

# Regulatory response to a hybrid ancestral nitrogenase in *Azotobacter vinelandii*

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**ABSTRACT** Biological nitrogen fixation, the microbial reduction of atmospheric nitrogen to bioavailable ammonia, represents both a major limitation on biological productivity and a highly desirable engineering target for synthetic biology. However, the engineering of nitrogen fixation requires an integrated understanding of how the gene regulatory dynamics of host diazotrophs respond across sequence-function space of its central catalytic metalloenzyme, nitrogenase. Here, we interrogate this relationship by analyzing the transcriptome of *Azotobacter vinelandii* engineered with a phylogenetically inferred ancestral nitrogenase protein variant. The engineered strain exhibits reduced cellular nitrogenase activity but recovers wild-type growth rates following an extended lag period. We find that expression of genes within the immediate nitrogen fixation network is resilient to the introduced nitrogenase sequence-level perturbations. Rather the sustained physiological compatibility with the ancestral nitrogenase variant is accompanied by reduced expression of genes that support trace metal and electron resource allocation to nitrogenase. Our results spotlight gene expression changes in cellular processes adjacent to nitrogen fixation as productive engineering considerations to improve compatibility between remodeled nitrogenase proteins and engineered host diazotrophs.

**IMPORTANCE** *Azotobacter vinelandii* is a key model bacterium for the study of biological nitrogen fixation, an important metabolic process catalyzed by nitrogenase enzymes. Here, we demonstrate that compatibilities between engineered *A. vinelandii* strains and nitrogenase variants can be modulated at the regulatory level. The engineered strain studied here responds by adjusting the expression of proteins involved in cellular processes adjacent to nitrogen fixation, rather than that of nitrogenase proteins themselves. These insights can inform future strategies to transfer nitrogenase variants to non-native hosts.

**KEYWORDS** nitrogen fixation, nitrogenase, *Azotobacter vinelandii*, ancestral protein reconstruction, RNA-Seq

Nitrogen cycling impacts ecosystems across the globe and is vitally important for sustained biological activity. The largest reservoir of nitrogen is highly inert atmospheric N<sub>2</sub> that is unavailable to most organisms. Nature has invented a single molecular mechanism to reduce, or “fix”, N<sub>2</sub> gas to bioavailable NH<sub>3</sub> and overcome nitrogen limitations on biological productivity via the family of nitrogenase enzymes hosted solely by certain bacteria and archaea (1, 2). Nevertheless, approximately half of global fixed nitrogen today is generated by anthropogenic means to meet the demands of a rapidly expanding human population (3). Although nitrogenases catalyze nitrogen fixation at ambient conditions, the Haber-Bosch process, which generates the bulk of anthropogenic fixed nitrogen, requires high temperatures and pressures and is both energetically and environmentally costly (4). Thus, strategies to both improve biological

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nitrogen fixation activity and distribute the enzymatic machinery to non-diazotrophic hosts (e.g., cereal crops) are highly desirable bioengineering goals (5, 6).

A critical component of nitrogen fixation in natural diazotrophs is its genetic regulatory architecture that is required to coordinate the expression of nitrogenase enzymes in response to dynamic environmental conditions and physiological states (7–9). Regulatory precision is necessary due to the high metabolic cost of nitrogen fixation as well as the complex nature of its supporting protein network. For example, the aerobic, diazotrophic model gammaproteobacterium *Azotobacter vinelandii* has more than 50 proteins that support three nitrogenase isozyme systems, with molecular functions including nitrogenase regulation and assembly, electron transport, and cofactor synthesis (8, 10, 11). The oxygen sensitivity of the nitrogenase metalloenzyme demands that aerobic microbial hosts (desirable models for nitrogen fixation transfer to crop plants such as cereals) utilize particular strategies to ensure metabolic compatibility, including temporal/spatial regulation of nitrogen fixation activity or protection via heightened respiratory rates (9, 12). These features make regulatory optimization challenging, particularly with the heterologous expression of nitrogen fixation genes. Under diazotrophic conditions (i.e., lacking an exogenous reduced nitrogen source), nitrogenases are highly expressed [e.g., comprising up to 10% of total protein in *A. vinelandii* (13)]. Nevertheless, in heterologous expression systems, overexpression of nitrogenase proteins decreases total nitrogen fixation activity (14), perhaps due to misfolding of excess proteins (15). Nitrogen fixation evidently relies on a fine-tuned protein network stoichiometry that is well-optimized in native hosts but is often incompatible with other species (16).

Relative to regulation, sequence-level engineering of nitrogenases and their associated proteins for improved outcomes has received little attention. Prior mutagenesis studies have generally aimed to generate key insights into nitrogenase biochemical mechanisms via disruption of activity rather than to increase activity through a broader exploration of sequence space (1, 17). Only recently have the functional consequences of nitrogenase sequence variation been deeply interrogated, for example, through random mutagenesis (18), extant ortholog libraries (19), and resurrection of phylogenetically inferred ancestral proteins (20). These sequence-level studies have the potential to identify variants with improved catalytic activities, stabilities, or interactions with associated proteins, as well as compromises of two or more of these features (e.g., reduced activity but highly improved stability). Nevertheless, due to the many genetic requirements for nitrogenase activity, functional insights from these studies are unlikely to be divorced from their downstream consequences on the surrounding cellular network in both native and heterologous hosts. Sequence-level optimization might be hampered by protein network incompatibilities and/or a counterproductive regulatory response (21). Thus, successful nitrogen fixation bioengineering prospects rely upon a concerted understanding of both nitrogenase sequence and regulatory space.

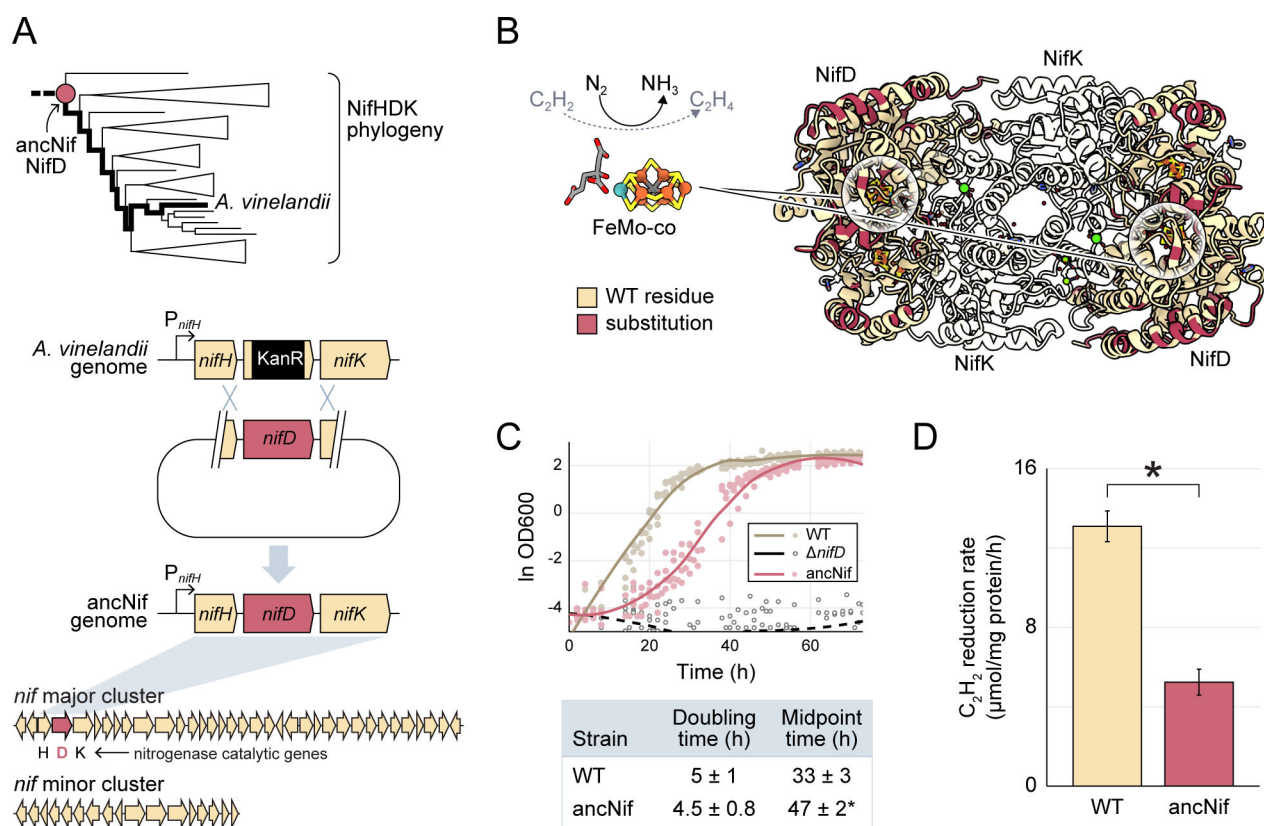
In this study, we probe the regulatory response of *A. vinelandii* to a synthetic, ancestral variant of the nitrogenase catalytic protein NifD, previously resurrected from within the direct *A. vinelandii* evolutionary lineage (20). The establishment of the *A. vinelandii* genetic system, which has detailed the nitrogenase regulon structure and expression mechanisms, and the detailed physiological information available from decades of work, makes *A. vinelandii* an ideal model organism for the transformation of synthetic nitrogenase genes and downstream transcriptional characterization (1, 8, 10, 22, 23). The nitrogenase variants of the engineered *A. vinelandii* strain have reduced N<sub>2</sub> reduction activity, also reflected by reduced cellular nitrogenase substrate reduction rates. Nevertheless, following an extended growth lag, the strain is capable of diazotrophic growth at rates comparable to wild type (WT). By analyzing the transcriptome of the engineered strain, we identify the gene expression patterns that accompany the sustained compatibility between the nitrogenase variant and the *A. vinelandii* host. We find that transcription levels within the immediate nitrogen fixation network, including nitrogenase and nitrogenase-related gene clusters, are highly robust to mutations in

a core, catalytic component of nitrogen fixation. Rather the regulatory response is enriched for genes external to this immediate network that indirectly impact nitrogen fixation by modulating electron flux, trace metal transport, motility, stress response, and central metabolism. Our results shift focus to these ancillary cellular functions as potential engineering targets to improve the compatibility of remodeled nitrogenase proteins in diazotrophic hosts.

## RESULTS AND DISCUSSION

### An ancestral nitrogenase protein variant results in defects to *A. vinelandii* nitrogen fixation ability

To interrogate the regulatory consequences of sequence-level changes in an engineered nitrogenase gene, we selected a previously constructed *A. vinelandii* strain, “ancNif,” reported by Garcia et al. (20), in which one of the WT nitrogenase catalytic genes, *nifD* (encoding the NifD protein subunit), was replaced with a phylogenetically inferred ancestral variant (20, 24, 25) (Fig. 1A). The ancestral NifD protein sequence was reconstructed from a phylogenetic node within the extant *A. vinelandii* nitrogenase



**FIG 1** Construction and physiology of *A. vinelandii* strain ancNif harboring an ancestral nitrogenase NifD protein subunit, previously reported by Garcia et al. (20). (A) The protein sequence of ancestral NifD was inferred from a NifHDK protein phylogeny (the targeted ancestral NifD clade, which includes the *A. vinelandii* lineage, shown in bold). The ancestral *nifD* gene (pink) was integrated into the *A. vinelandii* genome by homologous recombination, replacing a kanamycin resistance marker (KanR) previously incorporated to knock out WT *nifD* (see Materials and Methods). The engineered ancestral gene is the only genetic perturbation within the broader *nif* major and minor clusters. (B) ColabFold-predicted structure of the hybrid nitrogenase catalytic tetramer, NifDK, in ancNif, generated in the present study. NifD subunits are colored tan, with residues within the ancestral NifD that are substituted relative to WT highlighted pink. NifK is shown as transparent. FeMo-co serves as both the site of N<sub>2</sub> reduction to NH<sub>3</sub>, as well as reduction in the alternative substrate C<sub>2</sub>H<sub>2</sub> to C<sub>2</sub>H<sub>4</sub> (dotted arrow). (C) Growth curve and growth parameters of ancNif and WT. Midpoint time represents the time to the inflection point of a logistic curve fit to the growth data (26), which highlights the extended growth lag in ancNif. Average growth parameter values are tabulated (five biological replicates per strain) ± 1 SD. (D) Acetylene reduction rates of ancNif and WT. The bar plot shows mean acetylene reduction rates (three biological replicates per strain) and error bars represent ± 1 SD. (C-D) Asterisks indicate  $P < 0.05$  relative to WT (one-way ANOVA, post-hoc Tukey HSD). (A–D). Figures modified from Garcia et al. (20).

evolutionary lineage and bears ~85% protein sequence identity to WT NifD (Fig. S1 and S2). Unlike random mutagenesis or replacement with extant orthologs from divergent clades, this strategy introduced sequence variation derived from the evolutionary relationships across extant nitrogenases within a proteobacteria clade and was thus more likely to retain genomic compatibility (20).

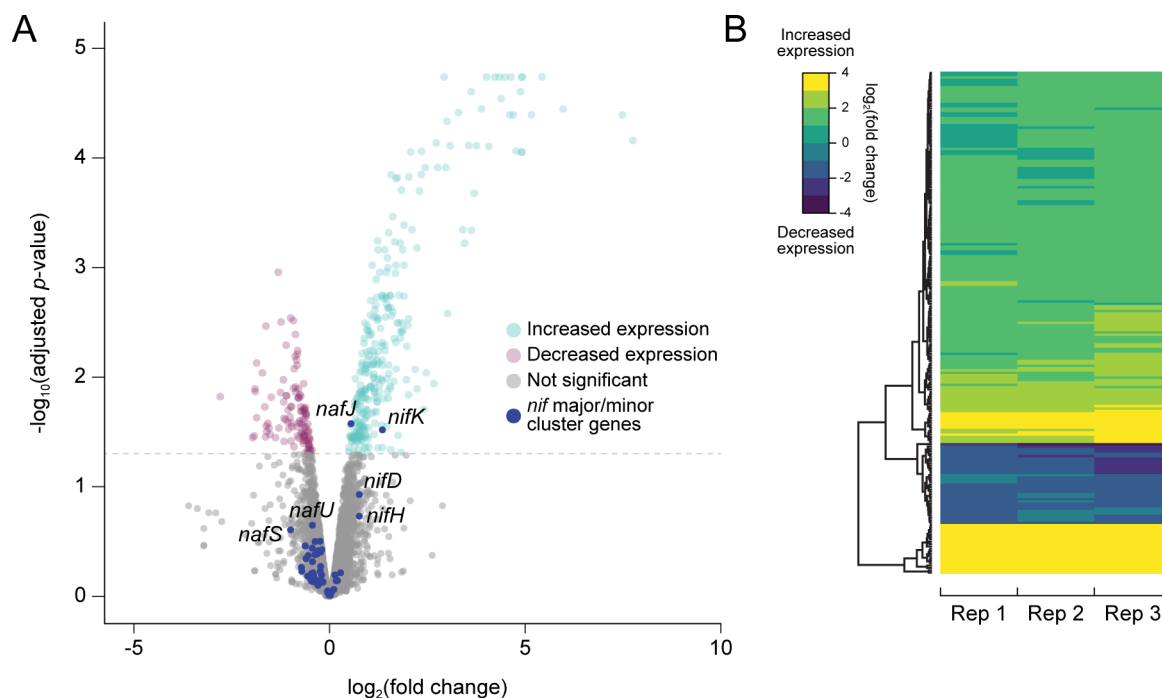
NifD, together with NifH and NifK subunit proteins, comprises the molybdenum- (Mo-) nitrogenase complex. Although *A. vinelandii* also possesses genes encoding vanadium- (V-) and iron- (Fe-)nitrogenase isozymes, which differ in their metal dependencies and expression conditions (27), only *nifD* has been replaced with an ancestral variant in the ancNif strain. Therefore, the Mo-nitrogenase in ancNif is a hybrid enzyme complex of ancestral and WT subunits (Fig. 1B). The NifD protein subunit binds the iron-molybdenum metallocluster (FeMo-co) that serves as the site for nitrogenase substrate reduction and together with NifK comprises the heterotetrameric catalytic component of nitrogenase. Electrons are delivered to the NifD active site via transient interactions between NifDK and the homodimeric nitrogenase reductase component NifH.

Garcia et al. previously demonstrated that strain ancNif exhibits a comparable diazotrophic growth rate to that of WT *A. vinelandii*, albeit with a ~14 h growth lag (Fig. 1C) (20). Growth rates were assessed under molybdenum-replete conditions, under which the hybrid Mo-nitrogenase is expressed and the alternative V- and Fe-nitrogenases are repressed (8). The Mo-nitrogenase activity of ancNif in the mid-log phase was previously found to be diminished (~40% that of WT), as detected by decreased cellular reduction rates of the nitrogenase substrate, acetylene (Fig. 1D) (20). This reduction in activity was confirmed by both nitrogenase immunodetection and purified enzyme activity assays to be due to reduced nitrogenase activity rather than reduced nitrogenase protein concentration (20). Purified ancNif nitrogenase exhibited ~30% N<sub>2</sub> reduction activity of WT nitrogenase, though the efficiency of ancNif nitrogenase (~1.95, quantified by the ratio of reduced N<sub>2</sub> to evolved H<sub>2</sub>) was comparable to that of WT (~2.10). Taken together, strain ancNif displays a measurable phenotypic defect while still retaining sufficient diazotrophic activity to eventually sustain cell growth at WT rates. Thus, ancNif is a suitable target for investigations into the transcriptional consequences of sequence-level nitrogenase perturbations, as well as for probing how *A. vinelandii* is capable of accommodating a less active nitrogenase variant.

## Gene expression patterns within the nitrogen fixation network are resilient to nitrogenase perturbations

We analyzed the transcriptome of the engineered ancNif strain sampled under mid-log (OD<sub>600</sub> ≈ 0.7; after ~20 h for WT and ~35 h for ancNif), diazotrophic growth conditions by RNA-Seq. Relative to WT strains cultured under the same conditions, we identified 405 genes (out of 5,051 mapped genes; ~8%) that are significantly differentially expressed (adjusted  $P < 0.05$ ), with 293 genes (~6%) having increased transcript abundance in ancNif and 112 genes (~2%) with decreased transcript abundance in ancNif (Fig. 2; Supplemental file 2). Of those genes exceeding this significance threshold, 57 genes had at least a log<sub>2</sub> fold change of 2 in the ancNif strain compared to WT, either increased (54 genes) or decreased (three genes) transcript abundance. We identified five clusters of gene response types in ancNif: three clusters among the 293 genes with increased transcript abundance in ancNif and two clusters among the 112 genes with decreased transcript abundance in ancNif (Fig. 2B; Supplemental file 3).

Because our genetic manipulation targeted the catalytic *nifD* gene, we investigated whether nitrogen-fixation-related genes were among those differentially expressed in the ancNif strain. We hypothesized that this manipulation would result in modifications to protein stoichiometries within the immediate nitrogen fixation network, accommodating a hybrid nitrogenase enzyme with reduced catalytic activity. In *A. vinelandii*, genes within the immediate network of the molybdenum-dependent nitrogenase are arranged into two distinct clusters, the *nif* major (Avin\_01360 to Avin\_01720) and minor clusters

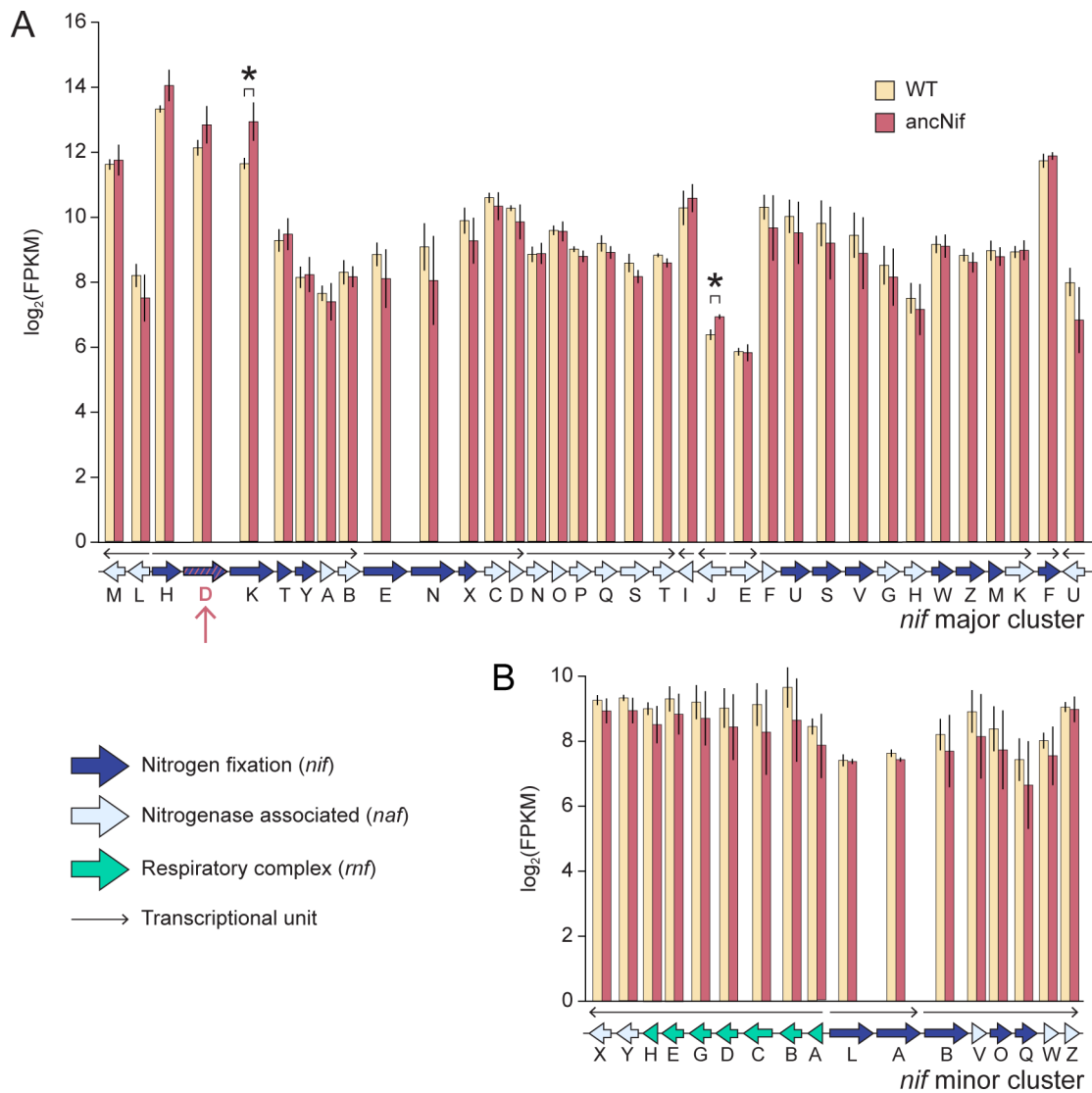


**FIG 2** Global differential gene expression in strain ancNif relative to WT. (A) Volcano plot highlighting significantly differentially expressed genes in ancNif vs WT, defined by an adjusted  $P < 0.05$ . Data points corresponding to *nif* major or minor cluster genes are indicated in dark blue (see Fig. 3). (B) Clustering of gene expression patterns across three biological replicates of ancNif.

(Avin\_50900 to Avin\_51060) (10, 28) (Fig. 3) (10). The major cluster includes the *nifHDK* catalytic genes, and both clusters include other *nif* genes important for nitrogenase assembly, metallocluster biosynthesis, and regulation. Interspersed among *nif* cluster genes are *naf* genes (nitrogenase-associated factors) that support assembly and biosynthesis, though many are not strictly required for diazotrophy and/or have unknown functions (10). The minor cluster contains *rnf* genes that form one of two respiratory complexes that direct electron flow to nitrogenase in *A. vinelandii* (the other is encoded by *fix* genes located elsewhere on the genome) (29). Predicted operons within the *nif* major and minor clusters mirror those previously reported (10, 30) (Supplemental file 4). Finally, the dedicated genes for V- and Fe-nitrogenases in *A. vinelandii* are housed in *vnf* and *anf* clusters, respectively, though nitrogen fixation by these alternative nitrogenases has previously been shown to also be supported by expression of certain *nif* genes (8, 10, 27).

In both WT and ancNif strains, the catalytic nitrogenase genes, *nifHDK*, are the most highly expressed ( $\log_2(\text{FPKM}) \approx 12\text{--}14$ , top 1% of all gene expression levels) relative to other genes within the major and minor *nif* clusters. In fact, in ancNif, *nifH* is the fourth most highly expressed gene in our data set (*nifD* and *nifK* ranked within the top 12), supporting previous findings that nitrogenase subunits constitute a significant percentage of total protein in nitrogen-fixing *A. vinelandii*. Little expression was observed for *vnf* and *anf* genes (e.g.,  $\sim 600$ -fold decreased expression of catalytic *vnfHDK* or *anfHDK* genes relative to *nifHDK*), which was expected since alternative nitrogen fixation in *A. vinelandii* is predicted to be repressed under the tested, molybdenum-replete, diazotrophic conditions (8).

Contrary to our hypothesis, we found that the expression of genes within the immediate nitrogen fixation network is largely unaffected by the replacement of an ancestral NifD variant in ancNif. Only two genes within the *nif* major and minor clusters showed significant increases in expression: the nitrogenase catalytic gene, *nifK* (Avin\_01400; fold change  $\approx 2.4$ ), and an uncharacterized gene with an ABC transporter domain, *nafJ* (Avin\_01580; fold change  $\approx 1.5$ ) (Fig. 3; Supplemental file 2). Thus, relative



**FIG 3** Transcription levels across the (A) *nif* major and (B) *nif* minor clusters of *ancNif* and WT *A. vinelandii* strains, expressed as fragments per kilobase per million mapped reads (FPKM). Bars represent mean values across three biological replicates per strain, and error bars indicate  $\pm 1$  SD. Asterisks indicate adjusted  $P < 0.05$ . Gene and transcriptional unit annotations from Del Campo et al. (10), the latter which mirrors operon predictions based on the transcriptional data presented here (Supplemental file 4).

stoichiometries of gene products across the *nif* clusters are expected to remain unchanged in *ancNif*. No genes within the *nif*, *vnf*, or *anf* clusters were found to have significantly lower expression in *ancNif* compared to WT. Together, these results suggest that nitrogen-fixation-related gene expression is remarkably robust to sequence-level perturbation to nitrogenase.

### Regulatory response is enriched in cellular functions outside the immediate nitrogen fixation network

We expanded our focus to analyze the regulatory response across cellular functions outside of the immediate nitrogen fixation network (i.e., outside of the major and minor *nif* clusters) that might otherwise be indirectly impacted by perturbation of the nitrogenase enzyme. We found several genes encoding proteins that are associated with pilus formation, molybdenum transport, electron transport, and central carbon metabolism to be among those with the largest expression changes in *ancNif* relative to WT (Fig. 4).



in *ancNif* (~230-fold increase in expression relative to WT) is *pilA*, which codes for the major, filament-forming pilin protein (31). Other *pil* genes with increased expression are primarily located in three clusters (*pilEVWY1*, Avin\_11830 to Avin\_11870; *pilABCD*, Avin\_12070 to Avin\_12104; and *pilMNOPQ*, Avin\_45260 to Avin\_45300; Fig. 4A). Across diverse bacteria, Type IV pili contribute to cell motility, sensing, attachment, aggregation, and DNA uptake (31). Furthermore, large increases in Type IV pilus gene expression have previously been observed in the transition from non-diazotrophic to (Mo dependent) diazotrophic conditions in *A. vinelandii* (8). The precise functional relationship between pilus formation and nitrogen fixation in *A. vinelandii* remains unclear. However, our finding that pilus gene expression is amplified even further in *ancNif*—exhibiting defects in its diazotrophic growth behavior relative to WT—might be indicative of resource limitation and associated stress response. Indeed, increased Type IV pilus expression has previously been reported in bacteria under starvation conditions (32–34).

### **Molybdenum transport**

We observed that genes encoding proteins associated with molybdenum transport are expressed at lower levels (~2-fold decrease) in *ancNif* relative to WT. *A. vinelandii* harbors a relatively complex pathway for molybdenum uptake and homeostasis that includes the transmembrane, high-affinity molybdenum ABC-type transporters (*mod*), as well as ATP-dependent molybdenum storage proteins (*mos*) (11, 35). In *ancNif*, *modABCGE* genes within the *mod1* cluster (Avin\_50650 to Avin\_50690; duplicates of some of these genes are also found within additional *mod2* and *mod3* clusters that are expressed at <10% the level of *mod1* in *ancNif*), which encode both the structural components of the transporter and its transcriptional repressor (*modE1*) (7), show lower expression levels (Fig. 4). Furthermore, we observe ~1.7-fold lower transcript levels of *mosAB* in *ancNif* relative to WT (Supplemental file 2). Deletions of *modE1* and *mosAB* have each previously been shown to impair the accumulation of intracellular molybdenum (35–37). Therefore, we hypothesize that reduced expression of these genes in *ancNif* may similarly reduce intracellular molybdenum that is otherwise needed to support the molybdenum-dependent, *nif* nitrogenase system.

### **Electron transport**

Among the genes with the largest decrease in expression in *ancNif* relative to WT are those that encode the Fix respiratory complex, which, together with the Rnf complex, provides low potential electrons for nitrogen fixation (29, 38). Relative to WT, *fixABCX* genes (Avin\_10520 to Avin\_10560) in *ancNif* have ~3- to 4-fold decreases in expression (Fig. 4A). The electron bifurcating Fix system transfers electrons from NADH to both quinone and flavodoxin/ferredoxin, the latter which donates electrons to nitrogenase (38). By contrast, Rnf, the expression of which is not significantly impacted in *ancNif*, couples the reduction in flavodoxin/ferredoxin to the proton motive force. Previous deletion mutants have demonstrated that there is some degree of redundancy between the Rnf and Fix systems, but inactivation of both the *fix* and the *rnf* genes within the *nif* minor cluster is sufficient to abolish nitrogen fixation activity (38). Under varying oxygen conditions or expression of different nitrogenase isozymes, *A. vinelandii* cells display preferences for either Rnf or Fix as a means of optimizing electron flow for efficient nitrogen fixation. The Fix is favored when oxygen is limiting and/or when additional energy is required for the expression of alternative V- and Fe-nitrogenases (29). The decrease in Fix gene expression but relative maintenance of Rnf transcript levels in *ancNif* suggests both that *ancNif* cells do not require the additional electron flux to nitrogenase that would have been generated by Fix and that rely more strongly on the reducing power provided by Rnf.

### **Central carbon metabolism**

Several genes that encode enzymes within the *A. vinelandii* tricarboxylic acid (TCA) cycle exhibited decreased expression levels in *ancNif* compared to WT (~2 to 3-fold decrease



in expression; adjusted  $P < 0.05$ ; Fig. 4B; Fig. S4). We note, however, that expression of isocitrate lyase (*icl*; Avin\_28420) was increased by ~2-fold in ancNif. *icl* directs carbon toward the glyoxylate shunt and away from oxidative steps of the TCA cycle (39) that would otherwise generate reduced NADH for electron flow to nitrogenase. The expression changes within the TCA cycle in ancNif are opposite from what has previously been observed in mutant *A. vinelandii* strains that constitutively express nitrogenase. Constitutive nitrogenase expression leads to an increase in the expression of genes that encode enzymes in the TCA cycle, as well as decreased flux through the glyoxylate shunt (40). Although TCA cycle gene expression in the constitutively expressing *A. vinelandii* strain likely reflects greater cellular investment in generating reducing power for larger quantities of nitrogenase enzyme, the opposite outcome in ancNif instead implies a preference for reserving carbon via the glyoxylate shunt at the expense of decreasing total electron flux toward nitrogen fixation.

### Reduced nitrogenase activity results in lowered transcription of genes that support resource allocation toward nitrogen fixation

Transcriptomic profiling of the mutant *A. vinelandii* strain ancNif harboring an ancestral NifD variant suggests a global pattern in which engineered cells reduce transcription of genes that support resource allocation for molybdenum-dependent nitrogen fixation in response to the diminished activity of the hybrid nitrogenase complex. Specifically, we find evidence of gene expression changes that would be expected to restrict molybdenum transport and storage, as well as electron flux by both downregulating Fix and upregulating the glyoxylate shunt that bypasses oxidative steps of the TCA cycle (Fig. 4). Furthermore, though the specific relationship between the observed increased expression of Type IV pilus genes and nitrogen fixation remains unclear, these patterns imply cellular investment in strategies to respond to resource limitation.

Interestingly, once overcoming an extended growth lag, the diazotrophic growth rate of ancNif is comparable to that of WT (Fig. 1C). Under standard diazotrophic conditions, the growth rate of *A. vinelandii* is limited by the nitrogen fixation rate (29). Thus, the mutations in the ancestral, catalytic *nifD* gene of ancNif that slow nitrogenase activity are likely responsible for the initial lag in growth. We note, however, that the changes in gene expression patterns alone cannot fully explain how ancNif achieves similar growth rates to WT during the exponential phase. The precise mechanism underlying the growth phenotype of ancNif awaits further analyses.

A slower nitrogenase enzyme would be expected to result in a wasteful excess of inputs to nitrogen fixation, including trace metals and reducing equivalents, without further changes to the transcriptome. The global expression patterns of sampled ancNif cells in mid-log phase, following the initial lag, demonstrate that this bottleneck in net nitrogen fixation rate is not loosened by increasing the pool of assembled and active nitrogenase, as transcript levels of genes within the *nif* clusters remain relatively constant compared to WT (Fig. 3). A possible explanation for this is that WT *A. vinelandii* already expresses nitrogenase proteins at high levels (13), limiting the selection of possible *nif* regulating mutations. Furthermore, adjustments to stoichiometries of nitrogen-fixation-related genes may be similarly inaccessible, as *A. vinelandii*, like other well-studied diazotrophs, likely already expresses well-optimized ratios of *nif* gene products (16). Rather we hypothesize that the cellular processes adjacent to nitrogen fixation that are enriched in gene expression differences in ancNif may be amenable to more dynamic regulatory control to optimize cellular investment in nitrogen fixation.

### Conclusion

This transcriptomic data set showcases the ability of *A. vinelandii* to readily incorporate phylogenetically inferred, ancient nitrogenase protein variants and respond dynamically to reduced nitrogen fixation activity. The regulatory response in an *A. vinelandii* strain engineered with an ancestral *nifD* sequence is enriched in genes external to

the nitrogen fixation network, including those related to molybdenum processing and electron transport, as the expression of *nif* genes is evidently resilient to the nitrogenase perturbations in ancNif and their physiological outcomes. This work provides a novel perspective on the challenge associated with the engineering of *nif* gene expression for improvements to nitrogen fixation. Importantly, transcriptional patterns in the hybrid nitrogenase-engineered strain highlight adjacent cellular processes as potentially more effective engineering targets for fine-tuning nitrogen fixation metabolism in bacteria, particularly in the interest of optimizing compatibilities between host models and nitrogenase protein variants.

## MATERIALS AND METHODS

### Ancestral sequence construction

Phylogenetic inference and reconstruction of the ancestral NifD variant sequence in strain ancNif were performed previously by Garcia et al. (20). Briefly, a representative nitrogenase protein sequence data set was curated following an initial BLASTp (41) search of the NCBI non-redundant protein database. A concatenated NifHDK alignment was generated by MAFFT v7.450 (42) and phylogenetic inference and ancestral sequence reconstruction were performed by RAxML v8.2.10 (43) under the LG + G + F evolutionary model. Though this version of the RAxML software does not perform full marginal ancestral sequence reconstruction, the ancestral NifD protein sequence was previously not found to differ substantially when generated by the marginal reconstruction algorithm implemented in PAML [see Garcia et al. (20) for additional discussion].

### Nitrogenase structure prediction

The three-dimensional structure of the hybrid NifDK heterotetramer was predicted by Colabfold (44) (<https://github.com/YoshitakaMo/localcolabfold>), which combines the AlphaFold2 structure prediction method (45) with the MMSeg2 method for homology detection (46). Colabfold was run with standard options (three recycles and AMBER all-atom optimization in GPU). Protein structures were visualized by ChimeraX (47).

### A. *vinelandii* genome engineering

Phenotypic characterization of *A. vinelandii* strains in this study was performed previously (20), following Carruthers et al. (26). *A. vinelandii* WT, ancNif, and DJ2278 strains were cultured under Mo-replete, diazotrophic conditions. Cells were inoculated into flasks containing Burk's medium lacking a fixed nitrogen source and grown at 30°C and 300 rpm (five biological replicates per strain). Optical density at 600 nm (OD<sub>600</sub>) was monitored over the growth period. Growth parameters were estimated by the Growthcurver R package (48). To quantify cellular acetylene reduction rates, the strains described above were cultured to an OD<sub>600</sub> ≈ 0.5 (three biological replicates per strain). Flasks were subsequently sealed and 25 mL of headspace was replaced by acetylene gas. Cultures were shaken at 30°C and agitated at 300 rpm for 60 min. Headspace gas was sampled every 15 min over this period and analyzed on a Nexis GC- 2030 gas chromatograph (Shimadzu). Acetylene reduction rates were normalized to total protein, quantified by the Quick Start Bradford Protein Assay kit (Bio-Rad).

### RNA library preparation and sequencing

Seed cultures of *A. vinelandii* WT and ancNif strains were grown in nitrogen-supplemented Burk's medium (13 mM ammonium acetate) for 24 h at 30°C and 300 rpm. Seed cultures were then inoculated into nitrogen-free Burk's medium and grown diazotrophically to an OD<sub>600</sub> of ~0.7 (mid-log), immediately followed by RNA extraction with the RNeasy Mini kit (Qiagen) following the manufacturer's instructions. RNA extracts were assessed on a Nanodrop 2000c (ThermoFisher Scientific) and confirmed to contain >2.5 µg of RNA with a purity of A260/280 = 1.8–2.2; A260/230 > 1.8. RNA extracts were

stored at  $-80^{\circ}\text{C}$ . RNA library preparation and paired-end sequencing ( $2 \times 150$  bp read length; Illumina NovaSeq 6000) was performed by Novogene.

### RNA sequencing bioinformatic analysis

Raw FASTQ reads were trimmed using Trimmomatic version 0.3 (49) (default settings except for HEADCROP = 5, LEADING = 3, TRAILING = 3, SLIDINGWINDOW = 3:30, MINLEN = 36). Trimmed reads were aligned to the *A. vinelandii* DJ genome sequence (GenBank accession CP001157.1) using bwa-mem v0.7.17 (version 0.7.17-h5bf99c6\_8) (50) with default parameters. Alignment files were further processed with Picard-tools v2.26.10 (<https://broadinstitute.github.io/picard/>) (CleanSAM and AddOrReplaceReadGroups commands) and samtools v1.2 (51) (sort and index commands). Paired aligned reads were mapped to gene locations using HTSeq v0.6.0 (52) with default parameters. The R package edgeR v3.30.3 (53) was used to identify significantly differentially expressed genes from pairwise analyses, using Benjamini and Hochberg (54) adjusted  $P$  value (FDR)  $< 0.05$  as a significance threshold. Raw sequencing reads were normalized using the fragments per kilobase per million mapped reads method (FPKM). Volcano plots were constructed with ggplot2 (55). For significantly differentially expressed genes, clustering analysis of expression patterns was performed with DP\_GP\_cluster v0.1 (56). Operons were predicted using Operon-mapper ([https://biocomputo.ibt.unam.mx/operon\\_mapper/](https://biocomputo.ibt.unam.mx/operon_mapper/), accessed 2022-10-19) (57) with default settings. The R package Pathview (58) was used to map fold changes of differentially expressed genes (FDR-adjusted  $P < 0.05$ ) involved in the *A. vinelandii* TCA cycle to the KEGG (59) pathway map (avn00020). KEGG Gene Set Enrichment Analysis (GSEA) was performed using the R package clusterProfiler v4.6.2 (60). The number of minimum required genes was set to five and the significant enrichment cutoff was set to an FDR-adjusted  $P < 0.05$ .

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## DATA AVAILABILITY

Phylogenetic tree from which the ancestral NifD was inferred and the predicted structure of the hybrid ancestral nitrogenase complex are available at [Github](#). Raw and processed RNA sequencing data are available in the NCBI GEO database (Accession #GSE234075).

## ADDITIONAL FILES

The following material is available [online](#).

## Supplemental Material

**Supplemental file 1 (Spectrum02815-23-s0001.docx).** Fig. S1 to S4 and Tables S1 and S2.

**Supplemental file 2 (Spectrum02815-23-s0002.xlsx).** edgeR and FPKM analysis summary.

**Supplemental file 3 (Spectrum02815-23-s0003.xlsx).** Expression clustering analysis summary.

**Supplemental file 4 (Spectrum02815-23-s0004.xlsx).** Operon prediction summary.

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