# Research Article

# Genome Signature Difference between *Deinococcus radiodurans* and *Thermus thermophilus*

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The extremely radioresistant bacteria of the genus *Deinococcus* and the extremely thermophilic bacteria of the genus *Thermus* belong to a common taxonomic group. Considering the distinct living environments of *Deinococcus* and *Thermus*, different genes would have been acquired through horizontal gene transfer after their divergence from a common ancestor. Their guanine-cytosine (GC) contents are similar; however, we hypothesized that their genomic signatures would be different. Our findings indicated that the genomes of *Deinococcus radiodurans* and *Thermus thermophilus* have different tetranucleotide frequencies. This analysis showed that the genome signature of *D. radiodurans* is most similar to that of *Pseudomonas aeruginosa*, whereas the genome signature of *T. thermophilus* is most similar to that of *Thermanaerovibrio acidaminovorans*. This difference in genome signatures may be related to the different evolutionary backgrounds of the 2 genera after their divergence from a common ancestor.

## 1. Introduction

In the present bacterial taxonomic system, the extremely radioresistant bacteria of the genus Deinococcus and the extremely thermophilic bacteria of the genus Thermus belong to a common lineage with remarkably different characteristics [1, 2]. Comparative genomic analyses have shown that after their divergence from a common ancestor, Deinococcus species seem to have acquired numerous genes from various other bacteria to survive different kinds of environmental stresses, whereas Thermus species have acquired genes from thermophilic archaea and bacteria to adapt to high-temperature environments [3]. For example, the aspartate kinase gene of Deinococcus radiodurans has a different evolutionary history from that of Thermus thermophilus [4]. In addition, D. radiodurans has several unique protein families [5] and genomic characters [6], and there is no genome-wide synteny between D. radiodurans and T. thermophilus [7]. However, phylogenetic analyses based on both orthologous protein sequence comparison

and gene content comparison have shown that the genomes of *Deinococcus* and *Thermus* are most closely related with each other [3, 8]. The trinucleotide usage correlations have been used to predict the functional similarity between two RecA orthologs of bacteria including *D. radiodurans* and *T. thermophilus* [9].

If the genes acquired through horizontal gene transfers are different between *Deinococcus* and *Thermus*, then the genomic base composition (GC content) and/or genome signature can be hypothesized to also be different between these 2 genera. However, the GC content of *D. radiodurans* (67%) is similar to that of *T. thermophilus* (69.4%). The genome signature, on the other hand, is a powerful basis for comparing different bacterial genomes [11–19].

Phylogenetic analyses based on genome signature comparison have been developed, and these analyses are useful for metagenomics studies [20]. It was reported that comparative study using the frequency of tetranucleotides is a powerful tool for the bacterial genome comparison [21]. In this study, we compared the relative frequencies



FIGURE 1: Neighbor-joining tree based on tetranucleotide sequence frequencies in 89 genomes. The frequencies for 89 bacteria were obtained from OligoWeb (oligonucleotide frequency search, http://insilico.ehu.es/oligoweb/). Each frequency vector consisted of 256 elements. The Euclidean distance between 2 vectors was calculated using the software package R (language and environment for statistical computing, http://www.R-project.org). On the basis of the distance matrix, a neighbor-joining tree was constructed using the MEGA software [10]. Numbers in parentheses indicate the GC content (percentage) of each genome sequence. Arrows indicate the positions of *Thermus thermophilus* and *Deinococcus radiodurans*.

 TABLE 1: Distance between *Deinococcus radiodurans* and each bacterium using correspondence analysis.

Bacterial species	Distance
Pseudomonas aeruginosa PO1	0.297932379
Myxococcus xanthus	0.305390764
Azorhizobium caulinodans	0.308895493
Ralstonia solanacearum	0.309212661
Gloeobacter violaceus	0.317496648
Symbiobacterium thermophilum	0.324422553
Thermomonospora curvata	0.347077134
Opitutus terrae	0.376683191
Acidobacterium capsulatum	0.378916616
Gemmatimonas aurantiaca	0.383939504
Rhodobacter sphaeroides 2.4.1	0.386383492
Rhodospirillum rubrum	0.392789705
Streptomyces griseus	0.415746597
Geobacter sulfurreducens	0.425877427
Agrobacterium tumefaciens	0.457788385
Thermomicrobium roseum	0.460897799
Syntrophobacter fumaroxidans	0.470005872
Sphingomonas wittichii	0.478630032
Desulfohalobium rethaense	0.50752939
Heliohacterium modesticaldum	0.512911658
Chloroflexus aurantiacus	0 53688488
Pirellula stalevi	0 540489386
Desulfatihacillum alkenivorans	0.618176651
Pelotomaculum thermopropionicum	0.636637282
Moorella thermoacetica	0.637983756
Yylella fastidiosa 925c	0.655118109
Fscherichia coli K-12 MG1655	0.671407958
Naissaria maningitidis MC58	0.679417806
Thermanagravibria acidaminovorans	0.079417000
Nitrosomonas auropaga ATCC 19718	0.718956013
Fibrohactor suscinogenes	0.773303007
Dehalosossaides ethenogenes	0.773595097
Vibrio cholarae N16961	0.793000040
Desulf to hastorium hafriance DCP 2	0.794400090
Therman thermothilus	0.023043007
Showanalla anaidansis	0.031109430
Alteration of the dist	0.04040937
Aneromonas macieoan	0.880228858
Thermohandum terrorum	0.009230030
Suntrath among a walfai	0.099243710
Syntrophomonas woljei	0.905/6094
Baculus subtilis	0.913613/19
Coprotnermobacter proteolyticus	0.925779955
Chiorodium chiorochromatii	0.926043337
Coxieua burnetii KSA 493	0.929681834
I nermotoga maritima	0.952651677
Bacteroides thetaiotaomicron	0.958944885
Denitrovibrio acetiphilus	0.966489936
Kosmotoga olearia	0.998958025
Carboxydothermus hydrogenoformans	1.012583789
Nostoc sp. PCC 7120	1.014447775
Aquitex aeolicus	1.03027576

TABLE 1: Continued.

Bacterial species	Distance
Chlamydia trachomatis D/UW-3/CX	1.041383827
Elusimicrobium minutum	1.06077929
Haemophilus influenzae Rd KW20	1.084974973
Veillonella parvula	1.10092918
Helicobacter pylori 26695	1.124775019
Cyanothece sp. ATCC 51142	1.126779861
Thermoanaerobacter tengcongensis	1.139238445
Halothermothrix orenii	1.149150516
Eubacterium eligens	1.164829099
Natranaerobius thermophilus	1.167863816
Prochlorococcus marinus CCMP1375	1.174664974
Fervidobacterium nodosum	1.195233916
Caldicellulosiruptor saccharolyticus	1.19880562
Caldicellulosiruptor bescii	1.199097055
Persephonella marina	1.209862481
Leptospira interrogans serovar lai 56601	1.221066506
Anaerococcus prevotii	1.224535688
Petrotoga mobilis	1.231307366
Thermodesulfovibrio yellowstonii	1.242134666
Trichodesmium erythraeum	1.246593564
Sebaldella termitidis	1.270114395
Dictyoglomus turgidum	1.29240584
Dictyoglomus thermophilum	1.297069077
Thermosipho melanesiensis	1.324630145
Deferribacter desulfuricans	1.331638037
Clostridium acetobutylicum	1.357082068
Mycoplasma genitalium	1.360597739
Campylobacter jejuni NCTC 11168	1.374681774
Leptotrichia buccalis	1.383345312
Rickettsia prowazekii	1.426681449
Borrelia burgdorferi B31	1.431569209
Candidatus Phytoplasma asteris	1.471567529
Mesoplasma florum	1.477622916
Fusobacterium nucleatum	1.487576702
Brachyspira hyodysenteriae	1.517447262
Streptobacillus moniliformis	1.535004291
Ureaplasma parvum ATCC 700970	1.559892696

of tetranucleotides in 89 bacterial genome sequences and determined the phylogenetic positions of *D. radiodurans* and *T. thermophilus*.

#### 2. Methods

2.1. Construction of Phylogenetic Relationships Based on the Relative Frequencies of Tetranucleotides in 89 Genome Sequences. We compared the relative frequencies of tetranucleotides in the genome sequences. The frequencies of the 89 bacteria were obtained from OligoWeb (oligonucleotide frequency search, http://insilico.ehu.es/oligoweb/). The 89

Bacteroides thetaiotaomicron

Chlamydia trachomatis D/UW-3/CX

 TABLE 2: Distance between *Thermus thermophilus* and each bacterium using correspondence analysis.

TABLE 2: Continued.

computing, http://www.R-project.org). On the basis of the

distance matrix, a neighbor-joining tree was constructed

using the MEGA software [10].

terium using correspondence analysis.		Bacterial species	Distance
Bacterial species	Distance	Chlorobium chlorochromatii	1.264256111
Thermanaerovibrio acidaminovorans	0.468763255	Denitrovibrio acetiphilus	1.264320363
Symbiobacterium thermophilum	0.686400076	Nostoc sp. PCC 7120	1.283892849
Geobacter sulfurreducens	0.756754453	Halothermothrix orenii	1.307140057
Myxococcus xanthus	0.772836176	Thermoangerabacter tengcongensis	1 321852789
Streptomyces griseus	0.786527308	Flusimicrobium minutum	1.327006319
Thermomonospora curvata	0.791039191	Cuanathaca sp. ATCC 51142	1 338024672
Moorella thermoacetica	0.806329416	Luliashartar talari 2005	1.336924072
Syntrophobacter fumaroxidans	0.825184063	Helicobacter pylori 26695	1.353623157
Deinococcus radiodurans	0.831109438	Veillonella parvula	1.366604516
Desulfohalobium retbaense	0.835469081	Natranaerobius thermophilus	1.374016605
Rhodospirillum rubrum	0.836862939	Persephonella marina	1.384851067
Azorhizobium caulinodans	0.837497899	Prochlorococcus marinus CCMP1375	1.392425502
Gloeobacter violaceus	0.847382695	Haemophilus influenzae Rd KW20	1.392980033
Rhodobacter sphaeroides 2.4.1	0.857474011	Anaerococcus prevotii	1.394012634
Desulfatibacillum alkenivorans	0.876877944	Eubacterium eligens	1.420199298
Heliobacterium modesticaldum	0.886943785	Dictyoglomus turgidum	1.42068199
Pseudomonas aeruginosa PO1	0.902403886	Caldicellulosiruptor saccharolyticus	1.428805275
Pelotomaculum thermopropionicum	0.910464775	Caldicellulosiruptor bescii	1.430940559
Acidobacterium capsulatum	0.940977424	Dictvoglomus thermophilum	1.432160811
Thermomicrobium roseum	0.958396462	Petrotoga mobilis	1.43247619
Agrobacterium tumefaciens	0.993864461	Fervidohacterium nodosum	1 436232766
Gemmatimonas aurantiaca	0.993867563	Leptospira interrogans serovar lai 56601	1.130232700
Ralstonia solanacearum	0.99540692	Thermodesulfavibria vallaustanii	1.4455360054
Opitutus terrae	1.014357577	Tride demiser and herein	1.443030432
Sphingomonas wittichii	1.018425039	Irichoaesmium erythraeum	1.459525665
Chloroflexus aurantiacus	1.027585883	Sebalaella termitiais	1.491593819
Pirellula staleyi	1.047176443	Thermosipho melanesiensis	1.522817305
Desulfitobacterium hafniense DCB-2	1.051272244	Deferribacter desulfuricans	1.541728701
Dehalococcoides ethenogenes	1.071801398	Clostridium acetobutylicum	1.553667164
Xylella fastidiosa 9a5c	1.080146527	Mycoplasma genitalium	1.586376378
Thermobaculum terrenum	1.103102039	Campylobacter jejuni NCTC 11168	1.590027263
Aminobacterium colombiense	1.103447745	Leptotrichia buccalis	1.598390503
Syntrophomonas wolfei	1.119525557	Borrelia burgdorferi B31	1.626448618
Nitrosomonas europaea ATCC 19718	1.125942985	Rickettsia prowazekii	1.653875547
Escherichia coli K-12 MG1655	1.136087269	Candidatus Phytoplasma asteris	1.673704846
Neisseria meningitidis MC58	1.137392967	Fusobacterium nucleatum	1.674099107
Fibrobacter succinogenes	1.147727362	Mesoplasma florum	1.701326765
Aquifex aeolicus	1.154770307	Streptobacillus moniliformis	1.715886446
Thermotoga maritima	1.163190235	Brachvspira hvodvsenteriae	1.717967185
Coprothermobacter proteolyticus	1.187035315	Ureaplasma parvum ATCC 700970	1.784252531
Vibrio cholerae N16961	1.194131544		10,01202001
Carboxydothermus hydrogenoformans	1.202997317		
Shewanella oneidensis	1.207081448	bacterial species are part of a list that which covers a wide range of bacterial species published in a previous report [8]. Each frequency vector consisted of 256 (= $4^4$ ) elements. The Euclidean distance between 2 vectors was calculated using the software package R (language and environment for statistical	
Bacillus subtilis	1.236980427		
Coxiella burnetii RSA 493	1.237627206		
Kosmotoga olearia	1.240198963		
Alteromonas macleodii	1.241401986		

1.250498401

1.259097769



FIGURE 2: Scatter plot between the tetranucleotide frequencies of the genomes of *Deinococcus radiodurans* and *Thermus thermophilus*.



FIGURE 3: Scatter plot between the tetranucleotide frequencies of the genomes of *Deinococcus radiodurans* and *Pseudomonas aeruginosa*.

2.2. Ranking Based on Similarities between the Relative Frequencies of Tetranucleotides according to Correspondence Analysis. Correspondence analysis [22], which is a multivariate analysis method for profile data, was performed against the relative frequencies of tetranucleotides in 89 genomes. Correspondence analysis summarizes an originally high-dimensional data matrix (rows (tetranucleotides) and columns (genomes)) into a low-dimensional projection (space) [23, 24]. Scores (coordinates) in the low-dimensional space are given to each genome. The distance between plots (genomes) in a low-dimensional space theoretically depends on the degree of similarity in the relative frequencies of tetranucleotides: a short distance means similar relative frequencies of tetranucleotides between genomes, whereas a long distance means different relative frequencies. Thus, distance can be used as an index for similarity among genomes in the relative frequencies of tetranucleotides.



FIGURE 4: Scatter plot between the tetranucleotide frequencies of the genomes of *Thermanaerovibrio acidaminovorans* and *Thermus thermophilus*.

Distances between all genome pairs were calculated, and then a ranking for distances was obtained.

#### 3. Results and Discussion

In the neighbor-joining tree (Figure 1), *D. radiodurans* is located in the high-GC-content cluster, whereas *T. thermophilus* is grouped with *Thermanaerovibrio acidaminovorans* and their group is located away from the high-GCcontent cluster. The neighbor-joining tree (Figure 1) was greatly influenced by the genomic GC content bias; most of the well-defined major taxonomic groups did not form a monophyletic lineage. This result indicates that each constituent of the well-defined major group has diversified by changing its genome signature during evolution. It is consistent with a previous paper indicating that microorganisms with a similar GC content have similar genome signature patterns [25].

Phylogenetic analysis according to genome signature comparison is not based on multiple alignment data. Thus, bootstrap analysis cannot be performed. In this paper, we estimated the similarity between 2 different tetranucleotide frequencies by using correspondence analysis. The correspondence analysis showed that the genome signature of D. radiodurans is most similar to that of Pseudomonas aeruginosa (Table 1), whereas the genome signature of T. thermophilus is most similar to that of Th. acidaminovorans (Table 2). Although the *D. radiodurans* genome signature has similarity to 18 bacterial species within the distance 0.5, the T. thermophilus genome signature has similarity only to Th. acidaminovorans within the same distance (Table 2). These results indicate that T. thermophilus has a different genome signature from those of bacteria included in the high-GCcontent cluster (Figure 1).

Although Pearson's correlation coefficient between the tetranucleotide frequencies of genomes of *D. radiodurans* 

and *T. thermophilus* is 0.630 (Figure 2), that between the tetranucleotide frequencies of genomes of *D. radiodurans* and *Pseudomonas aeruginosa* is 0.935 (Figure 3) and that between the tetranucleotide frequencies of genomes of *Th. acidaminovorans* and *T. thermophilus* is 0.914 (Figure 4). These results support the results of the neighbor-joining and correspondence analyses.

The frequency of horizontal gene transfer between different bacteria may be associated with genome signature similarity. However, the tree topology based on genome signature (Figure 1) is different from that based on gene content [8]. This is caused by, among others, an amelioration of the horizontally transferred genes [26]. Our findings strongly support the previous report that *Deinococcus* has acquired genes from various other bacteria to survive different kinds of environmental stresses, whereas *Thermus* has acquired genes from thermophilic bacteria to adapt to high-temperature environments [3].

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