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Intrinsic dependence of ice adhesion strength on surface roughness

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6 Abstract

7 The roles of surface roughness on icephobicity including ice adhesion strength have been 8 long debated in icephobicity studies. However, the direct/systematic influence of surface roughness on ice adhesion strength while keeping other surface characteristics such as surface 9 10 wettability and interfacial cavitation unchanged are seldom reported. In this paper, systematic 11 reduction of ice adhesion strength with the decrease in surface roughness regardless of the surface wettability was demonstrated across all the studied material types, i.e. metallic 12 surfaces and polymeric coatings with different surface wettability. In-situ icing observation 13 studies indicated that the ice did not anchor on smooth metallic surfaces and polymeric 14 coatings but anchored on rough surfaces including superhydrophobic coatings. Effect of 15 16 surface wettability was argued against the ice adhesion strength based on our results and similar ice adhesion strength was found on materials having different wettability (i.e. 17 hydrophilic and hydrophobic coatings, and surfaces having different contact angle 18 19 hysteresis). On the contrary, the introduction of low surface energy chemicals (via deposition and/or functionalization) on the surface having similar surface roughness showed a direct 20 reduction of ice adhesion strength. These results indicated the surface roughness is vital in 21 22 achieving icephobic performance, however, the ultra-low ice adhesion strength could be achieved by the synergetic effect of low surface roughness and low interfacial cavitation (in 23 line with the interfacial correlation factor). 24

25 Keywords: icephobicity, ice anchoring, surface roughness, icing

26 1 Introduction

Surface roughness plays a crucial role in imparting icephobicity and superhydrophobicity on 27 a solid surface and superhydrophobicity is the synergetic result of low surface energy and 28 29 rough asperities [1-4]. Air pockets generated by highly rough surface and low surface energy render the hydrophobicity of a surface in Cassie Baxter state, while high surface energy leads 30 31 to a highly hydrophilic surface. Zou et al. [5] reported that the introduction of low surface energy thin films on the sandblasted surface raised the water contact angle from 37° to 145°. 32 It is normally believed that surface roughness R_a from 100 nm to 100 μ m was used to render 33 the surface superhydrophobic for most of the cases [6-9]. 34

Surface superhydrophobicity would minimize the water contact area to prevent the ice to 35 36 form a strong bond (superhydrophobicity-induced icephobicity) [10-13] and this phenomenon 37 favours the diversion to homogeneous nucleation or results in loosely formed ice. Another related study indicated that contact angle hysteresis (CAH) on superhydrophobic surface and 38 39 strength of ice adhesion are significantly dependent on the ice-solid contact area [14]. However, this hypothesis has limited applications and is not applicable in the cases of (a) the 40 41 micro-frost formation under high humidity conditions [15-20], (b) maintaining high receding angles at sub-zero temperature [21, 22], (c) mechanical interlocking between ice and highly 42 complex rough asperities on the superhydrophobic surface [23-25], and (d) increased number 43 of hydrogen bonds (water-solid) [26-29]. All these factors form the main hurdles in the 44 deployment of the superhydrophobic surface in icephobic applications [30]. 45

Surface texturing or patterning has also been argued for achieving icephobicity [31-33], via
the superhydrophobicity-induced icephobicity [8, 15, 34, 35] and some promising results
were reported in anti-icing applications (e.g. droplet freezing delays, etc.) [36, 37].
Mishchenko et al [9] manufactured surfaces with highly ordered nano-scaled roughness

using Bosch process on various substrates. They studied the surfaces with wettability, and 50 reported ice accretion delay on hydrophilic, hydrophobic and superhydrophobic surfaces by a 51 52 few seconds, approximately 1 minute and remarkable >10 minutes, respectively. Eberle et al [38] fabricated various hydrophobic and hydrophilic surfaces with different nano-scaled 53 roughness with RMS ranging from 0.17 nm to 176 nm, and demonstrated approximately 25 54 hours of droplet freezing delays on surfaces with ultrasmooth Si surface. However, these 55 56 extraordinary improvements on anti-icing performance did not directly contribute to de-icing (shear removal of ice) abilities in most of the work and the anti-icing studies were mainly 57 58 conducted on superhydrophobic surfaces. In addition, it is important to note that these freezing delays were mainly observed under static testing conditions. For dynamic droplet 59 impact at aircraft velocity, the effect of freezing delay may be limited. 60

61 It is reported that ice nucleation can be annihilated or immensely delayed by deploying surface with roughness close to or smaller than critical ice nuclei size (1.2 nm - 2 nm under)62 supercooling) [37, 38]. The rate of ice nucleation over the surface depends on homogenous 63 and heterogeneous nucleation barriers [39, 40]. It is important to control or minimize the 64 heterogeneous nucleation rate, which is mainly influenced by foreign particles present in the 65 water and on the surface, interfacial energies among the surface, and interaction of the 66 67 liquid/solid and surface geometries. By favoring the homogenous nucleation, the need to 68 control effective contact area as required by superhydrophobicity-induced icephobicity 69 methods [41] could be eliminated. Previous studies have indicated the surface roughness (R_a) of less than 100 nm [37, 42, 43] is instrumental to induce anchor-free ice nucleation over the 70 surfaces and the annihilation of ice nucleation may be possible on surfaces with roughness 71 72 less than 10 nm [36, 38].

In our previous work [44], the anchoring mechanism on rough surfaces was observed andvalidated using in-situ water condensation and icing observation. The results indicated the

dependence of ice adhesion strength with surface morphology. However, it is essential to 75 study the direct effect of surface roughness, while keeping other parameters such as surface 76 77 wettability or interfacial cavitation unchanged. In this work, the systematic reduction of ice 78 adhesion strength was demonstrated with the decrease of surface roughness regardless of 79 surface wettability. Correlations with other surface characterises such as surface wettability and interfacial cavitation were also studied. Furthermore, in-situ de-icing observation 80 81 validated the intrinsic dependence of ice adhesion strength on surface roughness. The findings indicated that the surface roughness is vital in achieving icephobic performance. 82 83 Ultra-low ice adhesion strength could be achieved by the synergetic effects of low surface roughness and interfacial cavitation/surface energy. 84

85 2 Experimental

5 types of materials/coatings were used in this study and the surfaces were evaluated and compared based on static and dynamic water contact angles (WCAs) including advancing WCAs (AWCAs), receding WCAs (RWCAs) and contact angle hysteresis, surface roughness, and ice adhesion strength. The material types and coatings are summarized in table 1 and their properties are detailed in supplementary table S1.

91 2.1 Substrates and raw materials

Stainless steel 303 (SS 303) and aluminum 2024 (Al 2024-T4) plates with the size of 50 mm
x 20 mm x 3 mm and 50 mm x 20 mm x 1 mm respectively were used. 1H,1H,2H,2HPerfluorooctyltriethoxysilane (POTS) was procured from Fluorochem Ltd UK. Micropolishing cloth and colloidal silica suspension were procured from Struers and MetPrep
respectively. N, N-Dimethylformamide (DMF) was supplied by Sigma-Aldrich UK.

97 Two-part thermoset polyurethanes namely Vytaflex 40A (PU-1), Smooth-Cast Semi-Rigid
98 Series 61D (PU-2), Smooth-Cast 320 70D (PU-3) and Smooth-Cast ONYX 80D (PU-4) were

99 procured from Smooth-on (USA), and thermoplastic polyurethane matrix Estane 54610 (TPU) in form of pellets was provided by Lubrizol (USA). Polydimethylsiloxane (PDMS) R-2180 was purchased from NuSil technology. Hexagonal Boron Nitride nanoparticles with a 102 size of 70 nm (hBN NPs) were obtained from Lower Friction (Canada). Hydrophobic 103 functionalized silicon dioxide nanoparticles AEROSIL R 9200 (nSiO₂) were purchased from 104 Evonik UK. All the materials were used as received.

105 **2.2 Preparation of coatings/surfaces**

All aluminium and stainless steel plates were washed with ethanol and deionized water thriceand then dried using compressed air, prior to testing and further treatment.

The metallic plates were smoothened using grinding and polishing with a series of steps 108 employing sandpapers having grits sizes of (i) 220 and 320, (ii) 400, 600 and 1 µm polishing 109 cloths, and (iii) 0.25 µm (chemically induced) polishing cloths using Metprep colloidal silica 110 suspension particles for samples (i) Al-S1/SS-S1, (ii) Al-S2/SS-S2 and (iii) Al-S3/SS-S3, 111 respectively. Al-SB/SS-SB samples were roughened using a Guyson F1200 sandblaster 112 system with Guyson 180-220 µm alumina particles and Al-fSB/SS-fSB samples were 113 114 subsequently functionalized using POTS by employing chemical vapor deposition (CVD) method as reported elsewhere [45]. 115

PU-1, PU-2, PU-3, and PU-4 resins were prepared using magnetic stirring at Part A : Part B
ratios of 100:100, 100:93, 100:90 and 100:83 respectively. Then the resins were brush coated
on the Al-AR substrates. PU-1 coatings were cured at room temperature (RT) for 16 hours
and post-treated at 65 °C for 4 hours. PU-2 and PU-3 coatings were cured at 30 °C for 5 hours
and post-treated at 65 °C for 4 hours. PU-4 coatings were cured 65 °C for 5 hours and post-treated at 121 °C for 4 hours.

Thermoplastic polyurethane (TPU) coatings were developed by dissolving 1 gram of TPU 122 pellets in 1.5 ml of DMF and the coatings were applied using the dip-coating method. 123 Hydrophobic functionalization of hBN NPs (TPU-f5) was performed in a solution containing 124 400 mg of hBN NPs in 400 ml ethanol and the solution was ultrasonically mixed for 1 hour. 3 125 ml of POTS were added in the solution and the hBN NPs were treated at 80 °C for 120 under 126 reflux. The resultant was separated using a centrifuge method and the hBN NPs were washed 127 several times with ethanol and water. NPs were then overnight dried in an oven at 100 °C. 128 For TPU/hBNs coatings (TPU-5/5f/10/40/60/80), 2 grams of TPU pellets were dissolved in 3 129 130 ml of DMF on a magnetic stirrer at 60 °C. TPU/hBNs coatings with 5/10/40/60/80 wt% of hBN NPs were dispersed in 1/1.5/3.0/4.0/5.0 ml DMF using ultrasonic mixing for one hour 131 respectively. Magnetic stirring was then used to mix the solution in a single vial for 60 132 133 minutes, followed by 30 minutes of ultrasonic mixing. All TPU/hBNs coatings were fabricated using the dip-coating method. 134

For PDMS coatings, magnetic stirring was used to mix 1 gram of PDMS Part A and Part B (1:1) in 3 ml xylene for 3 hours. For PDMS/ nSiO₂ coatings (SHS-5/10/20/40), magnetic stirring was used to mix 1 gram of PDMS Part A and Part B in 1 ml xylene for 3 hours and ultrasonically dispersing 5/10/20/40 wt% of nano-SiO₂ in 2.5/3.0/3.5/4.0 ml of xylene, respectively. The formed nanoparticle dispersions were then mixed with the PDMS solution using magnetic stirring for one hour, followed by 30 minutes of ultrasonic mixing.

141 Chemat Technology spin-coater kW-4A was used to apply the PDMS/ nSiO₂ coatings on Al142 AR samples at a rotation speed of 1500 RPM for one minute and the samples were dried and
143 cured at 60 °C for 60 minutes, and then 150 °C for 150 minutes.

144 Table 1: List of sample types and their compositions

Sample types	Sample names	Surface / substrates	Surface	
			treatment /	Description
			coating	
Aluminium substrates	Al-AR	Al2024 T4	-	-
	Al-SB	Al2024 T4	Sandblasted	-
	Al-fSB	Al2024 T4	Sandblasted	POTS Functionalized
	Al-S1	Al2024 T4	Grinding	Grinded (600 grit)
	Al-S2	Al2024 T4	Polished	1 µm polishing cloth
	Al-S3	Al2024 T4	Polished	0.25 µm Silica particles
	SS-AR	SS 303	-	-
Stainless steel substrates	SS-SB	SS 303	Sandblasted	-
	SS-fSB	SS 303	Sandblasted	POTS Functionalized
	SS-S1	SS 303	Polished	Grinded (600 grit)
	SS-S2	SS 303	Polished	1 µm polishing cloth
	SS-S3	SS 303	Polished	0.25 µm Silica particles
Pristine polymers coatings	PU-1	Al2024 T4	PU	-
	PU-2	Al2024 T4	PU	-
	PU-3	Al2024 T4	PU	-
	PU-4	Al2024 T4	PU	-
Polymeric nanocomposite coatings	TPU	Al2024 T4	TPU	-
	TPU-5	Al2024 T4	TPU	hBN (5 wt%)
	TPI L _f 5	A12024 TA	ΤΡΙΙ	POTS Functionalized
	11 0-15	A12027 17	11.0	hBN (5 wt%)
	TPU-10	A12024 T4	TPU	hBN (10 wt%)
	TPU-40	Al2024 T4	TPU	hBN (40 wt%)
	TPU-60	Al2024 T4	TPU	hBN (60 wt%)
	TPU-80	Al2024 T4	TPU	hBN (80 wt%)
Superhydrophobic coatings	PDMS	Al2024 T4	PDMS	-
	SHS-5	Al2024 T4	PDMS	nSiO ₂ (5 wt%)
	SHS-10	Al2024 T4	PDMS	nSiO ₂ (10 wt%)
	SHS-20	Al2024 T4	PDMS	nSiO ₂ (20 wt%)
	SHS-40	Al2024 T4	PDMS	nSiO ₂ (40 wt%)

146 **2.3 Surface characterization**

A Zeta-20 non-contact optical profiler was used to evaluate the surface roughness. The 147 roughness values in this study were the averages of several measurements (minimum of 30 148 readings at least) and R_a was measured over a line stretching across the observed surface (348 149 μ m x 261 μ m). Shore hardness on the developed polymers was measured using a SAUTER 150 151 durometer having shore hardness A and D scales. The durometer was attached to SAUTER test stands TI-AO and TI-D for shore hardness A and D scales, respectively. The hardness 152 studied in this work was indicative of an average penetration (shore) value based on 10 153 readings of testing. 154

An FEI Quanta 650 ESEM (environmental scanning electron microscope) with controlled humidity and temperature was used to perform in-situ icing observations. In the in-situ icing study, the chamber humidity was raised above 90% RH to wet the surface and the temperature was dropped to sub-zero temperature (down to -5 °C) using a Peltier cooling plate to allow the ice growth over the surface. The system is capable of generating microlevel SEM images for water droplet condensation and icing study, and ice retracting behaviour on the surface was analyzed.

162 **2.4** Evaluation of hydrophobicity and icephobicity

163 Sessile drop technique was used to measure water contact angles (WCAs) using an FTÅ200 164 goniometer and 5 μ l of a controlled volume of water drop was analyzed. The dispense tip 165 method was used to measure dynamic WCAs (advancing and receding angles) with 5 μ l 166 droplets. Advancing and receding WCAs were measured when the base area (contact) of the 167 droplets was increasing or decreasing constantly. The flow rate of the water was kept 168 constant at 1 μ l/s and 5 consecutive values were measured to ascertain the dynamic WCAs values. CAH was calculated from the difference between AWCAs and RWCAs. The testswere conducted at room temperature.

171 A MOOG G403-2053A servo motor was used to measure the ice adhesion strength tests via the centrifugal method and the test was performed in a Design Environmental Chamber 172 (ALPHA 1550-40H) to simulate the freezing conditions. Ice was formed on top of the 173 samples using silicone moulds filled by de-ionized water with controlled volume and the 174 moulds were then flipped upside down and kept against gravity for overnight freezing at -10 175 °C. The samples with the formed ice were then mounted on a carbon fibre reinforced arm via 176 screws and spun at a rotation speed up to 4500 rad/min at 30 rev/min/sec acceleration (3.14 177 radian/second²). The ice adhesion test was conducted at a temperature of -10 °C. 178

179 The ice adhesion strength on the samples can be calculated by,

$$F = mr\omega^2 \tag{1}$$

181 Where ω is the rotational speed (rad/s) at ice removal, r is the rotor length and m is the mass 182 of ice. Shear removal stress can be calculated by,

$$\tau_{ice} = F/A \tag{2}$$

184 Where A is the substrate/ice contact area and F is the centrifugal shearing force.

The centrifugal method to evaluate the ice adhesion strength in this work has previously been applied by many researchers [46-48] and a recent publication indicated its compatibility with the other widely used methods such as horizontal force transducer method [49]. However, for a dynamic test such as the centrifugal method, there is always a risk of inherent motion or shake during the sample mounting procedures [50], and we rectified it by developing multiple rods that could be directly used for ice accretion on the samples and then mounted on the testing rig with minimal impact on the ice bonding. The obtained results closely correlated toin-situ study on surface ice retraction.

193 **3 Results and discussion**

194 **3.1** Growth of ice on developed surfaces

Ice adhesion strength is dependent on various factors including surface variables, purity of water, and the growth of ice over surfaces (heterogeneous or heterogeneous-homogenous mixed formation of ice) [7, 51]). Previous studies (static type tests) suggested that the heterogeneous nucleation is accelerated if the interfacial correlation factor f(m, R') is altered by increasing the effective area of contact or by changing the wettability of the surfaces. Interfacial correlation factor (i.e. probability of ice nucleation) is defined into two parameters i.e. m and R' [41]. m is defined as,

202
$$m = \frac{\left(\gamma_{sf} - \gamma_{sc}\right)}{\gamma_{cf}} \approx \cos\theta^0 \left(-1 \le m \le 1\right)$$
(3)

203 Where γ_{cf} , γ_{sc} and γ_{sf} are the interfacial energies between the crystal phase and the fluid 204 phase, the substrate and the crystal phase, and the substrate and the fluid phase respectively, 205 and θ^0 is the contact angle of the ice nucleus on the substrate. R' is defined as

$$R' = \frac{R}{R_c}$$
(4)

Where *R* is the radius of a flattened surface and R_c are the critical radius of the nuclei on the surface (at a specified temperature and nucleation condition). When $R \ge R_c \sin\theta^0$, the contact angle (where θ^0 is the contact angle of the ice nucleus on the substrate) remains unchanged on the surface and when $R < R_c \sin\theta^0$, the contact angle grows at a rate of $\sin^{-1}(R/R_c)$ as it is limited due to geometric restriction of the surface [41].

Thus the interfacial correlation factor is dependent on the radius of a surface to the critical 212 radius of the surface (R') and the synergetic effect of the average binding affinity of water to 213 214 the surface and interfacial free energies (water/ice-surface) (m). It is assumed that the introduction of low surface energy without changing surface roughness will not significantly 215 prevent ice nucleation. Furthermore, our results also indicated that the surface roughness is a 216 more dominating factor than the effective area and the wettability. In order to effectively 217 validate our hypothesis on surface roughness, we developed a series of surfaces and altered 218 their surface roughness while retaining the surface compositions. 219

220 **3.2** Influence of surface roughness and wettability on ice adhesion strength

In this section, we developed a series of metallic substrates and polymeric coatings with different wettability. The coatings/substrates were carefully fabricated to control the surface roughness and the ice adhesion strength tests were performed on these surfaces.

224 3.2.1 Stainless steel surface

Ice adhesion strengths on stainless steel (SS) surfaces were shown in figure 1. Firstly, the ice adhesion strengths were in correlation with surface roughness and the lowest ice adhesion strength was recorded on SS-S3 samples at 22.2 ± 2 KPa. 33-fold reduction in surface roughness (from SS-SB to SS-S3) resulted in a 3-fold reduction in ice adhesion strength (i.e. adhesion reduction factor, ARF).

However, no significant reduction in ice adhesion strength was observed on SS-S2 and SS-S3, i.e. 25.4 ± 7 and 22.2 ± 2 KPa respectively. Report from the literature [52, 53] indicated a correlation (directly proportional) with the contact angle hysteresis (CAH) but such results were not observed on our SS substrates except for the SS-S2 and SS-S3 samples.



Figure 1: Ice adhesion strength on stainless steel substrates with different surface roughnesses.

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235 **3.2.2** Aluminium surface

Significant reduction in ice adhesion strength was observed on aluminium substrates in comparison to SS substrates, as shown in figure S2 from the supplement. It is imperative to mention that the surface roughness of Al substrates was reduced 24 times (from Al-SB to Al-S3) as compared to a 33-fold roughness reduction on SS substrates. Ice adhesion strength was reduced from 145.5 \pm 3 KPa on Al-AR samples to 13.1 \pm 1 KPa on Al-S3 samples i.e. 91% deduction and ARF of 11. The decrease in ice adhesion strength observed on the metallic samples was mainly achieved by altering just one surface parameter, i.e. surface roughness.

In comparison with SS substrates, a similar pattern of ice adhesion strength dependence on surface roughness is noticed on Al substrates. Ice adhesion strength highly correlated with the reduction of surface roughness when above 100 nm and smoothening of substrates with roughness of less than 100 nm i.e. Al-S2 and Al-S3 (and SS- S2 and SS-S3 in section 3.2.1) did not produce a significant change in ice adhesion strength. Interestingly, for the metal substrates, CAH is demonstrating some correlation with ice adhesion strength until surface roughness reaches ~0.5 μ m and loses the correlation when the surface roughnes is higher than 0.5 μ m. However, the value of 0.5 μ m is not a rigid figure and the assumption is made based on the available results. Another considerable observation is that Al-S2 and Al-AR have similar CAHs but the ice adhesion strength varied by ~89% (reduction).

253 3.2.3 Polymeric surfaces

254 3.2.3.1 Pristine polymeric coatings

Polymeric nanocomposite showed a drastic change in ice adhesion strength with surface
roughness and a similar pattern of ice adhesion strength dependence on surface roughness (in
comparison with other coatings) was followed on polymeric surfaces i.e. PDMS, PU-1, PU-2,
PU-3, and PU-4 coatings, as indicated in figure 2.



Figure 2: Ice adhesion strength on pristine polymeric coatings with different surface roughnesses.

259

Although the surface energy of the studied coatings might differ, the basic composition of PU-based coatings was assumingly the same. The highest ice adhesion was measured on PU-3 coatings at 117.6 \pm 13.3 KPa and the lowest was 2 \pm 0.8 KPa on PU-1 coatings. Interestingly, the PDMS and PU-1 coatings had hydrophobic and hydrophilic polymeric matrixes, respectively. But their ice adhesion strength did not vary considerably. This development highlights the intrinsic effect of surface roughness over ice adhesion strength regardless of the influence of wettability. In terms of CAH relevance for the pristine polymeric coatings, ice adhesion strength did not correlate with CAH as their roughnesses were lower than $0.5 \,\mu$ m.



Figure 3: Ice adhesion strength versus shore hardness of pristine polymers.

269

Another engaging observation is the dependence of hardness of the polymeric coatings as 270 shown in figure 3. It was reported that ice adhesion strength decreased with the decreased 271 272 polymer cross-link density which corresponded to the reduction of mechanical properties of the polymers. It is a phenomenon known as inter-facial cavitation [54, 55]. As the ice forms, 273 it would be worth looking into the formation of ice over different polymers having different 274 275 hardness. From figure 4, it is suggested that the ice adhesion strength on polymeric surfaces increased as the shore hardness is increased at first. However, the ice adhesion strength is 276 277 quite low on PU-4 coatings with a shore hardness of 80D. Considering PU-4 is the hardest among the developed polymers, the hardness of the polymer could be a secondary factor for 278

ice adhesion strength as PU-4 has lower surface roughness as compared to PU-2 and PU-3coatings.

281 **3.2.3.2** Polymeric nanocomposite coatings

Surface roughness of TPU-hBN coatings was controlled using the incorporation of nanoparticles in the polymer matrix. Higher amount of nanoparticles reflected the high change in surface roughness and vice versa. Again, the ice adhesion strength clearly correlated with surface roughness as indicated in figure S3.

Interestingly, the ice adhesion strength dropped drastically from TPU-60 to TPU-5 samples. However, it remained stagnant on TPU-60 and TPU-80 samples, and CAH went irrelevant. In all the cases, the effect of surface roughness was instrumental on ice adhesion strength and could not be neglected. Ice adhesion strength on TPU-80 coatings decreased from 141.22 ± 7 KPa to 25.9 ± 2 KPa on TPU-5 coatings, i.e. a 5-fold reduction.

291 **3.2.3.3** Superhydrophobic polymeric coatings

292 In the previous section, we demonstrated the dependence of ice adhesion strength over surface roughness regardless of the wettability. In this section, we intend to study the effect 293 of the surface altered from hydrophobic to superhydrophobic (with the same material 294 composition) as shown in figure 4. SHS-5 was a hydrophobic coating and ice adhesion on 295 this coating was measured to be 5.4 \pm 2 KPa, mainly due to the effect of inter-facial 296 cavitation as mentioned in sub-section 3.2.3. SHS-5/SHS-10/SHS-20 were superhydrophobic 297 coatings and their ice adhesion strengths increased as the concentration of SiO₂ nanoparticles 298 299 in the polymer matrix were increased.



Figure 4: Ice adhesion strength versus surface roughness of superhydrophobic coatings.

300

Five key points of view can be drawn from these results. Firstly, when the wettability of 301 PDMS-nSiO₂ coatings was tuned from hydrophobicity to superhydrophobicity, there was no 302 significant change in ice adhesion strength. This could be the result of either the hardening of 303 nanocomposite coatings drive the ice adhesion strength up or the anchoring points for the ice 304 were enhanced. Secondly, the ice adhesion strengths on SHS-10 and SHS-20 tend to remain 305 in the same range which gives the idea that the superhydrophobicity induced icephobicity 306 was imparted to the coatings. Superhydrophobicity induced icephobicity is basically 307 308 icephobicity achieved using minimal contact with surface asperities which results in less influence of surface properties (heterogeneous ice nucleation) and disrupts heat exchange 309 between ice and the surface which leads to weakly bonded ice (discouragement of 310 solidification frontier formation). Thirdly, the surface roughness becomes a dominant factor 311 in SHS-40 coatings and the anchoring (mechanical interlocking of ice) was imminent. 312 Fourthly, the surface roughness remained a considerable factor in all the results and followed 313

suit along with other hydrophobic and hydrophilic coatings/substrates. Lastly, CAH showed
no direct relationship to reduce the ice adhesion strength for PDMS-nSiO₂ coatings.

316 **3.3** Overview of the influence of surface roughness on ice adhesion strength

Ice adhesion strength versus variable surface roughness discussed in section 3.2 is 317 summarized in figure 5. Overall, the ice adhesion strength tends to decrease with the 318 reduction in surface roughness values. Ice adhesion strength above 160 KPa could not be 319 determined due to the equipment limitation. However, there is sufficient evidence in the 320 321 available literature of increased ice adhesion strength beyond 160 KPa with an increase in surface roughness. Momen et al. [20] reported ice adhesion strengths of 220 KPa and 270 322 KPa at Ra values of 5 µm and 8 µm respectively, using a similar centrifugal method. Another 323 324 study involving blade de-icing under centrifugal influence reported a 250% increase in ice 325 adhesion strength, i.e. ~200 KPa to ~670 KPa on samples with a surface roughness Ra of 0.65 µm to 2.67 µm, respectively [56]. Hassan et al. [57] found a linear correlation on 326 327 samples having surface roughness Ra of 0.47 to 1.65 µm and ice adhesion strength of 142 KPa to 2279 KPa. 328

329 The lowest surface roughness in figure 5 corresponds to SS-S3 substrates. However, PU-1 coatings have the lowest ice adhesion strength among the studied surfaces. This signifies the 330 collective or synergetic effect of surface properties such as surface energy or inter-facial 331 332 cavitation that affect icephobic performance. The ice adhesion strength test was conducted based on bulk ice accretion (glaze ice) and it would be worthwhile to look into different 333 methods such as impact ice (in-cloud ice) and hard rime ice (precipitated ice). A recent study 334 335 that suggested higher ice adhesion strength may occur in these methods [58]. The data in figure 5 can also be categorized into two groups: one is hydrophobic and hydrophilic coatings 336 and the other is superhydrophobicity induced icephobic coatings. Although ice adhesion 337

strength on both coating groups has a correlation with surface roughness, superhydrophobic coatings tend to be rougher in comparison to other coatings and maintain promising icephobic performance in high roughness ranges and showed no correlation with CAH. This can be justified as superhydrophobicity induced icephobicity is mainly achieved by reducing the cross-sectional area of water contact, thus the effect of surface roughness is minimal but evident.



Figure 5: Overview of ice adhesion strength versus variable surface roughnesses.

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345 **3.4 Influence of surface energy on ice adhesion strength**

We have so far justified the influence of surface roughness on ice adhesion strength. However, we did not explicitly check the influence of surface energy with similar surface roughness. Al-fSB/SS-fSB and TPU-f5 were functionalized using POTS via chemical vapor deposition and nanoparticle functionalization, respectively. Substrates/coatings were developed with similar surface roughness ($\pm 0.05 \mu m$) and identical samples were used for WCA and ice adhesion strength tests (three samples each) to avoid the degradation of POTSlayers due to hydrolysis [59].



Figure 6: Ice adhesion strength: application of low surface energy chemical.

353

The ice adhesion strength results indicated that the introduction of low surface energy on the 354 surfaces aided the easy removal of ice and resulted in lower shear strength, compared to the 355 non-functionalized surface as indicated in figure 6. It is imperative to mention that the 356 introduction of a low surface energy chemical on the surface rendered the surface 357 hydrophobic but no significant change in receding angles was observed. These results are in 358 conflict with other studies [14, 25, 46, 60] which indicated the influential and direct 359 proportional roles of receding angles on ice adhesion strength. Zou et al. [5] reported the 360 reduction of ice adhesion strength on functionalized surfaces having similar surface 361 roughness and nearly doubled ice adhesion strength on sandblasted aluminium substrates as 362 compared to bare aluminium substrates. This study correlated well with our results. The 363 364 application of the low surface energy treatment resulted in an average decrease of 47% in ice adhesion strength across the tested surfaces. 365

366 4 In-situ icing studies

Based on the discussion above, we have thoroughly explained the influence of surface 367 roughness on the ice adhesion strength and how it changes with the introduction of low 368 surface energy treatment. Furthermore, it would be interesting to observe the visualization of 369 the ice anchoring process. In this section, in-situ icing observation was conducted on Al-AR, 370 Al-S3, SS-AR, SS-S3, SHS-40, and TPU-10BN surfaces. The surfaces were carefully 371 selected to consider the effect of surface roughness. The ice was nucleated at high humidity 372 conditions (90-98% RH) under low-pressure on a cold Peltier stage (-8 °C to -3 °C). Ice was 373 formed on the studied surfaces at different temperatures as the thermal gradient across the 374 observed surfaces changed. Similar technique was also employed in other studies, and in-situ 375 ice growth (growth of water droplets in the void valley) was confirmed on superhydrophobic 376 surfaces [61-63]. Above mentioned conditions also set to induce capillary action of water 377 droplets among the surface grooves and the ice would form in and around the surface rough 378 asperities. This icing condition would nullify the effect of superhydrophobic surfaces by 379 inducing micro-condensation and forming a thin layer of ice. The formed in-situ ice was 380 retracted at higher temperatures (above the freezing temperature on the top surface) and 381 lower humidity levels (60-80% RH) to ensure controlled receding of the ice. 382

383 4.1 Al-AR and SS-AR surfaces

The ice retraction process on Al-AR substrates is depicted in figure 7 (a-f). Figure 7a illustrates the direction of the retraction and figure 7b shows the weakening of the ice and fragmentation of the ice into smaller sections. Retracted ice is clearly indicated in figure 7c, 7d, 7e, and 7f, and the ice anchoring is evident throughout the ice retraction process.



Figure 7: In-situ icing retraction on Al-AR samples after (a) 0, (b) 20, (c) 60, (d) 80, (e) 140, and (f) 160 seconds.

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As the retraction process continues in figure 7c, the ice starts to break into segments and shows early signs of anchored ice. Anchoring of ice is clearly observed in figure 7d even after the 80 seconds of the ice retraction process. Finally, the initial anchored ice is fully retracted (figure 7e), and the ice anchoring is maintained in the second layer of block ice. The ice anchoring mechanism is fully validated in figure 7f, when the second layer of ice anchoring is completely detached from the main ice block and the second layer of ice continues to remain anchored on the surface as indicated (circled) in figure 7f. It is imperative to mention that the micro-sized ice in the surface rough grooves provides anchoring points of the ice to strongly adhere to the surface and the ice adhesion strength would be significantly higher. Similar behavior was observed on SS-AR substrates, but the ice anchoring was less severe compared to Al-AR, owing to the difference in material composition as well as the surface roughness.

401 **4.2 Al-S3 and SS-S3 surfaces**

In comparison to the as-received substrates, SS-S3 substrates were deployed for the in-situ
icing study and the ice was formed uniformly throughout the observed surface. Interestingly,
there is no ice anchoring present on the smoothened substrates as evidenced in figure 8.



Figure 8: In-situ icing retraction on SS-S3 samples after (a) 0, (b) 40, (c) 60, and (d) 80 seconds.

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406 Uniform formation of ice can be observed in figure 8a, and the possible ice anchoring407 points/sites are identified in figure 8b. In figure 8c, the ice retracts and does not anchor as

408 previously noted on the as-received substrates. Ice continues to retract without anchoring as 409 indicated in figure 8d. These are promising results as it visualizes the effect of surface 410 roughness and highlights its importance on ice adhesion strength which indicates a similar 411 correlation. These studies validate the effect of micro-condensation on ice adhesion strength 412 and subsequently on icephobic performance.

413 **4.3 Superhydrophobic surfaces**

SHS-40 had a superhydrophobic surface and the ice anchoring mechanism was evident. The ice anchoring was severe and the effect of this ice anchoring was also verified from ice adhesion strength as its ice adhesion strength raised 5.4 times as compared to the SHS-5 surface.



Figure 9: In-situ icing retraction on SHS-40 samples after (a) 0, (b) 40, (c) 60, and (d) 80 seconds.

In figure 9a, the ice anchoring is developing vigorously and the possible ice anchoring points are marked in figure 9b. Developed ice remains even after 80 seconds of ice retraction process as observed in figure 9c, and stubborn ice anchoring is observed on these surfaces as illustrated in figure 9d. The size of the anchor was considerably large in size (10-30 μ m) and was comparable to Al-AR substrates in section 4.1. Preliminary results suggest that the superhydrophobicity of the surface neither had a mitigating effect on the level of anchoring nor it prevented the anchoring to occur.

426

4.4 Polymeric nanocomposite coatings

The ice retraction process on the TPU-10BN surface narrated a significantly different 427 concept, as shown in figure 10. In figure 10a, instead of retracting outward towards the edge 428 429 of the coating (as observed on other coatings/surfaces), the ice simply started the melting at 430 the accretion positions. In figure 10b, the ice was melting in fragmented sections and smaller patches of ice were anchored on the surface as indicated. These patches of ice became more 431 432 visible in figure 10c, and these patches stayed on the observed surface even after the big blocks of ice were completely melted (figure 10d). These results depicted the intense and 433 stubborn ice anchoring mechanism. In comparison to the ice adhesion strength results, TPU-434 10BN did not show higher ice adhesion strength which signified the effect of inter-facial 435 cavitation and the ice detaches due to the soft nature of the polymer matrix. 436

Furthermore, as the concentration of BN particles increased in the TPU-BN nanocomposites, the ice adhesion strength of these nanocomposites nearly equated that measured on the SS-AR substrates. Thus, it could be assumed that the inter-facial cavitation became less effective with the hardening of the polymer. The possible assumption of this significant increase in ice adhesion strength is the severity of ice anchoring observed on TPU-BN nanocomposites which leads to a stronger ice bond on the surface.



Figure 10: In-situ icing retraction on TPU-10BN samples after (a) 0, (b) 40, (c) 60, and (d) 80 seconds.

443

444 **5** Conclusions

Surface roughness and superhydrophobicity have been long debated for inducing icephobicity and contradictory results were reported in anti-icing and de-icing applications. In this work, the systematic reduction of ice adhesion strength was demonstrated with the decrease of surface roughness regardless of surface wettability.

449 On metallic surfaces, ice adhesion strength was reduced dramatically by lowering the surface 450 roughness, without any surface coating and functionalization. For aluminium specimens, 451 surface roughness was reduced by 24-fold which resulted in an 11-fold or ~91% reduction in 452 ice adhesion strength. Ice adhesion strength on polymeric coatings also decreased with a 453 decrease in surface roughness. Superhydrophobicity-induced icephobicity was evident on 454 PDMS-nSiO₂ coatings, but with a higher concentration of functionalized silicon dioxide 455 nanoparticles in the PDMS matrix, ice adhesion strength surged mainly due to the increase in456 the surface roughness.

These results were further validated by deploying in-situ icing study and ice did not anchor 457 on smoothened metallic surfaces but anchored on the as-received metallic surfaces and 458 polymeric coatings. Surface wettability did not correlate with ice adhesion strength based on 459 our results. The studied PDMS and PU coatings are hydrophobic and hydrophilic, 460 respectively. However, their ice adhesion strengths did not change considerably. On the 461 contrary, low surface energy treatment on the surface showed a direct reduction of ice 462 adhesion strength. These results signify the synergetic effect of surface roughness and surface 463 energy on ice adhesion strength (in line with the interfacial correlation factor) as the 464 developed pristine polymers were comparably smooth. Furthermore, the functionalization of 465 466 surfaces with low surface energy layer would not be confused with the wettability as no significant changes in receding angles were observed on the treated coatings. Additionally, it 467 is imperative to mention that the superhydrophobic coatings demonstrated a reduction in 468 contact angle hysteresis as the concentration of functionalized silicon dioxide nanoparticles 469 increased but there was no clear reduction in ice adhesion strength (in correlation with CAH) 470 471 as debated in the available literature. Interestingly, CAHs of all the studied surfaces (except pristine polymeric and superhydrophobic coatings) demonstrated a strong correlation with ice 472 473 adhesion strength below the surface roughness of $R_a 0.4 \mu m$.

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