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# Metabolic biochemical models of $N_2$ fixation for sulfide oxidizers, methanogens, and methanotrophs

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ABSTRACT Dinitrogen  $(N_2)$  fixation provides bioavailable nitrogen to the biosphere. However, in some habitats (e.g., sediments), the metabolic pathways of organisms carrying out  $N_2$  fixation are unclear. We present metabolic models representing various chemotrophic  $N_2$  fixers, which simulate potential pathways of electron transport and energy flow, resulting in predictions of whole-cell stoichiometries. By balancing mass, electrons, and energy for metabolic half-reactions, we quantify the electron usage for nine  $N_2$  fixers. Our results demonstrate that all modeled organisms fix sufficient  $N_2$  for growth. Aerobic organisms allocate more electrons to  $N_2$  fixation and growth, yielding more biomass and fixing more  $N_2$ , while methanogens using acetate and organisms using sulfate allocate fewer electrons. This work can be applied to investigate the depth distribution of  $N_2$  fixers based on nutrient availability, complementing field measurements of biogeochemical processes and microbial communities.

**IMPORTANCE** N<sub>2</sub> fixation is an important process in the global N cycle. Researchers have developed models for heterotrophic and photoautotrophic N<sub>2</sub> fixers, but there is a lack of modeling studies on chemoautotrophic N<sub>2</sub> fixers. Here, we built nine biochemical models for different chemoautotrophic N<sub>2</sub> fixers by combining different types of half-chemical reactions. We include three sulfide oxidizers using different electron acceptors (O<sub>2</sub>, NO<sub>3</sub><sup>-</sup>, and Fe<sup>3+</sup>), contributing to the sulfur, nitrogen, and iron cycles in the sediment. We have two methanogens using different substrates (H<sub>2</sub> and acetate) and four methanotrophs using different electron acceptors (O<sub>2</sub>, NO<sub>3</sub><sup>-</sup>, Fe<sup>3+</sup>, and SO<sub>4</sub><sup>2-</sup>). By modeling these methane producers and users in the sediment and their N<sub>2</sub>-fixing metabolic pathways, our work can provide insight for future carbon cycle studies. This study outlines various metabolic pathways that can facilitate N<sub>2</sub> fixation, with implications for where in the environment they might occur.

**KEYWORDS** N<sub>2</sub> fixation, biochemical model, sulfide oxidizers, methanogens, methanotrophs, sediment, electron allocation, energy, CFM-CNF

B iological dinitrogen ( $N_2$ ) fixation, one of the key pathways in the global nitrogen ( $N_2$ ) cycle, provides bioavailable  $N_2$  to the global biosphere (1–5).  $N_2$  fixation is widespread across the Earth (6) and is found in various environments, including oligotrophic oceans (7), deep seas (8), nutrient-rich coastal waters (9), and the cold Arctic (5, 10, 11). However, in some ecosystems with high organismal and habitat diversity (e.g., wetlands, seagrass meadows, estuaries), estimating  $N_2$  fixation rates and their drivers remains challenging (12, 13). In order to explore  $N_2$  fixation mechanisms, it is important to consider the  $N_2$  fixation reaction itself (equation 1), which shows that  $N_2$  fixation requires electrons and a large amount of energy (16 ATP per  $N_2$ ). As a result, sources of electrons and energy are important while considering this process. Redox and electron acceptor availability tend to shape the depth distribution of  $N_2$  fixers in

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aquatic sediments, determining where N<sub>2</sub> fixation occurs. Investigating these patterns is essential for understanding how N2 fixation contributes to global nitrogen and carbon cycling.

$$N_2 + 8e^- + 10H^+ + 16ATP + 16H_2O \rightarrow 2NH_4^+ + H_2 + 16ADP + 16P_i$$
 (1)

Modeling studies of diazotrophic metabolism have primarily focused on N2 fixation by photoautotrophic cyanobacteria (14-16) and, to a lesser extent, heterotrophic bacteria (12, 17, 18). However, other "chemotrophic" energy-generating pathways can be coupled to N<sub>2</sub> fixation, including methane oxidation, methanogenesis, and sulfur oxidation. Little is known about N2 fixation by chemoautotrophs, despite their crucial role in Earth's biogeochemical history and continued prevalence in marine and freshwater systems, nor have models of these organisms been developed. Quantitative models can help predict potentially viable chemoautotrophic metabolic pathways to provide electrons and energy for N<sub>2</sub> fixation (17, 19-22). Here, we constructed nine biochemical models for nine chemoautotrophs with different resource utilizations (Table 1). We named them cell flux models of chemotrophic nitrogen fixers (CFM-CNF).

Electrons for N<sub>2</sub> fixation can be provided by some carbon (C) oxidation reactions (4, 23-25). For example, evidence shows that in methanotrophs, which are organisms that metabolize methane as their chemical energy source, methane oxidation can be coupled to N2 fixation (26), with electrons transferred both to N2 and to electron acceptors for energy production. For example, O2 is a favorable electron acceptor in oxic environments, while in anoxic environments, NO<sub>3</sub><sup>-</sup> (27), Fe<sup>3+</sup> (28), and the less favorable acceptor  $SO_4^{2-}$  (29) are all reported as electron acceptors in methanotrophs (30, 31). These various electron acceptors distinguish different types of methanotrophs: O<sub>2</sub> reducers, NO<sub>3</sub><sup>-</sup> reducers, Fe reducers, and SO<sub>4</sub><sup>2-</sup> reducers. We included these four different types of methanotrophs in this modeling study to represent the variation of these electron acceptors in different habitats.

In the global carbon cycle, methanogens, which are organisms that can produce methane, also play an important role. The methane production processes are electronaccepting reactions that can reduce CO<sub>2</sub> to methane and release energy. Hydrogen (H<sub>2</sub>) and acetate are important substrates for methanogens (32, 33). Some methanogens have also been reported as N<sub>2</sub> fixers, which broadens the organisms capable of N<sub>2</sub> fixation into the Archaea (34). However, more studies are needed to explore the coupling mechanism between methanogenesis and N<sub>2</sub> fixation as part of a suite of possible metabolic pathways that could support N2 fixation. In this study, we include methanogen (acetate and H<sub>2</sub> oxidizers) models to investigate the mechanism in detail.

Previous studies have also reported that sulfur oxidation, an electron-donating reaction, can be coupled with N<sub>2</sub> fixation in sediments (35, 36) as an electron source. Sulfide-oxidizing microorganisms are commonly reported in sulfidic water columns (37), marine and lake sediments (38, 39), microbial mats (40), and hydrothermal vents (41).

TABLE 1 Models and the applied half reactions<sup>a</sup>

Model	Rd (donation)	Ra (acceptance)
Sulfide oxidizer (O <sub>2</sub> )	2	6
Sulfide oxidizer (NO <sub>3</sub> <sup>-</sup> )	2	7
Sulfide oxidizer (Fe <sup>3+</sup> )	2	8
Methanogen (acetate)	3	9
Methanogen (H <sub>2</sub> )	4	9
Methanotroph (O <sub>2</sub> )	5	6
Methanotroph (NO <sub>3</sub> <sup>-</sup> )	5	7
Methanotroph (Fe <sup>3+</sup> )	5	8
Methanotroph (SO <sub>4</sub> <sup>2-</sup> )	5	10

 $^{o}$ Note: equations 2 to 10 are half reactions listed in Table 2 (Rd) and (Table 3) (Ra). For all of the models, Rn (N<sub>2</sub> fixation) is equation 1 listed in the introduction, and Rc (biosynthesis) is equation 11.

TABLE 2 A list of half reactions for electron donors (Rd)

Chemical equation	Equation number
$\frac{1}{8} H_2 S + \frac{1}{2} H_2 O = \frac{1}{8} S O_4^{2-} + \frac{5}{4} H^+ + e^-$	2
$\frac{1}{8} \text{ CH}_3 \text{COO}^- + \frac{3}{8} \text{ H}_2 \text{O} = \frac{1}{8} \text{CO}_2 + \frac{1}{8} \text{HCO}_3^- + \text{e}^- + \text{H}^+$	3
$\frac{1}{2}$ H <sub>2</sub> = H <sup>+</sup> + e <sup>-</sup>	4
$\frac{1}{4}$ H <sub>2</sub> O + $\frac{1}{8}$ CH <sub>4</sub> = $\frac{1}{8}$ CO <sub>2</sub> + H <sup>+</sup> + e <sup>-</sup>	5

These sulfide oxidizers can use  $O_2$  (39),  $NO_3^-$  (42, 43), and  $Fe^{3+}$  reduction (44) to provide energy, and all of these reactions have been reported to have a coupling effect with  $N_2$  fixation (7, 45, 46).

For all of these organisms above (including methanotrophs [O<sub>2</sub> reducers, NO<sub>3</sub>reducers, Fe<sup>3+</sup> reducers, and SO<sub>4</sub><sup>2-</sup> reducers], methanogens [H<sub>2</sub> oxidizers, and acetate oxidizers], and sulfide oxidizers [O<sub>2</sub> reducers, NO<sub>3</sub><sup>-</sup> reducers, Fe<sup>3+</sup> reducers]; Table 1), more studies are needed to investigate the potential chemical pathways or use energetic data to understand how N2 fixation affects their growth or ecology. Each of the nine biochemical models built in this study includes four different types of reactions (Fig. 1a): an electron donation reaction (Rd) to donate the electrons to the reductive half-reactions including synthesis and energy providers; a N2 fixation (Rn) half-reaction and a biosynthesis (Rc) half-reaction to fix N2 and grow, and an electron acceptance reaction (Ra) to provide enough energy for the N<sub>2</sub> fixation and biosynthesis. The constructed models integrate both the sources and usage of electrons and energy and consider N<sub>2</sub> fixation and growth, which are two essential processes in the cells of N<sub>2</sub> fixers. This model framework was adapted from Rittmann and McCarty (47) and follows the fundamental laws of mass, electron, and energy conservation. Based on these energy relationships, we calculated electron allocation, biomass yield, and N2 fixation yield (Fig. 1b) and compared these results among the nine N2 fixers. Our models address the following questions. (i) What key biochemical reactions are coupled with N2 fixation in different chemoautotrophs? (ii) How are electrons allocated to different biochemical reactions in these organisms? (iii) How do electron acceptor efficiencies influence N2 fixation and growth?

#### **RESULTS AND DISCUSSION**

Our study includes nine different models: sulfide oxidizers ( $O_2$  reducers,  $NO_3^-$  reducers, Fe<sup>3+</sup> reducers), methanogens ( $H_2$  oxidizers and acetate oxidizers), and methanotrophs ( $O_2$  reducers,  $NO_3^-$  reducers, Fe<sup>3+</sup> reducers, and  $SO_4^{2-}$  reducers), which have all been listed in Table 1. The first step of our simulation was to determine the appropriate half-reactions ( $R_3$ ,  $R_3$ ,  $R_4$ ,  $R_5$ ) for each model.

TABLE 3 A list of half reactions for electron acceptors (Ra)

Chemical equation	Equation number
$\frac{1}{4}$ O <sub>2</sub> + H <sup>+</sup> + e <sup>-</sup> = $\frac{1}{2}$ H <sub>2</sub> O	6
$\frac{1}{8}NO_3^- + \frac{5}{4}H^+ + e^- = \frac{1}{8}NH_4^+ + \frac{3}{8}H_2O$	7
$Fe^{3+} + e^{-} = Fe^{2+}$	8
$\frac{1}{8} \text{ CO}_2 + \text{ H}^+ + \text{e}^- = \frac{1}{4} \text{ H}_2 \text{O} + \frac{1}{8} \text{ CH}_4$	9
$\frac{1}{8}SO_4^{2-} + \frac{5}{4}H^+ + e^- = \frac{1}{8}H_2S + \frac{1}{2}H_2O$	10

#### Overview of the half-chemical reactions

Here, we describe how we built the CFM-CNF by using four different half-chemical reactions (Table 1; Fig. S1). For sulfide oxidizers, they oxidize the sulfide to provide electrons and can use O<sub>2</sub>, NO<sub>3</sub><sup>-</sup>, and Fe<sup>3+</sup> as electron acceptors. So, we considered sulfide oxidation (equation 2) as Rd and included O<sub>2</sub> (equation 6), NO<sub>3</sub><sup>-</sup> (equation 7), and Fe<sup>3+</sup> reduction (equation 8) (39, 42, 43) as Ra for different types of sulfide oxidizers (Table 1). For methanogens, their key characteristic is to produce methane, so we consider the methane-producing half-reaction (equation 9) as the electron acceptance (Ra). There are different types of methanogens using different substrates to provide energy and electrons, including acetate (equation 3) and H<sub>2</sub> reduction (equation 4) (48), so we use these two as the two different Rd for two methanogens. Methanotrophs oxidize methane to provide electrons and energy, so we used methane oxidation (equation 5) as the Rd for the methanotroph models. To provide enough energy, they can reduce  $O_2$  (equation 6),  $NO_3^-$  (equation 7),  $Fe^{3+}$  (equation 8), and  $SO_4^{2-}$  (equation 10) (27–29). We used these half reactions as Ra for different methanotrophs. The half-reactions to represent Rn and Rc are listed as equations 1 and 11, which show the general N<sub>2</sub> fixation and growth processes (47).

$$\frac{1}{5}CO_2 + \frac{1}{20}NH_4^+ + \frac{1}{20}HCO_3^- + H^+ + e^- = \frac{1}{20}C_5H_7O_2N + \frac{9}{20}H_2O$$
 (11)

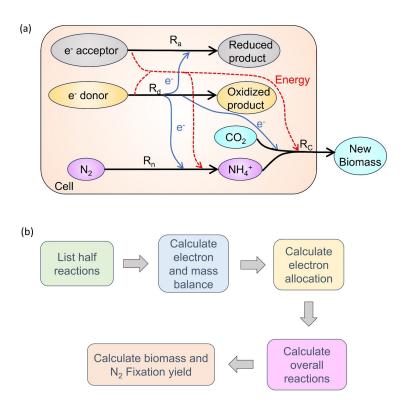


FIG 1 Model and simulation. (a) CFM-CNF schematic. Black arrows mean four main reaction types: Ra (electron acceptance), Rd (electron donation), Rn ( $N_2$  fixation), and Rc (biosynthesis via C fixation). Blue arrows mean electron flow from Rd to others. Red dash arrows mean energy flow. (b) Workflow to do the simulation. For each of the models, we listed the potential chemical reactions included, balanced the electrons and mass, and calculated the electron allocation. We added all the half reactions and calculated the overall reactions. Based on overall reactions, we calculate the biomass and  $N_2$  fixation yield and do the comparison.

#### **Electron allocation**

These half-reactions are essential to understanding how electrons are allocated to different cellular processes (e.g., N2 fixation) across these nine organisms. Our models simulate the electron allocations, which represent the number of electrons allocated to each half-reaction (Ra, Rc, and Rn) if there is one electron released from Rd. When we compare the allocation to Rc and Rn among different models (Fig. 2; Table S2), methanotrophs (O2) have the highest proportion of electrons dedicated to biosynthesis (0.456) and N<sub>2</sub> fixation (0.091) (Fig. 2; Table S2). Previous evidence showed that methane oxidation under aerobic conditions can enhance N2 fixation (26), which is consistent with our model results. Methanotrophs (except for when  $SO_4^{2-}$  is the electron acceptor) use more electrons in Rc and Rn than sulfide oxidizers, yet the opposite is true for Ra (Fig. 2). Evidence for methanotrophic N<sub>2</sub> fixers has been reported in previous cultural and genetic studies: with the sequencing of nifH fragments, researchers found that both types I and II methanotrophs could fix N2 (49). In studies of wetlands (26) and root tissues of paddy rice (50), N2 fixation activity was also observed. Our results indicate the theoretical electron acceptance pathways for these methanotrophs and suggest that aerobic pathways could be those with the highest electron efficiency.

Methanogens (acetate) and methanotrophs ( $SO_4^{2-}$ ) use more electrons in Ra and less in Rc and Rn. Although the electrons used in Rc and Rn are low, these values still exist, meaning these processes can still happen in methanogens (acetate) and methanotrophs

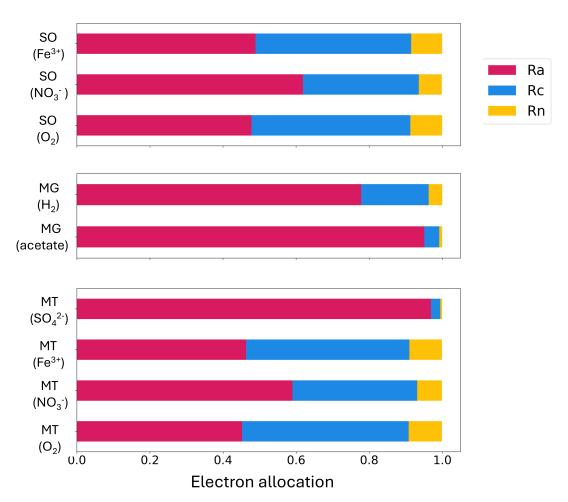


FIG 2 Electron allocation for different organisms. SO: sulfide oxidizers (top panel). MG: methanogens (middle panel). MT: methanotroph (bottom panel). The length of the bars represents electron usage in different reactions. Pink bars are electrons used for Ra (electron acceptance), blue bars are electrons used in Rc (biosynthesis via C fixation), and yellow bars are electrons used for Rn (N<sub>2</sub> fixation). The parentheses mean different electron acceptors or donors for different models.

 $(SO_4^{2-})$ . This is consistent with the previous studies: for methanotrophs using  $SO_4^{2-}$ , studies found that they can live with only  $N_2$  sources (49). For methanogens, a previous wetland study suggested that organic matter could be the electron donors for methanogens, and they can fix  $N_2$  (26). Our results suggest that although methane and  $SO_4^{2-}$  used in these two organisms may not provide large amounts of energy to support biosynthesis and  $N_2$  fixation, their electron donation pathways, including acetate oxidation and methane oxidation, could provide enough energy for their survival and  $N_2$  fixation. These results indicate that in some sedimentary environments with organic C, methane, and  $SO_4^{2-}$ ,  $N_2$  fixers can exist and may be supported by the half-reactions such as acetate oxidation, methane oxidation, methanogenesis, and  $SO_4^{2-}$  reduction. Our result in electron allocation indicates how electrons are distributed among chemical reactions, influencing reaction rates and ultimately affecting biomass and  $N_2$  fixation yields.

#### Overall reactions and yield: biomass and nitrogen yield per electron

Based on the half-reactions and potential electron and energy relationships listed above, we calculated the coefficient of each half-reaction and added all reactions together to obtain nine overall reaction equations (see Table S1), representing the nine different model metabolic organisms. We assume there is one transported electron for each reaction to normalize the equation. Based on these overall reactions, we can compare biomass and  $N_2$  fixation yields (Fig. 3; Table 4) using the coefficients of the biomass term ( $C_5H_7O_2N$ ) and  $N_2$  term (Table S1). Figure 3a and b show the amount of biomass produced and  $N_2$  fixed (in mmol) per mol of electron transport. In Fig. 2 and Table S1, all nine overall reactions have a positive coefficient for  $N_2$  as a reactant and biomass as a product, suggesting that the  $N_2$  fixation reaction (Rn) and biosynthesis (Rc) can be performed by all nine of these model organisms.

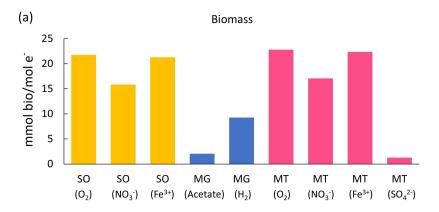
The significance of this finding is to identify and compare the diverse metabolic pathways that may support  $N_2$  fixation in sedimentary systems with varied nutrient availability. Based on the availability of various electron donors and acceptors in the sediments, our research suggests the potential microbial metabolic pathways that can maintain  $N_2$  fixation under a range of biogeochemical conditions. These models have broader implications that  $N_2$ -fixing communities may be highly flexible with various possible metabolic pathways, which can be adapted to changing environments. Furthermore, this model provides the basic framework for understanding nutrient cycling and microbial ecology in sedimentary environments and other environments inhabited by chemoautotrophic  $N_2$  fixers.

The trend of  $N_2$  fixation yield (Fig. 3b) in different organisms is similar to the biomass yield (Fig. 3a). This is because if more energy and electrons can be provided to biosynthesis, based on the constant fraction of biosynthesis and  $N_2$  fixation in synthesis reactions (equations 15 and 16), more energy and electrons can also be transported to  $N_2$  fixation, causing a higher  $N_2$  fixation yield. In the following sections, we divided the nine organisms into high-efficiency groups (yield higher biomass and  $N_2$  fixation, including methanotrophs  $[O_2]$ , methanotrophs  $[NO_3^-]$ , methanotrophs  $[Fe^{3+}]$ , and all modeled sulfide oxidizers) and low-efficiency groups (yield lower biomass and  $N_2$  fixation, including methanogens and methanotrophs  $[SO_4^{2-}]$ ).

#### High-efficiency N2 fixers

When using the same electron acceptors, methanotrophs can form more biomass (methanotrophs  $[O_2]$ : 22.81 mmol/mol e<sup>-</sup>, methanotrophs  $[NO_3^-]$ : 17.07 mmol/mol e<sup>-</sup>, methanotrophs  $[Fe^{3+}]$ : 22.35 mmol/mol e<sup>-</sup>) and fix more  $N_2$  (methanotrophs  $[O_2]$ : 11.41 mmol/mol e<sup>-</sup>, methanotrophs  $[NO_3^-]$ : 8.534 mmol/mol e<sup>-</sup>, methanotrophs  $[Fe^{3+}]$ : 11.18 mmol/mol e<sup>-</sup>) than sulfide oxidizers (biomass: sulfide oxidizers  $[O_2]$ : 21.76 mmol/mol e<sup>-</sup>, sulfide oxidizers  $[NO_3^-]$ : 15.85 mmol/mol e<sup>-</sup>, sulfide oxidizers  $[Fe^{3+}]$ : 21.28 mmol/mol e<sup>-</sup>;  $N_2$  fixation: sulfide oxidizers  $[O_2]$ : 10.88 mmol/mol e<sup>-</sup>, sulfide oxidizers  $[NO_3^-]$ : 7.927 mmol/mol e<sup>-</sup>, sulfide oxidizers  $[Fe^{3+}]$ : 10.64 mmol/mol e<sup>-</sup>). For these two different electron donors, methane oxidation  $(\Delta G^{0'} = -23.52 \text{ kJ/e}^-\text{eq})$ 

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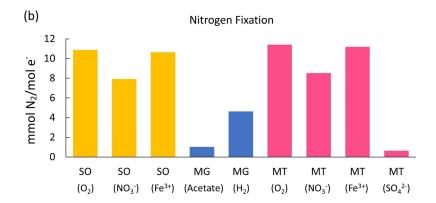


FIG 3 Biomass formation (a) and N<sub>2</sub> fixation (b) comparison. Yellow bars represent sulfide oxidizers (SO) results, blue bars are the methanogens (MG) results, and pink bars are methanotrophs (MT) results.

releases more energy than sulfide oxidation ( $\Delta G^{0'} = -20.85 \text{ kJ/e}^{-}\text{eg}$ ), supporting more N<sub>2</sub> fixation and growth. Previous studies have found that sulfide oxidizers and N<sub>2</sub> fixers in aquatic systems and sediment (36, 45), with the electron acceptors  $O_2$  and  $NO_3^-$ . Although we haven't found an experimental comparison in N<sub>2</sub> fixation yield between sulfide oxidizers and methanotrophs, our study calculated these theoretical values and fills the gap.

We can also compare the yields among models with different electron acceptors. In our results, O2 is the best electron acceptor yielding more biomass (Fig. 3a; Table 4, sulfide oxidizer [O<sub>2</sub>]: 21.76 mmol/mol e<sup>-</sup>, methanotrophs [O<sub>2</sub>]: 22.81 mmol/mol e<sup>-</sup>) and fixing more N<sub>2</sub> (Fig. 3b; Table 4, sulfide oxidizer [O<sub>2</sub>]: 10.88 mmol/mol e<sup>-</sup>, methanotroph [O<sub>2</sub>]: 11.41 mmol/mol e<sup>-</sup>) than other electron acceptor models. According to the

TABLE 4 Models, electron donors and acceptors, metabolic pathways, and yield

Model	e <sup>-</sup> donor	e <sup>-</sup> acceptor	Metabolic pathway	Biomass yield	N <sub>2</sub> fixation yield
				(mmol bio/mol e <sup>-</sup> )	(mmol N <sub>2</sub> /mol e <sup>-</sup> )
Sulfide oxidizer (O <sub>2</sub> )	H <sub>2</sub> S	O <sub>2</sub>	Oxygenic sulfide oxidation	21.76	10.88
Sulfide oxidizer (NO <sub>3</sub> <sup>-</sup> )	H <sub>2</sub> S	$NO_3^-$	Anaerobic sulfide oxidation	15.85	7.927
Sulfide oxidizer (Fe <sup>3+</sup> )	H <sub>2</sub> S	Fe <sup>3+</sup>	Anaerobic sulfide oxidation	21.28	10.64
Methanogen (acetate)	Acetate	CO <sub>2</sub>	Methanogenesis	2.053	1.027
Methanogen (H <sub>2</sub> )	H <sub>2</sub>	CO <sub>2</sub>	Methanogenesis	9.261	4.631
Methanotroph (O <sub>2</sub> )	CH <sub>4</sub>	O <sub>2</sub>	Aerobic methane oxidation	22.81	11.41
Methanotroph (NO <sub>3</sub> <sup>-</sup> )	CH <sub>4</sub>	NO <sub>3</sub>	Anaerobic methane oxidation	17.07	8.534
Methanotroph (Fe <sup>3+</sup> )	CH <sub>4</sub>	Fe <sup>3+</sup>	Anaerobic methane oxidation	22.35	11.18
Methanotroph (SO <sub>4</sub> <sup>2-</sup> )	CH <sub>4</sub>	SO <sub>4</sub> <sup>2-</sup>	Anaerobic methane oxidation	1.276	0.638

energy state of reactions,  $O_2$  reduction releases more energy ( $\Delta G^{0'} = -78.72 \, \mathrm{kJ/e^-eq}$ ) per electron transport, which provides more energy for growth and  $N_2$  fixation. These efficient aerobic  $N_2$  fixers have been found in soil (49) and fish gills (45). Our models can be used to predict the metabolic pathways, biomass, and  $N_2$  fixation yield of these organisms.

### Low-efficiency N<sub>2</sub> fixers

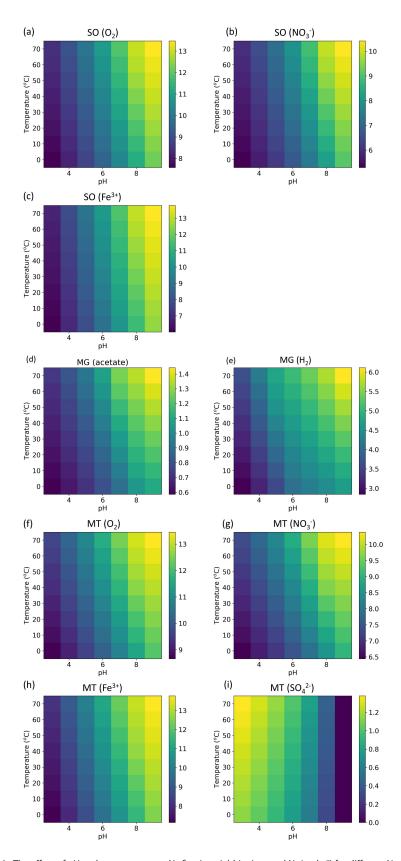
In our simulation results (Table S1),  $N_2$  fixation can be performed by all nine of these model organisms, including some less efficient  $N_2$  fixers, e.g., methanotrophs ( $SO_4^{2^-}$ ). Figure 3 shows that  $SO_4^{2^-}$  is a less effective acceptor, which can only form 1.276 mmol bio/mol  $e^-$  and fix 0.638 mmol  $N_2$ /mol  $e^-$ . Although it is less favorable ( $\Delta G^{0'} = 20.85 \, \mathrm{kJ/e^-eq}$ ), it can still happen mathematically, which provides a quantitative explanation for the existence of  $SO_4^{2^-}$  reduction in methanotrophs. This result is also consistent with field studies, which show that methanotrophic sulfate reducers exist (35) and can inhabit the sulfate–methane interface. In a recent study in cold seeps, researchers found that sulfate reducers could utilize anaerobic methane oxidation to support  $N_2$  fixation (51).

Methanogens (acetate) can form less biomass ( 2.053 mmol bio/mol e<sup>-</sup>) and fix less N<sub>2</sub> (1.027 mmol N<sub>2</sub>/mol e<sup>-</sup>) than most other modeled metabolic organisms, except for methanotrophs ( $SO_4^{2-}$ ) (Fig. 3; Table 4, 1.276 mmol bio/mol  $e^-$  and 0.638 mmol  $N_2$ /mol e<sup>-</sup>). Methanogens (H<sub>2</sub>) have a higher yield in biomass (9.261 mmol bio/mol e<sup>-</sup>) and N<sub>2</sub> fixation (4.631 mmol N<sub>2</sub>/mol e<sup>-</sup>) than methanogens (acetate), which is because H<sub>2</sub> oxidation is more favorable ( $\Delta G^{0'} = -39.87 \text{ kJ/e}^{-}\text{eg}$ ) and can provide more energy than methane oxidation. As a result, methanogens (H<sub>2</sub>) are more effective than methanogens (acetate). Previous studies in soil have found the nif gene in these two methanogens, contributing to the N production in the system (48). In their experiment, researchers found that the addition of H2 and CO2 could increase the nitrogenase activity and methane production significantly, while the addition of acetate did not have a significant effect, which is consistent with our model that H<sub>2</sub> is a better electron donor in methanogen N2 fixers. Researchers also found that these N2-fixing methanogen strains can exist in some O<sub>2</sub>-limited environments, including marine sediments and paddy soil (52). In the methanogen (acetate) and methanotroph (SO<sub>4</sub><sup>2-</sup>) models, Ra and Rd release less energy, leading to higher electron allocation to Ra to provide more energy and a lower allocation to Rc and Rn, resulting in less fixed N2 and growth.

#### Effect of pH and temperature

Temperature and pH are both important in biochemical reactions because they directly affect reaction rates and enzyme activity. Higher temperature increases the movement and collision frequency, raising the chance of reactants overcoming the activation energy barrier. Higher temperatures can also provide more energy for N2 fixation and biosynthesis, facilitating the processes of these reactions. pH can affect chemical reactions directly and modulate enzyme activities. In our model, we tested the effects of temperature and pH (Fig. 4), and we found that in most of the modeled organisms, with the increase in temperature and pH, the N<sub>2</sub> fixation yield increased. This trend may be explained by Le Chatelier's principle (53): when a system's equilibrium is disturbed, it adjusts to counteract the change and restore equilibrium. In the overall reactions for sulfide oxidizers, methanogens, and methanotrophs (Fe<sup>3+</sup>) (Table S1), since H<sup>+</sup> is on the product side of the overall reactions, decreasing H<sup>+</sup> (higher pH) drives the reaction forward to produce more H<sup>+</sup>, facilitating the overall reactions and fixing more N<sub>2</sub> and growing more biomass. For the methanotrophs (O<sub>2</sub> and NO<sub>3</sub>-), although H<sup>+</sup> occurs on the reactant side of the overall reactions, H<sup>+</sup> could inhibit methane-producing processes, which are the key electron donation processes to support N2 fixation. For methanotrophs (SO<sub>4</sub><sup>2-</sup>), decreased pH can facilitate their N<sub>2</sub> fixation because H<sup>+</sup> occurs on the reactant side of their overall reaction.

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**FIG 4** The effect of pH and temperature on  $N_2$  fixation yield (unit: mmol  $N_2$ /mol  $e^-$ ) for different  $N_2$  fixers (sulfide oxidizers [SO] using  $O_2$  (a),  $NO_3^-$  (b), and  $Fe^{3+}$  (c); methanogens [MG] using acetate (d) and  $H_2$  (e); Methanotrophs [MT] using  $O_2$  (f),  $NO_3^-$  (g),  $Fe^{3+}$  (h), and  $SO_4^{2-}$  (i)). Color means the  $N_2$  fixation yield (mol  $N_2$ /mol  $e^-$ ).

# Comparison with previous studies: empirical evidence of $N_2$ fixation for sulfide oxidizers, methanogens, and methanotrophs

Our predictive models based on physical, biochemical, and mathematical principles showed that N<sub>2</sub> fixation could occur alongside biosynthesis in all nine organisms analyzed in this study. Our theoretical findings are supported by previous studies using empirical techniques with varying confidence levels to examine these potential reactions in different habitats. For example, research on sulfide oxidizers in fish gills identified bacteria in the genus *Candidatus* Thiodiazotropha, an aerobic symbiont with the *nif* gene for N<sub>2</sub> fixation (45), which could be applied to our model for sulfide oxidizers (O<sub>2</sub>). Additionally, in cold seep ecosystems, researchers found that *Dechloromonas* sp. carried genes related to N<sub>2</sub> fixation (*nif*DHK), sulfur compound oxidation (*fccAB* and *soxABCXYZ*), and nitrate reduction (*napAB* and *nirBD*) (54), which could be applied to the sulfide oxidizer (NO<sub>3</sub><sup>-</sup>) model. Some N<sub>2</sub> fixers, such as *Thiobacillus ferrooxidans*, a sulfide oxidizer living in low pH habitats, were found to fix N<sub>2</sub> (55, 56) and, in some cases, reduce Fe<sup>3+</sup> (57), which may be related to our sulfide oxidizer (Fe<sup>3+</sup>) models.

For methanotrophs,  $N_2$  fixation can also be confirmed based on N isotope (26, 50) and genetic analysis (49). Auman found that aerobic methanotrophs, *Methylococcus* spp., and sulfide-reducing methanotrophs, *Methylosinus* spp., from soils can fix  $N_2$  (49). Dekas et al. observed that seep  $N_2$  fixation is methane-dependent, and that  $N_2$  fixation rates peak in narrow sediments because of anaerobic methanotrophic archaea and sulfate-reducing bacteria, which form symbionts and fuel the complex ecosystems (58). Cui et al. (26) found that nitrate-reducing methanotrophs, *Methylocystis* spp., in wetlands can fix  $N_2$ . In paddy soil under hypoxia, Yu et al. (59) found that methane oxidation coupled with iron reduction can significantly increase the biological  $N_2$  fixation rate, which can happen in *Methylocystis*, *Methylophilaceae*, and *Methylomicrobium*. The evidence above can, respectively, fit models of methanotroph  $(O_2)$ , methanotroph  $(SO_4^{2-})$ , methanotroph  $(NO_3^{-})$ , and methanotroph  $(Fe^{3+})$ .

Methanogens (*Methanococcus maripaludis* and *Methanococcus thermolithotrophicus*, oxidizing  $H_2$ ) in lab studies without N-amended media suggested fixed  $N_2$  was the sole N source (60), which is consistent with our methanogen ( $H_2$ ) model. Genetic analysis also shows that methanogens can fix  $N_2$  (61), for example, in a wetland soil incubation study, researchers found that methanogens using  $H_2$  and acetate both contain  $N_2$  fixation genes (*nifH*) (48), which confirms our findings. All these organisms and symbionts we listed above are commonly active in many aquatic and terrestrial ecosystems, particularly in locations with oxygen gradients or highly anoxic environments, for example, sulfide oxidizers in the redoxcline of the Black Sea (62) and methanogens in marine sediments (63).

### Model construction and comparison with different model types

Our model is a coarse-grained model (4), including some important biochemical processes inside the cells. Our model integrates both the sources and utilization of electrons and energy, focusing on two fundamental cellular processes in nitrogen-fixing organisms:  $N_2$  fixation and growth. This modeling framework is adapted from Rittmann and McCarty (47) and follows fundamental mass, electron, and energy conservation principles. For example, when considering half-reactions, we ensure that the energy-providing reactions provide sufficient energy for the overall process to proceed spontaneously. As for electron transport, the model includes both electron donors and acceptors. Various acceptence reactions include energy generation, biomass growth, and  $N_2$  fixation. Additionally, the model ensures that the mass of all chemical elements involved is conserved throughout the reactions.

Our coarse-grained model lies between simple equation models and detailed metabolic models. Different modeling approaches vary in detail and scope, each with strengths and limitations suited to specific applications. Detailed metabolic models can include numerous reactions based on omics data (64). However, they typically require constraints that are often difficult to validate (65–68). On the other end, highly simplified

models like Monod kinetics (69) are highly empirical yet may lack mechanistic processes (70). Coarse-grained models offer a middle-ground solution by resolving key physiological processes while remaining practical, flexible, and empirical (71).

In this study, we chose a coarse-grained model because it focuses on key cellular processes—such as electron donation and acceptance, and the budgets of mass, electrons, and energy—without relying on sets of poorly constrained parameters. We built our models upon an established method of electron allocation, which has been developed by experimental evidence (47). Although there is a possibility of increasing the detail, our level of simplification is deliberate and helps maintain consistency with available empirical data. It also improves computational efficiency and makes the model more broadly applicable across different organisms and environments. This model also provides a single solution rather than multiple possible outcomes, as often seen in more complex approaches like flux balance analysis. By aligning model complexity with data availability, we aim to keep our framework both reliable and widely usable, building on the success of similar approaches in previous studies in both Inomura groups (4, 14, 17, 19, 72) and other groups (6, 73–75).

#### **Future research**

#### Temporal dynamics

Our model begins with steady-state conditions instead of temporal dynamics. Because we are aiming at a steady sedimentary environment, where conditions do not change significantly on the time scale of minutes and hours. The steady-state assumption has been made in multiple previously published models, including most of the detailed metabolic networks (21, 22, 76), and our study followed these examples. Regardless, future research may resolve temporal dynamics to explore the shift in chemoautotrophic  $N_2$  fixation in a longer time series.

#### Depth distribution

Our models help to clarify the theoretical biochemical principles behind  $N_2$  fixation metabolism, which can be used to understand the spatial ecological niche of various chemoautotrophic  $N_2$  fixers. The availability and favorability of the reduction of the electron acceptors may interact to create a depth distribution of different  $N_2$  fixers along oxic-anoxic gradients in sediments. For example,  $NO_3^-$  reduction is more favorable than  $SO_4^{2-}$  reduction, resulting in  $NO_3^-$  reducers being found in the upper layer of the sediment (77, 78). In river estuarine sediments,  $SO_4^{2-}$  reduction was also reported to have a potential relationship with  $N_2$  fixation (79). Specifically, sampling from different sediment depths combined with transcriptomics and proteomics could further validate and expand our modeling results.

#### **Conclusions**

We constructed a whole-cell reaction stoichiometry of putative chemoautotrophic  $N_2$ -fixing organisms. The results show a range of electron allocation based on the energetics of the half-reactions. All these putative metabolic organisms allow  $N_2$  fixation and biosynthesis to occur, and thus, our work uncovers the potential reactions coupled with  $N_2$  fixation. Based on the electron allocation results,  $O_2$  is a better electron acceptor because chemotrophs using  $O_2$  can allocate more electrons to  $N_2$  fixation and growth. From the biomass and  $N_2$  fixation yield, we found that aerobic  $N_2$  fixars are more efficient, while  $SO_4^{2-}$  reducers and methanogens (acetate) are less efficient. However, even less favorable substrates,  $SO_4^{2-}$  and  $CH_4$ , can support  $N_2$  fixation. The variation between different organisms allows for the consumption of various substrates in the different catabolic reactions supporting  $N_2$  fixation, which may occur at different oxidative/reductive environments in aquatic systems at different depths. It is challenging to precisely measure the metabolisms of microorganisms living in sediments under variable environmental conditions. Therefore, our model will be useful in investigating

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the likely depth-dependent metabolic pathways for different substrate compositions. These predictions can complement field measurements by providing estimates of the contribution of chemoautotrophs to  $N_2$  fixation.

#### **MATERIALS AND METHODS**

Our CFM-CNF follows an original cell flux model (CFM) structure, which simulates Azotobacter vinelandii (17), an extensively studied soil-dwelling  $N_2$  fixer. We targeted organisms inhabiting sediments, where  $O_2$  concentrations are typically low. So, we assume that the  $O_2$  concentration is low enough that we can neglect the protection from  $O_2$  (i.e., the respiratory protection), especially for those anaerobes using non-oxygen substrates for electron acceptors living in anoxic environments. Since we did not target the heterotrophic organisms living in highly oxic environments (e.g., those in water columns), we did not include  $O_2$  inhibition in this model.

This model summarizes the cell metabolism and combines four biochemical reactions: electron donation (Rd), electron acceptance for non-synthesis purposes such as energy generation (Ra), biosynthesis (Rc), and  $N_2$  fixation (Rn). This model can be used to calculate electron flow, biomass, and  $N_2$  fixation yield. Here, we explained the calculation method step by step.

#### **Energy reactions**

Microorganisms obtain their energy for growth and maintenance from oxidation-reduction reactions, involving an electron donation half-reaction (Rd) and an electron acceptance half-reaction (Ra). For different potential  $N_2$  fixers in this study, we used different Rd and Ra (Table 1). We listed the Gibbs free energy change ( $\Delta G^{0'}$ ) for different Rd and Ra (Table S5), which describes their favorability under standard conditions. Based on their energy change, we then decide the energy-providing reactions and potential energy flow within the model.

## **Biosynthesis reactions**

Bacterial metabolic pathways involve two types of basic reactions, one for energy (mentioned in the last section) and the other for cellular synthesis (e.g., growth and maintenance). In this step, we need to consider the half-reactions for the synthesis part. For the growth of cells (Rc), we used equation 11. Since the purpose of this study is to model  $N_2$  fixers, here we also consider  $N_2$  fixation as a part of the maintenance of the cell (equation 1).

#### **Electron allocation**

When microorganisms use an electron-donor substrate for synthesis, a portion of their electrons  $(f_e)$  is initially transferred to the electron acceptor to provide energy. Other portions of electrons can be transferred to growth and maintenance  $(f_s)$ . The sum of  $f_e$  and  $f_s$  is 1 since we assumed one electron was transferred in this study.

Then, we calculated the allocation of electrons following the method in reference 47 (equations 12 to 14). Firstly, we calculated a parameter A (equation 12, derivation in the supplemental material) representing the number of electron donors that must be oxidized to supply the energy needed for cell synthesis. In equation 12,  $\Delta$   $G_n$  means Gibbs free energy change for N<sub>2</sub> fixation,  $\Delta$   $G_p$  means the energy required to convert the carbon source to the common organic intermediates (activated acetate) that cells use for synthesizing their macromolecules, and  $\Delta$   $G_{pc}$  means the energy used to convert the organic intermediates to cellular carbon. We used 18.8 kJ/e $^-$  eq as  $\Delta$   $G_{pc}$ .  $\varepsilon$  is energy transfer efficiency. Rittmann and McCarty (47) reported that with the optimum conditions, transfer efficiencies of 55% to 70% are typical for most anaerobic and

chemoautotrophic reactions, and a  $\varepsilon$  value of 0.6 is frequently employed to provide accurate results. So here we used  $\varepsilon$  equals to 0.6 for all the chemoautotrophs.

Here, an exponent n is used for the calculation of  $\varepsilon$ , according to Rittmann and McCarty (47), if  $\Delta$   $G_p$  is positive, n is 1; if is  $\Delta$   $G_p$  is negative, n is -1.  $\Delta$   $G_r$  was calculated by using Gibbs free energy change for the electron acceptance reaction (Ra) and Gibbs free energy change in the electron donation reaction (Rd).

$$A = -\frac{\left(f_n \times \Delta G_n + f_c \times \left(\frac{\Delta G_p}{\varepsilon^n} + \frac{\Delta G_{pc}}{\varepsilon}\right)\right)}{\varepsilon \Delta G_r}.$$
 (12)

We used the A value to calculate electron allocation to cell synthesis (equation 13,  $f_{Sr}$ , including Rc and Rn) and energy production (equation 14,  $f_{e}$ ). The derivation of equation 13 and equation 14 is in the supplemental material (equations S7 to S12).

$$f_S = \frac{1}{1+A} \tag{13}$$

$$f_e = \frac{A}{1+A} \tag{14}$$

Here, we explain the equations we used to calculate the fraction of biosynthesis and N<sub>2</sub> fixation. In equation 15,  $f_c$  means the fraction of electrons allocated to Rc over the total electrons allocated to Rc and Rn.  $Y_{\rm bio}^{\rm e^-:N}$  means the transferred electrons to biomass N ratio in Rc, and  $Y_{\rm N_2 fix}^{\rm e^-:N}$  means the transferred electrons to fixed N ratio in Rn. We calculated the ratio of Rc ( $Y_{\rm bio}^{\rm e^-:N}$ ) to the sum of Rc and Rn ( $Y_{\rm bio}^{\rm e^-:N} + Y_{\rm N_2 fix}^{\rm e^-:N}$ ) to obtain this electron allocation fraction of Rc ( $f_c$ ). In equation 16, the calculation is similar; we calculated this fraction of Rn ( $f_n$ ) out of the sum of Rn and Rc by using the electron ratio of Rn ( $Y_{\rm N_2 fix}^{\rm e^-:N}$ ) to the sum of Rc and Rn ( $Y_{\rm bio}^{\rm e^-:N} + Y_{\rm N_2 fix}^{\rm e^-:N}$ ).

$$f_c = \frac{Y_{\text{bio}}^{\text{e}^-:N}}{Y_{\text{bio}}^{\text{e}^-:N} + Y_{\text{N,fix}}^{\text{e}^-:N}}$$
(15)

$$f_n = \frac{Y_{\text{N_2fix}}^{\text{e}^-:\text{N}}}{Y_{\text{bio}}^{\text{e}^-:\text{N}} + Y_{\text{N_2fix}}^{\text{e}^-:\text{N}}}$$
(16)

#### Overall reactions and yield calculation

The mass is conserved in each half-reaction. We combine these reactions to balance electrons and energy. In all the cases in this study, the combination of Rd and Ra leads to energy production, which is, in turn, used for biosynthesis (Rc) and  $N_2$  fixation (Rn).

Equation 17 shows the calculation of Re (the overall reactions for energy). It can be calculated from the difference between Ra and Rd.

$$R_e = R_d - R_d \tag{17}$$

The synthesis reactions (Rs) (equation 18) are calculated from the difference between synthesis half reactions (Rsh) and donation (Rd).

$$R_s = R_{sh} - R_d \tag{18}$$

Here, we considered Rn and Rc as two different sections of the synthesis half reactions (Rsh). To calculate Rsh, we multiplied Rc by a fraction of Rc ( $f_c$ ) as the biosynthesis section. We multiplied Rn by a fraction of Rn ( $f_n$ ) as the N<sub>2</sub> fixation section.

$$R_{sh} = f_c R_c + f_n R_n \tag{19}$$

Then we substitute  $R_{sh}$  into equation 18, yielding equation 20.

$$R_s = f_c R_c + f_n R_n - R_d \tag{20}$$

Finally, we estimated the overall reaction, which is the sum of energy reactions (Re) and synthesis reactions (Rs). Here, we calculated this by using equation 21. We multiplied Re by the electron fractions to energy ( $f_e$ ) and Rs by the electron fractions to synthesis ( $f_s$ ).

$$R = f_e \times R_e + f_s \times R_s \tag{21}$$

We finally substituting equations 18 and 20 into equation 21 yields the final equation, and calculated the overall reactions (equation 22). The overall reactions for different modeling organisms are presented in Table S1. Based on the coefficients of the overall reactions, we can compare the yield for  $N_2$  fixation and biosynthesis. The coefficients before the  $N_2$  term mean the  $N_2$  fixed per electron, while the coefficients before the biomass term mean the biomass produced per electron.

$$R = f_e \times (R_a - R_d) + f_s \times (f_c R_c + f_n R_n - R_d)$$
(22)

The specific values we used to do the calculations (Table S3) are all from Rittmann and McCarty (47). For different models, we have different values, which have been listed in the supplementary parameter tables (Tables S3 through S6).

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#### **DATA AVAILABILITY**

The data sets generated and/or analyzed during the current study are available in the "Biochemical model for sediment  $N_2$  fixers" repository at https://doi.org/10.5281/zenodo.12680697.

#### **ADDITIONAL FILES**

The following material is available online.

#### Supplemental Material

Supplemental Material (mSystems00748-25-S0001.pdf). Tables S1 to S6; Fig. S1.

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