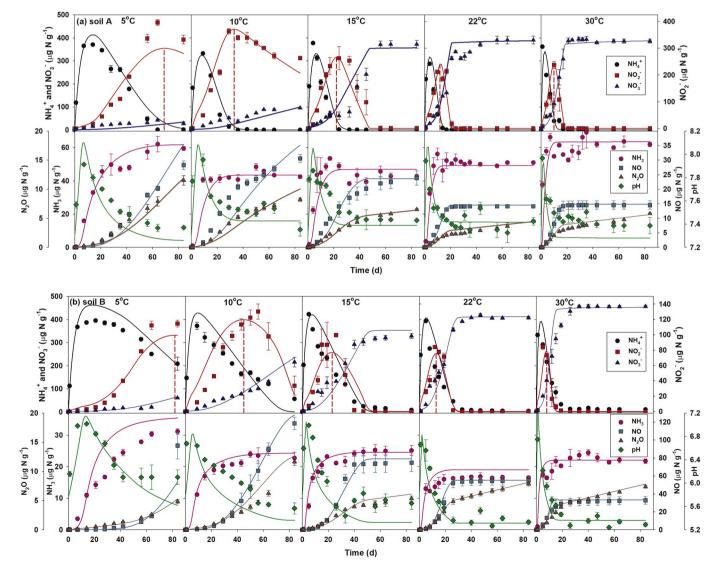
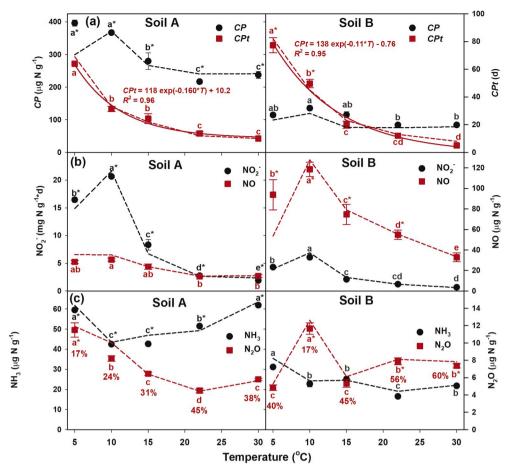


Fig. 2. Observed (symbols = means  $\pm$  std error) and simulated (lines) nitrogen (N) species and pH in (a) soil A and (b) soil B at five temperatures. In the lower panes, 'NH<sub>3</sub>' is cumulative N captured in the acid traps, and 'NO' and 'N<sub>2</sub>O' are cumulative N determined by trapezoidal integration of production rates versus time. Vertical dashed lines in the upper panes indicate timing and magnitude of simulated nitrite compensation points (*CP*).



**Fig. 3.** Observed (symbols = means  $\pm$  std error) and simulated (lines) (a) nitrite compensation point (CP) and time to reach CP (CPt), (b) cumulative  $NO_2^-$  and  $NO_3$ , and (c) cumulative NH<sub>3</sub> and N<sub>2</sub>O in soils A and B. Within each soil, means with same letter do not differ by temperature at P < 0.05. An asterisk (\*) indicates a mean is greater compared to other soil at the same temperature at P < 0.05. In (a), solid lines are exponential decay functions based on regression of observed CPt versus temperature. In (c), the values below each symbol are the percentages of the total simulated N2O production due to zero-order production  $(b_{N_2O}$  in Eq. (9)).

0.001) with cumulative  $NO_2^-$  in soil A ( $r^2=0.87$ ) and B ( $r^2=0.80$ ). In contrast to cumulative  $NO_2^-$ , which was two to four times greater at a given temperature in soil A than B, cumulative NO was two to four times greater in soil B than A (Fig. 3b). Trends in cumulative  $N_2^-$ O were less consistent with the trends in cumulative  $NO_2^-$  compared with cumulative  $NO_2^-$  (Fig. 3c). Cumulative  $N_2^-$ O was positively correlated (P<0.001) with cumulative  $NO_2^-$  in soil A ( $P^2=0.58$ ), while less strongly in soil B ( $P^2=0.20$ , P=0.10). When data from 5 °C were excluded, the degree of correlation between cumulative  $NO_2^-$  and  $N_2^-$ O increased ( $P^2=0.79$  and

0.61 in soils A and B, respectively). Cumulative  $N_2O$  reached its maximum value at 5 °C in soil A and at 10 °C in soil B, which had greater cumulative  $N_2O$  at 10, 22 and 30 °C compared to soil A. Cumulative  $NH_3$  was two to three times greater in soil A than B at each temperature, and there were differences in cumulative  $NH_3$  by temperature, but the pattern of differences was not consistent across soil types (Fig. 3c).

Recovery of N inputs after 84 d ranged from 86 to 101% (Table 2). At and above 15 °C,  $NO_3^-$  was the dominant form of recovered N, while  $NO_2^-$  and/or  $NH_4^+$  were recovered increasingly at  $\leq 10$  °C. Cumulative NO

**Table 2**Recovery of nitrogen (N) after 84 days of incubation accounting for measured and simulated variables.

Temp	Input <sup>b</sup>	<sup>a</sup> Percent recovery of urea + mineralized N as:										
		Remaining in soil			Cumulative gases emitted			Total without NO <sub>2</sub> sink	NO <sub>2</sub> sink <sup>c</sup>	Total with NO <sub>2</sub> sink		
		NH <sub>4</sub> <sup>+</sup>	$NO_2^-$	NO <sub>3</sub>	NH <sub>3</sub>	NO	N <sub>2</sub> O %					
°С	$\mu g N g^{-1}$											
Soil A												
5	507.5	11.7 (0.3)	65.5 (4.5)	5.6 (1.8)	11.7 (0.3)	5.6 (0.40)	2.3 (0.23)	91.0 (2.9)	15.8	106.9 (2.9)		
10	509.5	8.3 (0.3)	51.7 (0.4)	18.7 (0.2)	8.3 (0.3)	6.0 (0.38)	1.6 (0.09)	86.4 (0.6)	22.9	109.4 (0.6)		
15	512.0	8.3 (0.3)	< 0.5	72.4 (4.2)	8.3 (0.3)	4.6 (0.72)	1.3 (0.05)	87.6 (3.2)	15.7	103.3 (3.2)		
22	516.7	10.0 (0.2)	< 0.5	75.5 (4.6)	10.0 (0.2)	2.7 (0.07)	0.87 (0.08)	89.6 (3.3)	12.3	101.9 (3.3)		
30	524.4	11.8 (0.4)	< 0.5	73.6 (2.4)	11.8 (0.4)	2.8 (0.39)	1.1 (0.03)	89.8 (1.9)	10.7	100.5 (1.9)		
Soil B												
5	508.0	41.0 (7.9)	22.5 (1.2)	11.9 (0.3)	6.1 (0.3)	18.5 (4.1)	1.0 (0.09)	101.3 (5.9)	9.4	110.6 (5.9)		
10	510.1	11.1 (1.2)	6.6 (3.4)	42.3 (5.8)	4.5 (0.5)	23.2 (1.9)	2.3 (0.18)	90.2 (6.6)	17.8	108.0 (6.6)		
15	512.8	1.6 (0.2)	< 0.5	64.0 (3.0)	4.9 (0.4)	14.6 (2.7)	1.0 (0.12)	86.4 (0.9)	10.2	96.6 (0.9)		
22	517.8	0.8 (0.3)	< 0.5	78.7 (1.7)	3.2(0.1)	10.6 (1.2)	1.5 (0.11)	95.0 (0.8)	5.4	100.4 (0.8)		
30	525.9	2.0 (0.4)	< 0.5	86.7 (1.4)	4.1 (0.2)	6.2 (1.2)	1.4 (0.07)	100.8 (0.4)	2.8	103.6 (0.4)		

a Values are means of three replicates (±standard error) except for single value of NO<sub>2</sub> sink simulated for each soil and temperature combination.

 $<sup>^{\</sup>text{b}}$  Includes 500  $\mu g \; Ng^{-1}$  of added urea plus the simulated contribution from N mineralization over 84 days.

<sup>&</sup>lt;sup>c</sup> Total cumulative amount over 84 d simulated by the k<sub>f</sub>NO<sub>2</sub> term in Eq. (6) as a percentage of N input.

accounted for <6% of N inputs in soil A compared to 6–23% in soil B, while recovery as  $N_2O$  was similar in both soils. Cumulative NH $_3$  accounted for 8–12% in soil A compared to <6% in soil B.

## 3.2. Modeling

The model captured the overall trends in time series and cumulative data (Figs. 2 and 3). In particular, the trend of increasing CPt with decreasing temperature was accurately simulated (Fig. 3a) with meannormalized root-mean square errors (RMSE) of 9 and 11% for soils A and B, respectively. Trends in mean CP with temperature were simulated with RMSEs of 15 and 19%, respectively; although the model underestimated CP at 5 °C in soil A and 22 °C in soil B by 24 and 33%, respectively (Fig. 3a). Cumulative  $NO_2^-$ , NO and  $N_2O$  were simulated with RMSEs of 11 and 15%, 17 and 25% and 11 and 9%, for soils A and B, respectively (Fig. 3b and c). The largest discrepancies between simulated and observed data occurred at 5 °C for cumulative  $N_2O$  in soil

B (underestimated by 43%), at 5 °C for cumulative NO in soil A (overestimated by 25%) and at 30 °C for cumulative  $NO_2^-$  in soil A (overestimated by 24%). Cumulative  $NH_3$  responses were simulated with RMSEs of 5 and 10% in soils A and B, respectively, with the largest discrepancies occurring at 5 and 22 °C in soil B where the model overestimated observed means by 14 and 15%, respectively. For soil A, NO and  $N_2O$  production were simulated more accurately when  $NO_2^-$  was used as the substrate in Eqs. (8) and (9), whereas using HNO2 as the substrate resulted in better model performance for soil B.

Simulations done at 5 °C without the use of Eq. (13) resulted in substantial overestimation of  $NO_2^-$  concentrations during the first 60 d (Fig. 2S). Therefore, Eq. (13) was used in the final simulations at 5 °C to account for increases in ammonia-oxidizing microbial populations and/or enzyme activities over time. Simulations done without inclusion of the  $k_fNO_2$  term in Eq. (6) resulted in good model agreement with the  $NO_2^-$ , NO and  $N_2O$  data, but there was significant over-estimation of  $NO_3^-$  in most cases (Fig. 2S). The additional  $NO_2^-$  sink ( $k_fNO_2$ ) included

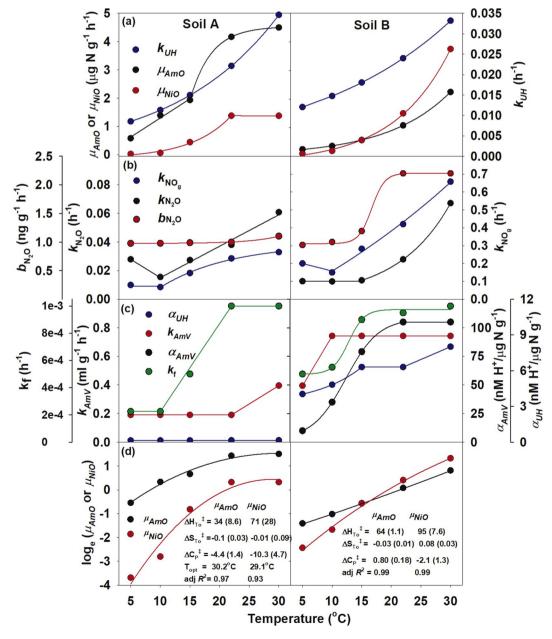


Fig. 4. Best-fit parameter values (symbols) and regression functions (lines) for parameters that vary by temperature for soil A (left) and soil B (right). Lines in panes (a) thru (c) are the temperature functions reported in Table 1. Lines in (d) are model fits with estimated regression coefficients for the MMRT model (Eq. 5S, see SI).

in the final model accounted for 3–23% of total N inputs and moved the estimates of total N recovery closer to 100% in 8 of 10 cases compared to estimates based on measured variables, in soil B at 5 and 30 °C (Table 2). In both soils, the cumulative sink was greatest at 10 °C and least at 30 °C, and was positively correlated with cumulative NO $_2^-$  ( $r^2=0.83$ –0.84,  $P\leq0.03$ ).

In general, parameters that varied with temperature could be expressed as increasing functions of temperature (Table 1, Fig. 4). Some parameters were constant over specific ranges, and in two cases, values were greater at 5 than at 10 °C ( $k_{N_2O}$  in soil A and  $k_{NO_g}$  in soil B). Some parameters were best described using different functions over different temperature ranges. Activation energies  $(E_a)$  were obtained for all parameters that varied with temperature (Table 1), except  $\alpha_{UH}$  in soil A and  $k_{\rm AmV}$  in both soils, for which Arrhenius relationships were not significant. In some cases, significant relationships were found only when the temperature range was constrained to >10 °C or <22 °C. The  $E_a$  values for several parameters ( $k_{UH}$ ,  $k_{NO}$ ,  $k_{N_2O}$ ,  $\mu_{AmO}$  and  $\mu_{NiO}$ ) were similar (within  $\pm 11\%$ ) between soils, whereas  $E_a$  for  $k_f$  and  $b_{N_2O}$  differed more widely by soil. Arrhenius plots for  $\mu_{AmO}$  and  $\mu_{NiO}$  were significant across 5–30 °C in soil A ( $r^2 = 0.88$  and 0.91, respectively) and B ( $r^2 > 0.99$ ). In both soils,  $E_a$  for  $\mu_{NiO}$  exceeded the  $E_a$  for  $\mu_{AmO}$  by factors of 2.1 and 1.7 in soils A and B, respectively. Compared to Arrhenius plots, the MMRT model described temperature responses better in soil A based on  $R^2$ (Fig. 4d). Optimum temperature (Topt) values were obtained for soil A (Fig. 4d), but in soil B could not be obtained for  $\mu_{AmO}$  and the obtained value for  $\mu_{NiO}$  (68 °C) was not biologically feasible.

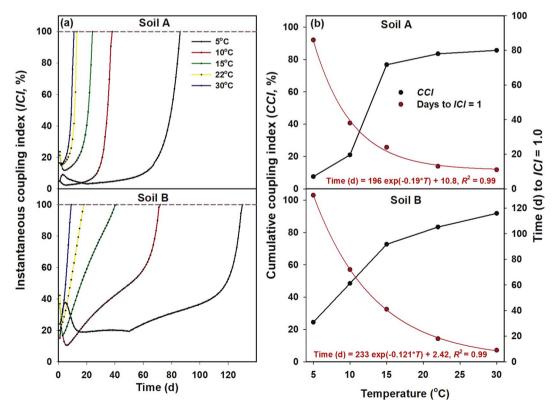
Model-simulated *NiOR* initially lagged behind *AmOR* but eventually equaled and then exceeded *AmOR* (Fig. 3S). The *ICI* was initially <100%, indicating uncoupling that persisted for longer periods at colder temperatures (Fig. 5a). Once the point of coupling (ICI = 100%) was reached, ICI then increased above 100% (note that ICI values > 100% are not shown in Fig. 5a to improve visibility of data prior to reaching 100%). The time required to reach coupled conditions decreased

exponentially with temperature while CCI increased with temperature (Fig. 5b).

#### 4. Discussion

The first and second steps of nitrification, AmO and NiO, were increasingly uncoupled at colder temperatures as evidenced by increased cumulative NO2 that was associated with increased production of NO, and to a lesser extent N2O. Maximum NO2 concentrations tended to increase and elevated NO<sub>2</sub> concentrations persisted for longer periods at decreasing temperature. These results imply that NiOR was more sensitive to temperature than AmOR. This hypothesis is supported by the model results. Differential temperature sensitivities are apparent in the relationships in Fig. 4d, where  $\mu_{NiO}$  declined faster with decreasing temperature than  $\mu_{AmO}$  in both soils and in the greater  $E_a$  estimates for  $\mu_{NiO}$  compared to  $\mu_{AmO}$  (Table 1). However,  $\mu_{AmO}$  and  $\mu_{NiO}$  do not necessarily represent the actual rates at any point in time, which also depend on substrate levels and the other parameters in Eq. (11) and (12). The model-calculated rates (Fig. 3S), and ratios between those rates expressed as ICI and CCI (Fig. 5), show that simulated NiOR decreased relative to AmOR at decreasing temperature, which also support the hypothesis that differential temperature responses of *AmOR* and NiOR were a fundamental regulator of the observed patterns.

The best-fit  $\mu_{NiO}$  values obtained here at 30 °C (1.4–3.8  $\mu$ g N g<sup>-1</sup> h<sup>-1</sup>) are similar to Michaelis-Menten ( $V_{max}$ ) values obtained by Taylor et al. (2019), whereas our  $K_{NiO}$  values were ~10 times less than their estimates (1.7–2.2  $\mu$ M after unit conversion). The latter difference may result from the fact that Taylor et al. (2019) used slurries compared to unsaturated soils used here. Taylor et al. (2019) concluded that differential temperature responses of  $V_{max}$  for NiO compared to AmO, previously measured by Taylor et al. (2017), were likely not responsible for  $NO_2^-$  accumulation in their experiments. They observed that NiO substrate affinities responded to temperature, although the directions of the



**Fig. 5.** Model-simulated (a) instantaneous coupling index (*ICI*) versus time and (b) cumulative coupling index (*CCI*) and time at which *ICI* reaches 100% with regression lines versus temperature. In (a), *ICI* values > 100%, which correspond to coupled conditions falling above dashed horizontal lines, are not shown to improve visibility of the data occurring prior to reaching 100%. In (b), *CCI* is plotted on the left axis, and time on the right axis.

responses were not consistent among soils. We found that using constant values for  $K_{NiO}$  across temperature were adequate to simulate  $\mathrm{NO}_2^-$  dynamics. Our sensitivity analyses show that varying  $K_{NiO}$  over the range of 10%–200% of the values in Table 1 altered cumulative  $\mathrm{NO}_2^-$  estimates by <2.5% in soil A and <12% in soil B.

Another relevant observation of Taylor et al. (2019) is that, under the assumption of Michaelis-Menten kinetics,  $NO_2^-$  must increase to some extent following  $NH_4^+$  addition before NiOR can equal AmOR which further highlights that kinetic parameters alone do not determine process rates. In soil B at  $\leq 15$  °C,  $\mu_{NiO}$  was  $\geq \mu_{AmO}$ , which might imply low potential for  $NO_2^-$  to accumulate; yet  $NO_2^-$  increased to  $>70~\mu g N g^{-1}$  and remained elevated for weeks. An advantage of dynamic simulations is that they can account for effects of varying substrate levels on process rates that cannot be determined based on knowledge of kinetic parameters alone.

Venterea and Rolston (2000b) simulated both steps of nitrification using kinetics that accounted for Monod-based population growth. Here, population growth models were not required to simulate the characteristic 'rise and fall' pattern of NO<sub>2</sub> dynamics, except at 5 °C, possibly indicating that growth of cold-adapted populations of ammonia oxidizers was important. The usefulness of the uncompetitive NH<sub>3</sub> inhibition model (Eqs. (11) and (12)) used here does not preclude the potential importance of other inhibitory or competing agents (Boon and Laudelout, 1962; Hunik et al., 1993). In our preliminary simulations (SI), we evaluated inhibition of AmO by low pH and of NiO by high pH (Hawkins et al., 2010), but predictions of these models did not correspond with observations. The uncompetitive inhibition model used here was also found by Park and Bae (2009) to best describe nitrification kinetics affected by NH<sub>3</sub> inhibition in wastewater. However, the current experiments were not primarily designed to distinguish among different types of inhibition kinetics which could be addressed more directly using techniques similar to those used by Park and Bae (2009). Also, the inhibition models applied here are likely a simplification of kinetics from activities of different resulting sub-populations ammonia-oxidizing bacteria and/or archaea, and nitrite-oxidizing bacteria, each of which may have differing maximum utilization potentials, substrate affinities, sensitivities to inhibitory agents and/or responses to temperature (Giguere et al., 2017; Duan et al., 2018; Lu et al., 2018; Taylor et al., 2019). Thus, values of the model parameters in Eqs. (11) and (12), and their variation with temperature, represent 'average' behavior across populations. Some studies indicate that AmO carried out by archaea, and complete nitrification ('comammox') carried out by some strains of *Nitrospira*, are more important under conditions of low N availability, and therefore may not have been important in the current experiment (Di et al., 2009; Wang et al., 2019). Nonetheless, it is likely that substantial diversity in kinetic behavior exists within strains of soil bacteria which separately carry out AmO and NiO. Similarly, while NO and N2O production are each simulated here using single rate coefficients, they can be generated via multiple processes, both biologically and abiotically, with NO2 and/or HNO2 as proposed substrates (Wrage et al., 2001; Wei et al., 2017). Nitric oxide has recently been identified NO as an obligate intermediate of hydroxylamine (NH2OH) oxidation by autotrophic ammonia oxidizing bacteria (Caranto and Lancaster, 2017). Caranto and Lancaster (2017) also proposed that, under oxygen stress, production of intracellular NO may exceed its rate of oxidation to NO<sub>2</sub> and that this could result in atmospheric emissions of NO and/or its conversion to N<sub>2</sub>O. The current modeling scheme does not explicitly account for these potential pathways, which may or may not have been important under the aerobic incubation conditions. The mechanisms considered here assume (i) that NO2 accumulates due to the inability of NiOR to fully process NO<sub>2</sub> produced via AmOR, and (ii) that NO production occurs mainly via biological and/or abiotic reduction of NO<sub>2</sub> based on the rapid production of NO (and N<sub>2</sub>O) observed in both sterile and non-sterile soils under aerobic conditions following addition of NO2 (Venterea and Rolston, 2000a; Wei et al., 2017). Incorporating the pathway of NO (and N2O) emissions proposed by

Caranto and Lancaster (2017) into the 2SN model might allow for hypothesis testing, for example, by comparing simulations to observation made under varying  $O_2$  availability. This would likely require explicit incorporation of the individual steps in AmO, including  $NH_2OH \rightarrow NO \rightarrow NO_2^-$ , into the model, as well as additional measurements (e.g.,  $NH_2OH$ ). For biological  $N_2O$  production, the relative contributions of ammonia-oxidizing bacteria and archaea, and their respective kinetics, may vary with chemical conditions and nitrite-oxidizing activity (Giguere et al., 2017) and/or temperature (Xu et al., 2017). While the use of single kinetic expressions to simulate AmO, NiO, and NO and  $N_2O$  production was an efficient approach for the current application, additional modeling studies could determine if explicitly accounting for process-level diversity would provide additional insight.

While the two soils exhibited similar dynamics and temperature responses, there were notable differences in the magnitude of those responses. Soil A had consistently greater cumulative NO<sub>2</sub> and NH<sub>3</sub> volatilization than soil B, both of which were likely driven by a greater pH in soil A, which shifts the NH<sub>4</sub>-NH<sub>3</sub> equilibrium toward NH<sub>3</sub>. Conversely, despite greater cumulative NO<sub>2</sub>, soil A had substantially less cumulative NO production at all temperatures except 30 °C, and less cumulative N<sub>2</sub>O at 10, 22 and 30 °C. This effect could have been driven by the lower pH in soil B, which shifts the NO<sub>2</sub>-HNO<sub>2</sub> equilibrium toward HNO2, which is known to favor abiotic NO production and at least hypothesized to favor abiotic N<sub>2</sub>O production (Thorn and Mikita, 2000). Obtained values of model parameters for the two soils were of similar magnitude, particularly for  $k_{UH}$ ,  $K_{NiO}$ ,  $\mu_{NiO}$  at  $\leq$  22 °C and  $k_f$  at  $\geq$  22 °C (Table 1, Fig. 4). In contrast, the pH-regulating parameters ( $\alpha_{UH}$ ,  $\alpha_{AmV}$ and  $\alpha_{AmO}$ ) were consistently 10 to 100 times less in soil A than B reflecting the greater apparent pH buffering capacity of soil A. Alternative methods for simulating pH consider buffering capacity explicitly (Wang et al., 1998). Such pH simulation methods that utilize independent estimates of pH buffering capacity might improve the robustness of the pH component of the 2SN model and reduce the number of parameters requiring estimation.

Inclusion of the sink term  $k_f NO_2$  in Eq. (6) is a hypothesis to account for the overestimation of NO<sub>3</sub> accumulation that was simulated without this term (Fig. 2S) and for the incomplete recovery of N in measured forms (Table 2). Further work is needed to test this or alternative hypotheses. A possible pathway for the unmeasured loss is abiotic incorporation or 'fixation' of NO<sub>2</sub> into phenolic and/or humic fractions of soil organic matter. Fitzhugh et al. (2003) found that 30-60% of  $^{15}$ N-labelled NO $_{2}^{-}$  applied to three O-horizon forest soils was fixed within 15 min of application and 25–50% was retained after 28 d. The amounts fixed by the mineral soils studied here were likely substantially less than that. However, the same processes involved in NO<sub>2</sub> incorporation into soil organic matter, including nitrosation, can also produce N gases including N2O, dinitrogen (N2) and methyl nitrite (CH3ONO) (Stevenson and Swaby, 1964; Thorn and Mikita, 2000; Wei et al., 2017). Thus, the potential for these processes to contribute to unmeasured N loss pathways is greater than the potential amount of fixed NO<sub>2</sub>. In addition, the protonated form of NO<sub>2</sub> (HNO<sub>2</sub> or HONO) can also be emitted as a gas (Su et al., 2011). An alternative hypothesis is an unmeasured sink for NO<sub>3</sub>, such as immobilization of NO<sub>3</sub> (Fitzhugh et al., 2003) or heterotrophic denitrification. This possibility was examined in separate simulations that included a sink term for NO<sub>3</sub> in Eq. (7), which did not improve model performance. Wertz et al. (2018) found evidence for denitrification in frozen soil (≤0.5 °C), amended with inorganic N and plant residues (1000  $\mu$ g C g<sup>-1</sup>), and incubated at a headspace:soil ratio of 4.2 ml g<sup>-1</sup> dry soil (compared to 25 ml g<sup>-1</sup> used here). Under these conditions, increasing  $NO_2^-$  over time was accompanied by decreasing NO<sub>3</sub>, which was not observed here, and was likely driven by O<sub>2</sub> depletion in occluded microsites (Wertz et al., 2018). The apparent background  $N_2O$  production ( $b_{N_2O}$ , Eq. (9)) was simulated here as being independent of NO<sub>2</sub> and may have originated from microsite denitrification. However, given the highly aerobic conditions, this source more likely evolved from NO<sub>2</sub> present at levels that were below detection

and/or from other nitrification-driven reactions such as those involving NH<sub>2</sub>OH (Liu et al., 2017a). Cumulative amounts of background N<sub>2</sub>O ranged from 2 to 4  $\mu g$  N g<sup>-1</sup> and therefore could not explain the unaccounted-for NO $_3^-$  (Fig. 2S) although it did account for 17–60% of total simulated cumulative N<sub>2</sub>O (Fig. 3c).

The MMRT model was useful for expressing  $\mu_{NiO}$  and  $\mu_{AmO}$  as continuous functions of temperature, which was the main objective. Of secondary interest was estimation of optimum temperatures which were only obtained for soil A. The optimum temperature estimates are likely not robust due to the limited upper temperature range, which was also the likely reason for the lack of curvature in the MMRT results for soil B. Nonetheless, the MMRT functions and the functions obtained for the other parameters, allow the model, in theory, to be applied under dynamic temperature regimes at least for temperatures <30 °C (an example application is provided as SI and the results are shown in Fig. 4S). While 2SN can account for multiple process interactions, in its current form it is restricted to well-mixed, primarily aerobic soil volumes. While this application is useful for testing hypotheses and exploring mechanisms and kinetics, to extend its applicability, 2SN would need to be integrated with models that account for other processes occurring over a broader range of conditions. These processes, which are addressed by other models, include diffusion of solutes and gases (Venterea and Rolston, 2000b), water flux, soil anaerobicity and heterotrophic denitrification (Riley and Matson, 2000) and plant N uptake (Inselsbacher et al., 2013). Apart from the modeling aspects of the study, the empirical findings suggest that the presence of available N at cold temperatures may give rise to large N gas losses due to reactions involving NO<sub>2</sub>. This further suggests that elevated N<sub>2</sub>O emissions observed under colder temperatures in the field (Wagner-Riddle et al., 2008) might be at least partly driven by these processes, but this requires further investigation.

## Declaration of competing interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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## Appendix A. Supplementary data

Supplementary data to this article can be found online at https://doi.org/10.1016/j.soilbio.2020.107727.

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