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# Identification of a bacterial regulatory system for ribonucleotide reductases by phylogenetic profiling

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**Using comparative genomics approaches, we analyzed the regulation of ribonucleotide reductase genes in bacterial genomes. A highly conserved palindromic signal with consensus acaCwAtATaTwGtg, named NrdR-box, was identified upstream of most operons encoding ribonucleotide reductases from three different classes. By correlating the occurrence of NrdR-boxes with phylogenetic distribution of ortholog families, we identified a transcriptional regulator containing Zn-ribbon and ATP-cone motifs (COG1327) for the predicted ribonucleotide reductase regulon. Further characterization of the regulon and metabolic reconstruction of the regulated pathways demonstrated its functional link to replication. The method of simultaneous phylogenetic profiling of genes and conserved regulatory signals introduced in this study could be used to identify transcriptional factors regulating orphan regulons.**

## Introduction

The rapidly increasing number of sequenced genomes provides challenges and opportunities for comparison of

the whole proteomes, metabolic pathways and regulatory networks [1–3]. Functionally related genes tend to be clustered on the chromosome and to have similar patterns of occurrences in genomes [4,5]. The last assumption could be used to predict functional coupling for a pair of genes on the basis of their phylogenetic co-occurrence profiles. A modification of this approach, establishing a connection between genes and phenotypes, was used to detect potential genomic determinants of hyperthermophily [6]. In this article, we used phylogenetic profiling – correlation of genes and transcriptional regulatory elements – to identify a candidate regulator for the novel ribonucleotide reductase regulon NrdR.

Ribonucleotide reductases (RNRs) catalyze the reduction of all four ribonucleotides to the corresponding deoxyribonucleotides and are essential for the DNA synthesis [7]. There are three main types of RNRs: (i) aerobic enzymes present in prokaryotes and eukaryotes (distantly related classes Ia and Ib, represented by NrdAB and NrdEF proteins from *Escherichia coli*, respectively); (ii) bacterial and archaeal B<sub>12</sub>-dependent enzymes homologous to NrdA and NrdE proteins (class II, NrdJ); and (iii) anaerobic enzymes (class III, NrdDG) [8]. In *E. coli*, the cell-cycle regulated *nrdAB* operon is activated by the

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DnaA, Fis and IciA transcription factors [9–10], and the anaerobically induced *nrdDG* operon is activated by Fnr [11]. Induction by hydroxyurea, an inhibitor of class I RNRs, was described for *nrd* operons in various species [12–15], suggesting upregulation of RNRs under conditions of deoxyribonucleotide starvation, although the molecular mechanism of this control was not known. Some indication of the involvement of a possible transcriptional regulator, *orfR*, was published by Torrents *et al.* [16]. Conserved consensus sequences were identified upstream of *nrd* operons in *Staphylococcus aureus* [12,17], *E. coli*, *Salmonella typhimurium* [18], and in *Streptomyces* spp. (GenBank accession nos AJ586904, AJ586905). However, the functional meaning of these sites is uncertain and no corresponding regulatory factors for the RNR genes are known. We have applied comparative genomics techniques (see the supplementary material online) to: (i) determine universal regulatory signals; (ii) identify transcription factors; (iii) describe the mode of regulation; and (iv) identify additional members of the RNR regulon.

### Identification of NrdR-box

Analysis of upstream regions of *nrd* operons in various taxonomic groups enabled us to identify a highly conserved signal, named NrdR-box (for *nrd* Regulation), with minor taxon-specific deviations from the common consensus signal *acaCwAtATaTwGtgt* (Table 1). The construction of the recognition signal and our search for new regulon members are described in the supplementary material online. As result, we identified candidate NrdR-boxes upstream of all *nrd* genes in most genomes and upstream of only some *nrd* genes in a minority of genomes (for more details, see Tables S1 and S2 in the supplementary material online). In several genomes and taxonomic groups, additional members of the NrdR regulon that are involved in replication or deoxynucleotide salvage were identified (Table S1 in the supplementary material online). However, in some bacterial genomes and in all archaea and eukaryotes, no signal was observed. NrdR-boxes are highly conserved in upstream regions of RNRs from closely related species (Figures S1–S3 in supplementary material). Interestingly, NrdR-boxes occur in tandem in most cases (single NrdR-boxes were observed only in 27 of 243 operons), so that the distance between the centers of palindromes equals an integer number of DNA turns (21 bp, 31–32 bp or 41–42 bp). The presence of multiple regulatory sites at a specific distance ensures cooperative binding of NrdR molecules to DNA. All of the known promoters of NrdR-regulated genes overlapped with predicted NrdR-boxes, making it possible to predict that NrdR is a repressor (supplementary material online).

Conservation of the signal suggested the existence of a universal regulatory mechanism. The palindromic structure of the NrdR-box and its size are characteristic of many prokaryotic transcription factors. In an attempt to identify the transcription factor, we analyzed the clusters of orthologous groups of proteins (COGs) [19] using as a query a compiled phylogenetic profile with two categories of bacterial genomes, those with and those without the predicted NrdR-boxes. We used an extended phylogenetic pattern search tool that enabled identification of COGs

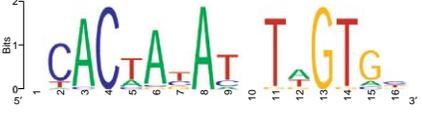
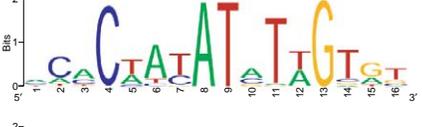
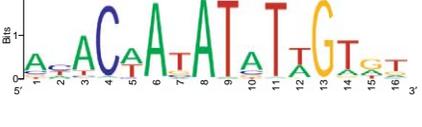
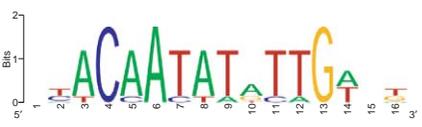
that contain or exclude selected organisms ([http://web.dmz.uni-wh.de/projects/protein\\_chemistry/epps/](http://web.dmz.uni-wh.de/projects/protein_chemistry/epps/)) [20]. The exact pattern search among 63 genomes identified only one COG, COG1327, that was present in most bacteria but absent in archaea and eukaryotes. COG1327 was not found in the available genomes of the *Bacteroidetes/Chlorobi* group or in  $\epsilon$ -proteobacteria, nor in *Aquifex aeolicus*, which constitutes a single-genome lineage. Among most other taxonomic groups, COG1327 showed a mosaic distribution (Table 1, supplementary material online).

COG1327, represented by hypothetical proteins *ybaD* from *E. coli* and *ytcG* from *Bacillus subtilis*, is annotated as ‘predicted transcriptional regulator consisting of Zn-ribbon and ATP-cone domains’ [19]. At most one member of this COG is present in any genome. Metal-binding Zn-ribbons consist of four conserved cysteines and participate in DNA or RNA binding in many different proteins including transcriptional factors [21]. The ATP-cone is an ATP-binding regulatory domain [22] that could be involved in sensing of deoxyribonucleotides to induce the DNA-binding activity of the Zn-ribbon domain of COG1327. We have tentatively re-named this protein NrdR.

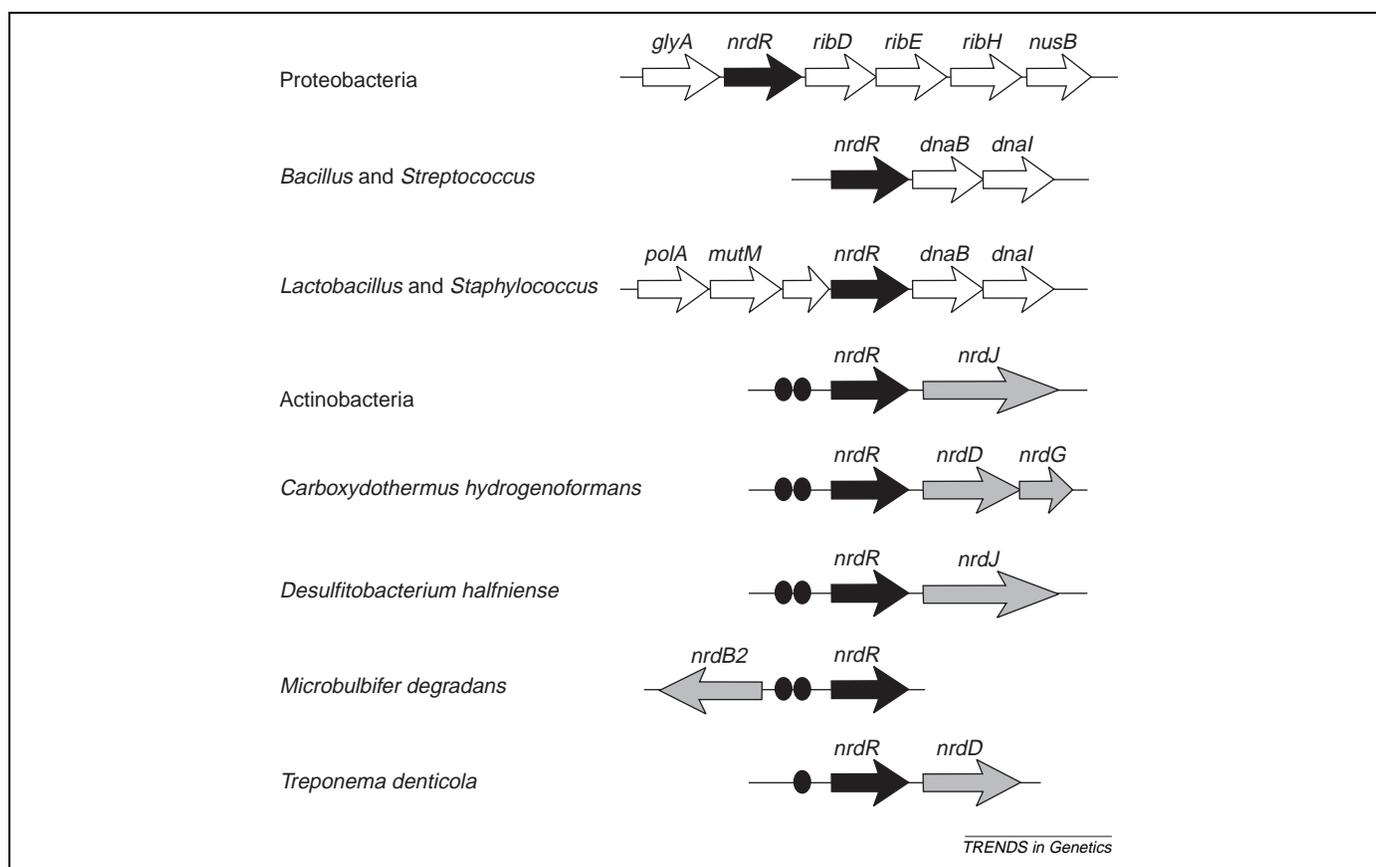
We supplemented this analysis by considering the NrdR occurrence in taxonomic groups with mosaic distribution of NrdR-boxes (Table 1). Among  $\alpha$ - and  $\gamma$ -proteobacteria, both NrdR-boxes and the *nrdR* genes were absent only in obligate intracellular parasites and endosymbionts *Rickettsia*, *Wolbachia*, *Buchnera* and *Wigglesworthia*. Both NrdR-boxes and *nrdR* were not found in two  $\delta$ -proteobacteria (*Desulfovibrio* spp.), one cyanobacteria (*Nostoc* sp.) or two lactobacilli (*Oenococcus oeni* and *Leuconostoc mesenteroides*) in the *Bacillus/Clostridium* group. By contrast, among four sequenced spirochetes, only *Treponema denticola* has the *nrdR* gene and a candidate NrdR-box, which are both located upstream of the ribonucleotide reductase *nrdD*. For a control, we applied all of the constructed NrdR-box profiles with low thresholds to the genomes without *nrdR*, and found no candidate sites upstream of *nrd* genes. Finally, we analyzed upstream regions of the *nrd* genes in taxonomic groups without *nrdR*, and found no conserved signals that could serve as variant NrdR-boxes.

This functional assignment of COG1327 is corroborated by another comparative genomic technique: analysis of gene neighborhoods. It is well known that transcriptional factors often directly regulate adjacent genes on the chromosome [23]. Indeed, in many microbial genomes, the *nrdR* genes are clustered with ribonucleotide reductase genes or with those that are involved in the chromosome replication, for example, *dnaB*, *dnaI*, *polA* (Figure 1). In  $\gamma$ -proteobacteria, experimental and predicted binding sites for the main regulator of replication, DnaA, precede RNR genes. In some studies, *ybaD* (COG1327) was predicted to be the regulator of riboflavin biosynthesis [24,25] and named *ribX*. Indeed, in proteobacteria, *ybaD* is often clustered with the riboflavin biosynthesis *rib* genes, the glycine metabolism gene *glyA* and the transcription antitermination factor *nusB* (Figure 1). However, no candidate binding sites were found upstream of these operons and, therefore, the link

Table 1. The NrdR regulons in bacteria

Taxonomic group of bacteria	Sequence logo of NrdR-boxes	Distribution of NrdR <sup>a</sup>	Distribution of <i>nrdR</i> genes and NrdR-boxes in bacterial genomes	Other candidate regulon members
Actinobacteria		+	Present in all actinobacteria	None
$\alpha$ -proteobacteria		$\pm$	Present in all $\alpha$ -proteobacteria, except <i>Wolbachia</i> and <i>Rickettsia</i> spp.	None
$\beta$ -proteobacteria		+	Present in all $\beta$ -proteobacteria	None
$\gamma$ -proteobacteria		$\pm$	Present in all $\gamma$ -proteobacteria, except <i>Buchnera</i> and <i>Wigglesworthia</i> spp.	<i>topA</i> (DNA topoisomerase I) in <i>Pseudomonas</i> spp.; <i>dnaA</i> (replication initiator) in <i>Shewanella</i> spp.
$\delta$ -proteobacteria		$\pm$	Present in all $\delta$ -proteobacteria, except <i>Desulfovibrio</i> spp.	<i>dnaA</i> (replication initiator) in <i>Myxococcus xanthus</i> , <i>Desulfotalea psychrophila</i> ; <i>COG1192</i> (chromosome partitioning) in <i>Desulfuromonas</i> spp.
<i>Bacillus</i> / <i>Clostridium</i> group		$\pm$	Present in all <i>Bacillus</i> / <i>Clostridium</i> group members, except <i>Leuconostoc mesenteroides</i> and <i>Oenococcus oeni</i>	<i>dgk-pnuC</i> (dNTP salvage) in lactobacilli; <i>nucA</i> (nucleotidase) in <i>Lactococcus lactis</i> ; <i>yvdD-yvdC</i> (unknown function) in <i>Bacillus</i> spp.; <i>ligA</i> (DNA ligase) in <i>Clostridium acetobutylicum</i>
Thermotogales		+	Present in all thermotogales	None
<i>Thermus</i> / <i>Deinococcus</i> group		+	Present in all <i>Thermus</i> / <i>Deinococcus</i> group	<i>DR1775</i> (DNA helicase II) in <i>Deinococcus radiodurans</i>
Chlamydiales		+	Present in all chlamydiales	None
Cyanobacteria		$\pm$	Present in all cyanobacteria, except <i>Nostoc</i> sp.	None
$\epsilon$ -proteobacteria	n/a	-	Absent in $\epsilon$ -proteobacteria	None
<i>Bacteroidetes</i> / <i>Chlorobi</i> group	n/a	-	Absent in all members of the <i>Bacteroidetes</i> / <i>Chlorobi</i> group	None
Mycoplasmatales	n/a	-	Absent in mycoplasmatales	None
Spirochaetes	n/a	$\pm$	Present only in <i>Treponema denticola</i>	None
Other	Diverse	$\pm$	Present in <i>Pirellula</i> sp., <i>Chloroflexus aurantiacus</i> and <i>Fusobacterium nucleatum</i> , but absent in <i>Aquifex aeolicus</i>	None

<sup>a</sup>The presence, absence or mosaic distribution of NrdR boxes is indicated by +, - or  $\pm$ , respectively.



TRENDS in Genetics

**Figure 1.** Genomic organization of the *nrdR*-containing loci in some bacterial genomes. Genes encoding the predicted ribonucleotide reductase regulator NrdR and the ribonucleotide reductase components are shown in black and grey, respectively. The black circles indicate the predicted NrdR-sites. The direction of transcription is indicated by the arrows.

between NrdR and riboflavin biosynthesis remains unexplained.

### Concluding remarks

Thus, we have tentatively characterized the regulation of ribonucleotide reductases in bacteria using comparative genomic analysis. A combination of various techniques, such as phylogenetic profiling of genes and regulatory signals, phylogenetic footprinting of regulatory sites and positional gene clustering, enabled us to produce a detailed description of a regulatory system that is almost completely uncharacterized experimentally. We assigned the role of regulator of RNR genes in most bacterial genomes to NrdR (COG1327), and identified its universal DNA-binding signal, which occurs mostly in tandems suggesting co-operative binding, and we predicted that NrdR acts as a repressor by phylogenetic footprinting of NrdR-sites and of known promoters. We identified new members of the NrdR regulon involved in deoxynucleotide metabolism and replication, and thus characterized the functional role of NrdR in bacteria.

Our analysis shows that a combination of the diverse techniques used in comparative genomics analysis, such as phylogenetic profiling, positional clustering and phylogenetic footprinting, enables a detailed description of a system that is little studied experimentally, whereas relying on any single type of evidence might be somewhat misleading. Indeed, while this study was being completed, Borovok and colleagues showed that NrdR was a

transcriptional regulator of class Ia and class II RNR genes in *Streptomyces* [26]. Finally, the suggested modification of phylogenetic profiling based on the co-occurrence of regulatory motifs and genes seems to be useful for the analysis of unknown regulatory proteins, although it has obvious limitations, because it requires some conservation (or at least tractable evolution) of the signal and is not immediately applicable to the analysis of large regulator families where it is not possible to resolve orthology relationships.

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### Supplementary data

Supplementary data associated with this article can be found at [doi:10.1016/j.tig.2005.05.011](https://doi.org/10.1016/j.tig.2005.05.011)

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Letter

## Assessing the signatures of selection in *PRNP* from polymorphism data: results support Kreitman and Di Rienzo's opinion

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Kreitman and Di Rienzo [1] highlighted an important issue in the analysis of polymorphism data and in the detection of the footprint of natural selection. In their article, they discussed the ascertainment bias that can be introduced in neutrality tests when genotyping large samples after an initial partial ascertainment of variation, by the sequencing of a limited number of chromosomes, implying that low-frequency variants are excluded from the analysis (see Ref. [2] and references therein). This could have a strong impact in the field of evolutionary genetics because numerous studies based on single

nucleotide polymorphism (SNP) data are being produced with previously known SNPs, and detecting selection in the human genome is usually performed with neutrality tests based on the allele-frequency spectrum.

### The balancing-selection hypothesis

Ascertainment bias was suggested in a study by Mead *et al.* [3], who proposed that balancing selection was the mechanism that maintained a polymorphism in the gene encoding the human prion protein (*PRNP*; GenBank accession no. M13899) in codon 129 (M129V). Mead *et al.* [3] argued that repeated episodes of endocannibalism in ancient human populations could have produced the

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