



The turbulent bubble break-up cascade. Part 1. Theoretical developments

Wai Hong Ronald Chan¹, Perry L. Johnson^{1,2} and Parviz Moin^{1,†}

¹Center for Turbulence Research (CTR), Stanford University, Stanford, CA 94305, USA
 ²The Henry Samueli School of Engineering, University of California, Irvine, Irvine, CA 92697, USA

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Breaking waves entrain gas beneath the surface. The wave-breaking process energizes turbulent fluctuations that break bubbles in quick succession to generate a wide range of bubble sizes. Understanding this generation mechanism paves the way towards the development of predictive models for large-scale maritime and climate simulations. Garrett et al. (J. Phys. Oceanogr., vol. 30, 2000, pp. 2163-2171) suggested that super-Hinze-scale turbulent break-up transfers entrained gas from large- to small-bubble sizes in the manner of a cascade. We provide a theoretical basis for this bubble-mass cascade by appealing to how energy is transferred from large to small scales in the energy cascade central to single-phase turbulence theories. A bubble break-up cascade requires that break-up events predominantly transfer bubble mass from a certain bubble size to a slightly smaller size on average. This property is called locality. In this paper, we analytically quantify locality by extending the population balance equation in conservative form to derive the bubble-mass-transfer rate from large to small sizes. Using our proposed measures of locality, we show that scalings relevant to turbulent bubbly flows, including those postulated by Garrett et al. (J. Phys. Oceanogr., vol. 30, 2000, pp. 2163–2171) and observed in breaking-wave experiments and simulations, are consistent with a strongly local transfer rate, where the influence of non-local contributions decays in a power-law fashion. These theoretical predictions are confirmed using numerical simulations in Part 2 (Chan et al., J. Fluid. Mech. vol. 912, 2021, A43), revealing key physical aspects of the bubble break-up cascade phenomenology. Locality supports the universality of turbulent small-bubble break-up, which simplifies the development of cascade-based subgrid-scale models to predict oceanic small-bubble statistics of practical importance.

Key words: breakup/coalescence, gas/liquid flow, turbulence theory

† Email address for correspondence: moin@stanford.edu

1. Introduction

Turbulent bubbly flows with a wide range of bubble sizes are ubiquitous in nature and engineering, including breaking waves in oceans (e.g. Blanchard & Woodcock 1957; Medwin 1970; Melville 1996; Mortazavi et al. 2016). These bubbles contribute richly to various transport phenomena with maritime and climate implications. Experiments such as those by Deane & Stokes (2002), Tavakolinejad (2010), Blenkinsopp & Chaplin (2010) and Masnadi et al. (2019) have measured the bubble-size distribution in breaking waves. Their data suggest that several physical mechanisms are at play at different length and time scales in the generation and evolution of these bubbles. These observations are supported by recent numerical simulations of breaking Stokes waves by Wang, Yang & Stern (2016) and Deike, Melville & Popinet (2016), hydraulic jumps by Mortazavi (2016) as well as shear-flow free-surface turbulence by Yu et al. (2019) and Yu, Hendrickson & Yue (2020). Many of these mechanisms are not well understood to date. Among various proposed mechanisms, the fragmentation of bubbles by turbulence has garnered significant interest. Turbulent fragmentation applies to fragmenting bubbles of sizes larger than the Hinze scale, where the action of turbulent fluctuations dominates the effects of surface tension (Kolmogorov 1949; Hinze 1955). These super-Hinze-scale bubbles have Weber numbers of the order of or larger than unity. Note that most sub-Hinze-scale bubbles with Weber numbers smaller than unity are expected to be formed by distinct fragmentation mechanisms (Deane & Stokes 2002; Kiger & Duncan 2012; Chan, Urzay & Moin 2018b; Mirjalili, Chan & Mani 2018; Chan et al. 2019; Mirjalili & Mani 2020). For this reason, sub-Hinze-scale bubbles are not considered in detail in this work.

Kolmogorov (1949) and Hinze (1955) suggested that turbulent eddies successively break up sufficiently large gaseous cavities into bubbles of various sizes. The average break-up frequency of bubbles of size D fragmenting via this mechanism has been postulated to scale as $\varepsilon^{1/3}D^{-2/3}$, where ε is the characteristic rate of turbulent kinetic energy dissipation per unit mass. The concept behind this postulate is that the break-up of a bubble is facilitated by an eddy of a comparable size in its neighbourhood (Hinze 1955; Chan et al. 2018b). It allows the break-up frequency to be directly estimated by the inverse of the corresponding eddy turnover time. This frequency scaling is corroborated at bubble sizes sufficiently larger than the Hinze scale by break-up frequencies for various turbulent bubbly flows in the experiments described by Martínez-Bazán, Montañés & Lasheras (1999a) and Rodríguez-Rodríguez, Gordillo & Martínez-Bazán (2006), and preliminarily explored in the simulations by Chan et al. (2018a). Garrett, Li & Farmer (2000) further proposed a quasi-steady bubble break-up cascade to explain the formation of these bubbles. Here, large volumes of gas are entrained and subsequently broken up in quick succession by turbulence, leading to an approximately steady rate of gaseous mass transfer from large- to small-bubble sizes (from the point of view of the small- and intermediate-sized bubbles). Garrett et al. (2000) suggested, via dimensional analysis of a system with steady entrainment, that this cascade yields a quasi-stationary bubble-size distribution with a $D^{-10/3}$ power-law scaling. The theoretical analysis by Filippov (1961) predicts a limiting form for the size distribution assuming a Markovian (memoryless) break-up process, which coincides with the $D^{-10/3}$ power-law scaling at intermediate bubble sizes and times when the break-up frequency above is assumed. A similar scaling was observed in ensemble-averaged size distributions from breaking waves at bubble sizes sufficiently larger than the Hinze scale. These include the measured distributions of Loewen, O'Dor & Skafel (1996), Deane & Stokes (2002), Rojas & Loewen (2007), Blenkinsopp & Chaplin (2010) and Na et al. (2016) (see also figure 1 of Deike et al. (2016)), as well as the computed distributions of Mortazavi (2016), Deike et al. (2016) and Chan *et al.* (2018*a,b*). The bubble break-up cascade is strictly only present in flows with infinite integral-scale Weber numbers where the Hinze scale is zero. However, these experimental and numerical observations suggest that the cascade hypothesis may be extended with reasonable accuracy to practical turbulent bubbly flows with sufficiently large integral-scale Weber numbers where the Hinze scale is finite but still much smaller than the integral length scale. Note, then, that the smallest fragmenting bubbles in the break-up cascade, and all subsequent references to 'small bubbles' in this work, should have sizes around or slightly larger than the Hinze scale. Note, also, that the previously discussed scalings for the break-up frequency and the size distribution were formally derived for a statistically stationary and homogeneous system, where all statistics are invariant in space and time. However, one may assume in a system with a large separation of scales that the large-scale dynamics does not significantly influence the small- and intermediate-scale dynamics. These scalings would then also hold in small, localized regions in various turbulent bubbly flows, including breaking waves. The proposed and observed $D^{-2/3}$ power-law scaling for the bubble break-up frequency

has traditionally been considered separately from the proposed and observed $\hat{D}^{-10/3}$ power-law scaling for the bubble-size distribution. This is in spite of the fact that both scaling laws were derived on the basis of related assumptions (see also Chan & Johnson 2019; Qi, Masuk & Ni 2020). As alluded to earlier, each of these scalings was obtained via dimensional analysis. Thus, on its own, neither of these laws provides unequivocal support to the presence of a bubble break-up cascade mechanism in turbulent bubbly flows. For example, Yu et al. (2019, 2020) have proposed alternative mechanisms contributing to similar power-law scalings in the bubble-size distribution, also via dimensional analysis. To demonstrate the plausibility of a cascade mechanism, one has to show that the underlying nature of the break-up dynamics is compatible with the characteristics of a cascade. An ideal bubble break-up cascade should be size local, where bubble mass is transferred on average from large to successively smaller bubble sizes. In other words, locality is achieved when this net transfer rate across a certain bubble size primarily depends on the break-up statistics of bubbles of similar sizes. Note that locality is necessary for the dynamics at sufficiently small bubble sizes to be largely independent of the dynamics at the largest bubble sizes. Independence from the large-size dynamics enables these small- and intermediate-size dynamics to be universal in small, localized regions in a variety of turbulent bubbly flows. In order for a universal bubble break-up cascade at these small and intermediate sizes to be plausible, the aforementioned power-law scalings will need to be reasonably compatible with the previously discussed notion of locality. This compatibility has not been demonstrated to date, mostly because a suitable tool has not been employed to assess it.

Population balance equations (Smoluchowski 1916, 1918; Landau & Rumer 1938; Melzak 1953; Williams 1958; Friedlander 1960*a,b*; Filippov 1961; Valentas & Amundson 1966; Valentas, Bilous & Amundson 1966, and others) have been used to characterize bubble break-up using a model kernel that includes both the break-up frequency and the size distribution. This makes the population balance equation a good candidate tool to demonstrate the plausibility of a universal bubble-mass cascade mechanism. However, it is not traditionally presented in conservative form (Martínez-Bazán *et al.* 2010; Saveliev & Gorokhovski 2012), where the size distribution is weighted by the bubble volume. This obscures the links between the model kernel and the direct movement of bubble mass from one bubble-size space is key to understanding and quantifying locality. Note that the conservative population balance equation should strictly be presented as a function

of mass, since mass is the true quantity being conserved (Carrica et al. 1999; Castro & Carrica 2013). However, the equation is considered as a function of volume in this work. This exploits the direct geometrical relationship between volume and size, and is equivalent to taking the incompressible limit of the mass-conserving equation. In the case of an oceanic breaking wave, for example, this is likely to be appropriate in the early wave-breaking stages, since most of the entrained bubbles would then reside near the wave surface. Care has to be taken for later stages of the wave-breaking process when smaller bubbles may be swept deep below the surface and compressibility effects may become important. One may perform a quantitative estimate of when these effects become important through a scaling analysis comparing the characteristic capillary pressure at a certain bubble size, σ/D , to the surrounding hydrostatic pressure, P_h , where σ is the gas-liquid surface tension coefficient. Generally, bubbles of sizes larger than $D \sim \sigma/P_h =$ $(10^{-1}/10^5)$ m = 1 µm may be effectively treated as incompressible. In the remainder of this work, incompressibility is assumed, and the terms 'mass' and 'volume' are used interchangeably. Scale-space transport has also been recently explored by Thiesset et al. (2020) for liquid jet atomization in relation to the volume fraction field. They proposed using two-point statistics instead of the size distribution to characterize scale locality.

In this work, a novel treatment of the population balance equation is used to demonstrate that the previously discussed power-law scalings for the bubble break-up frequency and size distribution are compatible with a bubble break-up cascade mechanism for turbulent bubbly flows. The population balance equation in conservative form is used to derive the bubble-mass-transfer flux, which describes the rate of transfer of gaseous mass between bubbles of different sizes within a bubble population. The break-up flux from large- to small-bubble sizes may be evaluated by averaging over many binary break-up events in these flows, where it is assumed for simplicity that every parent bubble breaks into exactly two child bubbles in each event. This paper analytically quantifies the degree to which the break-up flux is local in bubble-size space. The presence of locality would support the plausibility of the scalings proposed by Garrett *et al.* (2000), which are founded on a cascade phenomenology. Detailed simulations may also be used to measure this flux and its locality, and will be analysed in a companion paper (Chan *et al.* 2021, hereafter referred to as Part 2).

This work constructs analogies between this picture of turbulent bubble break-up and the ideas underlying the celebrated concept of the turbulent energy cascade (Richardson 1922; Kolmogorov 1941; Onsager 1945). Inspiration is drawn from the eddy-viscosity-based spectral energy transfer models of Obukhov (1941) and Heisenberg (1948*a*,*b*), as well as the quasi-local spectral energy transfer models of Kovasznay (1948) and Pao (1965, 1968). These parallels between the turbulent bubble-mass and energy cascades, in particular the universality of both processes in small, localized regions of turbulent flows, lend legitimacy to the idea of subgrid-scale modelling of bubbles in large-eddy simulations (LES) of turbulent two-phase flows, which inherently involve a large separation of scales.

This paper is organized as follows. In §2, the turbulent bubble-mass cascade is introduced in a parallel fashion to the turbulent energy cascade. Since locality is argued to be crucial for the validity of a cascade phenomenology, two measures of locality are introduced in the context of bubble-mass transfer. In §3, the mathematical formalism required to quantify this locality is introduced. This includes the distribution of bubble sizes, the conservative population balance equation describing the dynamics of the bubble-size distribution and the model binary break-up kernel in the population balance equation and the corresponding bubble-mass flux in bubble-size space. The locality of this flux is analysed in §4 in the context of self-similar energy and bubble-mass transfer.



Figure 1. Schematic illustrating the trinity of universality, locality and self-similarity in a forward cascade. This trinity only emerges in a system with sufficient scale separation.

In particular, scalings relevant to small, localized regions of turbulent bubbly flows are used to obtain an expression for the bubble-mass flux due to turbulent break-up. The measures of locality introduced at the end of § 2 are then used to elucidate the strength of locality in this flux. In § 5, more parallels are drawn between the turbulent bubble-mass and energy cascades using existing spectral energy transfer models as a guide. These parallels may be used to guide the development of a subgrid-scale model for bubbles in LES of turbulent two-phase flows. Finally, conclusions are drawn in § 6.

2. The features of a cascade mechanism

In a forward cascade mechanism, the small- and intermediate-scale dynamics of a physical process, such as energy or bubble-mass transfer, should become independent of the large-scale flow geometry as the scale separation is increased. In other words, flow-dependent large-scale details should not directly influence the small- and intermediate-scale dynamics if there exists a clear separation of scales, and the dynamics is universal across various flows at these small and intermediate scales. This decoupling between scales suggests that the small- and intermediate-scale dynamics are scale local. When there is substantial scale separation, locality further implies that the dynamics in an intermediate subrange of scales is independent of the largest and smallest scales. Because no characteristic scale can be present in this intermediate subrange, the corresponding dynamics must be self-similar with some degree of scale invariance. This trinity of universality, locality and self-similarity is schematically illustrated in figure 1. These classical ideas are reviewed for the well-established turbulent energy cascade in $\S 2.1$. Garrett et al. (2000) briefly alluded to a similar process for gaseous mass transfer in turbulent bubbly flows, which is examined in $\S 2.2$ with deliberate parallels to $\S 2.1$. Note that these cascades hold in two scenarios: either the flow of interest and the accompanying entrainment of gas are statistically stationary, or they are quasi-steady over time scales longer than those associated with turnover and break-up of most of the relevant (i.e. small- and intermediate-sized) eddies and bubbles, respectively. Quasi-steadiness may be assumed in small, localized regions of turbulent flows with a sufficient separation of scales. Locality of the bubble-mass transfer in bubble-size space is vital to this cascade phenomenology. § 2.3 discusses how locality may be quantified for the bubble-mass transfer flux, W_b .

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2.1. The turbulent energy cascade

The turbulent energy cascade in incompressible high-Reynolds-number single-phase flows is approximately initiated at the integral length scale L, i.e. the size of the largest turbulent motions, and is approximately terminated at the Kolmogorov length scale L_K , i.e. the size of the smallest turbulent motions. Consider, at some characteristic length scale L_n , the characteristic inertial momentum flux $\rho_l u_{L_n}^2$, and the characteristic viscous stress $\mu_l u_{L_n}/L_n$. Here, ρ_l and μ_l refer to the density and dynamic viscosity of the fluid, respectively, where the subscript l assumes without loss of generality that the bulk flow involves a liquid, and u_{L_n} refers to the magnitude of the characteristic velocity fluctuations associated with the length scale L_n . In turbulent flows, the large scales are dominated by inertial effects, while the small scales are dominated by viscous effects. The cross-over point $L_n = L_K$ occurs where the characteristic inertial momentum flux approximately balances the characteristic viscous stress, such that the Reynolds number

$$Re_{L_n} = \frac{\rho_l u_{L_n} L_n}{\mu_l} \tag{2.1}$$

satisfies $Re_{L_n} = Re_{L_K} = O(1)$. Applying the scaling $u_{L_n} \sim (\varepsilon L_n)^{1/3}$, which holds in the inertial subrange defined by $L_K \ll L_n \ll L$, and is asymptotically valid at $L_n \sim L_K$, leads to the following dimensional expression for the Kolmogorov length scale

$$L_K \sim \left(\frac{\mu_l}{\rho_l}\right)^{3/4} \varepsilon^{-1/4}.$$
 (2.2)

Note that L_K is a function of only $v_l = \mu_l / \rho_l$ and ε . At these small scales, the rate of energy input from the large scales ε is approximately balanced by the rate of viscous dissipation $v_l u_{L_K}^2 / L_K^2$. After non-dimensionalizing L_K by L and assuming that the energy cascade rate is dictated by the energy-containing scales $\varepsilon \sim u_I^2 / L$, one may further obtain

$$\frac{L_K}{L} \sim Re_L^{-3/4}.$$
(2.3)

Taken together, these relations paint the following physical picture of the turbulent energy cascade, which was first mooted by Richardson (1922) and then reiterated by Kolmogorov (1941) and Onsager (1945): in a system with a sufficiently high integral-scale Reynolds number Re_L , turbulent kinetic energy is cascaded from the largest to the smallest scales of turbulent motion at a rate ε that is governed only by the large scales and does not vary with scale in a subrange of intermediate scales. Kolmogorov (1941) advanced a number of similarity hypotheses to convey these ideas for turbulent kinetic energy transfer in eddy-size space, which are recapitulated in appendix A.1. Note that the turbulent energy cascade is strictly valid only in the limit of zero v_l and infinite Re_L , such that L_K is zero. However, it may be extended with reasonable accuracy to practical turbulent flows with sufficiently large Re_L , such that L_K is finite but still much smaller than L, with the understanding that the scale-invariant transfer of turbulent kinetic energy is an adequate description only in the inertial subrange $L_K \ll L_n \ll L$.

For breaking waves, the magnitude of L_K may be estimated using the wavelength to estimate L, and the corresponding wave phase velocity $(gL)^{1/2}/(2\pi)^{1/2}$ to estimate u_L , where g is the magnitude of standard gravity. For a more detailed discussion, including the potential impact of the wave slope on the estimation of the characteristic scales, see appendix B of Part 2. This yields $Re_L^{-3/4} \sim 3 \times 10^{-5}$ for a 1 m long wave. For the 27 cm long waves simulated in Part 2, the corresponding dimensionless Kolmogorov length scale is $Re_L^{-3/4} \sim 1 \times 10^{-4}$. In both cases, $L_K \approx 30 \,\mu$ m.

Locality in the turbulent bubble break-up cascade

2.2. The turbulent bubble-mass cascade

The turbulent bubble break-up cascade in high-Reynolds-number, high-Weber-number, incompressible and immiscible two-phase flows is approximately initiated at L, i.e. the size of the largest bubbles, and is approximately terminated at the Hinze scale L_H , i.e. the size of the smallest bubbles subject to turbulent break-up. Consider, at some characteristic length scale L_n , the characteristic inertial momentum flux $\rho_l u_{L_n}^2$, and the characteristic capillary pressure σ/D_{L_n} associated with a bubble of size D_{L_n} that is most relevant to the system dynamics at this length scale. Here, σ refers to the surface tension coefficient of the gas–liquid interface. If one assumes that a bubble interacts most strongly with an eddy of the same size, then $D_{L_n} = L_n$. A physical justification for this assumption was offered by Hinze (1955) and refined by Chan *et al.* (2018*b*). The cross-over point $L_n = L_H$ between the large scales where inertial effects are dominant and the small scales where capillary effects are dominant occurs where the characteristic inertial momentum flux approximately balances the characteristic capillary pressure, such that the Weber number

$$We_{L_n} = \frac{\rho_l u_{L_n}^2 L_n}{\sigma} \tag{2.4}$$

satisfies $We_{L_n} = We_{L_H} = O(1)$. At scales larger than the Hinze scale ($L_n > L_H$ and $We_{L_n} > 1$), the dominance of inertial forces over capillary forces has been postulated to drive the fragmentation of large gaseous cavities and bubbles (Kolmogorov 1949; Hinze 1955). This mechanism implicitly assumes that the gaseous volume fraction in the gas–liquid mixed-phase region (void fraction) is sufficiently low that coalescence between cavities and bubbles is rare. The Hinze scale is dynamically relevant only when $L_K \ll L_H$, so that viscous effects have a negligible influence on bubble fragmentation. The kinematic viscosity of the dispersed gaseous phase v_g should also not be significantly larger than v_l , so that the corresponding Kolmogorov length scale in the gaseous phase is not significantly larger than e_k in the liquid (Kolmogorov 1949). In addition, it is assumed that the density of the dispersed gaseous phase ρ_g is smaller than ρ_l , so that inertial mechanisms involving the dispersed phase may be neglected. Assuming again a sufficient separation of scales in the system of interest in order for an inertial subrange to be present in the bulk turbulence, and also that the void fraction of the mixed-phase region is sufficiently low that the turbulence statistics are not significantly modified by the presence of the bubbles, the following expression for the Hinze scale can be obtained

$$L_H \sim \left(\frac{\sigma}{\rho_l}\right)^{3/5} \varepsilon^{-2/5}.$$
 (2.5)

Note that L_H is a function of only σ/ρ_l and ε . At these small scales, the inertial momentum flux, which scales as $\rho_l(\varepsilon L_H)^{2/3}$, is approximately balanced by the capillary pressure, which scales as σ/L_H . After non-dimensionalizing L_H by L and assuming again that $\varepsilon \sim u_L^3/L$, one may further obtain (see also Shinnar 1961; Narsimhan, Gupta & Ramkrishna 1979; Tsouris & Tavlarides 1994; Luo & Svendsen 1996; Apte, Gorokhovski & Moin 2003)

$$\frac{L_H}{L} \sim W e_L^{-3/5}.$$
(2.6)

Observe the parallels between these statements and the corresponding statements in § 2.1, and between the relations (2.1)–(2.3) and (2.4)–(2.6). One might surmise that the concept of the bubble-mass cascade transferring gaseous mass from large to successively smaller bubble sizes analogously follows the energy cascade discussed in § 2.1, provided the



Figure 2. Schematic illustrating the forward energy and bubble-mass cascades in turbulent bubbly flows.

bubble-mass transfer is driven by turbulent eddies. In high- Re_L and high- We_L bubbly flows, these cascades may exist simultaneously, as illustrated in figure 2. A similar parallel was drawn in the context of coalescence by Friedlander (1960*a*,*b*). Like the energy flux ε , the bubble-mass flux W_b should be governed only by the large scales and should not vary with size in a subrange of intermediate sizes. While self-similarity occurs in the inertial subrange $L_K \ll L_n \ll L$ in the turbulent energy cascade, it should also be present in an analogous intermediate bubble-size subrange $L_H \ll L_n \ll L$ in the turbulent bubble-mass cascade. In addition, just as the transfer of energy should be interpreted in a statistical sense through the statistics of the velocity structure functions, a probabilistic interpretation of the transfer of gaseous mass across bubble sizes is warranted. This interpretation is provided by the bubble-size distribution to be introduced in \S 3.1. Finally, in the same way that the discussion in § 2.1 may be mapped to a set of similarity hypotheses recapitulated in appendix A.1, a set of similarity hypotheses for turbulent bubble-mass transfer in bubble-size space corresponding to the discussion above is proposed in appendix A.2. Note that the turbulent bubble-mass cascade is strictly valid only in the limit of zero σ/ρ_l and infinite We_L , such that L_H is zero. However, it may be extended with reasonable accuracy to practical turbulent two-phase flows with sufficiently large We_{L} , such that L_{H} is finite but still much smaller than L, with the understanding that the size-invariant transfer of bubble mass is an adequate description only in the intermediate bubble-size subrange $L_H \ll L_n \ll L$, i.e. for the fragmentation of super-Hinze-scale bubbles.

Aside from the assumptions listed above, the following should also hold in the turbulent bubble-mass cascade. First, large pockets of gas $(L_n \sim L)$ need to be steadily or quasi-steadily (from the point of view of the small and intermediate scales) injected into a bulk volume of liquid to facilitate the transfer of bubble mass from large- to small-bubble sizes. Second, buoyancy and gradual dissolution may be neglected in the bubble dynamics. Third, a mechanism for the removal of small bubbles of sizes smaller than L_H exists to prevent their accumulation. This physical limit holds when the time scales of the neglected secondary effects, such as coalescence, buoyancy, gradual dissolution and the accumulation of small bubbles, exceed the flow and entrainment time scales of interest, as alluded to by Garrett *et al.* (2000) as well.

For breaking waves, the magnitude of L_H may be estimated in a similar fashion to the estimate of L_K in § 2.1. For a 1 m long wave, one may obtain $We_L^{-3/5} \sim 3 \times 10^{-3}$. For the 27 cm long waves simulated in Part 2, one may similarly obtain $We_L^{-3/5} \sim 1 \times 10^{-2}$. In both cases, $L_H \approx 3$ mm and $L_H/L_K \sim We_L^{-3/5}Re_L^{3/4} \sim 10^2$, thus satisfying the earlier assumption $L_K \ll L_H$. More generally, one may write

$$\frac{L_H}{L_K} \sim \left(\frac{\sigma}{\mu_l u_{L_K}}\right)^{3/5}.$$
(2.7)



Figure 3. Schematic illustrating the computation of the bubble break-up flux $W_b(D)$ across a particular bubble size *D* through the appropriate averaging of gaseous mass transfers from individual events as represented by block arrows. Each row corresponds to an individual break-up event. Parent bubbles have a dark fill colour, while child bubbles have a light fill colour. Child bubbles that contribute to $W_b(D)$ are marked with a dark border. For a more comprehensive illustration, refer to figure 11 and the accompanying description in appendix B.

For air-water systems, the Kolmogorov velocity scale u_{L_K} will need to exceed $\sigma/\mu_l \sim 10^2$ m s⁻¹ in order for L_K to exceed L_H . Thus, the assumption is satisfied for most terrestrial oceanic systems where the characteristic flow speed is slower than this.

2.3. Locality in a universal framework for turbulent bubble break-up

The existence of a universal cascade mechanism for bubble break-up requires the break-up process to be size local. It should be emphasized that locality of the averaged break-up dynamics – not the locality of individual break-up events – is the measure of interest since turbulent cascades should always be interpreted in a statistical manner. In order to enable this statistical interpretation, the break-up flux, W_b , should be derived from the averaged break-up dynamics, as illustrated in figure 3. Here, $W_b(D)$ is the rate at which bubble mass – or, equivalently in an incompressible system, gaseous volume – is transferred from bubbles of sizes larger than D to bubbles of sizes smaller than D, and will be introduced in more detail in § 3. The link between individual break-up events and the averaged break-up dynamics is more concretely articulated through specific examples in appendix B.

Locality in W_b is quantified using two complementary measures inspired by the concepts of infrared and ultraviolet locality introduced by L'vov & Falkovich (1992) and Eyink (2005) for turbulent kinetic energy transfer. First, one is interested in the degree to which incoming contributions to $W_b(D)$ from all parent bubble sizes larger than D arise primarily from sizes only slightly larger than D. This metric is termed infrared locality, since infrared radiation has a longer wavelength than visible light. If the rate at which parent bubbles of sizes between $D_p > D$ and $D_p + dD_p$ transfer mass to bubbles of sizes smaller than D is $I_p(D_p|D) dD_p$, then $W_b(D)$ is the integral of the incoming differential transfer rate I_p and W_b . With this decomposition of W_b , infrared locality may then be quantified by considering how quickly the incoming differential transfer rate $I_p(D_p|D)$ from parent bubbles decays with increasing D_p



Figure 4. Schematics illustrating infrared locality in the break-up flux W_b . $W_b(D)$ may be computed by integrating the incoming differential contributions $I_p(D_p|D)$ from each parent bubble size $D_p > D$. (a) Illustration of this decomposition of W_b . In particular, it depicts a system where the incoming differential transfer rate $I_p(D_p|D)$ from parent bubbles varies as $I_p(D_{p1}|D) > I_p(D_{p2}|D) > I_p(D_{p3}|D)$ for $D_{p1} < D_{p2} < D_{p3}$. This variation of $I_p(D_p|D)$ with D_p is graphically depicted in (b). The limiting power-law exponent γ_p in (b) describes the behaviour $I_p(D_p \to \infty|D)$. This exponent is revisited in the relations (4.7) and (4.15).

DEFINITION 2.1 (Infrared locality). If $W_b(D)$ is written as

$$W_b(D) = \int_D^\infty \mathrm{d}D_p \, I_p(D_p|D), \qquad (2.8)$$

then infrared locality describes the rate at which I_p decays from $D_p \gtrsim D$ to $D_p \rightarrow \infty$.

The variation of $I_p(D_p|D)$ with D_p for an infrared local system is schematically illustrated in figure 4(b).

Second, one is interested in the degree to which outgoing contributions to $W_b(D)$ due to all child bubble sizes smaller than D are due primarily to sizes only slightly smaller than D. This metric is correspondingly termed ultraviolet locality. If the rate at which child bubbles of sizes between D_c and $D_c + dD_c < D$ receive mass from bubbles of sizes larger than D is $I_c(D_c|D) dD_c$, then $W_b(D)$ is the integral of the outgoing differential transfer rate $I_c(D_c|D)$ over all child bubble sizes $D_c < D$. Figure 5(*a*) illustrates this relation between I_c and W_b . With this decomposition of W_b , ultraviolet locality may then be quantified by determining how quickly the outgoing differential transfer rate $I_c(D_c|D)$ to child bubbles decays with decreasing D_c

DEFINITION 2.2 (Ultraviolet locality). If $W_b(D)$ is written as

$$W_b(D) = \int_0^D dD_c \, I_c(D_c|D),$$
 (2.9)

then ultraviolet locality describes the rate at which I_c decays from $D_c \leq D$ to $D_c \rightarrow 0$.

The variation of $I_c(D_c|D)$ with D_c for an ultraviolet local system is schematically illustrated in figure 5(*b*). To reiterate, these decompositions of W_b into I_p and I_c are two distinct but complementary ways of analysing the contributions to W_b from different bubble sizes. The sum of all I_p values over all eligible parent bubbles ($D_p > D$) yields $W_b(D)$, as does the sum of all I_c values over all eligible child bubbles ($D_c < D$).



Figure 5. Schematics illustrating ultraviolet locality in the break-up flux W_b . $W_b(D)$ may be computed by integrating the outgoing differential contributions $I_c(D_c|D)$ due to each child bubble size $D_c < D$. (*a*) Illustration of this decomposition of W_b . In particular, it depicts a system where the outgoing differential transfer rate $I_c(D_c|D)$ to child bubbles varies as $I_c(D_{c1}|D) > I_c(D_{c2}|D) > I_c(D_{c3}|D)$ for $D_{c1} > D_{c2} > D_{c3}$. This variation of $I_c(D_c|D)$ with D_c is graphically depicted in (*b*). The limiting power-law exponent γ_c in (*b*) describes the behaviour $I_c(D_c \rightarrow 0|D)$. This exponent is revisited in the relations (4.8) and (4.16).

3. Mathematical formalism

In this section, the bubble-size distribution and its corresponding population balance equation in conservative form, together with the typical model kernel for bubble break-up, are introduced in order to derive a suitable expression for the break-up flux W_b , and thus the locality measures I_p and I_c introduced in § 2.3. These quantities are used in § 4 to determine the extent of validity of the bubble-mass cascade phenomenology in § 2.2, including the proposed similarity hypotheses A.4–A.6 in appendix A.2.

3.1. The bubble-size distribution

At every location x, for every bubble size D, and at some time t, the number density function f for a bubble population may be constructed by adding a contribution from each bubble $i = 1, ..., N_b(t)$ having a centroid location x_i and an equivalent size D_i

$$\overset{\circ}{f}(x, D; t) = \sum_{i=1}^{N_b(t)} \delta(x - x_i(t)) \,\delta(D - D_i(t)) \,, \tag{3.1}$$

where δ is the Dirac delta function. Note that \mathring{f} is not a probability density function since it is constructed through the accounting of bubbles in a single system snapshot. The probability distribution of bubble sizes f may be obtained by ensemble averaging over statistically independent but similar realizations

$$f(\mathbf{x}, D; t) = \langle f(\mathbf{x}, D; t) \rangle.$$
(3.2)

The probabilistic nature of this size distribution results in a break-up flux in § 3.3 that is compatible with a statistical interpretation of the break-up dynamics. Note that the dimensions of \hat{f} and f are (length)⁻⁴ since the following constraints are satisfied over some sampling volume $\int_{\Omega} d\mathbf{x} = \mathcal{V}$ that always contains all $N_b(t)$ bubbles

$$N_b(t) = \int_{\Omega} \mathrm{d}\mathbf{x} \int_0^\infty \mathrm{d}D\mathring{f}(\mathbf{x}, D; t) , \quad \langle N_b(t) \rangle = \int_{\Omega} \mathrm{d}\mathbf{x} \int_0^\infty \mathrm{d}Df(\mathbf{x}, D; t) . \quad (3.3a, b)$$

Here, the volume-integration $(\int_{\Omega} dx \cdot)$ and ensemble-averaging $(\langle \cdot \rangle)$ operations commute only if Ω and \mathcal{V} are identical over all the ensemble realizations.

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While many flows, such as breaking waves, are intrinsically statistically unsteady and inhomogeneous, smaller-scale dynamics with faster time scales relative to larger-scale developments may evolve very similarly to statistically stationary and homogeneous flows, as suggested in hypothesis A.1 in appendix A.1. This smaller-scale dynamics occurs in small, localized regions of turbulent flows with sufficient scale separation. This approximation of quasi-stationarity and quasi-homogeneity implies

$$f(\mathbf{x}, D; t) \approx f(D). \tag{3.4}$$

In other words, the bubble-size distribution of a statistically stationary and homogeneous turbulent bubbly flow at small and intermediate bubble sizes may shed light on what might be the universal characteristics of a bubble population at small and intermediate bubble sizes in small, localized regions of turbulent bubbly flows with sufficient scale separation, and *vice versa*.

3.2. The population balance equation

The population balance equation was introduced by Smoluchowski (1916, 1918), Landau & Rumer (1938), Melzak (1953), Williams (1958), Friedlander (1960*a*,*b*), Filippov (1961), Randolph & Larson (1962), Fredrickson & Tsuchiya (1963) and Behnken, Horowitz & Katz (1963) in their respective fields. It is used here to describe the evolution of the bubble-size distribution f(x, D; t) in the four-dimensional phase space comprising the three spatial dimensions $x = (x_1, x_2, x_3)$ and the bubble-size dimension *D* as follows (Hulburt & Katz 1964; Randolph 1964)

$$\frac{\partial \left[f\left(x,D;t\right)D^{3}\right]}{\partial t} + \frac{\partial \left[v_{i}\left(x,D;t\right)f\left(x,D;t\right)D^{3}\right]}{\partial x_{i}} + \frac{\partial \left[v_{D}\left(x,D;t\right)f\left(x,D;t\right)D^{3}\right]}{\partial D}$$

$$= H(x,D;t), \qquad (3.5)$$

for some model term H that includes the effects of break-up, coalescence, entrainment and other effects. Here, v_i and v_D represent the velocities of the bubble-volume-weighted probability density function, fD^3 , in phase space along the spatial and bubble-size dimensions, respectively. The D^3 -weighting enables the equation to be written in conservative form (Martínez-Bazán *et al.* 2010; Saveliev & Gorokhovski 2012) in the incompressible limit where mass and volume are equivalent, since bubble mass is conserved by break-up and coalescence events. Following the arguments of quasi-stationarity and quasi-homogeneity leading to (3.4), one may simplify (3.5) to

$$\underbrace{\frac{d\left[v_D(D)f(D)D^3\right]}{dD}}_{\text{local transport}} = \underbrace{H(D)}_{\text{source and sink terms,}} .$$
(3.6)

These mechanisms are schematically illustrated in figure 6, which depicts the movement of fD^3 in *D*-space, and are further discussed in appendix C.1. In summary, the phase-space-based form of the population balance equation, (3.6), distinguishes the contributions of local and non-local bubble-mass transport. As explained in appendix B, individual break-up (and coalescence) events are non-local in size space. However, the ensemble-averaged dynamics may be approximated as size local if it satisfies infrared and ultraviolet locality, as discussed in § 2.3. These concepts are appropriate particularly in the limit where the subspace of initial conditions for a bubbly system corresponding to an initial collection of large bubbles is sufficiently sampled. If a quasi-stationary limit exists



Figure 6. Schematic illustrating the physical significance of the terms in (3.6). Local transport denoted by the lightly shaded block arrows corresponds to the left-hand side term, while the remaining mechanisms denoted by the dark block arrows correspond to the right-hand side term.

for the system, then subsequent bubble break-up would lead to a continuous distribution for f(D) after the transient dynamics has passed, as opposed to a discrete distribution comprising a finite number of Dirac delta functions in bubble-size space. Then, if the source and sink mechanisms are neglected, one may re-interpret the terms in (3.6) as

$$\underbrace{\frac{d\left[v_D(D)f(D)D^3\right]}{dD}}_{\text{local transport approximation for break-up and/or coalescence}} = \underbrace{H(D)}_{\text{error of local transport approximation}}.$$
(3.7)

The population balance equation (3.5) is often alternatively written, in the limit where mass-transfer processes such as dissolution that would cause individual bubble sizes to continuously increase or decrease with time may be neglected, as

$$\frac{\partial \left[f(\mathbf{x}, D; t) D^{3}\right]}{\partial t} + \frac{\partial \left[v_{i}(\mathbf{x}, D; t) f(\mathbf{x}, D; t) D^{3}\right]}{\partial x_{i}}$$
$$= T_{b}(\mathbf{x}, D; t) + T_{c}(\mathbf{x}, D; t) + T_{s}(\mathbf{x}, D; t)$$
(3.8)

for some model terms T_b , T_c and T_s corresponding to break-up, coalescence and other sources and sinks, respectively. Once again, (3.8) may be simplified to

$$0 = \underbrace{T_b(D)}_{\text{break-up}} + \underbrace{T_c(D)}_{\text{coalescence}} + \underbrace{T_s(D)}_{\text{other sources}}$$
(3.9)

The kernel-based form of the population balance equation (3.9) isolates the contributions to bubble-mass transport from individual physical processes. Since break-up and coalescence processes do not create or destroy bubble mass, or bubble volume in the incompressible limit, $T_b(D)$ and $T_c(D)$ must individually satisfy the conservation of bubble mass; for example

$$\int_{0}^{\infty} \mathrm{d}D \, T_{b}(D) = 0. \tag{3.10}$$

Recalling the assumptions in § 2.2, $T_c(D)$ is assumed to be negligible, while $T_s(D)$ is assumed to be active only at small $(D < L_H)$ and large $(D \sim L)$ bubble sizes. Thus, at intermediate bubble sizes, only $T_b(D)$ is in play. The common model kernel for $T_b(D)$ is the subject of the next subsection. At these intermediate sizes, one may compare (3.7) with

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(3.9) to approximately obtain, in the limit of size-local break-up,

$$\underbrace{-\frac{d\left[v_D(D)f(D)D^3\right]}{dD}}_{\text{local transport approximation}} = \underbrace{T_b(D)}_{\text{break-up}}.$$
(3.11)

The bubble break-up process may then be modelled by an appropriate velocity in bubble-size space, $v_D(D)$, as will be further discussed in § 5.1. Quasi-stationarity and quasi-homogeneity also imply that both terms in (3.11) are zero. In other words, the rate of increase of the number of bubbles of size D due to the break-up of larger bubbles is dynamically balanced by the rate of decrease due to break-up into smaller bubbles. It is further shown in § 4 that this corresponds to the self-similarity of $W_b(D)$ in the intermediate bubble-size subrange $L_H \ll D \ll L$, which emerges when there is a sufficient separation of scales.

3.3. The model binary break-up kernel and the corresponding break-up flux

Assuming that all break-up events are independent of one another, i.e. that they follow a Markovian (memoryless) stochastic process where each break-up event is independent of all previous events, and that only binary break-up events occur, a model form for the break-up kernel $T_b(D)$ may be constructed as follows (e.g. Filippov 1961; Valentas & Amundson 1966; Valentas *et al.* 1966; Coulaloglou & Tavlarides 1977; Ramkrishna 1985; Martínez-Bazán *et al.* 1999*a*; Martínez-Bazán, Montañés & Lasheras 1999*b*; Chan *et al.* 2018*a*)

$$T_b(D) = \int_D^\infty \mathrm{d}D_p \, q_b(D|D_p) g_b(D_p) f(D_p) D^3 - g_b(D) f(D) D^3.$$
(3.12)

The first term on the right-hand side is a source (birth) term due to the break-up of bubbles of sizes larger than D, while the second term is a sink (death) term due to the break-up of bubbles of size D into smaller bubbles. The differential break-up rate $g_b(D)f(D)$ is the expected differential rate of break-up events per unit domain volume for bubbles of size D, which is modelled as being proportional to the average number of bubbles of size Dper unit domain volume and unit size, f(D). Then, $g_b(D)$ is the characteristic break-up frequency of a bubble of size D. Also, $q_b(D|D_p)$ is the probability that a bubble of size D_p breaks into a bubble of size D and another bubble of complementary volume such that the total gaseous volume remains constant through the break-up event. Several properties of $q_b(D_c|D_p)$ that will facilitate subsequent derivations are introduced in appendix C.2. Non-binary break-up events are addressed in appendix D.1.

The corresponding break-up flux $W_b(D)$ may be interpreted in two complementary ways, recalling the concepts introduced at the end of § 2.3. First, it describes the net loss of mass from bubbles of sizes larger than D due to the break-up process modelled by $T_b(D)$, if one decomposes W_b into its incoming contributions from various parent bubbles. Second, it describes the net gain in mass in bubbles of sizes smaller than D, if one decomposes W_b into its outgoing contributions to various child bubbles. From (3.10), it is evident that these two quantities are equal in magnitude, leading to the following equivalent definitions for the break-up flux

$$W_b(D) = \int_0^D dD_c \, T_b(D_c) = -\int_D^\infty dD_p \, T_b(D_p).$$
(3.13)

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Note that this implies in turn that

$$\frac{\mathrm{d}W_b(D)}{\mathrm{d}D} = T_b(D). \tag{3.14}$$

Observe the parallels between (3.11) and (3.14), which will be addressed in § 5.1.

One may show that W_b satisfies

$$W_b(D) = \int_0^D dD_c D_c^3 \int_D^\infty dD_p \, q_b \left(D_c | D_p \right) g_b(D_p) f(D_p).$$
(3.15)

A detailed derivation is provided in appendix C.2. Note that the dimensions of W_b are $(time)^{-1}$. Note, also, that $W_b(D)$ has been expressed in terms of integrals with limits involving D, similar to the expressions (2.8) and (2.9). One may then directly infer that

$$I_p(D_p|D) = \int_0^D dD_c D_c^3 q_b \left(D_c | D_p \right) g_b(D_p) f(D_p), \qquad (3.16)$$

$$I_c(D_c|D) = \int_D^\infty \mathrm{d}D_p \, D_c^3 q_b \left(D_c | D_p \right) g_b(D_p) f(D_p). \tag{3.17}$$

The analysis of the constituent terms in these quantities is the subject of the next section.

It is emphasized again that the break-up flux W_b averages the transfer of bubble mass over many break-up events through the ensemble-averaging operation discussed in § 3.1. Assuming each event occurs independently, (3.15) may be interpreted as the summation of the bubble-mass (or gaseous volume) transfer $q_b(D_c|D_p)D_c^3$, multiplied by the average differential break-up rate $g_b(D_p)f(D_p)$, over all relevant parent and child bubble sizes. This is reiterated using concrete examples in appendix B.

4. Locality in bubble-mass transfer across bubble-size space

The presence of locality, and hence cascade-like behaviour, in the break-up flux W_b driven by turbulence may be analysed using scalings for the constituent model terms $g_b(D_p)f(D_p)$ and $q_b(D_c|D_p)$ suitable for turbulent bubble fragmentation. Consider, first, the variation of the differential break-up rate $g_b(D_p)f(D_p)$ with the parent bubble size D_p . As discussed in § 1 and as presented by Chan *et al.* (2018*a*,*b*), the bubble-size distribution has been theoretically, experimentally and numerically demonstrated to scale as $D_p^{-10/3}$ for parent bubbles of a set of intermediate sizes $L_H \ll D_p \ll L$ where fragmentation occurs due to turbulence in the carrier phase. The $D_p^{-10/3}$ power-law scaling for the size distribution is revisited in Part 2 in relation to a set of numerical simulations of breaking waves to be discussed. Assuming

$$f(D_p) \sim D_p^{-10/3}$$
 (4.1)

in this range of bubble sizes, it remains to examine the scaling of the characteristic break-up frequency g_b with D_p . This may be estimated by recalling from § 2.1 that at some length scale D_p in the inertial subrange $L_K \ll D_p \ll L$, turbulent velocity fluctuations scale as $u_{D_p} \sim D_p^{1/3}$. The characteristic break-up frequency of super-Hinze-scale bubbles

of size D_p may then be estimated as the inverse of the corresponding eddy turnover time

$$g_b(D_p) \sim u_{D_p}/D_p \sim D_p^{-2/3}.$$
 (4.2)

This yields the following scaling for the differential break-up rate $g_b f$ in the intermediate size subrange $L_H \ll D_p \ll L$ (Filippov 1961; Chan & Johnson 2019; Qi *et al.* 2020)

$$g_b(D_p)f(D_p) \sim D_p^{-4}.$$
 (4.3)

The frequency scaling $g_b \sim D_p^{-2/3}$ has been suggested in other studies, including the break-up models of Coulaloglou & Tavlarides (1977), Lee, Erickson & Glasgow (1987*a*,*b*) and Martínez-Bazán *et al.* (1999*a*). In addition, Martínez-Bazán *et al.* (2010) and Qi *et al.* (2020) demonstrated that several other models in the literature that may not at first seem to have a $D_p^{-2/3}$ scaling do in fact predict a very similar scaling at sufficiently large D_p . As mentioned in § 1, this frequency scaling was also observed in experiments discussed by Martínez-Bazán *et al.* (1999*a*) and Rodríguez-Rodríguez *et al.* (2006), and is also consistent with the breaking-wave simulations to be discussed in Part 2. It is emphasized here that $g_b \sim D_p^{-2/3}$ is an appropriate scaling only for bubbles in the intermediate size subrange $L_H \ll D_p \ll L$ where the action of turbulent velocity fluctuations dominates the effects of surface tension for the purposes of fragmentation. Thus, bubbles of sizes very close to the Hinze scale may have break-up frequencies that diverge from this idealized scaling as capillary effects enter the picture. Note, also, that the ratio u_{D_p}/D_p in (4.2) may still be used to estimate $g_b(D_p)$ for turbulent break-up outside of the inertial subrange if a more general model for the turbulent kinetic energy spectrum is available to estimate u_{D_p} as a more involved function of D_p .

A complete characterization of locality requires knowledge of the break-up probability $q_b(D_c|D_p)$ as well. Compared to the scalings for f and g_b above, there is less consensus among analytical, experimental and numerical studies on the appropriate scaling of q_b with D_c and D_p in the context of turbulent break-up. Various model forms have been developed from statistical ansatzes, phenomenological arguments and empirical data, as reviewed in detail by Lasheras *et al.* (2002), Liao & Lucas (2009), Martínez-Bazán *et al.* (2010) and Solsvik, Tangen & Jakobsen (2013). Two canonical distributions in bubble-volume space are used as surrogate models to cover the range of these model forms: the uniform distribution and the beta distribution. The validity of these surrogate models will be examined using the simulations in Part 2.

4.1. Uniform distribution in bubble-volume space

Consider, first, the uniform distribution in bubble-volume space $(D^3$ -space)

$$q_b \left(D_c^3 | D_p^3 \right) = \begin{cases} \frac{2}{D_p^3}, & 0 \le D_c^3 \le D_p^3, \\ 0, & D_p^3 < D_c^3, \end{cases}$$
(4.4)

where the factor of 2 arises from the assumption of binary break-up. From the properties of q_b discussed in appendix C.2, this is equivalent to the following distribution in bubble-size

space (D-space)

$$q_b(D_c|D_p) = \begin{cases} \frac{6D_c^2}{D_p^3}, & 0 \le D_c \le D_p, \\ 0, & D_p < D_c, \end{cases}$$
(4.5)

where the additional factor of 3 arises from the change in variables from D^3 to D. With the available scalings for q_b and $g_b f$, the relations (3.16) and (3.17) yield

$$I_p(D_p|D) \sim \int_0^D \mathrm{d}D_c \, D_c^5 D_p^{-7} \sim D^6 D_p^{-7}, \quad I_c(D_c|D) \sim \int_D^\infty \mathrm{d}D_p \, D_c^5 D_p^{-7} \sim D_c^5 D^{-6}.$$
(4.6*a*,*b*)

Observe that I_p and I_c rapidly decrease as $D_p \to \infty$ and $D_c \to 0$, respectively, indicating that W_b may be reasonably approximated as size local. More specifically, the limits

$$I_p(D_p|D) \sim D_p^{\gamma_p} \sim D_p^{-7},\tag{4.7}$$

$$I_c(D_c|D) \sim D_c^{\gamma_c} \sim D_c^5 \tag{4.8}$$

hold as $D_p \to \infty$ and $D_c \to 0$, respectively. The exponents γ_p and γ_c were referenced earlier in figures 4(b) and 5(b), respectively. Note that these relations hold even at $D_p \sim D$ and $D_c \sim D$, respectively, because q_b is separable in D_p and D_c . Thus, a stronger statement on locality may be made in the case of the uniform distribution; since

$$W_b(D) \sim \left(\int_0^D \mathrm{d}D_c \, D_c^5\right) \times \left(\int_D^\infty \mathrm{d}D_p \, D_p^{-7}\right) \tag{4.9}$$

may be expressed as the separable product of two integrals, one may further conclude that $W_b(D)$ may be directly approximated by a movement of bubble mass in bubble-size space from some bubble size only slightly larger than D to some bubble size only slightly smaller than D. Finally, as a self-consistency check, one may obtain the scaling of $W_b(D)$ with D

$$W_b(D) \sim \int_0^D \mathrm{d}D_c \, D_c^5 D^{-6} \sim \int_D^\infty \mathrm{d}D_p \, D^6 D_p^{-7} \sim D^6 D^{-6} \sim \text{constant.}$$
(4.10)

If the underlying energy flux in the surrounding turbulence is scale invariant within an inertial subrange, and the break-up probability is chosen to be size invariant in a corresponding intermediate range of bubble sizes, then the resulting bubble break-up flux is size invariant, confirming the presence of an intermediate size subrange where the break-up process is self-similar in nature. Self-similarity is compatible with the assumption of statistical quasi-stationarity and quasi-homogeneity as evidenced by (3.9)and (3.14), assuming only T_b is active on the right-hand side of (3.9) in this intermediate size subrange. The potential non-stationarity of a non-self-similar break-up process is further addressed in appendix D.2.

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Figure 7. The symmetric beta distribution in D^3 -space (4.11) for various shape parameters α .

4.2. Beta distribution in bubble-volume space

Recall from § 3.3 that the break-up probability is symmetric in bubble-volume space. The beta distribution that satisfies this constraint can take only a single shape parameter α , and may be expressed in bubble-volume space, or D^3 -space, as

$$q_b(D_c^3|D_p^3) = \begin{cases} 2D_c^{3(\alpha-1)} \left(D_p^3 - D_c^3\right)^{\alpha-1} D_p^{-6(\alpha-1)-3} / B(\alpha,\alpha), & 0 \le D_c^3 \le D_p^3, \\ 0, & D_p^3 < D_c^3, \end{cases}$$
(4.11)

where $B(\alpha, \alpha)$ is the beta function (Abramowitz & Stegun (1964), §6.2), which is a normalization constant for the beta distribution with shape parameter α , and the factor of 2 arises from the assumption of binary break-up. This distribution is plotted in figure 7 for several values of α . Note that the uniform distribution is recovered when $\alpha = 1$. The beta distribution is defined only for $\alpha > 0$. When $0 < \alpha < 1$, the distribution is U-shaped and goes to infinity at the endpoints of the domain, thus favouring the formation of bubbles of unequal sizes. The formation of these bubbles is permitted in the infinite-Weber-number limit where the Hinze scale is zero, as discussed in the introduction. For practical flows with finite integral-scale Weber numbers, the favourable formation of bubbles of sizes smaller than the Hinze scale may not be as plausible, and a more precise surrogate model for q_b may have to involve a truncated U-shaped beta distribution, or an M-shaped distribution. Nevertheless, the U-shaped beta distribution should remain an adequate surrogate model for parent bubbles of sizes L_n in the intermediate size subrange $L_H \ll L_n \ll L$ and sufficiently larger than the Hinze scale. When $\alpha > 1$, the distribution is inverted-U-shaped and goes to zero at the endpoints, thus favouring the formation of bubbles of equal sizes. The beta distribution is thus a reasonable surrogate model for most observed and modelled break-up distributions, except for the class of M-shaped distributions. One such distribution was introduced by Wang, Wang & Jin (2003); see the reviews cited in the preamble of this section for more examples. The analogue of (4.11) in



Figure 8. Integrands of W_b demonstrating the extent of (*a*) infrared locality using (4.13) and (*b*) ultraviolet locality using (4.14) after substituting the symmetric beta distribution with various shape parameters α for the probability distribution of child bubble volumes q_b , as well as scalings for the differential bubble break-up rate $g_b f$ corresponding to a turbulent break-up mechanism. Since the proportionality constants are dropped in (4.13) and (4.14), the integrands here are plotted in arbitrary units, with the values at $D_p = D$ (for (*a*)) and $D_c = D$ (for (*b*)) fixed at unity. The power-law fits at large D_p/D and small D_c/D correspond to the scaling limits in (4.15) and (4.16) for $\alpha = 1/5$ and $\alpha = 5$.

bubble-size space, or D-space, is

$$q_b(D_c|D_p) = \begin{cases} 6D_c^{3\alpha-1}(D_p^3 - D_c^3)^{\alpha-1}D_p^{3-6\alpha}/B(\alpha, \alpha), & 0 \le D_c^3 \le D_p^3, \\ 0, & D_p^3 < D_c^3. \end{cases}$$
(4.12)

With the available scalings for q_b and $g_b f$, the relations (3.16) and (3.17) yield

$$I_p(D_p|D) \sim \int_0^D \mathrm{d}D_c \, \frac{D_c^{3\alpha+2}}{(D_p^3 - D_c^3)^{1-\alpha}} D_p^{-1-6\alpha} \sim D_p^{-1} \int_0^{D^3/D_p^3} \mathrm{d}x \, x^{\alpha} (1-x)^{\alpha-1}, \quad (4.13)$$

$$I_c(D_c|D) \sim \int_D^\infty \mathrm{d}D_p \, \frac{D_p^{-1-6\alpha}}{(D_p^3 - D_c^3)^{1-\alpha}} D_c^{3\alpha+2} \sim D_c^{-1} \int_0^{D_c^3/D^3} \mathrm{d}x \, x^\alpha (1-x)^{\alpha-1}.$$
(4.14)

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The final integrals in (4.13) and (4.14) are the incomplete beta functions $B_{D^3/D_p^3}(\alpha + 1, \alpha)$ and $B_{D_c^3/D^3}(\alpha + 1, \alpha)$, respectively (Abramowitz & Stegun (1964), §§ 6.6.1 and 26.5.3). The results discussed in § 4.1 are exactly recovered when $\alpha = 1$. The expressions in (4.13) and (4.14) are plotted in arbitrary units as functions of D_p/D and D_c/D , respectively, in figure 8. As α increases, the rates of decay of I_p and I_c as $D_p \rightarrow \infty$ and $D_c \rightarrow 0$, respectively, increase, indicating that as break-up events involving child bubbles of similar sizes are increasingly favoured, the locality of the break-up process correspondingly increases. At small α , where the most likely break-up events involve child bubbles of very different sizes, the cascade is diffuse, or leaky, and the bubble break-up flux is less local. Also, for sufficiently large D_p and sufficiently small D_c , (4.13) and (4.14) may respectively be approximated as

$$I_p(D_p|D) \approx \frac{D_p^{-1-6\alpha}}{D_p^{3(1-\alpha)}} \sim D_p^{-4-3\alpha} \sim D_p^{\gamma_p},$$
 (4.15)

$$I_c(D_c|D) \approx D_c^{3\alpha+2} \sim D_c^{\gamma_c}.$$
(4.16)

Recall that the exponents γ_p and γ_c were referenced earlier in figures 4(b) and 5(b), respectively. Note, also, that in these limits, I_p decays at least as quickly as D_p^{-4} , and I_c grows at least as quickly as D_c^2 , so the break-up flux is always at least quasi-local regardless of α , for values of α where the beta distribution is defined. Once again, the results of § 4.1 are recovered – in an exact fashion – for $\alpha = 1$. Note, in addition, that a bubble break-up process best described by an M-shaped distribution may be modelled by a superposition of two bubble-mass fluxes due to two q_b values with different α values. Since each bubble-mass flux is always at least quasi-local regardless of α , this implies that M-shaped distributions also result in a net quasi-local flux. Finally, one may also examine the dependence of $W_b(D)$ on D as a self-consistency check

$$W_{b}(D) \sim \int_{0}^{D} dD_{c} \left[D_{c}^{-1} \int_{0}^{D_{c}^{3}/D^{3}} dx x^{\alpha} (1-x)^{\alpha-1} \right]$$

$$\sim \int_{D}^{\infty} dD_{p} \left[D_{p}^{-1} \int_{0}^{D^{3}/D_{p}^{3}} dx x^{\alpha} (1-x)^{\alpha-1} \right]$$

$$\sim \int_{0}^{1} dy \left[y^{-1} \int_{0}^{y^{3}} dx x^{\alpha} (1-x)^{\alpha-1} \right]$$

$$\sim \text{ constant,}$$
(4.17)

which reveals, as expected, an intermediate bubble-size subrange for the bubble break-up flux where the break-up process is self-similar in nature, if α is constant over the size subrange. Once again, self-similar behaviour of W_b is compatible with the statistical quasi-stationarity and quasi-homogeneity of the system ($T_b = 0$). The potential non-stationarity of a non-self-similar break-up process is further addressed in appendix D.2.

4.3. Revisiting some of the assumptions in the bubble break-up formalism

Note that the findings of this work assume that all break-up events are binary in nature. The binary break-up assumption precludes the formation of satellite bubbles, which might be assumed to decrease the locality of the resulting bubble-mass transfer and also disrupt self-similarity. It turns out, however, that locality and self-similarity remain plausible in such a scenario. Non-binary break-up events are addressed in appendix D.1. As mentioned earlier, appendix D.2 discusses non-self-similar break-up mechanisms, which may be relevant in systems without sufficient scale separation. It turns out that locality remains relatively robust even in the absence of self-similarity.

The extent of locality in the break-up flux $W_b(D)$, in particular the respective scalings of $I_p(D_p|D)$ and $I_c(D_c|D)$ with D_p and D_c , will be examined in Part 2 via a direct evaluation of the flux from all relevant break-up events in a breaking-wave simulation.

5. Model descriptions for bubble-mass transfer and their implications on subgrid-scale modelling

5.1. Relations between bubble-mass and spectral energy flux models

The break-up flux $W_b(D) = \int_0^D dD_c T_b(D_c)$ describes the average movement of bubble mass $\sim f(D)D^3$ in bubble-size space (*D*-space) as governed by the population balance equation given in (3.6) and (3.9), where the rate of change of $f(D)D^3$ due to break-up is $T_b(D)$, recalling from the introduction that mass and volume are assumed to be equivalent in the incompressible limit. This is analogous to how the transfer flux $W(k) = \int_0^k dk' T(k')$ describes the movement of turbulent kinetic energy E(k) in wavenumber space (*k*-space) based on the spectral turbulent kinetic energy equation (Batchelor 1953)

$$\frac{\partial E(k,t)}{\partial t} = T(k,t) - 2\nu_l k^2 E(k,t), \qquad (5.1)$$

where the rate of change of E(k) due to interscale transfer is T(k), and the time dependence drops off in the quasi-stationary limit. In particular, the double-integral form of the break-up flux (3.15) is reminiscent of the spectral energy transfer model of Heisenberg (1948*a*,*b*), where W(k) is modelled as a separable product of integrals

$$W(k) \sim \left(\int_{0}^{k} dk' E(k') {k'}^{2}\right) \times \left(\int_{k}^{\infty} dk'' \sqrt{\frac{E(k'')}{k''^{3}}}\right).$$
 (5.2)

By substituting the inertial subrange scaling $E(k) \sim k^{-5/3}$ into (5.2), one obtains $k'^{-5/3}k'^2 \sim k'^{1/3}$ and $\sqrt{k''^{-5/3}k''^{-3}} \sim k''^{-7/3}$ for the scalings of the two integrands, suggesting some degree of infrared and ultraviolet locality, respectively. Remarkably, it turns out that these model limits agree with the scalings obtained in the analyses by Eyink (2005), Eyink & Aluie (2009) and Aluie & Eyink (2009) for the turbulent energy cascade for a monofractal velocity field, as well as an earlier analysis by Kraichnan (1971) based on closure approximations that also introduces a measure of locality and earlier investigations by Zhou (1993*a*,*b*) based on numerical simulations. Note that these rates of decay are slower than those obtained in §§ 4.1 and 4.2 for the bubble-mass flux integrands, suggesting that the turbulent bubble-mass cascade may be more strongly local than the turbulent energy cascade. One may further evaluate these integrals

$$W(k) \sim \int_0^k \mathrm{d}k' k'^{1/3} \int_k^\infty \mathrm{d}k'' k''^{-7/3} \sim k^{4/3} k^{-4/3} \sim \text{constant}, \tag{5.3}$$

in order to see that W(k) has no dependence on k, as one would expect for a self-similar energy transfer process. Note that this self-similarity, in turn, implies that the underlying

system dynamics is statistically steady or quasi-stationary, since T(k) must then be negligible in the range of scales of interest. An analogous observation was made in the case of the bubble break-up flux in §§ 4.1 and 4.2.

If the true W(k) is quasi-local in k-space, then it may be well approximated by a wavenumber-local expression. This brings to mind the quasi-local models of Kovasznay (1948) and Pao (1965, 1968). Kovasznay (1948) argued that if W(k) is dependent only on E(k) and k, then the only dimensionally consistent expression is

$$W(k) \sim [E(k)]^{3/2} k^{5/2}.$$
 (5.4)

Subsequently, Pao (1965, 1968) allowed W(k) to depend on ε as well. If it is further assumed that W(k) is linear in E(k), then it follows from dimensional arguments that

$$W(k) \sim \varepsilon^{1/3} k^{5/3} E(k).$$
 (5.5)

In a similar fashion, $W_b(D)$ may be justifiably modelled by an expression local in *D*-space if there is sufficient quasi-locality in the break-up flux. From a comparison of (3.11) and (3.14), it is clear that the local transport term in the phase-space-based population balance equation provides an appropriate model form for a local W_b . Then, one desires an appropriate model for the velocity of $f(D)D^3$ in bubble-size space, $v_D(D)$, such that

$$W_b(D) \sim v_D(D) f(D) D^3.$$
(5.6)

If there exists an intermediate bubble-size subrange where $W_b(D)$ is independent of D, and $f(D) \sim D^{-10/3}$, then an appropriate model for $v_D(D)$ should satisfy

$$v_D(D) \sim D^{1/3}.$$
 (5.7)

Note that this is similar to the scaling for the turbulent velocity fluctuations with eddy size $u_D(D) \sim D^{1/3}$. The scaling for v_D was previously postulated by Garrett *et al.* (2000) on the dimensional grounds that $v_D \sim u_D$, but one should be cognizant of the difference between bubble-size space and eddy-size space. In addition, the term $\partial (v_D f D^3)/\partial D$ in the original supporting reference (Garrettson 1973) was used to model a dissolution process, meaning that the model form referenced by Garrett *et al.* (2000) is applicable only to the change in bubble mass in individual events. Here, the model form for size-local bubble-mass transport is not applicable to individual events, as will be clarified by the discussion in appendix **B**. The locality of the corresponding bubble-mass flux must necessarily be interpreted in an averaged sense, as all turbulent cascades should be. In turn, the model velocity v_D strictly describes the averaged break-up dynamics in small, localized regions of turbulent bubbly flows with sufficient scale separation.

To close this discussion, recall the scaling for the break-up frequency $g_b(D) \sim D^{-2/3}$, which may be interpreted as the inverse of the characteristic break-up time of bubbles of size D. If one assumes that the flux $W_b(D)$ is effectively described by a size-space velocity $v_D(D)$ such that a characteristic size interval D is travelled in this characteristic time, then one may write $v_D(D) \sim g_b(D)D$, and thus $W_b(D) \sim g_b(D)f(D)D^4$. The scaling $g_b(D)f(D) \sim D^{-4}$ is thus seen to follow directly from the assumption of a quasi-local and self-similar bubble break-up flux. The scaling of Garrett *et al.* (2000) for $f \sim Q\varepsilon^{-1/3}D^{-10/3}$, obtained via dimensional analysis in an intermediate bubble-size subrange using a steady large-scale entrainment rate Q, is also a direct consequence of quasi-locality and self-similarity in the bubble-mass flux, with the additional consideration that $Q \sim W_b$. This exhibits a clear parallel to the turbulent energy cascade, where it is also typically assumed that the energy production and cascade rates are of the same order of magnitude. Some of these ideas are summarized in the schematic on bubble-mass transport in figure 9. Further remarks on Q are provided in appendix E.

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Figure 9. Schematic of local transport of bubble mass $\sim fD^3$ in *D*-space. The large-scale entrainment rate *Q* is directly related to the bubble-mass flux $W_b \sim v_D fD^3 \sim g_b fD^4$.



Figure 10. Schematic illustrating subgrid-scale modelling in turbulent bubbly flows.

5.2. Implications for subgrid-scale modelling

Aside from providing a theoretical basis for the scalings for f and v_D proposed by Garrett et al. (2000) through connections to the characteristic break-up frequency g_b (Kolmogorov 1949; Hinze 1955; Martínez-Bazán et al. 1999a), this work has also posited that the bubble break-up cascade provides a universal description of the bubble break-up dynamics at small and intermediate bubble sizes in small, localized regions of turbulent bubbly flows with sufficient scale separation. For example, the break-up flux in these small, localized regions should be constant in an intermediate subrange of bubble sizes $L_H \ll L_n \ll L$, provided the surrounding turbulence is sufficiently energetic. Universality simplifies the task of subgrid-scale modelling in turbulent two-phase flows with a large separation of scales, and lends legitimacy to a universal subgrid-scale model in the spirit of LES of turbulent single-phase flows. In traditional LES, large-scale turbulent motions and flow structures are resolved, while small-scale motions and structures are modelled. The rationale for this approach is twofold, as discussed succinctly by Rogallo & Moin (1984). Large-scale motions are influenced by the flow geometry and cannot be assumed to have a universal character. They are thus explicitly resolved, along with the bulk of the energy in the flow. Small-scale motions may be assumed to have a universal character and are instead represented by models that dissipate energy in a universal fashion. A similar idea may be applied to turbulent two-phase flows where a separation of scales enables a universal description of the small scales. Large structures of the dispersed phase are explicitly resolved via an interface-tracking or interface-capturing method, while small structures of the dispersed phase are treated as subgrid entities using a Lagrangian point-particle description. If the formation and dynamics of these subgrid bubbles occur in a universal fashion, then simplified models may be used to generate these bubbles through the modelled break-up of larger bubbles. For example, the results of this work suggest that in simulations where the mesh resolution is larger than the expected L_H , the generation of super-Hinze-scale subgrid bubbles may be modelled via

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a bubble break-up cascade, as illustrated in figure 10. As noted in the introduction, most sub-Hinze-scale bubbles are expected to be formed by distinct fragmentation mechanisms, such as Mesler entrainment, as well as regular and irregular drop entrainment (Deane & Stokes 2002; Kiger & Duncan 2012; Chan *et al.* 2018*b*, 2019). As such, the generation of sub-Hinze-scale subgrid bubbles will have to be addressed separately in a manner that bypasses the cascade considered in this work (see e.g. Chan *et al.* 2018*a*,*b*, 2019; Mirjalili *et al.* 2018; Mirjalili & Mani 2020). It is envisioned that distinct subgrid-scale models for sub-Hinze-scale and super-Hinze-scale subgrid bubbles be combined in an additive fashion in order to account for this myriad of fragmentation mechanisms and cover more bases for modelling the formation and dynamics of subgrid bubbles. A detailed formulation of a suitable subgrid-scale model in the context of super-Hinze-scale subgrid bubbles is under development. This model would use both the kernel-based break-up model form (3.15), as well as the phase-space-based break-up model form (5.6).

6. Conclusions

This paper explores the properties of the bubble break-up cascade that was postulated by Garrett et al. (2000) to generate a spectrum of bubble sizes beneath breaking waves, and more generally in high-Reynolds-number and high-Weber-number turbulent flows. The description of the turbulent bubble-mass cascade is strongly analogous to the turbulent energy cascade in single-phase turbulence (Richardson 1922; Kolmogorov 1941; Onsager 1945). An intrinsic feature of these cascades is the approximate scale locality of interscale fluxes. In the case of the bubble-mass cascade, this specifically refers to the bubble-mass flux from large- to small-bubble sizes, which is governed by bubble break-up event statistics. Novel manipulation of a mass-conserving population balance equation for the bubble-size distribution, f, is shown to yield quantitative insights into the locality of this flux. The key ingredient for locality is the adoption of turbulent-flow scalings for f and the break-up frequency, g_b , with theoretical, numerical and experimental support. With these scalings, the flux is shown to be infrared local, where flux contributions from parent bubbles of sizes $D_p > D$ decay faster than $(D_p/D)^{-4}$, and ultraviolet local, where flux contributions to child bubbles of sizes $D_c < D$ decay faster than $(D/D_c)^{-2}$. In other words, the bubble-mass flux is approximately size local with a power-law decay for longer-range interactions. These flux scalings suggest that the turbulent bubble-mass cascade is more strongly local than the turbulent energy cascade. The presence of locality is not too sensitive to the probability distribution of child bubble volumes, q_b , but the shape of the distribution influences the strength of locality. In the case of the uniform distribution, for example, flux contributions from parent bubbles may decay as quickly as $(D_p/D)^{-7}$, and flux contributions to child bubbles may decay as quickly as $(D/D_c)^{-5}$. Under the assumptions of quasi-stationarity and quasi-homogeneity, it may be further deduced that the bubble break-up flux is self-similar in an intermediate bubble-size subrange, much like the energy flux in the inertial subrange in the energy cascade. The theoretical tools introduced here in Part 1 enable detailed inspection of numerical simulations of breaking waves in a forthcoming companion paper, Part 2, through a detailed analysis of bubble break-up statistics. Taken together, these findings confirm key physical aspects of the turbulent bubble break-up cascade phenomenology and provide a theoretical basis for the dimensional analysis of Garrett et al. (2000) using traditional turbulent-flow scalings for bubble break-up (Kolmogorov 1949; Hinze 1955; Martínez-Bazán et al. 1999a). Locality in the bubble-mass-transfer process implies that small-bubble break-up may be universal in small, localized regions in a variety of turbulent bubbly flows with sufficient scale separation. In particular, the results of this work have not been specifically derived for

oceanic breaking waves, and might be broadly applicable to other turbulent two-phase flows under appropriate conditions, such as bubble break-up in stirred tanks and reactors. This universality lends legitimacy to the construction of universal subgrid-scale models for the break-up of subgrid bubbles in LES of these flows.

On average, the bubble break-up cascade transfers bubble mass from large- to small-bubble sizes. The sustained presence of this break-up cascade implies the eventual dominance of the bubble dynamics by these small bubbles. Small bubbles are known to linger in terrestrial air-water flows due to their low rise velocity (Garrettson 1973; Thorpe 1982, 1992; Trevorrow, Vagle & Farmer 1994). Knowledge of the behaviour of these bubbles is thus of practical importance for characterizing these flows. Effective predictive modelling of the statistics of these bubbles leads to accurate prediction of physical phenomena related to the acoustical and optical responses of these bubbles, such as the persistent wake signatures of seafaring vessels. The results of Part 2 will demonstrate the relevance of this cascade mechanism in realistic air-water flow configurations, while the modelling approach to be introduced in forthcoming work is a step towards accurate physics-based prediction of small-bubble statistics in these practical configurations.

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Author ORCIDs.

- Wai Hong Ronald Chan https://orcid.org/0000-0002-3525-6319;
- Perry L. Johnson https://orcid.org/0000-0002-7929-9396;
- Derviz Moin https://orcid.org/0000-0002-0491-7065.

Appendix A. Similarity hypotheses for the turbulent energy and bubble-mass cascades

A.1. Kolmogorov's similarity hypotheses for high-Re single-phase turbulent flows

Kolmogorov's hypotheses for the local structure of turbulence in high- Re_L flows (Kolmogorov 1941), which were phenomenologically reviewed in detail in § 2.1, were paraphrased by Pope (2000, § 6.1.2) and are further paraphrased here for reference:

HYPOTHESIS A.1 (Local isotropy). In flows with sufficiently high Reynolds number, the small-scale turbulent motions ($L_n \ll L$) are isotropic.

This hypothesis echoes the statements earlier that scalings relevant to statistically stationary and homogeneous turbulent flows also apply in small, localized regions in a variety of turbulent flows with sufficient scale separation.

HYPOTHESIS A.2 (First similarity hypothesis). For locally isotropic turbulence, the statistics of the small-scale turbulent motions $(L_n \ll L)$ have a universal form that is uniquely determined by ε and ν_l .

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HYPOTHESIS A.3 (Second similarity hypothesis). At scales in the range $L_K \ll L_n \ll L$ in locally isotropic turbulence, the statistics of the turbulent motions have a universal form that is uniquely determined by ε and independent of v_l .

Note that in the original hypotheses, the 'statistics of the turbulent motions' refer specifically to the statistics of the second-order velocity structure functions.

A.2. Proposed similarity hypotheses for high-Re and high-We turbulent bubbly flows

A corresponding set of similarity hypotheses pertaining to the turbulent bubble-mass cascade examined in § 2.2 is proposed here:

HYPOTHESIS A.4 (Single-size approximation). In bubbly flows with sufficiently high Weber number, the statistics of sufficiently small bubbles of volumes $L_n^3 \ll L^3$ may be analysed by parameterizing each bubble by a single length scale L_n .

If the phase space of the bubble-size distribution contains no other important dimensions, then the single-size approximation enables the treatment of the distribution as a one-dimensional probability distribution in bubble-size space.

HYPOTHESIS A.5 (First similarity hypothesis for gas transfer in bubble-size space due to turbulent break-up). The statistics of sufficiently small bubbles of sizes $L_n \ll L$ have a universal form that is uniquely determined by ε and σ/ρ_l .

HYPOTHESIS A.6 (Second similarity hypothesis for gas transfer in bubble-size space due to turbulent break-up). The statistics of bubbles of sizes $L_H \ll L_n \ll L$ have a universal form that is uniquely determined by ε and independent of σ/ρ_l .

Hypothesis A.6 implies the presence of an intermediate bubble-size subrange for bubble-mass transfer in turbulent bubbly flows with sufficiently high We_L , in an analogous fashion to the inertial subrange implied by hypothesis A.3.

The proposed hypotheses for the turbulent bubble-mass cascade are chiefly applicable to low-order bubble statistics like the bubble-size distribution f, by analogy with the low-order flow statistics referenced by Kolmogorov's original similarity hypotheses.

Appendix B. Contributions of individual break-up events to the break-up flux W_b

The break-up flux W_b introduced in §§ 2.3 and 3.3 is a statistical quantification of the bubble-mass-transfer rate due to many independent break-up events, obtained through the ensemble-averaging operation discussed in § 3.1. The meaning and significance of locality may be elucidated by isolating the contributions of each break-up event to the flux $W_b(D)$. Assume that a parent bubble of size $D_p > D$ breaks up into two child bubbles of sizes D_{c1} and D_{c2} . Non-binary break-up events are further discussed in appendix D.1. By the conservation of mass, these bubble sizes must satisfy the constraint $D_p^3 = D_{c1}^3 + D_{c2}^3$. The contribution of each of these break-up events to the total flux $W_b(D)$ across the bubble size D depends on the magnitudes of D_{c1} and D_{c2} are both larger than D, then no bubble mass is transferred to any bubbles of sizes smaller than D. The resulting contribution to $W_b(D)$ in this case is zero. Second, if D_{c1} is smaller than D while D_{c2} is larger than D, i.e. D_p , to



Figure 11. Schematics illustrating the three cases of break-up events discussed in appendix B. Parent bubbles have a dark fill colour, while child bubbles have a light fill colour. Child bubbles that contribute to the bubble-mass flux $W_b(D)$ are marked with a dark border.

a bubble of size smaller than D, i.e. D_{c1} . Third, if both D_{c1} and D_{c2} are smaller than D, then the volume $D_p^3 = D_{c1}^3 + D_{c2}^3$ is transferred from a bubble of size larger than D to bubbles of sizes smaller than D. These three cases are schematically illustrated in figure 11. The relative frequency of these three cases is encapsulated in the break-up probability distribution $q_b(D_c|D_p)$ over all child bubble sizes $D_c \leq D_p$, as well as the ratio D_p/D . The average contribution of a single break-up event involving a parent bubble of size D_p to the total flux $W_b(D)$ may be obtained by integrating the differential average volume transfer $q_b(D_c|D_p)D_c^3$ over all eligible child bubble sizes $D_c < D$. If these break-up events are independent of one another, then the total flux $W_b(D)$ may be constructed by multiplying this average gaseous volume transfer due to a single event involving a parent bubble of size $D_p f(D_p)$, and then integrating over all eligible parent bubble sizes $D_p > D$. One may heuristically construct the expression (3.15) for W_b given these considerations.

Two observations may be made about the relationship between the bubble-mass-transfer rate due to individual break-up events and the average flux W_b . First, an individual event that is itself non-local in bubble-size space may not contribute strongly to the non-locality of the corresponding W_b if the frequency of this event is small. The intuition provided by a single event may thus not offer the complete story on the locality of W_b . Second, the bubble-mass-transfer rate is a volume-weighted quantity. Consider the case where a parent bubble of size $D_p > D$ breaks into two child bubbles of sizes $D_{c1} < D$ and $D_{c2} \gg D_{c1}$. While this may appear to be a highly non-local event since D_{c1} is far removed from D_p , the gaseous volume that is transferred from the bubble of size D_p to the bubble of size D_{c1} is $D_{c1}^3 \ll D_p^3$. The influence of this non-local transfer on the non-locality of $W_b(D)$ is limited by this volume weighting.

Appendix C. More about the mathematical formalism

C.1. The population balance equation

The population balance equation is a phenomenological evolution equation for a probability density function in a predefined phase space describing a population of

discrete entities. As such, the equation should respect the conservation laws governing this population. In (3.5), the total mass of gas in all the bubbles is conserved in the x-D phase space, except for buoyant degassing, the influx of gas due to processes like large-scale entrainment, and analogous sink terms for the gaseous mass in the limit of small bubble sizes. It has been implicitly assumed that a single parameter, D, suitably describes the size of the bubbles (Williams 1958). As suggested in hypothesis A.4 in appendix A.2, this is appropriate in a flow with a sufficiently high We_L . Note that the population balance equation resembles the classical Liouville equation, except that no claim is made here about the divergence of the phase-space velocity field. One may also interpret (3.5) as a generalized Boltzmann equation (Garrettson 1973; Carrica *et al.* 1999; Solsvik & Jakobsen 2015) where bubbles may split, degas or be entrained in addition to colliding with one another. These various effects are subsumed in the generalized collision term, H.

Equation (3.6) describes the movement of gaseous mass in bubble-size space in small, localized regions of turbulent bubbly flows, albeit in a probabilistic manner. By the conservation of total mass of gas and statistical quasi-stationarity, H(D) must satisfy

$$\int_{0}^{\infty} dD H(D) = R_d / \mathcal{V} + R_e / \mathcal{V} \underbrace{= 0}_{\substack{\text{statistical} \\ \text{quasi-stationarity}}}$$
(C1)

in the limit of negligible buoyant degassing, where $R_d < 0$ and $R_e > 0$ are the volumetric rates of small-scale removal and large-scale addition, respectively. Noting that the left-hand side of (3.6) is the conservative form of the convective operator acting on $f(D)D^3$, (C1) implies that the total amount of $f(D)D^3$ in the entire semi-infinite *D*-space cannot change except due to gas removal and/or addition, whose effects balance each other in the limit of statistical quasi-stationarity. Break-up and coalescence events do not generate or eliminate bubble mass, and thus do not contribute to the integral mass balance in (C1).

In (3.9), one may decompose $T_s(D) = T_d(D) + T_e(D) + T_g(D)$ into a small-scale sink kernel $T_d(D)$, a large-scale source kernel $T_e(D)$, and a sink kernel due to buoyant degassing $T_g(D)$, such that $\int_0^\infty dD T_d(D) = R_d/\mathcal{V} < 0$ and $\int_0^\infty dD T_e(D) = R_e/\mathcal{V} > 0$. If $T_d(D)$ and $T_e(D)$ are assumed to be active only at small and large D, respectively, and $T_c(D)$ and $T_g(D)$ are also assumed to be negligible, then an intermediate bubble-size subrange $L_H \ll D \ll L$ emerges where $T_b(D) = 0$ as implied by hypothesis A.6 in appendix A.2. Equations (3.11) and (3.14) further imply that W_b is constant in this size subrange in the spirit of self-similarity.

C.2. The model break-up kernel

Several properties of the probability distribution of child bubble sizes, $q_b(D_c|D_p)$, are introduced here (Ramkrishna 1985; Martínez-Bazán *et al.* 2010). The mechanics of break-up require (Valentas *et al.* 1966)

$$q_b(D_c|D_p) = 0 \quad \text{if } D_c \geqslant D_p, \tag{C2}$$

since a bubble cannot break to form bubbles larger than itself. Then, q_b may be normalized such that

$$\int_{0}^{D_{p}} \mathrm{d}D_{c} \, q_{b}(D_{c}|D_{p}) = \int_{0}^{\infty} \mathrm{d}D_{c} \, q_{b}(D_{c}|D_{p}) = 2, \tag{C3}$$

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where the factor of 2 arises from the assumption of binary break-up. As a result of this normalization, as well as the conservation of bubble mass, q_b will also need to satisfy

$$\int_{0}^{D_{p}} \mathrm{d}D_{c} \, q_{b}(D_{c}|D_{p})D_{c}^{3} = \int_{0}^{\infty} \mathrm{d}D_{c} \, q_{b}(D_{c}|D_{p})D_{c}^{3} = D_{p}^{3}. \tag{C4}$$

Also, if a bubble of size D_p breaks into two bubbles of sizes D_1 and D_2 , then $q_b(D_1|D_p)/D_1^2 = q_b(D_2|D_p)/D_2^2$ by symmetry. This is more readily seen by observing equivalently that if a bubble of volume D_p^3 breaks into two bubbles of volumes D_1^3 and D_2^3 , then $q_b(D_1^3|D_p^3) = q_b(D_2^3|D_p^3)$ by symmetry. An appropriate change in variables from D^3 to D yields the desired relation. Using the properties of q_b described above, one may verify that the model break-up kernel (3.12) satisfies (3.10) by direct substitution. One may also show via these properties of q_b that W_b satisfies

$$\begin{split} W_{b}(D) &= \int_{0}^{D} dD_{c} T_{b}(D_{c}) \\ &= \int_{0}^{D} dD_{c} \int_{D_{c}}^{\infty} dD_{p} q_{b} \left(D_{c} | D_{p} \right) g_{b}(D_{p}) f(D_{p}) D_{c}^{3} - \int_{0}^{D} dD_{c} g_{b}(D_{c}) f(D_{c}) D_{c}^{3} \\ &= \int_{0}^{D} dD_{c} D_{c}^{3} \int_{0}^{\infty} dD_{p} q_{b} \left(D_{c} | D_{p} \right) g_{b}(D_{p}) f(D_{p}) - \int_{0}^{D} dD_{p} g_{b}(D_{p}) f(D_{p}) D_{p}^{3} \\ &= \int_{0}^{D} dD_{c} D_{c}^{3} \int_{0}^{\infty} dD_{p} q_{b} \left(D_{c} | D_{p} \right) g_{b}(D_{p}) f(D_{p}) \\ &- \int_{0}^{D} dD_{c} D_{c}^{3} \int_{0}^{\infty} dD_{p} q_{b} \left(D_{c} | D_{p} \right) g_{b}(D_{p}) f(D_{p}) \\ &= \int_{0}^{D} dD_{c} D_{c}^{3} \int_{D}^{\infty} dD_{p} q_{b} \left(D_{c} | D_{p} \right) g_{b}(D_{p}) f(D_{p}). \end{split}$$
 (C5)

Appendix D. Generalization of the bubble break-up formalism

D.1. Non-binary break-up

The constraints (C3) and (C4) need to be satisfied if bubbles in a system undergo only binary break-up events. These constraints need to be modified in the case of non-binary break-up. If the mean number of bubbles generated by a break-up event is $m \ge 2$, then the factor of 2 on the right-hand side of (C3) will need to be replaced by m. The beta-distribution surrogate model in § 4.2 may be correspondingly modified to accommodate non-binary break-up. The generic beta distribution in bubble-volume space with two shape parameters α and β takes the form

$$q_b(D_c^3|D_p^3) = \begin{cases} CD_c^{3(\alpha-1)} \left(D_p^3 - D_c^3\right)^{\beta-1} D_p^{-3(\alpha+\beta-2)-3} / B(\alpha,\beta), & 0 \le D_c^3 \le D_p^3, \\ 0, & D_p^3 < D_c^3. \end{cases}$$
(D1)

In order for the constraints (C3) – with the right-hand side modified to m – and (C4) to be satisfied, α and β need to satisfy $(m - 1)\alpha = \beta$, and C needs to satisfy C = m. In the binary break-up limit m = 2, one recovers $\alpha = \beta$ and C = 2. The distribution (D1) is

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Figure 12. The generic beta distribution in D^3 -space (D1) for various shape parameters α . Here, β is defined to be equal to 2α so that m = C = 3.

plotted in figure 12 for several values of α in the case of m = 3. Note that for the same α , the large- D_p and small- D_c limits, (4.15) and (4.16), remain the same regardless of the value m takes. This implies that the degrees of locality are comparable in two break-up processes that have different mean numbers of child bubbles but can be described with the same α , which is the smaller of the two shape parameters characterizing the beta distribution. Also, the break-up process remains self-similar as long as both α and β are constant over the size subrange of interest. These results imply that locality and self-similarity remain plausible in a break-up process that includes non-binary events.

D.2. Non-self-similar break-up

In the case of non-self-similar break-up, the scaling $g_b f \sim D_p^{-4}$ is no longer guaranteed to hold, as alluded to in § 5.1. However, the locality of the break-up flux appears to remain robust even in the absence of self-similarity. Consider the beta-distribution surrogate model in § 4.2 with the binary break-up assumption. Equation (4.15) suggests that as long as the differential break-up rate $g_b f$ is a decreasing function of D_p as $D_p \to \infty$, the break-up flux remains quasi-local for any permissible α . In the worst-case scenario $\alpha \to 0$, γ_p remains negative as long as the condition stated above holds true. More rigorously, the integral of I_p with respect to D_p from D to ∞ is only defined if I_p decays faster than D_p^{-1} . To ensure quasi-locality, one should then require that $g_b f$ also decays faster than D_p^{-1} . One may also argue the relative robustness of locality in the following manner: while a size-dependent α immediately results in a size-dependent W_b , (4.15) and (4.16) suggest that the break-up flux may remain size local even if α is a function of the bubble size of interest.

Recall from §§ 4.1 and 4.2 that a self-similar W_b is compatible with the statistical quasi-stationarity and quasi-homogeneity of the underlying system. Conversely, the absence of self-similarity suggests that the underlying system dynamics may not be statistically quasi-stationary. Consider (3.11) in relation to the discussion in the preceding paragraph, which remarks that the break-up flux may remain size local even if it departs

from self-similarity. This corresponds to the observation that the two terms of (3.11) may still balance each other while being non-zero each. This, in turn, suggests that while an appropriate velocity v_D may still be used to model a non-self-similar break-up process if there is sufficient locality, both v_D and the bubble-size distribution f may become functions of time in the absence of self-similarity. In this case, a time-invariant power-law variation of f cannot be assumed.

Appendix E. The large-scale entrainment rate Q

The gaseous volume entrainment rate per unit domain volume, Q, is typically assumed to be constant and imposed by integral-scale quantities like u_L and L. It was observed in § 5.1 that just as the large-scale energy production rate ε is also assumed to be the turbulent kinetic energy cascade rate ε in the turbulent energy cascade, the large-scale entrainment rate Q and the bubble-mass cascade rate W_b appear to be synonymous in the turbulent bubble break-up cascade. Two follow-up remarks are in order here. First, O and ε are imposed by the large scales and may both depend on u_L and L. Thus, Q itself may appear to have an implicit dependence on ε , as remarked by Deike *et al.* (2016) and Yu et al. (2020), who suggest that Q is an increasing function of ε . More specifically, the quantity ε in hypotheses A.5 and A.6 and figure 2 may be equivalently replaced by Q to no detriment. Second, recall from § 2.2 that inertial effects dominate at large scales and capillary effects dominate at small scales. In a cascade mechanism with sufficient scale separation, large-scale quantities like Q and ε are unlikely to have implicit dependences on small-scale parameters like σ/ρ_l . Thus, in theories of bubble break-up that imply such a dependence in the sense that f itself is proposed to be a function of σ/ρ_l , the underlying mechanism may not be self-similar due to the lack of scale separation. This is also a direct consequence of hypothesis A.6: if an intermediate subrange of bubble sizes exists where the bubble dynamics is self-similar, then the corresponding bubble statistics are not a function of σ/ρ_l . It follows from appendix D.2 that a quasi-stationary power-law dependence should not be assumed in a system where the bubble statistics at intermediate sizes depend on σ/ρ_l .

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