



Abstract

 *Background:* Marine sponges (phylum Porifera) are a diverse, phylogenetically deep- branching clade known for forming intimate partnerships with complex communities of microorganisms. To date, 16S rRNA gene sequencing studies have largely utilised different extraction and amplification methodologies to target the microbial communities of a limited number of sponge species, severely limiting comparative analyses of sponge microbial diversity and structure. Here, we provide an extensive and standardised dataset that will facilitate sponge microbiome comparisons across large spatial, temporal and environmental scales.

 *Findings:* Samples from marine sponges (n=3568 specimens), seawater (n=370), marine sediments (n=65) and other environments (n=29) were collected from different locations across the globe. This dataset incorporates at least 269 different sponge species, including several yet unidentified taxa. The V4 region of the 16S rRNA gene was amplified and sequenced from extracted DNA using standardised procedures. Raw sequences (total of 1.1 billion sequences) were processed 81 and clustered with a) a standard protocol using QIIME closed-reference picking resulting in 39,543 Operational Taxonomic Units (OTU) at 97% sequence identity, b) a *de novo* protocol using Mothur resulting in 518,246 OTUs, and c) a new high-resolution Deblur protocol resulting in 83,908 unique bacterial sequences. Abundance tables, representative sequences, taxonomic classifications and metadata are provided.

 *Conclusions:* This dataset represents a comprehensive resource of sponge-associated microbial communities based on 16S rRNA gene sequences that can be used to address overarching hypotheses regarding host-associated prokaryotes, including host-specificity, convergent evolution, environmental drivers of microbiome structure and the sponge-associated rare biosphere.

 Keywords: Marine sponges, Archaea, Bacteria, Symbiosis, Microbiome, 16S rRNA gene, Microbial diversity

 

## Data Description

## *Purpose of data acquisition*

 Sponges (phylum Porifera) are an ancient metazoan clade [1], with more than 8,500 formally described species [2]. Sponges are benthic organisms that have important ecological functions in aquatic habitats [3, 4]. Marine sponges are often found in symbiotic association with microorganisms and these microbial communities can be very diverse and complex [5, 6]. Sponge symbionts perform a wide range of functional roles, including vitamin synthesis, production of bioactive compounds and biochemical transformations of nutrients or waste products [7-9]. The diversity of microorganisms associated with sponges has been the subject of intense study (the search of "sponge microbial diversity" returned 348 publications in Scopus database [10]. Most of these studies were performed on individual species from restricted geographic regions [e.g., 11, 12]. A comparative assessment of these studies is often hindered by differences in sample processing and 16S rRNA gene sequencing. However, two recent studies incorporating a large number of sponge microbiomes (> 30) [5, 13] revealed the potential of large-scale, standardised, high- throughput sequencing for gaining unique insights into the diversity and structure of sponge- associated microbial communities. The purpose of this global dataset is to provide a comprehensive 16S rRNA gene-based resource for investigating and comparing microbiomes more generally across 111 the phylum Porifera.

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## *Sample collection, processing and 16S rRNA gene sequencing*

 Sample collection and processing, species identification and DNA extractions were conducted as previously described [13]. A total of 3568 sponge specimens were collected, representing at least 268 species, including several yet unidentified taxa (hereafter collectively referred to as species) (Supplementary Table S1). Of the total species, 213 were represented by at least three specimens. *Carteriospongia foliascens* had the highest replication comprising 150 individuals. Seawater (n=370), sediment (n=65), algae (n=1) and echinoderm (n=1) samples as well as biofilm swabs (n=21) of rock surfaces were collected in close proximity to the sponges for comparative community analysis. Six negative control samples (sterile water) were processed to identify any potential contaminations. Of the samples included in this current dataset, 973 samples had been analysed previously [13]. Samples were collected from a wide range of geographical locations (Figure 1 and Supplementary Table S1). Total DNA was extracted as previously described [13] and used as templates to amplify and sequence the V4 region of the 16S rRNA gene using the standard procedures of the EMP [14, 15]. 52 121 54 122

## *Processing of sequencing data*

Clustering using the EMP standard protocols in QIIME:

 Quality-filtered, demultiplexed fastq files were processed using the default closed-reference pipeline from QIIME v. 1.9.1, providing the EMP standard method for cross-dataset comparisons and allowing direct comparison with the tens of thousands of other samples processed in the EMP and 131 available via the Qiita database [16]. Briefly, sequences were matched against GreenGenes (v. 13 8 at 97% similarity) reference database. Sequences that failed to align were discarded. Taxonomy for each sequence was taken from the cluster to which it aligned.

Clustering using Mothur:

 Quality-filtered, demultiplexed fastq files were also processed using mothur v. 1.37.6 [17] and Python v. 2.7 [18] custom scripts with modifications from previously established protocols [13]. Detailed descriptions and command outputs are available at the project notebook (see Availability of supporting data). Briefly, sequences were quality-trimmed to a maximum length of 100 bp. To minimize computational effort, the dataset was reduced to unique sequences, retaining total sequence counts. Sequences were aligned to the V4 region of the 16S rRNA gene sequences from the SILVA v 123 database [19]. Sequences that aligned at the expected positions were kept and this dataset was again reduced to unique sequences. Further, singletons were removed from the dataset and remaining sequences were pre-clustered if they differed by one nucleotide position. Sequences 145 classified as eukaryote, chloroplast, mitochondria or unknown according to the Greengenes (v. 13 8 at 99% similarity) [20] and SILVA taxonomies [21] were removed. Chimeras were identified with UCHIME [22] and removed. Finally, sequences were *de novo* clustered into Operational Taxonomic Units (OTUs) using the furthest neighbour method at 97% similarity. Representative sequences of OTUs were retrieved based on the mean distance among the clustered sequences. Consensus taxonomies based on the SILVA, Greengenes and RDP (v. 14\_032015) [23] databases were obtained based on the classification of sequences clustered within each OTU. 

De-noising using Deblur:

 Recently, sub-OTU methods that allow views of the data at single-nucleotide resolution have become available. One such methods is Deblur [24], which is a denoising algorithm for identification of actual bacterial sequences present in a sample. Using an upper bound on the PCR and read-error

 rates, Deblur processes each sample independently and outputs the list of sequences and their frequencies in each sample, enabling single nucleotide resolution. For creating the deblurred biom table, quality filtered, demultiplexed fasta files were used as input to Deblur using a trim length of 100, and min-reads of 25 (removing sOTUs with < 25 reads total in all samples combined). Taxonomy was added to resulting biom table using QIIME [25], RDP classifier [26] and Greengenes 13.8 [20].

Database metadata category enrichment:

 For enrichment analysis of metadata terms in a set of sequences, each unique metadata value is tested using a binomial test. For a bacterial sequence s and metadata value v, denote N the 166 total number of samples,  $O(s)$  the number of samples where s is present,  $K_v(s)$  the number of sample 167 with value v where s is present, and  $T(v)$  the total number of samples with value v. The p-value for enrichment was then calculated as:

 $p$ -value = *binomial\_cdf* ( $T(v)$ -K<sub>v</sub>(s),  $T(v)$ , P<sub>Null</sub>(s))

170 where  $P_{Null}(s) = O(s) / N$ 

 We have set up a webserver (www.spongeemp.com) that performs this enrichment analysis for user-defined sequence submissions. The code for the webserver is also available in Github [27] for a local installation.

## **Data description**

 The dataset covers 4032 samples with a total of 1,167,226,701 raw sequence reads. These sequence reads clustered into 39,543 OTUs using QIIME's closed-reference processing, 518,246 OTUs from *de novo* clustering using Mothur (not filtered for OTU abundances), and 83,908 sOTUs using Deblur (with a filtering of at least 25 reads total per sOTU). We recommend that data users consider the differences in sequencing depths per sample and abundance filtering for certain downstream analyses, such as when calculating diversity estimates [28] and comparing OTU abundances across samples [29]. In terms of taxonomic diversity, most Mothur OTUs were assigned to the phylum Proteobacteria, although more than 60 different microbial phyla were recovered from the marine sponge samples according to SILVA (n=63) and Greengenes classifications (n=72) (Figure 2).

Potential uses

 This dataset can be utilised to assess a broad range of ecological questions pertaining to host-associated microbial communities generally or to sponge microbiology specifically. These include: i) the degree of host-specificity, ii) the existence of biogeographic or environmental patterns, iii) the relation of microbiomes to host phylogeny, iv) the variability of microbiomes within or between host species, v) symbiont co-occurrence patterns as well as vi) assessing the existence of a core sponge microbiome. An example of this type of analysis is shown in Figure 3, where samples were clustered using unweighted UniFrac data [30] with a Principal Coordinate Analysis and visualization in Emperor [31] based on their origins from sponges, seawater or kelps [32].

## Availability and requirements

Project name: The Sponge Microbiome Project

 Project home page: GigaScience repository; www.spongeemp.com; <https://github.com/amnona/SpongeEMP> 

Operating system(s): Unix

Programming language: Python and R

 Other requirements: Python v. 2.7, Biopython v. 1.65, Python 3.5, R v. 3.2.2, mothur v. 1.37.6, QIIME v. 1.9.1, Deblur

 License: MIT 

Any restrictions to use by non-academics: None

 

## Availability of supporting data

 Raw sequence data were deposited in the European Nucleotide Archive (accession numbers: ERP020690). Quality-filtered, demultiplexed fastq files, Deblur and QIIME resulting OTU tables are available at Qiita database [16] (Study ID: 10793). The additional datasets that support the results of 

 this article are available in the GigaScience repository **(DOI of the dataset)** and include an OTU abundance matrix (the output ".shared" file from mothur, which is tab delimited), an OTU taxonomic classification table (tab delimited text file), an OTU representative sequence FASTA file, and a table of samples' metadata. The project workflow, mothur commands and additional scripts are available as HTML TiddlyWiki notebook [33], which is viewed in any browser **(DOI of the workflow**).

 The deblurred dataset has also been uploaded to an online server [34] that supplies both html and REST-API access for querying bacterial sequences and obtaining the observed prevalence 219 and enriched metadata categories where the sequence is observed (Figure 4). This allows an interactive view of which sequences are associated with which specific parameters, such as depth or salinity.

# List of abbreviations

- bp: base pairs
- OTU: operational taxonomic unit
- rRNA: ribosomal RNA

## Competing interests

The authors declare that they have no competing interests.

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## Authors' contributions

 L.M.-S., N.S.W. and T.T. designed the study. C.A.G., D.S., F.L., G.S., G.K., G.McC., G.-F. F, J.J.B., J.V., J.R.B., J.M.M., J.R., L.S., M.C.P, M.V.M., M.W.T., N.S.W., P.P., P.M.E., P.J.S., R.L.S, R.W.T., R.C., R.T.H., S.L-L., T.D., T.R., U.H. and Z-Y. L. collected samples. C.A.G., D.S., J.V., J.R.B., L.S., M.C.P., M.W.T., N.S.W., P.M.E., R.L.S, R.W.T., S.L-L. and U.H. extracted DNA. G.L.A. and R.K. sequenced DNA. L.M.-S., S.N., A.A., A.G., G.L.A. and T.T. performed data processing and analysis. L.M.-S., N.S.W. and T.T. wrote the manuscript. All authors contributed to the writing of the manuscript.

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Figure 3.















- Acidobacteria:Acidobacteria
- Acidobacteria;Holophagae
- Actinobacteria:Acidimicrobiia
- Bacteroidetes;Cytophagia ш
- Bacteroidetes;Flavobacteriia ш
- Chloroflexi;Anaerolineae m.
- Chloroflexi;Caldilineae m.
- Chloroflexi;Chloroflexi\_unclassified
- Chloroflexi;SAR202\_clade **COL**
- ш Cyanobacteria;Cyanobacteria
- Firmicutes; Clostridia
- Gemmatimonadetes;Gemmatimonadetes
- Nitrospirae;Nitrospira ш
- PAUC34f;PAUC34f\_unclassified m.
- ٠ Proteobacteria;Alphaproteobacteria
- n. Proteobacteria;Betaproteobacteria
- **Proteobacteria:Deltaproteobacteria**
- Proteobacteria;Gammaproteobacteria ш
- Proteobacteria;Proteobacteria\_unclassified
- Thaumarchaeota:Marine\_Group\_I

## SILVA Greengenes RDP

- Acidobacteria:Acidobacteria–6
- m. Acidobacteria;Sva0725
- Actinobacteria:Acidimicrobiia
- ш Bacteroidetes;Flavobacteriia
- Chloroflexi;Anaerolineae ш
- Chloroflexi;SAR202 ш
- Crenarchaeota;Thaumarchaeota m.
- Cyanobacteria;Synechococcophycideae
- ٠ Gemmatimonadetes;Gemm−2
- Nitrospirae;Nitrospira
- PAUC34f;PAUC34f\_unclassified
- Proteobacteria;Alphaproteobacteria
- Proteobacteria;Betaproteobacteria ш
- Proteobacteria;Deltaproteobacteria m.
- m, Proteobacteria;Gammaproteobacteria
- m. Proteobacteria;Proteobacteria\_unclassified

- Acidobacteria; Acidobacteria Gp10
- Acidobacteria;others
- **Actinobacteria:Actinobacteria**
- m. Bacteroidetes;Flavobacteriia
- Cyanobacteria/Chloroplast;Cyanobacteria ш
- Poribacteria;Poribacteria\_unclassified
- Proteobacteria;Alphaproteobacteria m.
- Proteobacteria;Gammaproteobacteria
- Proteobacteria;Proteobacteria\_unclassified ш
- Thaumarchaeota;Nitrosopumilales





## **Figure 4** [Click here to download Figure figure](http://www.editorialmanager.com/giga/download.aspx?id=11117&guid=26c307d1-bfe3-4236-8ec5-41ae0fddf1c6&scheme=1) 4.pdf

## **Search results**

#### taxonomy: k\_Bacteria;p\_Proteobacteria;c\_Alphaproteobacteria;o\_Rhizobiales

sequence: TACGAAGGGGCCTAGCGTTGTTCGGAATCACTGGGCGTAAAGCGCACGTAGGCGGACTTTTAAGTCAGGGGTGAAATCCCGGGGCTCAACCCCGGAACTG More info from dbBact Present in 0.034474 of samples (132/3829)

 $\blacktriangleright$  host scientific name (6 significant)



Sample number distribution



#### Significant enrichment:

host scientific name:Dysidea avara (30/64) host scientific name: Crella sp. (4/9) host\_scientific\_name:Dysidea etheria (4/10) host scientific name: Cliona orientalis (11/31) host scientific name: Coscinoderma sp. (5/27) host\_scientific\_name:Crambe\_crambe\_(10/56)

- $\triangleright$  env\_feature (1 significant)
- $\triangleright$  country (3 significant)
- $\blacktriangleright$  ALL (84 significant)

Supplementary Table 1

Click here to access/download [Supplementary Material](http://www.editorialmanager.com/giga/download.aspx?id=11119&guid=c636056e-68af-451d-b4e1-46425621befa&scheme=1) Supp.table1.tsv

Data Information

Click here to access/download Supplementary Material [Data information.v2.docx](http://www.editorialmanager.com/giga/download.aspx?id=11185&guid=99a56229-83a0-478a-91ff-41b818289dd4&scheme=1) README of files to be submitted

Click here to access/download [Supplementary Material](http://www.editorialmanager.com/giga/download.aspx?id=11120&guid=d99e3274-c41d-47d4-b233-d6956b70e1bf&scheme=1) README.txt

Sequence processing notebook

Click here to access/download Supplementary Material [SMP.sequence.processing.html](http://www.editorialmanager.com/giga/download.aspx?id=11121&guid=ec004767-0e61-4a37-b16a-c78051a70d2b&scheme=1) Sample metadata

Click here to access/download [Supplementary Material](http://www.editorialmanager.com/giga/download.aspx?id=11186&guid=f3af6d3e-f507-464b-9ae5-6f542ebdc61d&scheme=1) sample.metadata.csv