Rhodopseudomonas palustris Regulons Detected by Cross-Species Analysis of Alphaproteobacterial Genomes

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Rhodopseudomonas palustris, an α -proteobacterium, carries out three of the chemical reactions that support life on this planet: the conversion of sunlight to chemical-potential energy; the absorption of carbon dioxide, which it converts to cellular material; and the fixation of atmospheric nitrogen into ammonia. Insight into the transcription-regulatory network that coordinates these processes is fundamental to understanding the biology of this versatile bacterium. With this goal in mind, we predicted regulatory signals genomewide, using a two-step phylogenetic-footprinting and clustering process that we had developed previously. In the first step, 4,963 putative transcription factor binding sites, upstream of 2,044 genes and operons, were identified using cross-species Gibbs sampling. Bayesian motif clustering was then employed to group the cross-species motifs into regulons. We have identified 101 putative regulons in *R. palustris*, including 8 that are of particular interest: a photosynthetic regulon, a flagellar regulon, an organic hydroperoxide resistance regulon, the LexA regulon, and four regulons related to nitrogen metabolism (FixK₂, NnrR, NtrC, and σ^{54}). In some cases, clustering allowed us to assign functions to proteins that previously had been annotated with only putative functions; we have identified RPA0828 as the organic hydroperoxide resistance regulator and RPA1026 as a cell cycle methylase. In addition to predicting regulons, we identified a novel inverted repeat that likely forms a highly conserved stem-loop and that occurs downstream of over 100 genes.

The alpha division of the proteobacteria is defined by a conserved 16S rRNA gene sequence and insertions/deletions in conserved protein sequences (20). Despite being phylogenetically related, the α -proteobacteria have no defining phenotypic characteristics. Among the photosynthetic α -proteobacteria (i.e., purple bacteria) are Rhodobacter sphaeroides, Rhodospirillum rubrum, and Rhodopseudomonas palustris. These metabolically adaptable species are found in a variety of niches, including marine environments, freshwater sediments, and soil, and they have the ability to photosynthesize, fix carbon dioxide, and fix nitrogen. Other members of the α -proteobacteria live in association with eukaryotes, both plants and animals. Plant-associated species include Bradyrhizobium japonicum, a soybean symbiote, and Agrobacterium tumefaciens, the causative agent of crown gall disease. Animal pathogens include Bartonella henselae, Rickettsia prowazekii, and Brucella suis, the causative agents of cat scratch disease, typhus fever, and porcine brucellosis, respectively. At the time of this study, complete genome sequence data are available for 13 α -proteobacterial species, and partial genome sequence data are available for an additional 16 species. Given the wealth of sequence data available and the metabolic and environmental diversity of these bacterial species, the α -proteobacteria constitute an excellent target for a comparative genomics study.

The purple photosynthetic bacterium *R. palustris* exhibits a highly flexible metabolic lifestyle, reflecting the diversity present in the α -proteobacteria, and was therefore an obvious choice as the reference species for this comparative study.

In addition to its ability to photosynthesize, fix carbon dioxide, and fix nitrogen, R. palustris can degrade a variety of organic aromatic compounds, including those found in plant matter and industrial waste (10, 21). R. palustris is able to respire both aerobically and anaerobically. Under anaerobic conditions in the presence of light, the bacterium forms stacked membrane structures that house the photosynthetic machinery and generate energy (51). It can produce hydrogen using a nitrogenase-dependent mechanism, thus making it a potential bioenergy source (2). The R. palustris genome encodes many alternate or redundant systems, including four complete LH₂ (light-harvesting) complexes, two NADH-dependent dehydrogenases, and three nitrogenases (24). R. palustris and other α -proteobacterial species, like Caulobacter crescentus and Hyphomonas neptunium, share an asymmetric cell division phenotype, wherein cell division is initiated only by surface-adherent cells, resulting in an adherent cell and a motile cell (22). It has been suggested that the immobilized cells may be exploited in the fabrication of biocatalysts (24). The potential applications in energy production, bioremediation, and biocatalysis make R. palustris a bacterial species of considerable environmental and biotechnological interest. In order to realize that potential, it is important that we first understand the regulation of R. palustris' complement of metabolic pathways.

A consequence of *R. palustris*' metabolic flexibility is the need for the organism to have an extensive transcription-regulatory network. Cellular processes, such as nitrogen fixation and carbon dioxide fixation, are energy intensive; thus, the enzymes for these pathways must be regulated with respect to nutrient availability and other environmental factors (for reviews, see references 7, 8, and 43). For example, it is most efficient for the bacterium to regulate the synthesis of its pho-

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tosynthetic machinery with respect to light intensity and wavelength (18). The presence of a sophisticated regulatory network is supported by the large number of annotated transcription-regulatory and signaling proteins (451 genes) encoded in the *R. palustris* genome (24).

In order to begin to dissect this complex regulatory network, we undertook a comparative study of the α -proteobacteria, focusing on R. palustris. The first goal of this study was to identify transcription factor binding sites (TFBSs) genomewide by phylogenetic footprinting. Phylogenetic footprinting is an approach to discover regulatory motifs in orthologous intergenic regions. The assumption is that among a phylogenetically close group of species, orthologous genes are likely to be regulated by a common transcription factor (TF). Under this assumption, the TFBSs will be conserved, while other noncoding DNA that is not under selective pressure will be free to mutate over time. Thus, the promoter regions upstream of orthologous genes are analyzed for putative regulatory motifs by computationally searching for conserved sequence elements. In the current study, conserved sequences were found using a Gibbs sampling strategy. This approach predicts regulatory motifs de novo without any prior knowledge regarding binding sites and exploits the diversity of the contributing species in order to increase the power of the search for regulatory motifs.

An advantage of using the Gibbs sampler for these studies is that it implements a rigorous Bayesian method to infer the number of sites and their locations (49). This means that not all of the species contributing orthologous promoter data are required to contribute to a motif prediction (detailed discussion and examples can be found at http://bayesweb.wadsworth.org /web_help.PF.html). Accordingly, a TFBS that is present in an intergenic region of the target species and some of the species in the collection may be absent in others. This feature is important, since the selection of species for phylogenetic footprinting is empirical; we require only that the species be phylogenetically related so that they have a significant number of common TFs (30). This requirement was met for the set of α -proteobacteria selected for the current study (Table 1), allowing us to predict regulatory motifs for the promoter regions of 2,044 operons. We have previously demonstrated the power of Gibbs sampling (49) for phylogenetic footprinting within the γ -proteobacteria (29, 30). Specifically, among promoters with experimentally verified TFBSs, ~74% of the predictions corresponded to the known sites. Furthermore, among the remaining novel predictions were TFBSs predicted upstream of fatty acid biosynthesis genes; these sites were used to affinity purify a previously uncharacterized TF (YijC) that has since been shown to regulate fatty acid biosynthesis in vivo (55).

The second goal of this study was to cluster these predicted *cis* regulatory elements into regulons. Clustering provides a mechanism by which motifs that represent binding sites for the same TF are grouped; this combined evidence improves the reliability of pathway and cognate TF identification. We used a Bayesian clustering algorithm developed previously that was found to accurately cluster *Escherichia coli* regulatory motifs (38). A total of 101 putative *R. palustris* regulons were identified, including 8 that are of particular interest.

TABLE	1.	Selected	features	shared	between	the α-proteo	bacterial
			species u	sed in	this study		

Species and description	Characteristics	No. of TFs
R. palustris; widely distributed	Photosynthesizes Fixes carbon dioxide Fixes nitrogen Degrades aromatic compounds Asymmetric cell division phenotype	168 ^a
B. japonicum; soybean symbiote	Fixes nitrogen	139
C. crescentus; aquatic	Degrades aromatic compounds Asymmetric cell division phenotype	51
<i>B. suis</i> ; intracellular animal pathogen	Degrades aromatic compounds	61
R. sphaeroides; widely distributed	Photosynthesizes Fixes carbon dioxide Fixes nitrogen	54 ^b
R. rubrum; widely distributed	Photosynthesizes Fixes carbon dioxide Fixes nitrogen	69 ^{<i>b</i>}
N. aromaticivorans; widely distributed, opportunistic pathogen	Degrades aromatic compounds	44 ^b
H. neptunium; marine	Asymmetric cell division phenotype	46 ^b

^{*a*} Count of TFs identified in each species for the 168 that are found in *R. palustris* and at least one other species (70 of the 238 *R. palustris* TFs did not have an ortholog in any of the above species by our criteria).

^b These counts are from incomplete genomes and are therefore preliminary.

MATERIALS AND METHODS

Genome sequence data. The following genome sequences were obtained from the NCBI reference sequence database (ftp://ftp.ncbi.nih.gov/genome/Bacteria/): *Rhodopseudomonas palustris* CGA009 (NC_005296), *Bradyrhizobium japonicum* USDA 110 (NC_004463), *Brucella suis* 1330 (NC_004310 and NC_004311), and *Caulobacter crescentus* CB15 (NC_002696). Incomplete genome sequence data for *Rhodobacter sphaeroides* (v 11/9/2003), *Rhodospirillum rubrum* (v 11/9/2003), and *Novosphingobium aromaticivorans* (v 11/12/2003) were obtained from the Department of Energy Joint Genome Institute (http://www.igi.doe.gov). The sequence of *Hyphomonas neptunium* ATCC 15444 (March 2004) was obtained from The Institute for Genome Research (http://www.tigr.org). *R. palustris* operon predictions were downloaded from the Department of Energy Joint Genome Institute's site.

Phylogenetic footprinting. Orthologous intergenic regions were identified as previously described (29). Briefly, TBLASTN (1) was used to identify orthologs of 4,814 *R. palustris* proteins (excluding 18 of the 4,832 CDS entries in NC_005296 that are pseudogenes) in a database composed of the genome sequence data of the eight species under study. The following criteria were applied in order to select hits corresponding to bona fide orthologs: (i) the expectation value must be $<10^{-20}$; (ii) the expectation value must be better than the expectation value of the second-best hit in *R. palustris*; (iii) a hit must start within the first 20 amino acids of the *R. palustris* query sequence. Upstream orthologous intergenic regions were extracted from the database with a maximum length of 500 bp and a minimum length of 50 bp. In some cases, it was obvious that the start codons for genes in *R. palustris* were annotated upstream of a more likely 5' end of the gene (e.g., *lexA*). To prevent the loss of regulatory signals near the 5' ends of genes, we identified a more likely downstream start codon. The

BLAST procedure described above was then rerun with the revised (i.e., shortened) sequences. Potential artifacts arising from the shifting of these start codons were minimized by tracking the revised genes throughout the phylogeneticfootprinting and clustering process.

The recursive Gibbs sampler (Gibbs v 2.06.015) (50) was used to exhaustively search for palindromic and nonpalindromic motifs in each orthologous intergenic data set. A Bayesian segmentation algorithm was used to generate a position-specific background composition model for each sequence in a data set (Unifiedcpp) (26). All models consisted of 16 active columns that were allowed to fragment to a maximum width of 24 columns. For the detection of palindromes, the Gibbs sampler was allowed to choose an even- or odd-width palindromic model, based on the sequence evidence. The sampler was allowed to run for 2,000 iterations, with a plateau period of 200 iterations, and it was reinitialized 40 times using random seeds. The most significant motif found by the recursive Gibbs sampler in a data set was masked, and the sampling procedure was repeated until no motifs were found with an average maximum a posteriori probability (avgMAP) of >1. This average MAP cutoff was chosen empirically. For reference, MAP values of >0 provide a measure of how much more likely the alignment is than the unaligned background. The entire process (sampling and masking) was repeated three times to take advantage of the stochastic nature of Gibbs sampling and to maximize the number of motifs found. Motifs that contained unique sites in R. palustris were then extracted and used for further analysis.

Clustering. We selected motifs for clustering by first applying a critical-value criterion; palindromic and nonpalindromic motifs were compared to model-specific critical-value criteria derived from random data simulations (30). Coding sequence contamination in the extracted intergenic regions was detected through comparison of the coordinates of each site in a motif to the available genome annotations (*R. palustris, B. japonicum, B. suis,* and *C. crescentus*). If more than half of the sites from annotated species overlapped a coding region, the motif was eliminated from clustering. Motifs were also analyzed for the presence of shared sites. If two motifs contained the same site from *R. palustris* (which sometimes occurs with divergently transcribed genes), one motif was eliminated from the clustering input.

Clustering was carried out using the Bayesian motif clustering algorithm (BMC v 1.5x) (38). Even-, odd-, and nonpalindromic models were clustered separately using a tuning parameter (q) of 100. This parameter, which affects whether a motif forms a cluster on its own or whether the motif joins an existing cluster, was determined empirically. BMC was run for 10 iterations without fragmentation, followed by 25 iterations with the fragmentation option enabled, to produce the optimal solution. BMC was then allowed to sample for an additional 500 iterations to produce the frequency solution described in this study. All clusters were initially allowed to shift, meaning that motifs could realign with respect to each other within a cluster. The shifting option did not influence the alignment of motifs in palindromic clusters and was turned off. Shifting did, however, improve the alignment of nonpalindromic motifs within a cluster; thus, we allowed nonpalindromic motifs to shift left or right by up to two columns.

Scanning. Cluster models from the frequency solution were used as input to the Dscan algorithm (Dscan revision 2.3) (34), using either palindromic models (the base counts in paired palindromic columns were summed) or nonpalindromic models, as indicated by the cluster model parity. The complete set of *R. palustris* intergenic regions was scanned to detect sites that matched the model. Given the input model and database, Dscan uses the approach described by Staden (44) to report sites that match the model above a given level of statistical significance. In this study, we report sites at a *P* value of <0.05.

RESULTS

Phylogenetic footprinting to identify transcription factor binding sites. The choice of species to be used for phylogenetic footprinting was governed by two factors: their phylogenetic relatedness and the presence of common metabolic pathways. First, the phylogenetic relatedness of α -proteobacterial species for which a complete or nearly complete genome sequence was available was inferred using the sequences of their 16S rRNA genes. Current alignment algorithms, including Gibbs sampling, do not account for the phylogenetic relatedness (correlation) of the input data, which leads to overestimation of the



FIG. 1. Phylogenetic tree of the α -proteobacterial species used in this study (*Rhodopseudomonas palustris, Bradyrhizobium japonicum, Caulobacter crescentus, Brucella suis, Rhodobacter sphaeroides, Hyphomonas neptunium, Rhodospirillum rubrum, and Novosphingobium aromaticivorans*) generated using 16S rRNA sequences and the maximum likelihood method (12).

significance of motifs. Therefore, to achieve sufficient phylogenetic diversity and minimize losses to the power of the crossspecies technique due to phylogenetic correlations among the sequence data, we chose *R. palustris* and seven additional species (Fig. 1), using the technique of Newberg and Lawrence (35). This was done in a "greedy" fashion, so as to maximize the effective number of independent sequences. This means that, although additional genome sequences were available, they were not expected to improve the reliability of predictions in *R. palustris* and in fact would be likely to skew the results by including highly correlated data. This is why, for instance, only one of the sequenced *Brucella* species was retained.

Six of the eight species shown in Fig. 1 approximate independent observations; that is, for each possible species pair comparison, there is no more correlation, measured as the percent identity in the orthologous intergenic regions, than would be expected by chance ($\sim 40\% \pm 4\%$). R. palustris and B. japonicum, however, exhibit some correlation in sequence, with an average of $47\% \pm 8\%$ sequence identity in the intergenic regions. B. japonicum was retained, nevertheless, because the inclusion of a correlated species has been shown to improve reference species predictions in a cross-species study (30), and this low level of correlation can be accounted for in the critical value (P value) calculations (see Materials and Methods). A second factor in our choice of species was the presence of common metabolic pathways and TFs; Table 1 highlights features of each species that are expected to contribute to the analysis of R. palustris. The conservation of TFs across species was examined, and of the 238 R. palustris TFs (24), 168 were found to have an ortholog in at least one of the other seven species.

Using the set of eight species, we compiled orthologous upstream intergenic sequence data sets representing 2,411 *R. palustris* genes/operons and used them as input to the Gibbs sampler (see Materials and Methods). A total of 4,963 motifs were found for 2,044 of these data sets by phylogenetic footprinting. Statistical-significance criteria were determined using

a random data simulation as described by McCue and coworkers (30). By these critical-value criteria, over half of the motifs (2,722) were marginally significant (P < 0.2); of those, 442 were highly significant (P < 0.01). The full set of phylogenetically footprinted motifs, along with significance criteria, can be viewed online (http://bayesweb.wadsworth.org/prokreg.html).

Clustering predicted sites into regulons. A BMC algorithm (38) was used to infer regulons from the collection of motifs found by phylogenetic footprinting. After applying filtering heuristics (see Materials and Methods) to the 2,722 motifs described above, we identified 1,730 motifs for clustering. At the selected level of statistical significance (P < 0.2), many of these 1,730 motifs were only marginally significant. However, we have found that the noise introduced into the clustering procedure by false-positive motif predictions has little effect on true regulons; specifically, the false-positive motif predictions do not join clusters reproducibly (L. A. McCue, unpublished data). This is supported by the observation that only 472 of the input motifs reproducibly joined a cluster and are reported as members of regulons. Furthermore, we calculate a Bayes ratio as a measure of cluster strength and have found true regulons to rank among the highest scoring. The Bayes ratio is the ratio of the probability of the data belonging in a cluster to the probability of the data existing as separate motifs. Among the 101 clusters identified here, several of the high-scoring clusters are supported by biochemical and genetic data from the literature as bona fide regulons; they are shown, along with sequence logos (41), in Table 2 and are described in detail below.

The clusters represent partial regulons, including only those regulatory sites that could be detected by our cross-species approach. For example, R. palustris genes lacking orthologs in other species were never analyzed. It is also the case that the heuristics used to filter out motifs prior to clustering may eliminate some legitimate motifs. One way in which to address this problem is to scan the complete set of intergenic regions for a species, using position weight matrices built from the clusters. This approach often results in the prediction of additional members of a regulon (48). We employed a rigorous statistical algorithm based on Staden's method (44) as implemented by Neuwald and coworkers (34) to scan for additional TFBSs in *R. palustris*. The algorithm yields a *P* value for a motif match that represents the probability that a site of equal or greater strength would be found in a random data set of the same size and composition. In scans of the set of all intergenic regions of R. palustris with the cluster matrices, we identified additional members of regulons at a *P* value of <0.05 (Table 2). Phylogenetic footprinting, clustering, and scanning are summarized in Fig. 2.

Nomenclature. The regulon descriptions presented here use the following naming conventions. A motif is defined as a collection of aligned DNA sequences (i.e., putative TFBSs) from phylogenetic footprinting; motifs are simply given the name of the *R. palustris* gene whose upstream intergenic sequence data were analyzed during motif prediction. A cluster is defined as a collection of aligned motifs. Clusters are referred to as Even, Odd, or NonP depending on whether an even-palindromic, odd-palindromic, or nonpalindromic model best describes them. Each cluster also has a numerical designation that is produced during the clustering process; it is used here solely as a unique identifier (e.g., Even-239). Annotated gene functions were extracted from the published *R. palustris* CGA009 genome (24). Eight of the clusters have particular relevance to *R. palustris* biology and are described below.

OhrR cluster. Cluster Even-627 was the highest-scoring cluster by the Bayes ratio criterion. Two of the four genes in the cluster (*ohr* and *rpa4101*) are annotated as organic hydroperoxide resistance genes. These two *R. palustris* genes are homologous to the *ohr* gene from *Xyella fastidiosa*, which encodes a thiol-dependent peroxidase that decomposes organic hydroperoxides (5). *R. palustris* Ohr and RPA4101 are 60% and 45% identical, respectively, to *X. fastidiosa* Ohr at the protein level and have two conserved cysteines that are required for peroxidase activity. *rpa4101* forms an operon with *rpa4102* and *rpa4103*, which, respectively, encode a MarR family TF and a possible glutathione *S*-transferase. One of the remaining genes in the cluster, *rpa0828*, is annotated as a MarR family TF.

Organic hydroperoxide resistance genes are regulated by OhrR in Xanthomonas campestris. OhrR is a MarR family TF that senses oxidative stress through a single conserved cysteine residue; this cysteine, when oxidized, disrupts DNA binding (36). An amino acid sequence alignment of X. campestris OhrR, RPA0828, RPA4102, and orthologs from B. japonicum, B. suis, and H. neptunium shows that all contain the critical reactive cysteine surrounded by a number of other well-conserved residues (Fig. 3A). Additionally, it is interesting that the ohr and rpa0828 genes in R. palustris are syntenic with ohr and ohrR in X. campestris. Specifically, the rpa0828 gene is immediately upstream of and on the same strand as ohr, with a regulatory site predicted in each upstream region. In contrast, among B. japonicum, B. suis, and H. neptunium, the ohr orthologs are divergently transcribed from the ohrR orthologs, with a regulatory site located between them (Fig. 3B). These results suggest that RPA0828 is likely the cognate TF of the regulon, although RPA4102 is a probable paralog of RPA0828 and could provide redundancy in the regulatory circuit.

FixK₂ and NnrR clusters. The six motifs that made up cluster Even-623 have a strongly conserved palindromic sequence; when this cluster model was used to scan the database of all R. palustris intergenic regions, 12 additional sites were identified (Table 2). Several of the genes in this expanded regulon have predicted functions related to respiration, specifically, in cytochrome assembly and porphyrin biosynthesis. The motif model for this cluster (TTGA-N₆-TCAA) resembles the known binding sequence for the E. coli TF, Fnr (TTGAT-N₄-ATCAA) (17), a global regulator of anaerobic respiration. In B. japonicum, nitrogen fixation genes and genes for anaerobic or microaerobic metabolism, including the types of the genes found in this cluster, are controlled by a Crp/Fnr family TF, FixK₂ (14, 33), which is regulated by the FixLJ two-component system. It is likely that R. palustris employs a regulatory circuit similar to the *B. japonicum* FixLJ-FixK₂ cascade and that this cluster corresponds to the R. palustris FixK₂ regulon. This assertion is supported by the presence of an intact FixLJ twocomponent system in R. palustris. In addition, when the E. coli Fnr protein sequence is used to search the R. palustris proteome, $FixK_2$ is returned as the top hit and shows 68% identity in the helix-turn-helix region, supporting the observed similarity in binding sites. The presence of three TFs in the cluster (rpa2339, rpa1015, and rpa1090) may thus indicate the exis-

ID^a, TF^b	ABR ^c	Logo ^d	Cluster ^e	Dscan ^{e,f}
E627 OhrR	20.00		rpa0828 rpa4101-03 ³ ohr rpa0792-90 ³ /0793	none
E623 FixK ₂	12.65		rpa4238-36 ³ rpa4502 ccoNOQP ⁴ hemO rpa1220 rpa2160	rpa3501 rpa1672/1673 rpa2338-ctpC ⁶ /2339 cycH rpa1014/1015 rpa1090 rpa3622 rpa1504-02 ³ /1505-bchD ³ rpa0746 rpa1219/1220 kup1
E592 NnrR	7.78		norCB ² norE rpa1454 ²	rpa2059/nosR-rpa2067 ⁸ rpa1223/iorA
E602 PpsR	10.52	LITCA. IX. ITGACA	bchCXYZ ⁴ bchEJ hemN ³ bchF-hemA ¹⁴ crtDC ² /crtEF ²	phyB4/pucB _e A _e ² crtIB ² pucB _d A _d /rpa3014 cbbY phnG-rpa0687 ⁹ /rpa0696
O529 NtrC	12.47	tic. da tra.ca	glnB nifR3-ntrC ³ /ispD cinA ²	$glnK_2 amtB_2^2$
O740 FlbD	10.90		sigE/rpa0638 flgD-flgL ⁶ flhA rpa3888-86 ³ flgI-rpa3911 ³ /rpa3908 fliF-flbD ⁵ rpa1026/1027	None
N396 LexA	13.63	GAACA.	rpa4726 lexA recA rpa0053	ssb/rpa2815 rpa3088/RadA rpa2532 rpa1032/1033 rpa0620/def
N401 sigma ⁵⁴	9.92	LICCAELEE IT LICET	anfHDGK ⁴ hup S LC ³ rpa1305-04 ²	$glnK_2 amtB_2^2$ vnfH

TABLE 2. Selected clusters of phylogenetically footprinted motifs

^a ID, cluster identifier.
 ^b Predicted TF.
 ^c ABR, average Bayes ratio.
 ^d Cluster logo.
 ^e Divergently transcribed genes and operons are separated by a slash. Operons are shown as follows. A dash indicates an inclusive range of gene names. Large operons are denoted as a range between the first and last genes. A superscript indicates the number of genes in each operon.
 ^f Additional members of the regulon found by Dscan.



FIG. 2. Flowchart of phylogenetic footprinting, clustering, and scanning. The phylogenetic-footprinting procedure is shown above the dashed line, and the clustering procedure is shown below. Input data and intermediate data sets are shown in boxes. Operations are shown in rounded boxes.

tence of downstream regulatory circuits and possible interconnections with other pathways.

Another Crp/Fnr family TF in *B. japonicum*, NnrR, is regulated as part of the FixLJ-FixK₂ cascade and controls genes involved in response to nitric oxide and related free radicals (31). Predicted motifs upstream of the nitric oxide-regulated *norCB* and *norE-rpa1454* operons formed a separate cluster (Even-592), with an average Bayes ratio of 7.779, and are likely regulated by NnrR. This nitric oxide regulatory cluster was used as a model for Dscan, detecting the *nosRZDFYLX-rpa2067* operon that is involved in nitric oxide uptake. The fact that FixK₂ and NnrR are closely related members of the same TF family is reflected by the high degree of similarity between their binding site consensus sequences (Table 2).

PpsR cluster. Cluster Even-602 is made up of genes involved in pigment synthesis and photocenter assembly. When the cross-species motif was used as a model for Dscan, several additional motif sites were predicted, including sites upstream of two LH₂ complexes ($pucB_eA_e$ and $pucB_dA_d$) and an additional pigment synthesis gene, *crtI*. One interesting member of the expanded regulon is *cbbY*, which encodes a haloacid dehalogenase-like hydrolase thought to be involved in the Calvin-Benson-Bassham cycle (15). However, statistically significant sites were not found upstream of any additional genes of the Calvin-Benson-Bassham cycle.

Transcription of the photosynthetic genes in *R. sphaeroides* (37) and in the unusual photosynthetic *Bradyrhizobium* sp. strain ORS278 (16, 23) is controlled by the product(s) of the *ppsR* gene(s). Both *R. palustris* and *Bradyrhizobium* sp. strain ORS278 have two forms of PpsR (encoded by *ppsR*₁ and *ppsR*₂), while *R. sphaeroides* has only one (encoded by *ppsR*). The binding site consensus for PpsR from *R. sphaeroides* 2.4.1 and *Rhodobacter capsulatus* (3), TGT-N₁₀-ACA, matches the sequence logo for this cluster, suggesting that one (or both) of the *R. palustris* PpsR isoforms is likely the cognate TF for this regulon.

NtrC cluster. Cluster Odd-529 is made up of two nitrogenregulated genes, glnB and $nifR_3$. The motifs upstream of these two genes are present in all eight species, indicating that they are part of a regulatory circuit that is highly conserved among the α -proteobacteria. The glnB gene encodes a P_{II} nitrogenregulatory protein and is located upstream of the glutamine synthase gene, glnA. The $nifR_3$ gene forms an operon with ntrBC, which encodes a two-component system. When the cluster model was used to scan the complete set of *R. palustris* intergenic regions, an additional site was found upstream of a second P_{II} nitrogen regulatory gene, $glnK_2$.

Given that the TF NtrC is a member of this regulon (in the $nifR_3$ -ntrBC operon), it was an obvious candidate for the cognate, autoregulatory TF. There are three lines of evidence that support this hypothesis. The first is that NtrC sites have been found in the promoters of both glnB and $nifR_3$ in R. capsulatus (4). Secondly, two closely spaced copies of the NtrC site are found by Dscan in the promoters of glnB, $nifR_3$, and $glnK_2$; this tandem arrangement is a feature of NtrC-regulated promoters, which are cooperatively bound by NtrC octamers (25, 40). Finally, when DNase I-footprinted NtrC sites from R. capsulatus (4, 27) are aligned, the resulting sequences have a pattern similar to that shown in Table 2 for this cluster, specifically, conserved GC pairs separated by an 11-bp AT-rich region.

		В
OhrR	LDNQL C FALYS	ohrR ohr
RPA0828	LETQL C FALYS	
RPA4102	LDRQV C FLLYA	
BLR0736	LDNQI C FAVYS	
BRA0886	LADMLCFAVYS	
?	LDHAL C FAIYS	
	OhrR RPA0828 RPA4102 BLR0736 BRA0886 ?	OhrR LDNQLCFALYS RPA0828 LETQLCFALYS RPA4102 LDRQVCFLLYA BLR0736 LDNQLCFAVYS BRA0886 LADMLCFAVYS ? LDHALCFAIYS

FIG. 3. Partial alignment of OhrR orthologs. (A) Alignment of the region surrounding the oxidation-sensitive cysteine residue (in boldface) from *X. campestris* OhrR and its orthologs. Gene names are noted except in the case of the ortholog from *H. neptunium*, as this species' genome is not yet annotated. (B) Arrangement of the *ohr* (black arrows) and *ohrR* (dark-gray arrows) orthologs for the corresponding species in panel A. Motifs found upstream of genes are shown as hatched boxes.

FlbD cluster. Cluster Odd-740 is made up of motifs associated with flagellar synthesis genes, as well as a putative adenine methyltransferase. Since DNA methylation and flagellar assembly are both regulated in a cell-cycle dependent manner in C. crescentus (28), it seemed likely that RPA1026 (the adenine methyltransferase) could have a cell cycle-regulatory function. In fact, a BLAST search identified rpa1026 as an ortholog of ccrMI, the cell cycle methylase of C. crescentus. The ccrM gene is widely distributed among the α -proteobacteria and has been shown to be essential for the viability of C. crescentus (45). Orthology with ccrMI and membership in the flagellar cluster, combined with evidence that ccrMI is under the control of a class II flagellar promoter in C. crescentus (46), support the hypothesis that RPA1026 is part of the flagellar cluster and has a cell cycleregulatory function. The likely cognate TF for this cluster is FlbD, which is encoded in the fliFG-rpa1266-fliY-flbD operon and is known to be a negative regulator of its own transcription. In addition, the *fliF* motif found by phylogenetic footprinting and included in this cluster, contains a C. crescentus site (GGTAAA TCCTGCC) that has been shown to be bound by FlbD (32).

LexA cluster. Cluster NonP-396 contains motifs upstream of both *recA* and *lexA* from seven of the eight species used for phylogenetic footprinting. These genes encode proteins involved in the SOS pathway for repairing DNA damage (52). When we used this cluster motif as a model to scan the entire set of *R. palustris* intergenic regions, we identified five additional statistically significant sites, including sites upstream of *ssb* and *RadA*, which are also involved in responding to DNA damage. The sequence logo for this cluster matches the previously reported nonpalindromic LexA binding motif described for *R. palustris* and other α -proteobacteria (9, 13).

Sigma⁵⁴ cluster. Cluster NonP-401 is made up primarily of motifs occurring upstream of genes involved in nitrogen and hydrogen metabolism. The *anfHDGK* operon encodes the alternate nitrogenase, and the *hupSLC* operon encodes a hydrogenase. When this cluster motif was used as a model for Dscan, a significant site was found upstream of *vnfH*, which encodes a vanadium-dependent nitrogenase subunit. Since the predicted regulon included subunits for two of the three *R. palustris* nitrogenases, as well as a nitrogen-regulatory protein (*glnK*₂), we compared the logo for the cluster with the motifs for known nitrogen regulators. The results

suggest that this motif is bound by the alternative sigma factor σ^{54} , which is known to regulate many genes involved in nitrogen assimilation and metabolism (54).

A novel inverted repeat. Two high-scoring (by the Bayes ratio criterion) Even clusters had a strongly conserved central CCGG sequence and were composed largely of motifs consisting of sites from only R. palustris and B. japonicum (Fig. 4). When used in Dscan, both of the cluster models identified dozens of intergenic regions in R. palustris with significant matches. Examination of the sequences in these clusters revealed that they were part of a conserved inverted repeat of the form ATTCCGGG-N₁₀₋₅₂-CCCGGAAT. The 8-bp ends are identical in all copies of the repeat and are separated by an unconserved, but typically palindromic, region of variable length. The genome sequence of R. palustris was analyzed using simple pattern matching for occurrences of this repeat pattern. Repeats were found almost exclusively in intergenic regions at the 3' ends of gene sequences. Specifically, these repeats were found with high frequency in intergenic regions between genes transcribed in the same direction (n = 124; 69 intergenic regions) and intergenic regions between convergently transcribed genes (n = 107; 63 intergenic regions) but occurred rarely in intergenic regions separating divergently transcribed genes (n = 5) or in coding regions (n = 7). The other species in this study were analyzed for the presence of the repeats. The B. japonicum genome was found to have a similar density of this repeat, with a similar preference for intergenic regions at the 3' ends of genes. The other six species do not carry any copies of this repeat, consistent with our observation that these species did not contribute to the motifs making up the clusters represented in Fig. 4A.

The composition of the *R. palustris* repeat was examined in greater detail. The length of the region separating the 8-bp bounding sequences varied from 10 to 52 bases; however, the distribution of lengths was not uniform. Total repeat lengths of 32 bases, 36 bases, and 37 bases were the most common, accounting for 71% of the repeats. The central variable regions were analyzed using the palindrome tool from EMBOSS (39); 89% of the sequences were found to be palindromic. Randomized data were also analyzed, and fewer than 10% of these sequences were found to be palindromic when the same methodology was used. Thus, conservation of the central region may



FIG. 4. Features of an *R. palustris* inverted repeat. (A) Two sequence logos (41) from clusters composed primarily of inverted repeats. (B) Aligned examples of repeats that are 32, 36, and 37 bp in total length from *R. palustris* intergenic regions. Gene names refer to the flanking genes. Internal palindromic regions are shown in gray boxes (exceptions are in lowercase). The CCGG sequence contributing to the central region of the logos in panel A is found in the flanking inverted repeats. (C) Predicted secondary structures (lowest free energy and most probable) for four repeats having different total lengths. The first three structures correspond to *R. palustris* sequences labeled in panel B. The fourth structure is an example of one of the largest repeat sequences (68 bp) detected. All structures were inferred using Sfold (6).

be based on secondary structure (i.e., hairpin formation) rather than primary sequence. This is supported by the observation that many of the repeats examined are predicted to fold into a stemloop structure composed of a perfectly conserved 8-bp helix, followed by a bulge and then a variable-sequence hairpin (Fig. 4C).

DISCUSSION

In the present work, we have described a cross-species analysis of transcription regulation in *R. palustris*. In previous phylogenetic-footprinting studies, using *E. coli* as the reference species and several additional γ -proteobacteria, we were able to compare our findings to a large number of DNase I-footprinted TFBSs from the literature (29, 30). Since little information is available regarding experimentally identified TFBSs in *R. palustris*, we focused on clustering the motifs to infer regulons, rather than investigating motifs individually. When the γ -proteobacterial phylogenetic-footprinting data were clustered (38), the majority of clusters with an average Bayes ratio of ≥ 8 were identified as regulons that had been described in the literature. Among 101 R. palustris clusters, 63 had an average Bayes ratio of ≥ 8 . The clustering results described here, however, differ from the γ -proteobacterial results in that we chose motifs for clustering using a liberal cutoff for statistical significance (P < 0.2), instead of the more stringent cutoff (P <0.05) used previously (38), and allowed the clustering algorithm to identify those motifs that reproducibly formed clusters instead of identifying a single near-optimal clustering solution. Although the two studies are not directly comparable, we expect that many of the 63 high-scoring (average Bayes ratio, \geq 8) clusters from this study merit investigation. All 101 reproducible clusters, as well as the individual motifs with their associated statistical significances, are available at http://bayesweb.wadsworth.org/prokreg.html.

The comparative-genomics approach. Some caveats associated with phylogenetic-footprinting approaches should be considered, particularly when choosing targets for experimental validation. During either phylogenetic footprinting or scanning of intergenic regions for additional regulon members, TFBSs may be predicted between divergently transcribed genes. Frequently, it is not possible to determine which of the divergently transcribed genes is regulated by the TFBS(s). This is the case during phylogenetic footprinting, when synteny of the two genes in question is conserved among several of the species included in the data set. In addition, when intergenic regions of *R. palustris* are scanned, the identity of the regulated gene(s) cannot be inferred. In cases where the identity of the regulated gene is unclear, both divergently transcribed genes were listed in Table 2. Another current limitation of the phylogeneticfootprinting approach used here is that it does not reliably detect riboswitches or attenuators; the implications of this are discussed below, in the context of the methionine biosynthesis genes. Finally, phylogenetic footprinting addresses only the regulation of genes that have an ortholog in at least one of the other species, have a similar operon structure, and are regulated by a TF found in at least one of the other species.

Rather than focus on individual motifs from phylogenetic footprinting, we clustered the footprinted motifs into putative regulons. This allowed us to make inferences about their regulatory roles. In addition, putative regulons were expanded by scanning *R. palustris* intergenic regions. The results presented in this report highlight three advantages of this approach: (i) the ability to make *cis-trans* connections, (ii) the ability to discriminate between members of a TF family, and (iii) the ability to make predictions in the absence of prior information.

Tan et al. (47) have shown that the presence of autoregulatory sites in the promoters of TFs provides key information to link a particular motif to its cognate TF (i.e., *cis-trans* connections). In addition, a network analysis of *E. coli* transcription regulation has shown that ~50% of TFs are autoregulated (42). In the clusters described in Results, four of the eight contained sites upstream of the likely cognate TF (RPA0828/ RPA4102, NtrC, FlbD, and LexA). While there is evidence in the literature of autoregulatory sites for NtrC, FlbD, and LexA among the α -proteobacteria, the connection between RPA0828/RPA4102 and the organic hydroperoxide resistance gene cluster was made de novo by phylogenetic footprinting and clustering.

The *R. palustris* genome is predicted to encode 15 Crp/Fnr family TFs (24). Some of these family members likely bind to similar TFBSs due to homology in their DNA-binding domains. It was therefore possible that motif clustering could produce "mixed" regulons containing motifs upstream of genes regulated by two or more closely related TFs. It was known from clustering *E. coli* motifs (38) that the BMC algorithm could correctly separate motifs bound by Crp and Fnr, which have similar binding site consensus sequences. In this study, the separation of FixK₂- and NnrR-regulated genes into distinct clusters further demonstrates the ability of the BMC algorithm to detect subtle differences between motifs. Nevertheless, we cannot exclude the possibility that some of our clusters may be mixed regulons.

An advantage of phylogenetic footprinting is that no prior knowledge of the regulatory network is required. This is useful, since regulatory-network information from other species can, in some cases, be misleading. For instance, the motifs that make up the *R. palustris* LexA cluster identified in this study are upstream of genes likely involved in the SOS response (*lexA*, *recA*, and *ssb*), as they are in *E. coli*. However, the LexA binding motif identified here, de novo, is distinct from that of *E. coli*. Specifically, in the α -proteobacteria, LexA binds to a completely different site (GTTC-N₇-GTTC) than that of the γ -proteobacteria (CTG-N₁₀-CAG) (13).

We also detected a novel repeat element in *R. palustris* and *B. japonicum* with features reminiscent of both a transcriptional terminator and a mobile DNA element. Specifically, the repeat occurs preferentially at the 3' ends of gene sequences, suggesting a role in terminating transcription, but also has perfectly conserved flanking sequences like those observed for mobile DNA elements (e.g., a transposon). Given the nonuniform distribution of the repeat in the *R. palustris* genome, we hypothesize that it may be involved in a novel type of transcription termination or perhaps mRNA stability.

Regulation in the α -proteobacteria compared to the γ -proteobacteria. Our results illustrate some differences in transcription regulation between the γ -proteobacteria and α -proteobacteria. For example, there were a number of regulons that we might have expected to detect, based on our previous experience with phylogenetic footprinting and clustering in the γ -proteobacteria and a general knowledge of prokaryotic gene regulation. However, important amino acid biosynthetic regulatory clusters, such as those for methionine, tyrosine, and tryptophan, were noticeably absent. In fact, orthologs of the *E. coli* TFs that regulate these pathways (*metJ*, *tyrR*, and *trpR*) are missing in R. palustris, despite the presence of complete metabolic pathways for the synthesis of these amino acids. Because the motif predictions described here were made based on sequence conservation alone, our cross-species method does not require any similarity between the E. coli and R. palustris regulatory networks. However, it is instructive to consider how the transcriptional regulation of these pathways differs in these two species and why regulons, perhaps unique to the α -proteobacteria, were not predicted de novo by phylogenetic footprinting and clustering.

In E. coli, the metA, metC, metE, metF, and metJ genes are regulated by the TF MetJ. Orthologs of the methionine synthesis genes (metA, metC, metE, and metF) are present in R. palustris, but a metJ ortholog is not present. In addition, no common motif is found upstream of the four biosynthesis genes, as would be expected if a single TF regulated them. The *metE* gene, however, has eight predicted sites that are conserved across four of the species in our study. Similarly, metF has seven distinct sites predicted that are conserved across seven or eight species and that cover 142 bp of the 410 bp in the R. palustris metF intergenic region. These data indicate extensive regions of conservation in the upstream regions of these genes, beyond that which might be expected for straightforward TF-mediated regulation. We found that seven of the eight sites upstream of metE in R. palustris overlap a predicted riboswitch for cobalamine (Rfam) (19). A riboswitch has not been predicted upstream of metF; however, given the limited data available for the prediction of riboswitches, this is perhaps not surprising. These data indicate that the R. palustris methionine biosynthesis pathway may be at least partially controlled

by riboswitches, as it is in *Bacillus subtilis* (11, 53), highlighting the need to extend the phylogenetic-footprinting technique to more efficiently detect riboswitches.

In E. coli, aromatic amino acid biosynthesis is coordinated by TrpR and TyrR. The trpLEDCBA operon encodes proteins involved in tryptophan biosynthesis and is regulated by the TF TrpR and by attenuation. The orthologous genes in R. palustris are separated into three operons: trpG (a trpE ortholog), rpa2889-trpDC-maoC-rpa2893, and trpFBA. Few motifs were found cross-species for these operons, and no motifs were found when the three upstream regions from R. palustris alone were analyzed (data not shown). Similarly, genes encoding the proteins of the tyrosine biosynthesis pathway had few motifs predicted cross-species. The absence of TrpR and TyrR orthologs, as well as the lack of unique motif predictions in the intergenic regions controlling the tryptophan and tyrosine biosynthesis pathways, suggests that the regulation of these pathways has diverged from the E. coli paradigm and may not depend on a classical TF-mediated mechanism.

Conclusions. The emphasis of this work was on improving our understanding of R. palustris biology. Specifically, we sought to describe the regulatory network of this metabolically versatile species and to make functional predictions that will be of use to the R. palustris research community. This paper provides a description of the most striking patterns that emerged from our genome scale study. From a molecular-biology perspective, many of the predictions made in this study lead directly to hypotheses which can be tested experimentally. For example, interruption of rpa0828 and rpa4102, the putative ohrR orthologs, is predicted to result in constitutive expression of the organic hydroperoxide resistance genes. Interruption of rpa1026, the ccrM ortholog, is likely to have strong effects on cell cycle control and could even be a lethal mutation, as it is in C. crescentus. Our results suggest that the inverted repeat described in this study serves a regulatory role that may involve a stem-loop structure; the first step in investigating this hypothesis is to determine whether the repeat is transcribed, perhaps using nucleic acid hybridization. From a computational-biology perspective, this work demonstrates the applicability of our methods to nonmodel organisms; it illustrates the importance of not only developing computational methods, but also applying them to pertinent bacterial species.

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