# Solute effects on dynamics and deformation of

# emulsion droplets during freezing

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### Abstract

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- Soft or rigid particles, suspended in a liquid melt, interact with an advancing
- solidification front in various industrial and natural processes, such as fabrica-
- tion of particle-reinforced-composites, growth of crystals, cryopreservation, frost
- 17 heave, and growth of sea ice. The particle dynamics relative to the front de-
- termine the microstructure as well as the functional properties of the solidified
- material. The previous studies have extensively investigated the interaction of
- $_{20}$  foreign objects with a moving solid-liquid interface in pure melts while in most
- $_{\rm 21}$   $\,$  real-life systems, solutes or surface active impurities are almost always present.
- 22 Here we study experimentally the interaction of spherical oil droplets with a

moving planar ice-water interface, while systematically increasing the surfactant concentration in the bulk liquid, using in situ cryo-confocal microscopy. We demonstrate that a small amount of surfactant in the bulk liquid can instigate long-range droplet repulsion, extending over a length scale of 40 to 100  $\mu$ m, in contrast to the short-range predicted previously ( $< 1 \mu$ m). We report on the droplet deformation, while they are in contact with the ice-water interface, as a function of the bulk surfactant concentration, the droplet size, and the crystal growth rate. We also depict the dynamic evolution of solute-enriched premelted films ( $\approx 5 \mu$ m). Our results demonstrate how an increasing concentration of surfactant in the bulk and its subsequent segregation during solidification can dramatically alter the solidification microstructures. We anticipate that our experimental study can serve for the development of theoretical models incorporating solute effects.

Keywords: solidification, solute, droplets, deformation, dynamics

### <sub>17</sub> 1 Introduction

The interaction of particles with an approaching solid-liquid interface is of special relevance in nature, like frost heave, glacial motion [1], and in engineering sciences, such as food freeze-thaw stability [2], cryopreservation [3, 4], metallurgy [5], and crystal growth [6]. This dynamic problem consists of particles, soft or hard, dispersed in a liquid melt interacting with a solid-liquid interface. The objects can be biological cells in cryopreservation [3, 4], colloids in freezecasting [7], droplets in food preservation [8], gas bubbles in growth of single crystals [6, 9] and metallurgy [5], or reinforcing particles in material-matrixcomposites [10]. The outcome of the particle-interface confrontation determines the solidified microstructure and hence, the functional properties of the solidified material. It is essential to understand the underlying mechanisms of solidification (or freezing) to forge the required material microstructure. The particle can interact with an advancing solidification interface with diverse outcomes; it can be engulfed instantaneously upon contact, pushed ahead in the remaining liquid by the interface indefinitely, or it may undergo engulfment after being pushed over a certain distance [11]. The shape of the particle (deformed or undeformed) becomes an equally important processing criterion in applications where soft deformable objects (droplets or bubbles) encounter a moving solid-liquid interface. Numerous interaction scenarios, still poorly understood, can therefore exist during solidification. 58 The role and concentration of solute in the solidifying liquid is often significant and a dominating factor in determining, amongst others, the shape of the solid-liquid interface in the vicinity of the suspended particles [12–14]. Solutes render the interfacial curvature concave, thereby promoting engulfment of objects at growth rates lower than those predicted for planar curvatures [15, 16]. The solutes can be either desired, like additives (e.g. cryoprotectant used in preservation of biological cells), or be present as an undesired impurity, such as dissolved gases (H<sub>2</sub>) in liquid metals or surface active impurities. The segregation of solutes at the interface is instigated by their relatively low solubility in the solid phase and enhanced further by the approaching objects obstructing their diffusion field [12]. This local solute enrichment is of particular importance in understanding the nucleation and growth of macroporosity in solidifying melts [13], studying the constitutional supercooling with formation of premelted films [17, 18], and in determining the osmotic stresses acting on a freezing biological cell [4,19] to give a few examples. Moreover, the morphology of a solid-liquid interface (planar, columnar, or dendritic), determined by the magnitude of solute concentration gradient build-up ahead of the growing solid, plays a major role on the final microstructure [12,20].

Past studies have formulated a plethora of analytical and numerical models expressing the outcome (engulfment or rejection) of objects interacting at close

Past studies have formulated a plethora of analytical and numerical models expressing the outcome (engulfment or rejection) of objects interacting at close distances (< 10 nm) with the solid-liquid interface [15,21–24]. The models vary in the mathematical formulation of the features taken into account (e.g. the inclusion of object-melt thermal conductivity mismatch, solute effects etc...), while using a similar approach (balance of repulsive and attractive forces between the object and front) to describe the interaction [11].

The study of particle deformation has been of particular interest in the prediction of pore shape evolution during directional solidification of crystals to avoid or control porosity defects. Much of the progress in this domain has been achieved through numerical simulations and post-solidification analysis [25, 26]. In situ experimental evidence of solidification dynamics (repulsion or engulfment) and shape modification have been facilitated using transparent analogs (e.g. succinonitrile-acetone) with optical microscopes at ambient temperatures [20, 27] and X-ray transmission microscope at elevated temperatures [13, 28]. However, the volume investigated along with the temporal resolution is limited, while the local solute segregation cannot be visualized. Hence, the tracking of microstructures where objects interact with a solid-liquid interface in the presence of solute effects remains challenging.

In this study, we analyse the interaction of spherical oil droplets with an advancing ice-water interface using *in situ* cryo-confocal microscopy. We investigate the impact of an increasing surfactant concentration on the mechanisms involved at three different stages: droplets in water (water) far from the solidification front, droplets in contact with an approaching solid-liquid interface, and droplets captured in the growing ice. The three interaction stages are crucial in determining the droplet spatial distribution and shape evolution, and hence, the solidification microstructure.

### $_{04}$ 2 Methods

#### 05 2.1 Materials

We purchased the oil (propyl benzoate), surfactant (Tween 80), oil fluorophore (Difluoro2-[1-(3,5-dimethyl-2H-pyrrol-2-ylidene-N)ethyl]-3,5-dimethyl-1H-pyrro lato-Nboron), and aqueous fluorophore (Sulforhodamine B) from Sigma-Aldrich. The fluorophores are referred to as BODIPY (incorporated in oil) and SRhB (incorporated in water) in the study. We cycled the deionized water through 0.45  $\mu m$  Nylon membrane filters (VWR International) to remove traces of impurities and ensure purity of the emulsions prepared. We chose propyl benzoate owing to its low melting temperature ( $T_m = -51.6^{\circ} C$ ), low solubility in water (0.035 g/100 g), and similar density to water ( $\rho_{oil} = 1.023 g \cdot cm^{-3}$ ).

#### 115 2.2 Sample Preparation

We prepared the oil-in-water emulsions using a microfluidic setup, as explained in our previous study [14]. The monodisperse droplets have radii  $(R_1, R_2)$  of either  $7.2 \pm 0.4~\mu m$  or  $30.9 \pm 1.2~\mu m$ , as shown in Supporting information. The oil phase consisted of propyl benzoate with  $10^{-4}~M$  BODIPY to obtain clear imaging of dispersed droplets at 1% laser power. For the aqueous phase, we used  $10^{-5}~M$  SRhB solution, as self-quenching was reported at concentrations above  $2 \times 10^{-4}~M$  [29]. We added Tween 80 (HLB=15~[30]), a non-ionic surfactant,

to the aqueous phase to stabilise the oil droplets. The surfactant Tween 80 (cmc  $=13-15 \ mg \cdot l^{-1}$  [31]) also acts as a solute and hence colligatively depresses the freezing point of solutions, when its concentration increases locally [14]. We prepared three agueous solutions with 0.01, 0.1, and 1 wt.% Tween 80 to study the impact of solute concentration on the solidification dynamics and behaviour of oil droplets dispersed in an aqueous phase. The surfactant is added as wt.% of the aqueous solution to have an equal concentration in all the solutions prepared. The concentration of surfactants in the bulk solution at which micelles start 130 forming is known as the cmc. Individual surfactant molecules that are in the 131 system but are not part of a micelle are called monomers [32]. At 1wt.% of 132 Tween 80 in aqueous solution we are  $\approx 600 \times cmc$ . All experiments are therefore 133 performed above the cmc and increasing the surfactant concentration results in an increase of the number of micelles in solution while the concentration of surfactant monomers remains approximatively equal to the cmc. The presence of micelles at the given concentration was confirmed by dynamic light scattering 137 (DLS) analysis. A typical micelle size of 9 nm with a corresponding diffusion 138 coefficient of 30  $\mu m^2 \cdot s^{-1}$  at 273 K was obtained from the DLS analysis. The 139 prepared emulsions were filled through capillarity and solidified in a rectangular 140 Hele-Shaw cell (height =100  $\mu m$  and volume =100  $\mu l$ ). We fabricated the Hele-141 Shaw cell using two glass slides (Menzel,  $24 \times 60 \ mm$ , thickness  $0.13 - 0.16 \ mm$ ), 142 and sealed it with nail-polish at one end to prevent evaporation and leakage.

#### 4 2.3 Imaging & Analysis

We used a Leica TCS SP8 confocal laser scanning microscope (Leica Microsystemes SAS, Germany) equipped with 488 nm (blue), 552 nm (green) lasers and two photodetectors (PMT) for image acquisition. The images were captured for the emission spectra of BODIPY (oil phase) and SRhB (aqueous phase), using a non-immersive objective (Leica HCX PL APO CS  $20\times$ ) with a working distance of 590  $\mu m$ . Ice does not fluoresce and hence, we can simultaneously detect three phases (oil droplets, unfrozen aqueous phase, and ice) with two

photodetectors. In 2D, we used the microscope at a scanning speed of 600 Hz, with  $1024 \times 1024$  pixels for imaging  $775 \times 775$   $\mu m$ , resulting in 1.7 s per frame.

We used Fiji [33] for image thresholding in conjunction with Python [34] for image and data analysis.

#### 56 2.4 Freezing Stage

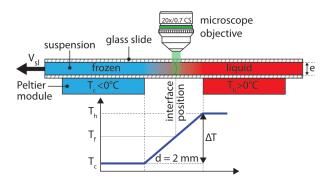


Figure 1: Cryo-confocal microscope setup to perform in situ solidification experiments. A Hele-Shaw cell containing an oil-in-water emulsion is pulled at a constant velocity  $(V_{sl})$  through a constant linear temperature gradient (G), established by two Peltier elements. In steady-state, the solidification interface is at a constant position under the microscope objective.

We conducted unidirectional solidification experiments, translating the sample cell at a constant velocity  $(V_{sl})$  along a constant linear temperature gradient (G)158 of  $10^4 \ K \cdot m^{-1}$ , using the cryo-confocal stage described in detail previously [35]. 159 We imposed the temperature with two Peltier modules, and controlled it with 160 high precision ( $< 0.01 \, ^{\circ}C$ ) using TEC-1122 Dual Thermo Electric Cooling Tem-161 perature Controller from Meerstetter Engineering, Switzerland. The Peltier elements were separated by a distance of 2 mm to establish a linear temperature gradient. The in situ observation of objects interacting with the solid-liquid interface was achieved using a confocal microscope mounted vertically over the gap (2 mm) between the two Peltier modules, as shown in Fig.1. Using this set up the solidification interface appears immobile in the frame of observation. We 167 utilised the VT-80 translation stage (Micos Pollux Drive PI, USA) to impose the rate at the which the sample cell is pulled through the temperature gradi-

ent. The rate of translation was verified to be in agreement with the measured solidification velocity  $(V_{sl})$ , using posterior image analysis (error < 1 %). Thus, we can decouple and control independently the solidification velocity  $(V_{sl})$  and the thermal gradient (G) in our system. We performed the solidification experiments in the velocity range of 174  $1.0 \le V_{sl} \le 10.0 \ \mu m \cdot s^{-1}$ . We wait for  $20 - 30 \ mins$  to ensure a steadystate diffusion controlled regime before starting the acquisition at a given solidification velocity. The time needed for a steady-state to establish scales as  $2D/V_{sl}^2\approx 60~s,$  where D is the solute diffusion coefficient. We do not expect 178 forced convection in our experiments as they are performed in a closed Hele-Shaw cell of small thickness (100  $\mu m$ ) and at low solidification velocity with a steady linear temperature gradient. The solid-liquid interface is stable over extended time periods ( $\approx 4-5 \ hours$ ) and the interface does not accelerate or decelerate during the solidification experiments. In addition, we do not observe a transient unsteady regime and the interface morphology is stable for the given 184 experimental parameters.

#### $_{\circ}~3~~{ m Results}~\&~{ m Discussions}$

We performed horizontal solidification experiments by displacing a Hele-Shaw cell, containing an oil-in-water emulsion, with our custom cryo-confocal stage, at a velocity of  $V_{sl}$ . A typical 2D confocal image of a freezing emulsion with the distinct features observed is shown in Fig.2A. The confocal image enables us to distinguish three phases; oil phase in cyan (fluorophore BODIPY), water in colormap viridis (fluorophore SRhB), and a dark ice phase. As solidification progresses, the growing ice phase rejects the dissolved dye, SRhB, owing to its low solubility and hence appears black, which enables us to visualize the solid-liquid interface. In the frame of observation, the interface is stationary. In the frame of the sample, the interface is advancing through the sample at a velocity of  $V_{sl}$  along  $\vec{x}$  and eventually encounters droplets which velocity, noted

 $U_r$  (defined in Fig. S2) is indicated in Fig.2A. We also note the premelted films between two ice surfaces as well as around the oil droplets captured in the ice phase, which are due to the rejection of the dye by the ice and subsequent depression of the freezing point.

A typical time-lapse evolution of an isolated oil droplet interacting with
the ice-water interface obtained for an oil-in-water emulsion with 1wt.% Tween
80 in the aqueous phase is shown in Fig.2B. The interaction of oil droplets
with the solid-liquid interface can be divided in three different stages, which
are described below in three different sections and which dynamics depends on
the surfactant concentration and advancing velocity. First, we investigate the
solidification mechanisms at play when the oil droplets in the water phase far
from the advancing interface. Secondly we report the evolution of the droplet
shape upon contact with the interface. Third we analyse the droplets captured
in ice and report on the evolution of premelted films with the associated icewater meniscus.

#### 3.1 Droplets in water

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From each experiment, we acquire 50-400 droplet trajectories and for each trajectory we measure the droplet velocity in the frame of observation  $U' = \delta x/\delta t$ with x being the distance to the interface and t the time (see Fig. S1 for the definition of x and t). We then deduce the velocity of the droplets in the sample frame  $U_r = V_{sl} - U'$ . We then average over 50 - 400 droplets to obtain 218 the mean velocity  $\overline{U} = \langle U_r \rangle$  (see details in Fig. S2 and Reference [18] for the python script). Using these notations, a positive magnitude of  $\overline{U}$  implies that 220 the droplets are repelled or pushed by the moving ice-water interface towards 221 the remaining liquid. 222 In Fig.3, we present the mean droplet velocity,  $\overline{U}$ , with the distance to 223 interface for an interface velocity of  $V_{sl}$  of 3  $\mu m \cdot s^{-1}$ . We define the distance to interface as  $0 \mu m$  when the front edge of the droplet comes in contact with the

absolute detected position of the ice-water interface.

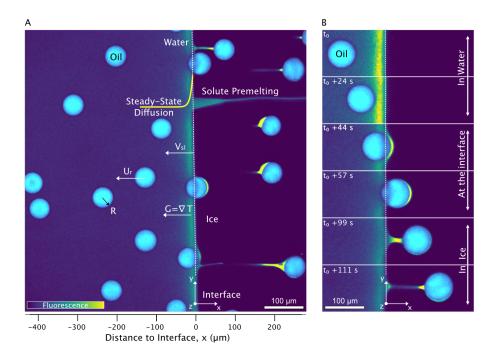


Figure 2: 2D cryo-confocal image of freezing an oil-in-water emulsion in the presence of 1wt.% Tween 80 in the aqueous phase. (A) Typical features observed for a planar growth at  $V_{sl}=2~\mu m\cdot s^{-1}$  (B) Time-lapse evolution of an oil droplet encountering an approaching solid-liquid interface with three distinct regimes of interaction at  $V_{sl}=2~\mu m\cdot s^{-1}$ . Ice is in black, oil droplets in cyan, and the aqueous phase is in colormap viridis (fluorescence bar). © (2020) S. Tyagi et al. (10.6084/m9.figshare.14815083) CC BY 4.0 license https://creativecommons.org/licenses/by/4.0/.

At large distances from the interface, larger than 100  $\mu m$  the droplets in 227 water are unperturbed and their mean velocity  $\overline{U}$  in the sample frame is zero. 228 As they get closer to the interface, they start getting repelled. The mean droplet 229 velocity  $(\overline{U})$  increases and exhibits a maximum  $(U_{max})$ , when the leading edge 230 of the droplets coincides with the initial position of the growing crystal. We note 231 that the droplet velocity  $\overline{U}$  is lower than  $V_{sl}$ , which means that the droplets are finally captured in ice. As the droplets are captured in ice, their velocity  $\overline{U}$ returns to zero. As shown in Fig.3,  $\overline{U}$  decreases for a larger droplet size, while it increases with an increasing surfactant concentration. From the evolution of  $\overline{U}$  with the distance to the interface, we define a char-236 acteristic length scale,  $L_v$ , corresponding to the distance at which the droplets

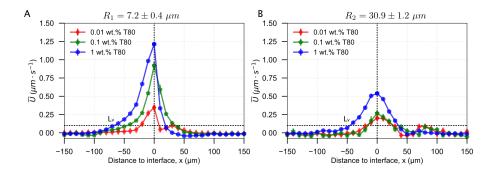


Figure 3: Droplet dynamics in presence of 0.01, 0.1, and 1wt.% solute in solution, deduced from the droplet trajectories at  $V_{sl}=3~\mu m\cdot s^{-1}$ . Mean droplet velocity versus distance to interface for (A)  $R_1=7.2\pm0.4~\mu m$  and (B)  $R_2=30.9\pm1.2~\mu m$ . The droplets accelerate as the solidification front approaches, and decelerate as they are engulfed into the ice. © (2020) S. Tyagi *et al.* (10.6084/m9.figshare.14815083) CC BY 4.0 license https://creativecommons.org/licenses/by/4.0/.

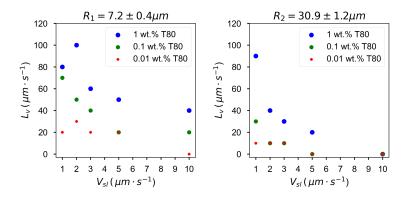


Figure 4: Characteristic length scale  $L_v$  versus Solidification Velocity  $(V_{sl})$ , for different solute concentrations (wt.%). Left:  $R_1 = 7.2 \pm 0.4 \ \mu m$  and right:  $R_2 = 30.9 \pm 1.2 \ \mu m$  droplets. The distance  $L_v$ , where droplets in water start getting repelled by the interface, increases significantly with the solute concentration, while it decreases with an increasing growth rate. © (2020) S. Tyagi et al. (10.6084/m9.figshare.14815083) CC BY 4.0 license https://creativecommons.org/licenses/by/4.0/.

attain a mean velocity  $(\overline{U})$  of  $0.1 \ \mu m \cdot s^{-1}$ , which is shown in Fig.4. This distance corresponds to the range of interaction between the droplets and the interface. We find that the droplets get repelled over distances ranging between 10 and  $100 \ \mu m$ , often larger than their diameter, especially for the largest surfactant concentrations. Smaller droplets with radius  $R_1$  are repelled at greater distances from the interface as compared to the larger  $R_2$  droplets. Increasing the growth rate decreases the characteristic distance  $L_v$ .

The results described so far show that an increasing amount of surfactant induces a repulsion of the droplets by the interface over large distances, of the order of ten to a hundred of microns away from the interface and that the droplet dynamics is influenced by the bulk surfactant concentration, the growth rate and the droplet size. These three parameters control the local gradient of surfactant concentration close to the solidification front. Indeed the surfactant concentration close to the solid-liquid interface is higher as compared to the bulk concentration far from the interface because of its low solubility in ice.

For steady-state planar growth, the concentration field of rejected solutes in the remaining liquid writes

$$C_L = C_0 + C_0 \left(\frac{1 - K_0}{K_0}\right) exp\left[\frac{-V_{sl}}{D}|x|\right]$$
(1)

where  $C_L$  is the solute concentration at a distance x from the interface,  $C_0$ is the bulk solute concentration in the liquid far from the interface, D is the solute diffusion coefficient and  $K_0$ , the partition coefficient defined as the ratio of surfactant concentration in the solid phase to the one in the liquid [36]. In a previous article [18], we suggested that the displacement of the droplets 259 is caused by surfactant concentration gradients close to the ice-water interface, possibly through a phenomenon called diffusiophoresis [37]. Diffusiophoresis 261 is provoked by solute concentration gradients and can lead to displacement of micrometric particles with velocities of the order of a few micron per second, 263 comparable to the droplet velocities that we measure in our study. From Eq. (1), it is expected that the local gradient of surfactant concentration spans over a typical distance  $L_d = D/V_{sl}$  [36]. Hence an increasing growth rate  $(V_{sl})$  will decrease the distance at which the solute field can be perceived by the droplets and can qualitatively account for the decreasing values of  $L_v$  measured (see Fig.4) at high growth rates. Moreover the concentration gradient  $C_L - C_0$ depends linearly on  $C_0$  which can possibly account for the strong influence of the surfactant concentration on the droplet displacement.

We note that diffusiophoretic displacements of particles have been studied theoretically and experimentally for simple solutes such as ionic salts, dissolved gas or charged surfactants such as Sodium dodecylSulfate [37–40] but was never reported for non-ionic species.

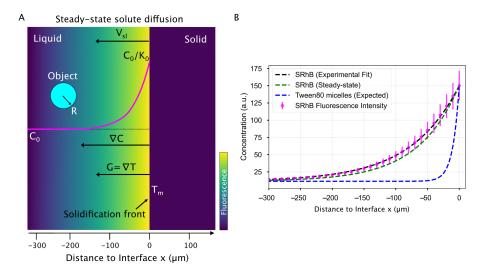


Figure 5: Solute rejected by the growing solid phase and segregated at the solid-liquid interface during steady-state directional solidification. (A) Model sketch depicting the concentration profile evolution of a solute (in magenta) in the remaining liquid, rejected by a solidification front advancing at  $V_{sl}$ , during steady-state planar growth. (B) Mean fluorescence intensity (magenta) of SRhB, acquired using a confocal microscope, is fit with a theoretical diffusion-type exponential (black line). The predicted steady-state diffusion of SRhB (green line), using the model from Tiller et al. [36], corresponds closely to the experimental data fit. A steady-state planar growth is thus verified. The corresponding steady-state diffusion profile of Tween 80 micelles (blue) shows a significant difference in length scales over which the two molecules (SRhB and Tween 80) diffuse. All data presented was recorded for a growth rate of 3  $\mu m \cdot s^{-1}$ . © (2020) S. Tyagi et al. (10.6084/m9.figshare.14815083) CC BY 4.0 license https://creativecommons.org/licenses/by/4.0/.

To further study the influence of the surfactant concentration gradients on the droplet dynamics, it would be useful to measure *in situ* the surfactant concentration close to the front. However Tween 80 does not fluoresce, hence we cannot measure its concentration profile. However it is in principle possible to predict it from Equation 1 provided a steady state regime is reached in our experiments. Therefore we examine the validity of Equation 1 by recording the fluorescence intensity of the dye, SRhB, which can be obtained easily with the confocal microscope (see Fig.5A). The concentration profile of SRhB rejected by the ice-water interface, deduced from the fluorescence intensity profile for a growth rate of 3  $\mu m \cdot s^{-1}$  is given in Fig.5B. At 3  $\mu m \cdot s^{-1}$ , the concentration profile obtained is in agreement with the *steady-state* diffusion profile predicted from Eq.1 (see Fig.5B). However we note that the *steady-state* approximation is not valid at higher velocities (not shown) probably because constitutional undercooling modifies the local temperature of the front hence the diffusion coefficient of the dye.

Interestingly, we see from Fig.5B which is obtained for a velocity of  $3 \mu m \cdot s^{-1}$ , that the distance at which the dye concentration profile starts increasing is of the order of 150  $\mu m$ . This value is much higher than the typical distance  $L_v$  over which both the large and small droplets get repelled from the interface at the same velocity, which are below 60  $\mu m$ . As the surfactant monomers and the dye have the same diffusion coefficient, we would expect that the distance  $L_d$  is similar for both species.

To account for the discrepancy between the measured values of  $L_v$  and the 298 theoretical  $L_d = D/V_{sl}$ , one may suggest that the droplet dynamics may be controlled by the concentration gradient of surfactant micelles rather than the sur-300 factant monomers, which diffusion coefficient is lower than that of the monomers and for which we expect a lower value of  $L_d$ . Using DLS, we measured the diffusion coefficient of the micelles and calculated the corresponding concentration profile using Eq.1. As shown in Fig.5B, at a growth rate of  $3 \mu m \cdot s^{-1}$ , we obtain a typical distance  $L_d$  of 10  $\mu m$ , which is lower than the distance  $L_v$  measured experimentally at this growth rate. Hence it turns out that the experimentally measured value of  $L_v$  ranges between the  $L_d$  values calculated either for the 307 surfactant micelles or for the monomers. However we note that the monomer and micelle concentration profiles close to ice-water front depends on the exchange dynamics between the surfactants and the micelles, hence may not be at equilibrium.

The segregation of solute at the interface thus plays a key role in redistribut-312 ing the droplets before they hit the solidification front. We believe this can be an important criterion for controlling the spatial distribution of objects, especially in multiple object scenarios. The control of the material microstructure has 315 been a topic of interest in alloy solidification (especially in particle-reinforcedcomposites) and for impurity control in castings and single crystal growth. The 317 object dynamics and impact of solute (or impurity) are still complex to quantify 318 as the observation of solidification in situ remains challenging. We have tried 319 to advance towards an in situ quantification of the solute mechanisms at play and further work is required to correlate the dye fluorescence intensity to the 321 absolute solute concentration gradient. The latter can be useful in predicting thermal convection and non steady-state solidification regimes.

#### 3.2 Droplets at the interface

We now focus on the behaviour of droplets when they come in contact (distance to interface =  $0 \mu m$ ) with the solid-liquid interface. We observe three typical behaviours of oil droplets as they encounter an approaching front, as shown in Fig.6. The droplets can elongate permanently as they get engulfed in the growing ice (Fig.6A), the droplets may deform transiently (t = 13 s) at the ice-water interface and subsequently relax to their original spherical shape as they move further into the ice phase (Fig.6B), or the droplets remain mostly 331 spherical during their engulfment by the growing crystal (Fig.6C). We notice 332 that the deformation behaviour depends on the droplet size R, the imposed 333 growth rate  $V_{sl}$ , and the bulk surfactant concentration. Therefore, we need to systematically study the effect of these solidification parameters to understand 335 the different types of deformation observed. The droplet deformation is estimated from the analysis of 2D shape elonga-337

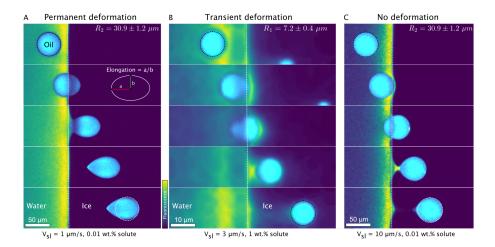


Figure 6: Typical time-lapse montage depicting the three types of deformation behaviour of oil droplets while undergoing directional planar front solidification. (A) The droplets elongate at the ice-water interface and remain deformed in the ice phase, scale bar =  $50 \mu m$ , time interval between frames: 44.5s (B) The droplets deform in a transient manner ( $t=13\ s$ ) at the ice-water interface and recover their shape as they are captured by the growing ice phase, scale bar =  $10 \mu m$ , time interval between frames: 6.7s (C) The droplets do not undergo deformation and preserve their shape during their interaction and further engulfment in the growing crystal. Scale bar =  $50 \mu m$ , time interval between frames: 3.3s. Oil is in cyan, water is in colormap viridis (fluorescence bar), and ice is in black. © (2020) S. Tyagi et al. (10.6084/m9.figshare.14815083) CC BY 4.0 license https://creativecommons.org/licenses/by/4.0/.

to 400 (depending on R and  $V_{sl}$ ) droplet interactions in 0.01 wt.% and 1 wt.% solute solution at varying growth rates for two different droplet sizes  $(R_1, R_2)$ .

We observe from Fig.7A and Fig.7B that the droplets undergo permanent elongation for the two droplet sizes  $(R_1, R_2)$ , when the bulk surfactant concentration is 0.01 wt.%. The elongation is  $\approx 1.0$ , representing a circle, when the droplets are in the remaining liquid far from the interface. The droplets start getting elongated as their front edge touches the interface (distance = 0  $\mu m$ ) and their shape transforms into an ellipse (elongation > 1.0). The droplet deformation evolves further and reaches a constant magnitude when the front edge is located at a distance of  $2R \times Elongation$ . Once the droplets are completely engulfed in the ice, their shape does not evolve any more (Fig.7A,B). Interestingly, we notice that the elongation reduces with an increasing growth rate for

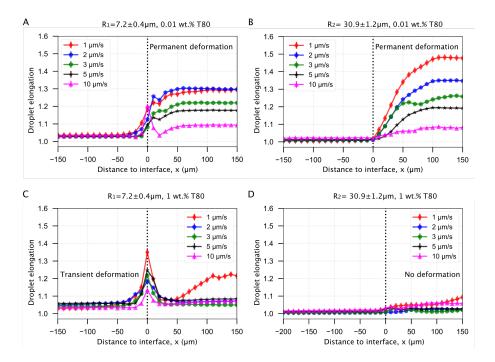


Figure 7: Mean elongation profiles for oil droplets encountering an approaching ice-water interface. Planar solidification front induced permanent deformation of oil droplets dispersed in a solution with (A,B) 0.01 wt.% solute concentration having a size of (A)  $R_1 = 7.2 \pm 0.4 \ \mu m$  (B)  $R_2 = 30.9 \pm 1.2 \ \mu m$ . The transient and no deformation regimes for droplets in (C,D) 1 wt.% solute concentration having a size of (C)  $R_1 = 7.2 \pm 0.4 \ \mu m$  (D)  $R_2 = 30.9 \pm 1.2 \ \mu m$ . © (2020) S. Tyagi et al. (10.6084/m9.figshare.14815083) CC BY 4.0 license https://creativecommons.org/licenses/by/4.0/.

both the droplet sizes investigated. However, the maximum elongation for the smaller  $R_1$  droplets is lower as compared to the larger  $R_2$  droplets at the given 0.01 wt.% solute concentration.

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In Fig.7C, we report the transient deformation of the oil droplets as they confront the ice-water interface with 1 wt.% bulk solute concentration. Here, the oil droplets undergo elongation at the interface (distance =0  $\mu m$ ) but eventually recover their shape as they are completely engulfed in the ice. In contrast, from Fig.7D we notice that the larger  $R_2$  droplets do not undergo any type of deformation at the same solute concentration of 1 wt.%. Hence, the elongation profile of  $R_2$  droplets remains unmodified during the droplet-interface confrontation.

We deduce from these observations that the droplets confronting an ap-

proaching interface have distinct behaviours depending on the concentration of solute in the bulk solution. In particular, an increasing solute concentration tends to decrease the droplet elongation significantly.

Several experimental and theoretical studies devoted to the shape of bubbles during solidification in the absence of surfactant can be found in the literature [41–43]. Highly elongated bubbles along with the formation of a highly curved tip at the bubble-ice interface were observed [41,42] and are controlled by the contact angle between the bubbles and the ice-water interface [43]. In the case of the low surfactant concentrations, we see from Fig.6A that the contact angle between the droplets and the ice-water interface remains close to 90° during engulfment, similarly to bubbles, because of the weak thermal flux in the droplets owed to their low thermal conductivity in comparison to water [44]. This results in tear-shaped drops which are very similar to those reported in the literature for bubbles.

At higher surfactant concentration we observe much lower elongations. Ac-377 cording to Eq.1, an increasing bulk solute concentration  $(C_0)$  implies a higher concentration of the solute segregated  $(C_0/K_0)$  at the solid-liquid interface. The 379 segregation of solute is further enhanced owing to an obstruction of their diffu-380 sion field by the droplets in the vicinity of the solid-liquid interface [12,45]. The segregated solute, trapped in the layer between the droplet and the interface, induces solute premelting [46,47] (Fig.2B at t = 44 s, Fig.6B at t = 8 s, in Fig.6C at t = 3 s) which in turn causes a lowering of the equilibrium melting temperature of water. Therefore these premelted films are stable below the solid's bulk melting temperature,  $T_m$  and the thickness of the premelted films increases with the solute concentration [17,46]. As a premelting film intercalates between the droplets and the solid liquid interface, the situation is very different from the literature studies discussed above as no finite contact angle between the drops and the interface can be defined. Here we suggest that the liquid-liquid interfacial tension between the droplet and the premelting film favors spherical shapes to minimize the interfacial area. Interestingly we note that the effect of size is different at low and high surfactant concentrations. At low surfactant concentrations, smaller droplets undergo a lower deformation, probably because of a
higher capillary pressure inside the drops that opposes the deformation. At opposite, for large surfactant concentrations, smaller droplets present a transient
deformation, while larger droplets remain mostly spherical. This effect may be
linked to the stronger segregation of solute in the films between the droplets
and the ice in the case of larger films.

The deformation of droplets at the ice-water interface depends strongly on

400 the growth rate  $(V_{sl})$  and the corresponding bulk solute concentration  $(C_0)$ . 401 Furthermore, the addition of solute increases the thickness of the observable 402 premelted films, which appears to act as a protection mechanism against the 403 interface initiated droplet deformation. The local solute environment and deformation are two important criterion for cryopreservation in particular. In cryobiology, the excess of solute causes severe osmotic stresses that can instigate cell membrane rupture and hence, cryoinjury to cells and tissues [4, 19]. In food engineering, alterations to the continuous phase concentration or to the shape and size of dispersed droplets is detrimental to the freeze-thaw stability of consumable emulsions [8]. Hence, a complete understanding of the solute 410 redistribution mechanisms along with the associated object deformation at the 411 corresponding freezing conditions is desired. Our multi-dimensional approach 412 highlights the importance of different solidification parameters and the ubiquitous role of solute in dominating the various aspects of object deformation behaviour. Further work is required to accurately estimate the direction and magnitude of forces at the origin of the observed deformation.

#### 3.3 Droplets in Ice

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We have discussed so far the dynamics and consequences of oil droplets interacting with an approaching ice-water interface. In the last section, we investigate the fate of droplets after their engulfment by the ice front.

At 1 wt.% solute in the aqueous solution, at a growth rate of 1  $\mu m \cdot s^{-1}$ , the

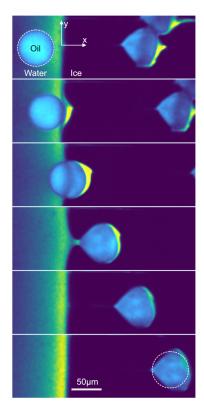


Figure 8: Crushing of oil droplets during their engulfment in ice at a growth rate of  $V_{sl}=1~\mu m\cdot s^{-1}$  with 1 wt% solute in solution.  $R_2=30.9\pm1.2~\mu m$ . Typical time-lapse montage depicting the crushing of an oil droplet, scale bar =  $50~\mu m$ , time interval between frames: 60s. The dashed circle indicate the shape of the droplet before encapsulation. Note that in the crushing regime, the droplets are elongated in a direction parallel to the front, unlike in the other regimes (elongation perpendicular to the front). © (2020) S. Tyagi et al. (10.6084/m9.figshare.14815083) CC BY 4.0 license https://creativecommons.org/licenses/by/4.0/.

droplets undergo an elongation process after engulfment whereby the two radii, along  $\vec{x}$  and  $\vec{y}$ , are stretched in magnitude as the droplets progress further in ice. This means that the droplets flatten in the z direction as they are engulfed in the ice. We depict this phenomenon with a time-lapse montage, highlighting the deformation, in Fig.8. Interestingly, we observe this phenomenon only at a growth rate of 1  $\mu m \cdot s^{-1}$  in the presence of 1 wt.% bulk solute concentration for both droplets radii R1 and R2.

We currently have no definitive explanations for this behavior. One possibil-

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ity could be that the shape of the water/ice meniscus in these conditions (curved meniscus) may favor entrapment and flattening of the droplets between the ice and the glass surface. However, this particular point would deserve additional experiments, in particular in 3D, which are beyond the scope of the current study.

Furthermore we note that once the droplets are trapped in the ice, we do 435 not observe any thermal regelation, i.e the droplets do not manifest any motion relative to the ice. Moreover the liquid layer between the droplet from the 437 growing solid decreases in thickness as the droplets move along the temperature 438 gradient in ice towards an increasing undercooling ( $\Delta T = T_m - T$ , where T is the temperature of the substrate) [1]. The study of particle migration in ice is an important topic of research to understand frost heave, glacier motion, and icecore dating among other technological applications [1]. Recent studies suggest that the presence of impurities or solutes tend to accelerate the regelation of trapped particles in ice. Typical migration velocities of 0.1  $\mu m \cdot s^{-1}$  at  $\Delta T$  of 1 K have been reported for micron sized particles in the presence of impurities [48]. Another recent study highlights the major impact of impurities on the rapid displacement (0.5 cm) over small time scales (120 s) of 1  $\mu m$  silicon particles 447 trapped in ice [49]. The objects investigated here are 1 order of magnitude (or more) larger, which could explain why no regelation was observed. The use of cryo-confocal microscopy with the ability to image the solute segregation has a promising prospect for investigating such mechanisms. We believe the high space and temporal resolution can be used effectively to resolve the dynamics of individual colloidal particles to gain further insight into regelation.

### 4 Conclusions

In conclusion, we report that the oil droplets undergoing directional solidification feel the impact of solute at every stage, from being in the liquid phase to getting captured by the growing ice-water interface. The solute plays an important role in determining the droplet shape (deformed or not), droplet behaviour (engulfment or rejection), and eventually the droplet spatial distribution. To predict the solidified microstructure, an understanding of the several in-situ mechanisms at play is therefore indispensable. The use of rapid cryo-confocal microscopy facilitates an *in situ* investigation and quantification of solidification mechanisms with visualization of the local solute segregation. To represent the observations in real-life systems, we need to explore models incorporating interaction dynamics and object behaviour with solute effects. Current theories do not encompass all the factors required for explaining the long-range solute effects on the objects during solidification. We hope our experimental data can serve to improve the existing theoretical models. Finally, we suggest that the freezing of oil-in-water emulsions may serve as an analogue for studying the *in situ* interaction of foreign objects with an advancing solid-liquid interface in the presence of solute effects.

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#### 477 Author contributions

S.D. and C.M. designed and supervised the project, S.D, C.M. and S.T. designed the experiments, S.T. carried out the confocal microscopy, S.T., C.M. and S.D. analyzed the data. All authors discussed the results and implications and wrote the manuscript.

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### 485 Conflict of interest

The authors declare no conflict of interest.

# 487 Availability of materials and data

- The datasets generated during and/or analysed during the current study are
- available from the corresponding author on reasonable request.

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# <sub>29</sub> 5 Supplementary Information

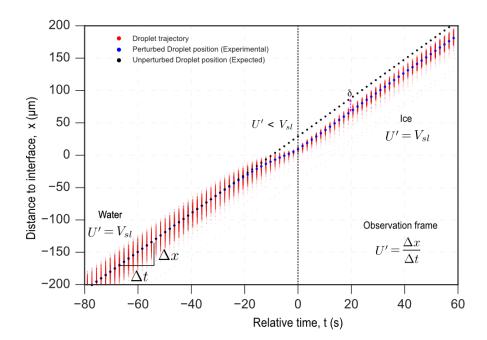


Figure S1: Measurement of interaction time and apparent droplet velocity U' in the observation frame. In the observation frame, far from the solid-liquid interface in water the droplet moves at the imposed growth rate  $U' = Dx/Dt = V_{sl}$ , as the droplet approaches the interface it gets repelled  $U' \neq V_{sl}$ , and as the droplet is engulfed in the ice it doesn't get repelled anymore, thereby recovering  $U' = V_{sl}$ . The interaction time is the total duration over which a droplet gets repelled by the solidification interface. Relative time is zero when the front edge of the droplet hits the solidification front. Experimental conditions for which the curve was recorded:  $V_{sl} = 3 \ \mu m \cdot s^{-1}$ ,  $G = \nabla T = 10^4 \ K \cdot m^{-1}$ , Droplet size  $R_1 = 7.2 \pm 0.4 \ \mu m$ . © (2020) S. Tyagi et~al. (10.6084/m9.figshare.14815083) CC BY 4.0 license https://creativecommons.org/licenses/by/4.0/.

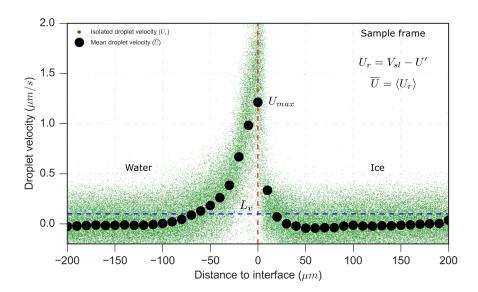


Figure S2: Deducing the isolated droplet velocity  $U_r$  and the mean droplet velocity  $\overline{U}$  in the sample frame. In the sample frame, the isolated droplet velocity  $U_r$  is zero far from the interface, it increases and reaches a maximum when the droplet gets repelled by the interface and subsequently, reduces to zero as the droplet is engulfed in the ice. Experimental conditions for which the curve was recorded:  $V_{sl}=3~\mu m\cdot s^{-1},~G=\nabla T=10^4~K\cdot m^{-1},$  Droplet size  $R_1=7.2\pm0.4~\mu m$ . © (2020) S. Tyagi *et al.* (10.6084/m9.figshare.14815083) CC BY 4.0 license https://creativecommons.org/licenses/by/4.0/.