**RESEARCH PAPER** 



# Genomic characterization and molecular dating of the novel bacterium *Permianibacter aggregans* HW001<sup>T</sup>, which originated from Permian ground water

Shuangfei Zhang<sup>1,2</sup> · Russell T. Hill<sup>3</sup> · Hui Wang<sup>1,2</sup>

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#### Abstract

The Permian Basin is a unique ecosystem located in the southwest of the USA. An unanswered question is whether the bacteria in the Permian Basin adapted to the changing paleomarine environment and survived in the remnants of Permian groundwater. In our previous study, a novel bacterial strain, *Permianibacter aggregans* HW001<sup>T</sup>, was isolated from microalgae cultures incubated with Permian Basin waters, and was shown to originate from the Permian Ocean. In this study, strain HW001<sup>T</sup> was shown to be the representative strain of a novel family, classified as 'Permianibacteraceae'. The results of molecular dating suggested that the strain HW001<sup>T</sup> diverged ~447 million years ago (mya), which is the early Permian period (~250 mya). Genome analysis was used to access its potential energy utilization and biosynthesis capacity. A large number of transporters, carbohydrate-active enzymes and protein-degradation related genes have been annotated in the genome of strain HW001<sup>T</sup>. In addition, a series of important metabolic pathways, such as peptidoglycan biosynthesis, osmotic stress response system and multifunctional quorum sensing were annotated, which may confer the ability to adapt to various unfavorable environmental conditions. Finally, the evolutionary history of strain HW001<sup>T</sup> was reconstructed and the horizontal transfer of genes was predicted, indicating that the adaptation of *P. aggregans* to a changing marine environment depends on the evolution of their metabolic capabilities, especially in signal transmission. In conclusion, the results of this study provide genomic information for revealing the adaptive mechanism of strain HW001<sup>T</sup> to the changing ancient oceans.

Keywords Permian groundwater · Molecular dating · Genomic adaptation · Genes gain and loss

# Introduction

The Permian Basin is a large sedimentary basin in the southwestern USA. It extends from the southeastern Lubbock, Texas, to the south of Odessa and Midland, and westward to adjacent southern New Mexico (Bein and Dutton

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Hui Wang wanghui@stu.edu.cn

- <sup>1</sup> Southern Marine Science and Engineering Guangdong Laboratory (Guangzhou), Guangzhou 511458, China
- <sup>2</sup> Biology Department, College of Science, and Guangdong Provincial Key Laboratory of Marine Biotechnology, Shantou University, Shantou 515063, China
- <sup>3</sup> Institute of Marine and Environmental Technology, University of Maryland Center for Environmental Science, Baltimore, MD 21201, USA

1993). It represents a unique ecosystem, and is the remains of an ancient sea that existed during the Permian period (~250 million years ago) (Hong et al. 2013; Wright 2011). Permian water has relatively low ammonia concentration  $(0.19 \pm 0.01 \ \mu mol/L)$ , normal N/P ratio  $(20.95 \pm 0.45)$  and low salinity  $(1.65 \pm 0.10\%)$  (Hong et al. 2013). In addition, modern Permian groundwater is an aerobic and relatively stable environment with high concentrations of bicarbonate, nitrite, nitrate, phosphate, and iron (Gruber 2008; Hong et al. 2013). In contrast to modern Permian groundwater, the Permian Ocean is believed to have experienced not only oceanic eutrophication, but also acidification, anoxia, and ecological perturbation during the Permian period, which eventually led to mass extinction (Sun et al. 2018). These marine environmental changes could affect their metabolism and the evolution of organisms living in the habitat. Gradually, the constant mutation rate of some bacteria helps them adapt to changing environmental conditions (Denamur and Matic 2006).

In general, Proteobacteria, especially Gammaproteobacteria, are abundant in Permian groundwater and are known for their extensive metabolic diversity (Mori et al. 2017). Bacterial strains cultured from the abundant Gammaproteobacteria in Permian groundwater may shed light on the mechanisms of adaption to the specific environment of ancient oceans. A bacterium designated P. aggregans strain HW001<sup>T</sup> was isolated from liquid cultures of the biofuelproducing microalga, Nannochloropsis oceanica IMET1, cultured in Permian groundwater (Wang et al. 2012). Using primers specific to the 16S rRNA gene of strain HW001<sup>T</sup>, the strain-specific amplicons were obtained only from original Permian groundwater, and not from other tested samples (Wang et al. 2012). This indicated that strain  $HW001^{T}$  may be originated from Permian groundwater. Phylogenetic analysis indicated that *P. aggregans* strain HW001<sup>T</sup> is a member of a novel genus Permianibacter belonging to the family Pseudomonadaceae (Wang et al. 2014). In this study, we aimed to redefine the phylogenetic status of the strain P. aggregans HW001<sup>T</sup>, determine the timing of divergence, and investigate adaptive mechanisms that may play a role in its survival in the Permian Basin environment.

# Results

# Genomic characterization of strain HW001<sup>T</sup>

The genomic features of *P. aggregans* HW001<sup>T</sup> isolated from Permian groundwater are listed in Supplementary Table S1. Plasmids were not detected in the genome of P. aggregans strain HW001<sup>T</sup>. The genome size was 4,265,640 bp and the G+C content was 54.4%. Final annotation of *P. aggregans* strain HW001<sup>T</sup> produced 3816 predicted coding sequences (CDS). A total of 57 RNA sequences were detected, including 6 rRNA genes (5S, 16S and 23S) and 48 tRNA genes. The graphic circular plot of *P. aggregans* strain HW001<sup>T</sup> genome was colored by COG category (Fig. 1A). Among them, 452 genes encoding energy production and conversion were predicted. It was found that 29 GIs were identified across the chromosome of strain HW001<sup>T</sup> (Fig. 1B). Most of these GIs (68.34%) were dominated mainly by hypothetical proteins (Supplementary Table S2). Other proteins present were associated with DNA replication, transposition, fatty acid hydroxylation, group transfer, membrane transportation, metal resistance, and DNA-binding response regulators. Also, proteins involved in transcription regulation and various mobile elements were observed. The PHASTER server predicted only one incomplete prophage region in the genome of strain HW001<sup>T</sup> with a total size of 11.7 kb (Supplementary Fig. S1). The prophage region sequence was blasted to COG database, and it encodes key enzymes for some functions, such as various mobile elements.

#### Sequence identity differences

In our previous study, the 16S rRNA gene sequence of P. aggregans strain HW001<sup>T</sup> showed only 88.31% similarity with that of *Pseudomonas protegens* strain CHA0<sup>T</sup>, which was affiliated with Pseudomonadaceae (Wang et al. 2014). In this study, Blastn analysis showed that *P. aggregans* strain HW001<sup>T</sup> had a higher similarity (89.15%) with *Cavicella* subterranea strain W2.09-231<sup>T</sup> belonging to another family Moraxellaceae in the class of Gammaproteobacteria. This similarity value was higher than 86.5%, which is the threshold for classifying different families (Yarza et al. 2014). Genome-based analysis was conducted to investigate the phylogeny of *P. aggregans* strain HW001<sup>T</sup>. It was found that the ANI value (67.78%) between P. aggregans strain HW001<sup>T</sup> and *Pseudomonas aeruginosa* strain ATCC  $10145^{T}$  was the highest, whereas the sequence homology between *P. aggregans* strain HW001<sup>T</sup> and other strains was relatively low, generally around 66% (<75%), indicating that the phylogeny of the *P. aggregans* strain HW001<sup>T</sup> needs to be redefined (Supplementary Table S3).

# Phylogenetic analysis of the strain HW001<sup>T</sup>

Phylogenetic analysis based on 16S rRNA gene sequence analysis using different tree algorithms [Fig. 2 (ML) and Supplementary Fig. S2 (NJ and ME)] showed that P. aggregans strain HW001<sup>T</sup> was distinct from other families in the class of Gammaproteobacteria and formed a single clade. This is different from our previous study, which showed that P. aggregans strain HW001<sup>T</sup> belongs to Pseudomonadaceae (Wang et al. 2014). For further verification, the genomic tree of P. aggregans strain HW001<sup>T</sup> and other Gammaproteobacteria strains was constructed based on single-copy genes (Fig. 3). Genomic recombination was performed using RDP4 and ClonalFrameML to mitigate the effects of homologous recombination (Supplementary Figs. S3, S4; Supplementary Table S4). The results of phylogenetic analysis of the whole genomes showed that the P. aggregans strain HW001<sup>T</sup> resides in a single clade, clearly different from Pseudomonadaceae and other known Gammaproteobacteria families.

# Molecular dating

The timing of divergence of *P. aggregans* strain HW001<sup>T</sup> was inferred from molecular phylogenetic chronogram and calibration of various fossils using penalized likelihood in r8s (r8s-PL) and Bayesian estimation with uncorrelated relaxed rates among lineages (BEAST). Molecular dating based on r8s software (Fig. 4) suggested that *P. aggregans* 



**Fig.1** Graphic circular plot of strain HW001<sup>T</sup> genome. **A** From outside to the center: Genes on forward strand (colored by COG categories), Genes on reverse strand (colored by COG categories), RNA

strain HW001<sup>T</sup> diverged around 447 ( $\pm$ 7) mya. The resulting dated phylogeny based on BEAST software (Supplementary Fig. S5 and Supplementary Table S5) was similar to r8s, and the *P. aggregans* strain HW001<sup>T</sup> diverged around 508 mya (95% credibility interval: 477.3590, 582.3631). These dating times are in the early Permian period (~250 million years ago) (Hong et al. 2013; Wright 2011). Cyanobacteria (2700 mya), akinetes (1991 mya),

genes (tRNAs green, rRNAs red, other RNAs black), GC content, GC skew. **B** Representation of genomic islands predicted by Islandviewer 4 in strain  $HW001^T$  genome

and *Rhizobium* (129 mya) were also closed to the reported period. The strain was thought to be encased in an underwater basin that contains the remnants of an ancient ocean that existed during the Permian period. In order to identify potential shifts in bacterial physiology by genome-wide evolution, we asked which genes associated with environmental adaptation were present/absent in the genome of *P. aggregans* strain HW001<sup>T</sup>.



Fig. 2 Maximum-likelihood tree based on partial 16S rRNA gene sequences of the strain *Permianibacter aggregans* HW001<sup>T</sup> and other type strains of each family in the class Gammaproteobacteria

#### Functional gene composition and comparison

According to the results of genome annotation and genome analysis, *P. aggregans* strain  $HW001^T$  was enriched in

genes encoding secondary metabolite biosynthesis, transport and catabolism, cell motility and defense mechanism, compared with other more recently diverged Gammaproteobacteria (Supplementary Fig. S6). Specific genes were



Fig. 3 The RAxML maximum likelihood phylogenomic tree based on 102 single-copy gene families in the class Gammaproteobacteria. Five reference strains from Alpha- and Betaproteobacteria were used

as the outgroup for genomic tree. The scale bar indicates 1.0 substitution per nucleotide position for genomic tree. G+C content and genome size are indicated in the two left columns

annotated in the genome of *P. aggregans* strain  $HW001^{T}$ , including nitrogen metabolism [pA (periplasmic nitrate reductase) and pB (cytochrome c-type protein)], amino acid metabolism [aspC (aspartate aminotransferase) and puuE (4-aminobutyrate aminotransferase)], putrescine transport system (potFGHI), butanol dehydrogenase (bdhAB, 3 copies), argHA (argininosuccite lyase), mogA (molybdopterin adenylyltransferase) and lapB (ATP-binding cassette) (Supplementary Table S6). The metabolic pathways of *P. aggregans* strain HW001<sup>T</sup> include oxidative phosphorylation, ABC transporters and associated proteins, nitrogen metabolism, sulfur metabolism, extracellular polymeric substance (EPS), and carbon fixation (Fig. 5).

#### Carbohydrate-active enzymes

The genome of *P. aggregans* strain HW001<sup>T</sup> contains at least 57 genes encoding carbohydrate-active enzymes, including glycosyl transferases (GTs, 22 genes), glycoside hydrolases (GHs, 14 genes), carbohydrate-binding modules (CBMs, 9 genes), carbohydrate esterases (CEs, 6 genes) and auxiliary activities (AAs, 6 genes) (Supplementary Table S7). GTs and GHs belong to 8 and 11 known families, respectively, described in the CAZy database. Over half of the annotated P. aggregans strain HW001<sup>T</sup> GTs were associated with glycosyl transferase (GT families 2 and 4; 13 copies). Five genes (GH family 13) encode alpha amylase. In addition, genes encoding Beta-galactosidase, Beta-glucanase,



Fig.4 A chronogram of Gammaproteobacteria performed using the r8s software. Nodes with fossil record corrections are indicated with an asterisk

exo-1,4-beta-glucosidase, peptidoglycan transglycosylase, and Beta-glucosaminidase were annotated. Furthermore, genes encoding catalase (AA family 2; 2 copies), oxidoreductase (AA family 3), and multimeric flavodoxin (AA family 6; 2 copies) were detected in the genome of *P. aggregans* strain HW001<sup>T</sup>.

#### Nitrogen and sulfur metabolism

It is well known that nitrate acts as an electron acceptor, affecting the biological activity of microbial cells (Ogilvie et al. 1997). In the presence of *NarGHI*, *NapAB*, *NirBD*, and *NrfAH* genes in *P. aggregans* strain HW001<sup>T</sup>, dissimilatory nitrate reduction (nitrate = > ammonia) was determined to be the main metabolic pathway for ammonia production. *glnA* ([EC:6.3.1.2], 4 copies) is the most common gene involved in nitrogen utilization, converting ammonia to glutamine and glutaminate. However, in the absence of the *NosZ* gene, *P. aggregans* strain HW001<sup>T</sup> could not catalyze the production of nitrogen from nitrate. Three nitrate/nitrite transporter genes encoding *NRT* were annotated. They may

have the function of regulating nitrogen balance. Its assimilating sulfate reduction (sulfate = >  $H_2S$ ) pathway is a key mode of sulfur metabolism.

#### Extracellular polymeric substance (EPS)

In our previous study (Wang et al. 2012), it was determined that *P. aggregans* strain HW001<sup>T</sup> could aggregate microalgae, such as *Nannochloropsis oceanica* IMET1 and *N. oceanica* CT-1. Surface EPS is mainly composed of polysaccharides, proteins, nucleic acids, and lipids, which may exert an important role in the aggregation process (Xiao et al. 2018). Several complete glycan biosynthesis pathways were detected in the genome of *P. aggregans* strain HW001<sup>T</sup>, including peptidoglycan (DAP-type and Lys-type, Supplementary Fig. S7) and lipopolysaccharide biosynthesis (Supplementary Fig. S8). A complete phosphatidylethanolamine (PE) biosynthesis pathway [phosphatidylethanolamine (PE) biosynthesis pathway [phosphatidic acid (PA) = > phosphatidylserine (PS) = > PE] was successfully annotated, including genes encoding for phosphatidate cytidylyltransferase (*CDS*1, HW001\_00670



Fig. 5 Heterotrophic metabolic pathways of strain HW001 highlighting the major functions identified by genomic analysis

and HW001\_02758), phosphatidylserine decarboxylase (*psd*, HW001\_02719), and CDP-diacylglycerol--serine O-phosphatidyltransferase (*CHO*1, HW001\_02101). Additionally, a transmembrane protein (*EpsH*, HW001\_02119) and a putative exopolysaccharide exporter (EPS-E, HW001\_00554) were annotated based on KEGG database.

#### **ABC transporters**

At least 45 genes in the genome of *P. aggregans* strain HW001<sup>T</sup> encode a variety of ABC transporters, including a metal ion transfer systems (molybdate, sodium, iron (III), and iron complex), organic molecular transfer system

(putrescine, phospholipid, phosphate, phosphonate, dipeptide, lipopolysaccharide, and lipoprotein), and other transport systems (heme, cell division, putative ABC, ABC-2 type) (Fig. 5). These identified transporters regulate intracellular homeostasis and provide sufficient materials for the survival of *P. aggregans* strain HW001<sup>T</sup>.

#### **Two-component system**

Various two-component systems, including PhoQ-PhoP (magnesium transport), CusS-CusR (copper tolerance), EnvZ-OmpR (osmotic stress response), RstB-RstA BaeS-BaeR (envelope stress response), DesK-DesR (membrane lipid fluidity regulation), BarA-UvrY (central carbon metabolism), AlgZ-AlgR (alginate production), PhoR-PhoB (phosphate starvation response), GlnL-GlnG (nitrogen regulation), PilS-PilR (type 4 fimbriae synthesis), and FlrB-FlrC (polar flagellar synthesis) were annotated in the genome of *P. aggregans* strain HW001<sup>T</sup>.

#### Quorum sensing

In general, quorum sensing can regulate various metabolic pathways, which may be related to the transition of bacterial lifestyles between free-living (low substrate utilization, low population density) and particle associated (high substrate utilization, high population density) (Gram et al. 2002). In this study, 25 genes encoding quorum sensing were found in the genome of *P. aggregans* strain HW001<sup>T</sup>. Specifically, the gene (HW001\_01847) encoding a putative adhesion enzyme was annotated as a fibronectin type III domain protein or BapA (Supplementary Fig. S9). The protein was considered to be essential for biofilm formation and host colonization of Salmonella enterica serovar Enteritidis (Latasa et al. 2005). The analysis of codon usage in the genome of *P. aggregans* strain HW001<sup>T</sup> revealed that the codon adaptation index (CAI) of the gene was 0.694, whereas the average CAI was 0.714, indicating that *P. aggregans* strain HW001<sup>T</sup> likely obtained this gene in the past (Supplementary Table S8). However, the results based on the HGTector2 showed the gene was not transferred from other species. Only a gene encoding ferric uptake regulator (Fur), which controls the expression of enzymes that protect against reactive oxygen species (ROS) damage, was predicted to transfer from Gammaproteobacteria (Troxell and Hassan 2013).

#### Analysis of gene gain and loss

To study the evolution of *P. aggregans* strain HW001<sup>T</sup>, we clustered all protein sequences from 54 strains into different protein families (see Materials and methods), and estimated the gain and loss of protein families using phylogenetic gain–loss-duplication model implemented in Dollo

parsimony (Supplementary Tables S9, S10). A total of 19 gene families were predicted to be gained (Supplementary Table S9). Gains may come from horizontal gene transfer, mainly involving genes encoding methyltransferase, formyl transferase, and transcriptional regulator. Of the total 155 gained genes at nodes 17 and 19, further analysis showed that  $5 (\sim 4.63\%)$  and  $9 (\sim 19.15\%)$  of them were identified as cellular process and signaling based on the eggNOG database, respectively (Fig. 6).

Of the 419 deletion gene families in strain HW001<sup>T</sup>, 351 were annotated by the COG and KEGG databases. Among all deletion gene families, genes were mainly related to information storage and processing (~ 10.02% of the total deletion gene families), cellular process and signaling (~ 21.96%), and metabolism (~ 20.05%). Many of them are involved in cell wall/membrane/envelope biogenesis (COG M category, 23 families), amino acid transport and metabolism (COG E category, 24 families), transcription (COG K category, 23 families), signal transduction mechanism (COG T category, 13 families), energy production and conversion (COG C category, 14 families), inorganic ion transport and metabolism (COG P category, 27 families; Supplementary Table S10).

# HGT for strain HW001<sup>T</sup>

The results of HGT gene analysis indicated that more than 6% of strain HW001<sup>T</sup> genes may have been horizontally transferred from other bacteria (Supplementary Table S11). Among all putative HGTs, genes related to signaling and cellular processes (15.98% of the total putative HGTs), genetic information processing (5.33%), carbohydrate metabolism (4.92%), amino acid metabolism (3.28%), and environmental information processing (2.46%), were the top five most abundant functional classifications. Among candidate donors, most genes were acquired from the phylum Proteobacteria (171), with Gammaproteobacteria transferring the largest number (93). Many genes (68), including 10 genes encoding amino acid transport and metabolism, were acquired from some unclassified bacteria.

# **Global distribution**

The results of the global distribution survey of *P. aggregans* strain HW001<sup>T</sup> based on IMNGS analysis showed that 476 of the environmental samples (0.11%) had 16S rRNA genes with > 97% similarity to *P. aggregans* strain HW001<sup>T</sup> (Supplementary Table S12). Among them, SRR2041107, SRR2041108, SRR2041114, SRR2041168, and SRR2041112 with high abundance target 16S rRNA gene of 0.0338%, 0.0113%, 0.0063%, 0.0063%, and 0.0059%, respectively, were all collected from the aquatic samples of coral pond water in Davis, California, USA. Also, targeted 16S rRNA genes were found in samples



**Fig. 6** Evolutionary histories of strain HW001<sup>T</sup> using COUNT with Dollo parsimony. **A** The Bayesian tree is generated from Figtree. The numbers of gain and loss events were marked at leaves and nodes on the phylogenetic tree. The blue words represent the total number of

gene families at different nodes. "+"s represent gain events and "-"s represent loss events. The lightly yellow star represents the major gene gain/loss event. **B** The pie chart shows the numbers of gained genes classified by COG database

collected from the beach sand metagenomes, maize rhizosphere saline soil, *Suaeda salsa* rhizosphere soil, and lettuce rhizosphere arable soil of Pensacola, Florida, USA.

Further investigation of the physico-chemical parameters of the Permian groundwater showed that compared with the other three habitat types (open ocean, coral reef, and marine-derived lake sites) in the global ocean sampling data, the living environment of *P. aggregans* strain HW001<sup>T</sup> was similar to that of the east coast of North America (Fig. 7; Supplementary Fig. S10). It is worth noting that the concentration of silicate in Permian Basin water was higher than that in the GOS data. These results suggested that the *P. aggregans* strain HW001<sup>T</sup> or its closely related groups may be mainly distributed in the adjacent regions of the USA, and tend to propagate in the Permian aquatic environments as well as some rhizosphere soils.

# Discussion

# **Divergence time**

Molecular dating, a standard method for inferring timetrees, is a fundamental step in drawing biological conclusions from nucleotides or amino acid sequence data (Ho and Duchêne 2014; Mello 2018). It may reveal the diversification of major taxa and their association with Earth's history (Misof et al. 2014). The divergence time of *P. aggregans* strain HW001<sup>T</sup> in this study was inferred from molecular phylogenetic chronogram and various fossils calibrated using r8s-PL and BEAST. The results indicated that strain HW001<sup>T</sup> should have diverged around 447 mya, the Ordovician Period (480 mya-440 mya years ago), which was earlier than the Permian period (~250



**Fig. 7** Comparison of physiological and biochemical characteristics between the sampling sites of strain HW001<sup>T</sup> and other GOS data

million years ago) (Hong et al. 2013; Wright 2011). In our previous study, strain HW001<sup>T</sup> was proved to be derived from the Permian ground water, which was used for cultivating the biofuel-producing microalgae, *Nannochloropsis oceanica* IMET1 (Wang et al. 2012). Therefore, we believed that HW001<sup>T</sup> is a bacterium that existed in the Permian Ocean in the early Permian Period, which adapted to the changing marine environments at that time, and survived in the groundwater until the present.

## Metabolic capabilities of the strain HW001<sup>T</sup>

#### Chemoheterotrophic metabolic capabilities

Previous studies have shown that *P. aggregans* strain HW001<sup>T</sup> utilized organic carbon sources (e.g., cellobiose, maltose, starch, glucose, gluconate, sucrose and adipic acid) rather than inorganic bicarbonate for growth (Wang et al. 2014). In this study, we successfully annotated many branched chain amino acid transporters, peptide transporters and amino acid efflux proteins in the genome of *P. aggregans* strain HW001<sup>T</sup>, further demonstrating that proteins are important carbon sources for *P. aggregans* strain HW001<sup>T</sup>. In the *P. aggregans* genome, numerous ABC-type transporter systems of putrescine are present, similar to the finding in the marine bacterium *Silicibacter pomeroyi* (Moran et al. 2004). In contrast, *P. aggregans* does not have a spermidine transport system, but can synthesize and utilize spermidine

and putrescine through the polyamine biosynthesis pathway (arginine = > agmatine = > putrescine = > spermidine). One reason why P. aggregans tends to metabolize organic carbon is that this promotes dissimilatory nitrate reduction processes, which are useful for cellular respiration and electron transport (Yin et al. 2002). Due to the presence of various CBM described families, such as CBM5, CBM50, CBM12, and CBM48, strain HW001<sup>T</sup> is believed to be able to adhere to chitin, glycogen, and cell walls. Also, genes encoding for 4-oxalocrotonate tautomerase were detected in the genome of strain HW001<sup>T</sup>, indicating that it could generate intermediates of the TCA cycle via the conversion of aromatic compounds. Additionally, the detection of 5-phospho-alpha-D-ribose 1-diphosphate PRPP biosynthesis and the pentose phosphate pathway in this strain suggests the potential for the production of some nucleotide and amino acid precursors (Luo et al. 2021). Moreover, HGT, as an important evolutionary process in prokaryotes, largely affecting the diversity of gene repertoires (Zhaxybayeva et al. 2009). For example, the genes presented encoding chitinase [EC:3.2.1.14] and beta-glucosidase [EC:3.2.1.21] (bglX and bglB) were apparently the products of HGT events. On the one hand, strain HW001<sup>T</sup> has multiple organic matter transport systems that can be used to utilize organic matter. One the other hand, gene families related to inorganic substrate transport, such as nitrate/nitrite transport (nrtA) and sulfate/thiosulfate transport (cysR), have been lost over a long evolutionary history, reflecting the shifts of bacterial physiology during the early Permian Period. In short, a large series of transporters, abundance of genes encoding carbohydrate-active enzymes, and many genes encoding degradative and synthetic proteins suggested that HW001<sup>T</sup> possess chemoheterotrophic metabolic capabilities to target a wide range of organic carboncontaining compounds.

#### Multifunctional strategies for other environmental stresses

In our previous studies, we observed EPS on the cell surface of *P. aggregans* (Wang et al. 2012, 2014). EPS not only contributes nutrients to the environment, but also protects bacteria from toxic substances. At the same time, EPS may be used as energy storage to cope with external environmental pressure (Xiao and Zheng 2016). *P. aggregans* cells are encapsulated by multi-layer peptidoglycans (DAP-type and Lys-type). These layers on the cell wall may improve mechanical strength, help bacteria to regulate the external osmotic pressures, and survive in harsh environments. Conversely, the degree of cross-linking of peptidoglycan is associated with the structural integrity of cells (Höltje 1998).

A unique physiological marker of biofilm-producing bacteria is the high level of intracellular content of cyclic di-GMP (c-di-GMP), which is a secondary messenger that plays an essential role in determining the lifestyle of a wide range of bacteria (Chew and Yang 2016). Intracellular c-di-GMP is synthesized by several diguanylate cyclases (DGCs), and degraded by phosphodiesterases (PDEs). Multiple DGCs and PDEs offer *P. aggregans* strain HW001<sup>T</sup> great flexibility to regulate its intracellular c-di-GMP content enabling adaptation to different environmental conditions (Chew and Yang 2016). Histidine kinases (HK) are sensory proteins of two-component systems that control the response of many bacteria to different stimuli, i.e., mainly changes in environmental parameters (Fernández et al. 2019). Many of the genes encoding the LytTR family are predicted to be transferred from Oceanospirillales and other members of Proteobacteria. In addition, the gain of transposase may help to catalyze the donor cleavage and strand transfer reactions of HW001<sup>T</sup> through HGT from Gammaproteobacteria. There was also a putative HGT gene *pspA* encoding for phage shock protein A involved in responses to various stresses (ethanol, heat, and osmotic shock) (Brissette et al. 1990; Kleerebezem et al. 1996). Furthermore, the two-component system KdpD/KdpE is well known for its regulatory role in potassium (K<sup>+</sup>) transport antimicrobial stress, osmotic stress and oxidative stress (Freeman et al. 2013). A series of these gene families were lost, including genes encoding KdpA, KdpB, KdpC, KdpD, and KdpE, indicating that strain HW001<sup>T</sup> had this two-component system in the past. Also, gains/losses of other signal transduction proteins, flagellar biosynthesis proteins, quorum sensing systems, and twocomponent system regulatory proteins ensured the survival of *P. aggregans* strain HW001<sup>T</sup> cells in changing environmental conditions. Among all putative HGTs, genes related to signaling and cellular processes (15.98% of the total putative HGTs) and genetic information processing (5.33%) were the top two enriched functional classifications. In this regard, the adaptation of P. aggregans to a changing marine environment depends on the evolution of their metabolic capabilities, especially in signal transmission.

Genes encoding the ATP-dependent DNA helicases PIF1 and DEAD box helicase were predicted also with the results showing that they might have transferred from other Proteobacteria. These genes contribute largely to DNA repair (Rand et al. 2003). Several putative HGT genes encoding for multidrug resistance proteins imported from unclassified Bacteria may play a significate role in coping with stress. In addition, genes encoding superoxide dismutase (SOD2), which is essential for the detoxification of reactive oxygen species (ROS), was detected. ROS are generated during aerobic respiration and ammonia oxidation (Kim et al. 2016). To protect cells from oxidative stress and repair oxidatively damaged cytoplasmic proteins, thioredoxin reductase encoded by the gene trxB in HW001<sup>T</sup> could be helpful (Cheng et al. 2017). Additionally, inferred HGT genes essential for protection from ROS were predicted to be transferred from Gammaproteobacteria, such as speE. speE encoding spermidine synthase which could also protect DNA in thermal biotopes (Cheng et al. 2009). These genes would enable HW001<sup>T</sup> to adapt to low-oxygen conditions.

### **Ecological implications**

According to IMNGS analysis and comparison of physicochemical parameters with global ocean sampling (GOS) data, P. aggregans strain HW001<sup>T</sup> was mainly distributed in the regions adjacent to the USA, and tends to propagate in the Permian aquatic environments as well as some coastal soils or sediment environments. P. aggregans was abundant under eutrophic conditions, especially in coral pond water. This suggests that coral ponds contain substances that meet the metabolic needs of P. aggregans. These organisms could be applied as potential cleaning agents to degrade and remove organic carbon in eutrophic environments, thereby reducing water eutrophication. In addition to aquatic environments, P. aggregans may be a member of the rhizosphere community in some coastal soils. Relics of marine bacterial communities can be preserved in sediments for many years (Langenheder et al. 2016). Therefore, it is necessary to study the bacterial community in sediments of the Permian Basin to help understand the adaptive metabolism of P. aggregans.

#### Taxonomy

The chemotaxonomic and metabolic characteristics of *P. aggregans* strain HW001<sup>T</sup> differed considerably from other strains in Gammaproteobacteria (Supplementary Table S13). For example, GC content, enzymatic activities and carbohydrate utilization rate were different from those of other families. Based on genotypic, phylogenetic, chemotaxonomic and phenotypic assays, *P. aggregans* strain HW001<sup>T</sup> may be classified to a novel family, named Permianibacteraceae fam. nov. in the order of Psedudomadales.

#### Description of Permianibacteraceae fam. nov.

Permianibacteraceae (Per.mi.a.ni.bac.ter.ace'ae. N.L. masc. n. *Permianibacter*, the type genus of the family; N.L. suff. -aceae ending to denote the name of a family; N.L. fem. pl. n. Permianibacteraceae the family of *Permianibacter*).

This genus is classified to a new family because of its large physiological differences and phylogenetic distance from other members of Gammaproteobacteria. The description is identical to that of the genus *Permianibacter*, in which the cells are aerobic, oxidase-positive but catalase and urease-negative Gram-stain-negative rods *ca*. 1.6–2.7 µm long and 0.4 µm wide, without endospores. The G + C content of genomic DNA was ~55.4 mol%. The major fatty acids were iso-C15: 0, summed feature 9 (iso-C17: 1  $\omega$ 9*c*), and C16: 0. Q-8 is the main respiratory quinone. Polar lipid profile

consists of phosphatidylethanolamine, an unidentified aminophospholipid, and some other unidentified lipids.

# Conclusion

In this study, genomic analysis of P. aggregans strain HW001<sup>T</sup> provided the first glimpse of the genome landscape of the novel family Permianibacteraceae. With the genome expansion of *P. aggregans* HW001<sup>T</sup>, its evolved metabolic and physiological characteristics can ensure its survival in a changing marine environment. The results of this study indicated that HW001<sup>T</sup> has a chemoheterotrophic metabolism targeting organic carbon, which promotes electron transfer to improve its resistances to oxygen stress. In addition, the integration of various EPSs, two-component systems, and its own quorum sensing may help ensure cell survival under eutrophication, acidification and other environmental pressures. *P. aggregans* strain HW001<sup>T</sup> is mainly distributed in regions adjacent to the USA, and has a tendency to reproduce in plant rhizosphere soils. In the future, more in-depth experimental verification will be carried out on P. aggregans HW001<sup>T</sup>, especially its silicate metabolism ability and diverse quorum sensing systems.

# Materials and methods

# **Genomic DNA extraction and sequencing**

*P. aggregans* strain HW001<sup>T</sup> (= CICC 10856<sup>T</sup> = KCTC 32485<sup>T</sup>) was cultured in marine 2216E broth (BD Biosciences) at 30 °C and 150 rpm for 3 days. Aliquots (2 ml) of liquid cultures were centrifuged (6000 rpm, 5 min) and cell pellets were collected for genomic DNA extraction using the Ultra-Clean microbial DNA isolation kit (MoBio Laboratories, USA). DNA concentration and purity were measured using a NanoDrop 2000 spectrophotometer (Thermo Fisher Scientific, USA). The genomic DNA (50 µl) with the final concentration of 300 ng/µl was sent to Beijing Genomics Institute (BGI, Shenzhen, China) for sequencing using Illumina (HiSeq 4000, USA) and Pacbio RSII sequencing platform. The sequencing results were assembled into different scales of contigs using SOAPdenovo (V1.05) and RS\_HGAP Assembly3.

# Genome annotation and analysis

Protein-encoding gene prediction of *P. aggregans* strain HW001<sup>T</sup> was conducted using the Prokaryotic Genome Annotation System pipeline (Version 1.11) (Seemann 2014). The encoded predicted proteins were classified based on Gene Ontology (GO), Kyoto Encyclopedia of Genes and

Genomes (KEGG), Swiss-Prot, Non-redundant protein sequences (NR), and Clusters of Orthologous Groups (COG) databases (e value < 0.00001). Carbohydrate-active enzymes were identified with the assistance of MetaCyc (Caspi et al. 2014) and CAZy database (Drula et al. 2022). The genomic similarity between *P. aggregans* strain HW001<sup>T</sup> and other Gammaproteobacteria isolates was investigated by calculating the average nucleic acid identities (ANIs) using EZBio-Cloud online service (https://www.ezbiocloud.net/tools/ani) (Yoon et al. 2017). Prediction and annotation of functional proteins of other Gammaproteobacteria isolates were also based on GO, KEGG, and COG databases. The number and size of genomic islands (GIs) were determined with Island-Viewer 4 server, an integrated interface of four different GI prediction methods: IslandPick, IslandPath-DIMOB, SIGI-HMM, and Islander (Bertelli et al. 2017). Prophages of strain HW001<sup>T</sup> were predicted using the online API in PHASTER (Arndt et al. 2016).

#### **Genome recombination**

It is clearly stated that recombination may obscure phylogenetic signals and may result in exaggerated branch lengths and increased evolutionary distances between strains (Knight et al. 2015). In order to mitigate its effects, recombinant genomic regions should be excluded from any phylogenetic reconstruction. Multiple alignment of the genome sequences for strain HW001<sup>T</sup> and the closed strains was performed by using Mauve (v20150226) multiple alignment software (Darling et al. 2004). RDP4 software was used to detect possible recombination breakpoints and potential recombination strains (Martin et al. 2017). In addition, in order to determine reliable recombination events, nine different methods (RDP, MaxChi, Chimaera, SiScan, GENECONV, BootScan, Phylpro, LARD, and 3Seq) were embedded in the RDP program with the corrected *P* value cutoff of  $10^6$ .

To estimate mutation and recombination rates, the RAxML tree was first constructed based on the results of the RDP program (members in the tree were Acinetobacter gerneri DSM 14,967, Alcanivorax jadensis T9, Alteromonas macleodii ATCC 27,126, Diplorickettsia massiliensis 20B, Kangiella sediminilitoris KCTC 23,892, Rickettsiella grylli TrM1, and Permianibacter aggregans HW001). For further details, please refer to the Phylogenetic analysis section. The MAFFT alignment was calculated using their genomic sequences. Both RAxML predefined tree and MAFFT alignment were applied as the input to ClonalFrameML v1.12 (Didelot and Wilson 2015). ClonalFrameML was used to detect gene clusters at loci with elevated base substitution densities, identify multiple recombination events and generate a final corrected tree. Default priors  $R/\theta = 10^{-1}$ ,  $1/\delta = 10^{-3}$ ,  $\nu = 10^{-1}$  and mean branch length of  $10^{-4}$  were used. The reliability of each node was supported by 100

pseudo-bootstrap replicates, as suggested by Didelot et al. (Didelot and Wilson 2015). The R package "ape" v3.348 and the R package "PopGenome" v2.1.649 were used to compute the mean patristic branch length and transition/transversion ratio, respectively. The priors obtained from this mode were used as the initialization values to rerun ClonalFrameML under the "per-branch model" mode with a branch dispersion value of 0.1 (Oliveira et al. 2017).

## **Phylogenetic analysis**

For phylogenetic analysis of *P. aggregans* strain HW001<sup>T</sup>, phylogenetic trees based on 16S rRNA gene sequence were constructed using maximum-likelihood (ML), neighborjoining (NJ), and minimum-evolution (ME) algorithms in MEGA software package (version 7) (Kumar et al. 2016). To study the whole genome evolution of the life history of strain HW001<sup>T</sup>, the phylogenetic relationship between *P*. aggregans strain HW001<sup>T</sup> and 115 other Gammaproteobacteria strains was analyzed. The genomes of Sinorhizobium meliloti 1021 and Rhodospirillum rubrum ATCC 11,170 affiliated with Alphaproteobacteria, and genomes of Ralstonia solanacearum GMI1000 and Chromobacterium violaceum ATCC 12,472, and Neisseria meningitidis MC58 affiliated with Betaproteobacteria were used as outgroups. First, orthologous gene families were identified using the GET\_HO-MOLOGUES package (Contreras-Moreira and Vinuesa 2013), which carries out the algorithm of the OrthoMCL software (Li et al. 2003). Then a comprehensive data cluster of 83,234 orthologous gene families covering 116 strains was compiled. From these orthologous gene families, 20,903 single-copy gene families were obtained. Through screening, 102 single-copy shared gene families were selected for downstream phylogenomic analysis. These members in each gene family were aligned at the amino acid sequence level using MAFFT software (Katoh and Standley 2014) and deleted columns with gaps. Considering that different genomic regions may evolve independently, PartitionFinder software was used to perform data partition models (Lanfear et al. 2012). Then 31 partitions were obtained, which were identified as the best partition scheme based on the Bayesian information criterion (BIC). These 31 partitions were used to predict the LG amino acid substitution matrix (Le and Gascuel 2008) as the best model. In addition, the gamma distribution of rate variations (Yang 1996) and the predicted invariable site model was appropriate to all partitions. The resulting alignment was constructed using the RAxML version 8 (Stamatakis 2014) with LG substitution matrix and gamma model. Then, prediction of genome recombination was performed using ClonalFrameML (as shown in the previous section (Genome recombination)) to mitigate the effects of homologous recombination. Finally, a phylogenetic tree was mid-point rooted and performed using FigTree v1.4.4 (Rambaut 2018).

# **Molecular dating**

Two widely used dating methods, penalized likelihood implemented in the r8s software (r8s-PL) and Bayesian estimation with uncorrelated relaxed rates among lineages (BEAST), were used to process the dating analysis of strain HW001<sup>T</sup>. To estimate divergence dates in r8s (Luo et al. 2013; Sanderson 2003), a genome-wide molecular phylogenetic tree was constructed using RAxML version 8 software with a data partition model identified by PartitionFinder to calculate divergence time of *P. aggregans* strain HW001<sup>T</sup>, as shown in the previous section (Phylogenetic analysis) (Lanfear et al. 2012). A total of 89 genomes were sampled, including several that evolved from ancestral branches with the fossil records. A cyanobacterium, Gloeobacter violaceus PCC 7421, was used as the outgroup of the phylogenetic tree. This tree was calibrated by imposing constraints on several ancestral nodes, including cyanobacteria occurring around 2700-3500 mya (David and Alm 2011; Falcón et al. 2010), and akinetes that deviated from cyanobacteria at>1,500 mya (David and Alm 2011). Dating analyses were conducted on the basis of 100 bootstrapped trees with the identical topology. The chronogram of Gammaproteobacteria was displayed by using FigTree v1.4.4 software and modified by Adobe Illustrator CS6.

Another phylogeny was time-calibrated using the Bayesian algorithm in BEAST v2.6.4 (Bouckaert et al. 2014). For all analyses in BEAST, the same fixed topology (ML) based on the results of r8s-PL was used. Strict clock method with a Birth Death speciation process was used for all analyses. The range of origin dates of Rhizobium (in nodules) diverged from Agrobacterium (not in nodules) was calibrated with about 100-120 mya (Ochman and Wilson 1987). A normal prior was set with a mean value at the midpoint between the minimum and maximum values (node = 110.0). For all nodes, default prior was used, the mean and stdev were set to 1.0, and offset values were used. The assessment of chain convergence was done using Tracer 1.7.1 (Rambaut et al. 2018). A maximum clade credibility tree with mean heights was constructed with TreeAnnotator 2.2.1 (Burnin percentage: 50; Posterior probability limit: 0.0).

# Gene gain/loss prediction through ancestral reconstruction of genome content

For further comparative analysis, only genomes with completeness > 80% and contamination < 5% were considered. The phylogenetic tree and clusters of homologous protein were reconstructed for the remaining 54 genomes affiliated with Gammaproteobacteria and Betaproteobacteria (the outgroup in the reference tree). For further details, please refer to the Phylogenetic analysis section. An "all-againstall" protein sequence similarity search was conducted with DIAMOND v. 0.9.18 (Buchfink et al. 2015) ("more sensitive" mode with a maximum e value cutoff of  $10^{-5}$  and retaining up to 2500 hits). OrthoFinder v. 2.3.3 was applied to reconstruct orthologous gene families with default parameters (Emms and Kelly 2015). This yielded a total of 12,572 protein families. In order to predict gene gain and loss in *P. aggregans* strain HW001<sup>T</sup>, a maximum likelihood (ML) birth-and-death model was initially selected in the Count software (Csűös 2010; Nakjang et al. 2013). A gain-lossduplication model without any restrictions on lineage-specific rates was used to maximize the likelihood of phyletic pattern (vector of observed family sizes at terminal taxa). The gain-loss-duplication model was computed with the ML model parameters implemented in Count with Dollo parsimony. This approach is very strict, prohibiting multiple gain of genes (Hua et al. 2018). Using this method may reconstruct gene gain and loss events at both potential ancestors and observed species (Hua et al. 2018). In addition, the rates of gain, loss, and duplication were conducted based on four discrete gamma distributions. Functional annotation of gains and losses was performed using InterProScan v. 5.39-77.0 (Jones et al. 2014) and eggNOG 5.0 (Huerta-Cepas et al. 2019), including mapping InterPro entries to GO annotations.

# Horizontal gene transfer predictions

To further examine the role of HGT in the adaptation of strain HW001<sup>T</sup>, the automated pipeline HGTector2 (Zhu et al. 2014) was used to infer putative HGT genes. In this process, DIAMOND combined with the homologs of predicted genes retrieved from the NCBI-nr database was applied to search protein sequence similarity. The parameter settings mainly include sequence identity  $\geq$  30%, *E* value  $\leq$  1e<sup>-20</sup>, and coverage of query sequence  $\geq$  50%.

#### **Statistical analysis**

The codon adaptation index (CAI) value of genome gain of *P. aggregans* strain HW001<sup>T</sup> was determined using the CAI calculator (http://genomes.urv.cat/CAIcal/) (Puigbò et al. 2008). Physico-chemical parameters were obtained from the CAMERA database and used to compare with in situ environmental parameters in the present-day environments of *P. aggregans* strain HW001<sup>T</sup> (Toulza et al. 2012). The 54 Global Ocean Sampling (GOS) sites consist of four habitat types, including 24 coastal, 22 open ocean, 4 coral reefs, and 4 marine-derived lake (Antarctic) sites. According to the Pearson method, the coefficient relationship between sampling sites was calculated by "psych" in R (Revelle 2013;

Team 2013). The interaction between *P* value (<0.01) and  $\rho$  value ( $|\rho|$ > 0.7) was applied to construct networks using Cytoscape software (Kohl et al. 2011). Based on the 16S rRNA gene sequence of *P. aggregans* strain HW001<sup>T</sup>, the Integrated Microbial Next Generation Sequencing (IMNGS, https://www.imngs.org) server was applied to investigate the global distribution of *P. aggregans* strain HW001<sup>T</sup>. Threshold was set at 97% sequence similarity and minimum size was set to 200 bp (Lagkouvardos et al. 2016).

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Author contributions HW and RTH conceived and designed the experiments; SZ performed the experiments and drafted the manuscript; HW, RTH, and SZ revised the manuscript; HW supervised the project. The final manuscript was approved by all of the authors.

**Data availability** The genome sequence has been submitted to the Gen-Bank database under BioProject PRJNA526813 and accession number CP037953.

#### Declarations

**Conflict of interest** The authors declare that there is no conflict of interest.

Animal and human rights statement This article does not contain any studies performed with human and animals.

# References

- Arndt D, Grant JR, Marcu A, Sajed T, Pon A, Liang Y, Wishart DS (2016) PHASTER: a better, faster version of the PHAST phage search tool. Nucleic Acids Res 44:W16–W21
- Bein A, Dutton AR (1993) Origin, distribution, and movement of brine in the Permian Basin (USA): a model for displacement of connate brine. Geol Soc Am Bull 105:695–707
- Bertelli C, Laird MR, Williams KP, Group SFURC, Lau BY, Hoad G, Winsor GL, Brinkman FS (2017) IslandViewer 4: expanded prediction of genomic islands for larger-scale datasets. Nucleic Acids Res 45:W30–W35
- Bouckaert R, Heled J, Kühnert D, Vaughan T, Wu C-H, Xie D, Suchard MA, Rambaut A, Drummond AJ (2014) BEAST 2: a software platform for Bayesian evolutionary analysis. PLoS Comput Biol 10:e1003537
- Brissette JL, Russel M, Weiner L, Model P (1990) Phage shock protein, a stress protein of *Escherichia coli*. Proc Natl Acad Sci USA 87:862–866
- Buchfink B, Xie C, Huson DH (2015) Fast and sensitive protein alignment using DIAMOND. Nat Methods 12:59–60
- Caspi R, Altman T, Billington R, Dreher K, Foerster H, Fulcher CA, Holland TA, Keseler IM, Kothari A, Kubo A (2014) The

MetaCyc database of metabolic pathways and enzymes and the BioCyc collection of pathway/genome databases. Nucleic Acids Res 42:D459–D471

- Cheng L, Zou Y, Ding S, Zhang J, Yu X, Cao J, Lu G (2009) Polyamine accumulation in transgenic tomato enhances the tolerance to high temperature stress. J Integr Plant Biol 51:489–499
- Cheng C, Dong Z, Han X, Wang H, Jiang L, Sun J, Yang Y, Ma T, Shao C, Wang X, Chen Z, Fang W, Freitag NE, Huang H, Song H (2017) Thioredoxin A is essential for motility and contributes to host infection of *Listeria monocytogenes* via redox interactions. Front Cell Infect Microbiol 7:287
- Chew SC, Yang L (2016) Biofilms. In: Caballero B, Finglas P, Toldrá F (eds) Encyclopedia of food and health. Elsevier, Oxford, pp 407–415
- Contreras-Moreira B, Vinuesa P (2013) GET\_HOMOLOGUES, a versatile software package for scalable and robust microbial pangenome analysis. Appl Environ Microbiol 79:7696–7701
- Csűös M (2010) Count: evolutionary analysis of phylogenetic profiles with parsimony and likelihood. Bioinformatics 26:1910–1912
- Darling ACE, Mau B, Blattner FR, Perna NT (2004) Mauve: multiple alignment of conserved genomic sequence with rearrangements. Genome Res 14:1394–1403
- David LA, Alm EJ (2011) Rapid evolutionary innovation during an Archaean genetic expansion. Nature 469:93
- Denamur E, Matic I (2006) Evolution of mutation rates in bacteria. Mol Microbiol 60:820–827
- Didelot X, Wilson D (2015) ClonalFrameML: efficient inference of recombination in whole bacterial genomes. PLoS Comput Biol 11:e1004041
- Drula E, Garron ML, Dogan S, Lombard V, Henrissat B, Terrapon N (2022) The carbohydrate-active enzyme database: functions and literature. Nucleic Acids Res 50:D571–D577
- Emms DM, Kelly S (2015) Orthofinder: solving fundamental biases in whole genome comparisons dramatically improves orthogroup inference accuracy. Genome Biol 16:157
- Falcón LI, Magallón S, Castillo A (2010) Dating the cyanobacterial ancestor of the chloroplast. ISME J 4:777–783
- Fernández P, Porrini L, Albanesi D, Abriata LA, Dal Peraro M, De Mendoza D, Mansilla MC (2019) Transmembrane prolines mediate signal sensing and decoding in *Bacillus subtilis* DesK histidine kinase. mBio 10:e02564-19
- Freeman ZN, Dorus S, Waterfield NR (2013) The KdpD/KdpE twocomponent system: integrating K<sup>+</sup> homeostasis and virulence. PLoS Pathog 9:e1003201
- Gram L, Grossart H-P, Schlingloff A, Kiørboe T (2002) Possible quorum sensing in marine snow bacteria: production of acylated homoserine lactones by *Roseobacter* strains isolated from marine snow. Appl Environ Microbiol 68:4111–4116
- Gruber N (2008) The marine nitrogen cycle: overview and challenges. Nitrogen Mar Environ 2:1–50
- Ho SYW, Duchêne S (2014) Molecular-clock methods for estimating evolutionary rates and timescales. Mol Ecol 2324:5947–5965
- Höltje J-V (1998) Growth of the stress-bearing and shape-maintaining murein sacculus of *Escherichia coli*. Microbiol Mol Biol Rev 62:181–203
- Hong Y, Youshao W, Chen F (2013) Archaea dominate ammonia oxidizers in the Permian water ecosystem of midland basin. Microbes Environ 28:396–399
- Hua ZS, Qu YN, Zhu Q, Zhou EM, Qi YL, Yin YR, Rao YZ, Tian Y, Li YX, Liu L, Castelle CJ, Hedlund BP, Shu WS, Knight R, Li WJ (2018) Genomic inference of the metabolism and evolution of the archaeal phylum Aigarchaeota. Nat Commun 9:1–11
- Huerta-Cepas J, Szklarczyk D, Heller D, Hernández-Plaza A, Forslund SK, Cook H, Mende DR, Letunic I, Rattei T, Jensen LJ, von Mering C, Bork P (2019) eggNOG 5.0: a hierarchical, functionally

and phylogenetically annotated orthology resource based on 5090 organisms and 2502 viruses. Nucleic Acids Res 47:D309–D314

- Jones P, Binns D, Chang H-Y, Fraser M, Li W, McAnulla C, McWilliam H, Maslen J, Mitchell A, Nuka G, Pesseat S, Quinn AF, Sangrador-Vegas A, Scheremetjew M, Yong S-Y, Lopez R, Hunter S (2014) InterProScan 5: Genome-scale protein function classification. Bioinformatics 30:1236–1240
- Katoh K, Standley DM (2014) MAFFT: iterative refinement and additional methods. Methods Mol Biol 1079:131–146
- Kim JG, Park SJ, Sinninghe Damsté JS, Schouten S, Rijpstra WIC, Jung WY, Kim SJ, Gwak JH, Hong H, Si OJ, Lee SH, Madsen EL, Rhee SK (2016) Hydrogen peroxide detoxification is a key mechanism for growth of ammonia-oxidizing archaea. Proc Natl Acad Sci USA 113:7888–7893
- Kleerebezem M, Crielaard W, Tommassen J (1996) Involvement of stress protein *PspA* (phage shock protein A) of *Escherichia coli* in maintenance of the protonmotive force under stress conditions. EMBO J 15:162–171
- Knight DR, Elliott B, Chang BJ, Perkins TT, Riley TV (2015) Diversity and evolution in the genome of *Clostridium difficile*. Clinical Microbiol Rev 28:721–741
- Kohl M, Wiese S, Warscheid B (2011) Cytoscape: software for visualization and analysis of biological networks. Methods Mol Biol 696:291–303
- Kumar S, Stecher G, Tamura K (2016) MEGA7: molecular evolutionary genetics analysis version 7.0 for bigger datasets. Mol Biol Evol 33:1870–1874
- Lagkouvardos I, Joseph D, Kapfhammer M, Giritli S, Horn M, Haller D, Clavel T (2016) IMNGS: a comprehensive open resource of processed 16S rRNA microbial profiles for ecology and diversity studies. Sci Rep 6:33721
- Lanfear R, Calcott B, Ho SY, Guindon S (2012) PartitionFinder: combined selection of partitioning schemes and substitution models for phylogenetic analyses. Mol Biol Evol 29:1695–1701
- Langenheder S, Comte J, Zha Y, Samad MS, Sinclair L, Eiler A, Lindstrom ES (2016) Remnants of marine bacterial communities can be retrieved from deep sediments in lakes of marine origin. Environ Microbiol Rep 8:479–485
- Latasa C, Roux A, Toledo-Arana A, Ghigo J-M, Gamazo C, Penadés JR, Lasa I (2005) BapA, a large secreted protein required for biofilm formation and host colonization of *Salmonella enterica* serovar Enteritidis. Mol Microbiol 58:1322–1339
- Le SQ, Gascuel O (2008) An improved general amino acid replacement matrix. Mol Biol Evol 25:1307–1320
- Li L, Stoeckert CJ, Roos DS (2003) OrthoMCL: identification of ortholog groups for eukaryotic genomes. Genome Res 13:2178–2189
- Luo H, Csürös M, Hughes AL, Moran MA (2013) Evolution of divergent life history strategies in marine Alphaproteobacteria. mBio 4:e00373-13
- Luo ZH, Narsing Rao MP, Chen H, Hua ZS, Li Q, Hedlund BP, Dong ZY, Liu BB, Guo SX, Shu WS, Li WJ (2021) Genomic insights of "Candidatus Nitrosocaldaceae" based on nine new metagenomeassembled genomes, including "Candidatus Nitrosochermus" gen nov. and two new species of "Candidatus Nitrosocaldus." Front Microbiol 11:3412
- Martin DP, Murrell B, Khoosal A, Muhire B (2017) Detecting and analyzing genetic recombination using RDP4. In: Keith JM (ed) Methods in molecular biology. Humana, Totowa, pp 433–460
- Mello B (2018) Estimating timetrees with MEGA and the TimeTree resource. Mol Biol Evol 35:2334–2342
- Misof B, Liu S, Meusemann K, Peters RS, Donath A, Mayer C, Frandsen PB, Ware J, Flouri T, Beutel RG, Niehuis O, Petersen M, Izquierdo-Carrasco F, Wappler T, Rust J, Aberer AJ, Aspöck U, Aspöck H, Bartel D, Blanke A et al (2014) Phylogenomics

resolves the timing and pattern of insect evolution. Science 346:763-767

- Moran MA, Buchan A, González JM, Heidelberg JF, Whitman WB, Kiene RP, Henriksen JR, King GM, Belas R, Fuqua C (2004) Genome sequence of *Silicibacter pomeroyi* reveals adaptations to the marine environment. Nature 432:910
- Mori JF, Scott JJ, Hager KW, Moyer CL, Kusel K, Emerson D (2017) Physiological and ecological implications of an iron- or hydrogenoxidizing member of the Zetaproteobacteria, *Ghiorsea bivora*, gen. nov., sp. nov. ISME J 11:2624–2636
- Nakjang S, Williams TA, Heinz E, Watson AK, Foster PG, Sendra KM, Heaps SE, Hirt RP, Martin Embley T (2013) Reduction and expansion in microsporidian genome evolution: new insights from comparative genomics. Genome Biol Evol 5:2285–2303
- Ochman H, Wilson AC (1987) Evolution in bacteria: evidence for a universal substitution rate in cellular genomes. J Mol Evol 26:74–86
- Ogilvie BG, Rutter M, Nedwell DB (1997) Selection by temperature of nitrate-reducing bacteria from estuarine sediments: species composition and competition for nitrate. FEMS Microbiol Ecol 23:11–22
- Oliveira PH, Touchon M, Cury J, Rocha EP (2017) The chromosomal organization of horizontal gene transfer in bacteria. Nat Commun 8:1–11
- Puigbò P, Bravo IG, Garcia-Vallve S (2008) CAIcal: a combined set of tools to assess codon usage adaptation. Biol Direct 3:38
- Rambaut A (2018) Figtree, a graphical viewer of phylogenetic trees, version 1.4. 4. Institute of evolutionary biology, University of Edinburgh
- Rambaut A, Drummond AJ, Xie D, Baele G, Suchard MA (2018) Posterior summarization in Bayesian phylogenetics using Tracer 1.7. Syst Biol 67:901–904
- Rand L, Hinds J, Springer B, Sander P, Buxton RS, Davis EO (2003) The majority of inducible DNA repair genes in *Mycobacterium tuberculosis* are induced independently of RecA. Mol Microbiol 50:1031–1042
- Revelle WR (2013) psych: procedures for personality and psychological research. Available http://CRAN.R-project.org/package=psych Version = 1.3.10. Accessed 20 Dec 2013
- Sanderson MJ (2003) r8s: inferring absolute rates of molecular evolution and divergence times in the absence of a molecular clock. Bioinformatics 19:301–302
- Seemann T (2014) Prokka: rapid prokaryotic genome annotation. Bioinformatics 30:2068–2069
- Stamatakis A (2014) RAxML version 8: a tool for phylogenetic analysis and post-analysis of large phylogenies. Bioinformatics 30:1312–1313
- Sun H, Xiao Y, Gao Y, Zhang G, Casey JF, Shen Y (2018) Rapid enhancement of chemical weathering recorded by extremely light seawater lithium isotopes at the Permian-Triassic boundary. Proc Natl Acad Sci USA 115:3782–3787
- Team RC (2013) R: A language and environment for statistical computing. Available http://www.R-project.org. Accessed 2 Feb 2013
- Toulza E, Tagliabue A, Blain S, Piganeau G (2012) Analysis of the Global Ocean Sampling (GOS) project for trends in iron uptake by surface ocean microbes. PLoS ONE 7:e30931

- Troxell B, Hassan HM (2013) Transcriptional regulation by Ferric Uptake Regulator (Fur) in pathogenic bacteria. Front Cell Infect Microbiol 3:59
- Wang H, Laughinghouse HD, Anderson MA, Chen F, Williams E, Place AR, Zmora O, Zohar Y, Zheng T, Hill RT (2012) Novel bacterial isolate from Permian groundwater, capable of aggregating potential biofuel-producing microalga *Nannochloropsis oceanica* IMET1. Appl Environ Microbiol 78:1445–1453
- Wang H, Zheng T, Hill RT, Hu X (2014) Permianibacter aggregans gen. nov., sp. nov., a bacterium of the family Pseudomonadaceae capable of aggregating potential biofuel-producing microalgae. Int J Syst Evol Microbiol 64:3503–3507
- Wright WR (2011) Pennsylvanian paleodepositional evolution of the greater Permian Basin, Texas and New Mexico: depositional systems and hydrocarbon reservoir analysis. AAPG Bull 95:1525–1555
- Xiao R, Zheng Y (2016) Overview of microalgal extracellular polymeric substances (EPS) and their applications. Biotechnol Adv 34:1225–1244
- Xiao R, Yang X, Li M, Li X, Wei Y, Cao M, Ragauskas A, Thies M, Ding J, Zheng Y (2018) Investigation of composition, structure and bioactivity of extracellular polymeric substances from original and stress-induced strains of *Thraustochytrium striatum*. Carbohyd Polym 195:515–524
- Yang Z (1996) Among-site rate variation and its impact on phylogenetic analyses. Trends Ecol Evol 11:367–372
- Yarza P, Yilmaz P, Pruesse E, Glöckner FO, Ludwig W, Schleifer K-H, Whitman WB, Euzéby J, Amann R, Rosselló-Móra R (2014) Uniting the classification of cultured and uncultured bacteria and archaea using 16S rRNA gene sequences. Nat Rev Microbiol 12:635–645
- Yin S, Chen D, Chen L, Edis R (2002) Dissimilatory nitrate reduction to ammonium and responsible microorganisms in two Chinese and Australian paddy soils. Soil Biol Biochemi 34:1131–1137
- Yoon S-H, Ha S-M, Lim J, Kwon S, Chun J (2017) A large-scale evaluation of algorithms to calculate average nucleotide identity. Ant v Leeuwenhoek 110:1281–1286
- Zhaxybayeva O, Swithers KS, Lapierre P, Fournier GP, Bickhart DM, DeBoy RT, Nelsond KE, Nesbøe CL, Doolittlea WF, Gogarten JP, Noll KM (2009) On the chimeric nature, thermophilic origin, and phylogenetic placement of the Thermotogales. Proc Natl Acad Sci USA 106:5865–5870
- Zhu Q, Kosoy M, Dittmar K (2014) HGTector: an automated method facilitating genome-wide discovery of putative horizontal gene transfers. BMC Genomics 15:1–18

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