1 Impact of Influent Carbon to Phosphorus Ratio on Performance and

2 Phenotypic Dynamics in Enhanced Biological Phosphorus Removal (EBPR)

3 System - Insights into Carbon Distribution, Intracellular Polymer

- 4 Stoichiometry and Pathways Shifts
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12

13 Abstract

This study investigated the impact of influent carbon to phosphorus (P) ratio on the variation in
 P-removal performance and associated intracellular polymers dynamics in key functionally

16 relevant microbial populations, namely, PAOs and GAOs, at both individual and populations

17 levels, in laboratory scale sequencing batch reactor-EBPR systems. Significant variations and

18 dynamics were evidenced for the formation, utilization and stoichiometry of intracellular

19 polymers, namely polyphosphate, glycogen and Polyhydroxyalkanoates in PAOs and GAOs in

20 the EBPR systems that were operated with influent C/P ranged from 20 to 50, presumably as

21 results of phylogenetic diversity changes and, or metabolic functions shifts in these two

22 populations at different influent C/P ratios. Single cell Raman micro-spectroscopy enabled

23 quantification of differentiated polymer inclusion levels in PAOs and GAOs and, showed that as

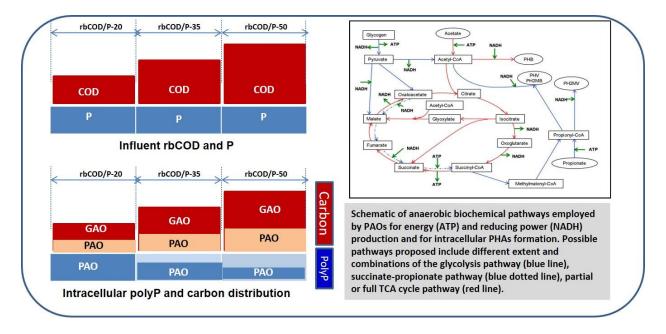
24 the influent rbCOD/P ratio increases, the excessive carbon beyond stoichiometric requirement

25 for PAOs would be diverted into GAOs. Our results also evidenced that when condition becomes

26 more P limiting at higher rbCOD/P ratios, both energy and reducing power generation required

for acetate uptake and PHB formation might shift from relying on both polyP hydrolysis and
glycolysis pathway, to more enhancement and dependence on glycolysis in addition to
partial/reverse TCA cycle. These findings provided new insights into the metabolic elasticity of
PAOs and GAOs and their population-level parameters for mechanistic EBPR modeling. This
study also demonstrated the potential of application of single cell Raman micro-spectroscopy
method as a powerful tool for studying phenotypic dynamics in ecological systems such as
EBPR.

8 KEYWORDS Enhanced biological phosphorus removal, EBPR, Raman microscopy,
9 polyphosphate, PHB, glycogen



10

11 **1. Introduction**

The increasingly stringent limits imposed on wastewater effluent phosphorus demand for higherlevel treatments through more reliable and better optimization of phosphorus removal processes. Although enhanced biological phosphorus removal (EBPR) process is considered a potentially efficient process with economic and environmental advantages compared to traditional chemical phosphorus removal, the benefits are often offset, in practice, by the needs to have standby
chemicals for achieving reliable and consistent performance. There is still knowledge gap in
understanding the mechanism and factors that control the stability of the process, particularly for
achieving extremely low effluent limits and, as a result, process stability and system performance
have been seen to vary among facilities (Gu et al., 2005; Neethling et al., 2005; Stephens et al.,
2004).

EBPR performance and stability have been shown to be affected by many factors among 7 which, the competition of the two main functionally relevant populations, namely polyphosphate 8 9 accumulating organisms or PAOs and glycogen accumulating organisms or GAOs, were found to be crucial for achieving successful operation of EBPR. Although deterioration of EBPR 10 performance has been attributed to the proliferation of GAOs in lab-scale EBPRs and also at full 11 scale EBPR facilities (Gu et al., 2005; Cech and Hartman, 1993; Saunders et al., 2003), others 12 (Gu et al., 2008; Tu and Schuler, 2013) have also shown that efficient EBPR could also be 13 achieved with relatively high abundance of GAOs being present, highlighting the need for 14 further understanding of the impact of GAOs on EBPR. In addition, the phylogenetic identities, 15 phenotypic elasticities, and biochemical metabolic pathways involved in these two groups of 16 17 microorganisms are still not fully understood. There are still uncertainties regarding the mechanism and metabolic pathways in the EBPR process; particularly, the involvement of either 18 TCA cycle or glycolysis pathway (Entner-Doudoroff versus Embden-Meyerhof-Parnas pathway) 19 20 for energy and reducing power generation and, the extent of possession and utilization of these pathways by different phylogenetic PAOs or GAOs groups under various conditions remain 21 22 unclear (Zhou et al., 2010). Interestingly, recent studies pointed out that these two groups could

1 change and switch their phenotypes and metabolic pathways under different conditions revealing 2 their metabolic flexibility (Acevedo et al., 2012; Lanham et al., 2013; daSilva et al., 2018). 3 Understanding and designing the conditions that are favorable for PAOs over GAOs and other competing microorganisms is considered necessary to maintain the system stability and 4 performance (Neethling et al., 2005; Barnard et al., 2005). Several factors have been shown to 5 6 impact the competition between PAOs and GAOs, including influent bio-available carbon to P ratio, solid retention time, VFA loading rate, feeding strategy and composition, hydraulic 7 retention time, temperature, pH, dissolved oxygen and, salinity etc. (Cech at Hartman, 1993; Tu 8 9 and Schuler, 2012; Whang and Park, 2006; Liu et al., 1997; Filipe et al., 2001; Lopez-Vasquez et al., 2009). Among these, the influent C/P ratio is particularly important since it has been 10 correlated with EBRP performance and stability (Gu et al., 2008). The observed stoichiometric 11 requirement of carbon for a unit amount of phosphorus to be removed has been around 10-20 mg 12 rbCOD/mg P removed (Barnard et al., 2005; Tchobanoglous, 2003). Higher rbCOD/P ratios (40-13 14 50 mg-rbCOD/mg-P) have been seen to be associated with GAO dominated culture (Liu et al., 1997; Broughton et al., 2008; Kong et al., 2002; Schuler and Jenkins, 2003; Oehmen et al., 2007) 15 and lower ratios (<10-20 mg-rbCOD/mg-P) have been associated with PAO dominated culture. 16 17 The range of rbCOD/P ratio for satisfying P removal in Water reclamation facilities was recommended as 15:1-25:1 (Randall et al., 1992; Tetreault et al., 1986). Gu et al (2008) 18 hypothesized that although the excessive amount of available carbon can harbor the proliferation 19 20 of GAOs, stable process can be maintained as long as the operational conditions are controlled to kinetically favor the growth of PAOs over GAOs. 21 22 The link of influent rbCOD/P ratio with microbial population structures and consequent

23 impact on EBPR performance stability warrants further investigation. Specifically, the impact of

1 varying rbCODd/P loading conditions on the relative abundances of both PAOs and GAOs along 2 with their metabolic changes and competition requires better understanding. The unavailability of diverse PAO and GAO isolates, and the lack of tools to monitor the metabolic state of these 3 4 two key populations in a mixed culture, make it often difficult to understand the influence of process parameters on the specific population levels. A single cell Raman micro-spectroscopy 5 6 method that allows for phenotype-based quantification of relative PAO and GAO abundance, simultaneous intracellular detection and quantification of polymers (i.e. polyphosphate, PHB and 7 glycogen) at individual cellular level was developed by Majed et al. (2009, 2010). Later on, 8 9 Raman-based phenotypic operational phenotype unit (OPUs) was also linked with operational taxonomic unit (OTUs) by Li et al (2018). In this study, we further employed the developed 10 Raman microscopy method to evaluate the impact of influent rbCOD/P ratio on the EBPR 11 system, including overall performance, relative PAO/GAO population abundance and, 12 particularly, on the intracellular polymer dynamics at both single cellular and population levels. 13 These results provided new insights into metabolic diversity, involvement of biochemical 14 pathways and the mechanisms of EBPR. 15

16 **2.** Material and Methods

17 2.1 Sequencing batch EBPR reactors

Three identical lab-scale SBR-EBPR systems were operated with three different influent
rbCOD/P ratios of 20, 35 and 50 (ratios relevant to full-scale EBPR processes in US),
respectively by changing the influent COD concentrations in relative to constant influent orthoP
level of 10 mg-P/L. The SBRs were controlled at a constant room temperature of 19-22°C and
operated with four six-hour cycles per day with each cycle consisting of: 10 minutes' fill
followed by 130 minutes of anaerobic phase, 183 minutes of aerobic phase, 30 minutes of

1	settling and then 7 minutes of withdrawing. The composition of synthetic wastewater feed was
2	according to Schuler and Jenkins (2003). Phosphorus was added as 45 mg/L sodium phosphate
3	monobasic (NaH ₂ PO ₄ • H ₂ O) (10 mg-P/L). Influent organic feeding ranging from $200 - 500$ mg
4	COD/L as sodium acetate (CH ₃ COONa \cdot 3H ₂ O) was provided with supplement of 15 mg/L of
5	casamino acids. We recognize that this study only focused on acetate-fed system that are
6	dominated by Accmulibacter-like PAOs and investigation of EBPR systems with more complex
7	carbon feed (i.e mixture of acetate and propionate) is warranted for future studies. Nitrogen was
8	added as ammonium chloride (NH4Cl) to maintain stoichiometric requirement of nitrogen for
9	growth (rbCOD:N:P of 100:5:1). Allylthiourea was added at 2 mg per liter of feeding to inhibit
10	nitrification. The SRT and HRT of the system were maintained at 7 days and 12 hours
11	respectively. For each rbCOD/P ratio, the SBR was operated for duration of at least 3 times SRT
12	(21-25 days) for obtaining stable performance before subjecting to populations' study and
13	Raman analysis.

14

2.2 EBPR performance evaluation

Three SBRs were operated with rbCOD/P ratios of 20, 35 and 50 respectively. For each 15 rbCOD/P ratio operations, P release and uptake cycles were monitored during the steady state 16 period to determine the EBRP activities, including P release and uptake rates, P release to acetate 17 uptake ratios and glycogen degradation to acetate uptake ratios. Samples (in duplicate) were 18 taken at the beginning and at the end of anaerobic cycle and at the end of aerobic cycle for each 19 of the three SBRs with varying influent rbCOD/P ratios for Raman analysis, as well as for 20 21 quantifying cellular-level intracellular polymers content including polyphosphate, PHB and glycogen. In addition, samples were collected at 15-60 minutes' intervals for bulk chemical 22 23 analysis to be performed for soluble orthophosphate, total phosphate, acetate, total solids and

glycogen content in sludge. The filtered samples through 0.45 μm filter papers were analyzed for
 orthophosphate (orthoP; (PO₄³)⁻) and acetate (CH₃COO⁻) using DX-120 ion chromatograph
 (Dionex Benelux, Belgium). All phosphorus fractions were measured according to the standard
 method (4500-P) (APHA, 1998). Glycogen was measured according to the method specified by
 Erdal (2002).

6 2.3 PAOs/GAOs population analysis

7 Presence of PAOs in the reactor was confirmed with phosphate removal performance evaluation, Neisser and DAPI staining (Jenkins et al., 1993; Streichan et al, 1990) for total PAO observation 8 9 and, FISH for detecting known candidate PAOs and GAOs. Oligonucleotide probes targeting Accumulibacter PAOs, Actinobacteria PAOs, Competibacter GAOs, Defluvicoccus clusters 2 10 GAOs were used in FISH analysis (Detailed listing of probes is provided in STable 1). The 11 staining, FISH protocol and hybridization conditions used were previously described (He et al., 12 2008; Zilles et al., 2002). DAPI staining for polyP was carried out at 50 µg/ml of DAPI for 1 13 14 min, whereas, DAPI staining for total population in hybridized slides (to analyze for relative abundance of phylogenetic sub-groups of PAOs and GAOs over total population) was carried out 15 at 1µg/ml of DAPI for 10 min. Hybridized and DAPI stained cells were observed with an 16 17 epifluorescent microscope (Zeiss Axioplan 2, Zeiss, Oberkochen, Germany). For the quantification of the relative proportion of the target types of cells, around 20 micrographs were 18 collected with random fields of view from the same slide/sample and average abundance of the 19 20 target cells was calculated as the relative proportion of fluorescing area having the target label (PAO/GAO) compared to the area of the total population (DAPI) using DAIME (Digital Image 21 22 Analysis in Microbial Ecology) software version 1.3.1 (http://www.microbial-ecology.net/) 23 (Daims et al., 2006). The standard error of the mean (SEM) was calculated as the standard

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1 deviation of the area percentages divided by the square root of the number of images analyzed. 2 For Raman analysis, fractions of target populations (PAOs/GAOs) were determined by averaging 3 the fractions of samples from aerobic phase according to Majed et al (2012). 4 2.4 Raman Micro-Spectroscopy Analysis 5 Samples subjected to Raman analysis were prepared on optically polished CaF₂ windows (Laser 6 Optex, Beijing, China) according to Majed et al (2010). Samples were homogenized rigorously by 26-gauge needle and syringe to obtain a more uniform sample. Raman spectra for at least 40-7 45 single cells were examined for each sample and the sample size was determined with 8 9 consideration of both the desired accuracy and labor-intensiveness of the Raman analysis. Statistical analysis of the sample size and validation of the analysis accuracy and reliability was 10 demonstrated in our previous publications (Majed et al., 2010; Li et al., 2018) and also provided 11 in supporting information (SFigure 3 and SFigure 4). Raman spectra were acquired using a 12 WITec, Inc. (Ulm, Germany) Model CRM 2000 confocal Raman microscope. Excitation (ca. 30 13 mW at 633nm) was provided by a Helium/Neon laser (Melles Griot, Carlsbad, CA). Details on 14 the acquisition of spectra can be obtained in Majed et al. (2009). Relative quantity of polyP 15 content in each individual cell was evaluated based on the Raman intensity (peak height in the 16 17 unit of Charged Coupled Device (CCD counts) of the PO₂⁻ stretching band occurring around 1168-1175 cm⁻¹ wave number region after background correction (Majed et al., 2009). The C=O 18 stretching band of ester linkage occurring around 1734 cm⁻¹ and glycogen vibration occurring 19 around 480 cm⁻¹ were used for quantification of PHB and glycogen content, respectively (Majed 20 and Gu, 2010). Total PHV concentration associated with the two populations could not be 21 22 quantified via Raman due to the overlapping of peak positions between PHV and glycogen 23 (Majed and Gu, 2010). Depending on the time point during the anaerobic/aerobic EBPR cycle

1 when the sample was taken, and the expected corresponding Raman polymers spectrum based	olvmers spectrum based on
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- 2 current understanding of the EBPR mechanisms and polymer functions, cells containing polyP,
- 3 with or without other polymers (glycogen, PHA) were categorized as PAOs and the cells
- 4 containing only glycogen or combination of glycogen and PHA, were assigned as GAOs.
- 5 Detailed description of the rationale and validation of the proposed quantification methods is
- 6 referred to Majed et al. (2012).
- 7 **3. Results and Discussion**

8 3.1 Impact of Influent rbCOD/P on EBPR performance and kinetics

- 9 Table 1 shows the EBPR activities-related stoichiometry observed in EBPR systems along with
- 10 the performance and stability of the system at different influent feeding rbCOD/P ratios.
- 11 Operational data for the SBRs under monitoring (STable 2) indicated that percent removal of P
- 12 changed from 82% to 95% to 97% as rbCOD/P ratio changes from 50 to 35, then to 20
- respectively. The results showed good P removal at rbCOD/P ratio of 20 to 35, and significant
- 14 decrease in P removal efficiency at rbCOD to P ratio of 50.

15 Table 1: P removal performance and activity data of the SBR- EBPR systems operated with influent 16 rbCOD/P ratio at 20, 35 and 50, respectively

Influent mg- COD/m g-P	Cumulative Frequency Effluent ortho-P< 1mg P/L	Cumulative Frequency of Effluent ortho-P< 0.5mg P/L	P Removal Efficiency (%)	P release rate, mg- P/gVSS.h	P uptake rate, mg- P/gVSS. h	P _{release} /HAc ^{uptake} Pmol/Cmol	Gly _{utilization} / HAc _{uptake} Cmol/Cmol	P content, mg-P/mg- VSS
20	0.85	0.6	97	50.63	23.81	0.6	0.41	0.09
35	0.86	0.63	95	38.14	21.2	0.47	0.74	0.06
50	0.5	0.31	82	4.38	9.82	0.22	1.04	0.024

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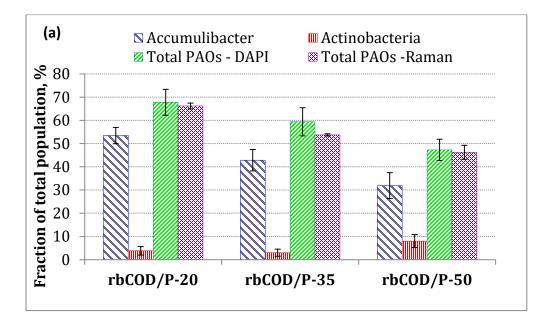
2	Through comparison of cumulative frequency of the occurrence that effluent orthoP is obtained
3	below <1 mg/L and below <0.5 mg/L, the system with COD/P ratio of 35 ensures the maximum
4	stability while the system with rbCOD/P ratio of 20 performs almost similar. However, system is
5	far from stable for the SBR system with rbCOD/P ratio of 50.
6	According to established EBPR models, EBPR metabolic pathways demand certain
7	stoichiometric relationships among the storage polymers. The Prelaease/HAcuptake (P/HAc) ratio is
8	often used as an indicator of the relative PAO and GAO activities and abundance. As shown in
9	Table 3, the P/HAc ratio was 0.6 Pmol/Cmol for rbCOD/P ratio of 20 which decreases linearly
10	with increasing rbCOD/P ratio. Previous studies indicated that higher influent rbCOD/P led to
11	more GAO-dominant microbial population in the system (Smolders et al., 1994). This is
12	confirmed and supported by our population analysis results that are discussed in the section 3.2.
13	The anaerobic glycogen _{utilization} /HAc _{uptake} ratios (Gly/HAc ratio) decreased linearly from 0.41 to
13 14	The anaerobic glycogen _{utilization} /HAc _{uptake} ratios (Gly/HAc ratio) decreased linearly from 0.41 to 1.04 Cmol/Cmol from rbCOD/P ratio of 20 to 50 respectively. These ratios are within the range
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1 3.2 Impact of influent rbCOD/P on relative PAO- GAO population abundance and Association

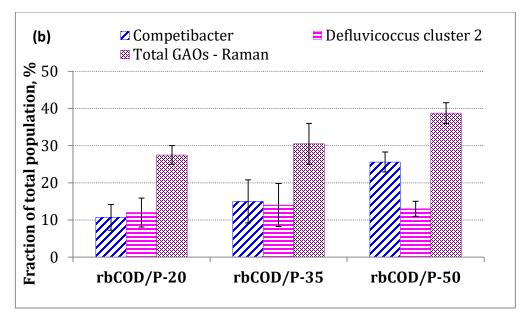
2 with EBPR activities

Figure 1 shows the PAOs (Figure 1a) and GAOs (Figure 1b) population fractions changes in 3 response to varying influent rbCOD/P ratios, using conventional DAPI staining, FISH 4 5 measurements and Raman analysis. As shown in Figure 1a, total PAOs determined via Raman 6 spectrum agreed well with those estimated by DAPI staining for all rbCOD/P ratios. Currently, there is no other method available for quantifying total GAOs in EBPR systems; therefore, the 7 GAOs abundance determined by Raman could not be compared. Note that the sum of GAOs and 8 9 PAOs, as quantified by Raman analysis, comprised around 85-90% of total microbial population 10 in the SBR-EBPR studied, indicating that our methods captured majority of the population. Both Accumulibacter-like PAOs and total PAOs abundance decreased, as the influent 11 rbCOD/P (mg-COD/mg-P) ratio increased from 20 to 50 (Figure 1a). Accumulibacter PAOs 12 comprised around 70% of total PAOs population at all rbCOD/P ratios studied. Actinobacteria 13 type PAOs constituted a minor fraction of total PAOs being less than 5% of the total population 14 at rbCOD/P ratios of 20 and 35, however, their abundance increased to 8% at rbCOD/P of 50. 15 Actinobacteria PAOs are known to grow on amino acids instead of acetate and the casamino 16 17 acids in the feeding likely provided the amino acid source that supported the growth of Actinobacteria. Concurrently with the decrease of relative PAOs abundance, the relative GAOs 18 19 abundance increased by 40% with the increasing rbCOD/P ratios from 20 to 50 as shown in 20 figure 1b. Alphaproteobacterial Defluvicoccus cluster 2 (DF2) and Competibacter type GAOs accounted for majority (>80%) of the total GAOs (based on Raman measurements since there is 21 22 currently no other method available for quantifying total GAOs) in our culture (Figure 1b). 23 *Competibacter* abundance increased by >40% with the increasing rbCOD/P ratios from 20 to 50,

- 1 but abundance of DF2 did not seem to vary, indicating that *Competibacter* was likely the one
- 2 that responded to the change in loading ratio. Muszyński and Miłobędzka (2015) also observed
- 3 increase in *Competibacter* abundance from 4 to 20% when the rbCOD/P ratio was changed from
- 4 15:1 to 100:1 with aerobic granular sludge while abundance of *Alphaproteobacterial*
- 5 *Defluvicoccus* cluster 1 (*DF1*) remained constant at 2% (they did not detect DF2 type GAOs in
- 6 the granular sludge). These results clearly showed that both relative abundance and community
- 7 compositions of PAOs and GAOs shifted as the influent rbCOD/P ratio changed.



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Figure 1: Abundances of population fractions belonging to the groups (a) PAOs and (b)
 GAOs at different rbCOD/P ratios quantified via DAPI staining (total PAOs), FISH (known candidate sub-PAOs and GAOs) and Raman polymers spectrum analysis (total PAOs and GAOs based on intracellular polymers). Error bars represent standard error

4

5 The changes in relative abundance of PAOs and GAOs in response to influent rbCOD/P variations were consistent with the chemical analysis of P content level in the sludge and the 6 evaluation of EBPR activities, as summarized in Table 1 (profiles demonstrated in SFigure 1). 7 8 With a higher carbon loading with respect to phosphorus, the P content in sludge, the P release rate and the Prelease/HAcuptake ratios decreased, indicating a decline of relative PAOs activities 9 (presumably proportional to PAO populations) and increase in relative GAOs in the sludge. 10 Correlation analysis of relative PAOs abundance (%) with the EBPR activities parameters 11 12 seemed to indicate that relative total PAOs abundance change correlated more significantly (p<0.05) with $P_{release}/HAc_{uptake}$ ratio (r = 0.99, p = 0.0351) and sludge P content (r = 13 0.99, p = 0.0468), but less so with P release rate (r = 0.99, p = 0.0991), 14 glycogen_{degradation}/HAc_{uptake} ratio (r = -0.99, p = 0.0836), and P uptake rate (r = 0.97, p = 0.155). 15

1 The result also showed positive correlation between the P_{rel}/HAc_{uptake} ratio and the abundance 2 ratio of Accumulibacter/(Competibacter+DF2) (correlation coefficient, r = 0.97; p = 0.1553), as well as P_{rel}/HAc_{untake} ratio and total PAO/GAO (analyzed by Raman) (r = 0.98, p = 0.1248) at 3 4 different rbCOD/P ratios.

5 Previous studies have indicated that rbCOD/P ratio seem to dictate the relative PAO and 6 GAO population abundance based on indirect observation of changes in EBPR activities (since total GAOs could not be quantified previously) (Gu et al., 2008; Liu et al., 1997; Schuler et al., 7 2003). Our results are consistent with the previous studies, and more clearly demonstrated the 8 9 impact of rbCOD/ P ratio on both total and different sub-populations of PAO and GAOs, as well as their associated phenotypic activities. We recognize that this study only focused on acetate-fed 10 system that are dominated by Accmulibacter-like PAOs and investigation of EBPR systems with 11 more complex carbon feed (i.e mixture of acetate and propionate) is warranted for future studies. 12 One intriguing observation is that P removal performance deteriorated at rbCOD/P ratio 13 of 50, even though the system still contained rather high relative abundance of total PAO and 14 Accumulibacter-like PAOs (47%, 32% respectively.), which are higher than typical range 15 observed at full-scale EBPR systems (Neethling et al., 2005; Gu et al., 2008; Lanham et al., 16 17 2013; Gu et al., 2018). This suggests, in agreement with previous observations, that EBPR performance does not always correlate with relative PAOs abundance alone. 18

19

3.3 Impact of Influent rbCOD/P ratio on population- level distributions of intracellular

polymer content in PAOs and GAOs 20

21 Raman analysis allows for the quantification of intracellular inclusion of polyP, PHB and glycogen within each individual cell and therefore can reveal the level and distribution of 22

intracellular polymer contents among populations. In addition, by identifying the cells as either 23

PAOs or GAOs based on their unique polymer combination as described previously, the changes 1 and dynamics of the functionally relevant intracellular polymers associated with either PAOs or 2 GAOs can be, for the first time, evaluated separately. However, it should be noted that 3 evaluation of the levels of intracellular polymeric inclusions and the resulting distributions do 4 not necessarily correspond to the rate of increase or decrease of polymer formation or 5 degradation at any given condition, nevertheless the variations in the levels at different 6 conditions depict the dynamics of intracellular transformations in response to the influent loading 7 8 changes.

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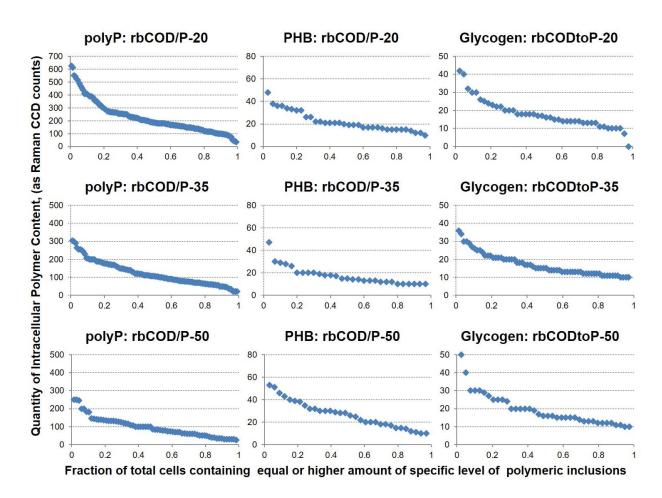




Figure 2: Intracellular polymer content level (intensity as CCD counts) distribution among PAOs cells for polyphosphate, PHB, and glycogen quantities, respectively. Data based on batch testing sampling of all cells subjected to single cell Raman micro-spectroscopy analysis in the three EBPR SBR systems fed with different influent COD/P (mg/mg) ratios. X axis: fractions of cells that contained equal or higher amount of the specific level of polymeric inclusion at any given testing. Y-axis: level of polymeric inclusion in CCD counts. bioRxiv preprint doi: https://doi.org/10.1101/671081; this version posted June 13, 2019. The copyright holder for this preprint (which was not certified by peer review) is the author/funder. All rights reserved. No reuse allowed without permission.

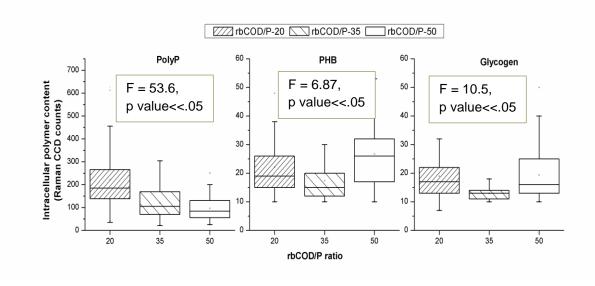


Figure 3: Box plots showing the minimum, maximum and median levels of intracellular
polymer content levels of polyP, PHB and glycogen polymers in individual PAO cells
revealed by single cell Raman micro-spectroscopy (respective F statistic and P values are
shown in figures)

1

6 Figure 2 and Figure 3 show the comparison of quantity level and distributions of different intracellular polymers in PAOs for EBPR systems operated under three different influent 7 8 rbCOD/P ratios. Both 50 percentile and maximum polyP intensity inside individual PAO cells 9 decreased as the rbCOD/P ratio increased even though the influent P concentration remained the same (SFigure 1). Drastic decrease of cellular level polyP content at increased rbCOD/P ratio is 10 quite contrary to the traditional assumption in EBPR models that considers that the maximum 11 saturated intracellular polyP levels is relatively constant and only PAO populations abundance 12 varies with the external condition (Streichan et al., 1990). Therefore, PAOs abundance changes 13 14 based on the bulk sludge P content or overall P release during EBPR process may not be adequate. In contrast to significant polyP abundance changes, the intracellular PHB levels in the 15 PAOs exhibited slight increase (38% for median, 37% for maximum values disregarding the 16 17 outlier) as the influent rbCOD/P ratio increases from 20 to 50 (Figures 2 and 3). There was no

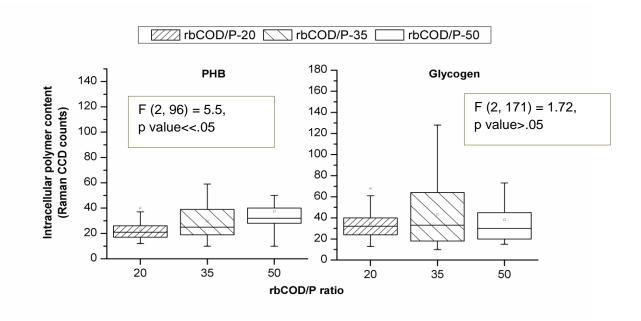
1	significant change in the median level of intracellular glycogen level in PAOs, however
2	maximum and minimum levels increased (25% and 43% respectively, Figure 3) as rbCOD/P
3	increased from 20 to 50. This warranted the one-way ANOVA test among the polymeric
4	inclusion data which revealed $F_{polyP}(2,301) = 53.6$, p<<0.05; $F_{PHB}(2,92) = 6.87$, p<<0.05;
5	$F_{glycogen}(2, 119) = 10.5$, p<<0.05 for PAOs suggesting that the changes in polymeric inclusion
6	levels with changes in rbCOD/P ratio are statistically significant. This implies that the
7	intracellular polymers content and their stoichiometric ratios in PAOs are rather dynamic
8	depending on the influent carbon loadings, which can be associated with both PAO phylogenetic
9	diversity and phenotypic elasticity. Therefore, the saturation level (maximum) of these
10	intracellular polymers that are considered to be a constant in current EBPR models (Schuler,
11	2005) needs further justification.

Similarly, observations of inclusion level and distribution for intracellular glycogen and 12 13 PHB content in individual glycogen containing cells (GAOs) were revealed by single cell Raman microspectroscopy (Figure 4 and SFigure 2). Significant increase in cellular PHB content (50% 14 increase in median and 31% increase in maximum cellular level) with elevation of rbCOD/P 15 ratios (from 20 to 50) in GAO cells (Figure 4) was observed. Intracellular glycogen level in 16 GAOs exhibited overall increase for maximum levels (50% increase from rbCOD/P of 20 to 50), 17 however median values remained almost similar. This warranted the one-way ANOVA test 18 among the polymeric inclusion data which revealed F_{PHB} (2,96) = 5.5, p<<0.05; $F_{glvcogen}$ (2,171) 19 20 = 1.72, p>0.05 for GAOs. This suggests the higher carbon loading to the EBRP systems not only 21 resulted in increase of relative abundance of GAOs, but also led to either selection of GAOs with higher intracellular PHB, and/or encouraged GAOs to accumulate more PHA pool inside cells. 22

1 However, the increment of glycogen pool within GAO cells with increase in rbCOD/P ratio is

2 not statistically significant.

3



4

Figure 4: Box plots showing the minimum, maximum and median levels of intracellular
polymer content levels of PHB and glycogen polymers in individual GAO cells revealed by
single cell Raman micro-spectroscopy (respective F statistic and P values are also mentioned)

8

9 These results, for the first time, revealed the individual cellular level polymers level 10 changes in both PAOs and GAOs populations in response to changes in influent carbon and P 11 loading conditions. These observed intracellular polymers dynamics could result from and reflect 12 the changes in phylogenetic diversity and, or metabolic functions shifts in PAOs, which requires 13 further investigation. The results also imply that there is great heterogeneity of the intracellular 14 polymers storage amount among PAOs and GAOs, which can be dynamic depending on 15 operational conditions.

1 3.4 Distribution of Carbon and polyP between PAOs and GAOs at varying COD/P condition

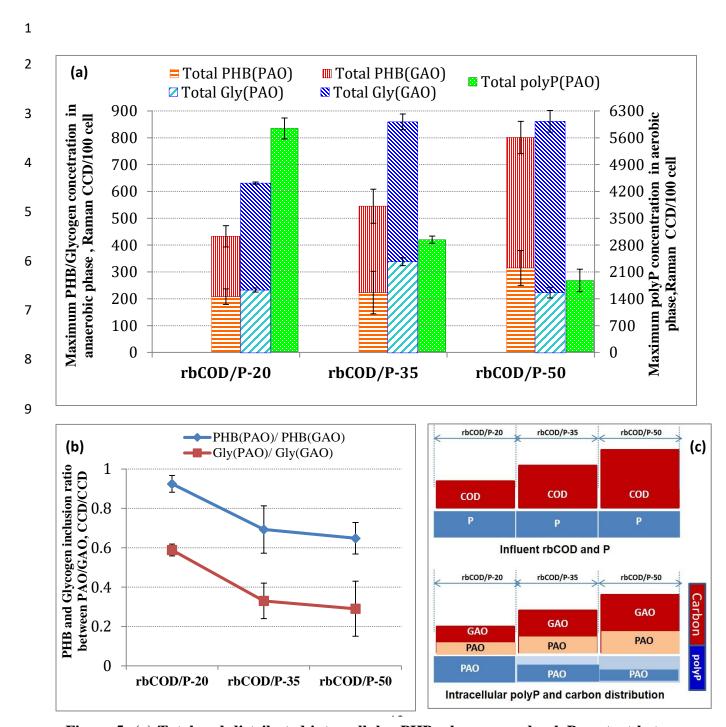
2 Using the Raman-based PAO and GAO identification methods described earlier, differentiated intracellular polymer content associated within PAOs versus those within GAOs 3 4 could be quantified and evaluated separately (Majed and Gu, 2010). Figure 5a shows the total and distributed PHB (normalized amount at the end of the anaerobic phase when the PHB 5 6 content is presumably to be at the maximum level) and glycogen content levels (normalized amount at the end of the aerobic phase when the glycogen content is presumably to be at the 7 maximum level) inside PAOs and GAOs. Figure 5b shows the ratio of PHB and glycogen 8 9 content in PAOs in relative to those in GAOs at different rbCOD/P loading conditions and figure 5c is a qualitative illustration of the distribution and carbon flow among PAOs and GAOs in 10 response to the increase in influent carbon loads. 11 Both total PHB and total glycogen concentration in the overall mixed population (sum of 12 those in both PAOs and GAOs) exhibited elevating trends with the increasing rbCOD/P ratio. 13 Majority portion of incremental PHB and glycogen content was associated with GAOs, 14 indicating the flow of the increased carbon to GAOs as a result of increased relative abundance 15 of GAOs as well as elevated average individual cellular glycogen content in GAO cells. The 16 17 ratio of PHB inside PAOs to that inside GAOs dropped from 0.92 to 0.65 when rbCOD/P ratio increased from 20 to 50, (Figure 5b). These results clearly demonstrated the quantitative shift in 18 intracellular carbon storage distribution between the two populations, from having a good 19 20 portion (50%) of the total PHB in PAO populations to having majority of the carbon shuttled to

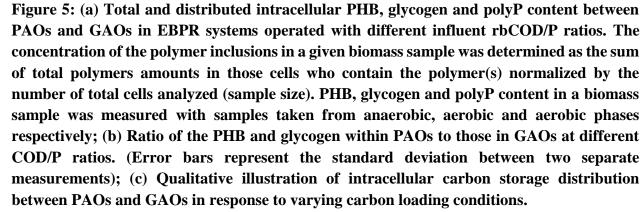
21 GAOs as the rbCOD/P increased. These results support the hypothesis and carbon distribution

22 model proposed by Gu et al (2008) that as the influent rbCOD/P ratio increases, the excessive

23 carbon beyond stoichiometric requirement for PAOs would be diverted into GAOs.

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1 Also shown in Figure 5a is the normalized polyP concentration (total polyP amount 2 determined by Raman normalized to sample size) that exhibited dramatic decrease with increase in rbCOD to P ratio as a result of decrease in individual cellular polyP intensity. These results are 3 4 consistent with bulk P content (Table 1), suggesting again the validity of the Raman analysis for 5 polyP. The quantitative measurement of intracellular polymers associated with PAO and GAO 6 populations allowed for the estimation of changes in the stoichiometry of the utilization and formation of these polymers with different loading conditions. Table 2 summarizes the ratios of 7 PHB formation to polyP utilization, glycogen utilization to polyP utilization and PHB formation 8 9 to glycogen utilization during the anaerobic phases in PAOs. As described in our previous studies, the lack of standard chemicals for polymers and difficulty with Raman method to 10 establish a reference calibration for a mixed culture (activated sludge) as ours did not yet allow 11 the conversion of CCD count to conventional units of mg/L (Majed et al., 2009). Therefore, we 12 could not compare our stoichiometric values directly with those reported in the literature yet 13 (Oehmen et al., 2010). Nevertheless; the ratios used here are still valid for assessing the impact 14 of rbCOD/P ratio on these values. Based on the current biochemical model of EBPR, the 15 theoretical stoichiometric ratios between polyP, PHB and glycogen polymers are generally 16 17 assumed to be constant for a given pathway within a given population (Smolders et al., 1994). However, as shown in Table 2, each of the ratios varied consistently for PAOs as the loading 18 conditions changed. These results, for the first time, demonstrated that the EBPR stoichiometry 19 20 could vary significantly with loading conditions, possibly due to the metabolic states changes (e.g utilization of different pathways) and /or population changes within phylogenetic sub-groups 21 22 (e.g sub clusters of Accumulibacter-like PAOs).

23

1 Table 2: Stoichiometric ratios of polyP utilization, PHB formation and glycogen utilization

2 in the anaerobic phase for PAOs, in SBR-EBPR system operated with different influent 2 rbCOD/B (mg/mg) ratios

3 rbCOD/P (mg/mg) ratios.

	PHB formation / polyP utilization	Glycogen utilization /polyP utilization	PHB formation /Glycogen utilization
	CCD/CCD	CCD/CCD	CCD/CCD
rbCOD/P-20	0.044	0.009	4.84
rbCOD/P-35	0.13	0.07	1.81
rbCOD/P-50	0.24	0.21	1.21

4

5 3.5 Insights into the metabolic pathways involved in EBPR

Uncertainties still exist regarding the pathways employed by PAOs for reducing power generation 6 in anaerobic EBPR process, which would affect the stoichiometric ratios and the amount and type 7 8 of PHA formation from acetate uptake (Zhou et al., 2010). Current understanding indicates that PAOs can use glycolysis in addition to partial TCA cycle (reductive branch of TCA cycle, also 9 10 called succinate-propionyl-coA pathway), split (reverse) TCA cycle and/or glyoxylate shunt based on carbon preservation under different polymer content (daSilva et al., 2018; Martin et al., 2006; 11 Wilmes et al, 2008; He et al., 2010; Zhou et al., 2009) (provided as SFigure 5 and SFIgure 6). The 12 extent of involvement and utilization of these pathways also vary depending on the phylogenetic 13 subgroups of PAOs and different external loading/nutrient availability conditions (Zhou et al., 14 2010; daSilva et al., 2018; Oehmen et al., 2010). 15

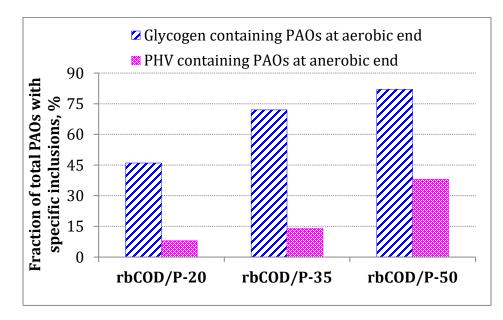
Our results suggest that when condition becomes more P limiting at higher rbCOD/P ratios, both energy and reducing power generation required for acetate uptake and PHB formation might shift from relying on both polyP hydrolysis and glycolysis pathway, to more enhancement and dependence on glycolysis in addition to partial/reverse TCA cycle. This is supported by The anaerobic glycogen utilization to polyP utilization ratio inside PAOs which increased nearly 20

1 times from 0.009 to 0.21 as influent rbCOD/P elevated from 20 to 50 (Table 2). This is also 2 consistent with the increasing trend of glycogen_{degradation}/HAc_{uptake} ratio with higher rbCOD/P ratio (Table 1). Furthermore, Figure 6 is a representation of the increase in the fraction of 3 glycogen containing PAO cells (those containing both polyP and glycogen or 4 5 polyP+glycogen+PHB) in the EBPR system under study and the corresponding increase in the 6 PAO cells that contained PHV as the rbCOD/P ratio increases. Previously established EBPR models (SFigure 5) and current understanding (SFigure 6) assume that PHB can be formed via 7 some form of TCA cycle or glycolysis or combination of both, however, PHV can mainly be 8 9 formed through glycolysis pathway in combination with the succinate-propionate pathway (reductive branch) of TCA cycle or reverse TCA with glyoxylate shut combined with succinyl-10 CoA (daSilva et al., 2018) Thus, increase in the PHV containing PAO cells indicates the larger 11 extent of employment of partial/split TCA pathways with increasing rbCOD/P ratio. Previous 12 studies have often associated the increase in PHV content in the EBPR system with increase in 13 the relative population abundance of GAOs since the latter mainly utilize glycolysis pathway and 14 produce higher amount of PHV. However, our results revealed that the fraction of PAOs that 15 contain PHV could vary as well with different operational loading conditions, irrelevant to the 16 17 abundance of GAOs. Acevado et al (2012, 2017) showed that long-time P limited conditions enhance glycolytic pathway to supply energy deficit and shift towards more GAO-like 18 19 metabolism. It was observed later by da Silva et al (2018) that when polyP is limited, reverse 20 (split) TCA cycle is the most optimal pathway suggesting GAOs are operating reverse TCA cycle. 21

It should be noted that for individual PAO cells in our study, the relative percentage of
PHV content to total PHB+PHV never exceeded 8-12% (data not shown), which is consistent

with the PHV content range reported previously with PAO-enriched (>70%) system (Oehmen et
al., 2007). These results, for the first time, provided direct cellular and population level evidence
for the possibility that at higher rbCOD/P loading condition when P becomes more limited, there
were shifts in the involvement of different metabolic pathways in PAOs. Now, whether this was
caused by phenotype changes or shifts in phylogenetic sub-populations that possess different
pathways still requires confirmation via further investigation. Furthermore, it is also possible that
some of these PAO cells might follow certain metabolism that does not involve the known and

8 identifiable storage polymers.



9

Figure 6: Distribution of fractions of PAOs (over total PAOs at respective phases) containing PHV at the end of anaerobic phase and glycogen at the end of aerobic phase in EBPR systems with different influent rbCOD/P ratios

12 Conclusion

- 13 The lack of PAO isolates and the tools to monitor the quantities related to metabolic states of PAOs
- 14 made it difficult to investigate the speculations that require observation from both phenotypic and
- 15 phylogenetic aspects. The Raman microscopy method employed in this study helped us gaining

1 further population and cellular level insights into the metabolic diversity among sub-populations 2 within PAO group via tracking of intracellular polymeric inclusions in different metabolic stages 3 of EBPR system, in contrast to the bulk measurements describing the EBPR process that are 4 actually "apparent" sums of different PAOs groups with diverse metabolic pathways. To 5 summarize, the following major conclusions could be drawn: Influent rbCOD/P ratio affected EBPR system stability and relative dominance/abundance of 6 7 functionally relevant PAOs/GAOs Individual cellular level polymers level heterogeneity, distributions and stoichiometry ratios 8 9 changed in both PAOs and GAOs populations in response to changes in influent carbon and P 10 loading conditions. 11 Intracellular polymeric stoichiometry evaluation within PAO populations enabled by Raman ٠ 12 analysis elucidated the phenotypic elasticity in PAOs depending on influent loading conditions Quantification of differentiated PHB and glycogen inclusion levels in PAOs and GAOs 13 showed that the influent rbCOD/P ratio increases, the excessive carbon beyond stoichiometric 14 requirement for PAOs was diverted into GAOs. 15 Population-specific evaluation of intracellular polymers evidenced that P limiting conditions 16 • at higher rbCOD/P ratios led to enhancement and increased reliance on glycolysis in addition 17 18 to partial/reverse TCA cycle for anaerobic reducing power generation. 19 These findings provided new insights into the metabolic diversity of the functionally relevant 20 populations in EBPR and population level formation for mechanistic EBPR model improvement 21 and development. It also demonstrated the potential of application of Raman method as a 22 powerful tool for the fundamental understanding of EBPR mechanism.

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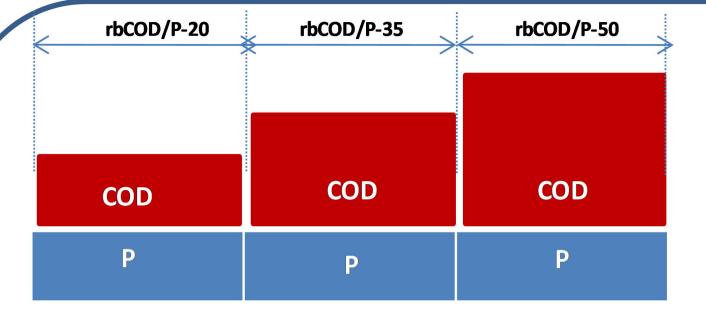
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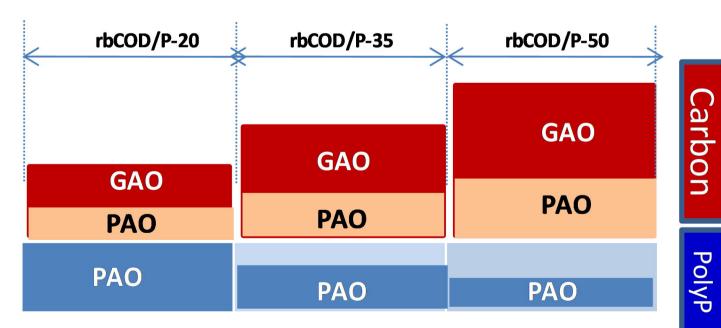
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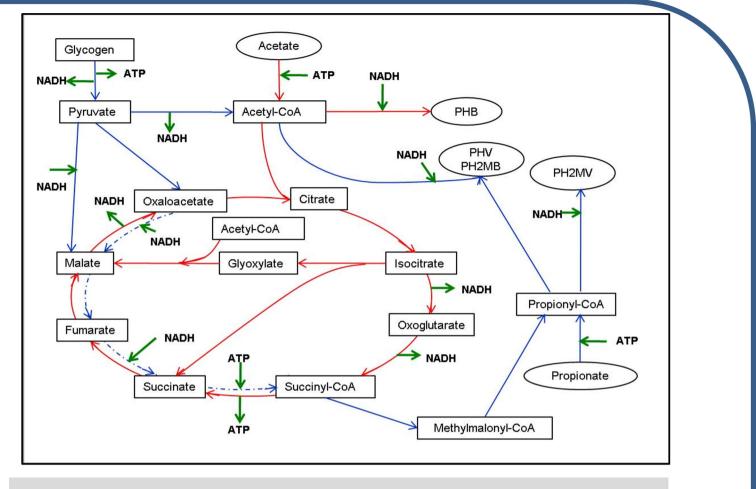
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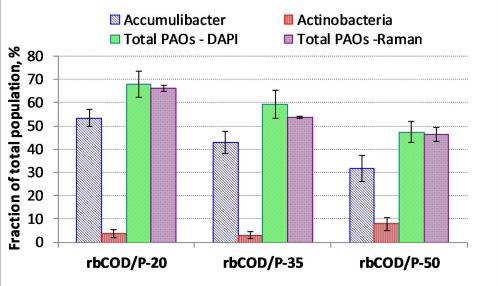
Influent rbCOD and P

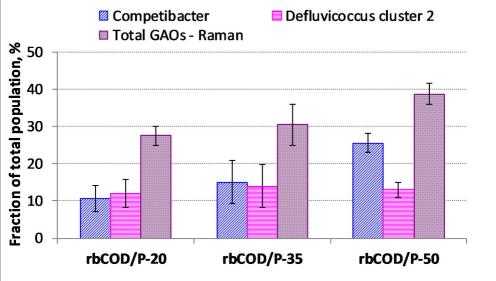


Intracellular polyP and carbon distribution



Schematic of anaerobic biochemical pathways employed by PAOs for energy (ATP) and reducing power (NADH) production and for intracellular PHAs formation. Possible pathways proposed include different extent and combinations of the glycolysis pathway (blue line), succinate-propionate pathway (blue dotted line), partial or full TCA cycle pathway (red line).

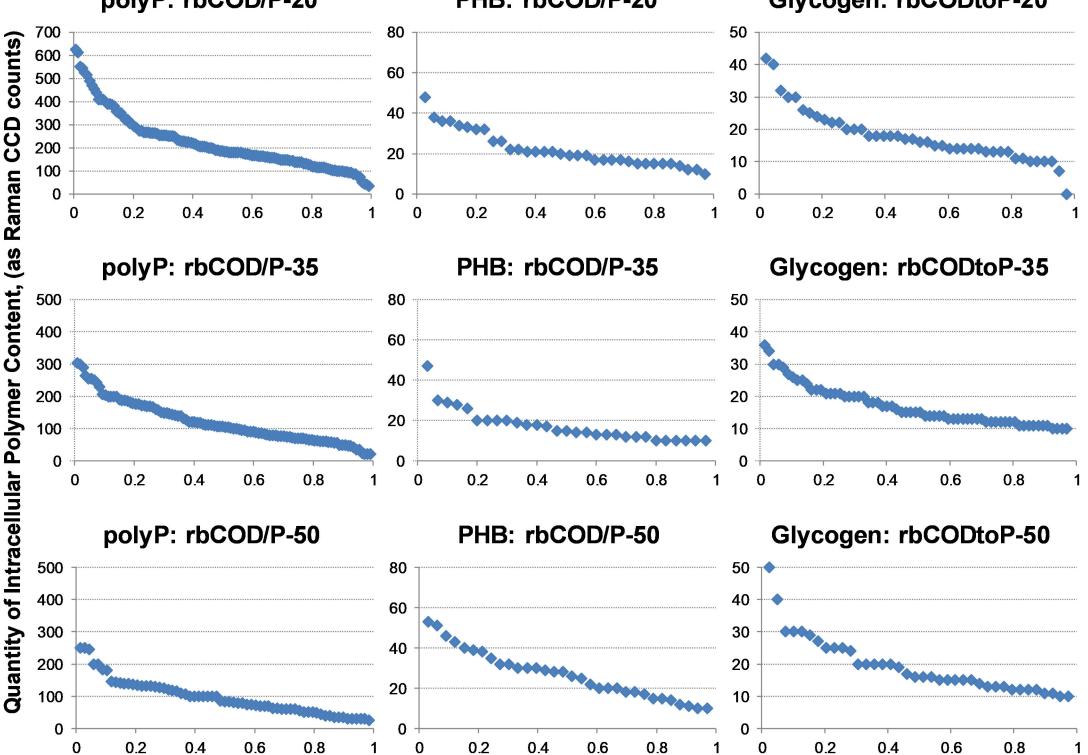




polyP: rbCOD/P-20

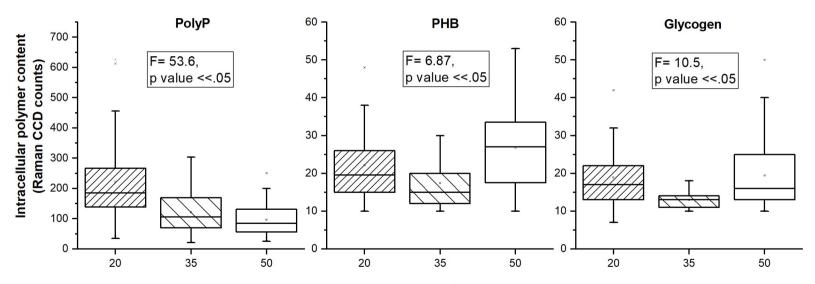
PHB: rbCOD/P-20

Glycogen: rbCODtoP-20



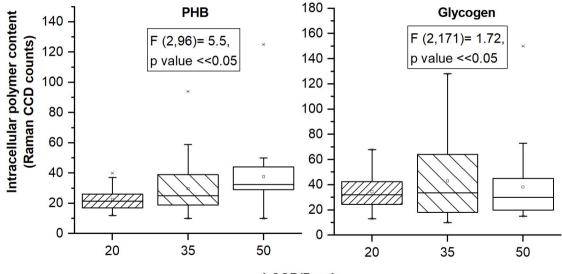
Fraction of total cells containing equal or higher amount of specific level of polymeric inclusions





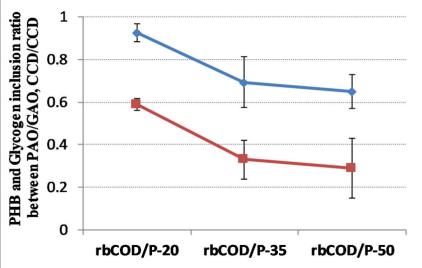
rbCOD/P ratio

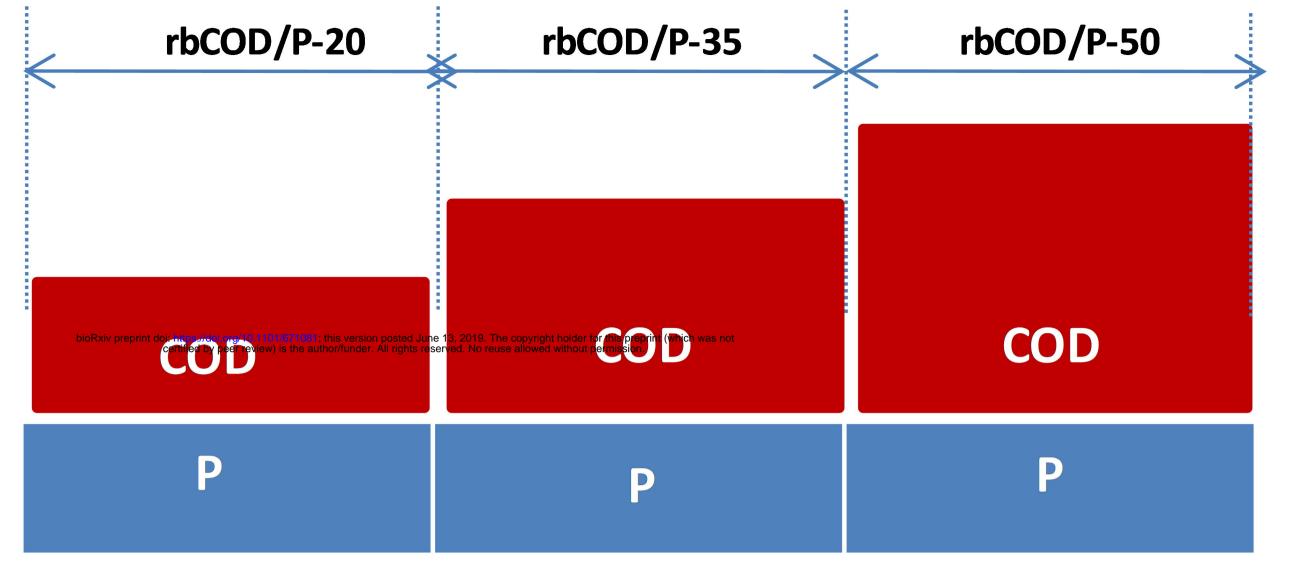
rbCOD/P-20 rbCOD/P-35 rbCOD/P-50



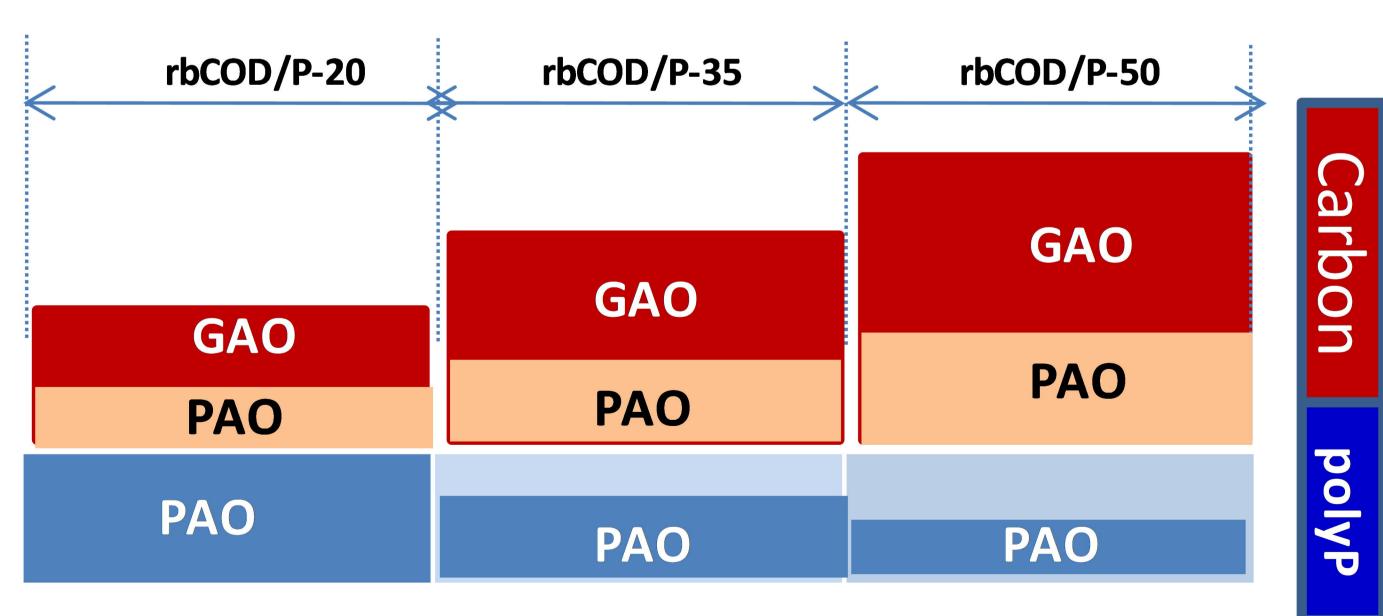
rbCOD/P ratio

PHB(PAO)/ PHB(GAO) - Gly(PAO)/ Gly(GAO)





Influent rbCOD and P



Intracellular polyP and carbon distribution

