

## Article

# The Effect of the Artificial Reef on the Structure and Function of Sediment Bacterial Community

Fei Tong <sup>1,2,3,4,5,\*</sup> , Guobao Chen <sup>1,2,3,4,5</sup>, Xue Feng <sup>1,2,3,4,5</sup>, Yan Liu <sup>1,2,3,4,5</sup> and Pimao Chen <sup>1,2,3,4,5</sup>

- <sup>1</sup> South China Sea Fisheries Research Institute, Chinese Academy of Fishery Sciences, Guangzhou 510300, China
- <sup>2</sup> Shenzhen Base of South China Sea Fisheries Research Institute, Chinese Academy of Fishery Sciences, Shenzhen 518121, China
- <sup>3</sup> Key Laboratory of Marine Ranching, Ministry of Agriculture and Rural Affairs, Guangzhou 510300, China
- <sup>4</sup> Scientific Observing and Experimental Station of South China Sea Fishery Resources and Environment, Ministry of Agriculture and Rural Affairs, Guangzhou 510300, China
- <sup>5</sup> National Digital Fisheries (Marine Ranching) Innovation Sub-Center, Guangzhou 510300, China
- \* Correspondence: tongfei@scsfri.ac.cn

**Abstract:** The bacterial community in sediment is sensitive to artificial disturbance, and they respond differently to human disturbance, such as changing the nutrient cycling and energy flow in marine ecosystems. However, little is known about the dynamics and distribution of bacterial community structures in marine sediments and potential biogeochemical functions during the long-time succession in marine ranching. In the present study, we compared the dynamics of the bacterial composition and potential biogeochemical functions of sediment to ten years (TR) and one-year new artificial reef (NR) areas using metagenomic next-generation sequencing technology. Results revealed that NR reduces the Pielou's evenness and Shannon index. Similarly, nonmetric multidimensional scaling showed that the beta diversity of sediment bacterial communities in NR significantly differed between TR and non-artificial reef areas. Previously, TR biomarkers were frequently associated with organic matter decomposing and assimilating in the organically enriched sediments (i.e., *Acinetobacter*). The soluble reactive phosphate (SRP) and total phosphorus (TP) concentrations were thought to be the primary driving forces in shaping the microbial community in sediment. *Pseudomonas*, *Lactobacillus*, and *Ralstonia* have a significant positive correlation with SRP, TP, nitrate, and TN, but a negative association with pH, Salinity, Hg, and depth. NR was found to have more negative correlation nodes, indicating that taxa face more competition or predation press. *Vibrio* served as the module-hubs in the network in all areas. In addition, chemoheterotrophy, aerobic chemoheterotrophy, and fermentation were the three most prominent functions of the three areas, accounting for 59.96% of the relative abundance of the functional annotation. Different bacteria in sediments may change the amount of biogeochemical cycle in the marine ranching ecosystem. These findings can increase our understanding of the succession of the microecosystem for the marine ranching sedimentary environment by revealing how artificial reefs affect the indigenous sediment bacterial community and their responses to environmental variation.

**Keywords:** marine ranching; artificial reef; community structure; keystone taxa; FAPROTAX



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## 1. Introduction

China has been practicing marine ranching since the late 1970s, primarily through constructing artificial reefs (ARs) and stock enhancement [1]. In 1979, China installed 26 experimental small individual ARs along the coast of Guangxi [2]. By 2016, the total amount of funds used for marine ranching construction in China had reached 5.58 billion yuan, more than 200 marine ranches had been built, and more than 60 million cubic meters of ARs had been installed [3,4]. The primary goal of marine ranching construction is to increase marine fishery resources [1]. Marine ranching may provide a viable solution for

reducing wastewater and overfishing as well as achieving aquaculture sustainability [5]. By 2021, 153 national-level nearshore marine ranching areas had been approved for development. The Ministry of Agriculture and Rural Affairs invested more than 2.9 billion yuan between 2016 and 2021 to support 153 artificial reef construction projects, totaling more than 50 million m<sup>3</sup> of reefs.

Concrete is a widely used material for ARS construction worldwide because of its stability, ease of shaping into various structures and sizes, and high biological fixation rate [6]. Tons of concrete reefs on the sea floor changed the flow field of the sea floor [7]. The complex flow field near ARS not only provides a suitable activity area for various marine organisms but also promotes the exchange of various nutrients and enhances the ecological effect of ARS. The transport and exchange of sediment nutrients can be promoted by upwelling [8]. Long-term exposure to seawater caused chemical and mineralogical alteration in some concrete regions. Calcium hydroxide ions, iron, and silicate in ARS were transported to the external environment [9,10].

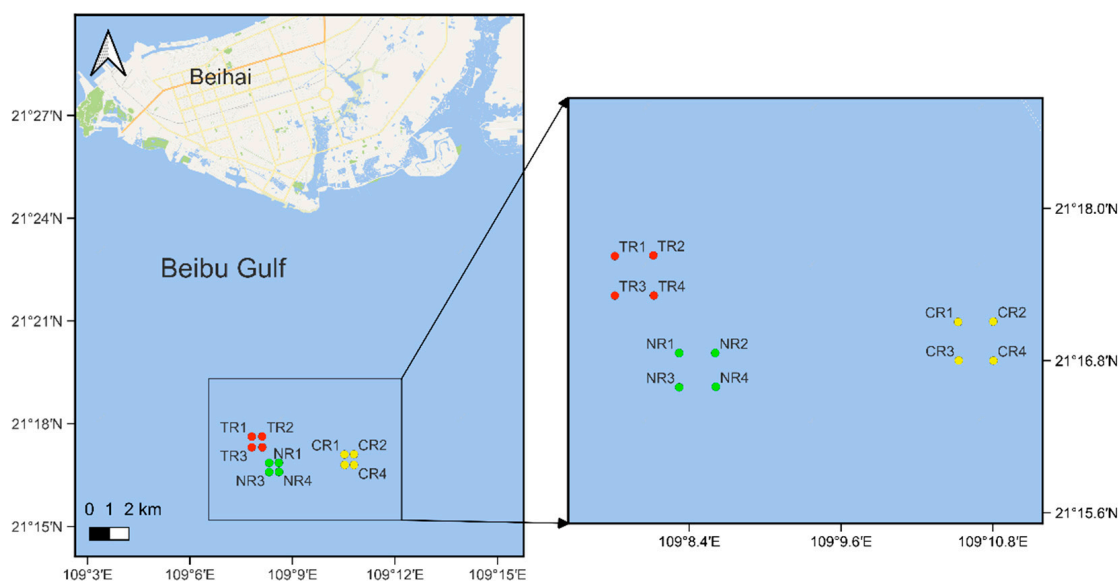
Microbial communities in sediments play an important role in organic remineralization, helping to maintain biogeochemical cycles, release nutrients, and emit greenhouse gases [11,12]. As primary producers, these prokaryotes form an indispensable foundation of the food web of the ARS ecosystem, supporting a diverse range of benthic life, from microbial consumers to animals like zooplanktons, clams, mussels, and shrimps [13]. Bacterial communities can exhibit spatial or temporal patterns and are influenced by different environmental parameters and human activities [14,15], such as artificial reef construction in marine ranching [16]. In recent decades, a long-standing research focus has been on microbial communities' distribution patterns in marine sediments [17]. Sediments microbial communities are sensitive to environmental changes, and bacterial communities respond differently to disturbance [16,18].

The Beibu Gulf is located in the south of the Guangxi province. It is a traditional and economically significant subtropical fishery area [19]. Due to the discharge of urban and industrial wastewater and overfishing, the marine environment has deteriorated, and fishery resources have been depleted [20]. The local government started building reef-throwing marine ranching ten years ago and recently began building national-level marine ranching [21]. However, the studies related to the bacterial community of sediment in response to ARS are still insufficient [16,22]. Thus, the present study aimed to address how ARS of different ages (1) shape the bacterial composition in the surrounding sediment and (2) determine whether bacteria function in response to environmental features to provide context for their potential as drivers of bacterial biodiversity in sediment.

## 2. Materials and Methods

### 2.1. Study Area and Samples Collection

The present study was conducted at the southern sea area of Yingtan in the Beibu Gulf in March 2022. The water depth in this area is approximately 11–20 m. We took samples from a ten-year artificial reef area (TR), a one-year new artificial reef area (NR), and a control area (CR) without reefs. The ARs are concrete cubes with 4 m side lengths. Overlying water and sediment samples were collected from 12 sites (Figure 1). Sampling sites were near the artificial reefs. Samples were collected at 250–300 m intervals along the center of each area. At each site, triplicate superficial sediments (0–10 cm mud samples) were collected on the sediment surface at 12 sites using a manual Van Veen dredge [12,23]. The sediment samples were sieved with a 2 mm mesh to remove stones and plant roots before being sealed in sterile plastic bags [24]. The sieved sediment samples were flash-frozen and kept on boards in liquid nitrogen before being stored at  $-80\text{ }^{\circ}\text{C}$  in the laboratory [25]. Overlying water samples were collected with Van Dorn bottles washed with 10% HCl and stored in triplicate flasks at  $-4\text{ }^{\circ}\text{C}$  in a cooler [12].



**Figure 1.** Locations of sampling sites in the marine ranching of the Beibu Gulf, China. TR: Ten-year artificial reef area; NR: one-year new artificial reef area; CR: control area (CR) without reefs.

## 2.2. Physical and Chemical Parameters

For environmental factor analyses, overlying water temperature (T), pH, salinity, and dissolved oxygen (DO) were determined in situ using a portable water quality analyzer (6600EDS, YSI, Los Gatos, CA, USA). A Secchi disk was used to measure water transparency in Secchi depth [16]. Within 24 h of sampling, ammonium ( $\text{NH}_4^+$ ), nitrate ( $\text{NO}_3^-$ ), nitrite ( $\text{NO}_2^-$ ), total nitrogen (TN), chemical oxygen demand (COD<sub>Cr</sub>), chlorophyll a (chl a), total phosphorus (TP), and concentration of soluble reactive phosphate (SRP) were determined using a spectrophotometer (cary100, varian, Palo Alto, CA, USA) according to the Marine Monitoring Code Standard GB 17378–2007.

The total organic carbon (TOC) in sediment was determined using the potassium dichromate volumetric method. Heavy metals (Cu, Pb, Zn, As, Hg and Cd) in sediment were assessed by atomic absorption spectrophotometry (Z-2010, Hitachi, Tokyo, Japan) [26]. As and Hg were determined by atomic fluorescence photometer (AFS-8520, Haiguang, Beijing, China). The pH of the sediment was measured using a pH meter (PHS-25CW, Bante, Shanghai, China) at 1/5 (*w/v*) of sediment to solution ratio in deionized water [27]. All sediment samples were collected, preserved, transported, and detected as per the National Specification for Marine Monitoring (GB 17378–2007) [16].

## 2.3. DNA Extraction and PCR Amplification

Total genomic DNA from sediment samples was extracted using a modified CTAB method [12]. DNA concentration and purity were assessed on 1% agarose gels. DNA was diluted to 1 ng/ $\mu\text{L}$  using sterile water according to the concentration. The V4 variable region of 16S rDNA genes of distinct regions was amplified using a specific primer (515FmodF–806RmodR) with the barcode, as previously described [28]. All PCR reactions used 15  $\mu\text{L}$  of Phusion<sup>®</sup> High-Fidelity PCR Master Mix (New England Biolabs), 2  $\mu\text{M}$  of forward and reverse primers, and about 10 ng template DNA. Thermal cycling consisted of 3 min of initial denaturation at 94 °C, followed by 30 cycles of denaturation at 94 °C for 30 s, annealing at 53 °C for 40 s, and elongation at 72 °C for 40 s [29]. To ensure successful amplification, mix the same volume of 1XTAE buffer with PCR products and perform electrophoresis on 2% agarose gel for detection. PCR products were mixed in equal ratios. The mixture of PCR products was then purified using the Qiagen Gel Extraction Kit (Qiagen, Hilden, Germany).

#### 2.4. Illumina NovaSeq Sequencing

The sequencing libraries were generated using TruSeq<sup>®</sup> DNA PCR-Free Sample Preparation Kit (Illumina, San Diego, CA, USA) following the manufacturer's instruction, and index codes were added. The Qubit<sup>®</sup> 2.0 Fluorometer (Thermo Scientific, Waltham, MA, USA) was used to evaluate the library quality. Finally, the library was sequenced on an Illumina NovaSeq 6000 platform, yielding 250 bp paired-end reads.

#### 2.5. Bioinformatics Analysis

The analysis was performed using the "Atacama soil microbiome tutorial" from Qiime2docs and customized program scripts (<https://docs.qiime2.org/2022.2/>, accessed on 1 June 2022). A program called Qiime tools import was used to import raw data FASTQ files into the format that could be used by QIIME2. Amplicon sequence variant feature tables (ASVs) are generated by quality filtering and trimming demultiplexed sequences, denoising, and merging them. After that, the QIIME2 dada2 plugin was used to identify and remove the chimeric sequences [30]. The QIIME2 feature-classifier plugin was then used to align ASV sequences to a pre-trained Greengenes Database 13.8 100% database (trimmed to the V4 region bound by the 515FmodF/806RmodR primer pair) to generate the taxonomy table [25,31,32]. The QIIME2 feature-table plugin filters out any contaminating mitochondrial and chloroplast sequences. Appropriate methods such as analysis of community similarities (ANOSIM), analysis of composition of microbiomes (ANCOM), Kruskal–Wallis, and LEfSe were used to identify taxa that differed significantly from phylum to genus across samples and sea areas [33,34]. Diversity metrics were calculated using the core-diversity plugin within QIIME2. To estimate the bacterial diversity within sea areas, feature level alpha diversity indices such as the Shannon diversity index and Pielou's evenness index were calculated. The structural variation of sediment bacterial communities across samples was investigated using beta diversity distance measurements, including Bray Curtis, and was then visualized through nonmetric multidimensional scaling (NMDS) [35]. Redundancy analysis (RDA) was used to assess the association of sediment bacterial genera characteristics in relation to environmental factors based on relative abundances of bacterial species at genus taxa levels using the R package "vegan" [36]. The network plot was used to display the associations among taxa in co-occurrence net analysis, which was performed by calculating Spearman's rank correlations between predominant taxa. The igraph packages were used for the network plots. In addition, functional annotation of prokaryotic taxa (FAPROTAX) was used to predict the potential functional characteristics of sedimental bacterial communities [14,37]. In this study, physicochemical variables and alpha diversity indices were expressed as the mean  $\pm$  standard deviation over four replications. The statistical analysis was performed using the Statistical Package for the Social Sciences (SPSS) version 23. [38]. All sequencing data are stored in the PRJNA880993 biological project.

### 3. Results

#### 3.1. Changes in Physicochemical Characteristics of Overlying Water and Sediment

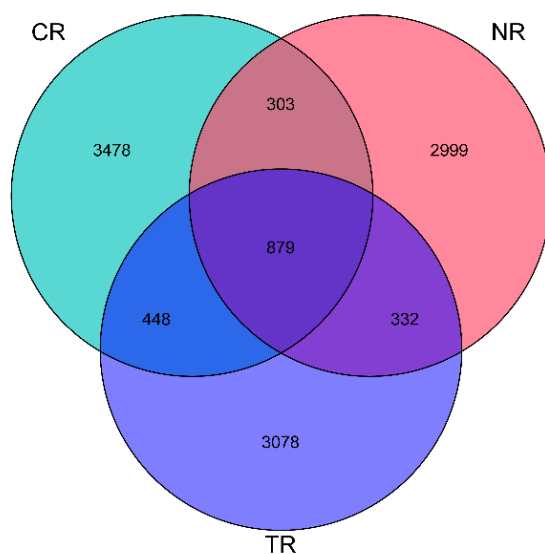
Table S1 represents the 22 environmental factors collected at the 12 sampling sites in the three sea areas. The Kruskal–Wallis test was used to compare the geochemical characteristics of overlying water and sediment in different areas. Dunn's multiple posthoc tests were used to compare areas pairwise (Table S2). Overly water pH was significantly higher in NR areas than in CR (Dunn's test,  $p = 0.046$ ) and TR ( $p = 0.041$ ). However, dissolved nutrient concentrations of  $\text{NO}_3^-$ , TN, SRP, and TP were significantly higher in CR than in NR ( $p = 0.044$ ,  $0.035$ ,  $0.004$ , and  $0.004$ , respectively).

The physicochemical characteristics of the sediment samples varied significantly between sampling sites. The pH of the sediments in CR was significantly higher than in TR ( $p = 0.050$ ). However, the concentration of As in sediments for CR was significantly lower than for TR ( $p = 0.024$ ) (Table S2). In addition, the Cu content of the sediments in NR was significantly higher than that of TR ( $p = 0.044$ ), although Cu contents were all lower than the class I levels of the sediment environment quality standard (GB 18668–2002).

### 3.2. Sediment Bacterial Community Composition

Illumina Miseq sequencing of bacterial 16S rRNA gene was performed on each sediment sample. A total of 650,977 high-quality reads were identified across all samples, ranging from 48,128 to 62,576 reads per sample. The rarefaction plots were shown as a supplement to show the sequencing depth is sufficient (Figure S1). The 16S rRNA sequences obtained from sediment samples were grouped into 11,517 ASVs, belonging to 71 different phyla. Proteobacteria were the dominant phyla in all three sea areas (Figure S2), accounting for 61.58% relative abundance on average, followed by Crenarchaeota (5.07%), Desulfobacterota (4.90%), Firmicutes (4.30%), and Bacteroidota (3.78%) that accounted for 80% of the phyla. Gammaproteobacteria and Alphaproteobacteria were the predominant types of Proteobacteria identified, accounting for 60% of all the classes.

The largest number of ASVs (5126) were detected in the CR, and the least number (4513) was found in the NR. The CR and TR sites shared the largest number of ASVs (448), while the CR and NR areas shared the least (303). The Venn analysis identified 879 ASVs (7.63% of the total ASVs) that were common among the three areas (Figure 2). The ternary plots showed that the distribution of each genus in the three sea areas is uneven (Figure S3). NR and TR have some “special” genera, which are located in the corresponding tip area of the ternary graph. However, most of the genera in the sediments are located in the middle of the ternary block, primarily Proteobacteria, including a variety of ubiquitous genera, which exist in all samples.

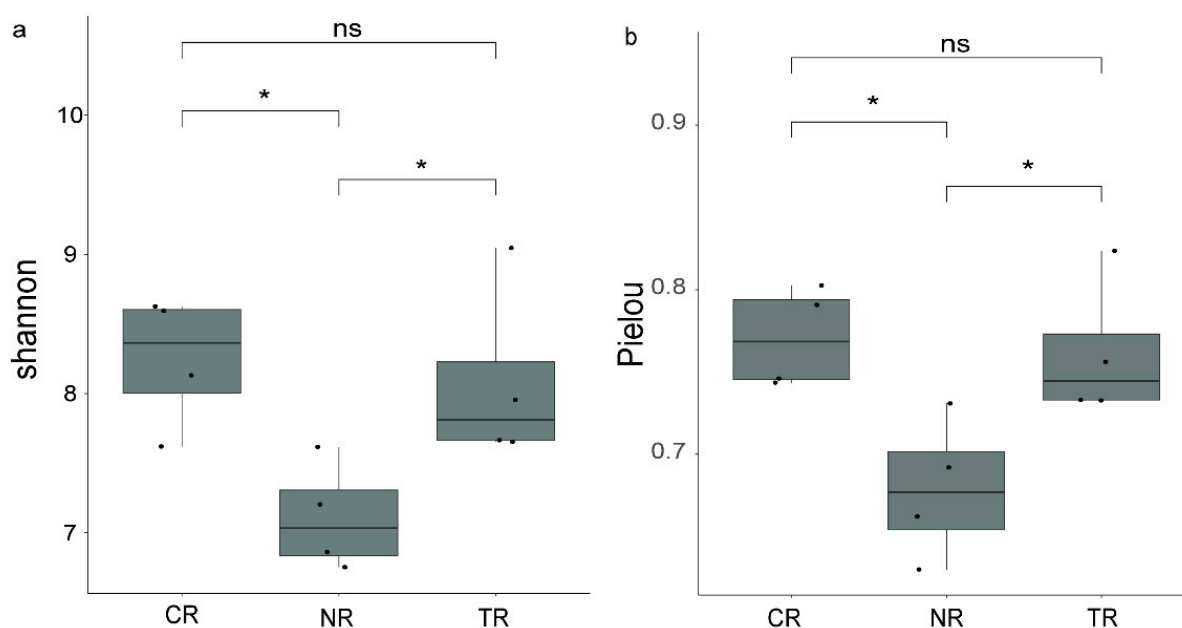


**Figure 2.** Venn diagram of the ASVs in all three areas. See Figure 1 for site abbreviations.

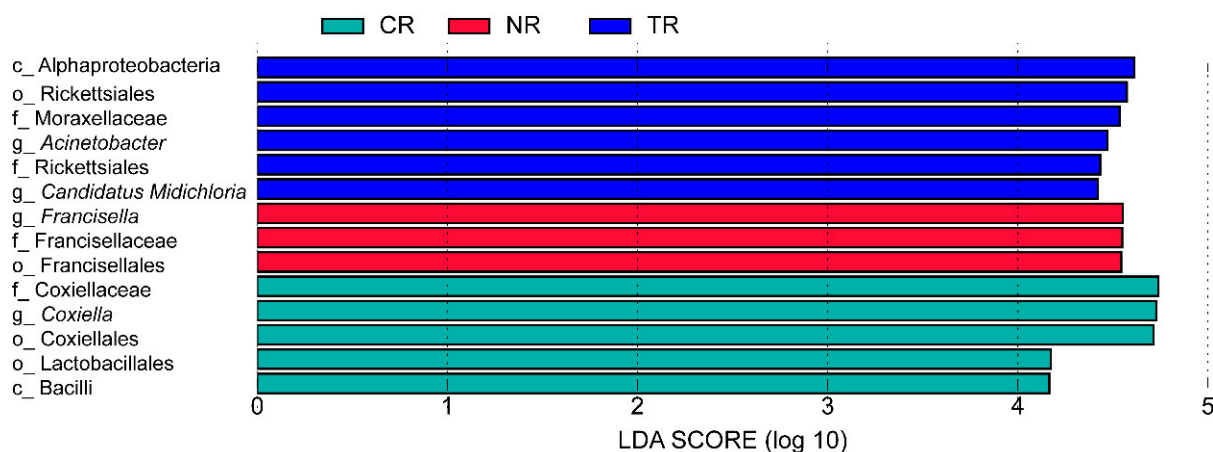
Sediment bacterial alpha diversity, measured by species Shannon index and Pielou’s evenness, varied significantly across research areas. The Shannon index of NR was significantly lower than that of CR ( $p = 0.029$ ) and TR ( $p = 0.029$ ). Meanwhile, the Pielou’s evenness of NR was significantly lower than that of CR (Wilcoxon test,  $p = 0.029$ ) and TR ( $p = 0.029$ ). However, the Kruskal–Wallis results revealed no statistically significant difference between CR and TR (Figure 3).

The LefSe analysis was used to identify sediment bacteria that differed significantly across three areas. In the present study, we applied a strict LDA score criterion (logarithmic LDA scores over 4.0) to the analysis. The findings revealed that six taxa were significantly enriched in 10 years of artificial reef sediment samples, including Alphaproteobacteria (class level), Rickettsiales (order level), Moraxellaceae (family level), *Acinetobacter* (genus level), Rickettsiales (family level), and *Candidatus Midichloria* (genus level). Meanwhile, three taxa were significantly enriched in NR sediments, including *Francisella* (genus level), Francisellales (family level), and Francisellales (order level). Finally, five taxa were signifi-

cantly enriched in CR sediment, including Coxiellaceae (family level), *Coxiella* (genus level), Coxiellales (order level), Lactobacillales (order level), and Bacilli (class level) (Figure 4).



**Figure 3.** Alpha diversity analysis of the ASVs. (a) Shannon index, (b) Pielou's evenness index. Upper and lower quartile values are shown in boxes; solid horizontal lines show median values, while the maximum and minimum values are shown in upper and lower whiskers, respectively. See Figure 1 for site abbreviations. \*  $p < 0.05$ .

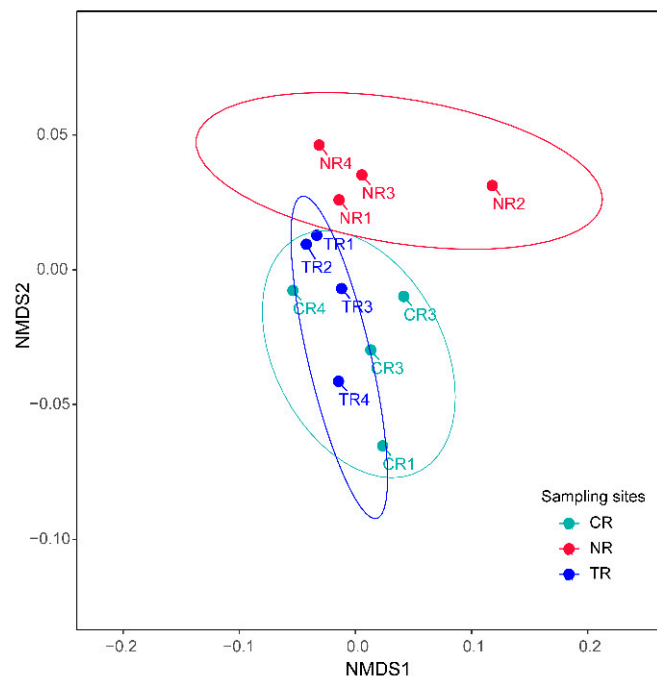


**Figure 4.** LEfSe analysis distinguishes between artificial reef and non-reef bacterial taxa. The diagram shows taxa (genus level) with logarithmic LDA scores over 4.0. Nonmetric multidimensional scaling (NMDS) was used to analyze the community composition variations. The results showed that NR samples were significantly separated from the other two clusters (ANOSIM,  $p = 0.003$ ; stress = 0.10), whereas the distribution of TR and CR samples showed no significant difference (Figure 5).

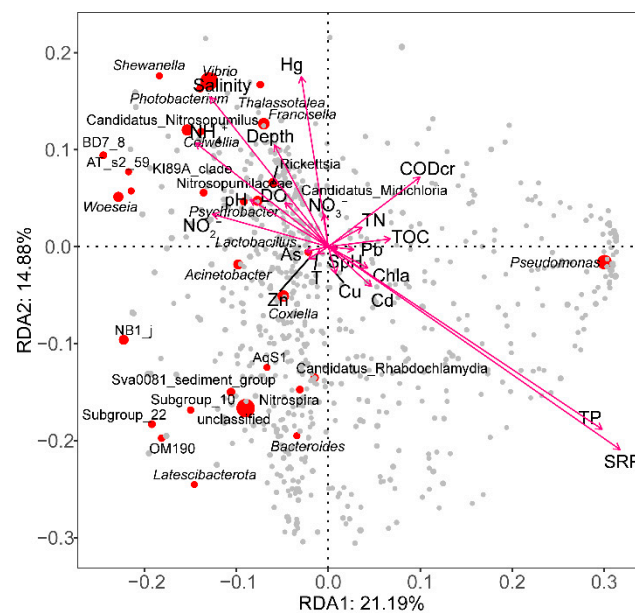
### 3.3. Relationships between Sediment Microbial Communities and Environmental Factors

We can explain the relationship between environmental factors and sediment microbes using redundancy analysis (RDA) by demonstrating the effects of different factors on sediment microbial communities (Figure 6). Based on the model, the top two axes for the sediment bacteria at the genera level could explain 36.07% of the total variance. In the sediment, the concentration of SRP ( $R^2 = 0.59$ ,  $p = 0.032$ ) and TP ( $R^2 = 0.55$ ,  $p = 0.037$ ) were significantly correlated with sediment bacteria community. Finally, we generated a Pearson correlation-based heatmap to illustrate the environmental parameters in clusters

and correlate them with the sediment microbial communities (Figure S4). The resulting heatmap showed the top 30 genera relevant to the environment. The 30 prominent genera are clustered into two main branches. The first branch, *Pseudomonas*, *Lactobacillus*, and *Ralstonia*, had a significant positive correlation with SRP, TP,  $\text{NO}_3^-$ , and TN but a negative association with pH, salinity, Hg, and depth. In contrast, the Candidatus *Nitrosopumilus*, *Thalassotalea*, *Photobacterium*, *Vibrio*, and OM182 clade significantly correlated with SRP, TP,  $\text{NO}_3^-$ , and TN, but had a positive correlation with pH, salinity, Hg, and depth.



**Figure 5.** Nonmetric multidimensional scaling (NMDS) ordination of sediment bacterial beta-diversities, measured by Bray Curtis dissimilarity between genera relative abundance profiles. The ellipse refers to a 95% confidence interval.



**Figure 6.** Redundancy analysis (RDA) ordination diagram of relative abundance of sediment bacterial genera and environment factors.

### 3.4. Bacterial Relationships within the Sediment Microbial Communities

A correlation network analysis was performed on the co-occurrence of the top 30 abundance microbial genera (Spearman correlation coefficient > 0.4) to find associations between bacteria in the sediment microbial communities (Figure 7). The significant correlations among bacteria found in the sediment samples from three sea areas revealed distinct patterns. The genera that were significantly correlated ( $p < 0.05$ ) with other genera and had a relative abundance of > 1% were selected as keystone taxa [16]. There were 38 significant positive correlation nodes in NR and 52 significant negative correlation nodes. In contrast, the correlation network contained nine phyla. Potential keystone taxa in the NR sediment network include five genera affiliated with two phyla such as *Vibrio*, *Francisella*, *Acinetobacter*, *Rickettsia*, and NB1-j. Furthermore, *Vibrio* and *Francisella* served as network module hubs, and members from phylum Proteobacteria served as module hubs and connectors. TR had 44 significant positive correlation nodes and 40 negative correlation nodes. The correlation network contained 12 phyla. Four genera affiliated with three phyla, including *Vibrio*, *Woeseia*, *Lactobacillus*, and Subgroup-22, were identified as potential keystone taxa in the TR sediment network. Moreover, *Vibrio* served as the module hubs in the network, and members from phylum Proteobacteria served as module hubs and connectors.

CR had more significant positive correlation nodes than NR and TR, with 64 significant positive and 22 negative correlation nodes. The correlation network contained 11 phyla. Nine genera affiliated with three phyla, including *Pseudomonas*, *Vibrio*, *Coxiella*, *Francisella*, *Candidatus Nitrosopumilus*, NB1-j, *Candidatus Midichloria*, Sva0081 sediment group, and *Acinetobacter* were identified as potential keystone taxa in CR sediment network. In addition, *Pseudomonas*, *Vibrio*, and *Coxiella* served as the module hubs in the network, and members from the phylum Proteobacteria served as the module hubs and connectors.

### 3.5. Sediment Microbial Functional Annotation

The FAPROTAX model predicted 59 functions for the ASVs in the sediment samples. Chemoheterotrophy was the predominant function (14.45% of total relative abundance) across all samples, followed by aerobic chemoheterotrophy and fermentation. When compared to TR sites, NR sites had a significantly lower relative abundance of ASVs associated with cellulolysis (Kruskal–Wallis,  $p = 0.019$ ) and intracellular parasites ( $p = 0.008$ ). CR sites had a significantly higher representation of groups involved in dark hydrogen oxidation/nitrification than TR ( $p = 0.049$ ) and NR sites ( $p = 0.009$ ). However, the CR sites were significantly lower than NR ( $p = 0.011$ ), associated with fermentation (Table S3).

The relationship between the FAPROTAX function and environmental factors was depicted using a heatmap showing Spearman's rank correlation and  $p$ -value (Figure 8). The top 30 significant FAPROTAX function correlations are clustered into two branches. One branch was primarily positive to the  $\text{NO}_2^-$ , TN, SRP, TP, and TOC but negative to the depth and salinity. In contrast, the other branch was primarily negative to the  $\text{NO}_2^-$ , TN, SRP, TP, and TOC but positive to the depth and salinity. Thiosulfate respiration was the most significant ( $p < 0.05$ ) influenced by the five environmental factors (BST, COD<sub>Cr</sub>,  $\text{NO}_2^-$ , SRP, and TP).

Following that, four environmental factors significantly ( $p < 0.05$ ) affected methanogenesis by reduction of methyl compounds with  $\text{H}_2$ , fermentation, aromatic compound degradation, and nitrate reduction. On the other hand, ten sediment bacteria community functions were significantly ( $p < 0.05$ ) correlated with SRP and TP concentration. Furthermore, depth and pH had a significant ( $p < 0.05$ ) effect on the six sediment bacteria community functions.



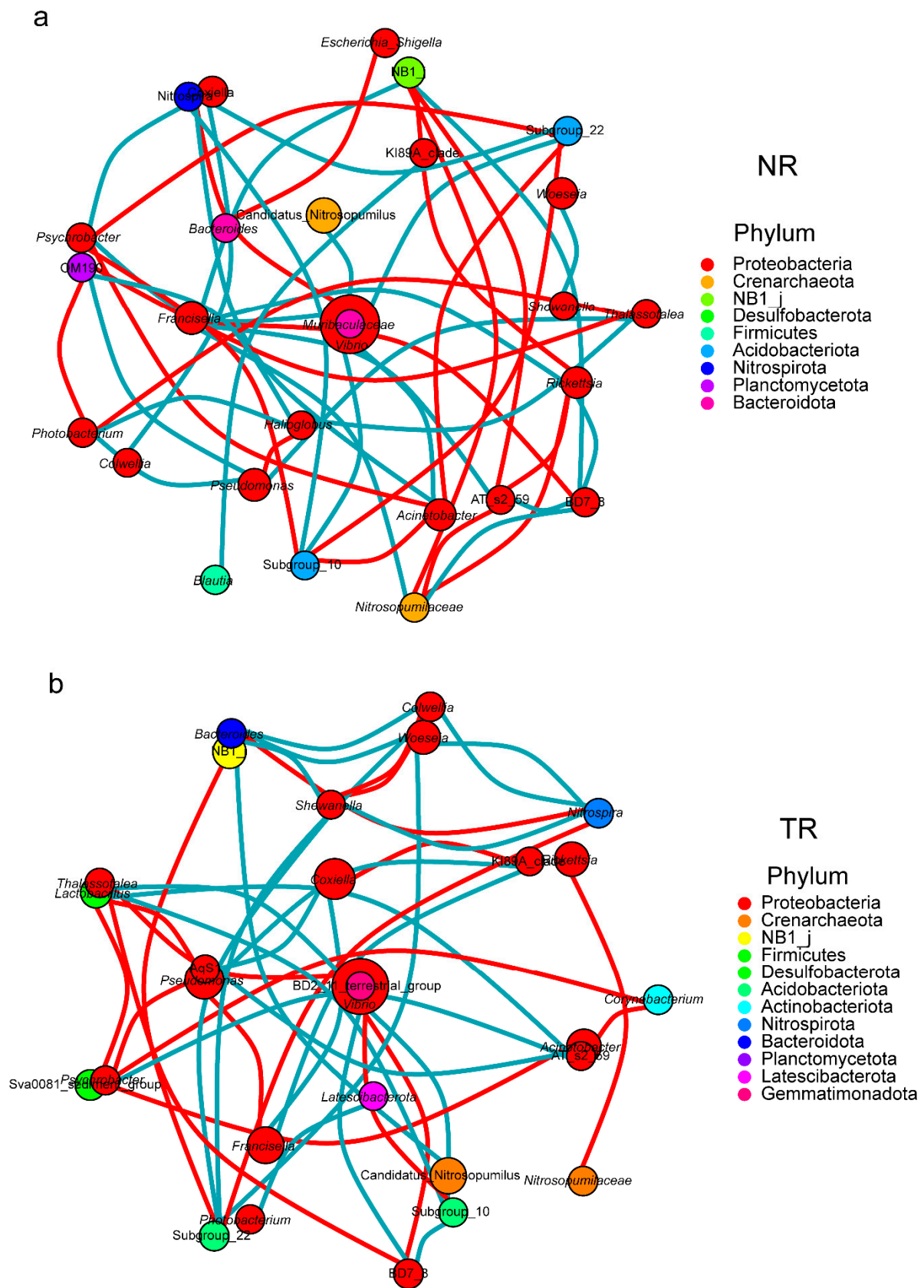
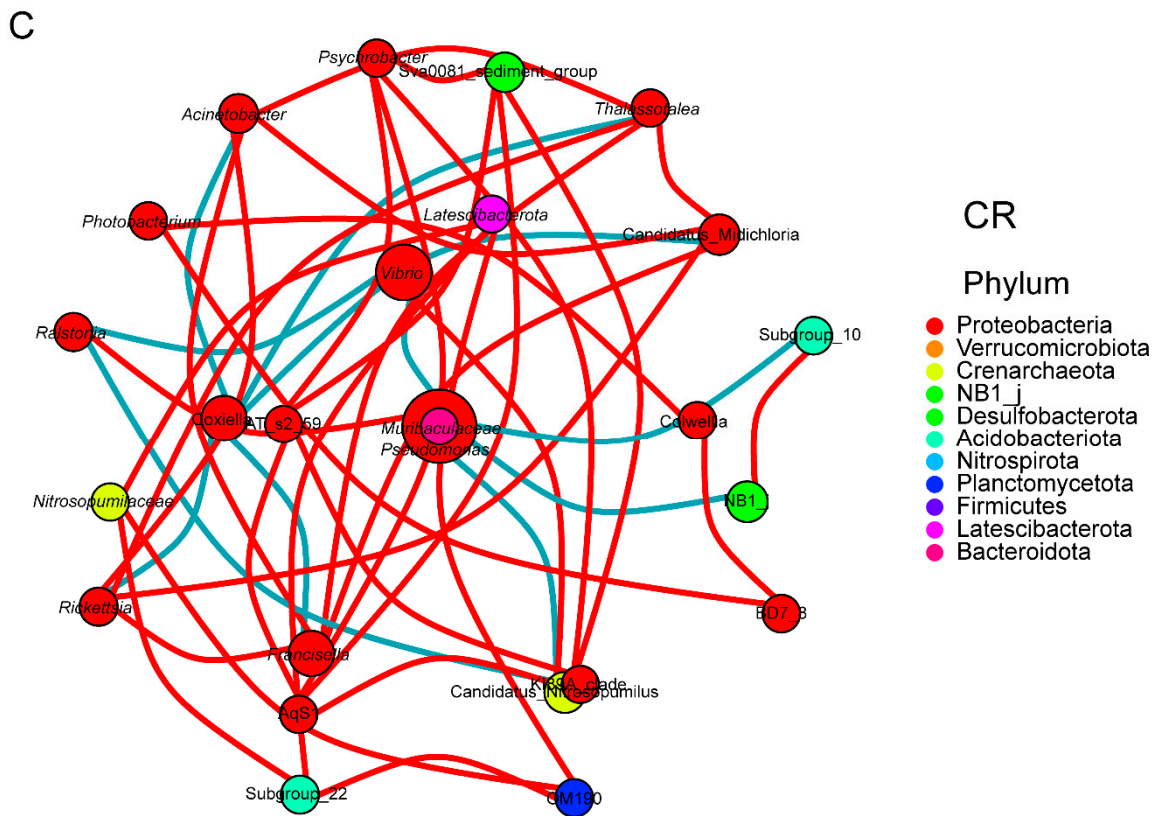
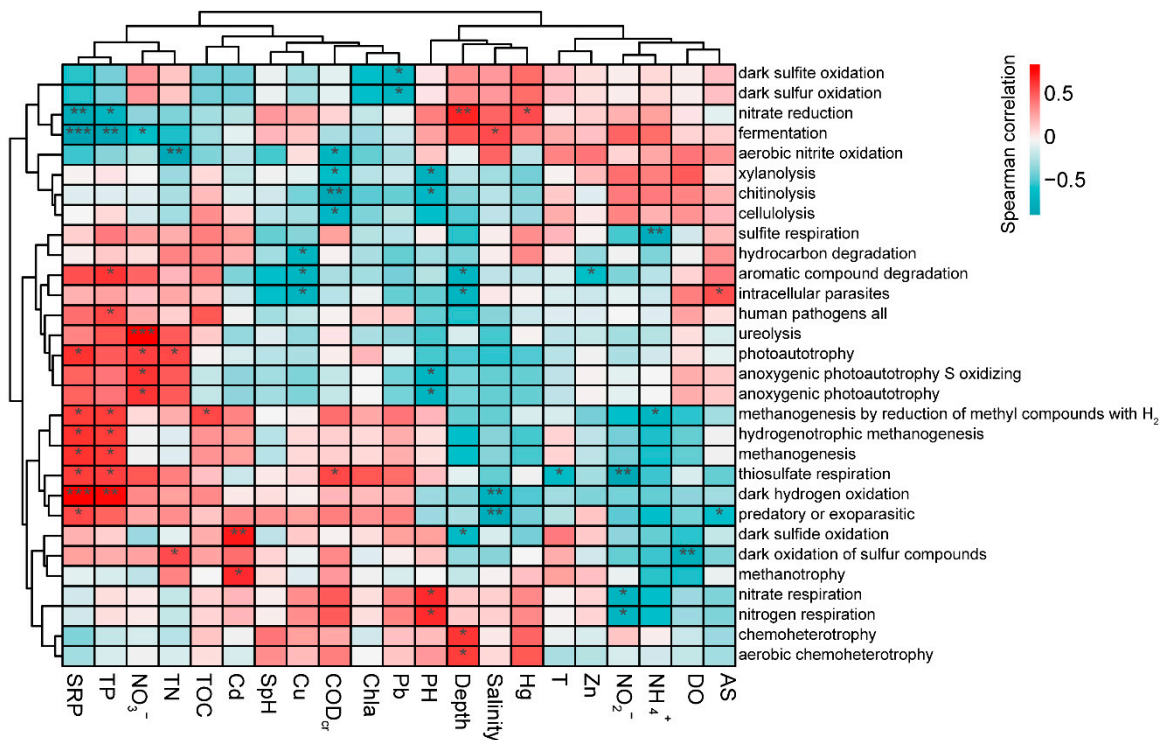


Figure 7. Cont.



**Figure 7.** Correlation network analysis of sediment bacterial genera relative abundance in three areas. (a): NR, (b): TR, (c): CR.



**Figure 8.** Correlation heatmap of bacterial function and environmental factors in the FAPROTAX database for different areas. Different colors indicate the correlation between the environmental factors and potential biogeochemical function predicted by FAPROTAX. \*  $p < 0.05$ , \*\*  $p < 0.01$ , \*\*\*  $p < 0.001$ .

## 4. Discussion

The loss of fishery habitat is one of the important ecological threats faced by the South China Sea [39,40]. China has built large-scale marine ranching to restore the habitat of important fishery waters [2,41]. The previously reported primarily focuses on the impact of marine ranching on fishery resources [42–44]. However, there have been few studies on the long-term changes of microecological communities in the sediments of marine pasture habitats. The present study analyzed the microecological changes of sediments in the artificial reef area and the reef-free control area for ten years and one year and found that the reef throwing behavior was significantly correlated with the local colony characteristics of sediments. The changes in these microbial communities may impact the local environmental characteristics, affecting the ecosystem cycle of local fishery habitats.

### 4.1. Changes in Physicochemical Characteristics of Overlying Water and Sediment

The finding that the pH of overlying water in NR areas was significantly higher than in CR and TR areas may be due to the decomposition of calcium silicate hydrate and calcium hydroxide and decarbonation of  $\text{CaCO}_3$  in the new concrete ARs [45]. This result was consistent with data obtained from the high pH surface region of the new artificial reef [46]. However, the findings of the present study show lower pH of the sediments in TR sites. The overlying water column represents a short-term impact, while the long-term is represented by sediment [16].

The marine biology stocks in the areas around ARs can generally be restored or strengthened after their deployment due to the improved productivity in the region and the accumulation of fish attracted from adjacent areas [47]. The long-term biological deposition causes an increase in humic acid and sulfide in sediments, affecting the sediments' pH [48–51]. Compared to water samples, this emphasizes the sediment samples' accumulation properties and relative stability [52]. Heavy metals are another hot research topic that can easily lead to accumulation. They are persistent, bioaccumulative, and difficult to decompose. The amplification and enrichment of the food chain may cause irreversible damage to the ecological balance and human health [53]. A micro-food loop has been proposed to affirm the importance of marine bacteria in marine ecosystems. Bacteria play an important role in the biological cycle of heavy metals. They are highly efficient microorganisms capable of converting heavy metals into low or nontoxic forms. Several studies are currently being conducted on the bacteria related to heavy metals in marine sediment structures [54]. Biochar can significantly improve heavy metals adsorption capacity. Biochar can fix heavy metals through direct electrostatic attraction, complexation, ion exchange, and precipitation [55]. However, this finding has not previously been described. Although the TOC ranges in the three survey sites were similar, the As of the sediments in CR was significantly lower than in TR. One possible explanation is that ARs contain iron sulphide minerals. It can incorporate trace amounts of arsenic in its structure [56].

Arsenic may release into the environment over time. This is consistent with previous findings, which revealed an excellent linear relationship between Fe/Mn and arsenic content [55,57]. Furthermore, the present study's findings show that the Cu of the sediments in NR was significantly higher than TR. The new ARs induce more Fe,  $\text{CO}_3^{2-}$  and  $\text{OH}^-$ . Cu is easily chemisorbed on or incorporated into a variety of minerals such as chalcopyrite ( $\text{CuFeS}_2$ ), covellite ( $\text{CuS}$ ), and malachite  $\text{Cu}_2\text{CO}_3(\text{OH})_2$ . They remain stable in an alkaline environment [56]. This finding is consistent with the previously described high pH in NR sites.

### 4.2. Sediment Bacterial Community Composition

The present study investigated the abundance and diversity of microbial communities in marine ranching sediments over time, providing a new perspective on the impact of marine pastures on coastal sedimentary habitats. Proteobacteria and Gammaproteobacteria were the most abundant phyla and classes in this study. The finding is consistent with that of

Zhuang [58], who determined microbial community structure in Eastern Guangdong shore sediment. However, the following phyla differed from those previously described [58,59].

It is worth noting that Pielou's evenness and Shannon index of NR were significantly lower than those of CR and TR ( $p < 0.05$ ). Compared with TR or CR sediments, the NR area exhibits a distinct pattern of bacterial diversity. The findings of the present study suggest that the newly formed ARs may have influenced the indigenous sediment microbial community structure. The results are consistent with previous studies [6,16,51]. However, as time passes, the impact of the reef on the microbial community structure of sediments will diminish. Finally, there was no statistically significant difference in the CR area. Not only the alpha diversity presented the above differences, but also the beta diversity results showed similar trends between the study areas through the NMDS. This could result from long-term microbial communities' succession in the TR area [6].

The biomarkers were considered part of the core microorganisms [60]. The LEfSe analysis revealed that Alphaproteobacteria (class level), Moraxellaceae (family level), *Acinetobacter*, Rickettsiales (order level), and Candidatus Midichloria (genus level) of phylum Proteobacteria enriched TR sediment. The wide distribution of Alphaproteobacteria in sediment environments has been well documented [52]. Previous studies have highlighted the importance of Alphaproteobacteria. They are important in decomposing and assimilating organic matter in organically enriched sediments [61]. The increase of Alphaproteobacteria could be attributed to the addition of organic matter in TR sediment [62]. Moraxellaceae was closely related to seawater salinity, making it a potential indicator of seawater invasion [63]. Similarly, *Acinetobacter* occupies an important position in sediment because it is ubiquitous. The multifunctional metabolic characteristics enable it to catabolize various natural compounds. It actively participates in the nutrient cycle of the sediment ecosystem [64]. Candidatus Midichloria and Rickettsiales are ecologically widespread intracellular symbionts found in the sediment. They were infected with aquatic protozoa [65,66].

In comparison to the TR, NR biomarkers were simple. *Francisella* are new bacteria with high virulence that can kill a large number of tilapia. These bacteria also affect many other fishes, including hybrid striped bass and various ornamental fishes [67]. The finding is also consistent with previous observations, which revealed a high abundance of *Francisella* in sediments and water [68,69]. Ulteriorly, these findings also support previous research indicating that Lactobacillales could be used as potential biomarkers in the Nile water [52]. Interestingly, some of the biomarkers are taxa known for their pathogenic potential, such as *Coxiella*, Lactobacillales, and Bacilli [70].

Although we cannot generalize about all species belonging to a particular genus, they have been associated with certain diseases [71]. On the other hand, Bacilli and Lactobacillales of phylum Firmicutes were widely distributed in the sediment and intestinal content. These organisms were typically anaerobic and chemoorganotrophic [72]. They could be identified as potential biomarkers in the CR sediment.

#### 4.3. Relationships between Sediment Microbial Communities and Environmental Factors

RDA correlates microbiota distribution variability to environmental variables. The SRP and TP concentration was thought to be the main driving force in shaping the microbial community in the sediment. These results seem to be consistent with previous research that found that sediment chemical components (i.e., nitrogen and phosphorus concentrations) regulate and form the diversity of bacterial communities [73,74]. The sedimentation environment has shaped different microorganisms, and microorganisms have influenced their habitat environment [12]. Furthermore, the Pearson correlation-based results indicate that *Pseudomonas*, *Lactobacillus*, and *Ralstonia* had a significant positive correlation with SRP, TP,  $\text{NO}_3^-$ , and TN, but a negative association with pH, salinity, Hg, and depth. These results are in line with previous studies. *Pseudomonas* has been isolated from both aquatic and terrestrial ecosystems worldwide. It usually has ecologically important characteristics, including the potential of denitrification and the ability to degrade xenobiotics [75]. It is

worth noting that *Pseudomonas* and *Ralstonia* have a high capacity for removing Pb and Hg from marine sediment [76,77]. The relative abundance of *Pseudomonas* and *Ralstonia* was significantly higher in CR. Consequently, the CR was better suited to their survival. The present study suggests that this area of sediment microbial communities may be subjected to heavy metal stress. However, the *Photobacterium*, *Vibrio*, and *Thalassotalea* had a significant negative correlation with SRP, TP,  $\text{NO}_3^-$ , and TN, but a positive association with pH, salinity, Hg, and depth. *Photobacterium*, *Vibrio*, and *Thalassotalea* commonly occur in seawater and cooperate with marine animals. Some are highly specific bioluminescent mutualisms with marine fish and squid [78,79]. These genera were found to have a higher relative abundance in NR. These findings indicated that these bacteria are preferentially inhabited in NR in abiotic conditions (lower SRP, TP,  $\text{NO}_3^-$  and TN, but higher pH and salinity) and biotic conditions (developing fishery resources).

#### 4.4. Bacterial Relationships within the Sediment Microbial Communities

The correlation network analysis revealed the structure and interactions of the microbial communities in sediment. In the present study, we analyzed the co-occurrence patterns of bacterial communities in the old and new marine ranching at genus levels. We identified the keystone taxa using topological parameters of network analysis. The significant differences in the structures of the correlation networks between areas were explored, indicating that marine ranching significantly impacted the correlation networks of the microorganisms in the sediment [80]. According to the current correlation network results in CR, this is consistent with the fact that microbes from the same domain frequently had significant and predominantly positive correlations with each other [81]. This could imply that mature and stable microbial communities exist in CR. Surprisingly, NR was found to have more negative correlation nodes, indicating that taxa face more competition or predation pressure [82]. However, as time passes, the negative relationship between micro-ecosystem deposition has weakened in TR. These results suggested that after being subjected to disturbance and succession [83], the sediment bacteria community gradually adapted to the existing conditions and reached a relatively stable state.

Compared to other taxa in the network, keystone taxa play an important role in maintaining the network structure of the sediment bacteria community [81]. Some keystones can act as transporters, regulators, and module hubs in bacterial communities, which are critical to the overall stability of the entire microbial network structure [84]. Surprisingly, *Vibrio* served as the module-hubs in the network in all areas. These findings indicate that marine ranching constructions had little influence. *Vibrio* is a typical heterogeneous bacterium widely distributed in marine ecosystems and is usually associated with a high nutritional environment. They are thought to be a potential indicator of eutrophication. In addition, previous studies have shown that *Vibrio* has a variety of metabolic capabilities, including nitrogen fixation, phosphate compound intake, organic matter utilization, and remineralization [19].

Moreover, some pathogenic bacteria from this genus may infect humans and aquaculture [85]. Another possible explanation for the enrichment of *Vibrio* was the high-density mariculture of coastal waters [86]. Our findings align with previous research indicating that *Vibrio* may be dominant in high disturbance areas [38]. Collectively, the current results suggest such keystone taxa should be given more attention.

#### 4.5. Sediment Microbial Functional Annotation

FAPROTAX was used to evaluate the potential functional differences between marine ranching stages and the control area. The present study showed that chemoheterotrophy, aerobic chemoheterotrophy, and fermentation were the top three main functions of the three areas that account for 59.96% relative abundance of the functional annotation. These results are consistent with findings from other marine microcosms [87–89]. However, when we focused on more specific functions, we found that the dominant functions involved in biogeochemical cycling differed depending on the sediment microbial ecosystem. It

was found that only the fermentation of the three primary functions differed significantly among areas. Fermentation was significantly higher in NR sites compared to CR. This disparity could be attributed to extra organic matter deposition by the increased biomass in NR [90]. On the other hand, the cellulolysis and intracellular parasite function were higher in TR than in NR. This result could be explained by the fact that TR's macroalgae and reef creature biomass were higher [91].

As environmental factors influence bacterial communities, the potential functions are consistent with the changes in environmental factors, particularly energy sources, the phosphorus cycle, and inorganic nitrogen [87]. In the current study, the heatmap between FAPROTAX function and environmental factors also revealed that  $\text{NO}_2^-$ , TN, SRP, TP, TOC, depth, and salinity were the key driving factors of the potential biogeochemical functions in the sediment. The key driving factors are consistent with previous research on the relationships between sediment microbial communities and environmental factors. Therefore, the impact of different bacteria in sediments could alter the amount of biogeochemical cycle in the marine ranching ecosystem [92]. In the marine ranching ecosystem, sedimentary colonies may play an important role in nutrient and carbon cycling, interacting with other organisms [81]. In addition, ARs affect the water flow field and accelerate the change of mineral composition of sediments that may support the electrical coupling of more complex microbial redox reactions, contributing to biogeochemical cycling and maintaining ecological stability [47,93,94].

## 5. Conclusions

Overall, the present study provided a more in-depth understanding of sediment microbial communities in marine ranching. Artificial reefs significantly impact these geochemical parameters (i.e.,  $\text{NO}_3^-$ , TN, SRP, TP, and pH). Meanwhile, nutrient concentrations and pH are the primary factors influencing the compositions and structure of the bacterial community in the sediments of an artificial reef. The new artificial reefs reduced sediment alpha diversity. The significant net correlations among bacteria identified in sediment samples from three sea areas showed different patterns. The distribution of potential biogeochemical functions concerning carbon and nutrient cycles in bacterial communities was strongly influenced by sediment environmental conditions, especially  $\text{NO}_2^-$ , TN, SRP, TP, TOC, depth, and salinity. This may impact the trophic transfer of energy in marine ranching food webs. These findings provided new perspectives for investigating the effects of artificial reef disturbances on sediment microbes and facilitated sedimental environment monitoring based on microbial community composition.

**Supplementary Materials:** The following supporting information can be downloaded at: <https://www.mdpi.com/article/10.3390/su142214728/s1>, Figure S1. Shannon rarefaction curve; Figure S2. Taxonomic profile of bacterial communities of sediment samples in phylum level. Only the top 20 relative abundance phyla were shown; Figure S3. Ternary plots of the genera and phyla for bacteria in three sea areas sediment; Figure S4. Pearson correlation-based heatmap of the environment factors and sediment microbial communities from sediment samples; Table S1. the geochemical characteristics of overlying water and sediment among different areas; Table S2. Kruskal-Wallis with Dunn's multiple-comparisons test of Physicochemical characteristics of the overlying water and sediment samples between sampling sites; Table S3. Kruskal-Wallis with Dunn's multiple-comparisons test of FAPROTAX model predicted between sampling sites.

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