

Citation for published version: Suwarno, SR, Huang, W, Chew, Y-M, Tan, SHH, Trisno, AE & Zhou, Y 2018, 'On-line Biofilm Strength Detection in Cross-flow Membrane Filtration Systems', Biofouling: The Journal of Bioadhesion and Biofilm Research, vol. 34, no. 2, pp. 123-131. https://doi.org/10.1080/08927014.2017.1409892

DOI: 10.1080/08927014.2017.1409892

Publication date: 2018

Document Version Peer reviewed version

Link to publication

This is an Accepted Manuscript of an article published by Taylor & Francis in Biofouling on 22 Dec 2017, available online: http://www.tandfonline.com/10.1080/08927014.2017.1409892.

University of Bath

General rights

Copyright and moral rights for the publications made accessible in the public portal are retained by the authors and/or other copyright owners and it is a condition of accessing publications that users recognise and abide by the legal requirements associated with these rights.

Take down policy If you believe that this document breaches copyright please contact us providing details, and we will remove access to the work immediately and investigate your claim.

1	On-line Biofilm Strength Detection in Cross-flov				
2	Membrane Filtration Systems				
3					
4	Suwarno, Stanislaus Raditya ²⁺ , Huang, Wenhai ¹⁺ , Chew, Y. M. John ⁴ ,				
5	Tan, Sio Hoong Henrich ³ , Trisno, Augustinus Elmer ³ , Zhou, Yan ^{1,3*}				
6					
7	1, Advanced Environmental Biotechnology Centre, Nanyang Environment & Water Research				
8	Institute, Nanyang Technological University, Singapore;				
9	2, Singapore Membrane Technology Centre, Nanyang Environment & Water Research Institute,				
10	Nanyang Technological University, Singapore;				
11	3, School of Civil & Environmental Engineering, Nanyang Technological University, Singapore;				
12	4, Centre for Advanced Separations Engineering and Department of Chemical Engineering,				
13	University of Bath, UK				
14					
15	Word Count				
16	Text: 3594				
17	References: 1339				
18	Figures: 180				
19	Tables: 237				

⁺ These authors contributed equally to this work.

^{*} Corresponding author.

Phone No.: +65-6592-1832

Email: <u>zhouyan@ntu.edu.sg</u> Postal address: Nanyang Environment & Water Research Institute (NEWRI), CleanTech Loop (CleanTech One) #06-08, Nanyang Technological University, Singapore, 637141

20 ABSTRACT

21 A fluid dynamic gauging (FDG) technique was used for on-line and in-situ measurements of 22 Pseudomonas aeruginosa PAO1 biofilm thickness and strength on flat sheet polyethersulfone membranes. The measurements are the first to be successfully conducted in a membrane cross-23 24 flow filtration system under constant permeation. In addition, FDG was used to demonstrate 25 the removal behaviour of biofilms through local biofilm strength and removal energy estimation, which other conventional measurements such as flux and TMP cannot provide. The 26 27 findings suggest that FDG can provide valuable additional information related to biofilm 28 properties that have not been measured by other monitoring methods.

29

30 Keywords: Fluid dynamic gauging (FDG), biofilm strength, biofilm thickness, membrane31 biofouling

32 Introduction

33 Biofouling in membrane processes is a long-standing problem and biofilm development on 34 and/or within membrane surfaces can cause lower product water quality, increased energy requirement and higher overall costs. Although biofouling predominantly occurs in high 35 36 pressure systems such as reverse osmosis (RO) and nanofiltration (NF) (Baker and Dudley 37 1998, Flemming et al. 1997), this problem may also affect other membrane systems including 38 low pressure microfiltration (MF) and ultrafiltration (UF) (Pontié et al. 2007), membrane 39 bioreactors (MBR) (Le-Clech et al. 2006), and other novel membrane systems (eg membrane 40 distillation, pressure retarded osmosis, etc.) (Bar-Zeev et al. 2015, Goh et al. 2013).

41 It has been understood that complete elimination of biofouling is almost impossible (Flemming 42 et al. 1997). Current pretreatment technologies mainly focus on the reduction of 43 microorganisms in the source water, which may not provide effective biofouling control since 44 biofilm development relies heavily on the availability of biodegradable nutrients (Chen et al. 45 2013, Jamaly et al. 2014, Nguyen et al. 2012). Despite the effort to lower biocide usage, it is 46 currently still the most commonly used method for membrane cleaning. While biocide does 47 kill bacteria, the dead cells are not totally removed but instead become a nutrient source for 48 surviving bacteria (Murthy and Venkatesan 2009). Therefore, a reliable monitoring method 49 which provides insights to biofilm removal under stress conditions is crucial for the 50 development of effective membrane cleaning protocols (Nguyen et al. 2012).

51 Traditionally, flux decline or transmembrane pressure (TMP) rise have been used to determine 52 and infer the occurrence and extent of membrane fouling because they can be measured readily 53 in the laboratory and industrial settings. However, these two parameters, though intuitive, are 54 indirect indicators of the properties of the fouling layer, which may not provide information 55 regarding the actual condition of membrane foulant thus causing ineffective membrane 56 cleaning. Moreover, flux and TMP are normally time, spatial or volume averaged 57 measurements. Therefore, direct and local information of the deposition and removal behavior 58 of foulant, by measuring the thickness and strength of the foulant, can assist the optimization 59 of the cleaning regimes, operating protocols and module design of membrane systems (Chavez et al. 2016). Most existing on-line monitoring techniques including (i) microscopic (confocal 60 61 laser scanning microscopy) (Mukherjee et al. 2016), (ii) spectroscopic [infrared, nuclear magnetic resonance spectroscopy (NMR) and Raman] (Graf von der Schulenburg et al. 2008, 62 63 Kögler et al. 2016), (iii) ultrasonic time-domain reflectometry (UTDR) (Sim et al. 2013), and 64 (iv) optical coherence tomography (OCT) (Chew et al. 2004b, Linares et al. 2016a), mostly 65 focus on the detection of foulant thickness or flow distribution and are unable to provide 66 information on foulant strength or attachment behaviour which could be the relevant parameter 67 for membrane fouling. Atomic force microscopy (AFM) is probably the only technique that 68 allows the measurement of the physical adhesive forces of foulants to surfaces in-situ, which 69 may include bacteria and biofilm adhesion to membrane surfaces (Powell et al. 2017). In 70 addition, it is especially challenging to obtain reliable measurements in flow systems 71 commonly found in membrane operations.

72 Fluid dynamic gauging (FDG) is a relatively simple technique which was initially developed 73 to measure the thickness of deposits on solid surfaces in situ and on-line (Tuladhar et al. 2000). 74 It has been employed to investigate foulant thickness formed on heated surfaces such as heat-75 exchangers used primarily in food processing, polymer manufacturing and crude oil industries 76 (Gu et al. 2009, Peck et al. 2015, Tuladhar et al. 2002). The FDG technique can measure (in a 77 destructive mode) local strength properties throughout the different layers of deposits (Chew 78 et al. 2004a). The ability of the FDG to be operated at elevated temperature and pressure (Ali 79 et al. 2013) has gained some interest for use in membrane filtration scenarios, where permeation is involved (Chew et al. 2007, Jones et al. 2010, Lewis et al. 2016). However, these studies 80

81 were mainly performed using synthetic organics to simulate constant TMP filtration in food 82 industries. Here, FDG is applied to membrane processes to simulate water and wastewater 83 treatment operations under constant permeation.

The objective of this study was to investigate the feasibility of FDG technique for on-line membrane biofouling detection by measuring both biofilm thickness and strength. This study is the first attempt to apply FDG to measure biofilm thickness and strength in a membrane cross-flow filtration system under constant permeation. This study also explored the impact of biofilm desiccation which could happen due to flow disturbances or during cleaning (transition from feed to cleaning formulations).

90 Experimental

91 Biofouling experimental protocol

92 The experimental set-up and protocols used for simulating biofouling in cross-flow filtration 93 were adapted from previous work (Figure 1A) (Sim et al. 2013). A rectangular flat-sheet cross-94 flow cell that had a membrane area of 0.0126 m² (180 mm \times 70 mm) and a channel height of 95 2.0 mm was used. Before installation, the low protein binding polyethersulfone (PES) flat sheet 96 membrane (PALL, 10K OMEGATM, MWCO 10 kDa) was cut and soaked in deionised water 97 (Milli-O, Merck-Millipore) for 24 h. The feed water contained background salinity of 500 mg L⁻¹ NaCl (Merck) and 20 mg L⁻¹ nutrient broth (Difco NB, BD Diagnostics) which provided 98 total organic carbon (TOC) of approximately 8 mg L⁻¹, similar to typical TOC in secondary 99 100 effluent water. Feed water was circulated via a gear pump (Cole-Palmer, Model 74013-45) in 101 a closed loop as shown in Figure 1A. Wild type *Pseudomonas aeruginosa* PAO1, a common 102 representative of wastewater bacteria, was chosen as model bacterium in this study (Hentzer et 103 al. 2002, Kim et al. 2015, O'Toole and Kolter 1998). A stock solution of PAO1 (cell counts ~10⁶ CFU mL⁻¹) was injected at a constant rate of 0.25 mL min⁻¹ via an injection pump 104

(ELDEX, model 5979-OptosPump 2HM). The preparation of bacteria stock solution can be
found elsewhere (Suwarno et al. 2012). The temperature of the feed was kept at 25°C by using
a continuous flow chiller (PolyScience 9706A, USA). A microfilter (0.2 µm pore size, Karei
Filtration) was installed at the retentate line to prevent bacteria from entering the feed tank.
Additionally, the feed solution was replenished within every 24 h to further ensure a controlled
feed condition throughout the whole experiment duration.

In this study biofouling experiments were conducted at constant feed pressure (P1) (80 kPa) and cross-flow (0.95 cm s⁻¹) and flux (10 LMH) for durations of 2, 4, and 6 days in duplicates.
FDG analysis was conducted on-line (under same operating conditions) at the end of every biofouling experiment. The experiments are identified as 2-day, 4-day and 6-day, respectively.

Apart from the biofouling experiment at varying durations, an additional experiment was conducted by performing a 2-day biofouling experiment under the same operating conditions, followed by 24-h desiccation under no cross-flow and no nutrient supply, followed by a 2-day biofouling experiment. This experiment was aimed at investigating the impact of flow cessation due to possible process interruption in a large-scale process. The above experiment is identified as 4*-day.

121 FDG System

122 The schematic of the FDG system and experimental set-up is depicted in Figure 1B. The FDG 123 system was comprised of a stepper motor, linear slide with mount to provide vertical 124 movements, linear stainless steel FDG gauge, pressure transducer, and a motorized syringe 125 pump for a controlled suction speed. A desktop computer was connected with the stepper motor 126 and pressure transducer to record the gauge position and differential pressure (ΔP). The stepper 127 motor movement was controlled by a constant current drive (Nanotec, SMC42) in a 128 programmable circuit board (Arduino, ATmega2560). This circuit board also read voltage from the linear potentiometer which provided an independent measurement of the position of the gauge. A signal converter (RS Components, Solartron OD5) was used to transform the linear variable differential transformer (LVDT) output into a steady ± 10 V reading. A precision data acquisition (DAQ) device (National Instruments, NI USB-6210) read both the LVDT and pressure transducer signals. The programmable circuit board and DAQ device were configured using LabVIEWTM visual interface (VI) to perform control and data-logging activities.

135 The inset in Figure 1B shows the operation of FDG. The FDG gauge was constructed from a 136 stainless steel tube of a diameter (d) of 2.0 mm, connected to a tapered (45°) end with internal 137 nozzle diameter of d_t (0.5 mm). FDG is based in the principles of fluid dynamics to determine 138 the foulant thickness by reading the pressure difference ΔP (Lewis et al. 2016). A dimensionless 139 characteristic height $-h/d_t$, is uniquely correlated to ΔP in a calibration plot of ΔP vs. h/d_t , such 140 that the foulant thickness, δ , can be determined (Figure 2A). Principally, with a constant suction mass flow rate ($m_g = 0.2 \text{ g s}^{-1}$) controlled by the syringe pump, as the FDG gauge approaches 141 the biofilm surface (ie decreasing h/d_t), ΔP shall firstly be stable and then gradually increase, 142 143 thus a curve (ΔP vs. h/d_t) to indicate the position of biofilm surface could be generated. In non-144 invasive mode, the biofilm is not disturbed by the suction flows as the FDG gauge approaches the surface. Comparison of the biofilm surface and membrane surface curves in Figure 2A 145 146 allow biofilm thickness to be estimated (detailed calculation is described in Supporting 147 Information section 1-2).

In destructive mode, however, as the gauge approaches the biofilm surface, the suction flow shall eventually cause removal of biofilm in the region directly underneath the gauge (Figure 2B).The gauge clearance from surface (h, as in Figure 1B) when removal of biofilm layer occurs is recorded to estimate the strength (cohesive strength or adhesive strength) of biofilms. The thickness of biofilm was estimated by comparing the biofilm surface and membrane surface curves (Figure 2A), and strength of biofilm was calculated by

154
$$\tau_{w,\max} = \frac{3\mu m_g}{\rho_I \pi \hbar^2 r}$$
(1)

155 where μ is viscosity of water, m_g is the suction mass flow rate by syringe pump, ρ_L is density 156 of water, h is the clearance from surface when removal of biofilm layer occurs as indicated in 157 Figure 2A and r is $d_t/2$ (Chew et al. 2004a, Lewis et al. 2012). After destructive testing, the 158 energy required to remove the biofilm layers was also estimated (detailed calculation is 159 described in Supporting Information section 3). The fouled membrane was then carefully 160 removed from the test apparatus and immediately analysed using a confocal laser scanning 161 microscope (Figure 2B). Biofilm samples were maintained moist and stored in covered 162 containers during storage and transport to ensure minimum deformation and contamination.

163 Confocal Microscopy

164 The thickness of biofilm formed on the membrane surface was also measured by observing the 165 fouled membrane via a confocal laser scanning microscope (CLSM, Zeiss, model LSM810). 166 Biofilm thickness measured by the CLSM and FDG were analysed statistically using the 167 Pearson's correlation analysis. Biofilms were prepared by staining with SYTO9 nucleic acid 168 fluorescent stain (Molecular Probes, S34854) in accordance with manufacturer's specifications. 169 Working solutions were prepared by mixing 1.5 μ L SYTO9 in 10 mL phosphate buffered saline 170 (PBS) solution.

The flow cell was initially dismantled by removing the top-plate, followed by carefully collecting the membrane samples by holding the two corners of the membranes with sterilized forceps. Centre sections of the membrane samples (1.5 cm x 2.0 cm) were slowly cut and separated from the rest of the membrane areas for CLSM analysis. CLSM samples were then soaked in working solutions and incubated for 30 min in the dark at room temperature. After the incubation the membrane samples were rinsed three times with sterile PBS before placing on the glass slide. Each experimental variable (at different durations) was repeated in duplicate

- and five replicates of CLSM three-dimensional (3D) images were constructed by stacking 2D
- 179 images of the biofilm at different thickness (Z-Stack mode).

180 **Results and Discussion**

181 Determination of Biofilm thickness by FDG

Biofouling experiments were conducted at durations of 2, 4, and 6 days, and FDG analysis was 182 183 conducted at the end of every experiment. Typical biofilm and membrane surface curves from 184 FDG measurements are shown in Figure 2A which provides information of both biofilm 185 strength and thickness. The biofilm strength can be separated into cohesive and adhesive 186 strength. Cohesive strength is considered as the strength required to deform layers within the 187 biofilm, while the adhesive strength is the removal strength required to detach biofilms from the membrane surface (FDG thickness = 0) (Peck et al. 2015). Biofilm thickness in this study 188 189 was measured by comparing the distance between before and after the FDG destructive mode 190 (i.e., cleaned membrane). The rationale behind this method is that the membrane reference 191 point was constantly changed and calibrated due to membrane compaction and possible 192 changes in hydrodynamic conditions caused by fouling. This method differed from previously 193 published literature in which the thickness was measured by taking a reference point at clean 194 condition before fouling (Chew et al. 2004b, Lewis et al. 2016, Peck et al. 2015).

The TMP rise (measured by the difference between P1 and P2 in Figure 1A), thickness measured by FDG, and thickness measured by CLSM from different experimental durations are summarized in Table 1. In general the results showed greater TMP rise and thickness associated with more biofilm on the membrane surfaces at longer durations. This is consistent with data reported in literature (Chen et al. 2013, Sim et al. 2013). Pearson correlation analysis was conducted between FDG thickness and confocal thickness. The Pearson correlation coefficient and significant correlation were 0.9733 and 0.0267 (< 0.05), respectively. The close 202 correlation between FDG thickness and confocal thickness shows that biofilm thickness can be203 reliably determined by FDG.

Duration, d	TMP Rise, kPa	FDG Thickness, μm	Confocal Thickness, µm
2	7.7 (± 1.8)	19.4 (± 0.5)	18.0 (± 2.5)
4	11.0 (± 0.9)	27.9 (± 0.8)	28.0 (± 2.0)
6	13.9 (± 0.2)	43.1 (± 0.5)	45.0 (± 3.0)
4*	12.3 (± 0.4)	23.3 (± 2.3)	28.0 (± 3.0)

Table 1. TMP rise and thickness of biofilm at different experiment durations.

*) Special treated biofilm (4 days intermittent run).

204

205 Determination of biofilm strength by FDG and impact of biofilm desiccation

The results for destructive strength testing at each time point are shown in Figure 3, in which 206 207 the biofilm thickness is plotted against the applied gauging shear stress (eq. 1) (Lewis et al. 208 2016). The scatter in the data points, especially for 4- and 6-day, reflect the dynamic nature of 209 the biofilm growth. The yield stress, characterised as that above which significant erosion of the biofilm (due to suction flow from gauge), for biofilms developed over 2, 4 and 6 days were 210 estimated at 1165, 1600, and 1660 N m⁻², respectively (indicated by the vertical dotted lines on 211 Figure 3). These values were estimated from the average initial FDG strengths from duplicate 212 213 experiments. The dashed lines, obtained from the yield stress and the average adhesive 214 strengths, were drawn on the figure for each experiment duration to aid visualization. A general 215 negative trend was observed in all these results, showing that the layers closer to the membrane 216 surface were harder to remove than those at the top of the biofilm (ie the cohesive strength 217 increases as the biofilm gets thinner). The increased strength of the biofilm layers closer to the 218 membrane could be caused by the permeate flux through the membrane and/or the increase in EPS concentration. It has been reported that permeate flux is a dominant factor in the 219

accumulation and compaction of EPS matrix within the biofilm which may further affect the hydraulic resistance on membrane surfaces. The drag force caused by the permeate flux may also lead to an increased number of binding points between EPS molecules, and thus, greater cohesive and adhesive strengths (Dreszer et al. 2013).

It is clear from Figure 3 that the adhesion increased with the duration of biofouling experiments. However, for 4- and 6-day experiments, the increase in adhesive strength was marginal. One possible explanation could be reduced transfer of fresh nutrient to the bottom layers due to less diffusion through the denser EPS layers (Oubekka et al. 2012). Hence, strengthening of the layers closer to the membrane was marginal.

Another interesting observation was the degree of variation of biofilm strength at a particular thickness at different experiment durations ie the gradient of the thickness versus strength curve (Figure 3). There was an apparent increase of cohesive and adhesive strengths from the 2-day biofilm to those of 4-day which resulted in a larger gradient, ie, $-8.8 \times 10^{-3} \mu m Pa^{-1}$ (2-day) vs. $-5.6 \times 10^{-3} \mu m Pa^{-1}$ (4-day). However, the 6-day biofilm showed a slight increase in strength with thickness ie $-8.6 \times 10^{-3} \mu m Pa^{-1}$ compared to that of 4-day.

Figure 4 shows that the average cohesive (more details provided in Supporting Information section 3) and adhesive strengths for 2-day biofilms were lower than those for 4-day and 6-day. This behaviour suggested that the biofilm developed its strength dramatically between 2 and 4 days. However, the increase in average cohesive and adhesive strengths from 4 days to 6 days was marginal. The results in Figure 4 may further support the findings in Figure 3 which show slower increase in biofilm strength with thickness at the 6-day duration.

Nevertheless, with the increasing thickness, the required removal energy was greater at longer
durations (see Figure 5). There was a good correlation between the removal energy (from FDG)
and the required energy to overcome fouling (as shown by the TMP rise). While the increasing

removal energy with longer duration and biofilm thickness is not counter-intuitive, this information may be required in the consideration for membrane cleaning protocol, in contrast to the traditional parameters of TMP rise or permeate quality.

It should be noted that the information of biofilm strength and biofilm removal energy proposed in this study is not intended to be used independently for the consideration of membrane cleaning. Instead, this additional biofilm characteristic may be used in conjunction with the information of production energy (ie TMP) to provide the overall comparison between (1) continuing production with presence of fouling, or (2) performing cleaning.

252 Both cohesive and adhesive strengths obtained from biofilms in the present study are 253 considerably higher than those of other FDG studies (Lewis et al. 2012, Mohle et al. 2007). 254 Mohle et. al (2007) used FDG to investigate the activated sludge forming biofilm grown on a 255 rotating disc biofilm reactor (rotation speed of less than 9 min⁻¹ for 7 days) and found the cohesive strength of the biofilm was only 6-7 N m⁻². Lewis et. al (2012) applied a cross-flow 256 257 system and formed biofilm by yeast suspension. Their experiment was conducted for 30 min with a duct flow rate of 0.9 L min⁻¹ under constant TMP of 3.5 kPa. The highest strength of 258 biofilm was around 55 N m⁻². In the present study, the operating conditions applied were 259 260 harsher and simulated the actual conditions of microfiltration for water treatment. Moreover 261 biofilms formed by *Pseudomonas aeruginosa* tend to have higher strength as evidenced by 262 other ex-situ methods (6,000-15,000 N m⁻²) (Korstgens et al. 2001, Poppele and Hozalski 2003).

263 Comparison of 4*-day with 4-day tests shows that biofilm desiccation did not significantly 264 impact the overall TMP and thickness (see Table 1). There was around 8% increase of TMP 265 and 8% decrease of FDG thickness, and the CLSM measurement did not show any thickness 266 change. Interestingly, the strength observation by the FDG showed significant increase in both 267 adhesive and cohesive strength of around 101.5% and 85.6% respectively (see Figure 4). The 268 apparent changes of biofilm condition were also shown by the slope strength at different 269 biofilm layers (Figure 6). Therefore, although the thickness and TMP rise were similar between 270 4-day and 4*-day, the latter showed significant increase of biofilm strength and resulted in an 271 increase of required removal energy (see Figure 5). An interruption to a biofilm development 272 process may cause undesired impact (eg accelerated attachment process) which affect biofilm 273 growth (Murthy and Venkatesan 2009, Timoner et al. 2012) and it is possible that desiccated 274 biofilm may produce an additional evaporation barrier and denser EPS, which may result in a 275 stronger biofilm (Flemming et al. 2016). These results may indicate that the FDG strength 276 analysis was able to provide additional information related to biofilm structural properties 277 which could not be reflected by TMP rise and biofilm thickness.

278 FDG as an aid for biofouling detection and cleaning in membrane systems

There have been previous studies related to biofilm properties and biofouling. In general, these studies can be grouped into three main areas: biofilm surface characteristics, biofilm structure and thickness, and biofilm adhesion to surface (see Table 2). Apart from these studies, there have also been some interests on the impact of biofilm development toward flow channel constriction and localized channeling (Graf von der Schulenburg et al. 2008).

In this study, the FDG technique provided unique additional information related to biofilm strength for both biofilm-biofilm (cohesive) and biofilm-surface (adhesive) through an on-line and simple method. This information is unique and can be correlated to the requirements of foulant removal energy due to biofilm development on membrane surfaces. This study also presented comparisons between the energy for maintaining permeate production rate and the required energy for foulant removal (see Figure 5).

Biofouling is still a major fouling problem in membrane operations and the most commonindicator for exercising the cleaning-in-place is pressure drop (TMP). FDG showed different

- 292 levels of cohesive and adhesive strength, while the TMP and thickness did not show significant
- 293 differences. The results in this study may provide an avenue for more developments on the use
- of FDG in future studies related to membrane biofouling. Several areas that can be considered
- 295 for future research include impact of different operating conditions and validation of the FDG
- strength information in a large-scale plant.

Table 2. Biofilm characteristic studies in literature.

Biofilm properties	Detailed characteristics	Literature	Note
	Hydrophobicity	(van Oss 1997)	Surface energy measurements using contact angle technique.
Surface characteristics	Surface charge	(He et al. 2015, Ikuma et al. 2014)	Surface zeta-potential measurements of biofilm coated or EPS surfaces.
	Viscoelastic	(Ferrando et al. 2017, Kundukad et al. 2016)	Surface viscoelastic determination including modulus and biofilm viscosity.
	Porosity	(Chew et al. 2014, Goh et al. 2013)	Biofilm porosity distribution determination.
Biofilm structure	Rheological	(Körstgens et al. 2001, Linares et al. 2016b)	Compressibility of biofilm, including impact of membrane permeations.
	Thickness	(Linares et al. 2016a, Mukherjee et al. 2016, Sim et al. 2013)	Most techniques are able to provide accurate thickness prediction of biofilm both on-line and off-line.
Adhesion	Surface adhesion	(Habimana et al. 2014, Huang et al. 2015, Suwarno et al. 2016)	Most studies focus on bacterial attachment to surfaces including impact of initial conditioning layers.
Autosofi	Cohesive strength	(Mohle et al. 2007)	Measurement of cohesive strength through an offline FDG method.

300 Acknowledgements

The authors were grateful to the funding support from Sustainable Earth Office, Nanyang Technological University for the project "Application of fluid dynamic gauge for fouling control in membrane bioreactor". Singapore Membrane Technology Centre and Advanced Environmental Biotechnology Centre of Nanyang Environment and Water Research Institute are supported by the Economic Development Board of Singapore. The researcher link funding provided by the University of Bath is also gratefully acknowledged.

307 References

- 308 Ali A, Chapman GJ, Chew YMJ, Gu T, Paterson WR, Wilson DI. 2013. A fluid dynamic
- 309 gauging device for measuring fouling deposit thickness in opaque liquids at elevated
 310 temperature and pressure. Exp Therm Fluid Sci. 48:19-28.
- Baker JS, Dudley LY. 1998. Biofouling in membrane systems a review. Desalination.
 118:81-90.
- 313 Bar-Zeev E, Perreault F, Straub AP, Elimelech M. 2015. Impaired performance of pressure-
- retarded osmosis due to irreversible biofouling. Environ Sci Technol. 49:13050-13058.
- 315 Chavez DLF, Nejidat A, Herzberg M. 2016. Viscoelastic properties of extracellular
- polymeric substances can strongly affect their washing efficiency from reverse osmosis
 membranes. Environ Sci Technol. 50:9206-9213.
- 318 Chen X, Suwarno SR, Chong TH, McDougald D, Kjelleberg S, Cohen Y, Fane AG, Rice SA.
- 319 2013. Dynamics of biofilm formation under different nutrient levels and the effect on
- biofouling of a reverse osmosis membrane system. Biofouling. 29:319-330.
- 321 Chew JW, Krantz WB, Fane AG. 2014. Effect of a macromolecular- or bio-fouling layer on
 322 membrane distillation. J Membr Sci. 456:66-76.
- 323 Chew JYM, Cardoso SSS, Paterson WR, Wilson DI. 2004a. CFD studies of dynamic
- 324 gauging. Chem Eng Sci. 59:3381-3398.

- Chew JYM, Cardoso SSS, Paterson WR, Wilson DI. 2004b. Fluid dynamic gauging for
 measuring the strength of soft deposits. J Food Eng. 65:175-187.
- 327 Chew YMJ, Paterson WR, Wilson DI. 2007. Fluid dynamic gauging: A new tool to study
 328 deposition on porous surfaces. J Membr Sci. 296:29-41.
- 329 Dreszer C, Vrouwenvelder JS, Paulitsch-Fuchs AH, Zwijnenburg A, Kruithof JC, Flemming
- HC. 2013. Hydraulic resistance of biofilms. J Membr Sci. 429:436-447.
- 331 Ferrando D, Ziemba C, Herzberg M. 2017. Revisiting interrelated effects of extracellular
- 332 polysaccharides during biofouling of reverse osmosis membranes: Viscoelastic
- properties and biofilm enhanced osmotic pressure. J Membr Sci. 523:394-401.
- 334 Flemming HC, Schaule G, Griebe T, Schmitt J, Tamachkiarowa A. 1997. Biofouling The
- Achilles heel of membrane processes. Desalination. 113:215-225.
- 336 Flemming HC, Wingender J, Szewzyk U, Steinberg P, Rice SA, Kjelleberg S. 2016.
- Biofilms: An emergent form of bacterial life. Nat Rev Microbiol. 14:563-575.
- 338 Goh S, Zhang Q, Zhang J, McDougald D, Krantz WB, Liu Y, Fane AG. 2013. Impact of a
- biofouling layer on the vapor pressure driving force and performance of a membrane
- distillation process. J Membr Sci. 438:140-152.
- 341 Graf von der Schulenburg DA, Vrouwenvelder JS, Creber SA, van Loosdrecht MCM, Johns
- ML. 2008. Nuclear magnetic resonance microscopy studies of membrane biofouling. J
 Membr Sci. 323:37-44.
- Gu T, Chew YMJ, Paterson WR, Wilson DI. 2009. Experimental and CFD studies of fluid
 dynamic gauging in annular flows. AIChE J. 55:1937-1947.
- 346 Habimana O, Semião AJC, Casey E. 2014. The role of cell-surface interactions in bacterial
- 347 initial adhesion and consequent biofilm formation on nanofiltration/reverse osmosis
- 348 membranes. J Membr Sci. 454:82-96.

349	He JZ, Li CC, Wang DJ, Zhou DM. 2015. Biofilms and extracellular polymeric substances
350	mediate the transport of graphene oxide nanoparticles in saturated porous media. J
351	Hazard Mater. 300:467-474.

352 Hentzer M, Riedel K, Rasmussen TB, Heydorn A, Andersen JB, Parsek MR, Rice SA, Eberl

L, Molin S, Høiby N, et al. 2002. Inhibition of quorum sensing in *Pseudomonas*

aeruginosa biofilm bacteria by a halogenated furanone compound. Microbiology.

355 148:87-102.

Huang Q, Wu H, Cai P, Fein JB, Chen W. 2015. Atomic force microscopy measurements of

bacterial adhesion and biofilm formation onto clay-sized particles. Sci Rep. 5:1-12.

358 Ikuma K, Madden AS, Decho AW, Lau BLT. 2014. Deposition of nanoparticles onto

359 polysaccharide-coated surfaces: implications for nanoparticle-biofilm interactions.

360 Environ Sci Nano. 1:117-122.

Jamaly S, Darwish NN, Ahmed I, Hasan SW. 2014. A short review on reverse osmosis
pretreatment technologies. Desalination. 354:30-38.

363 Jones SA, Chew YMJ, Bird MR, Wilson DI. 2010. The application of fluid dynamic gauging

in the investigation of synthetic membrane fouling phenomena. Food Bioprod Process.88:409-418.

366 Kögler M, Zhang B, Cui L, Shi Y, Yliperttula M, Laaksonen T, Viitala T, Zhang K. 2016.

367 Real-time Raman based approach for identification of biofouling. Sens Actuators, B.
368 230:411-421.

369 Körstgens V, Flemming HC, Wingender J, Borchard W. 2001. Uniaxial compression

370 measurement device for investigation of the mechanical stability of biofilms. J Microbiol

371 Methods. 46:9-17.

- 372 Kim LH, Shin MS, Kim SJ, Kim CM, Chae KJ, Kim IS. 2015. Potential effects of damaged
- 373 *Pseudomonas aeruginosa* PAO1 cells on development of reverse osmosis membrane
 374 biofouling. J Membr Sci. 477:86-92.
- 375 Korstgens V, Flemming HC, Wingender J, Borchard W. 2001. Influence of calcium ions on
- the mechanical properties of a model biofilm of mucoid *Pseudomonas aeruginosa*. Water
 Sci Technol. 43:49-57.
- Kundukad B, Seviour T, Liang Y, Rice SA, Kjelleberg S, Doyle PS. 2016. Mechanical
 properties of the superficial biofilm layer determine the architecture of biofilms. Soft
- 380 Matter. 12:5718-5726.
- Le-Clech P, Chen V, Fane TAG. 2006. Fouling in membrane bioreactors used in wastewater
 treatment. J Membr Sci. 284:17-53.
- Lewis WJT, Agg A, Clarke A, Mattsson T, Chew YMJ, Bird MR. 2016. Development of an
 automated, advanced fluid dynamic gauge for cake fouling studies in cross-flow
 filtrations. Sens Actuators, A. 238:282-296.
- 386 Lewis WJT, Chew YMJ, Bird MR. 2012. The application of fluid dynamic gauging in
- 387 characterising cake deposition during the cross-flow microfiltration of a yeast
- 388 suspension. J Membr Sci. 405:113-122.
- 389 Linares RV, Fortunato L, Farhat NM, Bucs SS, Staal M, Fridjonsson EO, Johns ML,
- 390 Vrouwenvelder JS, Leiknes T. 2016a. Mini-review: novel non-destructive in situ biofilm
- 391 characterization techniques in membrane systems. Desalin Water Treat. 57:22894-22901.
- 392 Linares RV, Wexler AD, Bucs SS, Dreszer C, Zwijnenburg A, Flemming HC, Kruithof JC,
- 393 Vrouwenvelder JS. 2016b. Compaction and relaxation of biofilms. Desalin Water Treat.
 394 57:12902-12914.
- 395 Mohle RB, Langemann T, Haesner M, Augustin W, Scholl S, Neu TR, Hempel DC, Horn H.
- 396 2007. Structure and shear strength of microbial biofilms as determined with confocal

- laser scanning microscopy and fluid dynamic gauging using a novel rotating disc biofilm
 reactor. Biotechnol Bioeng. 98:747-755.
- 399 Mukherjee M, Menon NV, Liu X, Kang Y, Cao B. 2016. Confocal laser scanning
- 400 microscopy-compatible microfluidic membrane flow cell as a nondestructive tool for
- 401 studying biofouling dynamics on forward osmosis membranes. Environ Sci Technol Lett.
- 402 3:303-309.
- Murthy PS, Venkatesan R. 2009. Industrial biofilms and their control. In: Marine and
 Industrial Biofouling. Berlin, Heidelberg: Springer Berlin Heidelberg. p. 65-101.
- 405 Nguyen T, Roddick FA, Fan L. 2012. Biofouling of water treatment membranes: A review of
- 406 the underlying causes, monitoring techniques and control measures. Membranes. 2:804-
- 407 840.
- 408 O'Toole GA, Kolter R. 1998. Flagellar and twitching motility are necessary for *Pseudomonas* 409 *aeruginosa* biofilm development. Mol Microbiol. 30:295-304.
- 410 Oubekka SD, Briandet R, Fontaine-Aupart MP, Steenkeste K. 2012. Correlative time-
- 411 resolved fluorescence microscopy to assess antibiotic diffusion-reaction in biofilms.
- 412 Antimicrob Agents Chemother. 56:3349-3358.
- 413 Peck OPW, Chew YMJ, Bird MR, Bolhuis A. 2015. Application of fluid dynamic gauging in
- 414 the characterization and removal of biofouling deposits. Heat Transfer Eng. 36:685-694.
- 415 Pontié M, Thekkedath A, Kecili K, Habarou H, Suty H, Croué JP. 2007. Membrane autopsy
- 416 as a sustainable management of fouling phenomena occurring in MF, UF and NF
- 417 processes. Desalination. 204:155-169.
- 418 Poppele EH, Hozalski RM. 2003. Micro-cantilever method for measuring the tensile strength
- 419 of biofilms and microbial flocs. J Microbiol Methods. 55:607-615.

- 420 Powell LC, Hilal N, Wright CJ. 2017. Atomic force microscopy study of the biofouling and
- 421 mechanical properties of virgin and industrially fouled reverse osmosis membranes.

422 Desalination. 404:313-321.

- 423 Sim STV, Suwarno SR, Chong TH, Krantz WB, Fane AG. 2013. Monitoring membrane
- 424 biofouling via ultrasonic time-domain reflectometry enhanced by silica dosing. J Membr425 Sci. 428:24-37.
- 426 Suwarno SR, Chen X, Chong TH, Puspitasari VL, McDougald D, Cohen Y, Rice SA, Fane

427 AG. 2012. The impact of flux and spacers on biofilm development on reverse osmosis
428 membranes. J Membr Sci. 405-406:219-232.

- 429 Suwarno SR, Hanada S, Chong TH, Goto S, Henmi M, Fane AG. 2016. The effect of
- 430 different surface conditioning layers on bacterial adhesion on reverse osmosis
- 431 membranes. Desalination. 387:1-13.
- 432 Timoner X, AcuÑA V, Von Schiller D, Sabater S. 2012. Functional responses of stream
- 433 biofilms to flow cessation, desiccation and rewetting. Freshw Biol. 57:1565-1578.
- 434 Tuladhar TR, Paterson WR, Macleod N, Wilson DI. 2000. Development of a novel non-
- 435 contact proximity gauge for thickness measurement of soft deposits and its application in

436 fouling studies. Can J Chem Eng. 78:935-947.

- 437 Tuladhar TR, Paterson WR, Wilson DI. 2002. Investigation of alkaline cleaning-in-place of
- 438 whey protein deposits using dynamic gauging. Food Bioprod Process. 80:199-214.
- 439 van Oss CJ. 1997. Hydrophobicity and hydrophilicity of biosurfaces. Curr Opin Colloid
- 440 Interface Sci. 2:503-512.
- 441