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*Computational fluid dynamics modeling for performance assessment of permeate gap membrane distillation*

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1       **Computational fluid dynamics modeling for performance**  
2               **assessment of permeate gap membrane distillation**

3  
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19 **Abstract**

20 The critical factors and interactions which affect the module-level performance of permeate gap  
21 membrane distillation (PGMD) were investigated. A three-dimensional computational fluid  
22 dynamics (CFD) model was developed for the PGMD configuration, and the model was validated  
23 using experimental data. The realizable k-  $\epsilon$  turbulence model was applied for the flow in the feed  
24 and coolant channels. A two-level full factorial design tool was utilized to plan additional  
25 simulation trials to examine the effects of four selected parameters (i.e., factors) on permeate flux  
26 and thermal efficiency, both of which represent performance indicators of PGMD. Permeate gap  
27 conductivity ( $k_{gap}$ ), permeate gap thickness ( $\delta_{gap}$ ), module length ( $L_{module}$ ), and membrane  
28 distillation coefficient ( $B_m$ ) were the selected factors for the analysis. The effect of each factor and  
29 their interactions were evaluated.  $B_m$  was found to be the most influential factor for both  
30 performance indicators, followed by  $k_{gap}$  and  $\delta_{gap}$ . The factorial analysis indicated that the  
31 influence of each variable depends on its interactions with other factors. The effect of  $k_{gap}$  was  
32 more significant for membranes with higher  $B_m$  because the gap resistance becomes dominant at  
33 high  $B_m$ . Similarly,  $\delta_{gap}$  is inversely proportional to the permeate flux and only significant for  
34 membranes with high  $B_m$ .

35

36 *Keywords:* permeate gap membrane distillation (PGMD); computational fluid dynamics (CFD);  
37 factorial analysis; permeate gap conductivity; permeate gap thickness.

## 38 Nomenclature

39

$A$	Active area [m <sup>2</sup> ]
$B_m$	Membrane distillation coefficient [kg/m <sup>2</sup> Pa s]
$c_p$	Heat capacity [kJ/kg K]
$\dot{V}$	Volumetric flow rate [L/min]
$g$	Gravitational constant [m/s <sup>2</sup> ]
$h_f$	Heat transfer coefficient along the feed side boundary layer [W/m <sup>2</sup> K]
$h_{fg}$	Latent heat of evaporation [kJ/kg]
$h_p$	Heat transfer coefficient in the permeate gap [W/m <sup>2</sup> K]
$J$	Permeate mass flux [kg/m <sup>2</sup> s]
$k$	Turbulent kinetic energy
$k_{gap}$	Permeate gap thermal conductivity [W/m K]
$k_{gas}$	Thermal conductivity of the gas trapped in the membrane pores [W/m K]
$k_m$	Membrane thermal conductivity [W/m K]
$k_{solid}$	Solid membrane material thermal conductivity [W/m K]
$L_{module}$	Module length [m]
$\dot{m}$	Mass flow rate [kg/s]
$P$	Pressure [Pa]
$P^{vap}$	Partial vapor pressure [Pa]
$S_h$	Energy source term [J/m <sup>3</sup> ]
$S_j$	Mass source term [kg/m <sup>3</sup> ]
$S_m$	Momentum source term [kg m/s m <sup>3</sup> ]
$T_f$	Feed stream temperature [K]
$T_p$	Permeate gap stream temperature [K]
$\dot{q}$	Heat flux [W/m <sup>2</sup> ]
$\dot{Q}_{in}$	Total heat input [W]
$u$	Fluid velocity [m/s]
$W$	Module width [mm]

40

## 41 Greek symbols

$\delta$	Thickness [m]
$\varepsilon$	Porosity [-]
$\mu$	Viscosity [Pa s]

42

## 43 Subscripts and superscripts

$ave$	Average
$BL$	Boundary layer
$c$	Cooling channel

<i>c, p</i>	Cooling plate/permeate gap interface
<i>cond</i>	Conduction
<i>f</i>	Feed channel
<i>gap</i>	Permeate gap
<i>in</i>	Inlet
<i>m</i>	Membrane
<i>m,f</i>	Membrane/feed interface
<i>m,p</i>	Membrane/permeate gap interface
<i>out</i>	Outlet
<i>p</i>	Permeate stream
<i>plate</i>	Cooling plate
<i>vap</i>	Water vapor

## 45 1. Introduction

46 Membrane distillation (MD) has the potential to become an important brine concentration  
47 technology [1,2]. In addition to the four common MD configurations (direct contact MD or  
48 DCMD; vacuum MD or VMD; sweeping gap MD or SGMD; and air gap MD or AGMD),  
49 permeate gap MD (PGMD) has developed more recently [3–7]. PGMD, which is also called water  
50 gap MD or liquid gap MD in literature, is a hybrid of the DCMD and AGMD configurations [8–  
51 11]. An additional channel (the permeate gap) separates the permeate stream from the cooling  
52 stream with an impermeable condensing plate. Other versions of PGMD have been studied,  
53 including material gap MD (e.g., with sand in the gap) and conductive gap MD (with a thermally-  
54 conductive material in the gap, which provides high energy efficiency and permeate flux [4]).

55 Since conductive heat loss is challenging to minimize in DCMD, DCMD has lower thermal  
56 efficiency than AGMD [12]. On the other hand, the presence of an air gap in AGMD adds an extra  
57 mass transfer resistance to vapor transport. Therefore, AGMD has lower permeate flux than  
58 DCMD. Separating the permeate stream from the cooling liquid enables the utilization of any  
59 liquid (such as the incoming feed itself) as a coolant medium in PGMD, in contrast to DCMD  
60 which requires a pure cold water stream [13]. Moreover, the mass transfer mechanism is improved  
61 in PGMD, resulting in higher permeate flux than AGMD [4]. Cipollina et al. reported that PGMD  
62 showed markedly better performance than AGMD even under mild process conditions with the  
63 smaller temperature difference between the feed and permeate streams [14]. Winter [15] studied  
64 pilot-scale AGMD, PGMD, and DCMD modules to compare the energy efficiency (which was  
65 quantified with gained output ratio or *GOR*) and the productivity (permeate flux) of these systems.  
66 It was found that the *GOR* and permeate flux values of PGMD and DCMD were within the same  
67 range. On the other hand, AGMD exhibited a markedly lower performance (in terms of lower *GOR*  
68 and permeate flux values) than the PGMD and DCMD configurations.

69 In small-scale (i.e., experimental) modules, the energy efficiency of MD is quantified by the ratio  
70 between the heat transferred due to vapor flux ( $\dot{Q}_{vap}$ ) and the total heat transferred through the  
71 membrane ( $\dot{Q}_{total}$ ) [2,7]. This ratio is called the thermal efficiency, and *GOR* is proportional to it  
72 [7]. The total heat transferred includes  $\dot{Q}_{vap}$  and heat transferred across the membrane thickness  
73 via conduction ( $\dot{Q}_{cond}$ ). If an MD module has high thermal efficiency ( $\approx 1$ ), the membrane in that  
74 module likely has a relatively low mass transfer resistance and/or a high conductive heat transfer

75 resistance under the process operating conditions [16]. Thermal efficiency not only depends on the  
76 operating parameters but also on structural parameters such as membrane properties and module  
77 geometry [17].

78 Since the permeate gap is responsible for most of the heat transfer resistance in PGMD, gap  
79 properties, such as gap conductivity ( $k_{gap}$ ) and gap thickness ( $\delta_{gap}$ ), are considered important  
80 factors affecting the PGMD efficiency [6]. The membrane itself is also a dominant resistance  
81 within the MD module. The membrane properties, such as its MD coefficient ( $B_m$ ), are believed to  
82 have a lower impact on the PGMD performance than that of AGMD [6]. Swaminathan et al.  
83 investigated PGMD performance using a numerical model based on counter-flow heat exchanger  
84 theory (number of transfer units method) [6]. The effect of  $\delta_{gap}$  was found inversely proportional  
85 to the  $GOR$  [6], which was supported by the experimental data from [15]. Similarly, Eykens et al.  
86 reported a flux decline while increasing  $\delta_{gap}$  from 0 to 2 mm [8]. In contrast, the opposite trend  
87 was reported by [10], where significant flux enhancement was observed when increasing  $\delta_{gap}$  from  
88 9 to 13 mm. In another study, a one-dimensional numerical model was developed to explore the  
89 critical parameters for the energy efficiency of PGMD and conductive gap MD [4]. The study  
90 reported that increasing  $\delta_{gap}$  and  $k_{gap}$  have both enhanced the  $GOR$ , although increasing  $k_{gap}$  above  
91 10 W/m K did not have a significant effect [4]. Cheng et al. reported that a PGMD setup with a  
92 brass net, which had a  $k_{gap}$  over 100 W/m·K (instead of polypropylene net with  $k_{gap} = 0.17$  W/m·K),  
93 did not improve the PGMD performance markedly [5]. In large-scale PGMD and DCMD modules,  
94 the modules with longer feed channels have better energy efficiency but permeate flux decline is  
95 observed as well [18,19].

96 Process operating parameters also influence the MD process performance. Ruiz-Aguirre et al.  
97 applied the factorial design tool for a pilot-scale spiral wound PGMD configuration to assess the  
98 effects of feed and coolant inlet temperatures, feed flow rate and their interactions on the PGMD  
99 process performance experimentally [20]. They concluded that feed inlet temperature has a  
100 substantial influence on both permeate flux and specific thermal energy consumption.  
101 Furthermore, the interaction between the feed inlet temperature and feed flow rate was found to  
102 be significant for permeate flux. Recently, a modeling study on PGMD module performance was  
103 published, which studied the effects of feed flow rate and temperature on process performance  
104 [21]. However, although the effects of operating parameters on PGMD performance were

105 discussed in [21] and others in the literature, no modeling studies have reported on the effects of  
106 interactions between module and membrane properties (includes effects of  $k_{gap}$ ,  $\delta_{gap}$ ,  $B_m$ , module  
107 length ( $L_{module}$ ) and their interactions) on PGMD performance.

108 Computational fluid dynamics (CFD) was demonstrated as a useful tool to investigate the  
109 parameters influencing the MD process performance [22,23]. Several two-dimensional and three-  
110 dimensional CFD studies were employed to design improved MD processes and propose solutions  
111 to issues in existing configurations [23]. Thus, in the present study, a three-dimensional CFD  
112 model was first developed for a laboratory-scale PGMD configuration and was validated using  
113 experimental PGMD data. Then, additional simulation runs were designed using a two-level full  
114 factorial design tool. The factorial design tool was utilized as it helps account for all likely high  
115 and low combinations of the selected factors in the runs and provides information about the effects  
116 of factors and their interactions on the output [24,25]. The parameters  $k_{gap}$ ,  $\delta_{gap}$ ,  $B_m$ , and  $L_{module}$   
117 were the selected factors in our study. Permeate flux and thermal efficiency, which are critical MD  
118 performance indicators, were obtained from the CFD simulations. Finally, the effects of the four  
119 factors and their interactions were evaluated based on the obtained results.

120

## 121 **2. Theory**

### 122 **2.1 Heat and mass transfer in PGMD**

123 In the PGMD configuration (Fig. 1), a hydrophobic membrane is in direct contact with the feed  
124 and permeate sides. It is assumed that the permeate gap is entirely filled with permeate liquid with  
125 permeate overflow leaving the channel from the top. The permeate gap and coolant plate introduce  
126 additional heat transfer resistances in the system (compared to DCMD), which have to be  
127 considered in the PGMD model. The vapor flow through the membrane pores is induced by the  
128 partial pressure difference between the feed and permeate sides. The total transmembrane mass  
129 flux ( $J$ , kg/m<sup>2</sup> s) can be defined as follows:

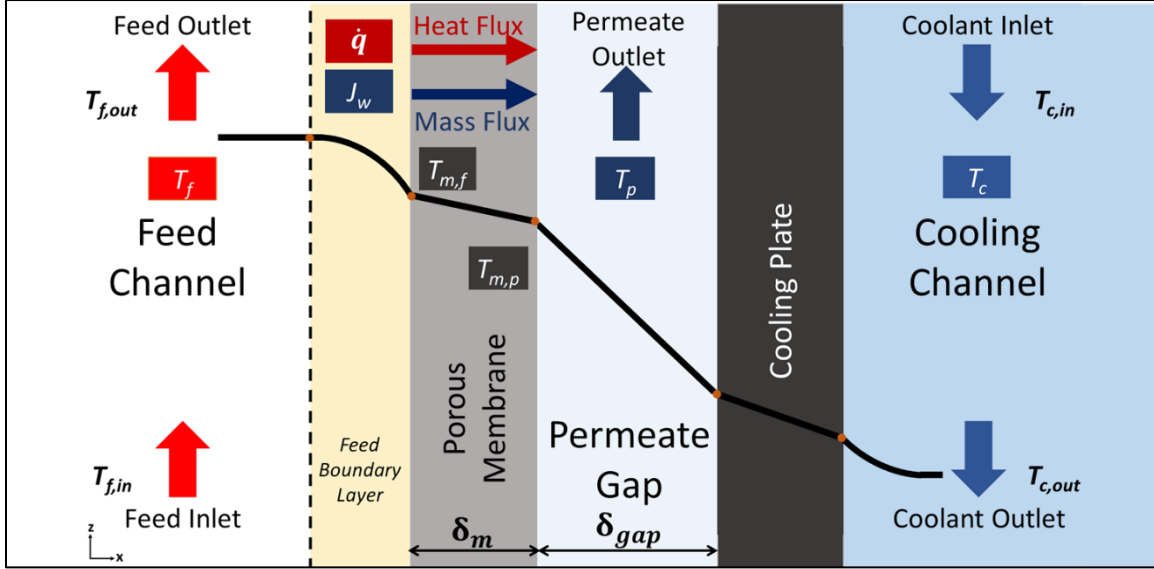
$$J = B_m \cdot (P_{m,f}^{vap} - P_{m,p}^{vap}) = B_m \Delta P^{vap} \quad (1)$$

130 where  $B_m$  is the membrane distillation coefficient (kg/m<sup>2</sup> Pa s),  $P_{m,f}^{vap}$  is the vapor pressure on the  
131 membrane/feed interface (Pa),  $P_{m,p}^{vap}$  is the vapor pressure on the membrane/permeate gap interface



132 (Pa) and  $\Delta P^{vap}$  is the partial pressure difference between the feed and permeate gap sides.  $P_{m,f}^{vap}$   
 133 and  $P_{m,p}^{vap}$  depend on the temperatures at the membrane surface on the feed ( $T_{m,f}$ ) and permeate  
 134 gap ( $T_{m,p}$ ) sides, respectively.

135



136

137 **Fig. 1.** Schematic representation of PGMD configuration in the counter-current flow mode. The  
 138 configuration includes the feed channel with the feed boundary layer, the porous hydrophobic  
 139 membrane, the permeate gap channel, the cooling plate, and the cooling channel.  $T_f$ ,  $T_p$  and  $T_c$   
 140 represent the local bulk stream temperatures along the feed, permeate gap and cooling channels,  
 141 respectively. These temperatures vary along the channels due to the heat transfer along the module.

142

143 The vapor pressure of water ( $P^{vap}$ ) can be calculated by the Antoine equation [26]:

$$P^{vap} = \exp\left(23.1964 - \frac{3816.44}{T - 46.13}\right) \quad (2)$$

144 where  $T$  is the temperature (K). Since pure water was used as the feed stream in our experiments,  
 145 vapor pressure depression was not considered in our model.

146 Mass and heat transfer occur simultaneously. The heat flux is a function of vapor flux,  $J$ . The  
 147 overall  $J$  can be calculated by integrating the local flux,  $J(y,z)$ , over the full membrane surface as  
 148 follows:

$$J = \frac{1}{A} \iint J(y, z) dy dz \quad (3)$$

$$J = \frac{B_m}{A} \iint \Delta P^{vap}(y, z) dy dz \quad (3a)$$

$$J = \frac{B_m}{A} \left[ \iint P_{m,f}^{vap}(y, z) dy dz - \iint P_{m,p}^{vap}(y, z) dy dz \right] \quad (3b)$$

149 where  $A$  is the active membrane area ( $m^2$ ) and the  $(y, z)$  coordinate represents the location on the  
150 membrane surface at the feed/membrane or permeate gap/membrane interface.

151 The heat flux ( $\dot{q}$ ) across the system components in the  $x$ -direction (Fig. 1) is the same under steady-  
152 state conditions

$$\dot{q} = \dot{q}_{BL,f} = \dot{q}_m = \dot{q}_p = \dot{q}_c \quad (4)$$

$$\dot{q}_{BL,f} = h_f (T_f - T_{m,f}) \quad (5)$$

153 where  $\dot{q}_{BL,f}$ ,  $\dot{q}_m$ ,  $\dot{q}_p$ , and  $\dot{q}_c$  are the heat fluxes through the feed side boundary layer, the membrane,  
154 the permeate gap and the cooling system, respectively.  $h_f$  is the heat transfer coefficient for the  
155 feed side boundary layer ( $W/m^2 K$ ). In this study, the heat transfer in the feed channel is evaluated  
156 using the 3D CFD model. Based on this model, the heat transfer coefficient across the feed side  
157 boundary layer can be inferred.

### 158 **Membrane side**

159 The overall heat flux through the membrane,  $\dot{q}_m$ , can be expressed as follows:

$$\dot{q}_m = \dot{q}_{vap} + \dot{q}_{cond} \quad (6)$$

160 where  $\dot{q}_{cond}$  and  $\dot{q}_{vap}$  are the conductive heat flux and the heat flux due to evaporation at the pore  
161 entrance, respectively. Since the mass and heat transfer phenomena happen simultaneously, the  
162 heat flux through the membrane thickness is a function of permeate flux,  $J$ , through the membrane.  
163 Thus,  $\dot{q}_{vap}$  can be expressed as

$$\dot{q}_{vap} = J h_{fg} \quad (7)$$

164 where  $h_{fg}$  is the latent heat of evaporation. Heat flux across the membrane thickness due to  
 165 conduction can be calculated from

$$\dot{q}_{cond} = \frac{k_m}{\delta_m} (T_{m,f} - T_{m,p}) = h_{m,cond} \Delta T \quad (8)$$

166 where  $\Delta T$  is the temperature difference between the opposing membrane sides,  $h_{m,cond}$  is the  
 167 membrane conductive heat transfer coefficient ( $\text{W/m}^2 \text{K}$ ) and  $k_m$  is the thermal conductivity of  
 168 the membrane ( $\text{W/m K}$ ), which is calculated from the simple approximation:

$$k_m = \varepsilon k_{gas} + (1 - \varepsilon) k_{solid} \quad (9)$$

169 where  $k_{gas}$  is the thermal conductivity of the gas (air and vapor) trapped within the membrane  
 170 pores ( $\text{W/m K}$ ),  $k_{solid}$  is the thermal conductivity of the solid membrane material ( $\text{W/m K}$ ), and  $\varepsilon$   
 171 is the porosity of the membrane. The gas thermal conductivity is usually far lower than the solid  
 172 membrane conductivity, so in order to minimize the conductive heat losses  $k_m$  must be as low as  
 173 possible or  $\varepsilon$  high as high as possible. By substitution in Eqn. 6,  $\dot{q}_m$  becomes:

$$\dot{q}_m = J h_{fg} + h_{m,cond} \cdot \Delta T \quad (10)$$

174

### 175 ***Permeate gap channel***

176 In the permeate gap channel, permeate liquid fills the gap completely and the permeate overflow  
 177 leaves the channel from the top. Since the liquid in the channel is almost stagnant, heat transfer  
 178 through the permeate channel is by conduction only and there is no boundary layer on the  
 179 permeate-gap side of the membrane. The heat flux through the permeate gap,  $\dot{q}_p$ , can be expressed  
 180 as:

$$\dot{q}_p = h_p (T_{m,p} - T_{c,p}) \quad (11)$$

181 where  $h_p$  is the heat transfer coefficient through the whole thickness of the permeate gap (W/m<sup>2</sup>  
 182 K) and  $T_{c,p}$  is the temperature at the permeate gap/cooling plate interface.  $h_p$  can also be expressed  
 183 as

$$h_p = \frac{k_{gap}}{\delta_{gap}} \quad (12)$$

184 where  $k_{gap}$  and  $\delta_{gap}$  are the thermal conductivity and thickness of the permeate gap, respectively.  
 185 If there is no spacer in the permeate gap channel, then  $\dot{q}_p$  is only determined by the thermal  
 186 conductivity of the fresh water ( $k_{water}$ ) in the gap ( $k_{gap} = k_{water}$ ). Increasing  $k_{gap}$  leads to better  
 187 process performance, the opposite effect of increasing  $k_m$  [7].

### 188 **Cooling system**

189 Heat is transferred from the permeate gap to the coolant liquid via a combination of thermal  
 190 resistances including those of cooling plate and the cooling channel.

$$\dot{q}_c = h_{c,total} (T_{c,p} - T_c) \quad (13)$$

$$\frac{1}{h_{c,total}} = \frac{1}{h_{plate}} + \frac{1}{h_c} \quad (14)$$

191  
 192 where  $h_{c,total}$ ,  $h_{plate}$  and  $h_c$  represent the heat transfer coefficients through the cooling system, the  
 193 heat transfer coefficient through the cooling plate ( $h_{plate} = k_{plate}/\delta_{plate}$ ), and the heat transfer  
 194 coefficient through the cooling channel, respectively.

195 Thermal efficiency ( $\eta$ ) is the fraction of energy transferred from the hot feed stream to the cold  
 196 permeate side that is actually utilized in mass transfer [17].  $\eta$  is calculated from

$$\eta = \frac{\dot{Q}_{vap}}{\dot{Q}_{vap} + \dot{Q}_{cond}} \quad (15)$$

197 where  $\dot{Q}_{vap}$  is the rate of heat transfer from the feed to the permeate due to the mass transfer (W)  
 198 and  $\dot{Q}_{cond}$  is the rate of heat transfer due to conduction through the membrane ( $\dot{Q}_{cond} = \dot{q}_{cond} A$ ).

199 When  $\eta$  is close to unity, most of the heat delivered to the MD module is consumed via the  
 200 evaporation process and conductive heat losses are negligible. Membrane properties and MD  
 201 operational parameters have a significant influence on  $\eta$  [17].

202

## 203 2.2 Governing transport equations in the CFD model

204 Since k- $\epsilon$  models have been validated and found reliable for various MD configurations (AGMD,  
 205 DCMD and VMD) [27–32], the realizable two-layer k-  $\epsilon$  model was applied to model the turbulent  
 206 flow in the feed and permeate channels. A turbulent eddy-viscosity was considered as a function  
 207 of the turbulent kinetic energy (k) and turbulent dissipation rate ( $\epsilon$ ) terms in the model [33]. This  
 208 model is one of the Reynolds-Averaged Navier-Stokes equations which approximate the  
 209 representation of the physical phenomena of turbulence. The transport equations govern the  
 210 transport of the mean flow quantities. In order to model the stress tensor, the Reynolds stress  
 211 transport models and Boussinesq approximation (which is an eddy viscosity model) were  
 212 employed. Further details can be found in [34,35].

213 The contributions of  $J$  and  $\dot{q}_{vap}$  were included in the three Reynolds-averaged conservation  
 214 equations: conservation of mass (16), conservation of momentum (17) and conservation of energy  
 215 (18).

$$\nabla \cdot (\rho \vec{v}) = S_j \quad (16)$$

$$\nabla \cdot (\rho \vec{v} \vec{v}) = -\nabla P + \nabla \cdot (\vec{\tau}) + \rho \vec{g} + S_m \quad (17)$$

$$\nabla \cdot (\rho c_p T \vec{v}) = \nabla \cdot (k \nabla T) + S_h \quad (18)$$

216 where  $S_j$ ,  $S_m$ , and  $S_h$  are mass, momentum and energy source terms, respectively, and can be  
 217 calculated from [36]

$$S_j = \begin{cases} -\frac{J A}{V} & \text{at the feed/membrane interface} \\ \frac{J A}{V} & \text{at the permeate gap/membrane interface} \end{cases} \quad (16a)$$

$$S_m = \begin{cases} -\frac{J A u}{V} & \text{at the feed/membrane interface} \\ \frac{J A u}{V} & \text{at the permeate gap/membrane interface} \end{cases} \quad (17a)$$

$$S_h = \begin{cases} -\frac{\dot{q}_{vap} A}{V} & \text{at the feed/membrane interface} \\ \frac{\dot{q}_{vap} A}{V} & \text{at the permeate gap/membrane interface} \end{cases} \quad (18a)$$

218 where  $u$  is the feed velocity (m/s) in the flow direction and  $V$  is the fluid element volume (m<sup>3</sup>).

219

### 220 **3. Methodology**

#### 221 **3.1. PGMD experimental set-up**

222 A laboratory scale PGMD setup was used for the experiments, as illustrated in Fig. 2. The  
 223 experimental setup has two flow loops for hot feed and coolant streams. Since MD in the counter-  
 224 current flow mode (in terms of coolant and feed streams) has shown better performance than the  
 225 co-current mode [4], the experiments were performed in the former mode. The system included a  
 226 flat sheet hydrophobic PVDF membrane (ISEQ00010 Millipore). The module and membrane  
 227 properties are listed in Table 1. The membrane active area was 192 cm<sup>2</sup>. An aluminum plate was  
 228 used as the cooling plate. The feed and permeate channels had inner dimensions of 16 cm × 12  
 229 cm. A plastic spacer was used in the permeate gap channel to keep the permeate gap thickness  
 230 constant. Also, an additional woven spacer mesh was placed in between the membrane and plastic  
 231 spacer to protect the membrane from any damage due to the hard edges of the plastic mesh. In the  
 232 module, the design of the feed flow channel included a flow developing region before the feed  
 233 stream entrance to achieve a fully developed feed inlet flow condition when the feed stream  
 234 reached the active membrane area. Further details of the experimental apparatus are given in [37].

235

236 **Table 1.** PGMD module and membrane properties.

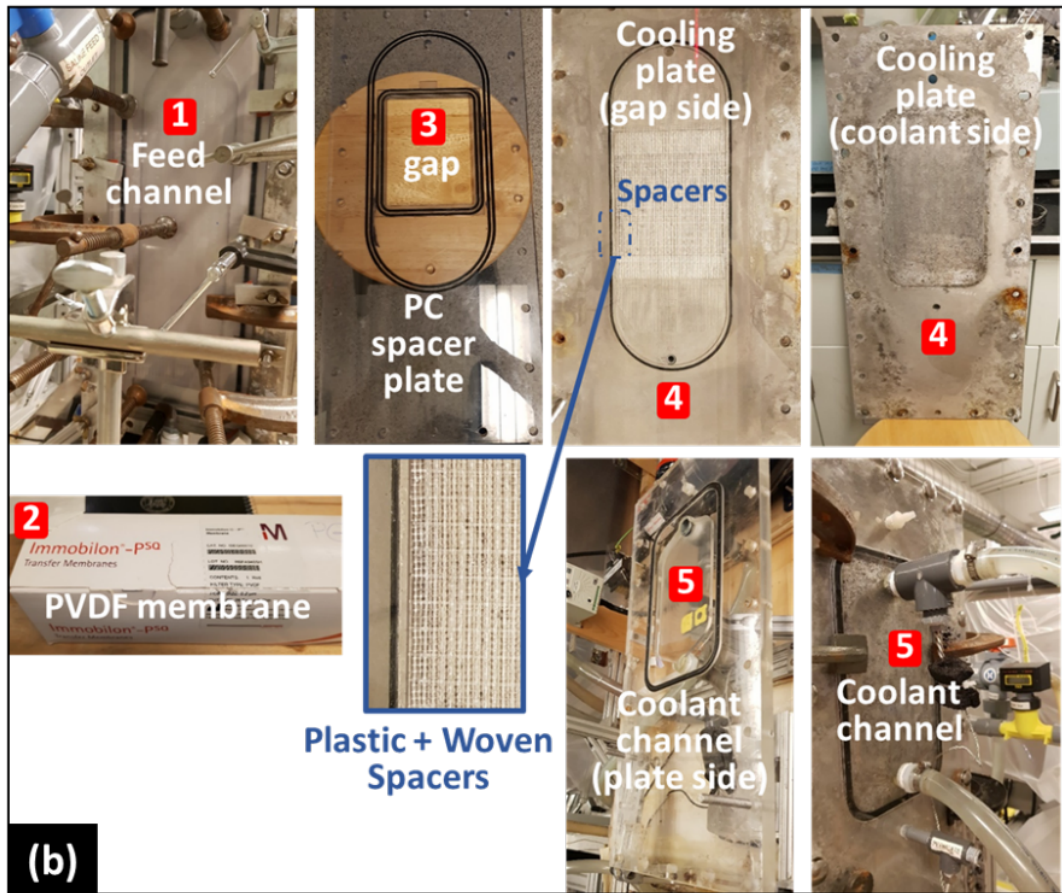
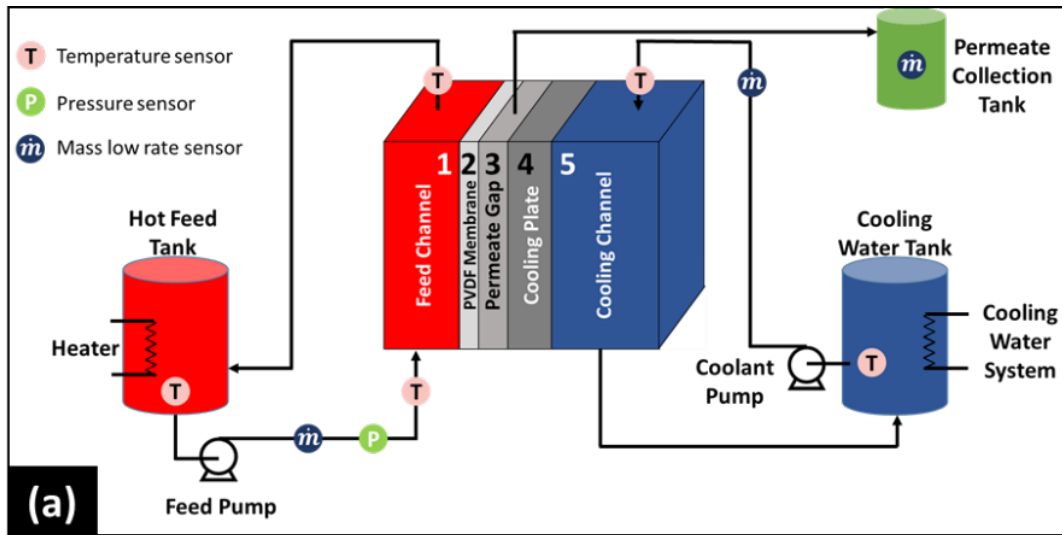
Property	Value
Module length, $L_{module}$	16 cm
Module width, $w$	12 cm
Feed flow channel depth	4 mm
Membrane type	PVDF membrane (ISEQ00010 Millipore)
Membrane thickness, $\delta_m$	200 $\mu\text{m}$
Nominal membrane pore diameter	0.2 $\mu\text{m}$
Porosity, $\varepsilon$	0.80
MD coefficient, $B_m$	$18 \times 10^{-7} \text{ kg/m}^2 \text{ Pa s}$
Membrane thermal conductivity ( $k_m$ ) <sup>a</sup>	0.07332 W/m K
Permeate gap thickness, $\delta_{gap}$	1 mm
Cooling plate thickness	4.8 mm
Coolant flow channel depth	10 mm

237 <sup>a</sup> Calculated from Eq. (9) where  $k_{gas}$  is equal to the thermal conductivity of the vapor ( $k_{vapor} = 0.0261 \text{ W/m K}$ ) and  
 238  $k_{solid}$  is the thermal conductivity of the PVDF ( $k_{PVDF} = 0.2622 \text{ W/m K}$ ) [38,39].

239

### 240 **3.2. PGMD Experimental procedure**

241 The PGMD experiments were performed at four feed flow rates,  $\dot{F}_f$  (3.87, 7.94, 12.13, and 15.92  
 242 L/min). Pure water was used as feed solution in our experiments. The conductivity of the feed and  
 243 permeate water streams were measured to monitor for membrane wetting and purity of the  
 244 freshwater produced. The average feed conductivity was 298  $\mu\text{S/cm}$  while the average permeate  
 245 conductivity remained below 11.8  $\mu\text{S/cm}$  during the experiments. This guaranteed that pore  
 246 wetting was avoided during the experiments. The process operating conditions are summarized in  
 247 Table 2. First, the feed stream was heated to 63.4 °C at the adjusted pressure and  $\dot{F}_f$  condition.  
 248 Similarly, the cooling water was kept at 21.2 °C with a constant cooling water flow rate ( $\dot{F}_c$ ) of  
 249 10.99 L/min. The stream temperatures were monitored using pipe plug thermistor probes  
 250 (designated with temperature sensor symbol (**T**) in Fig. 2a). The  $\dot{F}_f$  values yielded a Reynolds  
 251 number range ( $2100 \leq \text{Re} \leq 9100$ ), which includes the transition to turbulent flow regime. Stable  
 252 values were obtained for the flow rates and temperatures of the streams after 2.5 hours. Then, each  
 253 experiment was continued for an additional 1.5 hours to obtain a stable permeate flux ( $J$ ) under  
 254 steady state condition. Each set of experiments was repeated three times to check repeatability.  
 255 Finally, the experimental data were compared with the CFD simulation results to validate the  
 256 developed model, which was also based on the same operating conditions used in the experiments.



259 **Fig. 2.** (a) Schematic representation of the PGMD experimental setup, (b) PGMD system parts: 1-  
 260 feed channel, 2- PVDF membrane, 3- permeate gap channel, 4- aluminum cooling plate, 5- coolant  
 261 channel and spacers (plastic and woven) along the permeate gap channel.



263 **Table 2.** Summary of the operating conditions during the PGMD experiments

Variable	Value
Feed inlet temperature ( $T_{f, in}$ )	63.4 °C
Feed inlet volumetric flow rate ( $\dot{F}_f$ )	3.87, 7.94, 12.13, 15.92 L/min
Feed inlet gauge pressure ( $P_{f, in}$ )	0.34 bar
Gap outlet gauge pressure ( $P_{gap, out}$ )	0 bar
Coolant inlet temperature ( $T_{c, in}$ )	21.2 °C
Coolant inlet volumetric flow rate ( $\dot{F}_c$ )	10.99 L/min

264

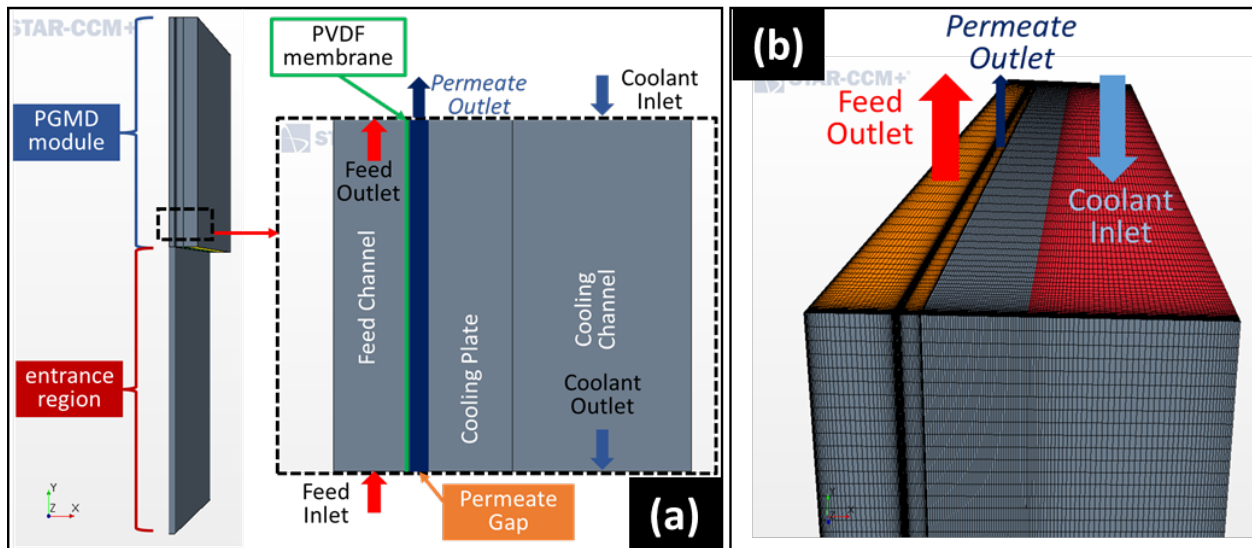
### 265 3.3. CFD model setup

266 The CFD model runs were performed using the Star-CCM+ package (double precision Star-  
 267 CCM+12.06.010-R8, Siemens Product Lifecycle Management Software Inc., Plano, Texas [33]).  
 268 In the CFD model, a steady-state condition was assumed within the PGMD process. Since the feed  
 269 and cooling channels flows were within the transition/turbulent flow ranges ( $2100 \leq Re \leq 9100$  in  
 270 our experiments), a realizable two-layer k-  $\epsilon$  turbulence model was applied. The feed, permeate  
 271 gap and coolant streams were set as freshwater. In the experiments, the permeate gap was filled  
 272 with stagnant permeate liquid. Additionally, a plastic spacer was placed in the channel to support  
 273 the membrane and keep the permeate gap thickness constant. Since the porosity of the spacer was  
 274 large (around 80%) and the thermal conductivity of water ( $k_{water} \approx 0.60$  W/m K) is much higher  
 275 than that of the plastic spacer ( $k_{spacer} \approx 0.15$  W/m K), the thermal conductivity of the permeate gap  
 276 was considered to be that of freshwater in the baseline case in our CFD model ( $k_{water} \approx 0.60$  W/m  
 277 K).

### 278 Geometry and boundary conditions

279 The experimental conditions explained in the previous section and provided in Table 2, were used  
 280 as the basis of the CFD model. To develop the model, a three-dimensional geometry was built  
 281 based on the properties in Table 1. The general scheme of this geometry is presented in Fig. 3a.  
 282 The inset figure illustrates the module parts and the direction of the applied inlet and outlet  
 283 conditions on the boundaries. The feed, permeate gap, and cooling channels were set as fluid  
 284 domains and the membrane and cooling plate were defined as solid volumes. Feed inlet, feed  
 285 outlet, permeate outlet, coolant inlet, and coolant outlet boundaries were set based on the  
 286 experimental conditions given in Table 2. The boundaries for the inlets and outlets were set as

287 velocity inlets and pressure outlets, respectively. The coolant and permeate outlet boundaries were  
 288 open to atmospheric pressure. All the sidewall boundaries other than the inlet and outlet boundaries  
 289 were considered as no-slip walls. The internal interface boundaries (the feed/membrane interface,  
 290 the membrane/permeate gap interface, the permeate gap/cooling plate interface and the cooling  
 291 plate/cooling channel interface) were selected as conjugate heat transfer boundaries, which allow  
 292 conjugate heat transfer between the regions (between a fluid domain and a solid domain) in Star-  
 293 CCM+. This strategy allows the simulation of heat transfer between a solid domain and a fluid  
 294 domain by exchanging thermal energy at the boundary between the two domains, so that heat  
 295 transport can be solved for at the wall correctly. In order to include the energy sink and source  
 296 terms, the heat flux was specified at the relevant interfaces such as the feed/membrane interface  
 297 (where energy leaves the feed volume), and the membrane/permeate gap interface (where energy  
 298 enters the permeate gap volume). Then, these terms were linked with an expression defined for  
 299 calculating  $\dot{q}_{vap}$ . The mass and momentum source terms were similarly set and linked with an  
 300 expression defined for calculating  $J$ .  $J$  was monitored over a range of inlet feed volumetric flow  
 301 rates ( $\dot{F}_f$ ): 3.87, 7.94, 12.13, and 15.92 L/min. In the CFD model, the thermal conductivity of the  
 302 permeate gap ( $k_{gap} = 0.6$  W/m K) and membrane distillation coefficient ( $B_m = 18 \times 10^{-7}$  kg/m<sup>2</sup> s  
 303 Pa) were selected based on the reported data for a similar setup and the same type of membrane  
 304 [6].



305  
 306 **Fig. 3.** (a) CAD drawing of the PGMD domain and its subdomain representation (Feed stream  
 307 entrance region and MD module subdomains including the feed, permeate gap and cooling

308 channels, and the PVDF membrane and cooling plate solid domains with the boundaries), (b) the  
309 structure of the mesh from the top view of the PGMD module.

310

### 311 **Mesh operation**

312 The directed mesh operation was applied to generate a 3D solver mesh in Star-CCM+ [33]. A mesh  
313 independence analysis was performed to achieve reliable results from the simulations. Permeate  
314 flux was chosen as a comparison parameter to ensure that flux results are grid-size-independent.  
315 The mesh size was refined step by step with considering all three dimensions and the permeate  
316 flux results were compared. When the change in permeate flux was less than 1%, the mesh  
317 refinement stopped. For the validation model, 240 number of divisions along the module length  
318 and 120 number of divisions along the module width were created as a base for the directed mesh  
319 operation. Then, the operation was continued for the feed channel, membrane, permeate gap, and  
320 cooling channel thicknesses, which were divided into 40, 20 and 50 layers, respectively. A two-  
321 sided hyperbolic stretching factor was applied for the domains (spacing at the wall boundaries was  
322 started at 0.01 mm.). The stretching factor was used to achieve further mesh refinement near the  
323 wall boundaries and to monitor the boundary layers of the feed and cooling water streams. The  
324 cooling plate and membrane were divided into 40 and 10 layers, respectively. Additionally, a  
325 volume extruder was applied to create 20 cm entrance length before the feed inlet boundary. This  
326 entrance region was included in the model to achieve a fully developed feed inlet condition when  
327 the feed stream reaches the active membrane area. Heat losses were neglected at the entrance  
328 region. In total,  $1,305 \times 10^4$  elements were generated for the domain. The structure of the mesh  
329 from the top view of the PGMD module is shown in Fig. 3b.

### 330 **Software tool**

331 A finite volume numerical discretization scheme based Star-CCM+ commercial software was used  
332 to solve the model equations described above. Pre-processing step was also performed utilizing  
333 the CAD and meshing packages provided in the Star-CCM+ software. SIMPLE algorithm was  
334 implemented to control the overall solution. Segregated flow and segregated energy solvers were  
335 set and the second-order upwind numerical scheme was used for the numerical solution. Under-  
336 relaxation factors (URFs) were defined for solvers such as velocity solver (URF= 0.7), pressure  
337 solver (URF= 0.3), fluid energy (URF= 0.8), and solid energy (URF= 0.9). The URF value governs

338 the new level to which the newly computed data from the solution replaces the old data for each  
339 iteration step [33].  $J$  and  $\dot{q}_{vap}$  were calculated and fed into the solution of the governing CFD  
340 model equations (Eqs. 16– 18) through the source terms (Eqs. 16a–18a) for each iteration step. It  
341 continued until the solver converged to represent the local hydrodynamic and thermal properties  
342 within the solution domain. The convergence criteria were achieved when the flow rate of fluid  
343 entering and leaving the model balanced and the temperature and  $J$  plots became stable. The  
344 residuals of the continuity and momentum equations were maintained below  $10^{-12}$ , and the residual  
345 of the energy equation was maintained below  $10^{-5}$ . It took an average 45,000 iterations to reach  
346 the residual levels.

347

### 348 **3.4. Design of the simulation runs: Two-level full factorial design**

349 Factorial analysis is a useful statistical approach, which can be applied in the design of both  
350 experiments and modeling studies [40]. The technique is used to study the impact of multiple  
351 independent variables, each of which may assume different possible values (i.e., levels), on one or  
352 more dependent variables. All potential high and low combinations of the input factors were  
353 considered in a two-level full factorial design to plan the runs for an experimental or modeling  
354 study [24,25,40]. Design-Expert ® Version 10 (Stat-Ease Inc., Minneapolis [41]) was used to  
355 design the simulation runs. The relative effects of four selected key factors and their interactions  
356 were elucidated in this study:  $k_{gap}$ ,  $\delta_{gap}$ ,  $L_{module}$  and  $B_m$ . A CFD simulation was performed for each  
357 run under the process operating conditions provided earlier (Table 2).

358 The following inputs were used in all simulation runs;  $T_{f, in} = 63.4$  °C,  $\dot{F}_f = 3.87$  L/min,  $P_{gap, out} = 0$   
359 bar (gauge pressure),  $T_{c, in} = 21.2$  °C, and  $\dot{F}_c = 10.99$  L/min. The module and membrane properties  
360 were the same as in Table 1, but the selected four variables ( $k_{gap}$ ,  $\delta_{gap}$ ,  $L_{module}$ , and  $B_m$ ) were varied  
361 for each run. The design matrix of the runs at two levels of input parameters (lower– and upper–  
362 bounded intervals) are presented in Table 3. The positive (+) and negative (–) signs for each factor  
363 indicate two-levels which are the lower and upper bounds, respectively. The total number of factor  
364 combinations is based on the  $2^n$  rule [25], where  $n$  is the number of factors (4 in this case).

365 The levels (lower and upper bounds) were selected based on a thorough review of the reported  
366 values for each factor found in the literature. For instance, since increasing  $k_{gap}$  or  $B_m$  does not

377 have a significant influence on the permeate flux beyond a specific limit [4,6], the upper bounds  
 378 of the  $k_{gap}$  and  $B_m$  were set at 10 W/m K and  $20 \times 10^{-7}$  kg/m<sup>2</sup> s Pa, respectively. The lower bound  
 379 of the  $k_{gap}$  was kept equal to the thermal conductivity of water, which is 0.6 W/m K. The responses  
 380 ( $J$  and  $\eta$ ) from each CFD run were fed into the Design-Expert software to analyze the effects of  
 381 factors statistically. A 95% confidence level was used in the analysis.

372

373 **Table 3.** Design matrix table for the CFD simulation runs based on a two-level full factorial design  
 374 (four main factors: gap conductivity ( $k_{gap}$ ), gap thickness ( $\delta_{gap}$ ), MD coefficient ( $B_m$ ) and module  
 375 length ( $L_{module}$ )). A total of 16 CFD runs were performed.

Run	$k_{gap}$	$\delta_{gap}$	$B_m$	$L_{module}$	$k_{gap}$ [W/m K]	$\delta_{gap}$ [mm]	$B_m$ [kg/m <sup>2</sup> s Pa]	$L_{module}$ [cm]
1	+	+	+	+	10	3	$2 \times 10^{-6}$	32
2	-	-	+	-	0.6	0.5	$2 \times 10^{-6}$	16
3	+	-	+	+	10	0.5	$2 \times 10^{-6}$	32
4	-	-	-	-	0.6	0.5	$1 \times 10^{-7}$	16
5	+	-	-	-	10	0.5	$1 \times 10^{-7}$	16
6	-	+	-	-	0.6	3	$1 \times 10^{-7}$	16
7	+	-	+	-	10	0.5	$2 \times 10^{-6}$	16
8	-	+	-	+	0.6	3	$1 \times 10^{-7}$	32
9	+	+	-	+	10	3	$1 \times 10^{-7}$	32
10	-	-	-	+	0.6	0.5	$1 \times 10^{-7}$	32
11	-	+	+	-	0.6	3	$2 \times 10^{-6}$	16
12	-	+	+	+	0.6	3	$2 \times 10^{-6}$	32
13	+	-	-	+	10	0.5	$1 \times 10^{-7}$	32
14	+	+	+	-	10	3	$2 \times 10^{-6}$	16
15	-	-	+	+	0.6	0.5	$2 \times 10^{-6}$	32
16	+	+	-	-	10	3	$1 \times 10^{-7}$	16

376

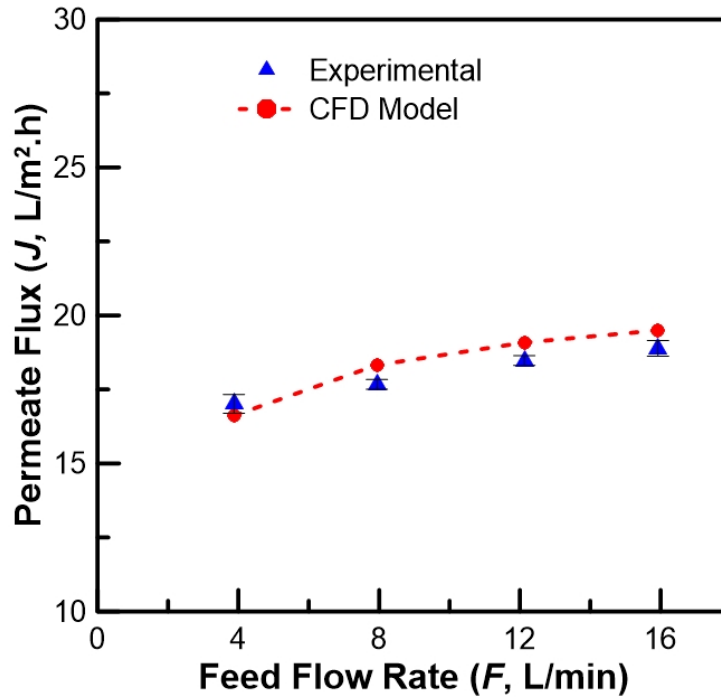
## 377 4. Results and Discussion

### 378 4.1. CFD model validation

379 The developed CFD model was validated using the experimentally obtained data over a range of  
 380 feed inlet volumetric flow rates,  $\dot{F}_f = 3.87, 7.94, 12.13,$  and  $15.92$  L/min. The permeate flux,  $J$ ,  
 381 predictions from the CFD model were plotted against  $\dot{F}_f$  in Fig. 4, along with their corresponding  
 382 experimental values. Since the CFD model results are very close to the experimental data, the CFD  
 383 predictions were deemed in good agreement with the experimental results. As shown in Fig. 4.,

384 higher feed flow rates result in enhanced water flux, due to the increase in the local heat transfer  
385 coefficient at the feed side ( $h_f$ ). The thermal boundary layer at the feed side becomes thinner with  
386 increasing  $\dot{F}_f$  and the temperature polarization effect diminishes [10,14,20].

387



388

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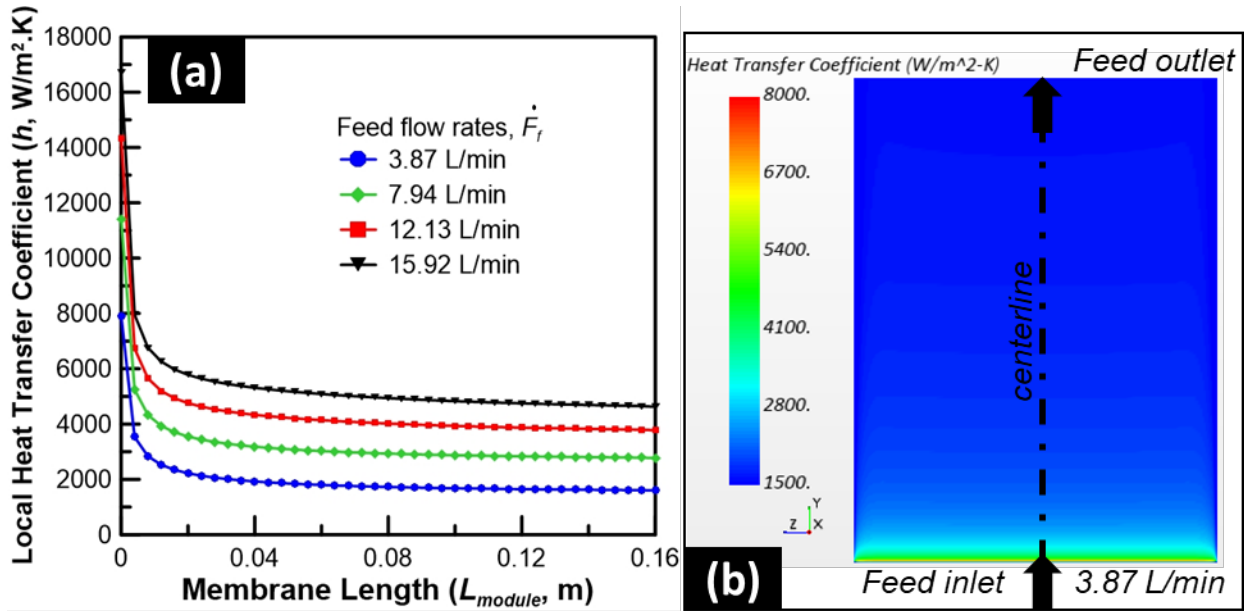
390 **Fig. 4.** CFD model validation using experimental permeate flux measurements over a range of  
391 feed flow rates ( $\dot{F}_f = 3.87, 7.94, 12.13$  and  $15.92$  L/min).

392

393 The mentioned effect of feed flow rate on  $h_f$  was further examined using the CFD results.  $h_f$  was  
394 monitored along the membrane length at the membrane/feed interface for four  $\dot{F}_f$  values, as  
395 presented in Fig. 5a. The shown  $h_f$  values were calculated at the centerline of the feed-side  
396 boundary layer (Fig. 5b). Using a feed flow rate of 3.87 L/min as an example, the contour plot in  
397 Fig. 5b shows the  $h_f$  profile at the membrane/feed interface. Additionally, the thermal boundary  
398 layer on the feed side was monitored and contour plots were generated at the feed/membrane  
399 interface for the four feed flow rates (Fig. 6). The boundary layer thickness was monitored using  
400 the “wall distance” field function in Star-CCM+. The thermal boundary layer, shown in terms of  
401 distance from the membrane surface in Fig. 6, was defined as any location where the temperature

402 is less than 99% of the bulk stream temperature. The contour plots in Fig. 6 clearly show that as  
 403  $\dot{F}_f$  increased, the thermal boundary layers became thinner, which supports the reasoning behind  
 404 the results in Fig. 5.

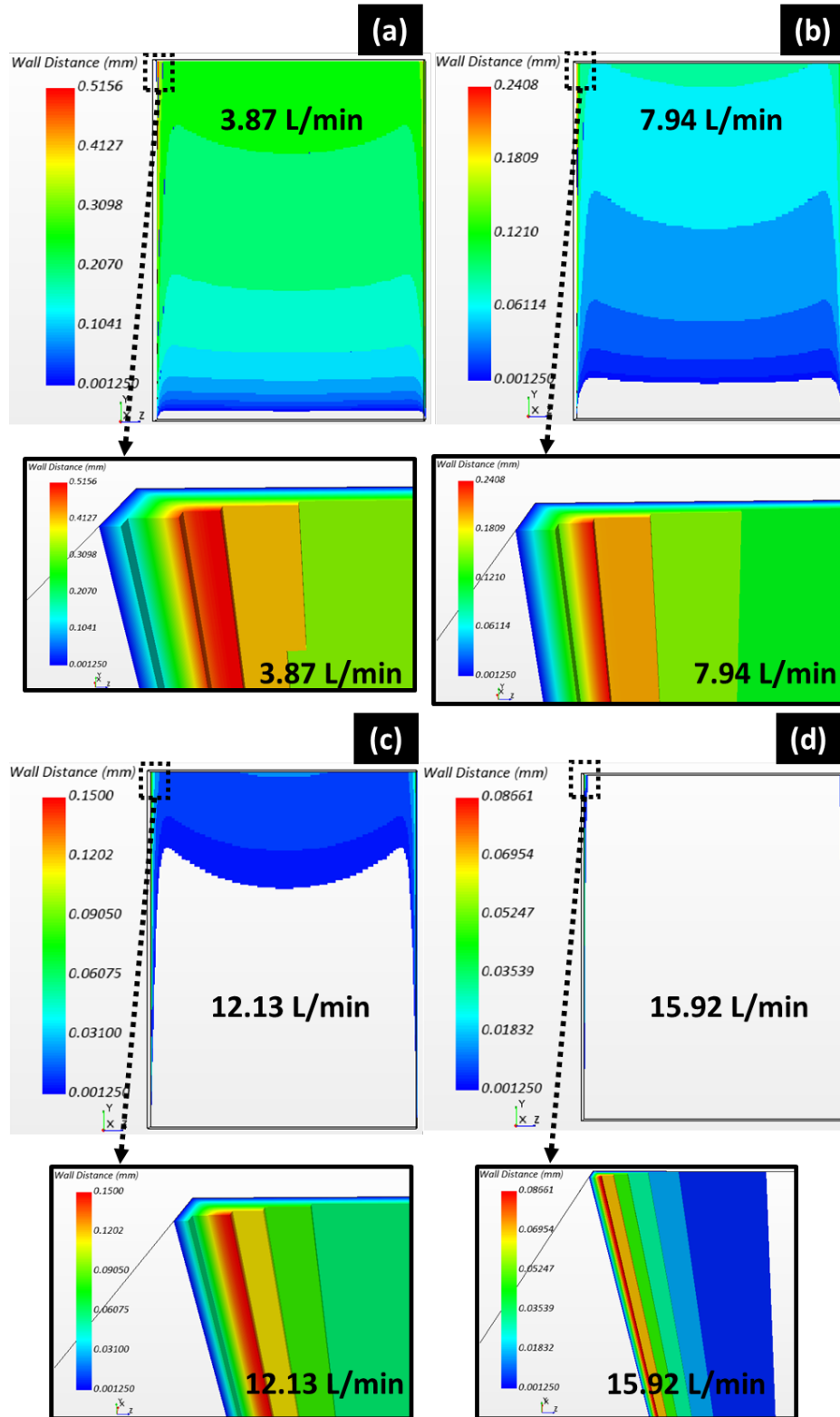
405



406

407 **Fig. 5.** (a) Local heat transfer coefficient ( $h$ ) along the module length ( $L_{module}$ ) at the centerline of  
 408 the feed channel boundary layer for varying feed inlet volumetric flow rates ( $\dot{F}_f = 3.87, 7.94,$   
 409  $12.13$  and  $15.92$  L/min). (b) Contour plot which shows the distribution of  $h$  along the feed side  
 410 boundary layer near the membrane/feed interface ( $\dot{F}_f = 3.87$  L/min).

411



412

413 **Fig. 6.** Wall distance contour plots showing the change in thermal boundary layer thickness upon  
 414 varying the feed flow rates: (a)  $\dot{F}_f = 3.87$  L/min (b)  $\dot{F}_f = 7.94$  L/min (c)  $\dot{F}_f = 12.13$  L/min and (d)  
 415  $\dot{F}_f = 15.92$  L/min.



416 **4.2. Effects of system factors on  $J$  and  $\eta$**

417 After its validation, the CFD model was used to investigate the effects of the four system factors  
 418 on  $J$  and  $\eta$ , based on the two-level full factorial design (table 3). The  $J$  and  $\eta$  values obtained from  
 419 the CFD simulations are listed in Table 4. Different trends can be observed from the simulation  
 420 results, which are in agreement with the literature-reported trade-offs between  $J$  and  $\eta$  for different  
 421 MD configurations [42,43]. Run 7 yielded the highest  $J$  value, while the highest value for  $\eta$  was  
 422 observed in Runs 11 and 12. Increasing  $L_{module}$  resulted in only a slight reduction of flux, which  
 423 can be expected given the fact that even the longest module modeled (32 cm) is still relatively  
 424 short (in comparison to full-scale MD systems), with tangible impacts of  $L_{module}$  hard to observe.  
 425 Similarly, increasing  $L_{module}$  did not influence  $\eta$ , for the same reason as  $J$ . It merits mentioning that  
 426 at significantly longer modules, both  $J$  and  $\eta$  are very likely to be affected in various ways, as we  
 427 demonstrated in a previous study for DCMD and AGMD systems [40]. However, as a result of the  
 428 fine grid used in our CFD modeling, which was needed to capture boundary layer effects, modeling  
 429 much longer modules (e.g., on the order of meters) would have required a massive computational  
 430 power unavailable to us.

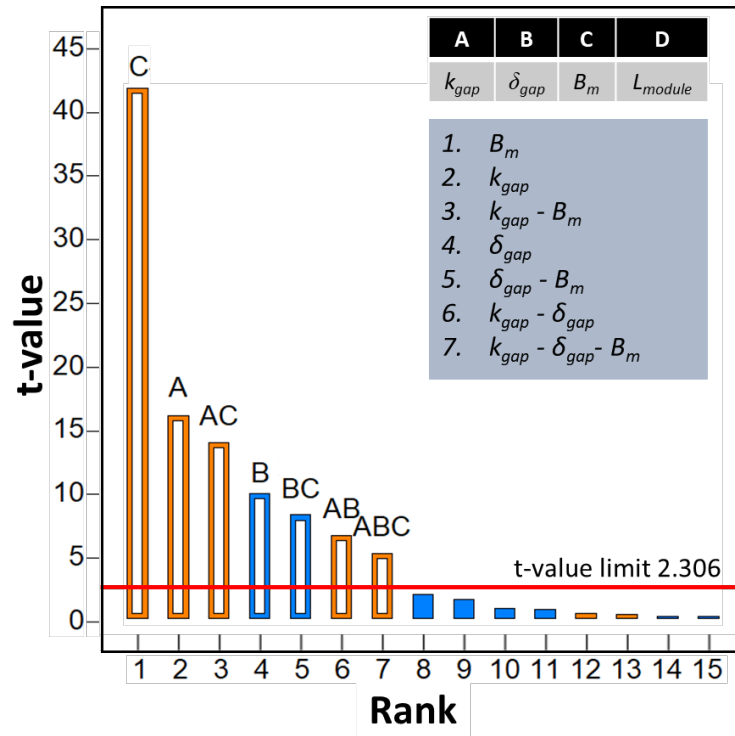
431 **Table 4.** Design matrix table for responses ( $J$  and  $\eta$ ) from the CFD model simulations at the two  
 432 levels of four input factors ( $k_{gap}$ ,  $\delta_{gap}$ ,  $B_m$ , and  $L_{module}$ ).  $\dot{F}_f$  was assumed 3.87 L/min (constant)

Run	$k_{gap}$ [W/m K]	$\delta_{gap}$ [mm]	$B_m$ [kg/m <sup>2</sup> s Pa]	$L_{module}$ [cm]	$J$ [L/m <sup>2</sup> h]	$\eta$ [-]
1	10	3	2 x 10 <sup>-6</sup>	32	28.03	0.873
2	0.6	0.5	2 x 10 <sup>-6</sup>	16	24.31	0.889
3	10	0.5	2 x 10 <sup>-6</sup>	32	30.79	0.862
4	0.6	0.5	1 x 10 <sup>-7</sup>	16	4.19	0.262
5	10	0.5	1 x 10 <sup>-7</sup>	16	4.53	0.236
6	0.6	3	1 x 10 <sup>-7</sup>	16	2.68	0.326
7	10	0.5	2 x 10 <sup>-6</sup>	16	33.43	0.863
8	0.6	3	1 x 10 <sup>-7</sup>	32	2.61	0.325
9	10	3	1 x 10 <sup>-7</sup>	32	4.22	0.246
10	0.6	0.5	1 x 10 <sup>-7</sup>	32	4.02	0.261
11	0.6	3	2 x 10 <sup>-6</sup>	16	9.60	0.916
12	0.6	3	2 x 10 <sup>-6</sup>	32	9.34	0.915
13	10	0.5	1 x 10 <sup>-7</sup>	32	4.33	0.235
14	10	3	2 x 10 <sup>-6</sup>	16	30.25	0.874
15	0.6	0.5	2 x 10 <sup>-6</sup>	32	22.80	0.888
16	10	3	1 x 10 <sup>-7</sup>	16	4.40	0.247

433

434 **Effects of factors on flux**

435 The Pareto chart in Fig. 7 represents the significance level of the individual and interconnected  
 436 factors on  $J$  in the dimensionless statistical form. The dimensionless statistical form aligns the  
 437 ranking based on the standard deviations at a set confidence level (95% was used in our analysis).  
 438 The t-value limit shown was calculated based on the identified significant parameters using half-  
 439 normal plot, a tool which utilizes the ordered estimated effects in order to find the important factors  
 440 under the 95% of significance threshold condition, using the Design-Expert software [25,41,44].  
 441 The blue columns indicate factors that are inversely proportional to the process output ( $J$ ), while  
 442 the orange columns indicate a direct proportionality. The factors/factor interactions are ranked  
 443 from 1 to 15 based on the significance level. The bars below the t-value limit (rank 8 to rank 15)  
 444 represent factors/ interactions which do not have any significant effects on  $J$ .  
 445



446  
 447 **Fig. 7.** Pareto chart of the effects of factors/factor interactions on  $J$  where the t-value of the absolute  
 448 effects is plotted against the ranking. Rank 1 has the highest significance and 7 has the lowest  
 449 significance. The bars below the t-value limit represent factors/ interactions which do not have any  
 450 significant effects on  $J$ . The blue columns indicate factors that are inversely proportional to the  
 451 process output ( $J$ ), while the orange columns indicate a direct proportionality.

452

453 Based on the results shown in Fig. 7,  $J$  was found directly proportional to  $B_m$ , as expected from Eq.  
454 1, with  $B_m$  having the most significant effect on  $J$ . Since a high gap conductance ( $k_{gap}/\delta_{gap}$ ) is  
455 necessary for better process performance [6,7],  $k_{gap}$  and  $\delta_{gap}$  were the following factors in terms of  
456 impact, although the interaction of  $k_{gap} - B_m$  was more important than  $\delta_{gap}$ . The influence of  $L_{module}$   
457 was not as significant as those of other factors and interactions, as mentioned earlier.

458 Two types of interaction plots are given in Fig. 8 to further understand the above-mentioned trends.  
459 In the 3D contour plots in Fig. 8, the  $x$ -axis and  $z$ -axis (horizontal axes) present the two factors of  
460 interest, while the  $y$ -axis (vertical axis) shows the  $J$  values from the CFD model runs. The  
461 remaining two factors (other than the two on the horizontal axes) were maintained at average  
462 values when plotting the graphs. In the 2D interaction plots,  $J$  was plotted against one factor on  
463 the  $x$ -axis. The two lines in each 2D interaction plot represent the upper- and lower-bounds of one  
464 additional factor (the second factor of interest). Similar to the 3D contour plots, the remaining two  
465 factors (other than those shown in the 2D interaction graph), were maintained at average values.  
466 Interesting observations can be made from the graphs. The A–C plots illustrate the interaction  
467 between  $k_{gap}$  and  $B_m$ . Even though the effect of  $k_{gap}$  on flux was significant for membranes with  
468 high  $B_m$  ( $20 \times 10^{-7} \text{ kg/m}^2 \text{ Pa s}$ ), it had almost no effect on flux for the membrane with low  $B_m$  ( $1 \times$   
469  $10^{-7} \text{ kg/m}^2 \text{ Pa s}$ ). A similar observation can be made for  $\delta_{gap}$  from the B–C plots.  $\delta_{gap}$  was inversely  
470 proportional to  $J$  at high  $B_m$  ( $20 \times 10^{-7} \text{ kg/m}^2 \text{ Pa s}$ ) and an increase in  $\delta_{gap}$  from 0.5 mm to 3 mm  
471 enhanced the flux as expected [8]. But, at low  $B_m$  ( $1 \times 10^{-7} \text{ kg/m}^2 \text{ Pa s}$ ), this effect was very minute.  
472 On the other hand, the  $k_{gap} - \delta_{gap}$  interaction (on the A–B plots) showed that the effect of  $k_{gap}$  on  $J$   
473 was more evident at the higher  $\delta_{gap}$  value (3 mm).

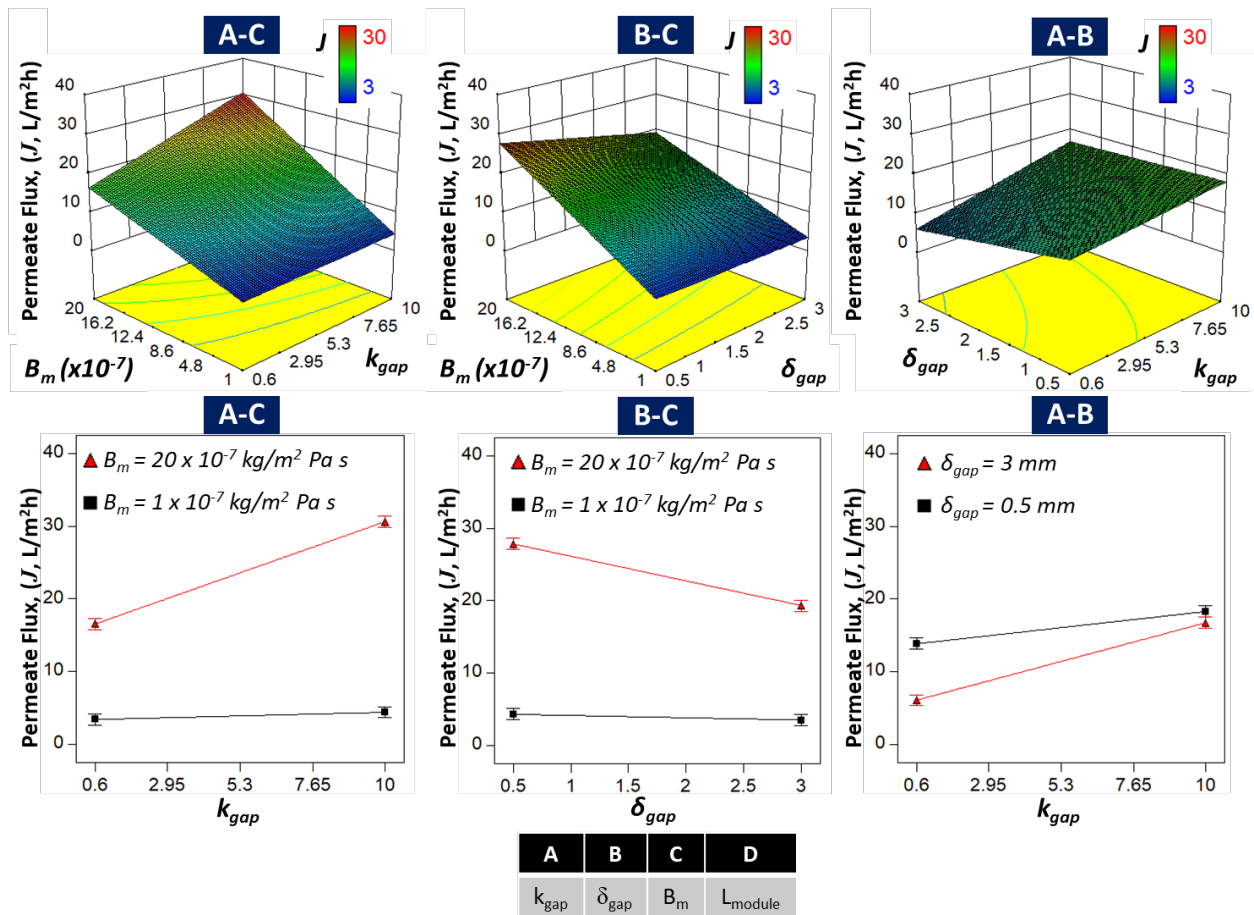
474 The flux is driven by the overall temperature difference between the hot and cold streams. The  
475 resistance of the hot stream, membrane, gap, condensation plate and the cold stream are in series.  
476 Since these resistances are in series, the total resistance between the hot and cold channels can be  
477 evaluated as the sum of all the resistances (extending Eq. 14 across all the resistance terms). Within  
478 the membrane, the resistances to vapor transport and to conduction can be considered to be in  
479 parallel, since they represent two alternative pathways for heat transfer through the membrane.

480 If one of these 5 resistances is significantly larger than the rest, the sum is dominated by this  
481 resistance. In such a scenario, changing this resistance would have a significant impact on overall

482 heat transfer, whereas modifying the others would have minimal impact. In light of this discussion,  
 483 we can understand the trends observed in Fig. 8. At low  $B_m$ , the membrane is the major resistance  
 484 in the series. In this scenario, therefore, changing  $k_{gap}$  has a small influence on flux. In contrast, at  
 485 high  $B_m$ , the gap itself is the major resistance. Therefore, increasing  $k_{gap}$  in this case leads to  
 486 significant improvement in flux. The observed trends of the impact of  $\delta_{gap}$  at the different values  
 487 of  $B_m$  can also be explained by the same logic.

488 Similarly, at large  $\delta_{gap}$ , the gap resistance is larger. In such a scenario, changes to the gap resistance  
 489 by changing  $k_{gap}$  are more significant, rather than when  $\delta_{gap}$  is small and the gap resistance itself  
 490 is correspondingly small.

491



492

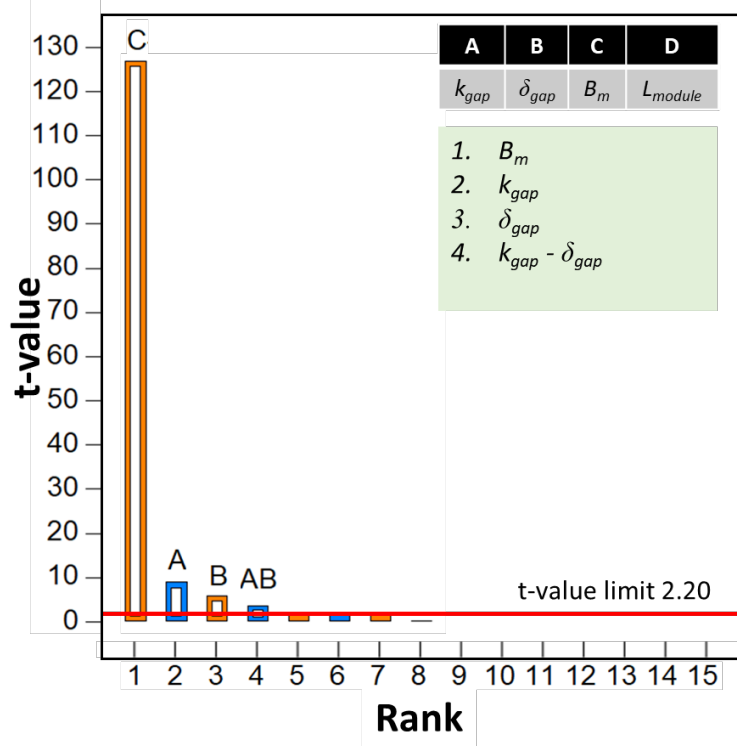
493 **Fig. 8.** 3D contour and 2D interaction graphs for the permeate flux ( $J$ ) response, where A–C is the  
 494  $k_{gap} - B_m$  interaction, B–C is the  $\delta_{gap} - B_m$  interaction, and A–B is the  $k_{gap} - \delta_{gap}$  interaction. The  
 495 error bars in the 2D graphs indicate the 95% least significant difference interval for the data points.

496

497 **Effects of factors on thermal efficiency**

498 The Pareto chart in Fig. 9 displays the impact ranking of the different factors/factor interactions  
499 on  $\eta$  based on the CFD simulations results in Table 4. The blue columns indicate factors that are  
500 inversely proportional to the process output ( $\eta$ ), while the orange columns indicate direct  
501 proportionality. The factors/factor interactions are ranked from 1 to 15 based on the significance  
502 level. The bars below the t-value limit (rank 1 to rank 4) indicate factors/interactions without any  
503 significant effects on  $\eta$ . The results show that  $B_m$ ,  $k_{gap}$ , and  $\delta_{gap}$  all have effects on  $\eta$ , with  $B_m$   
504 having, by far, the most significant effect. The significance levels of  $k_{gap}$  and  $\delta_{gap}$  followed, in that  
505 order. The only significant factor interaction vis-à-vis  $\eta$  was the  $k_{gap} - \delta_{gap}$  interaction, which came  
506 fourth in the rank of significance. This factor interaction is presented in the 2D interaction and 3D  
507 contour graphs in Fig. 9. Based on the heat transfer mechanism in PGMD, an increase in gap  
508 conductance ( $k_{gap}/\delta_{gap}$ ) is necessary to achieve better process performance [6,7]. Therefore, the  
509 significance of the  $k_{gap} - \delta_{gap}$  interaction was observed as expected.

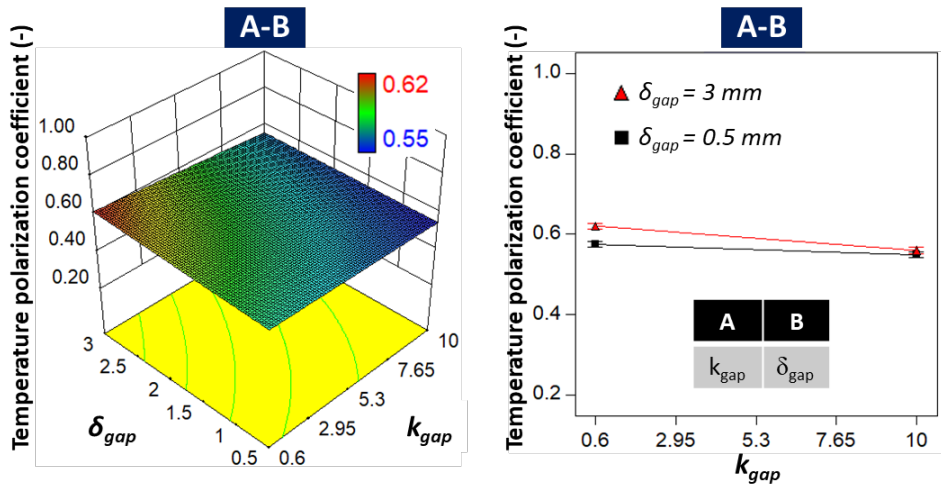
510 Going back to the heat transfer resistance model of the MD process,  $\eta$  defines the fraction of the  
511 total energy transfer happening in the form of vapor flux through the membrane. Not surprisingly  
512 therefore, the permeability has a significant impact on  $\eta$ . An increase in  $B_m$  improves vapor  
513 transport through the membrane without affecting the heat conduction resistance, thereby  
514 significantly improving  $\eta$ .



515

516 **Fig. 9.** Pareto chart of the effects of factors/factor interactions on  $\eta$  where the t-value of the  
 517 absolute effects is plotted against the ranking. Rank 1 has the highest significance and 4 has the  
 518 lowest significance. The bars below the t-value limit represent factors/interactions which do not  
 519 have any significant effects on  $\eta$ . The blue columns indicate factors that are inversely proportional  
 520 to the process output ( $\eta$ ), while the orange columns indicate direct proportionality.

521



522

523 **Fig. 10.** 3D contour and 2D interaction graphs for the  $\eta$  process output obtained from CFD model  
 524 runs. A–B is the  $k_{gap} - \delta_{gap}$  interaction.

## 525 **5. Conclusion**

526 In this study, a CFD model was developed for the PGMD configuration and was validated using  
527 experimental data. Upon validation of the model, a factorial analysis statistical tool was used to  
528 design the simulation sets to evaluate the influence of four selected PGMD configuration  
529 parameters ( $k_{gap}$ ,  $\delta_{gap}$ ,  $L_{module}$  and  $B_m$ ) on flux,  $J$ , and thermal efficiency,  $\eta$ . The latter two were  
530 selected as key indicators of process performance. The model reveals the influence of module  
531 design parameters in maximizing both  $J$  and  $\eta$ . The results show that  $B_m$ ,  $k_{gap}$ , and  $\delta_{gap}$  each have  
532 a significant contribution to PGMD process performance. Additionally, factorial analysis was a  
533 useful tool to probe the significance of each factor by also considering the interactions among  
534 parameters.

535 In view of the analysis, the following conclusions were reached:

- 536 • The membrane distillation coefficient has the most substantial effect on  $J$  and  $\eta$  in PGMD.  
537 This term has a positive correlation with both  $J$  and  $\eta$ .
- 538 • The next largest effects are from  $k_{gap}$  (positive correlation with  $J$ ) and  $\delta_{gap}$  (negative  
539 correlation with  $J$ ), individually, although the effect the  $k_{gap} - B_m$  interaction is more  
540 significant than  $\delta_{gap}$  with respect to its impact on  $J$ .
- 541 • The  $k_{gap} - B_m$  (positive correlation with  $J$ ),  $\delta_{gap} - B_m$  (negative correlation with  $J$ ), and  $k_{gap}$   
542  $- \delta_{gap}$  (positive correlation with  $J$ ) interactions all have significant impacts on  $J$ , in the order  
543 listed.
- 544 • The effect of  $k_{gap}$  on  $J$  is more significant for membranes with high  $B_m$ , because the gap  
545 resistance becomes the dominant resistance at high  $B_m$ .
- 546 • The only significant factor interaction observed for  $\eta$  was that of  $k_{gap} - \delta_{gap}$ . This interaction  
547 has a negative correlation with  $\eta$ .

548

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