Ecological constraints and evolutionary trade-offs shape nitrogen fixation across habitats

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Abstract

From its earlier beginnings, life's expansion into new habitats has been profoundly shaped by its reciprocal interactions with Earth's changing environments. Understanding how ancient metabolisms co-evolved with their environments require uncovering the ecological and evolutionary processes that structured the functionally linked genes and networks underlying these metabolisms. Here, we focus on nitrogen (N_2) fixation, one of life's most critical metabolisms to all known life, and investigate the drivers of complexity in its associated gene machinery today. We used a large-scale comparative genomics framework to construct a comprehensive catalog of extant N_2 fixation-associated genes and assessed their distribution across diverse microbial genomes and environmental backgrounds. Genomes enriched in N_2 fixation genes generally have larger genome sizes, broader metabolic capabilities, wider habitat ranges, and are predominantly associated with mesophilic and aerobic lifestyles. Evolutionary reconstructions reveal a pattern of early gene gains in ancestral diazotrophs followed by lineage specific gene losses in later diverging taxa, suggesting evolutionary trade-offs shaped by changing environments. These findings demonstrate that the evolution of N_2 fixation has been

intertwined with the composition and organization of the genes supporting the overarching

N_2 metabolism, driven by feedbacks between genome evolution and shifting

environmental and ecological conditions.

<u>Introduction</u>

Biological nitrogen fixation ("N_2 fixation") is an ancient metabolism tightly coupled to

Earth's geosphere [1–6]. Nitrogenases, catalytically responsible for reducing N_2 to NH_3,

are the only known enzymes capable of this reaction found in microorganisms, collectively

known as diazotrophs [7]. By supplying essential nitrogen for life, nitrogenase has been

transformative for biological productivity and Earth's environment [1, 2, 8–10].

While the global significance of diazotrophs is well established through studies of marine

and freshwater cyanobacteria [11] [12], and plant-associated symbioses [13], the factors

driving the evolution of N_2 fixation in both historical and modern contexts remain unclear

[14]. It's been revealed that despite nitrogenase's ~3 billion year evolutionary history, its

core structural and functional features have remained largely conserved over time [4, 15–

17]. In contrast, numerous genes involved in its function and regulation have diversified

[3, 18].

The function of nitrogenase is orchestrated by a myriad of components in the cell.

Nitrogenase is a metalloenzyme found in three different forms, differentiated by their

metal cofactors, molybdenum (Mo), vanadium (V), or iron (Fe) [19–21]. Of these, is Mo-

nitrogenase (*nif*), the most well-studied and catalytically efficient [22], encoded by the

nifHDK structural genes. Nitrogenase activity depends on additional proteins for cofactor

assembly, including maturases (*nifBEN*) [23] as well as numerous nif genes that support

cellular functions such as electron transfer (*nifFJ*), transcription (*nifALI$_1$I$_2$*), and

biosynthesis (*nifXQUVYS*) [24, 25].

Beyond the nif genes, other gene clusters contribute to N_2 fixation, including those

involved in metal transport (*mod, feo, cys*), iron-sulfur cluster assembly (*suf, isc, fdx*) [25,

26], and nitrogen-carbon metabolism (*gln, nir, nap, hox*) [27, 28]. Many additional genes

remain functionally uncharacterized [25, 29]. Nitrogenase interacts directly with several

of these proteins [30–32] and can indirectly with others, for example, through pathways

for nitrogen and amino acid metabolism [24, 27], oxygen protection [33, 34], and electron

transport [35]. **Figure 1** illustrates the genetic framework underlying nitrogenase in the

model diazotroph *Azotobacter vinelandii*.

The composition of this complex genetic "machinery" varies widely across the tree of life,

from a minimal gene set in some organisms, to more than 80 nitrogenase-associated

genes in others [7, 25]. This variability underscores the need to examine the

environmental and physiological contexts that shape nitrogenase gene distribution

among taxa [3, 36].

Figure 1. Structure of the major and minor molybdenum nitrogenase (Nif) clusters, vanadium nitrogenase

(Vnf) and iron nitrogenase (Anf) clusters, and the molybdenum acquisition (Mod) cluster in model diazotroph

Azotobacter vinelandii DJ. Genome positions and gene sizes for each cluster are based on KEGG genome

reference T00885 for *A. vinelandii* DJ.

An integrated synthesis that brings together the diversity of N_2 fixation and its associated

genes within a broader ecological and evolutionary framework would be essential for

understanding how this key metabolism has been shaped across time and environments.

While previous studies have recognized the potentially dynamic nature of N_2 fixation gene
acquisitions and losses [36, 37], few have examined these patterns in depth. Here, we
address this gap by employing large-scale comparative genomics to explore how present-
day organismal lifestyles shape evolutionary trajectories, especially in the context of
varying N_2 fixation-associated gene content. Ultimately, our study reveals how genome-
scale evolution underlies the expansion of diazotrophs into new and diverse ecological
niches by reshaping N_2 fixation machinery over time.

Methods

Genome selection

The reference phylogeny Web of Life (WoL) [38] was selected as the basis of our study
because of its extensive genome coverage and phylogenetic reconstruction. For our
analysis, we kept WoL genomes with $\geq$90% completeness and $<$5% contamination,
following quality thresholds established by [39].

Protein fasta files associated with the genome accessions (named "*_protein.faa.gz")
were downloaded from NCBI with eutils [40] (accessed July 17th, 2023). Genomes
missing available NCBI protein fasta files were excluded from analysis. This reduced the
WoL genome dataset from 10,575 genomes to 7,458. Nucleotide sequences of
noncoding RNA genes were downloaded if they were available at GenBank or RefSeq
and the 16S rRNA genes were extracted.

Nitrogen fixation gene catalog curation

Protein fasta files were functionally annotated using the Kyoto Encyclopedia of Genes
and Genomes (KEGG) database [41]. Specifically, the translated amino acid sequences
were annotated with KEGG orthology (KO) identifiers by profiling each genome against
KEGG hidden Markov models (KEGG release 106) for all KOs [42] (cutoff E-value = 1e-
5) using *hmmscan* in HMMER version 3.2.2 (http://hmmer.org/). Custom Python scripts
were used to parse through each genome's *hmmscan* output and generate the final KO
presence-absence matrix. The presence/absence matrix was subset to genes known to

be involved in N_2 fixation (and which had KO identifiers), which were collected through an

extensive literature search that included foundational studies with thorough analyses of

genes involved in N_2 fixation (**Supplemental Table 1**). Gene involvement was supported

by functional confirmation, for example by evidence from protein interactions with

nitrogenase, gene knockout phenotypes, or differential gene expression under N_2 fixation.

Species tree construction and visualization

The WoL species tree was subsetted to genomes annotated with nifHDK using the

drop.tip function from the APE package [43] in R. We additionally confirmed the presence

of nitrogenase by phylogenetic placement of concatenated nifDK sequences, as

described in reference [4], from each genome. The resulting species tree, the gene

presence-absence matrix, and trait data were plotted using the ggTree R package

(version 3.6.2) [44].

Trait data curation

Optimal growth temperature (OGT), oxygen, pH preference, and habitat preference trait

data were collected for each genome by matching the Genbank accession number to

BacDive [45], NCBI BioProject [46], or GOLD JGI [47] as well as matching the NCBI taxon

IDs to the Madin et al (2020) phenotypic trait database [48]. Trait data was also predicted

for all genomes. OGTs were predicted using the OGT_prediction tool [49]. The regression

model used included both Bacteria and Archaea, but excluded using information of the

16S rRNA gene and genome size (_superkingdom-all species-_

all features ex genome size and rRNA.txt). The *Oxyphen* package was used for

oxygen metabolism prediction based on the number of oxygen utilizing genes in each

genome [50]. Predictions for pH were done with the Ramoneda et al. (2023) prediction

model which is based on genes that influence pH tolerance [51]. Habitat preference and

coverage were determined with ProkAtlas [52] by mapping the 16S rRNA gene

sequences to the ProkAtlas metagenome database. Barrnap version 0.9 [53] was used

to extract 16S rRNA sequences for genomes with missing annotations. Using a custom

python script, the longest 16S rRNA sequence was extracted for each genome as its

representative 16S rRNA gene sequence to correct for errors in sequence length due to

sequencing and assembly bias. Twenty-one genomes without a 16S rRNA gene

sequence were excluded. A nucleotide identity of 97% and a query length match of at

least 150 base pairs were used as thresholds. Habitat preference, categorized into

freshwater, saline, terrestrial, plant-associated, non-plant host-associated, and

hydrothermal, was defined as the environment with the highest 16S abundance for each

genome. Habitat coverage was determined by summing up the total number of habitats

where a genome was considered present and dividing it by the total number of habitats

(n=100) investigated by ProkAtlas. The presence of KEGG modules was predicted using

the KEGG KO annotations with MetaPathPredict (version 0) [54]. Metabolic coverage was

calculated as the total number of KEGG modules present in a genome divided by the total

number of modules (n=194) searched for with MetaPathPredict. Data collected from

databases and predicted data were cross-referenced and manually annotated to provide

the final trait data for each genome.

Data analysis and statistics

We compared the mean number of N_2 fixation genes across specific traits (oxygen,

temperature, and habitat preferences) with non-parametric methods using the

stat_compare_means function in the ggpubr R package (version 0.6.0) [55]. For the

categorical traits habit, oxygen, and temperature preference, we first applied a Kruskal-

Wallis test, followed by pairwise Wilcoxon rank-sum tests with Benjamini-Hochberg

correction. For temperature preference (categories: mesophilic and thermophilic) we

used the Wilcoxon rank-sum test directly. Compact letter display was used to report

pairwise groups whose means are discernibly different, based on a p-value of 0.05.

The gene presence-absence matrix was used in phylogenetic principal-component

analysis (PCA) performed with the *phyl.pca* function (method = "BM", mode ="corr") in

phytools R package [56]. This was done to visualize similarities and dissimilarities

between genomes in regard to N_2 fixation gene content while accounting for phylogenetic

relationships. This approach reduces the risk of over-interpreting similarities simple due

to common ancestry among taxa. The first two components were retained for

visualization. Pearson correlation between the presence-absence of N_2 fixation genes

was calculated with the *cor* function in the stats R package [58] and plotted using corrplot

[6] with hierarchical clustering and default p-value of 0.05, to identify patterns of gene co-
occurrence.

Evolutionary trends analysis

In order to test whether certain traits shared a coevolutionary history with N_2 fixation gene
abundance, phylogenetic linear regression models were fit using the *phylolm* function in
the phylolm R package (version 2.62) [57], using Pagel's lambda model of phylogenetic
correlation. The lambda parameter (λ) ranges from 0 (no phylogenetic signal) to 1 (high
phylogenetic signal) in the response trait when the model has no covariates, or in the
residuals when covariates are included. Non-phylogenetic linear regressions were
performed using the *lm* function in the stats R package [58]. The *distRoot* function in the
adephylo R package [59] was used to calculate the root-to-tip patristic distances by
measuring the total length of branches (in terms of the number of substitutions per site)
from the root of the species tree to each tip.

Gene gain/loss was determined with Count [60] using a non-binary count matrix [61] for
all accessory (non-structural) Nif genes. Wagner parsimony with a gain/loss penalty of 2
was applied to infer the most parsimonious scenario of genes present at the internal
nodes, as done previously [62]. Ancestral trait reconstructions were performed on an
ultrametric and dichotomous tree, which was made using the *multi2di* and *chronos* (model
= "relaxed") functions of the APE package [62] in R. The *fitdiscrete* function in geiger [63]
was used for discrete reconstructions of oxygen preference, which were mapped onto the
phylogeny with the *simmap* function in phytools [56]. The *fastAnc* function in phytools was
used for continuous variable reconstructions of metabolic and habitat diversity, which was
mapped onto the tree using the *contMap* function in phytools [56].

<u>Results</u>

Distribution of nitrogenases across the tree of life

We used a large prokaryote reference phylogeny, "WoL" [39], containing over 7,000 high-
quality genomes [36, 63–65] to first assess the representative diversity and distribution of
nitrogenase today. A total of 673 genomes (~6.4%) were found to contain nitrogenase

(**Supplemental Table 2**) based on the presence of the catalytic HDK subunits of
nitrogenase (**Figure 2A**). Our estimate of nitrogenase diversity falls within range of recent
estimates (~5.9% to 16%) [36, 64–66]. Here, approximately 46.9% of these genomes
belonged   to   Proteobacteria   (in   order   of   abundance:
Alpha>Delta>Gamma>Beta>Epsilon>Acidithiobacillia), while the remaining top three
phyla included Firmicutes (17.3%), Cyanobacteria (12.6%), and Euryarchaeota (11.4%).
Amongst the nitrogenase-containing genomes, molybdenum (Mo)-only nitrogenase made
up the majority (90.3%), followed by genomes with both Mo-nitrogenase and iron (Fe)
nitrogenase (5.9%), genomes with both Mo-nitrogenase and vanadium (V) nitrogenase
(2.2%), and lastly with 1.5% of genomes containing all three nitrogenases (**Figure 1**)
(**Figure 2B**). Genomes with V-nitrogenase were found in 6 phyla: Euryarchaeota,
Firmicutes,   Alphaproteobacteria,   Deltaproteobacteria,   Cyanobacteria,   and
Gammaproteobacteria.   Fe-nitrogenases   were   found   in   11   phyla: Firmicutes,
Epsilonproteobacteria, Alphaproteobacteria, Gammaproteobacteria, Verrucomicrobia,
Euryarchaeota,   Deltaproteobacteria,   Gammaproteobacteria,   Bacteroidetes,
Spirochaetes, and Chlorobi. Euryarchaeota represented 50% of the genomes with all
three nitrogenases; the remaining phyla included Alphaproteobacteria, Firmicutes, and
Gammaproteobacteria.

Figure 2. Diversity and phylogenetic distribution of nitrogenase. **A)** The overall distribution of nitrogenase across the microbial diversity from the Zhu et al (2019) Web of Life (WoL) phylogeny [38]. Black bars on the outer ring represent the presence of nitrogenase. Numbers reflect the top 14 taxonomic groups in the dataset with the highest proportion of genomes with nitrogenase. The phylogeny was plotted with iTOL [68]. **B)** Proportions and taxonomic distributions of the different nitrogenase isozymes across WoL.

An N₂ fixation genomic and gene-centric ecological catalog

We screened all 673 genomes for 93 known genes ("machinery") involved in N_2 fixation (**Supplemental Table 3, Supplemental Figure 1**). In Figure 3, genes were organized into categories and the relative abundance of genes within each category was calculated. At the individual genome level, without considering *nifHDK*, the total number of N_2 fixation genes within a genome ranged from 14 genes to 67 genes. The highest number of genes were found in the Alphaproteobacteria *Rhodopseudomonas palustris CGA009,* followed closely by *Azotobacter vinelandii* DJ with 65 genes. Archaea *Methanococcus aeolicus* Nankai-3, *Methanothermococcus okinawensis* IH1 and *Methanocaldococcus infernus* ME all tied for the lowest number of genes (14). Across the species phylogeny, the number of N_2 fixation genes per genome scaled with increasing species branch lengths, indicating

that later diverged taxa tend to have larger N$_2$ fixation gene repertoires (**Supplemental**

Figure 2).

Figure 3. Distribution of N_2 fixation machinery mapped onto the phylogeny of nitrogenase-containing
genomes, highlighting associations with species-associated ecological and physiological traits. This pattern
also correlates with those that are mesophilic, prefer aerobic and/or facultative lifestyles, possess larger
genome sizes, broader metabolic capabilities, and occupy a wider range of habitats. For this figure, N_2
fixation genes were organized into functional categories and the relative abundance of genes for each
category calculated. The full gene matrix visualization can be found in Supplemental Figure 1 and the gene
matrix and associated categories in Supplemental Table 3. The phylogeny and matrices were plotted using
the ggTree R package (version 3.6.2) [44].

To explore the physiological and ecological diversity of nitrogenase-containing genomes,
we examined the habitats they occupy and prefer, their physiological tolerances to
oxygen, pH, and temperature, their degree of metabolic versatility, and the variation in
their genome sizes (**Figure 3**).

Amongst the nitrogenase-containing genomes, 47.5% of the genomes were anaerobes,
31.6% were aerobes, 5.3% were facultative, and 1.5% were microaerophiles. The
remaining 14% could not be determined due to missing data or uncertainty in predictions.
Temperature preferences further define nitrogenase distribution, with most genomes
(91.2%) belonging to mesophiles that favor temperatures from 18ºC to 45ºC. The
remaining ~8.8% belonged to thermophiles that preferred temperatures above 45ºC.
Similarly, neutrophiles (pH 5.5-8.0) dominated the pH preferences (87.2%). Acidophiles
and alkaliphiles, though present, were not as common. Genomes differed in their inferred
habitat preferences, with some habitats being more commonly represented than others.
Here, freshwater and terrestrial environments were particularly favored by 32.5% and
26.2% of genomes, respectively. The remaining genomes were associated with saline
environments (14.3%), non-plant host associations (11.4%), plant associations (8.8%),
and hydrothermal systems (6.8%). These patterns likely reflect not only genuine
ecological preferences, but also the influence of uneven environmental sampling, which
can skew our perception of where nitrogenase-containing organisms most thrive in the
nature. In addition to these traits, we assessed differences in metabolic and habitat
coverage to highlight the ecological versatility of diazotrophs. Metabolic coverage ranged
from 9.8 to 46.4%, with an average of 23.2%. Habitat coverage ranged from 0 to 48%,

with an average of 12%, when not accounting for the ~3% of genomes whose habitat

coverage could not be determined. We also assessed variations in genome size. Here,

genome size ranged from 1.3 to 12.3 Mbps, with the average being 4.6 Mbps.

Figure 4. N$_2$ fixation gene abundance varies across traits. The number of genes was compared across **A)**

temperature**, B)** oxygen, and **C)** habitat preferences**.** Pairwise differences between means were calculated

using non-parametric Wilcoxon rank-sum tests. For each panel, the means of those that do not differ with

statistical evidence share the same letter, whereas those that do not share a letter are discernibly different

(p<0.05). Boxplots were plotted with the ggpubr R package [55].

Physiological, metabolic, and habitat preferences vary with N$_2$ fixation genetic
complexity

Next, we examined how the number of N$_2$ fixation genes within a genome relates to its
environmental and physiological traits, aiming to uncover the factors that have influenced
the complexity of the genetic machinery required for N$_2$ fixation. We observed that
genomes with similar preferences for temperature, oxygen, and habitat type had
comparable numbers of N$_2$ fixation genes (**Figure 3**). Specifically, thermophiles and
anaerobes have discernibly fewer genes compared to their mesophilic (p.adj=8.60×10^{-23})
and aerobic (p.adj=4.80×10^{-45}) counterparts (**Fig. 4A,B**). Accordingly, organisms who
prefer hydrothermal environments have discernibly fewer N$_2$ fixation genes on average
compared to all other preferred environments (**Fig. 4C**). There were no discernible
differences in N$_2$ fixation gene abundances between terrestrial and freshwater, saline, or
host-associated environments. Plant-associated taxa had the highest average of N$_2$
fixation genes, which was discernibly higher than all environments, except host-
associated.

N$_2$ fixation genetic complexity as a predictor of co-evolutionary trait associations

To test the extent to which traits are evolutionarily conserved or have evolved
independently, we measured the phylogenetic signal for gene abundance, habitat
coverage, and metabolic coverage, as well as genome size, temperature, pH, and oxygen
preference across the species phylogeny using Pagel's lambda (λ) with the *phylolm* R
package [67]. All traits had a moderate to high (λ≥0.69) phylogenetic signal
(**Supplemental Table 4**), meaning that closely related genomes demonstrated greater
similarity in trait values compared to genomes randomly selected from the phylogeny.

We further assessed whether phylogenetic signal persisted at the individual phylum level
to test for phylum-specific evolutionary histories and differing selection pressures. This
analysis clarified whether the overall phylogenetic signal measured across the species
phylogeny was disproportionately driven by particular phyla. Because some phyla had
too few genomes (<20), phylum-specific analyses were restricted to Alpha-, Beta-, Delta-
, Gammaproteobacteria, as well as Cyanobacteria, Firmicutes, and Euryarchaeota.

Genome size, habitat coverage, and metabolic coverage all exhibited strong phylogenetic signal across these major nitrogenase-containing phyla, ($\lambda \geq 0.8$, **Supplemental Table 6**), indicating that these traits are broadly conserved across these lineages, rather than confined to a single clade. N_2 fixation gene abundance likewise showed a high λ (>0.8) within most phyla, with the exception of Cyanobacteria, ($\lambda = 0.34$), likely reflecting limited variability in their N_2 fixation gene sets.

By contrast, no phylogenetic signal for temperature was detected in Gammaproteobacteria ($\lambda=0.001$), consistent with their mesophilic lifestyle, while other phyla retained high signal ($\lambda>0.8$). Oxygen tolerance showed little phylogenetic signal in Gammaproteobacteria nor Firmicutes, whereas pH exhibited strong phylogenetic conservation in Cyanobacteria, Euryarcheaota, and Gamma- and Betaproteobacteria, but low conservation in Deltaproteobacteria.

Next, we assessed whether certain traits shared an evolutionary history with N_2 fixation gene abundance via phylogenetic linear regression models (**Figure 5, Supplemental Table 5**). Gene abundance was chosen as the independent variable to determine if the complexity of N_2 fixation genes in a genome could be used to predict other trait values. Response (trait) variables were transformed using either natural log or square root to stabilize variance prior to analysis. Genome size (**Figure 5A**) and metabolic coverage (**Figure 5B**) had a positive, significant linear relationship with N_2 fixation gene abundance, indicating that N_2 fixation gene complexity is impacted by broader genomic and metabolic expansion or subtraction forces. For temperature, we initially observed a significant, negative linear relationship with N_2 fixation gene abundance (**Figure 5C**). Because prior work has shown that adaptation to high temperatures is often linked to genome reduction [70], we repeated the regression using N_2 fixation gene abundance normalized to genome size (**Supplemental Table 2**). When normalized, the negative relationship with temperature disappeared, suggesting that the original pattern likely reflected genome size constraints rather than a temperature specific effect on N_2 fixation. A similar pattern emerged for habitat coverage: we found a marginally significant positive relationship (p=0.054) with gene number (**Figure 5D**), which likewise disappeared after normalizing N_2 fixation gene abundance to genome size.

Figure 5. Phylogenetic linear regressions assessed whether the number of N_2 fixation genes in a genome could predict other traits, such as **A)** genome size, **B)** metabolic coverage, **C)** optimal growth temperature, and **D)** habitat coverage. Response variables were either transformed using natural log or square root to stabilize variance prior analysis. Solid blue lines represent non-phylogenetic linear model coefficients,

dashed blue lines represent phylogenetic linear coefficients. Scatter plots were plotted using ggplot2 in R
[69].

Differences in N$_2$ fixation machinery distribution

We used phylogenetic principal component analysis (PCA) to cluster genomes based on
the similarity of their N$_2$ fixation gene presence-absence patterns, while accounting for
shared evolutionary history. Phylogenetic relationships accounted for most of the
variation, as indicated by the low variance captured by the phylogenetic PCA
(**Supplemental Figure 3**). This finding suggests that clades are clustered primarily
because they share conserved gene sets inherited from common ancestors.

We then examined the key genes driving separation among genomes in the phylogeny-
corrected PCA and interpreted their distribution across taxa and oxygen preferences. The
ten genes with the strongest influence on each component of the phylogeny-corrected
PCA included the different regulation elements (*nifI$_2$*, *nifL*, *regRS*, *ntrB*), two different
electron-donating/transfer mechanisms (*rnfABCDEG, fixABCX*), nodulation and
heterocyst differentiation genes (*nodABCD*, *devC*), oxidative protection mechanisms
(*sodN*, *cooA*), cofactor synthesis and iron acquisition genes (*nifM*, *sufD*, *feoC2*)*,* and the
genes that make up both the Fe- and V-nitrogenase (*vnfHGDKE*, *anfHGDK*). The post-
translational *nifI$_2$* regulator is primarily found in anaerobes, such as Archaea and
Firmicutes, confirming that other regulatory mechanisms *regS*, *nifL*, and *ntrB* are primarily
found in aerobic Proteobacteria (**Supplemental Figure 1**) [68, 69]. Pearson correlation
of gene co-occurrence (**Supplemental Figure 4**) confirming as well that *nifI$_2$* and *nifI$_1$* had
strong negative correlations with genes *nifTQWXZ*, *fnr*, *fdx*, *oxyR,* and *ntrBC*, which are
genes primarily found in aerobes.

A preference for either *rnfACDEG* or *fixACX* electron donation systems was evident in
the PCA where the genes pointed opposite from one another (**Supplemental Figure 3,4**).
Nodulation genes *nodABC* also pointed opposite to *rnfACDEG* and instead had a positive
correlation with *fixACX* (**Supplemental Figure 4**). This is confirmed by the fact that
diazotrophs forming symbioses with plants through nodulation prefer Fix over Rnf for

electron donation [71, 72]. None of the N_2 fixation genes were unique to thermophiles and
neither Fe- nor V- nitrogenases were found in genomes with optimal growth temperatures
greater than 41ºC.

Dynamic history of gene gain and loss

Although previous studies have noted the potential dynamic nature of N_2 fixation gene
acquisitions and losses [70], none have specifically analyzed these patterns in detail, nor
in relation to their traits. By observing gene gain/loss patterns across the phylogeny and
linking them to shifts in lifestyle changes, we can begin to observe the selective pressures
on the retention or loss of particular genes. We estimated net gain or loss at each node
of the nitrogenase-containing species tree using Wagner parsimony (see methods)
(**Figure 6**). Evolutionary trajectories of N_2 fixation machinery complexity indeed indicated
a dynamic history of gene gain and loss over time. Specifically, early branching nodes
imply net gene gain, suggesting an initial expansion of genes early in diazotroph
evolution, whereas gene loss primarily occurs closer to the terminal tree branches.

The nodes with the highest number of gene gains (+11) occurs at the most recent
common ancestor (MRCA) of Bacteria and at the MRCA of the Euryarchaeota clade
Methanosarcina (not shown). Some of the clades that experienced large gene losses
include Acidithiobacillia (-18), the Firmicute-Clostridia clade Thermoanaerobacterales (-
18) (not shown), Thermodesulfobacteria (-17) (not shown), Nitrospirae (-16), and the
MRCA of Aquificae and Epsilonproteobacteria (-11) (**Supplemental Tables 7-8**).
Acidothiobacillia's loss of genes *cowN*, *fixJL*, and the Suf and Rnf systems occurs in
tandem with a loss of habitat coverage (**Figure 6**). The loss of post-transcriptional
regulators *nifI$_1$I$_2$* unsurprisingly coincides with a gain in aerobic lifestyles at the MRCA of
Cyanobacteria, Actinobacteria and the MRCA of Gamma- and Alphaproteobacteria
(**Figure 6**) as *nifI$_1$I$_2$* is the main regulatory mechanism in anaerobes. The appearance of
transcriptional regulation by *nifA*, mostly used by aerobes, predates the loss of *nifI$_1$I$_2$* in
the MRCA of Gamma- and Alphaproteobacteria (**Figure 6**). The gain of genes involved
in protection against oxidants (*katG*, *oxyR*, and *cowN*) and oxygen response regulators
fixJL occurs early along the MRCA nodes of Verrucomicrobia, Chlorobi, Bacteroidetes,
and Proteobacteria (**Figure 6**). We noted two distinct gains of *rnfACDEG*, *nifTWZ*, *katG*

and *fixCX* in distantly related diazotrophs, indicating they were either inherited from a common ancestor that does not have nitrogenase (and therefore would not be represented in this tree), and/or they were gained through horizontal gene transfer.

Figure 6. N_2 fixation gene gain (green triangles) and gene loss (red triangles) throughout the evolution of diazotrophs. No change (grey circle) represents no gain or loss at that node, or an equal number or gains

and losses. Asterisks highlight potential candidates for HGT or genes derived from non-diazotroph

ancestors not in this subsetted phylogeny. All gene events can be found in Supplemental table 8. Key

transitional events of gene abundance and habitat coverage can be found in Supplemental Figure 5.

Discussion

Nitrogenase Distribution, Diversity, and Evolution Across Prokaryotic Lineages

Nitrogenase is widespread across prokaryotes, appearing within phylogenetically and

ecologically diverse Bacteria and Archaea (**Figures 2 and 3**). Mo-nitrogenase is the

dominate form encoded by diazotrophs, reported everywhere from the rhizosphere [73]

to deep-sea sediments kilometers below the ocean surface [74–76]. Although V- and Fe-

nitrogenases occur less frequently, they also span across diverse taxa (**Figure 2**; [77]).

However, focusing solely on nitrogenase's distribution overlooks the evolutionary and

genetic complexity of N_2 fixation.

To address this, we developed a comprehensive catalog of nitrogenase-containing

genomes and associated N_2 fixation machinery, mapped to environmental preferences

and phylogenetic history (**Figure 3**). Expanding on prior work [75–77], our work

incorporates ~2.5× more N_2 fixation genes and genomes, along with data on oxygen

metabolism, temperature, pH, genome size, habitat range. Whereas previous

comparative studies often targeted single clades or ecosystems [78–80], our framework

unifies nitrogenase and its supporting genes across the entire microbial tree.

Oxygen inhibits nitrogenase activity [81], and the enzyme's sensitivity to oxygen has long

shaped how diazotrophs function and evolve [78, 79]. Our expanded analysis confirms

that the majority of nitrogenase-containing genomes belong to anaerobic organisms,

while aerobic diazotrophs harbor significantly more N_2 fixation genes than anaerobes

(**Figure 4B**), likely reflecting the additional genetic machinery needed for oxygen

protection and regulation under aerobic growth [36]. We found that genes *katG*, *oxyR*,

and *cowN*, which provide protection against oxidants [82, 83], along with the oxygen

response regulators *fixJL* [81] were acquired along the lineages leading up to the

divergence of Proteobacteria (**Figure 6**), a period that coincides with the estimated timing

of the Great Oxidation Event (GOE; see Figure 3 in [84]). This pattern indicates these
genes played a role enabling ancient diazotrophs to expand into increasingly oxygenated
environments. Our recent work further supports the divergence of the alternative
nitrogenases during this transition to an oxic atmosphere [66], further underscoring how
environmental transitions, particularly the GOE, reshaped molecular evolution of N_2
fixation in deep time.

We also confirmed the relationship between N_2 fixation gene abundance and temperature
previously reported by Boyd et al [67]: thermophiles, on average, possess the simplest
N_2 fixation gene sets (**Figure 4AB, Figure 5C**). Our analyses indicate that this pattern is
in part influenced by genome reduction associated with long-term adaptation to high
temperatures [70]. Yet, if the earliest diazotrophs were indeed thermophilic [3, 85], then
temperature's role shaping the evolution of N_2 fixation cannot be dismissed. For example,
some cold-adapted diazotrophs switch from Mo- to V-based nitrogenases [86–88],
indicating how shifts in temperature regimes may have shaped the functional
diversification of nitrogenase over evolutionary time.

Building on these patterns, we next examined unusual derivations from the typical
nitrogenase gene set. Notably, several anaerobic thermophiles lack *nifE*, *nifN*, or both
(**Figure 3**), genes involved in FeMo cofactor assembly and part of the cononical minimal
nif genetic set (*nifHDKENB)* required for N_2 fixation [86]. These lineages include
Euryarcheaota, such as members of the ANME groups [89], Chloroflexi, and Firmicutes.
Some have verified N_2 fixation activity [90–93], while others, like *Roseiflexus castenholzii*,
do not [94].

Interestingly, recent work suggests that *nifDK* may have originated from a duplicated
maturase-like *nifEN* ancestor [67], raising the possibility that some extant diazotrophs
lacking *nifEN* evolved alternative cofactor maturation strategies, perhaps as a way to
maximize energy conservation under thermophilic conditions [70]. Support for this idea
comes from *Roseiflexus* sp. RS-1, which lacks *nifEN* and appears to use *nifDK* to fulfill
both the cofactor maturase and catalytic roles [95]. Further work will be required to
determine whether this streamlined mechanism occurs in other diazotrophs missing
nifEN.

Plant-associated genomes showed the highest N_2 fixation gene counts (**Figure 4C**),
consistent with their pivotal role in host nitrogen supply [96, 97]. Our reconstructions
captured the divergence of Actinobacteria *Frankia* from its ancestor, marked by a
transition to aerobic metabolism, accompanying genome and habitat expansion, the loss
of *nifI$_1$I$_2$* regulators, and the gain of both the nodulation gene *nodC* and oxidative stress
response gene *sodN* to support its dual free-living and symbiosis states (**Figure 6**).

We observed that *Frankia* lacks key regulators such as like *nifAL* [95]. However, we noted
the presence of the post-translational regulator *draG*, without its partner *draT*, indicating
that draG-draT regulation is likely non-functional and perhaps a novel, as-yet-unknown
mechanism for nitrogenase inactivation is present [98] – a possibility that warrants further
study.

In many plant symbioses, oxygen levels are tightly regulated by the host to activate the
FixL - FixJ pathway, ultimately driving nitrogenase expression [96], while *nod* genes
mediate nodulation [99]. Terrestrial habitats, being more variable than oceans [100],
impose fluctuating environmental conditions that demand dynamic nitrogenase regulation
[101–103]. Soil molybdenum scarcity likely favors the deployment of alternative
nitrogenases [104], contributing to gene repertoire expansion in terrestrial environments.
Our results illustrate this pattern. For example, several lichen-symbionts within the
Nostocales order of Cyanobacteria possess V-nitrogenase [105], likely as a way to
combat limited Mo in high latitude boreal forests [106]. Together, these findings highlight
how diazotroph N_2 fixation gene repertoires have been shaped by environmental
constraints and the selective pressures of symbiotic lifestyles.

Eco-evolutionary history of nitrogenase-associated genes

Central to our framework is that N_2 fixation gene complexity is not an isolated trait, rather,
it is embedded within a larger evolutionary framework of genome expansion, metabolic
versatility, and habitat diversity (**Figure 5**). Gene complexity can even serve as an
ecological marker—distinguishing generalists, with broad habitats and large, versatile

genomes [107–109], from specialists with narrow niches and smaller genomes [110, 111].

This distinction is increasingly relevant today, as specialist diazotrophs may contribute

disproportionately to total soil N_2 fixation [112].

Our reconstructions show that as diazotrophs diversified, so did their N_2 fixation

machinery (**Figure 3**). Gene gain dominated early evolution, with clades such as Alpha-,

Gamma-, and Betaproteobacteria maintaining extensive N_2 fixation genes (**Figure 6**). In

contrast, later stages were marked by lineage-specific losses, particularly in terminal

branches, pointing ecological specialization and genome streamlining. Losses were most

pronounced   in   Chloroflexi,   Nitrospirae,   Aquificae,   Acidithiobacillia,

Thermodesulfobacterota,   and   Epsilonproteobacteria,   groups   often   associated   with

anaerobic, thermophilic, acidophilic, or host-adapted lifestyles (**Supplemental Table 2**).

In some cases, N_2 fixation gene loss tracked closely with reduced habitat coverage, as in

Epsilonproteobacteria and Acidithiobacillia (**Figure 6**), consistent with prior work on

genome streamlining in these clades [113–115]. Adaptation to deep-sea hydrothermal

vents [116], shifts toward heterotrophy [114], and transitions to acidophily [117] all show

how niche transitions often coincide with simplification of N_2 fixation gene sets.

Yet, gene loss was not universal in streamlined genomes. *Zymomonas mobilis*

(Alphaproteobacteria) maintains the highest proportion of N_2 fixation genes (~2-3% of all

coding genes) despite having a compact ~2Mb genome (**Supplemental Table 2**).

Similarly, in symbiont systems, genome reduction often reflects host compensation [118].

UCYN-A2, a marine symbiont recently identified as an early stage "nitroplast" in

Braarudosphaera bigelowii [119, 120], has lost CO_2 fixation and photosystem II [121]

[121, 122], yet retains an intact *nif* cluster (*nifTZVBSHDKENXW)* [123].

Horizontal gene transfer (HGT) has further shaped N_2 fixation evolution [5, 80], likely

explaining some gene acquisitions we observed (e.g., *rnfACDEG*, *nifTWZ*, *katG* and

fixCX in Figure 6). Previous studies have documented entire *nif* clusters moving across

major clades – including a >20kb transfer from Gammaproteobacterium in to the diatom

symbiont "*Candidatus* Tectiglobus diatomicola" [124]. In our dataset, *Coleofasciculus*

chthonoplastes PCC 7420 (formerly *Microcoleus chthonoplastes*) appears to have
acquired *nifHDKEN* from a Deltaproteobacterium [125].

Together, these patterns show that the complexity of N_2 fixation genes reflects a balance
between the forces of gene loss and gain, specialization, horizontal transfer - all
embedded in the broader trajectory of diazotroph genome evolution.

Limitations of comparative genomics

As with any comparative genomic approach, there are inherent limitations in identifying
the full complement of genes and traits within genomes. One limitation is that our analysis
focuses on genes already recognized to be playing a role in N_2 fixation, meaning
additional, yet-undiscovered genes may contribute to the process, particularly in non-
model diazotrophs, where many functional mechanisms remain uncharacterized. Another
caveat is our reliance on KEGG KO number. Not all genes could be assigned KO
numbers, and some KO identifiers fail to distinguish between closely genes, such as
nifA/*vnfA*/*anfA*. Continued improvements in gene functional annotation and database
curation will be essential for building a more complete undersatnding of of diazotroph
capabilities [126].

Conclusion

Examining the distribution of diverse N_2 fixation machinery offers insight into which genes
were critical for enabling transitions into new environments over evolutionary time. The
rise of atmospheric oxygen, for example, fundamentally reshaped electron-donor
availability [127] and, along with changes in in metal availability [14, 128], likely exerted
strong selective pressures on N_2 fixation machinery as we have shown here.

Reconstructing historical patterns from the modern genetic records is thus pivotal for
understanding the processes that govern evolutionary change [129]. Global trends in
genome evolution not only reveal how organisms responded to past environmental
fluctuations but connects them to their present-day ecological niches. In particular, N_2
fixation complexity may help infer a diazotroph's ecological role, highlighting how

environmental factors and cellular demands intersect to enable colonization of new habitats.

In his book *Life's Engines*, Paul Falkowski likens nitrogenase and its core machinery to a computer's hardware, while accessory genes function as the software, essential for maintenance, optimization and updates [130]. This analogy is compelling, capturing the deep interconnection between core biochemical processes and their regulatory networks. These elements must evolve in concert to navigate the challenges posed by changing environments, a dynamic reflected in the expansions and contractions of diazotrophs which we have documented across both ancient and modern contexts.

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Data availability

Supplementary Table 2 contains genome accession, taxonomy, and trait data information. Custom scripts, tree files, raw data, and PDF versions of the figures are available at https://github.com/kacarlab/Sobol_2025_NifGeneEcoEvo.

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