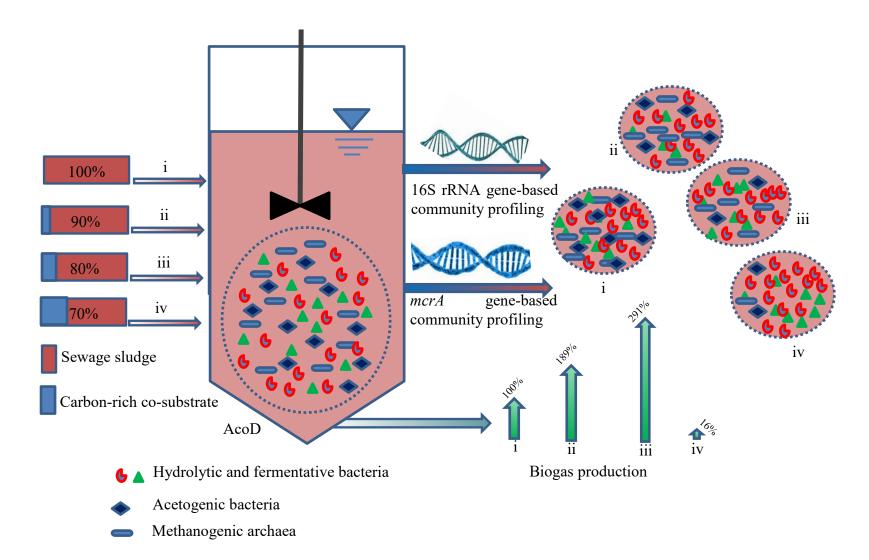
1	Impact of anaerobic co-digestion between
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3	waste on microbial community resilience
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### 16 ABSTRACT

17 This study examines the changes in microbial community diversity and structure in 18 response to anaerobic co-digestion (AcoD) between sewage sludge and a carbon-rich organic 19 waste. Biomass samples were collected at different carbon-rich co-substrate mixing ratios to 20 cover a large range of organic loading rate (OLR) for microbial community analysis by 21 amplicon sequencing of 16S rRNA and mcrA marker genes on the Illumina Miseq platform. 22 The results show a reduction in community diversity (i.e. richness and evenness) and a shift in 23 community structure as the OLR increased due to the addition of the carbon-rich co-substrate. 24 Despite the decrease in community diversity, biogas production increased proportionally to the 25 increase in OLR of up to 3.03 kg COD/m<sup>3</sup>/d (corresponding to 171% OLR increase compared 26 to anaerobic digestion of only sewage sludge). Further OLR increase led to the collapse of 27 biogas production as well as significant reduction in both the microbial diversity and 28 methanogenic population. The methanogenic community was more sensitive to the increase in 29 OLR compared to hydrolytic and fermentative bacteria. These results show that there is an 30 OLR threshold at which the function and resilience of the anaerobic ecosystem could be 31 maintained. Beyond this threshold, the enrichment of hydrolytic and fermentative bacteria, as 32 well as inhibition of methanogenic community, can cause anaerobic digestion failure.

33 KEYWORDS. Anaerobic co-digestion, sewage sludge, carbon-rich organic waste, beverage
 34 waste, microbial community diversity.



## 36 1. Introduction

Wastewater treatment is essential for the protection of public health and the environment. It is, however, also an energy-intensive exercise. Municipal wastewater treatment accounts for about 3% of global electricity consumption and 5% of global greenhouse gas emission<sup>1</sup>. A promising approach for the water industry to reduce its energy footprint is to co-digest sewage sludge (SS) with organic wastes for the production of biogas, which can then be used to generate electricity. Indeed, a few full-scale trials and successful implementations of anaerobic co-digestion (AcoD) at wastewater treatment plants (WWTPs) have been recently reported<sup>2-4</sup>.

Although AcoD has a vast potential<sup>3, 5</sup>, the risk of inhibition associated with AcoD at 44 45 WWTPs is also significant due to organic overloading and the variation in both quality and quantity of organic wastes<sup>6, 7</sup>. Anaerobic digestion is a complex biological process involving 46 47 four interrelated steps, namely hydrolysis, fermentation (acidogenesis), acetogenesis, and 48 methanogenesis. Each of these steps is accomplished by a consortium of microorganisms with 49 specific functionality and ability to adapt to the environment. For example, while hydrolytic 50 bacteria can thrive under an acidic condition, methanogenic archaea can only grow at near 51 neutral pH. Because these steps occur simultaneously within the digester, the harmonization among them is essential for process stability and efficiency<sup>8,9</sup>. 52

Previous studies on AcoD have focused mostly on optimizing the abiotic operating conditions such as co-substrate pairing, mixing ratio and organic loading rate (OLR) withvery few efforts have been made to understand key biotic factors. For example, while it is well established in the literature that anaerobic digestion performance can collapse at an excessive OLR value, the underlying changes in microbial community have not been comprehensively studied. Preliminary investigations have revealed the core organisms in AcoD are similar to those in mono-digestion<sup>10, 11</sup>, such as *Clostridia* members in hydrolytic and fermentative

bacterial groups<sup>12</sup>, Methanobacteriales, Methanomicrobiales, and Methanosarcinales 60 61 members in methanogens<sup>12, 13</sup>. Nevertheless, the impact of AcoD on the microbial community is still poorly understood and reported observations vary significantly. Jensen et al <sup>13</sup> observed 62 only minimal changes in microbial diversity when co-digesting SS and glycerol using a bench 63 scale-reactor (1 L). In contrast, Zhang et al <sup>14</sup> observed significant changes in the microbial 64 65 community structure when co-digesting SS and food waste compared to mono-digestion of 66 only SS using a series of biomethane potential batch experiments. Similarly, Fitamo et al<sup>15</sup> 67 reported significant changes in the microbial community structure as the feedstock changed 68 from SS to a mixture of SS, food waste, grass clipping and garden waste. These early studies 69 also highlight the need to better understand the potential impact of AcoD on microbial diversity and subsequently biogas production<sup>12-17</sup>. 70

71 The inception of next-generation sequencing technologies has paved the way for in-depth 72 investigation of the microbial community from different environmental matrixes. 16S rRNA 73 gene has been widely used for profiling the microbial community in anaerobic digesters. 74 Methyl-coenzyme M reductase (mcrA) gene, encoding the enzyme catalyzing the terminal step 75 in methanogenesis, has been suggested as a useful biomarker for specifically targeting 76 methanogen<sup>18</sup>. The complementary between 16S rRNA and *mcrA* marker genes to characterise the methanogen communities during anaerobic digestion has been recently demonstrated by<sup>19</sup> 77 78 and can also be useful to evaluate any changes in the microbial community during AcoD.

This study examines the effects of AcoD on the digester microbial community. The high throughput Illumina MiSeq platform was utilised to elucidate the response of the microbial community to AcoD. Diversity and structure of the microbial community were characterised by the complementary use of 16S rRNA and *mcrA* marker genes. Changes in three important ecological parameters – diversity level, community structure and community dynamics over time – were elucidated as these parameters contribute to the system functional stability and robustness. Finally, the relationship between microbial community dynamics and digester
function and stability was revealed and discussed.

87 2. Materials and methods

## 88 2.1. Digester operation

89 Biomass samples for microbial characterization were collected from an AcoD system as reported in a previous study<sup>20</sup>. It involved three identical anaerobic digesters designated as R1, 90 91 R2 and R3 operated in parallel. Each digester consisted of a 28 L stainless steel conical shape 92 reactor, a temperature control unit (Neslab RTE 7, Thermo Fisher Scientific, Newington, USA), a peristaltic hose pump (DULCO<sup>®</sup> Flex from Prominent Fluid Controls, Australia), and 93 a biogas counter (Ritter Company<sup>™</sup>, MilliGascounter). Primary sludge (PS) from the 94 95 Wollongong WWTP in New South Wales (NSW) Australia was used as the main substrate. The majority of sewage treatment facilities in Australia is near the coastline and only 96 97 produces(PS). Where secondary treatment is also involved, the volume of waste activated 98 sludge is usually only half of that of PS. A mixture of carbonated soft drinks collecting from a 99 commercial waste collector in NSW Australia was used as the co-substrate. These soft drinks 100 were beverage waste (BW) since they did not meet market requirements (e.g. out of date, 101 contamination, damaged packaging). Since sugar is the only carbonaceous organics in these 102 soft drinks, they are ideal for representing carbon-rich waste without interference from other 103 constituents such as nutrients and inhibitory substances. pH and COD of the PS were  $6.1 \pm 0.5$ 104 and  $22 \pm 1.4$  (g/kg wet weight, n = 7). pH and COD of the BW were  $3.3 \pm 0.1$  and  $204 \pm 2.3$ 105 (g/kg wet weight, n = 4).

The three digesters were operated for over 3.5 months (108 days) with three stages, at each stage, different organic loading rates (OLR) were applied by alternating the mixing ratio (% v/v) of PS and BW. In Stage 1 (52 days), mono-digestion of PS was carried out in all 109 reactors to obtain baseline performance data. In subsequent stages, co-digestion was carried 110 out in reactor R1 and R2 while reactor R3 was used as the control system. In Stage 2 (31 days), 111 BW was co-digested with PS at mixing ratio of 20 and 10% (v/v) in reactor R1 and R2, 112 respectively. In Stage 3 (25 days), BW ratio of digester R1 was increased further to 30% (v/v). 113 BW addition of 10, 20 and 30% (v/v) resulted in 86, 171, and 240% increase in OLR, 114 respectively. In total, 13 sets of biomass samples were collected with five, three, three and two 115 from the control, 86, 171 and 240% OLR increase, respectively. All the samples were fixed in 116 ethanol (1:1 v/v) and stored at -20 °C before DNA extraction.

117 All digesters were fed every day by withdrawing 1 L of digestate and replacing it with 1 118 L of feed (either PS or a mixture of PS with BW) resulted in 20 days of hydraulic retention 119 time. The temperature of all three reactors was maintained at  $35\pm1^{\circ}$ C for the whole 120 experimental period.

121 **2.2.** Co-digestion performance

122 Anaerobic performance of these digesters has been previously reported by Wickham et al <sup>20</sup>. Briefly, the specific methane yield of PS in Stage 1 was 300 L/kg COD added. The 123 124 optimum anaerobic operation was observed at Stage 2, where the increase in OLR to 3.03 and 125  $2.08 \text{ kg COD/m}^3/d$  due to BW co-digestion in digester R1 and R2, respectively, resulted in 191 126 and 89% increase in biogas production compared to the control digester (R3). These values are 127 proportional to the increase in OLR of 171 and 86% in digester R1 and R2, respectively. 128 Parameters including pH, TOA, alkalinity, and soluble COD of the three digesters were 129 consistent for 52 and 31 days in stage 1 and 2, respectively. This suggests that the reactors' 130 operations were stable and organic acids did not accumulate in the digester.

# 131 **2.3. DNA extraction and quality monitoring**

Genomic DNAs were extracted from samples using FastDNA<sup>®</sup> SPIN Kit for soil (MP Biomedicals, Santa Ana, CA) following manufacturer's instructions. The integrity, purity and concentration of the extracted DNA were evaluated by electrophoresis in a 1% (w/v) agarose gel and the NanoDrop<sup>®</sup> ND-1000 spectrophotometer (NanoDrop Technologies, Wilmington, DE). DNA amount in all samples was more than 10  $\mu$ g and the concentration of all samples was normalized to 10 ng/ $\mu$ l using DNase/Pyrogen-Free Water provided in the extraction kit before sending to the sequencing facility.

# 139 2.4. Amplicon sequencing and bioinformatics analysis

The universal primer set Pro341F (5'-CCTACGGGNBGCASCAG-3') and Pro805R (5'-140 141 GACTACNVGGGTATCTAATCC-3') was used to target both bacterial and archaeal 16S rRNA V3 - V4 regions for characterisation of the whole microbial community <sup>21</sup>. The mcrA gene was 142 143 PCR-amplified using the primer set ML-F (5'-144 GGTGGTGTMGGATTCACACARTAYGCWACAGC-3') ML-R (5'and TTCATTGCRTAGTTWGGRTAGTT-3') specifically for profiling 145 the methanogenic community<sup>22</sup>. Paired-end amplicon sequencing (2 x 300 bp) for both marker genes was carried 146 147 out on the Illumina MiSeq platform (Australian Genome Research Facility, Queensland, 148 Australia).

Raw reads were imported into Quantitative Insights into Microbial Ecology (QIIME 150 1.9.1)<sup>23</sup> for computational analysis. Paired-end reads were merged using USEARCH (version 8.1.1861)<sup>24</sup> tool and primers were identified and trimmed with Seqtk tool. Quality filtering, dereplication and operational taxonomic unit (OTU) clustering were performed following UPARSE pipeline <sup>25</sup>. Reads were mapped back to OTUs with a minimum identity of 97% to obtain the number of reads in each OTU. Taxonomy assignment was performed using Greengenes database (version 13 8)<sup>26</sup> for the whole microbial community (cut-off value 90%

similarity) and mcrA taxonomic database <sup>19</sup> for the methanogenic community (cut-off value 156 80% similarity). The rarefaction curves of all datasets approached the saturation plateau and 157 the Good's coverage of > 98.8 and > 99.7% for the whole microbial and the methanogenic 158 159 community (Fig. S1) confirming the sufficient sequencing depth in this study. The sequences 160 were rarefied to 55,000 and 30,000 sequences (the lowest number of sequences per sample) for 161 the whole microbial community and the methanogenic community, respectively, to estimate alpha diversity indices (Observed species, Chao 1 value, Shannon and Simpson) using the 162 163 QIIME package. All sequencing data in this study are available at the Sequence Read Archive 164 (Accession Number: SRP139419) in the National Center for Biotechnology Information.

165 Statistical analyses including principle coordinates analysis (PCoA), Canonical 166 correspondence analysis (CCA) and Pearson's correlation coefficient analysis were performed 167 using QIIME and PAST package. Statistical testing for differential community characteristics 168 (e.g. alpha diversity indices, community composition, and community phenotype) was 169 conducted using the Student's t-test in Excel.

# 170 **3. Results and discussion**

### 171 **3.1.** Effects of organic loading rate on microbial community diversity

172 The diversity index measurements based on 16S rRNA and *mcrA* marker genes showed 173 a decrease in alpha diversity of the whole microbial community and the methanogenic 174 community, respectively, in response to the increase of OLR due to BW addition (Fig. 1). The 175 alpha diversity was assessed in terms of microbial community richness (Observed species and 176 Chao1 value) and evenness (Shannon and Simpson indices). Increasing the OLR to 86% 177 decreased Observed species, Chao1 value, Shannon and Simpson indices of the whole microbial community by 6.7, 6.6, 3.4 and 0.6%, respectively. The decrease further extended to 178 179 29.0, 28.8, 25.8 and 14.3% when the OLR increased further to 171%. At the highest OLR (i.e.

180 240% increase), the alpha diversity indices were lower (P < 0.05 by Student's t-test [Table 181 S1]) than values from the control community, indicating the impact of OLR on the microbial 182 community diversity (Fig. 1). Several previous studies have reported the fluctuations in 183 microbial diversity induced by co-substrate addition and their results could be attributed to co-184 substrate characteristics<sup>15, 16</sup>. On the other hand, our study appears to be the first to 185 systematically demonstrate a decrease in microbial diversity as the OLR value increases due to 186 the addition of a carbon rich co-substrate.

187 Of a particular note, the methanogenic community was more susceptible to AcoD 188 compared to the whole microbial community in the digester. Significant decrease in the 189 methanogenic community richness (15.8 and 14.4% decrease of Observed species and Chao 1 190 value) and evenness (2.4% decrease of Shannon and Simpson indices) were observed at 86% 191 OLR increase (Fig. 1). Further increasing the OLR to 240% caused uneven methanogenic 192 community with 18.4 and 10% decrease in Shannon and Simpson indices, respectively. On the 193 other hand, at 240% OLR increase, the richness and evenness of the whole microbial community were not statistically different compared to those at 171% OLR increase (P > 0.05194 195 by Student's t-test, 171% vs 240% OLR). Furthermore, the quantitative ratio between bacterial 196 and archaeal abundance increased from 9.0 (control) to 12.7 and 24.6 at OLR increase of 171 197 and 240%, respectively, indicating the underrepresentation of archaea as OLR increased due 198 to AcoD. Results in Fig. 1 suggest that increase in OLR favored the bacterial population and 199 perturbed the archaeal community at a greater extent in the anaerobic digester. The degree of 200 perturbation caused by OLR increase in the microbial community and methanogenic 201 community diversity could be an indicator of digester performance. The impact of increase 202 OLR on the alpha diversity prompted a detailed investigation into the microbial community 203 structure as presented below.

204

# [FIGURE 1]

#### 205 **3.2.** Shifts in microbial community structure

206 The OTU (n = 5811 for the whole microbial community and n = 762 for the 207 methanogenic community) relative abundance data were used to carry out PCoA using Bray-208 Curtis dissimilarities metric. The shifts in the community structure under changing operation 209 conditions (i.e. OLR increase) are summarized in Fig. 2. The control ( $0.27 \pm 0.06$  by Bray-210 Curtis dissimilarities metric for the whole microbial community and  $0.24 \pm 0.07$  for the 211 methanogenic community) communities clustered closely, suggesting a stable community 212 structure in the control digester during the experimental period and allowing the better 213 comparison among the control and co-digestion reactors.

214 There was an increasing and more profound variation in the whole microbial 215 community as the OLR increased due to the addition of a carbon rich co-substrate compared to 216 the control digester when examining the PCoA plot and the Bray-Curtis dissimilarities of the 217 different communities based on the analysis of the 16S rRNA marker gene (Fig. 2A and C). 218 Results from Fig. 2A & C conclusively demonstrate that excessive addition of carbon-rich co-219 substrate could destabilize the microbial community. Indeed, the pairwise distance between the 220 control and AcoD increased as OLR increased (i.e.  $0.45 \pm 0.05$  (control vs 86%),  $0.64 \pm 0.10$ 221 (control vs 171%) and  $0.76 \pm 0.05$  (control vs 240%)). Although the intra-community distances 222 were lower than the inter-community distances, a PERMANOVA test revealed only significant 223 difference (Bonferroni-corrected P < 0.05) in the community structure of the digester at 171 224 and 240% OLR increase.

Fig. 2B & D show the impact of AcoD on the methanogenic community. The first two principal coordinate axes (PC1 and PC2) explained approximately 75% of the variation in the methanogenic community. Increasing OLR appears to destabilize the methanogenic community structure with more profound variations among samples at high OLR. The distance metrics within communities were also lower than that of pairwise communities (Fig. 2D).

## [FIGURE 2]

231 The shift in the community structure upon the addition of co-substrate has been reported 232 in the literature with the degree of shift varied by different co-substrate types and ratios. Yang et al <sup>12</sup> observed clear distinction of the microbial structure of an AcoD digester with SS and 233 234 fat, oil and grease compared to a mono digester with only SS. In this study, a larger degree of 235 alteration of microbial structure was simulated to observe process failure in the AcoD (e.g. at 236 240% OLR increase). Overall, results from 16S rRNA and mcrA gene-based community 237 analysis suggest that increase OLR (86 - 240%) by addition of BW in AcoD altered the 238 microbial community richness, evenness and structure. Thus, community dynamics were 239 evaluated further by examining different taxonomical levels as discussed in the next section.

**3.3.** 

# Phylogenetic community structure

16S rRNA gene sequence analysis showed the predominance of *Firmicutes* (20.2  $\pm$ 2.0%), followed by *Bacteroidetes* (13.5  $\pm$  2.2%), *Proteobacteria* (7.2  $\pm$  1.5%) in the control digester. In total, 16S rRNA gene sequence analysis reveals 19 major phyla (> 1% of the total) (Fig. S2). Consistent with the results in Fig. 2, OLR increase caused a notable shift in microbial community composition at the phylum level. For example, phyla *Firmicutes* were significantly higher in co-digestion digesters than in the control digester, with its population of 23.1  $\pm$  3.0% and 53.3  $\pm$  19.4% as the OLR increased to 86 and 171%, respectively (Fig. S2).

Changes in the relative abundances of major orders as a function of OLR increase due to AcoD are shown in Fig. 3. The orders belong to different microbial groups in the digester community and the extent of these changes varies from group to group. The *Clostridiales*, *Bacteroidales*, and *Anaerolineales* orders were the most predominant hydrolytic and fermentative bacteria in the three digesters. The sum relative abundance was 41.3% in the control digester. These orders continued maintaining their population under OLR increase with 254 the sum relative abundance of 39.1, 63.1 and 52.2% in communities at OLR increase of 86, 255 171 and 240%, respectively. Of interest was the significant enrichment of Clostridiales in the co-digestion reactors at 86 and 171% OLR ( $21.1 \pm 2.5\%$ ) and ( $52.2 \pm 24.8\%$ ), respectively 256 257 compared to the control digester (19.8  $\pm$  2.1%). The highest abundance of *Clostridiales* at 258 171% OLR increase correlated with the optimal digester performance (i.e. biogas production 259 increased by 191% and COD removal increased from 75.3 (control) to 86.2% [at 171% OLR 260 increase]). Members of the order *Clostridiales* are known to be associated with diverse hydrolysis and fermentation pathways <sup>27, 28</sup> and they benefit from the syntrophic relationship 261 with hydrogenotrophic methanogens <sup>29, 30</sup>. It is noted that at 240% OLR increase, the sum of 262 263 relative abundances of six hydrolytic and fermentative bacterial orders was above 74.8% (vs 264 48.0% in control digester), indicating the significant enrichment of these bacterial groups. This 265 observation is consistent with the significant decrease in the community diversity and shifts in 266 community structure discussed previously.

The acetogenic bacteria order of *Synergistales*<sup>27, 31</sup> was prevalent in the control digester 267 268  $(9.5 \pm 2.0\%)$ . The abundance of *Synergistales* slightly increased in the OLR 86% community 269  $(9.7 \pm 1.5\%)$  although the change was not statistically significant. At 240% OLR increase, the 270 Synergistales decreased significantly to  $1.6 \pm 0.2\%$ . Spirochaetales and Syntrophobacterales 271 relative abundances exhibited some degree of variations among communities; however, the 272 changes were not statistically significant (Fig. 3). Therefore, members of the order 273 Synergistales could be more susceptible to OLR increase and their presence appears to play an 274 important role in the digester performance. The underrepresentation of Synergistales was in 275 good agreement with the accumulation of TOA in the digester at 240% OLR increase.

The three main orders of the methanogenic community were *Methanosarcinales*, *Methanomicrobiales* and *Methanobacteriales*. The relative abundance of *Methanosarcinales* and *Methanomicrobiales* increased significantly as OLR increased to 86%. Their populations were maintained at a similar level to the control digester as the OLR increased to 171% and decreased further when the OLR increased to 240% (P < 0.05, by Student's t-test). The inhibition of the growth of *Methanosarcinales* and *Methanomicrobiales* could be directly attributed to the significant reduction of biogas production when OLR increased to 240%. Likewise, the optimum biogas and COD removal also coincided with their most abundance at 86% OLR increase. On the other hand, the order *Methanobacteriales* remained stable (< 1.5%) regardless of OLR increase.

286

## [FIGURE 3]

### 287 **3.4.** Comparing methanogenic community from 16S rRNA and *mcrA* marker genes

288 The relative abundance of the methanogens from 16S rRNA analysis was normalized 289 against the total abundance of methanogens for comparison. Fig. 4 presents the profile of 290 methanogenic community in digesters at different OLR increase (0, 86, 171 and 240%). At the 291 class level, two major classes Methanomicrobia and Methanobacteria were both detected by 292 16S rRNA (> 95% of the total) and mcrA (> 83% of the total) marker genes. However, the 293 relative abundance of each class was significantly different in pairwise comparisons. For example, the relative abundance of the two classes Methanomicrobia and Methanobacteria 294 295 revealed by 16S rRNA and mcrA marker genes were (87.1% vs 52.5% and 11.6% vs 36.8%), 296 respectively in the control digester. The distribution of two classes was more even based on the 297 mcrA marker gene under all tested conditions (Fig. 4), suggesting the complementary between 298 the two methods. Both results indicated the presence of non-methanogenic Euryarchaeota 299 (class *Thermoplasma*) at a very low abundance (< 0.05% of the total), while *Miscellaneous* 300 Crenarchaeotal Group (MCG) was detected based on 16S rRNA gene. Recently, the presence 301 of these groups has been reported in the anaerobic digestion process, but their roles are still 302 unknown. Further analysis of methanogenic community at a more refined level revealed the 303 predominance of three orders Methanobacteriales. *Methanosarcinales* and

304 *Methanomicrobiales*, suggesting the occurrence of both the hydrogenotrophic and acetoclastic 305 methanogenesis in digesters. Another notable observation was the higher abundance of 306 *Methanomicrobiales* at 0, 86 and 171% OLR increase detected by the *mcrA* marker gene. At 307 the highest OLR increase, a new *Methanomicrobia* order namely *YC-E6* was detected at 19.1% 308 by the 16S rRNA marker gene. A high number of unassigned microorganisms was observed in 309 taxonomical identification with the *mcrA* gene, suggesting the phylogenetic diversity of 310 methanogens in Archaea that remains to be discovered<sup>32</sup>.

311

### [FIGURE 4]

## 312 **3.5.** Community correlations and indications on digester stability

313 The relative abundances of seven major orders representing the hydrolytic, fermentative, 314 acetogenic and methanogenic microbial groups in all digester communities were selected for 315 community correlation analysis. Negative correlations (Pearson's correlation coefficient < 0) 316 were observed between hydrolytic/fermentative group (i.e. Clostridiales) and the orders of 317 other groups (acetogenic and methanogenic) (Fig. 5A). Statistical analysis revealed significant between 318 Spirochaetales, correlation coefficients Clostridiales and Synergistales, 319 Syntrophobacterales (P < 0.05). No significant correlation coefficient was observed between 320 Clostridiales and three orders of methanogens (Table S4). These results indicate that the 321 increase of *Clostridiales* could cause the decrease in abundance of others. This observation is 322 consistent with the data in Fig. 3. On the other hand, acetogenic and methanogenic groups 323 exhibited positive correlation within each group and inter-groups. These correlation 324 are insignificant, except for the ones between Synergistales coefficients and 325 Methanosarcinales, Methanomicrobiales (Table S4).

The relationship between environmental variables (i.e. TOA, pH, alkalinity, OLR), performance variables (i.e. VS removal, COD removal and biogas production), and the

328 microbial community was examined by CCA. In this study, seven dominant microbial groups 329 and four environmental variables and three performance variables were screened for CCA plots 330 calculation (Fig. 5B). The CCA1 and CCA2 explained 97.5% of the total variation. The seven 331 variables were divided into four quadrants. OLR%, biogas production, TOA and COD removal were distributed in the same quadrant, while pH and alkalinity were plotted into two quadrants. 332 333 BW addition (i.e. OLR increase) favored the growth of hydrolytic and fermentative bacteria 334 (e.g. *Clostridiales*). *Clostridiales* showed positive correlations with biogas production, COD 335 removal, and VS removal, indicating the important role of the order in digesters. However, 336 high abundance of this order increased the amount of TOA accumulated in the system which 337 led to a decrease in alkalinity and pH (Fig. 5B).

338

## [FIGURE 5]

#### 339 4. Conclusion

340 This study demonstrates that the introduction of a carbon-rich co-substrate to AD of SS 341 can lead to a decrease in microbial community diversity. Increasing OLR by further addition 342 of co-substrate extended the reduction of diversity indices (decreased by > 14.3%). In 343 particular, the methanogenic community was more susceptible to OLR increase when 344 comparing to the bacterial community. The shift in the community structure was most profound 345 at high OLR (240% increase) suggesting that there exists an OLR threshold at which the 346 function and resilience of the anaerobic ecosystem could be maintained. Excessive OLR value (240% increase) enriched hydrolytic and fermentative bacteria (> 74.8% of the total 347 348 abundance) and perturbed acetogenic and methanogenic community. Results reported here also 349 show the complementary application of the mcrA and 16S rRNA marker genes to provide a 350 better assessment of the methanogenic community in the anaerobic digestion process.

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- 354 CONFLICTS OF INTEREST
- 355 There are no conflicts to declare.

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## 459 List of Figures:

Figure 1. Alpha diversity indices of AcoD communities under different OLR increase in terms of (A) Observed species, (B) Chao 1 value, (C) Shannon index, and (D) Simpson index. The data presents the mean and one standard deviation at 0% (5 samples), 86% (3 samples), 171% (3 samples) and 240% (2 samples) OLR increase. All indices were calculated at the minimum sequencing depth of all samples (i.e. at 55,000 and 30,000 sequences per sample for 16S rRNA and *mcrA* marker genes, respectively).

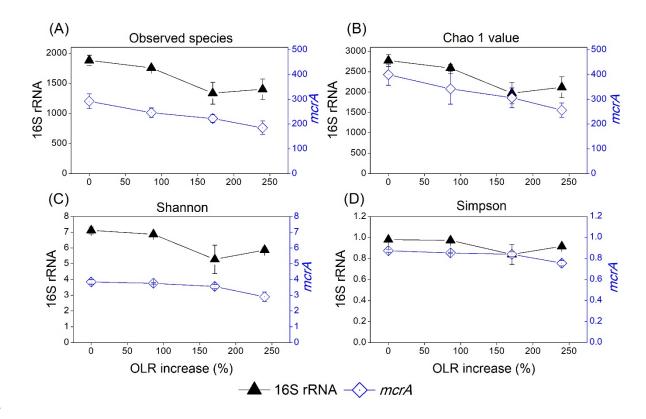
Figure 2. Shifts in the community structure based on (A) 16S rRNA and (B) *mcrA* marker genes principal coordinates analysis (PCoA) using the Bray-Curtis dissimilarities metric as well as the corresponding Bray-Curtis dissimilarities within and between communities from (C) 16S rRNA and (D) *mcrA* marker genes. The whiskers of the box represent the minimum and maximum values. The bottom and top of the box are the first and third quartiles, respectively, and the line inside the box denotes the median.

472 Figure 3. Relative abundances of the major microbial orders revealed by 16S rRNA marker473 gene. The error bars represent the mean and one standard deviation from the mean.

Figure 4. Relative abundances within the methanogenic community at (A) class and (B) order
level revealed by 16S rRNA and *mcrA* marker genes. The bar presents the mean value at of
0%, 86%, 171% and 240% OLR increase.

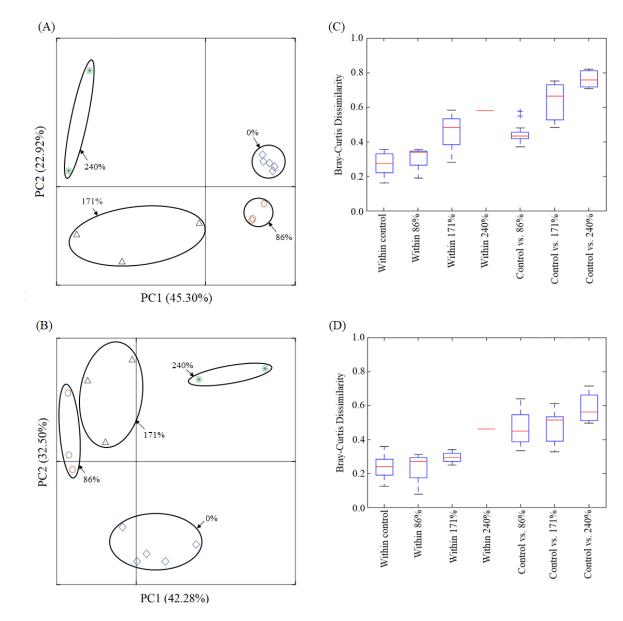
Figure 5. Relationships between environmental variables and performance variables and the microbial community. (A) Heat map for the frequency correlation between selected orders of different microbial groups (i.e. hydrolytic, fermentative, acetogenic and methanogenic). The color scale indicates the Pearson's correlation coefficient (between -1 and 1) with red color for positive correlations and blue color for negative correlations. (B) Canonical correspondence

- 482 analysis (CCA) between selected orders of different microbial groups and environmental
- 483 variables (i.e. TOA, pH, alkalinity, OLR) and performance variables (i.e. VS removal, COD
- 484 removal and biogas production). The symbols: blue diamond, red circle, black triangle and
- 485 green star denotes the communities at 0, 86, 171 and 240% OLR increase. Solid blue circle
- 486 denotes seven orders with their names placed beside.

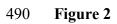


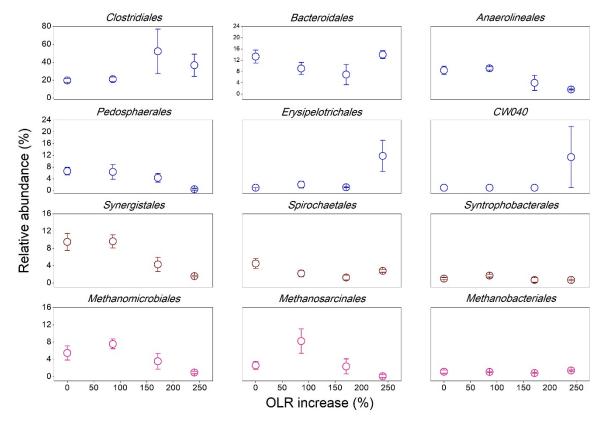


488 Figure 1

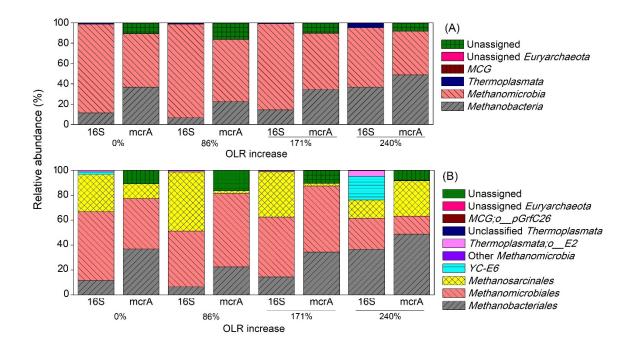






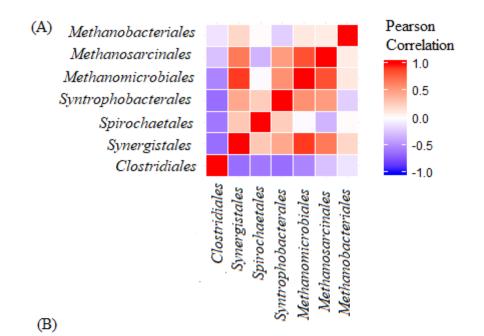


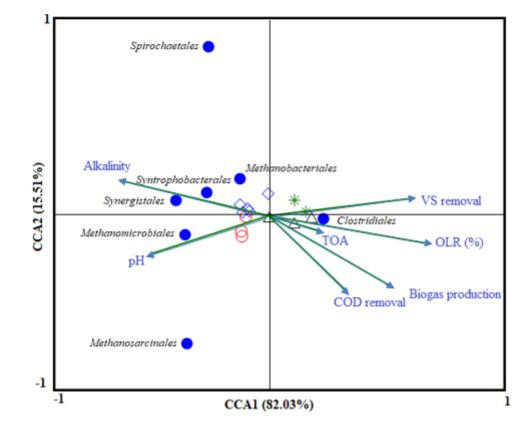
**Figure 3** 





494 Figure 4





496 Figure 5