1 Response to Referee Comments:

2 We would like to express our gratitude to Ref #1 for the detailed comments and suggestions

- 3 which helped to improve the manuscript significantly. Our point-by-point responses are
- 4 posted below, with the reviewer's comments being quoted first and our response (R) below
- 5 *each comment*.
- 6

## 7 General Comments

8 This study addresses the underlying factors that may influence the spatial and seasonal
9 distribution of the prokaryotic communities and nutrient dynamics along the Rajang River,
10 South China. Although the results of this study are valid and interesting, there are several points
11 that need to be addressed.

12 1) Dividing sampling cruises into "wet season" and "dry season" may be more beneficial than referring to them individually. Authors mentioned both wet and dry seasons in the 13 Methodology section (section 2.1), however, sampling cruises associated with each are lacking. 14 R: We agree that it would be beneficial to classify the sampling cruises into "dry season" 15 and "wet season", however as the two "wet" seasons also differ in terms of its microbial 16 community composition, we kept the individual cruises in order to prevent confusion 17 between the two wet seasons. We have clarified the 'classification' of the three cruises as 18 wet or dry season in the method section (it now reads: The August 2016 cruise (colored 19 red) is classified as the dry season based on the lower mean rainfall value as compared to 20 the other two (March 2017 and September 2017), in which the both are classified as the 21 wet season (refer to Sup. Fig. 1). 22

23

24 2) The site map (Figure 1A) currently shows sampling points throughout the river with source
25 types (Figure 1B), but illustration of anthropogenic activities along the river is missing. It will
26 be helpful to add these as it's not clear which sections of the river are impacted by which
27 activities.

R: Thank you for this. For the anthropogenic activities, the data was extracted from a
 report done by Wetlands International (2015) and is more a qualitative description. This

description was then used for the classification of land use. The Fig 1(B) was intended only to show the zones of peatlands and not for the anthropogenic activities. We have

only to show the zones of peatiands and not for the antiropogenic activities. v added a third man which contains the requested information (Fig. 1C)

- added a third map which contains the requested information (Fig. 1C).
- 33 34

35 3) Additional statistical analysis, such as PERMANOVA, may be used to infer the impact of
anthropogenic activities (e.g. human settlements, effluents, transportation and sand dredging)
and source types on beta diversity. Much of the Results and Discussion sections revolve around
alpha diversity indices but very little is mentioned about beta diversity.

R: Thank you for pointing this out. Beta diversity was in fact calculated and used for the
discussion, however, obviously, not clearly pointed out. For example, the plotting of
nMDS via PRIMER includes Kruskal-Wallis calculations (Kruskal stress formula: 1;

42 Minimum stress: 0.01; 2-d: Minimum stress 0.18 occurred 21 times). Furthermore, the

43 resemblance matrix was calculated using the Bray-Curtis dissimilarity measure. We have

included this information in the methods section to reflect its inclusion in our analyses.
 Additional models have been run for the impact of land use on the microbial communities

# and the discussion extended to address this point. New supplementary figures have been added as well (10-12)

48

49 4) Potential functionality inferred from PICRUST showed clear distinction between samples
50 when comparing source type. It would be interesting to see if potential functionality differed
51 too such an extent when samples are compared by anthropogenic perturbations.

52 R: Thank you for the suggestion. While comparing the potential functionality of the 53 anthropogenic perturbations, there was not much variation across the different 54 anthropogenic activities, hence this was not included in the results and discussion.

55

56 5) The general flow of the Discussion section needs improvement. The significance and 57 contribution of the study will have a bigger impact when the Discussion is presented clear and 58 logically. Also, the authors should double check the tense (present/past/passive) for each 59 section.

60 R: Thank you for pointing this out. We have rearranged the discussion section whereby

61 the bulk of the discussion was the drivers of microbial community composition and was 62 separated into 3 sections, i.e. spatial and environmental drivers, seasonal drivers and 63 anthropogenic drivers.

64

65 6) Recheck format of in-text references. Not all citations are written in the same format.

R: Thank you. We have checked through the in-text reference and changed those that
 have errors.

68 69

## 70 Specific Comments

71

1.0 Introduction p. 4 paragraph 6: The authors aimed to study microbial diversity and potential
function in the Rajang River. Although this study is the first to investigate microbial diversity
along a freshwater-marine gradient, with a tropical peatland component, the importance of the
river in Malaysia and clear objectives need to stated.

R: Thank you for highlighting this. The last paragraph of the introduction was combined 76 with the last few sentences from the previous paragraph. This paragraph now reads: 77 "This study focuses on the Rajang River, which is the longest river in Malaysia and one 78 79 of the most socio-economically important peat-draining rivers in South East Asia. It transports large amounts of terrestrial material (Müller-Dum et al., 2019) experiences 80 81 two monsoonal seasons (Sa'adi et al., 2017) and is subjected to anthropogenic disturbances (Gaveau et al., 2016; Miettinen et al., 2016). Thus, it is fundamental to take 82 into consideration both seasonal and anthropogenic influences on the microbial 83 communities of the Rajang River. Given the rapid development in Sarawak and the 84 importance of microbes in several biogeochemical processes in the Rajang river (Jiang et 85 al., 2019; Martin et al., 2018; Müller-Dum et al., 2019; Zhu et al. 2019), it is imperative to 86 study the microbial communities to enable future predictions and management responses. 87 The Rajang river offers the opportunity to study the microbial diversity along a river to 88 sea continuum and at the same time assess influence of natural conditions such as seasons 89 90 (dry vs. wet), different soil types (peat vs. mineral soil), as well as anthropogenic disturbances (e.g human settlements and plantations) on microbial succession. This study 91 aims to investigate (1) the microbial community structure, diversity and probable 92 93 function across wet and dry seasons in order to (2) understand the underlying factors that 94 may influence the spatial and seasonal distribution of the prokaryotic communities and the nutrient dynamics involved in the Rajang River." 95

96

- 2.0 Methodology 2.1 Study area and sampling strategy p. 5 line 136-139: "According to
  Wetlands International (2015), the land surrounding the study sites is characterized by a range
  of anthropogenic activities, ranging from oil palm and sago plantations to human settlements
  as well as transportation and sand dredging activities (Fig. 1(B))." This is not clear from Fig
  101 1B. Colours are associated with forested or non-forested lands, however, the map does not
  depict the different anthropogenic activities along the river.
- 103 R: Thank you for this. For the anthropogenic activities, the data was extracted from a 104 report done by Wetlands International (2015) and is more a qualitative description. This 105 description was then used for the classification of land use. The Fig 1(B) was intended 106 only to show the zones of peatlands and not for the anthropogenic activities. We have 107 added a new figure highlighting the anthropogenic activities (1C).
- 108
- 2.1 Pyrosequencing and Bioinformatics Analyses. Change "Pyrosequencing" to "Illumina sequencing" in the subheading. The authors did not perform 454-pyrosequencing but Illumina sequencing. Did ACE also extract DNA from samples? If that's the case, the authors should mention this in the beginning of this section.

#### 113 R: Agreed. "Pyrosequencing" was changed to "Illumina sequencing". Yes, ACE also 114 extracted the DNA samples. This information was placed at the sentence before section

- 115 **2.2.**
- 116
- 3.1 2.4 Statistical Analyses and distLM model. The authors used db-RDA to determine the
  impact of environmental variables on microbial diversity. The same method can be used to
  determine which parameters have an influence on specific bacterial taxa. Likewise,
  Spearman/Pearson correlations can be drawn between environmental parameters and taxa. The
  information inferred from these additional analyses can help the authors to link certain taxa to
  specific source types or pollution sources.

# 123 **R**: We agree that this would be a good addition to the existing discussion and have carried

# out the suggested analyses. Spearman's ranking on the major taxa does support the key

- 125 role of salinity shaping the microbial diversity.
- 126
- I also suggest that anthropogenic inputs should be divided into the following categories: human settlements, effluents (from both palm oil and sago plantations), transportation and sand dredging. Variation partitioning, if possible, may then be used to determine which anthropogenic input, or source type, had the biggest impact on bacterial diversity along the river.
- 132 R: Thank you for this suggestion. We did indeed use variation partitioning for the distLM 133 models. Unfortunately we do not think that we have sufficient data points from areas
- affected by sand dredging to be included in the model. Transportation of logs and sand
- by boats can be observed throughout the whole river, making it difficult to distinguish its
- 136 impact between different sites.
- 137
- 138 3.0 Results 3.3 Bacterial Distribution according to source type and cruise This section
- 139 may be improved by organizing it into the following paragraphs: Mention the dominant taxa
- and their relative abundances. The author mentioned this in the Discussion section (section 4.1
- 141 line 333-335) but not in the Results section.
- 142 R: Agreed, this was moved to the results section 3.3.
- 143
- 144 Which taxa (dominant or specialized) were more predominant at specific source types and/or
- seasons?

146 In this section, the authors acknowledge a higher Cyanobacterial abundance for the September 147 2017 marine and brackish peat samples. In the Discussion section they refer to the higher 148 Cyanobacterial counts as "blooms" without prior testing (e.g. chlorophyll-a) as a proxy 149 measure to confirm algal blooms. Since Cyanobacteria are more pronounced during warmer 150 months, and anthropogenic activities close to the sampling areas can cause nutrient input and 151 thus proliferation of Cyanobacteria, how valid is the assumption/statement made in the 152 manuscript without additional measurements?

R: Thank you for pointing this out. There were two measurements for validating cyanobacterial abundance. One was the respiration experiment, which showed that there was greater respiration as compared to oxygen production. The other was phytoplankton identification via pigments using a software (CHEMTAX). Only two sampling cruises were available for the phytoplankton identification, which unfortunately for September 2017 is unavailable. However, between the dry (August 2016) and wet (March 2017)

- 159 seasons, the wet season did indeed show greater counts of *Cyanobacteria*.
- 160

Alpha Diversity Indices: How did the authors calculate the effect of land use and source typeon alpha diversity indices? This was not mentioned in the Methodology section.

163 R: The information "The alpha diversity was calculated using the estimate\_richness 164 function embedded within the plot\_richness function found within the phyloseq package 165 utilizing R (v.3.5.3)." is now included in Section 2.2

166

Instead of comparing indices between cruises, the authors can make comparisons betweenseasons (e.g. compare the entire wet season with the dry season).

169 **R:** Referring to the earlier explanation, we kept the individual cruises as the two wet 170 seasons exhibited different microbial community composition, which warrants two 171 separate cruises instead of the entire wet season.

172

Discussion: I recommend that the authors re-write certain paragraphs of the Discussion section so that it may have a bigger impact on readers. Instead of naming all the different types of taxa in the river, focus on the important ones and what their roles are. How does the environment and different inputs (source types and anthropogenic activities) impact these taxa?

R: Thank you for highlighting this. The sections were further subdivided whereby the
main discussion was focused on the factors determining bacterial community composition
and was subdivided into three components which are (4.2.1 Spatial and environmental
drivers, 4.2.2 Seasonality as a driver of microbial community composition and 4.2.3
Land-use change and anthropogenic drivers.

182

Possible pathogenic bacteria and/or anthropogenic influence and land-use change. Was
Flavobacterium the only potential pathogen identified? I would suggest to start the paragraph
with anthropogenic influence and land-use change. A second, shorter paragraph can discuss
the potential pathogens

187 R: The possible pathogenic bacteria identified were part of the CFB group. We grouped
188 together the other information regarding *Proteobacteria* and *Bacteroidetes* as part of the
189 paragraph relating to land use change and anthropogenic drivers.

190

# 191192 C) Technical comments

193

1.0 Introduction p. 3: Combine paragraphs 2 and 5. Both are discussing lotic environments andnutrient cycling; it will thus make more sense to combine these two.

Response: Agreed, the two paragraphs were combined. This paragraph now reads: 196 "Lotic environments are the interface between soil and aquatic environments and aquatic 197 environments as terrestrial environments seed microbes into the adjacent water column 198 due to flowing waters (Crump et al., 2012). Until not long ago, rivers were thought to be 199 200 passive channels in the global and regional determination of carbon (C) and weathering products until it became clear that rivers regulate for example the transfer of nutrients 201 from land to coastal areas (Smith and Hollibaugh, 1993). Several studies have shown that 202 bacteria are key players in nutrient processing in freshwater systems (Cotner and 203 Biddanda, 2002; Findlay, 2010; Madsen, 2011). Zhang et al. (2018a) stated that the 204 organic matter composition is strongly modified by bacteria as well as its resistance to 205 degradation. Bacteria strongly influence the fluvial organic matter, hence playing a role 206 in carbon cycle (Dittmar et al., 2001) and recent studies in the Rajang river have 207 208 demonstrated that as indicated by high concentrations of D-form amino acids (Zhu et al., 209 2019). Moreover, it was demonstrated by Jiang et al. (2019) that Dissolved Organic Nitrogen was reduced to NH4+ via mineralization and ammonification, again 210 highlighting the biogeochemical activity and the importance of microbes in the Rajang 211 212 River. Until now, there has, however, been no study on their diversity yet; a gap that this study aims to fill. Thus, it is essential to understand the dynamics and structure of 213 microbial communities in them to assess their contribution towards biogeochemical 214 fluxes such as carbon and nitrogen (Battin et al., 2008; Raymond et al., 2013), as well as 215 phosphate cycling (Hall et al., 2013). In addition, the fluxes as well as transformations of 216 organic matter as well as nutrients in aquatic systems are environmentally driven by 217 parameters such as temperature or the availability of nutrients in these ecosystems (Welti 218 et al., 2017). In turn, various gradients (i.e physical, chemical, hydrological or even 219 biological) contribute to the changes in the microbial diversity and distribution living 220 within the lotic environments (Zeglin, 2015)." 221

222

p. 4 line 93-93: Due to their high diversity and fast generation time, microbial communities are
 the first responders to environmental changes

- 225 **R:** Agreed and changed to recommended sentence.
- 226

p. 4 line 96: Liao et al. (2019) showed that p. 4 line 97: delete "further" p. 4 line 97:

- Bruland et al. (2008) demonstrated that the
- 229 R: Agreed, removed "further"
- 230

p. 4 line 99-102: "Thus, as the Rajang River experiences two monsoonal seasons (Sa'adi et al.,
2017) and is subjected to anthropogenic disturbances (Gaveau et al., 2016; Miettinen et al.,
2016), it is thus fundamental to take into consideration both seasonal and anthropogenic
influences on the microbial communities of the Rajang River." This forms part of the aim and
objective and should rather move to last paragraph

- **R:** Agreed, this was changed to better reflect the aim and importance of the Rajang River.
- 237238 p. 4 line 115: delete "hypothesized"

### 239 **R: Agreed, removed "hypothesized"**

240

p. 4 line 120-121: as well as anthropogenic disturbances (e.g. human settlements and

- 242 plantations) on microbial succession.
- 243 R: Agreed, changed to recommended sentence.
- 244
- p. 4 line 121-122: Delete "Linear models are

| 246<br>247        | used to examine the relationship between the microbial community structure and their environment."   |
|-------------------|--|
| 248<br>249        | R: Agreed to remove sentence as it was already explained in methodology.   |
| 250<br>251<br>252 | 2.0 Methodology 2.1 Study area and sampling strategy p. 5 line 130: The region: <b>R: Agreed. Changed to "The"</b>   |
| 252               | p.5 line 134: small tributaries  |
| 254<br>255        | R: Agreed, changed from "distributaries" to "tributaries"  |
| 255               | p. 5 line 142: Which months were associated with the wet and dry season, respectively?   |
| 257<br>258<br>259 | <b>R</b> : The following sentence was extracted from the caption of Sup. Fig. 1. " The August 2016 cruise (colored red) is classified as the dry season based on the lower mean rainfall value as compared to the other two (March 2017 and September 2017), in which the both   |
| 260               | are classified as the wet season." to be placed in-text in the methodology for ease of   |
| 261<br>262        | reference  |
| 262               | p. 5 line 149: Approximately 250 – 500 mL of water: : :.   |
| 264               | R: Agreed, changed to "approximately"  |
| 265               |  |
| 266               | p. 5 line 153-156: A total of 117 filters were recovered (1 x 3.0 _m filter was discarded  |
| 267               | due to contamination) and immediately stored at - 20_C.  |
| 268               | R: Agreed. The sentence was changed as recommended.  |
| 269               |  |
| 270               | 2.2 Pyrosequencing and Bioinformatics Analyses p. 5 line 160: Briefly, fastq files   |
| 271               | generated: :: :  |
| 272<br>273        | R: Agreed. "In short" changed to "Briefly"   |
| 275               | p. 6 line 161: quality trimmed with fastqc, primer sequeces: : :.  |
| 275               | <b>R: Agreed, changed from "processed" to "quality trimmed"</b>  |
| 276               | The regreed of the second of t |
| 277               | p. 6 line 162-163: High quality sequences were subsequently processed using the Mothur   |
| 278               | pipeline.  |
| 279               | R: Agreed. Changed to the recommended sentence.  |
| 280               |  |
| 281               | p. 6 line 164: SILVA database  |
| 282               | R: Agreed, "alignment" changed to "database"   |
| 283               | n 6 line 171, notantial functional games   |
| 284               | <ul><li>p. 6 line 171: potential functional genes</li><li>R: Agreed, added "potential"</li></ul>   |
| 285<br>286        | K. Agreeu, audeu potentiai   |
| 280               | 2.3 Physico-chemical Data and Geochemical Analyses p. 6 line 179: in-between the   |
| 288               | Cruises  |
| 289               | R: Agreed, added "-"   |
| 290               | p. 6 line 189-191: Belawai samples (2_13'47.16"N, 111_12'19.04"E) were used  |
| 291               | in an incubation experiment to study the net primary productivity and respiration rate   |
| 292               | of the Rajang River. Technical triplicates were incubated in both light and dark set-ups   |
| 293               | (Refer to Supp. Table 1 for details).  |
| 294               | R: Agreed, the sentence was modified to the recommended sentence.  |
| 295               |  |

2.4 Statistical Analyses and distLM model p. 6 line 195-197: to determine if the various 296 terrestrial source types or different land use impacted bacterial community composition. 297 R: Agreed, sentence structure was changed to the recommended. 298 299 p. 7 line 199: what type of normalization method was used? 300 R: The following sentence was added: "using the "Normalise Variables" function in the 301 PRIMER 7 software". 302 303 p. 7 line 202-204: "The authors would like to note that the distLM models are based on only 304 the August 2016 and March 2017 cruise as there was a lack of physico-chemical data from the 305 September 2017 cruise due to malfunctioning equipment." Delete this sentence, no 306 need to mention this twice, at the end of the paragraph (lines 205-208) is sufficient 307 308 **R:** Agreed, the sentence was removed. 309 p. 7 line 215: A total of 74,690 high quality bacterial sequences: : ... 310 **R:** Agreed and changed as recommended. 311 312 3.2 Shifts in bacterial community structure p. 7 line 223-224: Delete this sentence, it's 313 Redundant 314 **R:** Agreed, the sentence was removed. 315 316 p. 7 line 230: August 2016 (dry season) samples 317 R: Agreed, added "(dry season)" to the sentence. 318 319 p. 7 line 231: September 2017 (wet season) samples 320 R: Agreed, added "(wet season)" to the sentence. 321 322 p. 7 line 231: There were clear overlaps between samples from: 323 R: Agreed, changed from "there are apparent" to "there were clear" 324 325 p. 7 line 232-233: We also observed a gradual shift in bacterial composition from mineral soils 326 and freshwater peat towards brackish and marine samples. 327 R: Agreed, sentence was changed accordingly as recommended. 328 329 3.3 Bacterial Distribution according to source type and cruise p. 8 line 240: Delete "Fig 330 331 3 show that" R: Removed as recommended but added (Fig. 3) to the end of the sentence. 332 333 3.4 Alpha Diversity Indices p. 8 line 263-264: Rewrite the sentence 334 R: Sentence was rewritten as "For the September 17 cruise, we observed increased values 335 of Chao1 across the brackish peat, freshwater peat as well as mineral soils." 336 337 p. 8 line 265: microbial communities varied significantly along the different source types 338 R: Agreed, changed sentence as recommended. 339 p. 8 line 266: to be higher than that of March 2017: 340 R: Agreed, changed from "found in" to "of" 341 342 p. 9 line 276: Authors are referring to "upstream" samples in this sentence, which samples are 343 these? They did not clearly differentiate between upstream and downstream samples in the 344 Methodology section which is causing confusion in subsequent text. 345

# R: Agreed. Added explanation at the end of the text: (i.e. Human Settlement, Oil Palm and Sago Plantation, Oil Palm Plantation and Secondary Forest).

- 348
- p. 9 line 289-290: Potential KEGG pathways between (i) marine and brackish peat, and (ii)
  freshwater peat and mineral soil were similar. There were differences between source types
  and seasons
- 352 **R:** Agreed, the recommended sentence provided more clarity.
- p. 9 line 290-292: Delete this sentence. It's part of Discussion
- 355 **R: Agreed and removed.**
- 356

359

362

- p. 9 line 301: Dissolved Inorganic Phosphate (10.57%)
- 358 R: removed "at" and added parenthesis to "10.57%".
- p. 9 line 304: Delete "lastly"
- 361 **R: Agreed.**
- p. 9 line 305: Dissolved Inorganic Nitrogen (4.29%) respectively made up the
- R: Agreed, changed from "(4.29%, respectively)" to "(4.29%) respectively
- 365

p. 10 line 308-309: Move this sentence to p. 9 line 300: "Marginal DistLM was performed in
order to gauge the extent of physicochemical parameters or environmental variables accounting
for a compelling proportion of variation in the bacterial communities. Significant vectors of
environmental variables (R2>0.3892, P <0.001) were 308 calculated based on a linear model</li>
(DistLM) and plotted against the bacterial community composition as shown in Fig 7. Salinity
was the single best predictor variable

- 372 **R: Agreed and changed.**
- 373

p. 10 line 311-320: The distLM model clustered samples from the August 2016 cruise
separately from the March 2017 samples. Brackish peat, as well as marine samples from
August 2016, correlated more strongly with salinity, irrespective of land use. On the contrary,
the March 2017 samples were found to cluster separately with DO. In addition, the August
2016 mineral soil samples correlated with silicate.

- **R: Agreed and changed to suggested sentences.**
- 380

p. 10 line 332: Delete this subheading and move subheading 4.2 to 4.1

## 382 R: Agreed, the remaining labels were corrected accordingly.

383 p. 10 line 335-342: in varying abundances, indicating high variation within the system. The 384 majority of bacterial taxa were restricted to a relatively small number of assemblages. However, 385 due to the heterogeneity of the Rajang River, substantial shifts in OTU diversity were shown, 386 while exhibiting successional changes in community composition downstream. We observed 387 abrupt shifts in terms of richness and diversity as well as bacterial distribution, which was 388 structured according to macro-scale source types. Staley et al. (2015) proposed that variability 389 390 in microbial communities were less due to the presence/absence but likely due to shifts in relative abundance of OTUs. 391

- 392 **R: Agreed and changed.**
- 393

p. 10 line 342: community composition, overlap between the core microbiome (i.e. free-livingand particle-attached portions) of samples were not evident.

| 396 | R: Agreed and changed.   |
|-----|--|
| 397 |  |
| 398 | p. 11 line 346: Change "further supported" with "demonstrated"                                     |
| 399 | R: Agreed and changed.   |
| 400 |  |
| 401 | p. 11 line 351: The short residence time in the Rajang River likely reflected a similar scenario   |
| 402 | to San Francisco Bay (Reference).  |
| 403 | R: Agreed and changed.   |
| 404 |  |
| 405 | p. 11 line 372-378: Delete these sentences. Beta-proteobacteria was already mentioned in the       |
| 406 | previous paragraph.  |
| 407 | R: Agreed and removed.   |
| 408 |  |
| 409 | p. 11 line 380: Were there really Cyanobacterial blooms?   |
| 410 | R: Thank you for pointing this out. Cyanobacterial bloom was changed to "the higher                |
| 411 | abundance of <i>Cyanobacteria</i> ", which more accurately describes the composition as shown      |
| 412 | by the abundance in taxa.  |
| 413 |  |
| 414 | p. 12 line 385: Sphingomonas, a purple-sulfur bacteria,  |
| 415 | R: Agreed and changed.   |
| 416 |  |
| 417 | p. 12 line 391: indicating its preference for this environment. It's interesting to note that most |
| 418 | studies on   |
| 419 | R: Agreed and changed to recommended sentence.   |
| 420 |  |
| 421 | p. 12 line 394: In most of these studies, Deinococcus-Thermus was found in low abundance           |
| 422 | (e.g. 1% in Antarctic marine environments, 1.5% in hypersaline soils; Giudice and Azzaro,          |
| 423 | 2019; Vera-Gargallo et al., 2019) when compared to the Rajang River.                               |
| 424 | R: Agreed and changed.   |
| 425 |  |
| 426 | p. 12 line 397: Start new paragraph with: "There was a fundamental shift in bacterial              |
| 427 | community composition when taking the major taxa into consideration. There was a clear             |
| 428 | distinction between dry and wet seasons with an overall higher species richness and diversity      |
| 429 | for the dry season" For the wet season, focus on both the March and September cruises to make      |
| 430 | a conclusion   |
| 431 | R: Agreed and changed.   |
| 432 |  |
| 433 | p. 13 line 421-427: Delete these sentences, was already mentioned in Methodology                   |
| 434 | R: Agreed, the sentences were removed.   |
| 435 |  |
| 436 | p. 13 line 427: There was a continual shift  |
| 437 | R: Agreed, changed "is" with "was".  |
| 438 |  |
| 439 |  |
| 440 | p. 13 line 432: similar to findings by   |
| 441 | R: Agreed, changed "akin" to "similar"   |
| 442 |  |
| 443 | p. 13 line 434: likely explaining the reduced relative abundances of some taxa. For example,       |
| 444 | Chloroflexi has a higher relative abundance upstream while Deinococcus-Thermus shows               |
| 445 | lower relative abundance downstream.   |

- 446 447
- R: Agreed and changed to recommended sentence.
- p. 13 line 438: Delete "salinity gradients"
- 449 **R: Agreed and removed.**
- 450

p. 13 line 451: Salinity, DIP () and dissolved oxygen are major environmental drivers of species
distribution (References). In this study, marine and brackish peat samples correlated well with
salinity.

- 454 **R: Agreed and changed.**
- 455

p. 14 line 459-469: Not sure what the authors want to say here. Do they assume there was highor low bacterial productivity?

R: We deduced that even though there was high abundance of associated phyla that may
contribute to the production of O<sub>2</sub> (via primary production), the high CO<sub>2</sub> emissions and
higher respiratory rate show that there was higher bacterial productivity versus primary
production.

462

p. 14 line 478-480: While the development of unique community structures was strongly
influenced by spatial factors, seasonality also played a role. Seasonal variability was also
observed between the

- 466 **R: Agreed and changed to recommended sentence.**
- 467

p. 14 line 485-490: Again, can the term Cyanobacterial bloom be accurately used?

R: Thank you once again for pointing this out. The sentence was changed to "The greater 469 abundance of Bacteroidetes in March 2017 may be indicative of the community 470 composition adjusting due to the processing of organic material caused by the higher 471 cyanobacterial abundance in the September 2017 cruise. This was similar to a study by 472 Pinhassi et al., (2004), in which the higher abundance of Bacteroidetes follows after an 473 algal bloom.". This would reduce the assumption of a cyanobacterial bloom. The study 474 quoted (Pinhassi et al. (2004)) was used as an example for probable inference of 475 cyanobacterial bloom but cannot yet be confirmed. 476 477

- p.15 line 494: "were similar in terms of climate"
- 479 **R: Agreed, and changed.**
- 480

p. 15: Start the paragraph with line 515: "The results obtained from this study suggest that the
run-off from anthropogenic activities alters the microbial community composition.
Anthropogenic disturbances, in particular settlements and logging (secondary forest), led to
higher diversity indices (Fig .6). On the contrary, sites surrounded by oil

- R: Agreed and changed. The breaking of paragraphs provide better clarity to the overall
  flow.
- 487 488

p. 16 line 543: The authors refer to "pristine and less pristine environments". Which sites wereclassified as pristine, and which were less pristine?

491 R: Thanks for pointing this out. We have changed this to "anthropogenic perturbations

- 492 (regions with oil palm plantations and human settlements) led to increased richness but
- 493 less diversity compared to those that were less affected by anthropogenic perturbations
- 494 (coastal zone and secondary forest)."
- 495

p. 16 line 545: The PICRUST results showed differences between source types

## **R:** Agreed, changed "difference" to "differences"

p. 16 line 550: mixing experiments. This approach will contribute towards a better
understanding of the response of microbial communities to anthropogenic perturbations, as
well as their role in degrading peat-related run-off from

**R: Agreed, and changed to suggested sentence.** 

### 508 We would like thank Ref #2 for the comments and suggestions which helped to improve the 509 manuscript significantly. Our point-by-point responses are posted below, with the reviewer's 510 comments being quoted first and our response (R) below each comment.

512 The manuscript of Sia et al. describes a study of bacterial communities' distribution in a section of the Rajang River. Overall, the quality and content of the paper is in line with similar 513 publications on lotic bacterial communities, where the community composition is linked to 514 environmental parameters. The strongest point of the study is that is covers multiple time points 515 (different seasons) and several salinity zones. The authors also made an attempt to estimate 516 potential functions of the bacterial communities. I would like to note a detailed and 517 comprehensive Discussion section. However, some revision is necessary. Certain results need 518 to be verified, methods described more in details (please see specific comments). English 519 520 language could be improved; the manuscript is not free of mistakes and misprints.

521

523

511

- 522 Some specific questions and comments:
- P 5 L 146 it is not clear for me how is classification into freshwater and brackish water
  described in Fig. 1(B). Possibly that is due to the poor quality of the map.
- R: Thank you for pointing this out. We removed this sentence "as described in Fig 1. (B)"
  as Fig. 1(B) is to show the areas with peat only.
- P 5 L 150, 152 Are you sure that those were polycarbonate filters? GF are usually glass fiber
  filters.
- R: Thank you for pointing this out. The correct filter used was Nuclepore<sup>™</sup> Track Etched Polycarbonate Membrane Filter. We have removed the (GF/C) description.
- 533

- 534 P 5 L 156 Incorrect reference. Caporaso et al. 2012 describe QIIME pipeline,
- 535 not Illumina sequencing.
- R: Agreed. Changed to Bentley et al. (2008) which describes the first paper that Illumina
  was based upon.
- 538
- 539 P 5 L 156 Could you please add more information on DNA
- 540 extraction and library preparation procedures, for example, which primers were used
- 541 for amplification?
- 542 R: Thank you for pointing this out. We have included the relevant information in the 543 methods section. It now reads: ....A total of 117 filters were recovered (1 x 3.0  $\mu$ m was 544 discarded due to contamination) and immediately stored at -20 °C and sent to the
- 545 Australian Centre for Ecogenomics (ACE), Brisbane for DNA extraction, library 546 preparation and processing utilizing the Illumina (Bentley et al., 2008) platform.
- 547 2.2 Illumina Sequencing and Bioinformatics Analyses
- 548 Initial upstream processes were carried out by the Australian Centre for Ecogenomics 549 utilizing the ACE mitag pipeline (ACE, 2016). The primers utilized were based on the V3
- 550 V4 hypervariable regions of the 16S rRNA gene.
- 551
- 552 P 6 L 163 Reference for Mothur pipeline missing.
- **R:** Thank you for pointing this out. The relevant citation was added (Schloss et al., 2009)
- 555 P 6 L 175 –Reference for the GreenGenes database missing.
- 556 **R:** Thank you for pointing this out. The relevant citation was added (DeSantis et al., 2006)

P7L215 – Can you explain why the sequencing depth was so low, especially for some samples? 557 Was it on purpose? 558 R: Thank you for this question. The minimum sequencing depth was 10,000 reads per 559 sample. After QC and removal of unknown sequences, some samples were left with a very 560 low read count. Given the general lack of data from these systems and to 'lose' as little 561 information /samples as possible, we chose a low read number for the subsampling. 562 563 564 P 7 L 215 – Were the sequences deposited to a public database? R: Raw sequences have been deposited with the NCBI BioSample database under 565 **BioProject ID PRJNA565954.** 566 567 P 7 L 232 – Are you sure it is "brackish peat" and not "freshwater peat", which seems to me 568 569 from Fig.2? R: Yes, thank you for pointing this out. "Brackish peat" was changed to "freshwater peat" 570 571 P 8 L 247-249 – This observation is not obvious to me from Fig. 3. 572 573 R: Agreed, this portion was removed. 574 P 8 L 258-259 – was the difference between OTU counts statistically significant? 575 R: The results shown were plotted based on the calculations from the estimate richness 576 function in the *phyloseq* package, and hence the observation was more a qualitative 577 578 observation. 579 P 10 L 324 – I didn't find any description of the results separately for free-living and particle-580 attached bacteria, however you discuss them a bit in chapter 4.1 in relation to Supp. Fig. 3. 581 Were the results pooled together for free-living and particle-attached bacteria in Fig. 2-7? 582 R: Thank you for pointing this out. Yes, for Figures 2 – 7 the results were pooled together 583 for discussion as the difference between free-living and particle-attached bacteria did not 584 exhibit clear distinction and hence was not further elaborated. The following sentence 585 was added in Section 2.2: "Apart from the results and discussion shown for free-living 586 and particle-attached bacteria, the remaining discussion is based on the pooled results of 587 both components" 588 589 P 11 L 378-380 - How does the dominance of Proteobacteria indicate its role in nitrogen 590 cycling? Please explain how it is complementary to Cyanobacteria bloom, the message 591 592 is unclear. R: The sentence was rephrased as "In a study by Yang et al. (2013), the dominance of 593 Protebacteria influenced the nitrogen cycle via the processes of nitrification and 594 denitrification, in which aeration would increase its abundance and result in higher 595 mortality of cyanobacteria. 596 597 P 12 L 394- 397 – "In contrast, most extreme environments show" this sentence sounds strange 598 and needs to be rephrased. 599 R: Agreed, this sentence was changed to "In most of these studies, Deinococcus-Thermus 600 was found in low abundance (e.g. 1% in Antarctic marine environments, 1.5% in 601 hypersaline soils; Giudice and Azzaro, 2019; Vera-Gargallo et al., 2019) when compared 602 to the Rajang River." 603 604 605

- 606 Biogeographical distribution of Microbial Communities along the Rajang River-South China
- 607 Sea Continuum
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- 621

#### 622 Abstract

623 The Rajang River is the main drainage system for central Sarawak in Malaysian Borneo which passes 624 through peat domes whereby peat-rich material is being fed into the system and eventually into the southern South China Sea. Microbial communities found within peat-rich systems are important 625 626 biogeochemical cyclers in terms of methane and carbon dioxide sequestration. To address the critical 627 lack of knowledge about microbial communities in tropical (peat-draining) rivers, this study represents 628 the first seasonal assessment targeted at establishing a foundational understanding of the microbial 629 communities of the Rajang River-South China Sea continuum. This was carried out utilizing 16S rRNA 630 gene amplicon sequencing via Illumina MiSeq in size-fractionated samples (0.2 and 3.0 µm GF/C filter membranes) covering different biogeographical features/sources from headwaters to coastal waters. 631 632 The microbial communities found along the Rajang river exhibited taxa common to rivers (i.e. 633 predominance of  $\beta$ -Proteobacteria) while estuarine and marine regions exhibited taxa that were 634 common to the aforementioned regions as well (i.e. predominance of  $\alpha$ - and  $\gamma$ -Proteobacteria). This is in agreement with studies from other rivers which observed similar changes along salinity gradients. In 635 636 terms of particulate versus free-living bacteria, nonmetric multi-dimensional scaling (NMDS) results 637 showed similarly distributed microbial communities with varying separation between seasons. Distinct 638 patterns were observed based on linear models as a result of the changes in salinity along with variation 639 of other biogeochemical parameters. Alpha diversity indices indicated that microbial communities were 640 higher in diversity upstream compared to the marine and estuarine regions whereas anthropogenic perturbations led to increased richness but less diversity. Despite the observed changes in bacterial 641

| 642 | community composition and diversity that occur along the Rajang River to sea continuum, the PICRUSt   |
|-----|---|
| 643 | predictions showed minor variations. The results provide essential context for future studies such as |
| 644 | further analyses on the ecosystem response to anthropogenic land-use practices and probable           |
| 645 | development of biomarkers to improve the monitoring of water quality in this region.                  |
| 646 |   |
| 647 | Keywords: particle-associated microbes, free-living microbes, 16S rRNA, Rajang river, River-sea       |
| 648 | continuum   |
| 649 |   |
| 650 |   |
| 651 |   |
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| 653 |   |

#### 654 **1. Introduction**

Biogeochemical transformations are primarily governed by microbial communities (Konopka, 2009), and it is crucial to understand their dynamics in order to predict biosphere modulations in response to a changing climate. Despite the importance of freshwater to society and despite hosting the highest microbial diversity (Besemer et al., 2013), microbial community composition and diversity in freshwater habitats, especially in lotic environments, are much less studied compared to marine and soil communities (Kan, 2018).

661

662 Lotic environments are the interface between soil and aquatic environments and aquatic environments as terrestrial environments seed microbes into the adjacent water column due to surface runoff (Crump 663 et al., 2012). Until recently, rivers were thought to be passive channels in the carbon (C) cycling and 664 665 weathering products until it became clear that rivers regulate for example the transfer of nutrients from land to coastal areas (Smith and Hollibaugh, 1993). Several studies have shown that bacteria are key 666 players in nutrient processing in freshwater systems (Cotner and Biddanda, 2002; Findlay, 2010; 667 668 Madsen, 2011). Zhang et al. (2018a) stated that the organic matter composition is strongly modified by 669 bacteria as well as its resistance to degradation. Bacteria strongly influence the fluvial organic matter, 670 hence playing a role in carbon cycle (Dittmar et al., 2001) and recent studies in the Rajang river have 671 demonstrated that as indicated by high concentrations of D-form amino acids (Zhu et al., 2019). 672 Moreover, it was demonstrated by Jiang et al. (2019) that dissolved organic nitrogen was mineralized to NH<sub>4+</sub>, again highlighting the biogeochemical activity and the importance of microbes in the Rajang 673 River. Until now, there has, however, been no study on their diversity yet; a gap that this study aims to 674 675 fill. Thus, it is essential to understand the dynamics and structure of microbial communities in them to 676 assess their contribution towards biogeochemical fluxes such as carbon and nitrogen (Battin et al., 2008; Raymond et al., 2013), as well as phosphorus cycling (Hall et al., 2013). In addition, the fluxes as well 677 as transformations of organic matter as well as nutrients in aquatic systems are environmentally driven 678 679 by parameters such as temperature or the availability of nutrients in these ecosystems (Welti et al., 680 2017). In turn, various gradients (i.e physical, chemical, hydrological or even biological) contribute to 681 the changes in the microbial diversity and distribution living within the lotic environments (Zeglin, 682 2015).

683

Next-generation sequencing technologies have enabled a better understanding of the rare or unculturable biosphere which traditional culture methods would not have been able to elucidate (Boughner and Singh, 2016; Cao et al., 2017). Only few studies assessing bacterial community composition have been undertaken in lotic/riverine environments (Fortunato et al., 2012; Ladau et al., 2013; Zwart et al., 2002), with even less focusing on the diversity of surface-attached biofilms in lotic environments, particularly in comparison to biofilm studies in benthic habitats (Zeglin, 2015). Furthermore, bacterial assemblages on suspended particles were shown to differ from free-living

691 bacterioplankton in a number of studies (Bidle and Fletcher, 1995; Crump et al., 1999) in which the 692 ratios between both fractions are often influenced by the quality of suspended particulate matter 693 (Doxaran et al., 2012). Even less studies attempt to map bacterial community composition in a river-to-694 sea continuum across multiple seasons and habitats (Fortunato et al., 2012) and it was only recently 695 reported that the most abundant riverine bacterioplankton resemble lake bacteria and can be regarded 696 as 'typical' freshwater bacteria (Lozupone and Knight, 2007; Zwart et al., 2002). Metagenomics studies substantiated the dominance of Proteobacteria and Actinobacteria 697 whereby Bacteroidetes, 698 Cyanobacteria, and Verrucomicrobia were found also found to be abundant in rivers (Cottrell et al., 699 2005; Kolmakova et al., 2014; Lemke et al., 2009; Newton et al., 2011; Read et al., 2015; Staley et al., 700 2013). While there are studies related to the freshwater-marine gradients of rivers such as studies by 701 Crump and Hobbie (2005) and Fortunato et al. (2013) and tropical peatlands (Kanokratana et al., 2011; 702 Mishra et al., 2014; Yule et al., 2016; Too et al., 2018), to the author's knowledge, this is the first study 703 which links both freshwater-marine gradients as well as tropical peatlands as a cohesive component (i.e. 704 tropical peat-draining river to coastal ecosystem). Due to their high diversity and fast generation time, 705 microbial communities (Hunt and Ward, 2015) are the first responders to environmental changes (both 706 natural and anthropogenic events such as storms, upwelling and pollutants). Liao et al. (2019) showed 707 that extensive agricultural land-use in the inter-tidal region of a watershed resulted in the prevalence of 708 bacteria pathogen-like sequences whereas Bruland et al. (2008) stated that the assemblages of microbes 709 also vary temporally as a function of oceanographic conditions, river discharge, tidal phase and season. 710

711 This study focuses on the Rajang River, which is the longest river in Malaysia and one of the most 712 socio-economically important peat-draining rivers in South East Asia. It transports large amounts of 713 terrestrial material (Müller-Dum et al., 2019), experiences two monsoonal seasons (Sa'adi et al., 2017), and is subjected to anthropogenic disturbances (Gaveau et al., 2016; Miettinen et al., 2016). Thus, it is 714 715 fundamental to take into consideration both seasonal and anthropogenic influences on the microbial 716 communities of the Rajang River. Given the rapid development in Sarawak and the importance of 717 microbes in several biogeochemical processes in the Rajang river (Jiang et al., 2019; Martin et al., 2018; 718 Müller-Dum et al., 2019; Zhu et al., 2019), it is imperative to study the microbial communities to enable future predictions and management responses. The Rajang river offers the opportunity to study the 719 720 microbial diversity along a river to sea continuum and at the same time assess influence of natural 721 conditions such as seasons (dry vs. wet), different soil types (peat vs. mineral soil), as well as 722 anthropogenic disturbances (e.g human settlements and plantations) on microbial succession. This study 723 aims to investigate (1) the microbial community structure, diversity and probable function across wet 724 and dry seasons in order to (2) understand the underlying factors that may influence the spatial and 725 seasonal distribution of the prokaryotic communities and the nutrient dynamics involved in the Rajang 726 River.

#### 728 2. Methodology

729

#### 730 2.1 Study area and sampling strategy

This study was conducted along ~300 km of the Rajang river in Sarawak, Malaysia (Fig. 1A). The 731 region has an equatorial climate characterized by constant temperatures, high extensive rainfall and 732 733 high humidity (Wang et al., 2009, 2005; see also Supp. Fig. 1). The Rajang delta system consists of an alluvial valley, an associated coastal plain and a delta plain (Staub and Esterle 1993). The coastal plain 734 is dissected into several small tributaries, namely Igan, Lassa, Paloh and Rajang (Fig. 1A). The 735 shoreline experiences tides and seasonally strong waves ranging from 3-6 m with intensity increasing 736 737 from the east to the west. According to Wetlands International (2015), the land surrounding the study 738 sites is characterised by land use change (Fig 1B) and a range of anthropogenic activities, such as oil 739 palm and sago plantations (Fig 1C), human settlements as well as transportation and sand dredge.

740

A total of 59 water samples were collected along salinity-gradients during three (3) cruises (Fig. 1A), 741 742 covering both wet and dry seasons as well as different source types (i.e. mineral or peat soils). Source 743 types sampled were grouped as follows: 1) marine 2) brackish peat 3) freshwater peat and 4) mineral 744 soils. From Sibu towards Kapit (upriver), the riparian zone is mineral soil whereas from Sibu 745 downwards to the coast it consists of peat which was then further divided into freshwater (salinity 0 to 746  $\sim$  1 PSU) and brackish (salinity 2- 28 PSU). The August 2016 cruise (coloured red) is classified as the 747 dry season based on the lower mean rainfall value as compared to the other two (March 2017 and September 2017), in which the both are classified as the wet season (refer to Supp. Fig. 1). The cruise 748 in August 2016 represented the highest sampling frequency in order to obtain complete coverage of 749 representative regions, while the cruises in March and September 2017 were aimed to obtain seasonal 750 representatives for each region. Approximately 250 - 500 mL of water were filtered through 3.0  $\mu$ m 751 pore size track-etched membranes (NucleoporeTM, Whatman, Germany) via vacuum filtration. This was 752 referred to as the 'Particulate-attached' fraction. The filtrate from the 3.0 µm portion was collected in a 753 754 sterile glass bottle and subsequently filtered through 0.2 µm pore size track-etched membranes (NucleoporeTM, Whatman, Germany). The smaller fraction was referred to as 'free-living' fraction. A 755 total of 117 filters were recovered (1 x 3.0 µm was discarded due to contamination) and immediately 756 757 stored at -20 °C and sent to the Australian Centre for Ecogenomics (ACE), Brisbane for DNA extraction, 758 library preparation and processing utilizing the Illumina platform (Bentley et al., 2008).

#### 761 2.2 Illumina Sequencing and Bioinformatics Analyses

762 Initial upstream processes were carried out by the Australian Centre for Ecogenomics utilizing the ACE 763 mitag pipeline (ACE, 2016). The primers utilized were based on the V3 – V4 hypervariable regions of the 16S rRNA gene. Briefly, fastq files generated from the Illumina platform were quality trimmed with 764 765 fastqc, primer sequences trimmed with Trimmomatic, and poor quality sequences removed using a sliding window of 4 bases with an average base quality of more than 15. High quality sequences were 766 subsequently processed using the mothur (Schloss et al., 2009) pipeline. Sequences were aligned against 767 the SILVA database (Quast et al., 2013; Yilmaz et al., 2014), 'pre.cluster' command executed for 768 769 denoising, and chimeric sequences removed using the 'chimera.vsearch' function. Chimera-free 16s 770 rRNA bacterial gene sequences were taxonomically assigned against the EzTaxon database (Kim et al., 771 2012) using the Naïve Bayesian classifier with a threshold of 80%. The quality-filtered sequences were 772 then clustered into operational taxonomic units (OTUs) at 97% similarity cutoff with singleton OTUs 773 being omitted. In order to reduce bias caused by variations in sample size, high-quality reads were 774 randomly subsampled to 923 reads per sample. Apart from the results and discussion shown for free-775 living and particle-attached bacteria, the remaining discussion is based on the pooled results of both 776 components. The alpha diversity was calculated using the *estimate\_richness* function embedded within 777 the *plot\_richness* function found within the *phyloseq* package utilizing R (v.3.5.3). For the analyses of 778 potential functional genes, Phylogenetic Investigation of Communities by Reconstruction of 779 Unobserved States (PICRUSt, Langille et al., 2013) was utilized. The metagenomics prediction table 780 produced from PICRUSt was utilized to produce pathway abundance profiles using HUMAnN2 781 (Franzosa et al., 2018). It should be noted that the reconstructed functional genes were based on the 782 GreenGenes (DeSantis et al., 2006) database and not the EzTaxon database used for the phylogeny. 783 Raw sequences have been deposited with the NCBI BioSample database under BioProject ID 784 PRJNA565954.

785

#### 786 2.3 Physico-chemical Data and Geochemical Analyses

787 Monthly precipitation for the period in-between the cruises (August 2016 to September 2017) were 788 obtained from the Tropical Rainfall Measuring Mission website (NASA, 2019) in order to gauge the 789 seasonality (wet or dry; see Supp. Fig. 1). In the laboratory, nutrients (Nitrate, NO<sub>3-</sub>, Nitrite, NO<sub>2-</sub>, 790 Ammonium, NH<sub>4+</sub>, Phosphate, PO<sub>43-</sub> and Silicate, SiO<sub>44-</sub>) were photometrically determined utilizing a 791 SKALAR Sanplus continuous flow analyser in the State Key Laboratory of Estuarine and Coastal 792 Research (SKLEC), Shanghai (details described in (Sia et al., 2019). NH<sub>4+</sub> and PO<sub>43-</sub> were determined 793 manually following Grasshoff et al., (1999). The total dissolved nitrogen, TDN, and total dissolved 794 phosphate, TDP, were determined indirectly by obtaining the values for NO<sub>3</sub>- and PO<sub>43</sub>- via oxidation with alkaline-persulfate solution (Ebina et al., 1983). The concentrations of dissolved organic nitrogen 795 796 (DON) and dissolved organic phosphorus (DOP) are estimated by subtraction of DIN from TDN and 797 PO<sub>43-</sub> from TDP, respectively. Belawai samples (2°13'47.16"N, 111°12'19.04"E) were used in an

- incubation experiment to study the net primary productivity and respiration rate of the Rajang River.
- 799 Technical triplicates were incubated in both light and dark set-ups (refer to **Supp. Table 1** for details).

800

#### 802 2.4 Statistical Analyses and distLM model

803 Ordination visualization, non-metric multidimensional scaling (NMDS, Kruskal-Wallis: Kruskal stress 804 formula: 1; minimum stress: 0.01), similarity analyses (ANOSIM) and coherence plots were executed using PRIMER 7 (Clarke and Gorley, 2015) to determine if the various terrestrial source types or 805 806 different land use impacted the bacterial community. Permutational multivariate analysis of variance (PERMANOVA) was used based on the Bray-Curtis dissimilarity of Hellinger Transformed 807 resemblance matrix to infer the impact of anthropogenic activities (land use) on the microbial 808 communities. By partitioning the community variation (using a Bray-Curtis dissimilarity matrix 809 810 resemblance), distance-based linear models (DistLM) were used to determine the extent of which the bacterial community structure can be explained by environmental variables (Legendre and Anderson, 811 1999). Normalizing transformations of the environmental variables were carried out prior to execution 812 of DistLM analyses using the "Normalise Variables" function in the PRIMER 7 software. Hellinger 813 814 Transformed OTU abundance table was used as the response variable for the variation partition analysis. The authors would like to note that the distLM models are based on only the August 2016 and 815 816 March 2017 cruise as there was a lack of physico-chemical data from the September 2017 cruise due to 817 malfunctioning equipment. Multi-collinearity between variables was tested utilizing the 'Draftsman 818 Plot' function in Primer 7 (Clarke and Gorley, 2006; Supp. Fig. 1). However, it is sufficient to draw 819 linkages between the major drivers of microbial communities between seasons as Mar 2017 and 820 September 2017 were considered wet seasons based on the average precipitation (see Supp. Fig. 1).

#### 822 **3. Results**

#### 823 3.1 Clustering of Samples according to ANOSIM Global Test Scores

- A total of 74,690 high quality bacterial sequences were obtained from a total of 117 samples, with 200 to 2,615 sequence reads per sample. The sequences were clustered into 2,087 OTUs at the 97% confidence interval. Instead of displaying bacterial diversity by station, bacterial communities were grouped together according to the R scores obtained from the ANOSIM Global test, with the parameters
- 628 'cruise', 'source type' and 'land use' showing the highest scores (ANOSIM Global R = 0.737, P < 0.001,
- **Table 1**). Furthermore, multi-variate analysis showed that the microbial community composition
- differed among the different land use as well as site nested with land use and source type (**Table 2**).
- 831

#### 832 **3.2** Shifts in bacterial community structure

833 The NMDS graph (2D stress score: 0.18, Fig. 2) supported ANOSIM results by clustering samples 834 according to (i) source type and land use as well as (ii) cruises. The X axis (MDS1 scores) clearly 835 reflects changes in terms of salinity (river-sea continuum) while the Y axis (MDS2 scores) emulates the 836 different cruises. It is apparent that there were seasonal variations as shown from the lighter shade points, 837 representing the August 2016 (dry season) samples, compared to those with darker shades representing 838 both March 2017 and September 2017 (wet season) samples (Fig. 2). There were clear overlaps of 839 samples from mineral soil and freshwater peat origin. We also observed a gradual shift of samples from 840 mineral soils and freshwater peat towards brackish and then marine samples.

841

#### 842 **3.3** Bacterial Distribution according to source type and cruise

To further support that the four different source types support distinct bacterial communities, the relative abundance was mapped into a percentage plot (**Fig. 3**).

845 The core microbial communities along the Rajang River-South China Sea continuum consist of 846 Proteobacteria, Firmicutes, Actinobacteria, Bacteroidetes, Deinococcus-Thermus and Cyanobacteria 847 in varying abundances (Fig. 3, Supp. Fig. 4), indicating high variation within the system. The phylum Deinococcus-Thermus was abundant in freshwater peat and in mineral soils, albeit at a lesser extent 848 849 compared to freshwater peat (Fig. 3). Taking into consideration seasonality, the relative abundance (%) of Deinococcus-Thermus drastically decreased in September 2017. Contrary, the abundance of 850 Cyanobacteria was greater within marine as well as brackish peat for the cruises of March 2017 and 851 852 September 2017 but not for August 2016. For the August 2016 cruise, Cyanobacteria were found 853 throughout all source types albeit at lower counts compared to the other cruises. Similar changes in 854 bacterial community were observed during different cruises but at different sections of the river. For 855 the freshwater peat and mineral soils, the cruises of August 2016 and March 2017 had greater resemblance towards each other. Furthermore, there was a distinct split in terms of the bacterial 856 857 community composition for the four source types across all sampling cruises i.e. marine and brackish 858 peat had similar composition and freshwater peat and mineral soils had similar composition. In terms

of a river-sea continuum, the most apparent changes in the community composition were observed during March 2017 which presented an almost step-wise change in bacterial community composition.

861

#### 862 3.4 Alpha Diversity Indices

863 Based on the observed indices (Fig. 4), mineral soils generally had the highest counts of unique OTUs. 864 However, during the September 2017 cruise, the freshwater region had the highest values. Based on the 865 Chao1 indices, there was a significant effect of the source type on the observed richness (p<0.001), with 866 increasing values from marine to mineral soils. In the March 2017 and September 2017 cruise, the 867 Chao1 indices were found to have greater variability as compared to the August 2017 cruise. For the September 17 cruise, we observed increased values of Chao1 across the brackish peat, freshwater peat 868 869 as well as mineral soils. According to the Shannon indices, the diversity of the microbial communities 870 varied significantly along the different source types (p<0.001). In the dry season the Shannon indices 871 were found to be higher than that of March 17 and September 2017 samples, except for the Brackish peat September 2017 samples. In terms of the Simpson diversity indices, the August 2016 season was 872 873 found to have the higher values as compared to the March 2017 and September 2017 season.

874

Based on the effects of land use on the diversity indices (**Fig. 5**), the sites which are surrounded by human settlements had higher observed indices (regardless of the cruise), with the exception of the Shannon indices in August 2016. Samples surrounded by secondary forest had the second-highest values with samples from August 2016 repeatedly higher than the other two cruises. There were significant differences (p<0.001) between samples from the coastal region with generally lower indices compared to upstream samples (i.e. Human Settlement, Oil Palm and Sago Plantation, Oil Palm Plantation and Secondary Forest).

882

#### 883 3.5 Functional Profile of Bacterial Communities

884 Based on the potential KEGG pathways (Fig. 6), the functional profiles of the microbial communities were predicted for the Aug 2016 and Mar 2017 samples. The main functions found were oxidative 885 886 phosphorylation (20.09%), carbon fixation pathways in prokaryotes (19.00%) and methane metabolism 887 (18.36%), respectively. This was then followed by nitrogen metabolism (11.50%), carbon fixation in 888 photosynthetic organisms (7.67%), inorganic ion transport and metabolism (5.68%). The remaining 889 functional groups were photosynthesis, sulphur metabolism, inositol phosphate metabolism, 890 phosphotransferase system (PTS), carbohydrate metabolism, phosphonate and phosphinate metabolism 891 and lastly mineral absorption (4.92%, 4.31%, 2.96%, 2.34%, 1.83%, 1.11% and 0.23%, respectively). 892 Clear differences were observed between source types and seasons and potential KEGG pathways displayed similar composition among samples originating from either (i) marine and brackish peat, or 893 894 (ii) freshwater peat and mineral soil. In terms of gene abundances, the March 2017 samples (wet season) 895 were found to have higher gene abundances with the highest counts in brackish peat followed by marine

samples. However, marine samples in August 2016 displayed slightly higher gene counts compared tothe brackish peat.

898

#### 899 **3.6** Distance-based Linear Model of bacterial communities and environmental parameters

900 Marginal DistLM was performed in order to gauge the extent of physicochemical parameters or environmental variables accounting for a compelling proportion of variation in the bacterial 901 902 communities. Significant vectors of environmental variables (R2>0.3892, P <0.001) were calculated based on a linear model (DistLM) and plotted against the bacterial community composition (Fig 7). 903 Salinity was the single best predictor variable explaining bacterial community variation (15.27%), 904 followed by DIP (10.57%). The remaining physico-chemical parameters were dissolved oxygen (DO, 905 906 9.64%) and suspended particulate matter (SPM, 6.55%) whereas for the biogeochemical parameters, 907 Silicate (9.27%), DOP (8.04%), DON (6.37%), dissolved organic carbon (DOC, 5.27%) and dissolved 908 inorganic nitrogen (DIN, 4.29%) respectively made up the remaining variables (all variables P = 0.001, 909 except for DIN, P=0.002).

910

911 The distLM model clustered samples from the August 2016 cruise separately from the March 2017 912 samples. Brackish peat, as well as marine samples from August 2016, correlated more strongly with 913 salinity, irrespective of land use. On the contrary, the March 2017 samples were found to cluster 914 separately with DO. In addition, the August 2016 mineral soil samples correlated with silicate.

#### 916 4. Discussion

This study presents seasonal and spatial distribution of particulate-attached and free-living bacteria in the longest river in Malaysia in an attempt to map the bacterial community composition of the water column across several habitats with relation to the riparian zones and anthropogenic activities in a riverto-sea continuum. Our dataset develops a comparison of the microbial community across two dimensions: spatial biogeography from headwaters to the coastal zone as well as through time (seasonally). The rich supporting dataset also allows us to assess underlying nutrient dynamics influencing the microbial communities.

924

# 4.1 General diversity of core bacterial communities along the Rajang river-South China Seacontinuum in comparison with global systems

927 The majority of bacterial taxa were restricted to a relatively small number of assemblages. Dominant 928 phyla typically found in Malaysian peat swamps such as *Proteobacteria* (Kanokratana et al., 2011; Too et al., 2018; Tripathi et al., 2016) are found throughout the Rajang river whereas Acidobacteria is not a 929 930 major phylum in the Rajang river. However, due to the heterogeneity of the Rajang River, substantial 931 shifts in OTU diversity were shown, while exhibiting successional changes in community composition 932 downstream. We observed abrupt shifts in terms of richness and diversity as well as bacterial 933 distribution, which were structured according to macro-scale source types. Staley et al. (2015) proposed 934 that variability in microbial communities were less due to the presence/absence but likely due to shifts 935 in relative abundance of OTUs. While there were shifts in the community composition, overlap between the core microbiome (i.e. free-living and particle-attached portions) of samples were evident (Supp. 936 937 Fig. 2, Supp. Fig. 8). The similar bacterial community structure in terms of particle association was in 938 line with studies by Noble et al. (1997) and Hollibough et al. (2000) in the Chesapeake Bay (winter 939 season) and San Francisco Bay, respectively. Hollibough et al. (2000) demonstrated that the difference 940 or similarity of the particle association of bacterial community was due to the origin as well as 941 composition of the particles, particularly in marine snow or estuarine particles. In the aforementioned study, there was limited metabolic divergence and similar communities between the estuarine turbidity 942 943 maxima and the river samples. Due to the short residence time, the rapid exchange of organisms likely reduced the divergence of phylogenetic composition. The short residence time in the Rajang River 944 945 likely reflected a similar scenario to San Francisco Bay (Müller-Dum et al. 2019). When comparing 946 with other rivers, the predominance of the Proteobacteria phylum, especially within the brackish peat 947 region (Fig. 3, Supp. Fig. 4) was similar to a recent study on the Pearl River Delta (Chen et al., 2019). 948 In another study by Doherty et al. (2017) on the mainstem of the Amazon River (a blackwater influenced 949 river, similar to the Rajang River), Actinobacteria were much more abundant (25.8%) compared to the 950 Rajang River (11.95%).

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#### 953 **4.2 Factors determining bacterial community composition**

#### 954 **4.2.1 Spatial and environmental drivers**

955 As shown in Fig. 2, it can be observed that there was a continual shift in microbial communities, 956 suggesting mixing of the microbial communities from the headwaters to the coast (Fortunato et al., 957 2012) which has also been observed along the Upper Mississippi River (Staley et al., 2015) and along the Danube River (Savio et al., 2015). The decrease in richness and evenness was similar to a study 958 959 conducted by Savio et al. (2015) in which the bacterial evenness and richness declined downriver, which 960 was in line with the River Continuum Concept (Vannote et al., 1980). The presence of peat did not 961 affect the alpha-diversity indices which was reflected in the shift in taxa occurring from freshwater 962 (which includes freshwater peat) towards the saline region (which includes brackish peat).

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964 Salinity, DIP and DO are major environmental drivers of species distribution (Peter et al. 2011; Wilhelm et al., 2015). In this study, marine and brackish peat samples correlated well with salinity. This was 965 neatly supported by the distribution of samples on the distLM fitted dbRDA graph (Fig. 7) whereby the 966 967 affinity for each of the samples correlates to the physical environment (e.g. the samples which group 968 along the salinity vector were the samples which correlate with the marine as well as brackish peat 969 region. The predominance of  $\beta$ -Proteobacteria in the freshwater region and the predominance of  $\alpha$ - and 970  $\gamma$ -Proteobacteria (Supp. Fig. 3) in the estuarine region is typical as the main group in seawaters 971 (Nogales et al., 2011) and similar to findings by Silveira et al. (2011) on the bacterioplankton 972 community along the river-to-ocean continuum from the Parnaioca River towards the Atlantic Ocean. This shows that salinity exhibited a strong influence on the abundances of Proteobacteria and 973 974 *Firmicutes*. Furthermore, based on the linear model (**Fig. 7**), salinity was an important factor in driving 975 the shift in microbial communities (**Table 3**), similar to findings by Herlemann et al. (2011) along a 976 200 km salinity gradient in the Baltic Sea. The dispersal of taxa of microbial communities from fresh 977 to marine waters faces a strong barrier due to salinity (Fortunato and Crump, 2015), likely explaining 978 the reduced relative abundances of some taxa (Fig. 3). For example, *Chloroflexi* has a higher relative 979 abundance upstream while Deinococcus-Thermus shows lower relative abundance downstream. Such 980 dispersals are further influenced by transitional waters such as estuaries and plumes whereby the 981 microbial communities are exposed to rapidly changing physic-chemical conditions such as nutrients, 982 temperature as well as sporadic anthropogenic inputs (Crump et al., 2004).

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While the distribution of the core microbial communities are indicative of the river-sea continuum, it is noteworthy that several phyla were distinctly associated with specific source types. The distinct shift in bacterial taxa for example from Freshwater to Brackish waters (and lack thereof between freshwater peat and brackish peat; **Fig. 3**) indicates that peat did not have a significant effect on the distribution of bacterial taxa. This was further supported by the fact that DOC (as a proxy for organic matter of peat origin) only accounts for 5.27% of the community variation (**Table 3**). A study on blackwater rivers in

- the Orinoco Basin, Venezuela (Castillo et al., 2004) showed that increased DOC resulted in higher bacterial production, however, the change in bacterial production was not a reflection of its influence on the community composition. This was supported based on a simple respiration experiment conducted in Aug 2016 (**Supp. Table 1**) whereby the respiration rate (0.44 ± 016 g DO L-1 d-1) was higher than that of the primary production rate (0.39 ± 0.08 g DO L-1 d-1).
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- Samples influenced by DO (Fig. 7) are from the estuarine region which showed an almost anoxic zone 996 997 (refer to Supp. Fig. 6). The low availability of oxygen was mirrored in higher counts (samples 998 belonging to the brackish peat category showed highest counts regardless of phyla as well as season; 999 Supp. Fig. 4). However, higher counts (particularly the phylum *Chloroflexi* and *Cyanobacteria* which 1000 are normally associated with production of oxygen via primary productivity) do not reflect higher 1001 primary production within this zone. Zones of coastal estuaries are usually deemed to have higher 1002 primary productivity, however, it can be inferred that the depletion in oxygen and higher pCO<sub>2</sub> 1003 emissions (Müller-Dum et al., 2019) within the brackish peat region of the August 2016 campaign was 1004 a result of high bacterial productivity. This can be further supported by the high SPM as a proxy of 1005 turbidity of the brackish peat (Supp. Fig. 6) which may have resulted in the reduced primary 1006 productivity, which in turn can explain the lower DO values. As aforementioned earlier, the respiration 1007 rate (0.44  $\pm$  016 g DO L-1 d-1) was higher than that of the primary production rate (0.39  $\pm$  0.08 DO L-1 1008 d-1). This was similar to a study in the Scheldt River whereby the higher bacterial production occurred 1009 in the turbidity maxima together with the depletion of oxygen (Goosen et al., 1995).
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#### 1011 4.2.1.1 Functional potential of major taxa according to source types

1012 In the Rajang River, the relative abundance of bacterial OTUs were higher in the estuary as well as 1013 marine region, reflecting that while the microbial communities are structured by salinity, the abundance 1014 was more a reflection of the nutrients available, especially in estuaries which exhibit circulation patterns 1015 which can result in localised nutrient-rich conditions (They et al., 2019). This was further supported by 1016 the higher relative abundance of oxidative phosphorylation genes as well as nitrogen metabolism within 1017 the brackish peat and further supported by Jiang et al. (2019) demonstrated through incubations studies 1018 whereby N transformations in the Rajang River estuary mixing zone was higher than in the Rajang 1019 River and coastal region. In a study done by Yang et al., (2013), the dominance of Proteobacteria 1020 influenced the nitrogen cycle via the processes of nitrification and denitrification, in which aeration 1021 would increase its abundance and result in higher mortality of Cyanobacteria. Hence, lower 1022 Proteobacteria abundance resulted in the higher abundance of Cyanobacteria which occur as evidently 1023 shown in Fig. 3. Furthermore, the higher presence of Chloroflexi (Ward et al., 2018) and Cyanobacteria 1024 (Guida et al., 2017) within the marine and brackish peat region indicated its probable role in carbon 1025 fixation as reflected by the higher gene counts (carbon fixation pathways in prokaryotes) in the marine 1026 and brackish peat regions as compared to the freshwater peat and mineral soil (Fig. 6). Furthermore,

1027 the presence of the genus Sphingomonas, a purple-sulphur bacteria which were able to utilize carbon 1028 dioxide (carbon fixation pathways in prokaryotes) and oxidation of hydrogen sulphide (sulphur 1029 metabolism) (Pfennig, 1975) (Fig. 6). In the case of *Firmicutes*, the higher abundance of *Firmicutes* in 1030 the brackish region was reflective of the overall production as opposed to selective growth of the 1031 particular source type, as *Firmicutes* were found throughout all four source types. The highest level of 1032 Deinococcus-Thermus (Fig. 3) was found in freshwater peat environments, indicating its preference for 1033 this environment. This was interesting to note that most studies on bacterial community composition 1034 show that the phylum *Deinococcus-Thermus* occurs in a higher abundance in extreme environments 1035 such as in hot springs (Zhang et al., 2018b) or in studies that are analogous for Mars (Joseph et al., 1036 2019). In most of these studies, Deinococcus-Thermus was found in low abundance (e.g. 1% in 1037 Antarctic marine environments, 1.5% in hypersaline soils; Giudice and Azzaro, 2019; Vera-Gargallo et 1038 al., 2019) when compared to the Rajang River.

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#### 1040 4.2.2 Seasonality as a driver of microbial community compositition

1041 While the development of unique community structures was strongly influenced by spatial factors, 1042 seasonality also played a role. When taking into consideration the major genera, there was a 1043 fundamental shift in bacterial community composition along the continuum (Fig 3, Fig. 4). The second-1044 most abundant taxon, *Proteobacteria* ( $\beta$ -*Proteobacteria*) peaked during seasons of high discharge. The 1045 same pattern of peaking during high discharge can be observed in the Rajang River with considerably 1046 higher relative abundance in the wet season (Fig. 3) which could be a result of the intense rainfall that 1047 led to the large input of freshwater (Silveira et al., 2011), and ultimately resulting in a "trickling" over 1048 microbial pattern from the freshwater to the brackish region. Furthermore, there was a distinct 1049 difference in terms of bacterial richness and diversity indices between the dry season (August 2016) 1050 and both wet seasons, with September 2017 having higher observed indices while the March 2017, 1051 while being a wet season as well had lower or variable observed indices. This difference in the two wet 1052 seasons could be the due to the different stages of phytoplankton bloom as mentioned earlier whereby 1053 the September 2017 was during an algal bloom while the March 2017 was after an algal bloom event. 1054 This was reflected in the Simpson index as well as the indices for September 2017 being lower than 1055 those of the August 2016 or March 2017 samples. Similarly, Zhou et al. (2018) demonstrated that the 1056 Simpson Indices for bacteria increased after the onset of an algal bloom (Brackish peat, September 1057 2017) whereas the Shannon indices was at the lowest (Brackish peat, March 2017) (when assuming that 1058 the region in which phytoplankton blooms occur was the brackish peat region). Overall, there was 1059 greater diversity (based on Shannon Indices) in the dry season (August 2016) than the wet seasons 1060 (March and September 2017) whereas there were greater OTUs in the wet season (Observed index).

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Seasonal variability was also observed between the source types, particle association and down to the
genus level (Fig. 2, Supp. Fig. 2 and Supp. Fig. 5). Based on the precipitation as an indicator of the

1064 seasonality, a probable "transitioning" phase was observed in the dry season (August 2016) with the 1065 microbial communities being more alike with the March 2017 samples (Fig. 8) when comparing both 1066 wet seasons (March 2017 and September 2017). Within the phylum rank (Fig. 3), the presence of 1067 Cyanobacteria during the March and September 2017 cruises indicates the influence of seasonality. 1068 However, while March 2017 and September 2017 were both considered to be wet seasons based on the 1069 precipitation, in terms of the relative abundance, there are considerable differences between the two 1070 cruises. The greater abundance of *Bacteroidetes* in March 2017 may be indicative of the community 1071 composition adjusting due to the processing of organic material caused by the higher cyanobacterial 1072 abundance in the September 2017 cruise. This was similar to a study by Pinhassi et al., (2004), in which 1073 the higher abundance of *Bacteroidetes* follows after an algal bloom. Moreover, the shifts in community 1074 composition from August 2016 to March 2017 and from March 2017 to September 2017 are indicative 1075 of the influence of seasonality. While March 2017 and September 2017 were similar in terms of climate, 1076 September 2017 had higher precipitation during that month, which led to higher run-off from the riparian region as compared with the March 2017 wet season. This could have led to the increase in 1077 1078 cyanobacteria, which was also reflected increase of picoplankton size class during the wet season where 1079 it was hypothesized that the September 2017 might be more optimal for picoplankton proliferation 1080 (Supp. Fig. 7). Furthermore, in comparison, August 2016 and March 2017 were similar in terms of the 1081 proportion of the relative abundance of the community composition (Fig. 3).

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#### 1083 4.2.3 Land-use change and anthropogenic drivers

1084 There has been little to no literature regarding the changes in microbial community composition as a 1085 result of land-use changes that occur within this region, particularly throughout the catchment area of 1086 the Rajang River. The results obtained from this study suggest that the run-off from anthropogenic activities alters the microbial community composition. The Cytophaga-Flavobacterium-Bacteroidetes 1087 1088 group, or rather known as the CFB group, are commonly associated with humans (Weller et al., 2000), 1089 reflecting anthropogenic influences on the samples, especially within the brackish areas which has 1090 several human settlements and plantations. This was shown in the coherence plots in **Supp. Fig. 10** and 1091 Supp. Fig. 11 whereby the CFB group in the *Bacteroidetes* phylum were more pronounced in areas 1092 with influence of oil palm plantations. Lee-Cruz et al. (2013) demonstrated that conversions of oil palm 1093 plantations from tropical forests are much more severe as compared to logged over forests in terms of 1094 bacterial community composition whereby logged over forests was shown to exhibit some resilience 1095 and resistance (to a certain extent). This was shown in the clustering of bacterial taxa adjacent to the oil 1096 palm plantation regardless of the source type (Supp. Fig. 12) in which the vector of *Flavobacteriia* fall 1097 under the samples of oil palm plantation in the brackish peat and to a certain extent, the vector of 1098 Bacteroidia along the oil palm plantation samples in the freshwater peat. Furthermore, among the 1099 identified possible pathogenic bacteria, according to Reza et al. (2018), the taxa Flavobacterium is a 1100 potential fish pathogen and is commonly found in freshwater habitats (Lee and Eom, 2017) as well as coastal pelagic zones (Eilers et al., 2001). In the Rajang river, it was the sixth most abundant class
(Supp. Fig. 4). This is cause for concern as it was found to be high in the coastal regions as well as
brackish regions where fisheries and fishing activities are concentrated.

1104

Anthropogenic disturbances, in particular, settlements and logging (secondary forest) led to higher 1105 diversity indices (Fig. 6). On the contrary, sites surrounded by oil palm plantations displayed the lowest 1106 1107 diversity indices, supporting results by Mishra et al. (2014) who found similar results in peatlands. 1108 Furthermore, the OTU overlapping of major anthropogenic activities (i.e. settlements and oil palm plantations) in Supp. Fig. 9 reflected the possibility of higher abundance of generalists as compared to 1109 1110 sensitive species (Jordaan et al., 2019) as microbial communities generally adapt to permanent stress events such as increased concentrations of inorganic or organic nutrients. In another study conducted 1111 by Fernandes et al. (2014), anthropogenically-influenced mangroves had 2x higher the amount of y-1112 1113 Proteobacteria compared to pristine mangroves. This was similar to the March 2017 cruise along the Rajang River, whereby *y-Proteobacteria* was the predominant class in the marine and brackish peat 1114 region along with the significant increase in Bacteroidetes as aforementioned, which can be associated 1115 1116 to anthropogenic activities. On the other hand, during the dry season, the diversity of the "less-1117 disturbed" region was higher than the disturbed regions. However, it should be noted that the coastal 1118 zone generally has the lowest richness and diversity amongst the other regions regardless of the presence 1119 or absence of anthropogenic activities. Hence, the extent of salinity intrusion may also result in the loss 1120 of diversity and richness of the microbial communities (Shen et al., 2018) in the Rajang River.

#### 1121 **5.** Conclusion

1122 This study represents the first assessment of the microbial communities of the Rajang River, the longest 1123 river in Malaysia, expanding our knowledge of microbial ecology in tropical regions. The predominant taxa are Proteobacteria (50.29%), followed by Firmicutes (22.35%) and Actinobacteria (11.95%). The 1124 1125 microbial communities were found to change according to the source type whereby distinct patterns were observed as a result of the changes in salinity along with variation of other biogeochemical 1126 parameters. Alpha diversity indices indicate that the microbial diversity was higher upstream as 1127 compared to the marine and estuarine regions whereas anthropogenic perturbations (regions with oil 1128 1129 palm plantations and human settlements) led to increased richness but less diversity compared to those 1130 that were less affected by anthropogenic perturbations (coastal zone and secondary forest). The PICRUSt results showed differences between source types. Areas surrounded by oil palm plantations 1131 showed the lowest diversity and other signs of anthropogenic impacts included the presence of CFB-1132 1133 groups as well as probable algal blooms. In order to further gauge and substantiate the functional and metabolic capacity of the microbial communities within each specific source type, metaproteomics as 1134 well as metabolomics should be carried out along with mixing experiments. This approach will 1135 1136 contribute towards a better understanding of the response of microbial communities to anthropogenic 1137 perturbations, as well as their role in degrading peat-related run-off from the surrounding riparian 1138 regions.

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#### 1455 Tables

#### 1456

### 1457 Table 1: ANOSIM Global Test scores based on various parameters

| Parameters tested, 999<br>permutations, random sampling | ANOSIM Global Test, R | P value |
|---|-----------------------|---------|
| Cruise (Wet/Dry season)                                 | 0.439                 | 0.001   |
| Source Type   | 0.422                 | 0.001   |
| Land use  | 0.182                 | 0.001   |
| Particle Association                                    | 0.037                 | 0.001   |
| Source Type, Land use                                   | 0.415                 | 0.001   |
| Cruise, Source Type, Particle                           | 0.708                 | 0.001   |
| Association,  | 0.708                 | 0.001   |
| Cruise, Source Type, Land use                           | 0.737                 | 0.001   |

1458

### 1459 **Table 2:** Results of permutational multivariate analysis of variance (PERMANOVA)

| Parameters tested, 9999 permutations, permutation of residuals under a reduced model | df | F    | Р      |
|--|----|------|--------|
| Land Use   | 7  | 1.54 | 0.0016 |
| Site (nested with land use and particle attached)                                    | 33 | 2.27 | 0.0001 |
| Site (nested with source type and land use)  | 13 | 2.60 | 0.0001 |

1460

1461

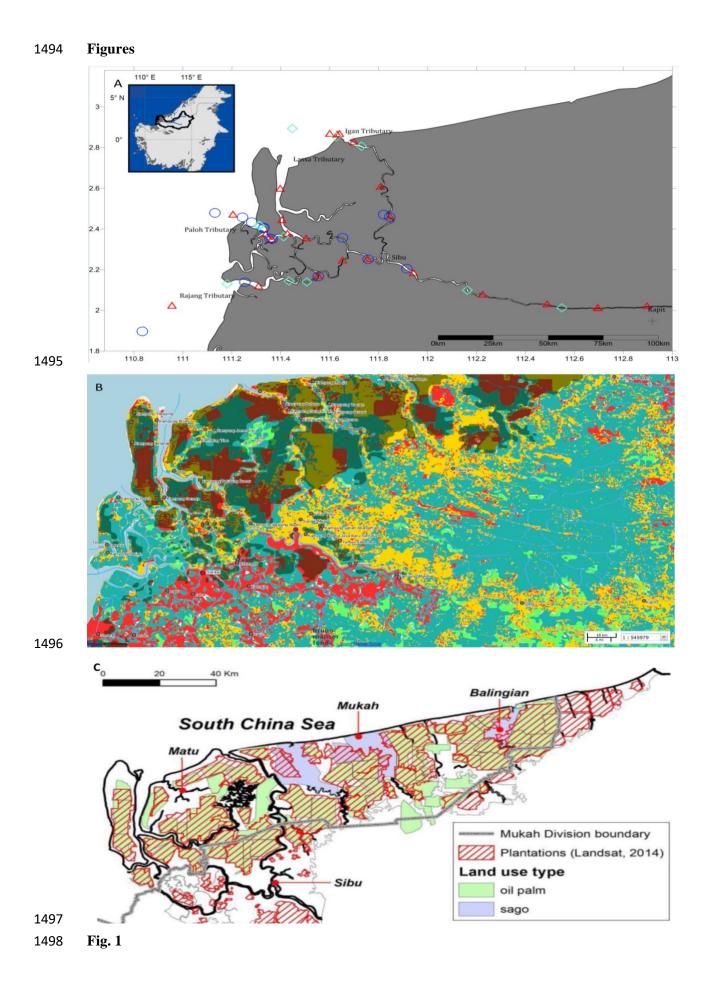
df represents degrees of freedom.

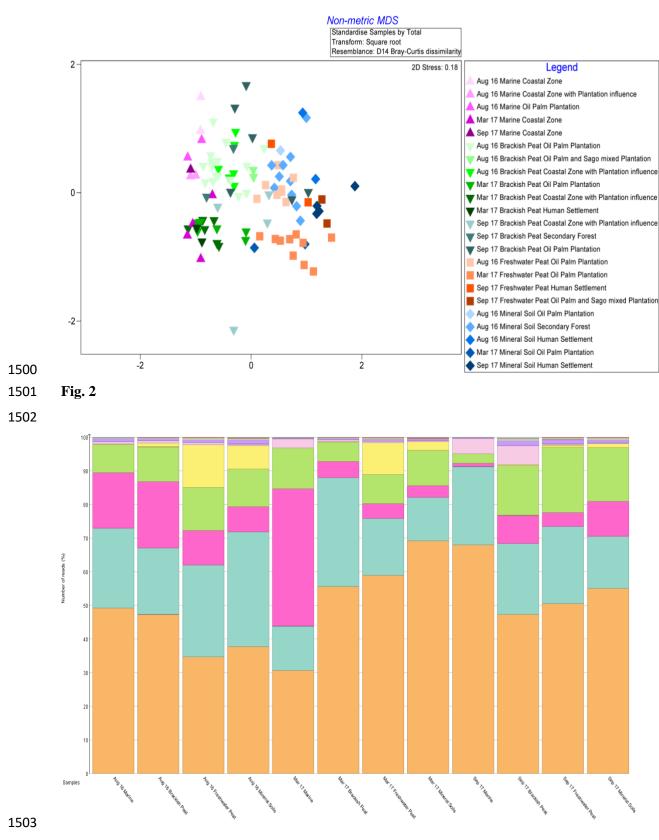
**Table 3:** Proportion of combined community variation based on marginal DistLM test that is explained

1463 by each predictor variable using two cruises (August and March 2017)

| Category         | Variable | Pseudo-F | <i>P</i> -value | Proportion<br>explained (%) |
|------------------|----------|----------|-----------------|-----------------------------|
| Dhysics showing  | Salinity | 9.6128   | 0.001           | 13.42                       |
| Physico-chemical | DO       | 6.6151   | 0.001           | 9.64                        |
| parameters       | SPM      | 4.3486   | 0.001           | 6.55                        |
|                  | DIP      | 4.2218   | 0.001           | 10.57                       |
| Diagooghamiaal   | Silicate | 9.269    | 0.001           | 9.27                        |
| Biogeochemical   | DOP      | 5.4246   | 0.001           | 8.04                        |
| parameters       | DOC      | 3.4495   | 0.001           | 5.27                        |
|                  | DON      | 4.2218   | 0.001           | 6.37                        |

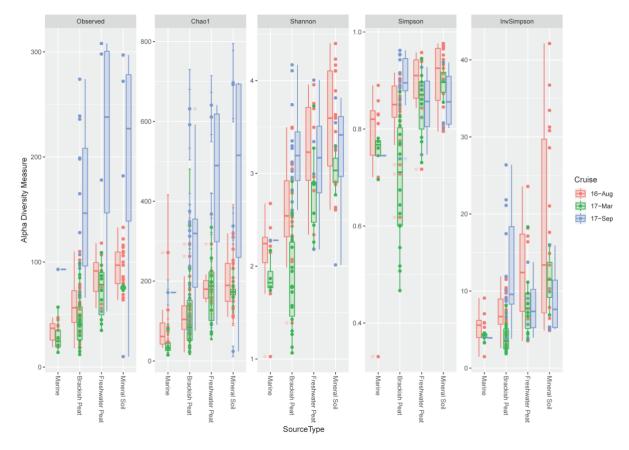
| 1465 | Figure Captions  |
|------|--|
| 1466 | Fig. 1: Location of Rajang River within Sarawak, Malaysia (inset). (A) shows the stations sampled          |
| 1467 | during three (3) different cruises; August 2016 (red triangles), March 2017 (blue circles) and September   |
| 1468 | 2017 (cyan diamonds). (B) GIS data from 2010 (Sarawak Geoportal, 2018) indicating various forest           |
| 1469 | types. Red colour represents non-forest areas (2010), yellow represents non-forest areas (2013), light     |
| 1470 | green represents primary forests, teal represents secondary forests whereas dark green represents          |
| 1471 | potential peat swamp forests.(C) Digitized NREB map obtained from Wetlands International, (2015).          |
| 1472 | The map shows the plantation cover as determined from Landsat showing licensed oil palm and sago           |
| 1473 | plantations (licensed).  |
| 1474 |  |
| 1475 | Fig. 2: Non-metric Multi-dimensional Scaling (NMDS) graph of samples according to cruise, source           |
| 1476 | type as well as land use.  |
| 1477 |  |
| 1478 | Fig. 3: Relative abundance (%) of dominant bacterial (at phylum level, top 10) along the various           |
| 1479 | source types (Marine, Brackish Peat, Freshwater Peat, Mineral Soils) across 3 cruises/seasons              |
| 1480 |  |
| 1481 | Fig. 4: The calculated $\alpha$ -diversity indices (Observed, Chao1, Shannon, Simpson and Inverse Simpson) |
| 1482 | of the four different source type along the salinity gradient.   |
| 1483 |  |
| 1484 | Fig. 5: The calculated $\alpha$ -diversity indices (Observed, Chao1, Shannon, Simpson and Inverse Simpson) |
| 1485 | of the Land Use types (Coastal Zone, Coastal Zone with Plantation (OP) influence) Coastal Zone with        |
| 1486 | Plantation (Sago and Oil Palm influence), Human Settlement, Oil Palm and Sago mixed Plantation, Oil        |
| 1487 | Palm Plantation and Secondary Forest)  |
| 1488 | Fig. 6: The relative abundance of predicted functional profiles in the four source types across two        |
| 1489 | seasons based on KEGG Pathways   |
| 1490 |  |
| 1491 | Fig. 7: Distance-based Redundancy Analysis (dbRDA) plot of cruise, source type and land use on a           |
| 1492 | linear model (DistLM) of normalised predictor variables  |
| 1493 |  |







1505 Fig. 3



1506

1507 Fig. 4

