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# Plant-Pathogenic *Ralstonia* Phylotypes Evolved Divergent Respiratory Strategies and Behaviors To Thrive in Xylem

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ABSTRACT Bacterial pathogens in the Ralstonia solanacearum species complex (RSSC) infect the water-transporting xylem vessels of plants, causing bacterial wilt disease. Strains in RSSC phylotypes I and III can reduce nitrate to dinitrogen via complete denitrification. The four-step denitrification pathway enables bacteria to use inorganic nitrogen species as terminal electron acceptors, supporting their growth in oxygen-limited environments such as biofilms or plant xylem. Reduction of nitrate, nitrite, and nitric oxide all contribute to the virulence of a model phylotype I strain. However, little is known about the physiological role of the last denitrification step, the reduction of nitrous oxide to dinitrogen by NosZ. We found that phylotypes I and III need NosZ for full virulence. However, strains in phylotypes II and IV are highly virulent despite lacking NosZ. The ability to respire by reducing nitrate to nitrous oxide does not greatly enhance the growth of phylotype II and IV strains. These partial denitrifying strains reach high cell densities during plant infection and cause typical wilt disease. However, unlike phylotype I and III strains, partial denitrifiers cannot grow well under anaerobic conditions or form thick biofilms in culture or in tomato xylem vessels. Furthermore, aerotaxis assays show that strains from different phylotypes have different oxygen and nitrate preferences. Together, these results indicate that the RSSC contains two subgroups that occupy the same habitat but have evolved divergent energy metabolism strategies to exploit distinct metabolic niches in the xylem.

**IMPORTANCE** Plant-pathogenic *Ralstonia* spp. are a heterogeneous globally distributed group of bacteria that colonize plant xylem vessels. *Ralstonia* cells multiply rapidly in plants and obstruct water transport, causing fatal wilting and serious economic losses of many key food security crops. The virulence of these pathogens depends on their ability to grow to high cell densities in the low-oxygen xylem environment. Plant-pathogenic *Ralstonia* can use denitrifying respiration to generate ATP. The last denitrification step, nitrous oxide reduction by NosZ, contributes to energy production and virulence for only one of the three phytopathogenic *Ralstonia* species. These complete denitrifiers form thicker biofilms in culture and in tomato xylem, suggesting they are better adapted to hypoxic niches. Strains with partial denitrification physiology form less biofilm and are more often planktonic. They are nonetheless highly virulent. Thus, these closely related bacteria have adapted their core metabolic functions to exploit distinct microniches in the same habitat.

**KEYWORDS** denitrification, denitrifying respiration, vascular wilt, bacterial wilt, endophytic bacteria, niche partitioning, plant pathogens

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Received 17 November 2022 Accepted 13 January 2023 Published 6 February 2023 **B** acteria with flexible respiratory metabolisms can grow in environments with fluctuating electron acceptor availability. Oxygen is the most energetically favorable terminal electron acceptor (TEA), but it is not always available to environmental microbes in soil or to pathogenic bacteria in host tissues. Such microbes are often forced to use alternative TEAs (1). Among alternative TEAs, nitrate  $(NO_3^-)$  is commonly available and yields the most reductive power (2). Nitrate respiration can occur alone when oxygen is limiting, yielding nitrite  $(NO_2^-)$  and generating a proton motive force to make ATP. It can also be coupled with denitrification, the oxygen-sensitive three-step enzymatic reduction of nitrite to nitric oxide (NO) to nitrous oxide  $(N_2O)$  to dinitrogen gas  $(N_2)$ . Separate reductases carry out each step of this pathway. Nitrate-respiring bacteria theoretically gain maximal energy by reducing  $NO_3^-$  all the way to  $N_2$ , using all inorganic nitrogen species in this pathway as TEAs.

We previously showed that a plant pathogen, *Ralstonia pseudosolanacearum* GMI1000, depends on nitrate respiration for colonization and virulence (3). GMI1000 is a member of the *Ralstonia solanacearum* species complex (RSSC), a diverse group of bacteria that colonize and block the water-transporting xylem vessels of higher plants (4). Xylem is a relatively low O<sub>2</sub> environment, containing about 200  $\mu$ M O<sub>2</sub>, which is hypoxic relative to the 9.4 mM O<sub>2</sub> in the atmosphere (3). However, xylem sap also contains 30 mM NO<sub>3</sub><sup>-</sup>, which is the optimal concentration for growth of strain GMI1000 (3). Respiratory reduction of NO<sub>3</sub><sup>-</sup>, NO<sub>2</sub><sup>-</sup>, and NO are all crucial for plant colonization and virulence of GMI1000 (3). It has long been known that strains in the RSSC vary in their ability to carry out the final reduction of N<sub>2</sub>O to inert N<sub>2</sub> gas (5). We wondered whether these closely related bacteria have adapted their core metabolic functions to exploit distinct microniches in the same habitat.

The RSSC contains four phylogenetic lineages, phylotypes I to IV (6). Phylotypes I and III are closely related and were recently renamed *R. pseudosolanacearum*, while phylotypes II and IV were named *R. solanacearum* and *R. syzygii*, respectively (7). The physiology of the model phylotype (phyl.) I strain GMI1000 has been extensively studied (3, 8–14), but little is known about core metabolism in other plant-pathogenic *Ralstonia*. Using a genetically diverse panel of RSSC strains, we showed that phylotypes I and III (phyl. I/III) are complete denitrifiers that benefit dramatically from the presence of NO<sub>3</sub><sup>-</sup> during oxygen-limited growth (5). All 25 tested phyl. I/III strains are complete denitrifiers that produce N<sub>2</sub> gas (15, 16). In contrast, 0/35 phyl. II and 0/8 phyl. IV strains tested produced N<sub>2</sub> gas (5). Despite this substantial difference in energy metabolism, all RSSC phylotypes include strains that can infect a common host, tomato.

We hypothesized that RSSC phylotypes depend on distinct respiratory mechanisms for growth *in planta*. Using bioinformatics and functional analyses, we identified intriguing metabolic and physiological differences that extend beyond the reduction of N<sub>2</sub>O to N<sub>2</sub> gas. Phylotype II and IV strains (phyl. II/IV) lack the final NosZ-dependent denitrification step, and they benefit only slightly from any step in the denitrification pathway under low O<sub>2</sub> conditions. Intriguingly, phyl. I/III strains and phyl. II/IV strains also differ in biofilm formation, taxis toward low-oxygen environments, and aggregation in tomato xylem. These functional differences suggest that despite causing similar wilt disease, these two subgroups have adapted to exploit different respiratory niches *in planta*.

### RESULTS

**Denitrification pathway gene content correlates with RSSC phylotypes.** We analyzed the distribution of denitrification genes in 51 genomes reflecting the phylogenomic diversity of the RSSC (Fig. 1A and B). Except for two insect-transmitted phyl. IV strains that have reduced genomes (R24 and BDB R229) (17), all genomes contained the *nar* cluster encoding NarK1/2 nitrate transporters and the first reduction step of the pathway (NO<sub>3</sub><sup>-</sup> to NO<sub>2</sub><sup>-</sup>). All strains also encoded Ani and Nor enzymes that catalyze the second and third denitrification steps (NO<sub>2</sub><sup>-</sup> to NO to N<sub>2</sub>O), except for genome-reduced R24. No members of phyl. II/IV carry the *nosZRDFYL* cluster that encodes the terminal N<sub>2</sub>O reduction. In contrast, all phyl. I and 10/11 phyl. III strains have this cluster (Fig. 1C).



**FIG 1** The first three steps of denitrification are well conserved across the RSSC, but only phyl. I and III have the 6-gene *nos* cluster. (A) A phylogenetic tree of 51 RSSC genomes that represent the described genomic diversity of the species complex. The tree was constructed in KBase using the Insert Genomes into SpeciesTree app. The Newick file was modified in IToL and Affinity Designer. Denitrification genes were identified using the KBase blastp app with a 40% identity and 70% length cutoff. (B) The four-step denitrification pathway enzymes, substrates, and products. (C) Using strain GMI1000 for comparison, the identity values of orthologous proteins were computed with the R package seqinr after aligning amino acid sequences with MUSCLE. Protein percentage identity of each is color coded according to a 50 to 100% gradient. Phylotype is indicated to the right of each strain name. Note that the three gene clusters shown are not adjacent to each other, but they are all located on the megaplasmid.

We wondered if this variation in *nos* content was associated with additional differences in proteins and regulators involved in nitrate-dependent metabolism under low  $O_2$  conditions. We explored this hypothesis by comparing amino acid sequences of the enzymes, transporters, and regulators encoded in the three denitrification gene clusters. We selected one representative strain from each of the four phylotypes: GMI1000 for phyl. I, K60 for phyl. II, CMR15 for phyl. III, and PSI07 for phyl. IV (Fig. 1). These four strains are all soilborne, colonize xylem vessels, and cause indistinguishable wilt symptoms on tomato plants. The catalytic subunits NarGH, AniA, and NorB were relatively well conserved in all four genomes (Fig. 1C; amino acid identity: 85 to 97%), but the  $NO_3^-$  transporters (NarK1 and NarK2: 80 to 95% identity), the  $NO_3^-$ -responsive regulators (NarX and NarL: 70 to 99% identity), and accessory metabolic proteins (NarJ, Narl, MobB, and RSp1504: 69 to 99% identity) had lower sequence identity.

Many highly conserved regulators influence  $NO_3^-$  metabolism and denitrification in other bacteria (18). All RSSC representatives encoded the potential NO-responsive regulators NnrS (GMI1000 locus RSc3399), NsrR (RSc3397), a predicted  $O_2$ -responsive FNR (RSc1283), two FNR-like regulators (RSp0190 and RSc0966), and the sigma-54 factor RpoN1 (RSc0408) (19). In contrast, the NorAR NO binding system (RSp0958 and RSp0959) were only present in phyl. I/III (20) (see Fig. S1 in the supplemental material).

**The nos N<sub>2</sub>O reduction genes are clustered in an apparently horizontally transferred element scattered among the** *Betaproteobacteria*. We investigated the presence of the *nosZRDFYL* cluster in complete genomes from diverse strains in the subclass *Betaproteobacteria*. As we found in the RSSC (Fig. 1A) and as reported in *Neisseria* spp. (21), the presence of the *nos* cluster was highly variable (Fig. S2).

In genomes of both phyl. I strain GMI1000 and phyl. III strain CMR15, the *nos* clusters are located near fragments of transposition insertion sequences (IS) (Fig. S3). These remnants are phylotype specific and lie outside the conserved *nos* region. As is typical of horizontally acquired elements, the *nos* cluster is in different locations in the two genomes. This suggests either that phyl. I/III strains acquired this locus through separate events or that genome shuffling occurred after the initial incorporation of the cluster.

While the genomic context and the flanking insertion sequences of the *nos* cluster differ between phyl. I/III strains, the cluster gene content and structure are conserved (Fig. S3). The *nos* clusters in GMI1000 and CMR15 contain all eight genes associated with NosZ function (*nosZRDFYLX* and *cco5*) (2, 22–27). Between the IS elements, there are also five conserved genes that are absent from phyl. II/IV genomes, including an SWKP family type III-secreted effector of unknown function (RSp1374).

To gain insight into the evolutionary history of the *nos* cluster, we compared 36 bacterial NosZ protein sequences (Fig. S4). Consistent with multiple horizontal gene transfer (HGT) events, NosZ protein phylogeny generally does not correspond with whole-genome phylogeny. Instead, the RSSC NosZ sequences cluster with NosZ from close relatives, *Ralstonia pickettii* and *Cupriavidus metallidurans*. This pattern may indicate a period of vertical inheritance of the cluster followed by its loss in phyl. II/IV or indicate that HGT is more frequent between organisms with higher sequence homology, independent of transposition events.

RSSC strains that encode the *nos* cluster require the last step of denitrification for full virulence on tomato. Because all described RSSC strains are plant pathogens, but only two subgroups contain the *nos* locus, we wondered if NosZ contributes to fitness or virulence of phyl. I/III strains. We previously determined that a  $\Delta nosZ$  mutant of phyl. I strain GMI1000 reached a slightly lower population size than the wild type in tomato stems 3 days after petiole inoculation (3). However, when we quantified population sizes earlier, at 2 days postinoculation, we found a larger growth difference (Fig. 2A). This early colonization defect suggested that N<sub>2</sub>O reduction contributes to *in planta* success of phyl. I strain GMI1000.

To investigate the role of N<sub>2</sub>O reductase in virulence for this phyl. I strain, we monitored symptom development following soil-soak inoculations of unwounded plants. This assay revealed that NosZ and, by extension, complete denitrifying respiration, are needed for full virulence in GMI1000, as measured by the rate of disease progression and the mean disease index reached by day 14 (Fig. 2B). To determine if NosZ is also a virulence factor in the closely related phyl. III, we created a  $\Delta nosZ$  mutant of strain CMR15 and repeated the assay. CMR15  $\Delta nosZ$  was similarly reduced in virulence (Fig. 2C). This shows that while strains from all four RSSC phylotypes wilt and kill tomato plants, only phyl. I/III strains require *nosZ* for full virulence.

**NO**<sub>3</sub><sup>-</sup> **enhances anaerobic growth of complete denitrifiers in the RSSC.** To test whether RSSC phylotypes differ in their denitrification physiology, we selected three representative strains from each phylotype. Growth assays revealed that the *nos* cluster was required for complete denitrification to N<sub>2</sub> under anaerobic conditions (Fig. 3A) (5). All tested phyl. I/III strains grew to a 3- to 4-fold higher cell density when provided with NO<sub>3</sub><sup>-</sup> than when this TEA was absent. In contrast, anaerobic growth of phyl. II/IV strains was unaffected by the presence of NO<sub>3</sub><sup>-</sup>. Notably,  $\Delta nosZ$  mutants of both GMI1000 and CMR15 still grew better with NO<sub>3</sub><sup>-</sup> than without it (data not shown [3]). This indicates that the lack of N<sub>2</sub>O reductase activity alone does not explain the inability of phyl. II/IV strains to use NO<sub>3</sub><sup>-</sup> as a TEA under anaerobic conditions.

To determine if NO<sub>3</sub><sup>-</sup> enhances growth of phyl. II/IV strains at any O<sub>2</sub> level, we measured the growth of each representative strain in 0.1, 1.0, 10.0, and 21.0% O<sub>2</sub> with or without 30 mM NO<sub>3</sub><sup>-</sup> (Fig. 4). At the ambient 21.0% O<sub>2</sub>, all four RSSC strains were inhibited by



**FIG 2** Strains that have *nos* genes require the complete denitrification pathway for full virulence on tomato. (A) After petiole inoculation (2 and 3 days) of 21-day-old wilt-susceptible tomato plants with either wild-type GMI1000 or a  $\Delta nosZ$  deletion mutant, stem sections were harvested and bacterial population sizes in stems were determined by serial dilution plating of ground stem sections. Each circle shows the bacterial population size in a single plant; horizontal bars represent median values; vertical bars indicate the standard error of the mean. Data represent 10 biological replicates per time point per strain. At both time points, population sizes of GMI1000 and  $\Delta nosZ$  were significantly different (P = 0.0066 at 2 days postinfection [dpi]) and P = 0.0150 at 3 dpi; two-tailed *t* test). The 3-dpi data were published previously (3). (B and C) Symptom severity of RSSC-susceptible tomato plants was monitored daily following naturalistic soil-soak inoculation with 1 × 10<sup>8</sup> CFU/g soil of either (B) wild-type RSSC strain GMI1000 (phyl. I) and GMI1000  $\Delta nosZ$  or (C) wild-type RSSC strain CMR15 (phyl. III) and CMR15  $\Delta nosZ$ . Each point indicates average symptom severity; bars in panel B reflect the standard error of the mean of 3 assays, each with 16 plants per treatment (P < 0.005; 2-way analysis of variance [ANOVA]). Representative data from one biological replicate containing 12 plants are depicted in panel C.

 $NO_3^-$ , possibly because of  $NO_2^-$  or NO-induced oxidase inhibition (3). Growth of phyl. II K60 was also inhibited by  $NO_3^-$  in 10%  $O_2$ . Both phyl. II K60 and phyl. IV PSI07 benefited slightly from the presence of  $NO_3^-$  under hypoxic conditions (1.0% or 0.1%  $O_2$ ), while phyl. I GMI1000 and phyl. III CMR15 grew much better under these conditions. Overall, the phyl. II/IV strains did not grow as well on  $NO_3^-$  as phyl. I/III strains at any  $O_2$  level.

All phyl. II/IV strains tested encode the  $NO_3^-$ ,  $NO_2^-$ , and NO reductases that catalyze the first three steps in denitrifying respiration, but comparative transcriptomic analysis revealed that phyl. II strain UW551 did not express genes in this pathway as highly as phyl. I strain GMI1000 during growth in tomato stems (28). This suggested that denitrification may be less important for phyl. II than for phyl. I. To confirm that the Nar  $NO_3^-$  reductases



**FIG 3** The presence of a functional *nos* cluster in RSSC strains correlates with the ability to grow anaerobically on nitrate and produce N<sub>2</sub>O. (A) Using three representative strains per phylotype (as labeled on the *x*-axis), cell cultures ( $OD_{600}$  of 0.001) were incubated statically for 72 h in VDM with or without 30 mM nitrate, and endpoint growth was measured spectrophotometrically. Vertical bars represent the standard error of the mean. Growth data were used with permission from reference 5. Dinitrogen (N<sub>2</sub>) gas production was qualitatively monitored for 96 h in separate tubes. Nitrite (NO<sub>2</sub><sup>-</sup>) was measured using Greiss reactions, using cultures of each strain in VDM inoculated to an OD<sub>600</sub> of 1.0 and incubated for 3 h anaerobically. The presence or absence of NO<sub>2</sub><sup>-</sup> and N<sub>2</sub> is indicated with a + or – sign, respectively. Data reflect 3 biological replicates per strain. (B) Production of N<sub>2</sub>O gas. Using a representative strain for each phylotype (GMI1000, K60, CMR15, PSI07), cell cultures (OD<sub>600</sub> = 0.0001) were incubated anaerobically for 24 h in VDM with 10 mM NO<sub>3</sub><sup>-</sup>. CFU was enumerated at the time of gas collection. The data shown reflect 5 or 6 biological replicates. Letters indicate *P* < 0.05 (Brown-Forsyth and Welch ANOVA with multiple comparisons).



**FIG 4** Nitrate enhances growth of RSSC strains under low-oxygen conditions, with the biggest impact on phylotypes I and III. (A to D) Representative strains of each phylotype were grown in denitrifying-favoring VDM broth with and without 30 mM nitrate and at various oxygen levels (0.1, 1.0, 10.0, and 21.0% oxygen).  $A_{600}$  was measured after 72 h growth at 28°C with moderate shaking. Bars indicate the standard error. Above each bar, the fold change is listed:  $A_{600}$  with NO<sup>-</sup><sub>3</sub> versus  $A_{600}$  without NO<sup>-</sup><sub>3</sub>. Each treatment was repeated a total of 9 times. \*, P < 0.05 by 2-tailed *t* test.

in phyl. II/IV strains are functional, we measured NO<sub>2</sub><sup>-</sup> production during anaerobic growth (Fig. 3A). Four of six tested phyl. II/IV strains produced detectable NO<sub>2</sub><sup>-</sup>, even though their growth was not enhanced by this metabolic conversion. After 4 h of incubation at high cell densities (10<sup>9</sup> CFU/mL), phyl. II strain K60 accumulated ~40  $\mu$ M NO<sub>2</sub><sup>-</sup>, while phyl. I GMI1000 accumulated ~90  $\mu$ M.

To learn if the predicted NO reductase NorB is functional in phyl. II/IV and to compare N<sub>2</sub>O production by completely and partially denitrifying strains, we measured N<sub>2</sub>O gas produced by denitrifying cultures of the four phylotype representatives. Consistent with the finding that all four strains reduce NO<sub>3</sub><sup>-</sup> under low-oxygen conditions, all strains made detectable quantities of N<sub>2</sub>O (Fig. 3B). Complete denitrifiers produced approximately twice as much N<sub>2</sub>O per cell as partial denitrifiers (P = 0.0065).

To determine if phyl. II/IV strains can grow in low  $O_2$  conditions by using fermentation as an alternative to  $NO_3^-$  respiration, we used high-pressure liquid chromatography (HPLC) to look for fermentation end products in filtered spent culture of the four representative strains after 24 h of growth under either aerobic or anaerobic conditions. We did not detect acetate, lactate, or other fermentation end products (data not shown). Moreover, fermentation usually acidifies culture media, and the pH of the RSSC culture supernatants was unaltered.

Gene enrichment analysis reveals additional metabolic differences between phyl. I/III and phyl. II/IV strains. To identify metabolic functions that may have cosegregated with the *nos* cluster and that could explain the observed differences among strains in inorganic nitrogen respiration, we screened genomes for KEGG categories that are enriched in phyl. I/III strains versus phyl. II/IV strains (Fig. S5). This analysis suggested that the genomes of complete and partial denitrifying strains are enriched in distinct sets of aromatic degradation pathways. Phyl. II/IV strains were enriched in a Ben/Cat pathway for benzoate/catechol degradation (29). Phyl. I/III strains showed enrichment of a partial Dmp pathway that is missing the DmpB gene that catalyzes the ring opening of catechol (30). The KEGG enrichment analysis was performed on the small set of genomes available in 2015, which was biased toward phyl. Il genomes. We curated high-quality genomes that better represent the genomic diversity of the RSSC and performed blastp searches for aromatic degradation enzymes (Fig. 5). This robust analysis confirms that the Ben/Cat pathway is indeed present in most phyl. II/IV genomes. The partial Dmp pathway is sporadically present in phyl. I/III genomes and absent from phyl. II/IV genomes. Overall, the protocatechuate degradation pathway (Pca) (29) is broadly conserved across the RSSC, as we previously found (31). The hydroxycinnamic acid degradation pathway (Fcs) (31) is broadly conserved except in the phyl. IIC lineage and the banana blood disease lineage of genome-reduced phyl. IV strains. The salicylic acid degradation pathway (Nag) (32) is broadly conserved except in phyl. IIC and most IIA genomes and the Sumatra disease of clove lineage of genome-reduced phyl. IV strains.

**Complete and partial denitrifiers in the RSSC have different oxygen preferences.** To better understand oxygen preferences within the RSSC, we stab-inoculated strains into tubes of Van der Mooter's (VDM) soft agar with or without 30 mM NO<sub>3</sub><sup>-</sup>. In these tubes, O<sub>2</sub> is available in a diffusion gradient near the agar surface. After 1 week, the growth patterns in these culture tubes indicated that phyl. I/III GMI1000 and CMR15 had a strong preference for anaerobic environments when NO<sub>3</sub><sup>-</sup> was available, while phyl. IV had a subtle preference for lower-than-atmospheric O<sub>2</sub> levels (Fig. S6). A GMI1000  $\Delta narG$  mutant, which lacks the first denitrification step, had no tactic response to NO<sub>3</sub><sup>-</sup> conditions (data not shown), which is consistent with dependence of these migration patterns on energy taxis (also known as aerotaxis) (33).

**Complete and partial denitrifiers in the RSSC may have adapted to different ecological niches.** Biofilms are typically hypoxic (34), so we hypothesized that phyl. I and III strains would form more robust biofilms. We tested this hypothesis using the polyvinyl chloride (PVC)-crystal violet biofilm assay, which showed that phyl. I/III strains formed thicker biofilms *in vitro* than phyl. II/IV (Fig. 6B).

Previous scanning electron microscopy (SEM) studies showed that the complete denitrifier GMI1000 forms dense biofilms in tomato xylem vessels (35, 36). To determine if all RSSC phylotypes form similarly dense biofilm in planta, we used SEM to image xylem tissue at the onset of wilt symptoms. The complete denitrifying strains in phyl. I/III-colonized xylem vessels differently than the phyl. II/IV partial denitrifiers. Phyl. I GMI1000 and phyl. III CMR15 colonized many xylem vessels extensively and often formed thick biofilms on vessel walls and in the lumens (Fig. 6A). In contrast, cells of phyl. II K60 and phyl. IV PSI07 were visible in fewer xylem vessels and often formed single-cell layers on the vessel walls (Fig. 6A). During SEM sample preparation, stem cross sections are washed in a fixative solution. We hypothesized that planktonic or loosely attached cells may disperse into the solution before the fixative can anchor them in place. To assess the relative numbers of planktonic and attached cells in plants infected with each strain, we quantified bacterial populations in homogenized stem samples and then quantified the unattached cells that streamed from cut stem sections incubated in water. As previously observed, all four phylotype representatives colonized plants similarly, reaching population sizes of  $>1 \times 10^9$  CFU/g stem (Fig. S7A). There was no difference in the proportion of released cells of phyl I/III strains GMI1000 and CMR15 or of phyl. II K60. More than 90% of these cells remained in cut stem sections. However, almost twice as many phyl. IV PSI07 cells streamed from cut stems into the water (Fig. S7B). If PSI07 cells were more often planktonic or loosely attached, this could explain the relatively few bacteria visible in SEM images of PSI07-infected stems. Together, the PVC biofilms, in planta SEM images, and streaming assay results suggest



**FIG 5** Variation in aromatic degradation pathways within the RSSC. (Top) Presence/absence of aromatic degradation genes across the species complex. (Bottom) Summary of the conservation of the aromatic degradation pathways across distinct phylotypes. The benzoate/catechol degradation pathway and the hydroxycinnamic acid/protocatechuate pathways converge on the last four Pca enzymes. The phylogenetic tree was constructed based on 49 conserved genes using the KBase SpeciesTree app. The presence/absence of each gene was determined through blastp analysis of the genomes.

that during plant infection, complete denitrification may help phyl. I/III strains form more robust biofilms on xylem walls.

To assess the effects of bacterial growth on  $O_2$  levels in tomato xylem, we used a microprobe to directly measure  $O_2$  concentrations in sap from plants colonized by each of the four representative strains. Bacterial wilt disease significantly reduced  $O_2$  availability in



**FIG 6** Complete denitrifying RSSC strains form more biofilm in culture and occupy different niches in tomato xylem during bacterial wilt disease. (A) Using 3 to 4 representative strains per phylotype, biofilm formation was quantified using PVC plate-crystal violet assay 96-well plates. Vertical bars represent the standard error of 9 biological replicates. (B) Representative SEM images showing stem cross sections of tomato plants infected with a representative strain from each phylotype (GMI1000, K60, CMR15, PSI07), as indicated. Susceptible tomato plants (cv. Bonny Best) were soil-soak inoculated with  $\sim 1 \times 10^8$  CFU/mL bacterial suspension in 80 g soil. At the first sign of disease, stem samples were taken, sliced, fixed, plated with gold, and visualized with a Zeiss LEO 1530 high-resolution scanning electron microscope. SEM images were captured from two biological replicates of plant inoculations each, with three or four plants and two stem slices per plant.

xylem sap regardless of the infecting RSSC strain. This finding is consistent with our previous observation that infection by GMI1000 reduced xylem  $O_2$  levels by half relative to healthy plants (3). The  $O_2$  levels in stagnant water and xylem sap from healthy tomato plants are 230  $\mu$ M  $O_2/L$  and around 200  $\mu$ M  $O_2/L$ , respectively (Fig. 7). Sap from early to mid-stage diseased plants (disease index = 1 to -3) infected with any of the four representative RSSC strains contained 95 to 220  $\mu$ M  $O_2/L$ . Oxygen levels were lower in sap from late-stage diseased plants, ranging from 0 to 175  $\mu$ M  $O_2/L$ . There was little difference in sap oxygen levels between tested strains (Fig. 7). This suggests that phyl. II/IV and I/III strains all rapidly consume any available oxygen and thus experience similarly low  $O_2$  during wilt pathogenesis. Nonetheless, our genomic and functional analyses indicate that the two groups have adapted to this metabolic challenge in distinct ways.

## DISCUSSION

We discovered that the four phylotypes in the RSSC have surprisingly diverse energy metabolisms. Comparative genomics of diverse RSSC strains revealed that the first three steps of denitrification are broadly conserved across the RSSC, but only phyl. I/III have the final Nos-dependent step. These bioinformatic results are consistent with prior physiological studies showing that only phyl. I/III strains produce N<sub>2</sub> gas (5). Unfortunately, this means that the official taxonomic revision of RSSC species incorrectly describes the denitrification phenotypes of *R. pseudosolanacearum* and *R. solanacearum* (7). This warrants correction.

Plant xylem has often been described as a nutrient-poor environment (9). However, recent quantitative metabolomics and physiological modeling show that healthy



**FIG 7** Xylem sap oxygen levels in healthy and RSSC-infected plants. A microsensor was used to measure oxygen levels in the xylem sap that exuded from a freshly detopped tomato plant inoculated with water (healthy) or with RSSC phylotype representatives, GMI1000, CMR15, K60, or PSI07. Each circle represents the O<sub>2</sub> level in one plant; N = 12 to 14 plants/condition. Closed circles are levels from plants with midstage disease (1 to 74% leaf area wilted), and open circles are levels from plants with late-stage disease (>75% leaf area wilted). Xylem sap from infected plants contained less O<sub>2</sub> than sap from healthy plants (P = 0.0443, 0.0015, 0.0125, and 0.0031 for healthy versus GMI1000, CMR15, K60, and PSI07, respectively; Mann-Whitney test). All tested RSSC strains similarly reduced sap O<sub>2</sub> levels. Xylem sap from healthy plants contained less O<sub>2</sub> than stagnant water (P = 0.0005; Mann-Whitney test). Bars show the standard error of the mean.

tomato xylem sap contains enough organic carbon and nitrogen to sustain *Ralstonia*'s rapid growth, including mM levels of amino acids and 0.1-mM levels of glucose and sucrose (12, 13). Xylem sap should thus be considered a rich, but incomplete, medium (37). *In vitro* experiments indicate that phyl. I strain GMI1000 relies primarily on the glutamate, asparagine, aspartate, and glucose in xylem (12, 13). Catabolism of other sugars contributes slightly to success in xylem (11). Although GMI1000 can assimilate NO<sub>3</sub><sup>-</sup> into organic nitrogen via NasA, NO<sub>3</sub><sup>-</sup> assimilation appears to be most important for *Ralstonia* success in the rhizosphere at the earliest early stage of disease (38). Our data indicate that for phyl. I/III strains, NO<sub>3</sub><sup>-</sup> is primarily a terminal electron acceptor *in planta* rather than a nitrogenous building block.

If phyl. II/IV strains lack the Nos enzymes, then why do phyl. I/III strains require *nosZ* for full virulence on tomato? Pathway blockage could cause the  $\Delta nosZ$  mutants of GMI1000 and CMR15 to accumulate N<sub>2</sub>O. Although N<sub>2</sub>O has low toxicity, it was possible that these mutants experience inhibitory N<sub>2</sub>O levels *in planta*. However, direct measurements found that these mutants did not accumulate more N<sub>2</sub>O than the wild type *in vitro*. Because all strains produce similar N<sub>2</sub>O levels during anaerobic growth, the most likely explanation is that phyl. I/III strains have become dependent on Nos enzymes to generate a sufficient proton motive force to support growth *in planta*. Recently, we showed that levels of the denitrification intermediate NO influence expression of the type 3 secretion system for phyl. I strain GMI1000 (39). The type 3 secretion system is a major virulence factor. It is possible that *nosZ* mutants have slightly reduced expression of type 3 secretion system genes.

Throughout plant infection, RSSC pathogens experience dynamic levels of  $O_2$  and reactive oxygen/nitrogen species. We found that infection by all representative strains similarly decreased  $O_2$  levels in tomato xylem sap, leading to anoxia in advanced wilt disease. Nevertheless, diverse RSSC strains need mechanisms to manage the reactive oxygen and nitrogen species during plant infections (20, 40–42). Although  $O_2$  levels decrease during bacterial wilt, some  $O_2$  is present when *Ralstonia* populations are rapidly growing during early and mid-stage disease. Previously, we showed that a different phyl. Il strain (UW551) requires a high-affinity cbb<sub>3</sub>-type cytochrome *c* oxidase for maximal growth *in planta* and in microaerophilic culture (43). Genomes from representatives of all RSSC phylotypes encode both major types of terminal oxidase families:

proton-pumping heme-copper oxidases and nonpumping *bd*-type oxidases (data not shown [44]). Nevertheless, it remains unclear if the two groups of RSSC strains vary in their ability to use oxygen as a TEA.

Because phyl. I/III strains form abundant and thick biofilms on xylem vessel walls, these strains may experience much lower  $O_2$  levels *in planta* than were reflected in our measurements. Although  $O_2$  levels in exuded sap reflect the  $O_2$  available to planktonic bacteria *in planta*, such bulk analyses can mask the spatial heterogeneity within plant hosts. Additionally, we recently used X-ray microtomography to show that phyl. I strain GMI1000 induces wilt symptoms when its dense biofilms clog half of the total xylem vessels (4). The SEM images shown here suggest that phyl. II/IV strains may form biofilms that have more available oxygen.

It is surprising that although all RSSC strains experience low-oxygen conditions *in planta*, phyl. II/IV strains benefit little from the presence of the alternate TEA  $NO_3^-$ . We previously hypothesized that RSSC strains may have an  $O_2^-$  and  $NO_3^-$ -independent mechanism to obtain energy in VDM, such as amino acid fermentation or Stickland reactions (3). However, Stickland metabolism is rare outside *Clostridia* (45), and our data are consistent with the conclusion that RSSC lack fermentative metabolism and are obligate  $O_2$  and  $NO_3^-$  respirers. These bacteria may have such a high affinity for oxygen that they can scavenge the extremely small amount of oxygen in the medium during growth in an anaerobic chamber.

Differences in denitrification metabolism correlated with phenotypic differences in aerotaxis behavior and biofilm formation. When allowed to migrate to their preferred oxygen concentration in soft agar, phyl. I/III strains moved to lower  $O_2$  levels in a  $NO_3^-$ -dependent manner. Without  $NO_3^-$ , these strains preferred the  $O_2$ -rich agar surface. When  $NO_3^-$  was present, they migrated to a deeper, less oxygen-rich band. In contrast, the phyl. II/IV strains were indifferent to the presence of  $NO_3^-$ . Among the RSSC, aerotaxis has only been studied in phyl. II strain K60 (33).

Using a population genetics test, several denitrification-related genes were identified as core RSSC genes under selection (46). The Tajima's D scores were above 2 for the accessory metabolic proteins Narl and NarJ and the  $NO_3^-$ -responsive regulators NarL and NarX, suggesting that there could be functionally distinct alleles of these genes within the RSSC population. Except for a robust study of variation in quorum sensing synthases/regulators within the RSSC (47), there has been relatively little investigation of the variation of regulators within the RSSC.

In addition to differences in denitrifying metabolism, our genomic enrichment analyses revealed that phyl. I/III and phyl. II/IV vary in their predicted capacity for degrading aromatic compounds. Aromatic compounds are a major class of plant defense chemicals as well as possible carbon sources. Several aromatics have been detected and quantified in tomato xylem sap during infection with phyl. I strain GMI1000: salicylic acid (~20 to 200 nM), benzoic acid (~10 nM), and coumaric acid (~100 nM) (48). Our analyses found that phyl. II/IV genomes were differentially enriched in a benzoic acid/ catechol degradation pathway (29). The ability to degrade other aromatic compounds significantly increases *in planta* fitness of phyl. I strain GMI1000 (31, 32). It remains to be determined whether benzoate/catechol degradation similarly contributes to *in planta* fitness of phyl. II/IV strains.

Across the domain *Bacteria*, genes encoding energy metabolism are among those most commonly found in recently horizontally acquired regions (49). The evolution of the RSSC has clearly been shaped by HGT events, likely boosted by the group's natural competency (50, 51). Strains in all RSSC phylotypes take up and transfer DNA (51), although phyl. I is the most recombinogenic of the phylotypes (51–54). The saprophytic life stages of phyl. I/III strains may have provided opportunities to horizontally acquire the *nos* cluster from other soil residents. Moreover, survival in the soil may exert selective pressure for complete denitrification. Like the RSSC, *Bradyrhizobium* isolates vary in the presence/absence of the *nosZ* gene. An elegant microbial ecology study in Japan found that *nosZ*-minus *Bradyrhizobium* strains dominated in soil types that have

high levels of volcanic ash (55). In contrast, *Bradyrhizobium* strains with the full denitrification pathway have higher tolerance to flooding (56, 57). Little is known about whether RSSC lineages vary in their ability to survive in different soil types, but some lineages persist better in soil than others (58, 59).

**Conclusions.** Our genomic, physiological, and virulence studies collectively suggest that RSSC strains in phyl. I/III and II/IV use different metabolic strategies to reach high cell densities *in planta*. Phyl. I/III strains benefit from denitrifying respiration during tomato infection, including N<sub>2</sub>O reduction by NosZ. However, phyl. II/IV strains are fully virulent, growing to similar densities in host stems and causing identical wilt symptoms even though they lack NosZ and cannot complete denitrifying respiration. Broader genomic and behavioral analyses *in planta* and *in vitro* suggest that the two groups respond differently to oxygen, a key environmental variable. The completely denitrifying strains in phyl. I/III grow better under hypoxic conditions *in vitro* and are more likely to aggregate in biofilms on host plant xylem vessel walls. Phyl. II/IV strains have respiratory strategies that allow them to exploit environmental and host-associated niches containing higher oxygen levels. Ongoing studies will test the intriguing hypothesis that these divergent energy strategies reflect interspecies niche partitioning.

#### **MATERIALS AND METHODS**

Strains, mutagenesis, and culture conditions. The origins and accession numbers of strains used in this study are shown in Table S1. One representative strain for each RSSC phylotype was selected, based on the ability to cause disease on the common host tomato and on existing experimental data and closed genome sequences for strains GMI1000, CMR15, K60, and PSI07. The  $\Delta nosZ$  GMI1000 mutant was generated using splicing by overhang extension (SOE)-PCR to replace the *nosZ* open reading frame (ORF) with a gentamicin resistance gene cassette as described (3). This mutation was moved into strain CMR15 with natural transformation (50). Construction of the GMI1000 narG mutant was previously described (3). All strains were maintained in  $-80^{\circ}$ C glycerol stocks and cultured on solid Casamino Acidpeptone-glucose (CPG) plates prior to growth in broth.

Bacterial growth was measured in modified Van der Mooter's (VDM) medium (0.5 g KH<sub>2</sub>PO<sub>4</sub>, 0.5 g K<sub>2</sub>HPO<sub>4</sub>, 0.234 g MgSO<sub>4</sub>, 2.5 g Casamino Acids, 50 mM sodium succinate,  $\pm$ 30 mM potassium nitrate) at 28°C under controlled O<sub>2</sub> conditions (3, 60). Bacteria were routinely cultured in rich CPG broth. Unless otherwise noted, media were inoculated to a starting optical density at 600 nm (OD<sub>600</sub>) of 0.001 (~1 × 10<sup>6</sup> CFU/mL), and endpoint data were collected 72 h postinoculation. Anaerobic growth was in BD GasPak systems in 1.7-mL tubes; the OD<sub>600</sub> was measured spectrophotometrically at the endpoint. Aerobic assays were incubated in a 28°C shaker at 225 rpm in 96-well plates sealed with Breathe-Easy membrane (Sigma-Aldrich). All other O<sub>2</sub> conditions were generated in a gas-controlled chamber (Invivo<sub>2</sub>400, Ruskinn, Sanford, ME) in 96-well plates sealed with breathable tape. For 96-well plate assays, a Synergy HT microtiter plate reader (Biotek Instruments, Winooski, VT) was used to measure the endpoint A<sub>600</sub>.

To assess bacterial growth under a range of O<sub>2</sub> conditions, we stab-inoculated semisolid VDM (0.2% noble agar) with  $\sim 1 \times 10^7$  CFU of each strain. Tubes were incubated at 28°C without shaking and visually assessed after a week. NO<sub>2</sub><sup>-</sup> was quantified (reported as +/-) using Griess reactions (Molecular Probes, Inc., Eugene, OR) in lysed cell supernatant of anaerobic cultures following 3 h of incubation at high cell densities (OD<sub>600</sub> = 1.0; 1 × 10<sup>9</sup> CFU/mL) as described (3). N<sub>2</sub> production was visually assessed as the presence of gas bubbles over 96 h of anaerobic incubation in 1.7-mL tubes following inoculation at an OD<sub>600</sub> of 0.001. All assays were replicated 3 times per treatment per strain.

**N<sub>2</sub>O quantification.** Overnight aerobic cultures of representative strains from each phylotype were diluted to an OD<sub>600</sub> of 0.100 ( $\sim$ 1× 10<sup>8</sup> CFU/mL). Then, 100 µL of culture was added to 100 mL of VDM medium containing 10 mM NO<sub>3</sub> in a 300-mL flask. For these assays, the NO<sub>3</sub> concentration was reduced to 10 mM to avoid saturating the instrument. Flasks were sealed with a double-holed rubber stopper with two glass tubes inserted for flushing the headspace and sampling gas. Flasks were flushed with >3 volumes of N<sub>2</sub> gas to create anaerobic conditions, and the glass tubes were stopped with small rubber septa. Medium was not deoxygenated, because RSSC cultures rapidly deoxygenate medium biologically (3). Cultures were incubated statically at 28°C for 24 h, at which point 100 µL of culture was measured using a needle and syringe to draw out a 300- mL gas sample from the top of the flask, while N<sub>2</sub> gas replaced withdrawn gas just above the culture level. Gas samples were placed in gas chromatography (GC) vials, injected into an Agilent 7890A GC system (Santa Clara, CA, USA), and analyzed as described (61).

**Growth in host tomato plants and virulence assays.** To measure pathogen growth *in planta*, 21day-old tomato plants (wilt-susceptible cultivar [cv.] Bonny Best) were inoculated through a cut leaf petiole with 2,000 CFU of RSSC as described (3). Then, 2 days postinoculation, 0.1 g stem tissue was collected from the midstem directly above the inoculated petiole, ground, and dilution plated to quantify the bacterial population size. These assays contained 10 plants per strain.

To assess relative virulence, unwounded 21-day-old tomato plants were soil-soak inoculated with  $1 \times 10^8$  CFU of RSSC per g potting mix as described (3). Symptoms were assessed daily using a disease

index based on the percentage of leaves wilted (0 = healthy, 1 = 1 to 25%, 2 = 26 to 50%, 3 = 51 to 75%, 4 = 76 to 100%) (62). Each assay contained 16 plants per treatment, and the assays were replicated three times.

**Phylogenetic analysis.** We selected 51 genomes that represent the genomic diversity of the RSSC (63). Using KBase (64), we built a phylogenetic tree by using the Insert Set of Genomes into Species Tree app, which creates a multiple sequence alignment (MSA) from 49 well-conserved bacterial proteins and builds a tree with FastTree 2 version 2.1.10 (65).

To expand the analysis beyond the RSSC, all complete genomes of *Betaproteobacteria* publicly available on NCBI at the time of this analysis (2012) were compared using multilocus sequence typing (MLST) based on 31 loci as described (66). The ORFcore pipeline (67) and MUSCLE version 3.7 (68) were used to extract, correct, align, and concatenate amino acid sequences. FastTree 2 version 2.1.3 was used for tree construction (65). A gene was considered present if it shared >40% (or in the case of NosF >30%) amino acid identity over at least 70% of the length of the query sequence (*Pseudomonas stutzeri* CAA37) as determined with blastp in the BLAST+ package. blastp was also used for amino acid comparisons across all available NosZ sequences on NCBI at the time of analysis (2015).

**Protein sequence comparisons.** Homologs of denitrification pathway genes were detected in genomes of strains GMI1000, CMR15, K60, and PSI07 using the MicroScope web interface, BLAST, and OMA (69). The corresponding protein sequences were aligned using MUSCLE (68), and percentage identity to strain GMI1000 was computed for each locus using the seqinr R package (70).

**FNR binding site predictions.** The Virtual Footprint Regulon Analysis program from PRODORIC predicted intergenic FNR binding sites across RSSC genomes using a weighted matrix generated from the *Escherichia coli* FNR binding sequence (71). Sequence logos were generated with WebLogo (72) and the trimmed FNR binding site sequences from all four phylotypes. The PRODORIC Virtual Footprint Promoter Analysis program predicted the presence of FNR binding sites upstream of genes related to denitrification for three representative strains. Because its genome was then in draft form, the representative phyl. Il strain K60 was excluded from this analysis.

**KEGG enrichment analysis.** All RSSC genome sequences available in 2015 were annotated using HMMer models for KEGG and Pfam as described (73). Amino acid identity (25% with 50% coverage) was used to cluster sequences *de novo* with proteinortho version 5. Gene families overrepresented in phyl. I/ III or phyl. II/IV strains were identified using Fisher's exact test in the Python package SciPy (74). The significance level was set at P > 0.05.

**Biofilm assays.** Biofilm formation of each phylotype representative strain was assessed *in vitro* using the PVC plate-crystal violet stain assay (33). Values were reported as  $OD_{590}/OD_{600}$  to normalize for minor differences in growth rates among strains.

**Scanning electron microscopy.** Bonny Best tomato plants (3 weeks old) were inoculated through a cut leaf petiole with  $1 \times 10^2$  CFU of RSSC GMI1000, K60, CMR15, or PSI07. At the first sign of symptoms (Disease Index = 1), two thin slices were collected from each midstem following surface sterilization and processed for SEM as described (35). Samples were visualized with a Zeiss LEO 1530 high-resolution scanning electron microscope (Materials Sciences Center, University of Wisconsin-Madison). For each strain, 6 to 8 plants were assessed.

**Bacterial streaming assay.** Tomato plants (19 days old) were inoculated through a cut petiole with  $1 \times 10^3$  CFU of strain GMI1000, K60, CMR15, or PSI07 as described above. At the first sign of symptoms (DI = 1), 1 cm of stem tissue from 0.5 cm below the inoculation site was excised, cut in half, and floated in 1 mL sterile water in a 24-well microplate. Samples were incubated for 90 min at room temperature with 85 rpm shaking before the stem section was removed and the escaped bacteria were quantified as OD<sub>600</sub> using a spectrophotometer.

**Xylem sap oxygen measurement.** Tomato plants (17 days old) were soil-soak inoculated as described above with  $1 \times 10^8$  CFU/mL of either GMI1000, CMR15, K60, PSI07, or water. When symptoms first appeared, disease severity was rated, plants were detopped, and xylem sap rapidly pooled on the cut stem via natural root pressure. An oxygen microsensor probe (Unisense, Aarhus, Denmark) was immediately inserted into the pooled xylem sap and read until the signal was steady for 60 s. For an O<sub>2</sub> saturated water control, air was bubbled through distilled water for 5 min. The anoxic control solution was 0.1 M sodium ascorbate and 0.1 M sodium hydroxide in water. The O<sub>2</sub> content of stagnant deionized water was measured at each sampling point to ensure probe consistency.

#### SUPPLEMENTAL MATERIAL

Supplemental material is available online only.

FIG S1, PDF file, 0.3 MB. FIG S2, PDF file, 0.3 MB. FIG S3, PDF file, 0.1 MB. FIG S4, PDF file, 0.2 MB. FIG S5, PDF file, 0.7 MB. FIG S6, PDF file, 1.3 MB. FIG S7, PDF file, 0.2 MB. TABLE S1, PDF file, 0.1 MB.

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