1	Pyrosequencing analysis yields comprehensive assessment of microbial communities
2	in pilot-scale two-stage Membrane Biofilm Reactors
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24 Abstract

We studied the microbial community structure of pilot two-stage Membrane Biofilm 25 Reactors (MBfRs) designed to reduce nitrate (NO₃) and perchlorate (ClO₄) in 26 27 contaminated groundwater. The groundwater also contained oxygen (O₂) and sulfate (SO_4^{2-}) , which became important electron sinks that affected the NO₃⁻ and ClO₄⁻ removal 28 rates. Using pyrosequencing, we elucidated how important phylotypes of each "primary" 29 microbial group –denitrifying bacteria (DB), perchlorate-reducing bacteria (PRB), and 30 sulfate-reducing bacteria (SRB) -- responded to changes in electron-acceptor loading. 31 UniFrac, principal coordinate analysis (PCoA), and diversity analyses documented that 32 the microbial community of biofilms sampled when the MBfRs had a high acceptor 33 loading were phylogenetically distant from and less diverse than the microbial 34 35 community of biofilm samples with lower acceptor loadings. Diminished acceptor loading led to SO_4^{2-} reduction in the lag MBfR, and this allowed *Desulfovibrionales* (an 36 SRB) and *Thiothrichales* (sulfur-oxidizers) to thrive through S cycling. Due to this 37 cooperative relationship, they competed effectively with DB/PRB phylotypes such as 38 Xanthomonadales and Rhodobacterales. Thus, pyrosequencing illustrated that, while 39 DB, PRB, and SRB responded predictably to changes in acceptor loading, a decrease in 40 total acceptor loading led to important shifts within the "primary" groups, the onset of 41 other members (e.g. Thiothrichales), and overall greater diversity. 42 43

Keywords: pilot MBfR, nitrate, perchlorate, sulfate, pyrosequencing (deep sequencing),
community structure, community function.

46 Introduction

47	Nitrate (NO_3) is a prevalent water contaminant due to its heavy use in fertilizers
48	and widespread presence in wastewater. NO ₃ ⁻ can cause methemoglobinemia ^{1,2} in infants
49	and spur eutrophication in water bodies. NO_3^- is regulated by the US EPA, ³ which
50	established a maximum contaminant level (MCL) of 10 mg N/L for drinking water.
51	Perchlorate (ClO ₄ ⁻) is an oxyanion with great chemical stability and is a constituent of
52	rocket propellants, fireworks, and explosives. ClO4-, a normally recalcitrant contaminant
53	found in waters of 35 US states and Puerto Rico, ⁴ can disrupt the thyroid after ingestion.
54	Although ClO ₄ ⁻ is not yet listed as a regulated chemical, ⁵ the USEPA is planning to issue
55	an MCL. ⁶ NO_3^- and ClO_4^- often are found together at contaminated sites, because
56	ammonium nitrate (NH4NO3), ammonium perchlorate (NH4ClO4), and potassium nitrate
57	(KNO ₃) are used together for the production of rocket fuel and explosives. ⁴
58	Destruction of NO_3^- and ClO_4^- by microbial respiration has been well
59	documented. ⁷⁻¹⁰ NO_3^- reduction can enhance or hinder ClO_4^- reduction ¹¹⁻¹⁴ depending on
60	the operating conditions of bioremediation approaches. Particularly, the inhibition of
61	ClO ₄ ⁻ reduction originates from the competition between denitrifying bacteria (DB) and
62	perchlorate-reducing bacteria (PRB) for common resources, such as the electron donor, ¹⁵
63	space in biofilms, ¹⁵ and reductase enzymes. ¹⁶⁻¹⁸ However and regardless of possible
64	complications, simultaneous microbial respiration of NO3 ⁻ and ClO4 ⁻ has been reported. ¹⁹⁻
65	²⁰ Furthermore, the need to manage the microbial communities in the system becomes
66	even more pressing when in addition to NO_3^- and ClO_4^- , other electron acceptors such as
67	sulfate (SO_4^{2-}) also are present in the water to be treated.

69	The presence of SO_4^{2-} in a $NO_3^{}$ and $ClO_4^{}$ contaminated groundwater was the
70	situation encountered during demonstration of a pilot two-stage Membrane Biofilm
71	Reactor (MBfR) system. ²¹ In the MBfR, hydrogen gas (H_2) diffuses through the walls of
72	hollow-fiber membranes and is used as electron donor by microorganisms that grow as a
73	biofilm on the membranes while utilizing oxidized compounds present in the water
74	flowing throw the reactor as electron acceptors. ²² Previous research with MBfR biofilms
75	pointed out competitive relationships between NO_3^- and ClO_4^- reductions for which a
76	NO_3^- loading above 0.6 g N/m ² day at a fixed H ₂ -delivery capacity slowed ClO_4^-
77	reduction. ¹⁵
78	Based on the desire to minimize competition between NO ₃ ⁻ and ClO ₄ ⁻
79	reductions ¹¹⁻¹⁸ when the groundwater to be remediated had a high NO_3^- : ClO ₄ ⁻ ratio (~76
80	g N: 1 g ClO ₄ ⁻), Evans et al. ²¹ set up a two-stage pilot-scale MBfR. The lead MBfR
81	treated the raw groundwater and performed the bulk of denitrification. This lowered the
82	NO_3^- loading and the potential for NO_3^- reduction to compete with ClO_4^- reduction in the
83	lag MBfR, which received the effluent from the lead MBfR. ²¹ The strategy was mostly
84	successful, since most of the NO3 ⁻ removal occurred in the lead MBfR; however, the two-
85	stage pilot MBfR could not consistently drive the ClO ₄ ⁻ concentrations to below the
86	detection limit of 4 μ g/L. ²¹
87	In an initial effort to understand the pilot MBfR's performance, Zhao et al. ²³
88	assessed the microbial community structure of the pilot reactors using the quantitative
89	Polymerase Chain Reaction (qPCR) targeting characteristic reductases. DB (determined
90	by the nitrite reductases <i>nirK</i> and <i>nirS</i>) were the most abundant microbial group;
91	however, sulfate-reducing bacteria (SRB) (quantified by the dissimilatory sulfite

92 reductase dsrA) became dominant and may have outnumbered DB in the pilot MBfRs 93 when the NO₃⁻ + O₂ loading was low, below 0.3 g H₂/m² day.²³ PRB (quantified by the 94 perchlorate-reductase *pcrA*) were the smallest microbial fraction and were adversely 95 affected when SRB became important, a finding consistent with previous bench-scale 96 studies.²⁴

In contrast to these pilot results, Ontiveros-Valencia et al.²⁵ was able to achieve 97 complete ClO₄⁻ reduction in a two-stage bench-scale MBfR, even though the ClO₄⁻ 98 concentration was unusually high (~4000 μ g/L) and SO₄²⁻ was amply present (~55-60 99 mg/L). The success was attributed to an effective management of the microbial ecology 100 of the reactors so that SO_4^{2-} reduction was minimized, especially in the lag MBfR. 101 Ontiveros-Valencia et al.²⁵ suppressed SRB in the lag MBfR by re-oxygenating the 102 103 influent to the lag MBfR to increase the total-acceptor loading and by lowering the H₂ 104 availability by either decreasing the H_2 pressure or by using a less- H_2 permeable membrane. Neither strategy was followed with the pilot two-stage MBfR system: Re-105 106 oxygenation of the effluent from the lead MBfRs was not possible with the pilot configuration, and the pilot-MBfRs were mostly run with excess H₂ availability to 107 encourage ClO₄⁻ reduction.²¹ 108

Added to the fact that treatment is more challenging when SO_4^{2-} is present in the water to be treated, only limited information is available on the ecological interactions between SRB and PRB. Waller²⁶ suggested that the microbial community structure of consortia explored in her study was responsible for the decline in CIO_4^- reduction when high SO_4^{2-} concentration was available. However, other studies reported no effect from

114 SO_4^{2-} on ClO_4^{-} microbial reduction²⁷⁻²⁸. Thus, more research addressing these critical 115 ecologic interactions is needed.

Although Zhao et al.²³ provided a broad view of the "primary" respiratory groups
(i.e., DB, PRB, and SRB) in the pilot MBfRs, we employ high-throughput
pyrosequencing to gain a deeper understanding of the microbial community structure,
including more insight into the phylotypes that constitute the primary respiratory groups
present when NO₃⁻, ClO₄⁻, and SO₄²⁻ are the electron acceptors and a view of other
members within the biofilm.

Our study addresses the ecological interactions among DB, PRB, SRB, and other 122 microbial groups that developed during bioremediation of groundwater polluted with 123 NO_3^- and ClO_4^- with SO_4^{2-} also present. In particular, we use UniFrac and principal 124 coordinate analysis (PCoA)^{29,30} to demonstrate that distinctly different communities 125 126 developed in the biofilm when the acceptor-loading rate was decreased significantly. Furthermore, we explore how decreased acceptor loading led to shifts within the primary 127 128 members and the development of important other members (e.g., heterotrophs and sulfuroxidizing bacteria) in the community. While Zhao et al.²³ used qPCR to provide an 129 analysis of community structure according to the primary respiratory groups, our findings 130 discriminate among conditions significantly altering the community structure, making the 131 biofilm more diverse and causing shifts within and outside the primary microbial groups. 132

133

134 Materials and Methods

135 *MBfR configuration and performance*

Detailed information about the pilot-MBfRs configuration is given by Evans et 136 al.²¹ and Zhao et al.²³ In brief, the two-stage MBfR was composed of two 500-gallon 137 (1890-L) vessels containing 4 MBfR modules with membrane surface area of 144 m² per 138 module. The manufacture and on-site configuration of the pilot-MBfR modules was 139 done by APTwater and CDM-Smith. Figure 1a shows that the pilot-MBfR modules were 140 cylindrical and made of woven fabric of polypropylene fibers, which formed sheets of 141 fibers wrapped around a perforated acrylonitrile butadiene styrene (ABS) core. Each 142 module contained ~140,000 polypropylene fibers (200µm OD, Teijin, LTD, Japan). H₂ 143 gas diffused through the fiber sheet, and water passed through the perforations in the 144 145 ABS core. The lead and lag MBfRs also were equipped with a set of side reactors for taking biofilm samples without disturbing the biofilm in the modules.^{21,23} Figure 1b&c 146 shows the side reactors with their connections for water and H₂. 147

148 The pilots were set up to treat a site historically used for munitions and explosives manufacture and surroundings agricultural fields. Hence, the oxidized contaminants in 149 the groundwater were NO₃⁻ at 8-9 mg N/L and ClO₄²⁻ at 160-200 μ g/L. The influent also 150 contained O_2 at ~8 mg/L and SO_4^{2-} at ~22 mg/L. The lead and lag positions were 151 switched every 3 days to make the biofilm development similar in both MBfRs and with 152 the goal of minimizing the abundance of SRB in the lag MBfR.²¹ The H₂ pressure and 153 influent flow rate were adjusted according to the conditions in Table 1. The four 154 conditions are representative periods of continuous operation of the pilot system. 155 156 Adjustment of the influent flow rate led to a proportional change in the total electron-

157	acceptor surface loading: Conditions 3 and 4 had significantly lower total electron
158	acceptor loadings than did Conditions 1 and 2. The use of an excess H ₂ -delivery capacity
159	was done to ensure good NO_3^- removal in the lead MBfR and to achieve complete ClO_4^-
160	reduction in the lag MBfR. ²¹
161	Samples were collected for off-site analysis at Test America (Irvine, CA), which
162	is certified by the California Environmental Laboratory Accreditation Program (ELAP).
163	The off-site assessment involved measurements for the lead and lag concentrations of
164	NO_3^- and SO_4^{2-} (US EPA method 300) and ClO_4^- (US EPA 314); they were performed
165	three, one, and three times per week, respectively. In addition, measurements for NO_3^-
166	and sulfide (as a surrogate for SO_4^{2-} reduction) were carried out three times per week on-
167	site using field kits (CHEMetrics, Virginia, USA). ²¹ O ₂ and pH were measured by a hand
168	held probes. ²¹ The pH during operation was maintained between 7.4-7.8. The maximum
169	H_2 delivery capacity was calculated according to Tang et al. ³¹ and reported in Table 1.
170	Our work is complementary to the work reported by Zhao et al. ²³ , and both studies are
171	built on the field demonstration described by Evans et al. ²¹

172 Biofilm microbial ecology by pyrosequencing analysis

Side reactors representing conditions 1, 2, 3, and 4 were taken after 60, 116, 221, 173 174 and 263 days of continuous operation, respectively, and were sent in ice containers to the Swette Center for Environmental Biotechnology for microbial community analysis. The 175 samples arrived within 24 hours and were processed according to Zhao et al.²³ for DNA 176 extraction. DNA samples were stored at -80°C until shipping for 454 pyrosequencing. 177 DNA samples for 454 pyrosequencing were sent to the Molecular Research DNA lab 178 (Austin, Texas, USA), which performed amplicon pyrosequencing using a standard 179

Roche 454/GS-FLX Titanium.³² The Bacteria domain was targeted by selecting the V6
and V7 regions of the 16S rRNA gene with primers 939F (5'-

TTGACGGGGGCCCGCAC-3') and 1492R (5'TACCTTGTTACGACTT-3').33 We 182 processed the raw data using QIIME 1.7.0 suite³⁴ and removed sequences having fewer 183 than 250 bps, homopolymers of more than 6 bps, primer mismatches, or an average 184 quality score lower than 25. We picked the operational taxonomic unit (OTUs) using the 185 Greengenes 16S rDNA database with *uclust* 35 based on > 97% identity, removed OTUs 186 that contain less than two sequences (singletons) from our analysis, and aligned the 187 representative sequence of each OTU to the Greengenes Database using PvNast.^{36,37} 188 Potentially chimeric sequences were identified by using ChimeraSlayer,³⁸ and a python 189 script in QIIME was employed to remove the chimeric sequences. We assigned 190 taxonomy to OTUs with BLAST using the SILVA database³⁹ and constructed Newick-191 formatted phylogenetic trees using FasTree.⁴⁰ 192 For the purpose of eliminating heterogeneity related to having different numbers 193 194 of sequences among the samples, we sub-sampled the OTU table by randomly selecting ten different times the lowest number of sequences (6800) found among the samples. We 195 then generated PCoA plots and Unweighted Pair Group Method Arithmetic Mean 196 (UPGMA) plots³⁰ using jack-knifed beta diversity. 197 We estimated the OTU richness by calculating Chao1,⁴¹ which determines the 198

asymptote on an accumulative curve, predicting how many OTUs would be present if a high number of sequences had been collected, and the phylogenetic relationships by using phylogenetic diversity (PD),⁴² which estimates the cumulative branch lengths from random OTUs. To evaluate the microbial species diversity and evenness, we computed

the Shannon⁴³ and Simpson⁴⁴ indexes. A higher value for the Shannon index indicates
greater microbial diversity, while a value for the Simpson metric near one shows an even
distribution of bacterial groups within the sample. Sequence data sets are available at
NCBI/Sequence Read Archive (SRA) under study with accession number SRP038958.

208 **Results and Discussion**

209 Microbial community function

Table 2 synthesizes the performance of the pilot-scale reactors. The lead MBfRs 210 211 were responsible for ~99% of the O₂ respiration, 70-90% denitrification, and a small loss of ClO₄^{-,21,23} In the lead MBfRs, the NO₃⁻ + O₂ flux was greater than ~ 0.34 g H₂/m²-212 day^{23} (Table 2), which completely suppressed SO_4^{2-} reduction and is consistent with the 213 bench-scale results of Ontiveros-Valencia et al.⁴⁵ and modeling work by Tang et al.⁴⁶ 214 Therefore, NO_3^- and SO_4^{2-} were the dominant electron acceptors entering the lag MBfR, 215 and the total acceptor surface loading to the lag MBfR was much lower than for the lead 216 MBfR (Table 1). Although the objective of reducing the flow rate and total acceptor 217 loading for Conditions 3 and 4 was to enhance ClO₄⁻ removal in the lag MBfR, its major 218 impact was to favor SO_4^{2-} reduction, an undesired outcome that led to lower CIO_4^{--} 219 220 removal fluxes in the lag MBfR (Table 2).

221

222 Electron-acceptor loading affects microbial diversity and structure

Table S1 shows all the values for the diversity and evenness metrics for the four 223 conditions. Overall, Chao1, Shannon, and PD values show that the microbial diversity of 224 biofilm samples from Conditions 3 and 4, which had a low acceptor loading (Table 1), 225 was greater than from Conditions 1 and 2, which had a higher acceptor loading. 226 Consistent with the Chao1 results and based on the Simpson index, biofilm samples from 227 Conditions 3 and 4 were more evenly distributed than those in Conditions 1 and 2. 228 Figure 2 shows the unweighted UniFrac analysis of the biofilm samples, which is 229 230 based on the presence or absence of all the phylotypes within a sample. The biofilm

samples with high acceptor loading (Conditions 1 and 2) clearly formed a cluster (blue
branch) distinct from the cluster of Conditions 3 and 4 (red branch). Thus, the large
changes in acceptor loading between Conditions 2 and 3 led to very different microbial
communities. Particularly for Conditions 1 and 2, the lead and lag biofilms were not
significantly different due to the regular switching of positions.²¹

Figure 3 presents the unweighted PCoA plot, which reinforces the clustering 236 found with the UniFrac analysis. The biofilm communities of Conditions 1 and 2 were 237 close to each other along the PC1 vector, while those biofilm samples of Conditions 3 238 and 4 were distant. In an attempt to differentiate the driving force for the PC1 vector, we 239 connect the removal fluxes for SO_4^{2-} and ClO_4^{-} (Table 2) with the community analysis by 240 PCoA. Conditions 3 and 4 had importantly decreased average acceptor loadings (Table 241 1), and SO_4^{2-} reduction increased significantly (Table 2). The PC1 vector correlates with 242 increased SO_4^{2-} reduction, particularly from Condition 2 to Condition 3. Hence, the 243 microbial community structure was substantially modified when SO4²⁻ reduction became 244 a more important electron sink, a trend also noted by Ontiveros-Valencia et al.³³ 245 Condition 2 was different from Conditions 1, 3, and 4 along the PC2 vector. This trend is 246 most likely explained by the substantially higher ClO₄⁻ flux for Condition 2, which is 247 illustrated in Table 2. 248

While the low electron acceptor loadings primarily shaped the microbial community, particularly by favoring SO_4^{2-} reduction, operation time also allowed biomass buildup^{33,45} that may have contributed to structural changes in the biofilm communities. However, operational conditions, such as to the flow rate and hydraulic retention time (HRT), are directly connected to the electron acceptor loadings:

Decreased flow rate and the consequent higher HRT cause a lowered electron acceptor
loading. Extra H₂ delivery capacity also can frame the community on its own; however,
the excess capacity to deliver electron donor rates was similar across conditions, while
the loading of electron acceptor was significantly modified.

258

259 *Taxonomic breakdown and shifts in the microbial community structure*

Figure 4 synthesizes the taxonomical break down at the order level of the most 260 abundant phylotypes. Figure S1 also reports the ten most abundant phylotypes for all 261 262 conditions at the genus level. Consistent with UniFrac and PCoA, the biofilm communities of the lead and lag MBfR were similar for each Condition. The brackets in 263 the legend of Fig. 4 identify the known DB, PRB, SRB, and other types. The groupings 264 show four important trends. First, ~86% of the taxonomic breakdown had microbial 265 phylotypes most closely related to characterized DB and PRB for Condition 1, but these 266 primary groups decreased for subsequent conditions, being only $\sim 60\%$ by Condition 4. 267 268 Connecting this community trend to community function, DB and PRB phylotypes (reported by pyrosequencing in Figure 4) follow the same trend as the NO_3^- , O_2 , and 269 ClO₄⁻ fluxes (Table 2). 270

Second, the decrease of microbial phylotypes most closely related to DB and PRB
was accompanied by significant increases in microbial phylotypes most closely related to
SRB: from <1% in Condition 1 to ~13% in Condition 4. The SRB trend by
pyrosequencing is similar to the SRB trend noted by Zhao et al.²³ using qPCR; however,
the qPCR study found that SRB had become the largest primary group in Condition 4,
followed by DB and PRB. It is possible that qPCR overestimated SRB, because some

DB harbor the *dsrA* gene.⁴⁷ Regardless of the method employed, the key trend is that SRB became important with lower acceptor loading. As noted by Ontiveros-Valencia et al.,²⁴ SRB become detrimental to PRB when they are able to occupy the most favorable zones in the biofilm (near the H₂-delivering substratum).⁴⁶ Therefore, incomplete $ClO_4^$ reduction in the lag MBfR can be at least partially attributed to increased competition from SRB.

Third, lowered electron acceptor loadings leading to augmented SO_4^{2-} reduction 283 (Conditions 3 and 4) boosted the sulfur-oxidizing *Thiotrichales* and the SRB 284 Desulfovibrionales. This combination points towards a cooperative relationship based on 285 active S cycling in which *Thiotrichales* oxidizes H₂S produced by SRB while respiring 286 NO_3^- to ammonia (NH₄⁺). Sulfide oxidation by *Thiotrichales* provided additional SO_4^{2-} 287 for SRBs, probably allowing SRB to grow to higher proportions than what would be 288 predicted from the one-time reduction of SO_4^{2-} . Figure S1 shows that closely related 289 Thiothix phylotypes, which belong to the Thiotrichales order, were abundant at 290 291 Conditions 3 and 4, and they might have imposed a risk for fouling the membranes due to its filamentous growth.⁴⁹ Thiothrix can accumulate S granules in its interior from the 292 oxidation of H₂S and form rosettes, which are arrangements of filaments. ⁵⁰⁻⁵¹ Staff 293 294 operating the pilot MBfRs reported observing filaments in some biofilms. Sulfide oxidizers also were reported in MBfR biofilms by Zhao et al.,⁵² who observed abundant 295 *Campylobacteriales* (sulfur-oxidizing bacteria), and by Ontiveros-Valencia et al.,²⁵ who 296 reported significant presence of Ignavibacteriales (green sulfur-oxidizing bacteria) and 297 Thiobacteriales (sulfur-oxidizing bacteria) when SO4²⁻ reduction was favored in bench-298 299 scale MBfRs. The differences in the phylotypes of the sulfur-oxidizers observed in the

bench- versus pilot-scale MBfRs probably can be attributed to the different inocula in each study. Despite the different inocula, the cooperative relationship between SRB and sulfur-oxidizing bacteria seems to be common once SO_4^{2-} reduction becomes important and seems to have accentuated an ecological advantage for SRB.

Besides sulfur-oxidizers, heterotrophic microorganisms such as Bacteroidales and 304 Flavobacteriales increased in Conditions 3 and 4. The heterotrophs likely consumed 305 soluble microbial products, whose rate of release increased with high rates of SO_4^{2-} 306 reduction.^{33,45}. Likewise, the relative abundance of "unclassified" bacteria and minor 307 phylotypes (microbial groups at <1% abundance) (not shown in Figure 3) went from an 308 average $\sim 3\%$ in Condition 1 to $\sim 8\%$ in Condition 4. The upswing of heterotrophs, 309 unclassified bacteria, and minor phylotypes was the foundation for the increase in the 310 microbial diversity with decreased acceptor loading (Table S1). The greater abundance 311 of other groups and SRB certainly imposed more competition for space in the biofilm, 312 forcing PRB to less favorable positions in the biofilm (zones more likely to detach).^{24,46} 313 Recently, Martin et al.⁵³ employed modeling to explain how increased detachment 314 hindered MBfR performance. Thus, increasing diversity in the biofilm was correlated 315 316 with poorer performance for ClO₄⁻ reduction.

Fourth, the DB and PRB groups showed important shifts with acceptor loading. In Conditions 1 and 2, *Rhodobacterales* were dominant; however, the most abundant DB and PRB phylotypes shifted to *Xanthomonadales* and *Rhodocyclales* in Conditions 3 and 4. In particular, closely related *Aquimonas* phylotypes, which belong to the *Xanthomonadales* order, were common to all biofilm samples, remaining in the biofilm regardless of competition (Fig. S1). In contrast, *Rhodobacterales* declined dramatically

in Conditions 3 and 4. Species *Rhodobacter capsulatus* and *Rhodobacter sphaeroides* can reduce chlorate (ClO_3^-) to chlorite (ClO_2^-); however, no growth was associated with this metabolism.⁵⁴

326 Other substantial shifts in the phylotypes most closely related to DB and PRB were observable. While the DB and PRB phylotype *Rhizobiales* remained relatively 327 constant across conditions, the phylotype Hydrogenophilales increased in Conditions 3 328 and 4. Lastly, phylotype Burkholderiales decreased abruptly while phylotype 329 Pseudomonadales decreased slightly. These substantial shifts in the DB and PRB 330 331 support that the biofilm communities were functionally redundant, which allowed different phylotypes to gain or lose prominence as acceptor loading changed without 332 affecting denitrification performance. 333

In conclusion, pyrosequencing allowed us to comprehensively assess the 334 microbial community diversity and structure of pilot MBfRs. UniFrac, and PCoA helped 335 us understand the main drivers for the shifts in microbial structures. Biofilm 336 337 communities developed with low total acceptor loading were more diverse and phylogenetic distant from communities with a higher acceptor loading. Primary members 338 (i.e., DB, PRB, and SRB) overall tracked the reduction of the electron acceptors, but 339 showed important shifts with acceptor loading. The DB/PRB phylotype Rhodobacterales 340 was significantly abundant at high acceptor loading; however, the phylotype 341 342 *Xanthomonadales* was overall the most dominant DB/PRB phylotype in all biofilm samples. *Desulfovibrionales* and *Thiothrichales* appeared together at low acceptor 343 loadings and when SO₄²⁻ reduction was strong, suggesting S cycling that corresponded to 344 345 a slowing of the ClO₄⁻-reduction rate. Likewise, heterotrophic bacteria became more

important with lower acceptor loading. The abundance of SRB and sulfur-oxidizing
partners, as well as heterotrophs, likely accentuated competition for space and forced
PRB to less favorable positions in the biofilm. Thus, the increase in diversity with low
acceptor loading was due to the increases in SRB, sulfur-oxidizers, and heterotrophs, and
it correlated with poorer performance in terms of ClO₄⁻ reduction.

351

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358 Supporting Information

Alpha-diversity metrics and ten most abundant genera in biofilm samples across the four conditions in the pilot system. This information is available free of charge via the Internet at http://pubs.acs.org/

Table 1 Four Conditions identified H_2 availability (controlled by H_2 pressure) and electron-acceptor surface loadings (adjusted by influent flow rate) for lead and lag MBfRs

Condition	Flow rate m ³ /d	Hydraulic Retention Time hours	H ₂ pressure atm		H ₂ pressure NO ₃ ⁻ -N surface loading atm g H ₂ /m ² -d		O2 surface loading g H2/m ² -d		SO4 ²⁻ surface loading g H ₂ /m ² -d		ClO4 ⁻ surface loading g H2/m ² -d		Total electron acceptor surface loading g H ₂ /m ² day		Average electron acceptor loading g H ₂ /m ² day	
			lead	lag	lead	lag	lead	lag	lead	lag	lead	lag	lead	lag		
1	65	0.7	2.2	1.8	0.41	0.13	0.15	0.002	0.22	0.22	0.002	0.002	0.78	0.36	0.6	
2	98	0.5	2.8	2.3	0.66	0.17	0.23	0.006	0.33	0.33	0.003	0.002	1.22	0.51	0.9	
3	44	1.0	2.2	2	0.37	0.03	0.10	0.002	0.18	0.18	0.002	0.0004	0.65	0.22	0.4	
4	33	1.4	2.1	1.6	0.23	0.02	0.08	0.0004	0.11	0.11	0.001	0.0002	0.41	0.13	0.3	

We calculated the electron acceptor loading rates according to:

$$Loading = \frac{Q \times (S^{\circ})}{A}$$
 (eq. 1)

where Q = volumetric flow rate (L/day), A = membrane surface area (m²), and S° is the influent concentration (g/L) for an electron acceptor. Each electron acceptor loading value was normalized to g H_2/m^2 day based on stoichiometric relationships described elsewhere.¹⁵⁻²³⁻²⁵ Total electron-acceptor loading was calculated as the sum of the loadings for O₂, NO₃⁻, ClO₄⁻, and SO₄²⁻. The average electron acceptor loading was calculated from the lead and lag total electron acceptor loadings at each condition. The lead and lag positions were switched every three days; therefore, an average estimate of the acceptor loading is valuable. The HRT was the same for each reactor regardless of the position.

Condition	Nitrate g H ₂ /m ² day		ate Oxygen flux n ² day g H ₂ /m ² day		Sulfate flux g H ₂ /m ² day		Perchlo g H ₂ /	orate flux m ² day	Total H ₂ experimental flux g H ₂ /m ² day		Maximum H ₂ flux g H ₂ /m ² day		Oversupply of H ₂ g H ₂ /m ² day	
	Lead	Lag	Lead	Lag	Lead	Lag	Lead	Lag	Lead	Lag	Lead	Lag	Lead	Lag
1	0.28	0.13	0.15	0.002	0	0.0006	0	0.0008	0.43	0.13	0.57	0.46	0.14	0.3
2	0.49	0.17	0.21	0.004	0	0.001	0.001	0.0018	0.7	0.2	0.72	0.59	0.02	0.4
3	0.24	0.03	0.09	0.002	0	0.0026	0.0007	0.00038	0.33	0.03	0.57	0.51	0.24	0.48
4	0.2	0.02	0.07	0.0004	0	0.003	0.0007	0.00019	0.27	0.02	0.53	0.41	0.26	0.39

Table 2 Electron acceptor and donor fluxes for lead and lag MBfRs for the four conditions tested over time

The electron acceptor fluxes were reported elsewhere.²³ The maximum H_2 flux was calculated as Tang et al.³¹ and the oversupply of H_2 corresponded to the maximum H_2 flux minus the total H_2 experimental flux.



Figure 1 a Pilot MBfR module which shows the ABS core and woven fabric. The water and H_2 flows are pointed by arrows. **b**&c show side reactors which were sent to ASU for community analysis. The side reactors were operated as the pilot MBfRs. **b** shows the water lines feeding the side reactors, and **c** visualizes the gas connections for the H_2 fed, and a closer look of the biofilm in the fiber sheet.



Figure 2 Clustering based on the unweighted UniFrac analyses. The branch length represents the distance between biofilm samples in UniFrac units, as indicated by the scale bar. The labels on each branch indicate the biofilm sample of either lead or lag MBfR at the four conditions applied to the reactors. The blue branch correspond to the reactors operated at high electron acceptor surface loadings (Conditions 1 and 2), while the red branch reflect the microbial community performing under low total electron acceptor surface loading (Conditions 3 and 4).



Figure 3 Principal Coordinate Analysis (PCoA) based on the unweighted UniFrac.



Figure 4 Microbial community structure in lead and lag MBfRs at the order level. The sum does not add up to 100% in all cases because phylotypes < 1% are not shown. The brackets in the legend group the orders according to known members of the noted metabolic groups. DB/PRB phylotypes are shown which hatched fills that clearly show a decline from Condition 1 to Condition 4. Some members of the "heterotrophic microorganisms," are capable of denitrification under specific circumstances, such as when using acetate as electron donor and carbon source.⁴⁸

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