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Reconstructing metabolic pathways of hydrocarbon-degrading bacteria from the Deepwater Horizon oil spill

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The Deepwater Horizon blowout in the Gulf of Mexico in 2010, one of the largest marine oil spills¹, changed bacterial communities in the water column and sediment as they responded to complex hydrocarbon mixtures²⁻⁴. Shifts in community composition have been correlated to the microbial degradation and use of hydrocarbons^{2,5,6}, but the full genetic potential and taxon-specific metabolisms of bacterial hydrocarbon degraders remain unresolved. Here, we have reconstructed draft genomes of marine bacteria enriched from sea surface and deep plume waters of the spill that assimilate alkane and polycyclic aromatic 10 hydrocarbons during stable-isotope probing experiments, and we 11 identify genes of hydrocarbon degradation pathways. Alkane 12 13 degradation genes were ubiquitous in the assembled genomes. Marinobacter was enriched with n-hexadecane, and uncultured 14 Alpha- and Gammaproteobacteria populations were enriched in 15 the polycyclic aromatic hydrocarbon-degrading communities and 16 contained a broad gene set for degrading phenanthrene and 17 naphthalene. The repertoire of polycyclic aromatic hydrocarbon 18 use varied among different bacterial taxa and the combined 19 capabilities of the microbial community exceeded those of 20 its individual components, indicating that the degradation of 21 complex hydrocarbon mixtures requires the non-redundant 22 capabilities of a complex oil-degrading community. **O1** 23

Marine microorganisms derive energy and carbon from the degra-24 dation of petroleum hydrocarbons and drive the bioremediation 25 process during anthropogenic oil spills, such as the Deepwater 26 Horizon (DWH) spill^{2,4,7-9}. Various uncultured bacteria, primarily 27 belonging to Oceanospirillales and other Gammaproteobacteria, 28 were enriched during the DWH spill and are believed to have 29 played a major role in oil degradation^{2,3,10-12}. However, this assump-30 tion relies on the dominance of these organisms in environmental 31 sequencing surveys, whereas the metabolic potential and pathways 32 33 for degrading hydrocarbons in bacterial populations, which demonstrably assimilate these compounds, remain to be determined. To 34 address this question, we obtained ~113 Gb of shotgun metagenomic 35 data from hydrocarbon-degrading enrichments using stable-isotope 36 probing (SIP) experiments¹³. Enrichments were obtained from weath-37 ered hydrocarbons floating on the sea surface and from the subsurface 38 hydrocarbon plume, collected during the DWH oil spill in 2010. The 39 plume sample was incubated with 13 C-labelled *n*-hexadecane (HEX), 40 and the sea surface sample was separately incubated with ¹³C-labelled 41 naphthalene (NAP) or phenanthrene (PHE) in SIP experiments¹³. 42 De novo assembly and (tetranucleotide signature) binning of meta-43 genomic sequences from the ¹³C-labelled fractions allowed the reconstruction of 7 high-quality (completeness of 52-95%) and 17

fragmentary draft genomes (completeness <50%), as well as ~13% 46 of unbinned scaffolds (see Methods, Supplementary Table 1 and 47 Supplementary Fig. 1). 48

We first annotated genes within all assembled genomes. 49 Taxonomic assignment of annotated genes in the HEX, NAP 50 and PHE assemblies revealed distinct bacterial communities 51 (Supplementary Fig. 2a,b). Marinobacter and Alcanivorax dominated the HEX-degrading community, and Alteromonas and 53 Cycloclasticus were abundant in NAP and PHE samples, respect- 54 ively. This community spectrum coincided with results from the 55 previous SIP-based analysis of the same samples using 16S rRNA 56 clone sequencing¹³. To identify taxa representing the seven high-57 quality draft genomes, we constructed a phylogenetic tree using 58 up to 15 ribosomal proteins (Fig. 1 and Supplementary Table 1). 59 We recovered a 95% complete Marinobacter genome from the 60 HEX enrichment, designated H-Mar (99% inferred protein simi- 61 larity to Marinobacter salarius R9SW1, Fig. 1 and Supplementary 62 Table 1). From the NAP-degrading community we reconstructed 63 two gammaproteobacterial genomes belonging to Oceanospirillales 64 (N-Alc, 73% similar to Alcanivorax sp. 43B GOM-46m, 84% com-65 plete) and Alteromonadales (N-Alt, 86% similar to Alteromonas 66 macleodii English Channel 673, 80% complete). An additional 67 93% complete alphaproteobacterial genome belonged to the order 68 Rhodospirillales (N-Tha, 99% similar to Thalassospira profundi- 69 maris WP0211). Three genomes from the PHE-degrading commu- 70 nities included a bacterium 83% similar to Cycloclasticus pugetii 71 PS-134H (P-Cyc, 52% complete), an Oceanospirillales member 72 with 73% similarity to Neptuniibacter caesariensis MED92 (P-Nep, 73 86% complete) and a member of the Alteromonadales with 64% 74 similarity to Colwellia psychrerythraea 34H (P-Col, 70% complete). 75

The NAP-enriched taxa *Rhodospirillales*, *Oceanospirillales* and 76 *Alteromonadales* (N-Tha, N-Alc and N-Alt) were previously associated with hydrocarbon degradation. For example, isolates of the 78 order *Alteromonadales* showed alkane and polycyclic aromatic 79 hydrocarbon (PAH)-degrading activity in previous SIP experiments¹³. The order *Rhodospirillales* accumulated during the 81 DWH spill in sea surface samples, and isolates of this order, such 82 as *Thalassospira tepidiphila*, degrade PAHs^{3,14}. We also assembled 83 one genome belonging to *Alcanivorax* from the NAP-degrading 84 community (N-Alc), a genus that was barely detected in the spill itself but was present in the previous SIP experiments¹³. Additionally, 86 *Alcanivorax* was abundant in HEX enrichments (Supplementary 87 Fig. 2b). Although *Alcanivorax* isolates degrade alkane hydro-88 carbons and none have been described to metabolize PAHs^{13,15}, 89 *Alcanivorax* was previously detected in bacterial consortia growing 90

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Figure 1 | Phylogenetic characterization of genomic bins reconstructed from three SIP enrichments. Maximum-likelihood-based phylogenetic tree of up to 15 concatenated ribosomal proteins (rpL2, 3, 4, 5, 6, 14, 15, 18, 22, 24 and rpS3, 8, 10, 17, 19) from seven high-quality genomes assembled from the *n*-hexadecane (H), naphthalene (N) and phenanthrene (P) SIP enrichments (bold). Two genomes from previously published DWH plume-derived metagenomes are indicated in italics^{10,46}. Bootstrap values were generated using MrBayes. Two *Planctomycetes* strains were used as outgroup. Black, grey and white circles: nodes with bootstrap values of 100, 75-100 and <75% (1,000 replicates).

on pyrene as the sole carbon source^{16,17}. Thus, the NAP enrichment
 of *Alcanivorax* supports a broader versatility in *Alcanivorax* for
 degrading not only alkanes but also PAHs, potentially by participating
 in bacterial consortia that fully metabolize PAHs.

Focusing on the PHE-degrading community, the genera 5 Cycloclasticus, Colwellia and Neptuniibacter (corresponding to 6 P-Cyc, P-Col and P-Nep) represented 66, 13 and 3% of clones in 7 previous PHE-SIP experiments, respectively¹³. Notably, the 8 Cycloclasticus 16S rRNA phylotype recovered from the previous SIP 9 study was >99% similar to the most dominant Cycloclasticus phylotype 10 that was enriched at the sea surface during the spill¹³. Concordantly, 11 Colwellia was enriched in laboratory experiments in dispersant-oil 12 microcosms¹⁸. Thus, the assembled genomes represent abundant, as 13 well as rare, hydrocarbon-degrading DWH spill community members. 14 16S rRNA gene sequences recovered from the SIP assemblies co-15 clustered with sequences derived from the previous SIP experiments 16 and partially with sequences enriched in surface and plume samples during the spill (Supplementary Fig. 3)^{2,3,13}. These clustering patterns 18 therefore indicate that the bacterial lineages present in our metagenomic 19 assemblies were present during the spill and do not represent artefacts of 20 the SIP experiment. To confirm this inference, we mapped our SIP 21 assemblies to published plume-derived metagenomic and metatran-22 scriptomic data sets10. The HEX-degrading assembly recruited 2.7 23 and 0.8% of metagenomic reads from plume and unpolluted samples, 24 respectively (Supplementary Table 2). Annotated genes from the HEX 25 assembly matched 6.3 and 1.3% of metatranscriptomic reads from 26 samples collected proximal and distal, respectively, from the plume 27 (Supplementary Table 2 and Supplementary Figs 4 and 5). This suggests 28 29 that genes from our assembled genomes were enriched and more highly

expressed with increasing hydrocarbon exposure. However, despite the 30 percentage of mapped reads, we were unable to locate specific alkane-31 degradation genes, possibly due to insufficient sequencing depth that 32 would allow covering non-abundant taxa (Supplementary Fig. 5). 33 No metagenomic data set from the sea surface of the spill is available; 34 but based on previous 16S rRNA gene studies, *Alphaproteobacteria* 35 (that is, order *Rhodospirillales*) as well as *Gammaproteobacteria* 36 (orders *Alteromonadales* and *Oceanospirillales*) were enriched in 37 oil-contaminated sea surface samples³. Thus, the lineages reconstructed in our assemblies reflect (or resemble) those enriched in 39 hydrocarbon-contaminated sea surface communities. 40

To identify genes that enabled bacterial community members to 41 be enriched during the DWH spill, we compared the gene content 42 between the different hydrocarbon-degrading communities obtained 43 in the SIP assemblies. Of the detected 4,756 unique gene functions, 44 ~40% were shared and 4, 13 and 22% were unique among the 45 HEX, NAP and PHE assemblies, respectively (Supplementary Fig. 6 46 and Supplementary Data 1). The PHE enrichment showed selection 47 for serine/threonine kinases, while the HEX samples encoded for 48 abundant short-chain dehydrogenases and the NAP assembly was 49 enriched for tripartite ATP-independent periplasmic (TRAP) trans- 50 porters. The serine/threonine kinases phosphorylate serine, threonine 51 and tyrosine are proposed mediators of bacteria-bacteria interactions, 52 while TRAP transporters function in osmoregulated solute transport^{19,20}. 53 Additionally, several functional categories were present in individ- 54 ual genomic bins (Fig. 2 and Supplementary Data 2). Five of seven 55 genomes carried genes for bacterial chemotaxis and six of seven 56 for flagella biosynthesis, hinting at active motility and therefore the 57 ability to move towards oil substrates. Additionally, P-Col encoded 58

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Figure 2 | Abundance of functional categories detected within the reconstructed genomes. Functional categories detected in the seven draft genomes assembled from the *n*-hexadecane (H), naphthalene (N) and phenanthrene (P) SIP enrichments. Functional categories are based on the SEED subsystems³⁶ and were compared against genes annotated within each metagenomic bin using blastp (e-value cutoff of 1e-20). Numbers in parentheses: total number of genes within each functional category. Percentage: per cent of total number of genes per subsystem found within each bin.

for several denitrification genes (13 of 21 tested genes), including 1 norB/C, nosR and nosD, while P-Nep appears able to oxidize 2 sulfur (that is, including soxA-D and sulfite oxidase), implying rel-3 evance for degrading sulfur-containing components of oil and the 4 5 applied dispersant Corexit. Suggesting physiological adaptations to phosphorous and iron limitation, most genomic bins contained 6 genes relevant for phosphate starvation or siderophore biosynthesis, such as staphylobactin (that is, phoH and sbnA; Supplementary Data 9 2). The presence of major genes for motility and for use of scarce nutrients suggests that the enriched organisms are well adapted 10 for chemotactic motility towards their hydrocarbon substrates and 11 for physiological responses to nutrient-limiting conditions that 12 characterize oil-induced bacterial blooms²¹. Alternatively, these 13 14 genes might be of general importance for survival and growth in the Gulf of Mexico. 15

To resolve the hydrocarbon degradation pathways in the assembled bacterial genomes, we searched for homologues to known degradation genes. An entire pathway for alkane degradation was found in H-Mar (Marinobacter), the dominant genus in the HEX-degrading commu- 19 nity (Fig. 3a and Supplementary Figs 1 and 2). This result is consistent 20 with isolates of Marinobacter being able to degrade HEX, increasing 21 Marinobacter abundance in DWH plume samples as validated by 22 fluorescence in situ hybridization (FISH), and enrichment of 23 genes for alkane degradation in metatranscriptomes from the 24 DWH spill and the Gulf coast^{2,10,22,23}. Additionally, we recon- 25 structed the alkane-degradation pathway in most of the genomes 26 from the NAP- and PHE-degrading bins (Fig. 3a). However, 27 based on the SIP approach, only a subset of bacteria appears to 28 actively employ these pathways-Marinobacter (H-Mar)-and 29 potentially outcompete other alkane-degrading bacteria, such as 30 Alcanivorax (N-Alc). To validate this finding, metatranscriptomic 31 sequencing could be used to map active gene expression to our 32 assembled draft genomes. One unique feature of the active alkane- 33 degrader H-Mar is the presence of genes encoding for the type VI 34 secretion system^{24,25}, which were mostly absent from all other 35 genomic bins (Fig. 2). The type VI secretion system is involved in 36

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Figure 3 | Distribution of key alkane and polycyclic hydrocarbon degradation pathways in reconstructed genomes. **a**, Metabolic reconstruction of the *n*-hexadecane (HEX) degradation pathway within seven high-quality metagenomic bins. **b**, Metabolic reconstruction of naphthalene (NAP) and phenanthrene (PHE) degradation pathways within seven high-quality genomes. Purple, green, blue: HEX, NAP and PHE-degrading bins, respectively.

inter-bacterial competition and has been discussed to be relevant
 for alkane assimilation^{24,25}, and thus could provide H-Mar with a
 competitive advantage over other non-active alkane degraders.

To characterize PAH degradation pathways in SIP-enriched bacteria, we identified genes encoding for enzymes in both NAP- and PHE-degradation pathways in our assembled genomes (Fig. 3b). 6

Of 41 described NAP- and PHE-degradation genes, 19 were present in >50% of genomes, while a subset of genes, such as *nahC*, salicylate hydroxylase or *phdF*, were only detectable in a few genomes. For 3 example, within N-Tha, N-Alc and N-Alt, we were unable to annotate the full known NAP-degradation pathway. N-Tha 5 (Thalassospira profundimaris) is equipped to degrade NAP to sali-6 cylate, but lacks the salicylate hydroxylase, which converts salicylate catechol. Only the fragmentary genome NAP-25 to 8 (Oceanospirillales) encoded the gene for this step among the 9 assembled genomes from the NAP enrichments. Similarly, the 10 extradiol dioxygenase (PhdF), which converts 3,4-dihydroxyphe-11 nanthrene to 2-hydroxybenzochromene-2-carboxylic acid early on 12 in the PHE-degradation pathway, was only detected in P-Cyc 13 (Cycloclasticus). Unless all pathway gaps are without exception 14 ascribed to sequencing gaps within the genomic bins, a more parsi-15 monious interpretation of these results suggests that alternative 16 genes and enzymes for these individual steps exist, which are not 17 represented in gene databases. Alternatively, coordinated commu-18 nity activity might be required to completely degrade polycyclic 19 20 hydrocarbons during the DWH spill.

Our study combines metagenomics and SIP, allowing the 21 assembly of genomes from active hydrocarbon-degrading bacteria 22 present during the DWH spill, and enriched from deep plume and 23 surface samples based on alkane and PAH assimilation. All 24 25 assembled genomes possessed pathways for alkane and PAH degradation, suggesting that several taxa actively degraded 26 hydrocarbons during the spill (Fig. 3). For example, H-Mar 27 (Oceanospirillales) corresponds to Marinobacter salarius, which 28 degrades alkanes in the plume, and the bacterium that constitutes 29 30 N-Tha (Rhodospirillales) was responsible for degradation of PAHs at the sea surface. These taxa were enriched during the spill and 31 their genes for hydrocarbon degradation were detected in the 32 plume and sea surface^{2,3,10,22,26}. However, the plume-derived 33 genome (H-Mar) appears to be enriched only at a low relative 34 35 abundance compared to previous data sets, where an uncharacterized Oceanospirillales represented >60% of sequence reads¹⁰. This 36 disparity suggests that low-abundant community members were 37 active during the spill, as observed in deep-sea hydrothermal 38 plumes²⁷. Additionally, differences between bacterial taxa detected 39 during the DWH spill compared to SIP enrichments could be a 40 reflection of the experimental set-up. For example, no dispersant 41 was added during the experiment, but Corexit was added during 42 the spill^{13,28} and found to select against Marinobacter in micro-43 cosm experiments¹⁸. Additionally, the SIP procedure required 44 45 incubation steps at room temperature instead of 4 °C to obtain sufficient incorporation of the ¹³C label into DNA for SIP¹³. 46 Such temperature shifts have been demonstrated to induce 47 changes in plume bacterial community composition³. Whole-48 community gene expression studies will be required to evaluate 49 the activity of our assembled genomes in their native 50 community context. 51

Within the constraints inherent to the SIP experimental approach, combining SIP with metagenomics enabled us to identify 53 and analyse hydrocarbon-degrading pathways within several uncul-54 55 tured bacteria. Bacteria that are usually not associated with PAH 56 degradation (that is, members of Alcanivorax in the NAP enrichments) persisted at sufficiently high levels for metagenomic recon-57 struction, indicating that complete pathways for the degradation 58 of PAHs may not be obligatory for individual community 59 members that thrive in PAH-degrading enrichments. Although we 60 cannot exclude that genes for hydrocarbon degradation were 61 missed in our assemblies, the apparent partitioning of key 62 pathway steps to individual community members suggests an alter-63 nate hypothesis, in that complete degradation of a complex mixture 64 of PAHs requires the coordinated response of a complex bacterial 65 community and the coordination of its metabolic pathways.

Sample collection and preparation. DNA samples for metagenomic reconstruction were obtained from a previously published stable-isotope probing (SIP) 69 experiment13. Briefly, an oil-contaminated sea surface sample (original ID PE5) was 70 collected near a site of the DWH spill (28°44.175' N, 88°22.335' W) in the Gulf of 71 Mexico on 5 May 2010. Two deep hydrocarbon plume samples (original ID B3 72 and B6, biological replicates) were collected near the Macondo wellhead 73 (28°41.686' N, 88°26.081' W) at depths of 1,170 and 1,210 m on 31 May 2010 and 74 combined for the SIP experiment. Sea surface and plume samples were collected at 75 ~0.86 and 3.5 m from the wellhead. SIP experiments for the plume sample (B3+B6) 76 were performed with ¹³C-labelled HEX and for the sea surface sample (PE5) with ¹³C-labelled NAP or PHE (yielding a total of three samples). Incubations containing 78 solely ¹²C-unlabelled substrate were run in parallel to act as unlabelled controls. 79 Total DNA from labelled and unlabelled incubations from each of the three SIP 80 experiments was extracted as described previously²⁹. Extracted labelled and 81 unlabelled DNA (0.7 to 1.0 µg for each sample) was separated using CsCl gradient 82 ultracentrifugation¹³. To prepare these previously processed SIP samples for 83 sequencing, DNA concentrations were measured using a Qubit 3.0 Fluorometer and 84 a final concentration of 10 ng μ l⁻¹ for each sample (using a total amount of 100 ng) 85 from the heavy-labelled fraction was used to prepare libraries for paired-end 86 Illumina (HiSeq 2500) sequencing. 87

Metagenomic assembly and binning. Illumina library preparation and sequencing 88 was performed by the Genome Sequencing and Analysis Facility (GSAF) at the University of Texas at Austin. For each of the three samples, two Illumina libraries 90 were prepared and sequenced (technical replicates). Sequencing was performed on 91 an Illumina HiSeq 2500 with the following specifications: high-throughput run 92 mode, run type paired end 2×125 bp, 6×4.0 E8 target reads (millions), insert size of 93 ~360-420 bp and ~5% PhiX control spike-in. This sequencing approach provided 94 ~113 Gb of sequencing data (373,279,006, 289,782,708 and 246,243,202 reads from 95 the HEX, NAP and PHE samples, respectively). Raw Illumina shotgun genomic 96 reads were separated from Illumina artefacts by removing the adaptors and DNA 97 spike-ins from the forward and reverse reads. Therefore, a sliding window approach using a kmer size of 28 and a step size of 1 was used. Reads with \geq 3 Ns, an average 99 score of <Q20 and a read length of <50 bps were removed using cutadapt (yielding 100 886,823,725 total reads)³⁰. Afterwards, reads were interleaved using interleave_fasta. 101 py and the interleaved sequences were trimmed using Sickle and a minimum quality 102 cutoff of 5 (yielding 877,414,119 total reads)³¹. The script for interleave_fasta.py can 103 be found at https://github.com/jorvis/biocode/blob/master/fasta/interleave_fasta.py. 104 Metagenomic reads from all SIP samples were individually assembled using 105 IDBA-UD and the following parameters: -pre_correction, -mink 75, -maxk 105, 106 -step 10, -seed_kmer 55 (ref. 32). This yielded a total of 2,739,076 scaffolds from all 107 three SIP enrichments. The minimum and maximum scaffold length ranged from 108 200 to 130,027 bp 109

Metagenomic binning was performed on assembled SIP enrichments using 110 tetranucleotide frequencies on scaffolds with a length \geq 4,000 bp (including a total of 111 4,874 scaffolds)³³. The resulting emerging self-organizing maps (ESOMs) were 112 manually sorted and curated (Supplementary Fig. 1)³³. Metagenomic binning was 113 enhanced by incorporating reference genomes as genetic signatures for the 114 assembled contigs into ESOMs^{33,34}. In this way we assembled 7 high-quality and 17 115 fragmentary metagenomic bins (completeness threshold of 50%). The seven high- 116 quality genomes showed a completeness ranging from 52–95%, included 1,492/4,874 117 scaffolds with a scaffold length between 4,006 and 257,386 bp. The 17 fragmentary 118 genomes displayed a completeness below 50% and comprised 2,737/4,874 scaffolds 119 that ranged from 4,000 to 44,889 bp. Additionally, 645/4,874 scaffolds remained 120 unbinned (4,002-77,080 bp length). After binning, draft genomes were linked to the 121 SIP enrichments based on their unique scaffold ID. CheckM was used to evaluate the 122 accuracy of the binning approach by determining the percentage of completeness 123 and contamination (Supplementary Table 1)35. Contaminants that were identified 124 based on their phylogenetic placement (wrong taxonomic assignment compared to 125 the average taxonomic assignment of the genes assigned to each bin; see section on 126 taxonomic assignment), GC content (>25% difference compared to the mean of all 127 scaffolds assigned to each bin) or confidence level (below 0.5) were manually 128 removed from the bins. 129

Gene calling, taxonomic assignment and functional characterization. Gene 130 calling and taxonomic assignment of the three SIP enrichments and seven 131 high-quality draft genomes were performed using the Joint Genome 132 Institute-Production Genomics Facility (JGI-PGF) Integrated Microbial Genomes with Microbiome (IMG/M) system. To achieve this, the complete assemblies 134 from the three SIP enrichments were uploaded onto the JGI server. The retrieved JGI 135 output was linked to the seven draft genomes using their unique scaffold IDs. 136 The JGI output summarizing the taxonomic assignment of all gene annotations was 137 used to depict the taxonomic composition as shown in Supplementary Fig. 2. 138 The JGI-based amino-acid sequences were used as a database for blastp searches 139 (as indicated in the text). 140 O5

For the functional characterization of our draft genomes, a reference gene 141 database was assembled by downloading SEED subsystems using the network-based 142 SEED API (function svr_all_subsystems)³⁶. The SEED-based reference database was 143

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- manually curated to include only subsystems of interest by downloading the gene functions and gene IDs of individual subsystems (functions svr_subsystem_roles 2 3 and svr subsystem spreadsheet), which were then used to retrieve their respective fasta sequences (function svr_fasta). The SEED subsystems included are shown in 4 5 Fig. 2, and the numbers in parentheses include the total number of genes screened 6 per subsystem (Fig. 2 and Supplementary Data 2). Additionally, we manually curated a reference database including only hydrocarbon degradation genes by searching the KEGG and NCBI databases for hydrocarbon degradation pathways 8 9 and corresponding genes (Fig. 3). Both of these reference databases were screened against annotated genes from the seven draft genomes using their JGI-derived 10
- 11 amino-acid sequences as input for blastp (e-value threshold of 1e-20)³⁷.
- Phylogenetic analyses. Phylosift was used to extract marker genes for the 12 phylogenetic placement of the assembled metagenomic bins³⁸. These marker genes 13 consist of up to 15 syntenic ribosomal protein genes that have been demonstrated to 14 undergo limited lateral gene transfer (rpL2, 3, 4, 5, 6, 14, 15, 18, 22, 24 and rpS3, 8, 15 10, 17, 19)³⁹. This gene set was derived from a reference database as detailed in 16 ref. 40. To search for ribosomal protein sequences, all metagenomic bins (fasta files) 17 18 were used as an input in Phylosift, which was used with default parameters. 19 Moreover, we searched NCBI to include amino-acid sequences from bacterial reference strains for phylogenetic analyses. Amino-acid alignments of the individual 20 ribosomal protein genes were generated using MUSCLE and curated manually⁴¹ 21 22 Afterwards, the curated alignments of the ribosomal proteins were concatenated for further phylogenetic analyses. In addition to analysing ribosomal proteins, we 23 employed EMIRGE to retrieve 16S rRNA genes from the three SIP enrichments⁴² 24 25 We therefore ran an EMIRGE analysis comparing the SILVA database against the 26 raw, short reads from the three SIP enrichments using default parameters. Retrieved 16S rRNA genes were aligned to the SILVA database using the ARB alignment tool 27
- and were curated manually⁴³. For both the ribosomal protein and 16S rRNA gene
- alignments, phylogenetic trees were generated using a maximum likelihood-based analysis (RAxML; rate distribution models: PROTGAMMA for ribosomal proteins
- 31 and GTRGAMMA for 16S rRNA gene sequences)⁴⁴. Bootstrap values were
- 32 calculated using MrBayes with 100,000 generations of Markov chain Monte Carlo 33 (MCMC) analyses with 100 sample and print frequencies⁴⁵. As a point of
- 34 comparison, we included published 16S rRNA gene sequences from the plume and
- sea surface as well as from the previous SIP experiment (16S rRNA genes from clone
- 36 libraries and isolated bacterial strains) for the 16S rRNA phylogenetic tree^{2,3,10,13,46}
- 37 Meta analysis. To determine whether genes from the assembled metagenomic bins
- 38 in this study were enriched and active in the plume during the spill, we compared
- 39 our three SIP enrichments with previously published plume-derived metagenomic
- 40 and metatranscriptomic data sets (http://mason.eoas.fsu.edu/DWH_plume/)¹⁰. Two
- 41 reference databases were generated, which were compared against the published
- 42 metagenomic and metatranscriptomic data sets. Reference database 1 consisted of 43 DNA sequences comprising scaffolds of >2,500 bp that were derived from the three
- 44 SIP assemblies. Reference database 2 included amino-acid sequences from the seven
- 45 high-quality draft genomes. Reference database 1 (DNA sequences) was mapped
- 46 against the published metagenomic and metatranscriptomic data set using BWA.
- 47 Database 2 (amino-acid sequences) was used to search against the published
- 48 metatranscriptomic data using Rapsearch2 to retrieve the exact genes that mapped
- 49 against this data set^{47,48}. For BWA the default parameters were used and an e-value
- 50 cutoff of 0.001 was used for RapSearch2.
- 51 Accession codes. The genomes are available in NCBI Genbank under BioProjectID
- 52 PRJNA301966. The whole genome shotgun projects have been deposited under
- 53 accession nos. LSMM00000000 (H-Mar), LSMN00000000 (N-Tha),
- 54 LSMO00000000 (N-Alc), LSMP00000000 (N-Alt), LSMQ00000000 (P-Cyc),
- 55 LSMR00000000 (P-Nep) and LSMS00000000 (P-Col). The reference numbers for
- 56 the original raw sequencing data are SRX1562986 (*n*-hexadecane), SRX1585241
- 57 (naphthalene) and SRX1586894 (phenanthrene).
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Author contributions

N.D., T.G. and B.J.B. conceived this study. N.D. and B.J.B. supervised experiments and 43 analyses. N.D., J.A.D., K.W.S. and B.J.B. performed analyses. N.D., T.G., A.P.T. and B.J.B. 44 wrote the paper with contributions from all authors. 45

Additional information

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Competing interests

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