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¹ Structure of iso-scalar sets

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An analytical framework is proposed to explore the structure and kinematics 7 of iso-scalar fields. It is based on a two-point statistical analysis of the phase 8 indicator field which is used to track a given iso-scalar volume. The displacement 9 speed of the iso-surface, i.e. the interface velocity relative to the fluid velocity, 10 is explicitly accounted for, thereby generalizing previous two-point equations 11 dedicated to the phase indicator in two-phase flows. Although this framework 12applies to many transported quantities, we here focus on passive scalar mixing. 13Particular attention is paid on the effect of Reynolds (the Taylor based Reynolds 14number is varied from 88 to 530) and Schmidt numbers (in the range 0.1 to 151), together with the influence of flow and scalar forcing. It is first found that 16diffusion in the iso-surface tangential direction is predominant, emphasizing the 17primordial influence of curvature on the displacement speed. Second, the appro-18 19priate normalizing scales for the two-point statistics at either large, intermediate and small scales are revealed and appear to be related to the radius of gyration, 20the surface density and the standard deviation of mean curvature, respectively. 21Third, the onset of an intermediate 'scaling range' for the two-point statistics 22of the phase indicator at sufficiently large Reynolds numbers is observed. The 23scaling exponent complies with a fractal dimension of 8/3. A scaling range is 24also observed for the transfer of iso-scalar fields in scale-space whose exponent 25can be estimated by simple scaling arguments and a recent closure of the Corrsin 26equation. Fourth, the effects of Reynolds and Schmidt numbers together with flow 27or scalar forcing on the different terms of the two-point budget are highlighted. 28

29 Key words:

30 1. Introduction

There exist a large variety of physical situations in which a description in terms of curved surfaces or interfaces instinctively emerges. Leaving aside some fields of

³² bi curved surfaces of interfaces institutively emerges. Leaving aside some neids of ³³ physics such as soft-matter physics (De Gennes *et al.* 2013), heterogeneous ma-

- terials (Torquato 2002) or biological/chemical-physics (Garcia-Ruiz *et al.* 2012),
- or vertees (recipiento 2002) or biological chemical physics (Garcia-ituiz et al. 20
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this concept applies naturally to fluid flows. A two-phase flow is the first case 35that comes to mind since the surface formed by the liquid-gas interface can 36 even be observed with the naked eye (Dumouchel 2008). A description in terms 37 of curved surfaces is also widely encountered in reacting flows (diffusion and 38 premixed flames), where the chemical reactions occur in thin layers. This has 39 inspired the flamelet model (Peters 1988) which considers reacting zones as a 40 collection of thin layers, whose inner structure is identical to a laminar flame, 41 propagating normal to themselves in the direction of the unburned turbulent 42mixture. In single-phase non-reacting flows, there are situations where a thin 43interface separates some zones of irrotational motion to some zones of strong 44 vortical intensity (da Silva et al. 2014). This layer, which can be observed in 45many archetypal flow configurations such as wakes, jets or boundary layers, is 46 referred to as the turbulent/non-turbulent interface, abbreviated TNTI. Mixing 4748 can also be treated using some geometric measures of iso-scalar surfaces (Catrakis & Dimotakis 1996; Dimotakis & Catrakis 1999). There are also a variety of 49natural situations, related to e.g. clouds and precipitations, dunes, coasts erosion, 50ocean mixing, ice melting, aquifers which can properly be described through a 51morphological analysis of moving interfaces. 52

For all such situations, the macroscale features of the interface are of great 53interest. In two-phase flows, the surface area or surface density (surface area per 54unit volume) of the liquid-gas interface is generally the parameter one seeks to 55optimize by resorting to the creation of a spray (Ashgriz 2011). This parameter 56also controls the evaporation rate in flows with phase change (Lebas et al. 2009; 57Jay et al. 2006). It is also a key parameter in climate change studies for which 58the processes taking place at the air-sea interface are primordial (Liss & Johnson 592014). In premixed flames, the flame surface area is an important parameter 60 as it appears in the expression of the volume integrated burning rate and heat 61release (e.g. Trouvé & Poinsot 1994). For the TNTI, the surface area allows the 62 rate of entrainment of irrotational zones into the turbulent flow to be estimated 63 (Sreenivasan et al. 1989; Krug et al. 2015). 64

The versatility of the notion of curved surface finds its foundation on some 65 mathematical grounds. Given any field variable ξ (e.g. temperature, concen-66 tration, enstrophy, etc) that varies in space, one can take any iso-value ξ_0 to 67 define an interface which separates the regions where $\xi(\boldsymbol{x}) > \xi_0$ from the regions 68 where $\xi(\mathbf{x}) < \xi_0$. The kinematic equations for both the interface position and 69 its geometrical features (surface density, curvatures) are known (Pope 1988; 70Drew 1990; Vassilicos & Hunt 1996) thereby embedding in a single mathematical 7172framework single- or two-phase, reacting or non-reacting flows, in presence or absence of phase change. 73

The wrinkling of the interface is related to intrinsic instabilities and to in-74homogeneities (specifically the turbulence) of the carrier environment which 75itself reveals some multi-scale fluctuations. This means, not only the macroscale 76 features (i.e. measured at scales larger than a typical integral correlation length-77 scale) are important, but also the microstructural characteristics (measured at 78a scale r) are worth being explored. In this respect, it is now well known that 79 interfaces that one may find in turbulence and turbulent mixing (Sreenivasan & 80 Meneveau 1986; Sreenivasan et al. 1989; Catrakis & Dimotakis 1996; de Silva et al. 81 2013), turbulent premixed flames (Gouldin 1987; Gouldin et al. 1989), two-phase 82 flows (Le Moyne et al. 2008; Dumouchel & Grout 2009; Grout et al. 2007), and 83 material lines evolving in turbulent flows (Villermaux & Gagne 1994) reveal some 84

"fractal facets". The fractal dimension of interfaces was predicted analytically 85 (Mandelbrot 1975; Constantin et al. 1991; Grossmann & Lohse 1994; Iver et al. 86 2020). For instance, Mandelbrot (1975) proved that the fractal dimension of iso-87 scalars is 2.5 for Burgers turbulence and 8/3 for Kolmogorov turbulence. Using 88 tools from geometric measure theory, Constantin et al. (1991) showed that the 89 fractal dimension of iso-scalars might evolve between 7/3 near the TNTI to 8/390 in fully turbulent regions. Later, Constantin (1994b, a) showed that a value of 91 8/3 holds for iso-scalars in the limit of small molecular diffusivities (high Schmidt 92numbers) while flame fronts exhibit a fractal dimension of 7/3. The dimensional 93 analysis of Hawkes et al. (2012); Thiesset et al. (2016a) showed that premixed 94flame fronts have a fractal dimension of 7/3 (8/3) in low (high) Karlovitz number 9596 combustion regimes. The Prandtl (or Schmidt) number dependence of the fractal dimension of iso-scalars is predicted by Grossmann & Lohse (1994). The fractal 97 dimension of clouds were also investigated (Lovejoy 1982; Hentschel & Procaccia 98 1984). Using numerical data of scalar mixing with an imposed mean gradient 99 at relatively high Reynolds numbers, Iver et al. (2020) recently showed that the 100fractal dimension is 2(8/3) for scalar iso-values far away from (close to) the mean. 101 Note that we omitted here the possibility that the fractal dimension might be 102scale-dependent as argued in the review by Dimotakis & Catrakis (1999). Note 103also that what is here simply referred to as a fractal dimension may recover 104different mathematical definitions (Hausdorff dimension, Kolmogorov capacity 105(Vassilicos & Hunt 1991; Vassilicos 1992)). 106

Characterizing and predicting the microscopic scale-dependent features (= the 107 microstructure) of interfaces requires the coupling between the interface and the 108 surrounding medium to be well understood. In this goal, one needs to identify 109the range of scales over which some characteristic physical parameters (e.g. 110 surface tension, fluid viscosity, scalar diffusivity, etc) or some physical processes 111 (turbulent straining, production by mean scalar gradient or interface reactivity, 112etc), have an influence. It is also worth drawing the connections between the 113 typical length-scales of the dynamical or scalar field (integral, Taylor, Corrsin, 114Kolmogorov, Batchelor, Obukhov length-scales) to those of the interface (inner 115and outer cutoff scales, radius of curvature, surface density length-scale). All 116117 these questions necessitate a scale-by-scale description of the processes at play in the kinematic evolution of contorted iso-surfaces or iso-volumes. To the best 118 of our knowledge, there does not exist such a theoretical framework that may 119be valid at all scales, irrespectively of the flow configuration and flow regime. 120The present study is an attempt to fill this gap. We propose an analytical 121122description that relies on a two-point statistical analysis (correlation and/or 123structure functions) of the phase indicator function. The latter field variable is used as a 'marker' or 'localizer' of the fluid iso-volume formed by a given 124iso-scalar value. Such two-point statistics are employed in different branches 125of physics, generally to gain information about the morphological content (the 126microstructure) of heterogeneous materials (Adler et al. 1990; Torquato 2002; 127Teubner 1990; Kirste & Porod 1962; Frisch & Stillinger 1963; Berryman 1987) 128or fractal aggregates (Sorensen 2001; Morán et al. 2019). In fluid mechanics, 129there are only few papers dealing with these aspects (Hentschel & Procaccia 130 1984; Vassilicos & Hunt 1991; Vassilicos 1992; Vassilicos & Hunt 1996; Lu & 131Tryggvason 2018, 2019; Elsas et al. 2018). 132

Here, the main originality of the present work is that this morphological descriptor is supplemented by an exact transport equation which allows the 135different physical process acting on the iso-scalar volumes to be characterized. It generalizes the equation proposed by Thiesset et al. (2020, 2021) firstly dedicated 136to two-phase flows, to cases where the interface possesses an intrinsic displacement 137speed (as for premixed flames or diffusive scalars). The machinery for obtaining 138two-point statistical equations is the same as the one used to derive the scale-by-139scale budgets of the dynamical or scalar field (see Hill 2002; Danaila et al. 2004, 140141among others). We will also resort to some analytical studies emanating from the fields of heterogeneous materials (Adler et al. 1990; Torquato 2002; Teubner 1990; 142Kirste & Porod 1962; Frisch & Stillinger 1963; Berryman 1987) and aggregates 143(Sorensen 2001; Morán et al. 2019) allowing the phase indicator structure function 144to be related to some integral geometric measures of the interface (surface den-145sity, mean and Gaussian curvatures) and some fractal characteristics. Although 146the proposed theory may apply to very different situations, we focus here on 147passive scalar mixing which is explored using Direct Numerical Simulation data 148covering a wide range of Reynolds and Schmidt numbers. By doing so, we expect 149emphasizing the key physics that ought to be accounted for e.g. a geometrical 150closure to the turbulent scalar flux in the equation for the mean scalar. 151

The present study has four objectives. Firstly, it aims at generalizing the 152equations firstly derived by Thiesset *et al.* (2020, 2021) to the case of diffusive 153scalars. The new set of equations reveals the importance of the interface displace-154ment speed which embeds different physics depending on the flow configuration. 155The second objective of our work is to characterize the influence of some non-156dimensional numbers (Reynolds and Schmidt numbers) and some geometrical 157features (e.g. the mean curvature) on the different components of the interface 158displacement speed. Thirdly, it aims at identifying the characteristic length-scales, 159asymptotic scaling and normalizing quantities of the phase indicator structure 160161 functions. Fourthly, it intends to explore the effect of Reynolds and Schmidt numbers together with other effects (decay, mean scalar/velocity gradient) on the 162different processes revealed by the scale-by-scale budgets of the phase indicator 163field. 164

The paper is organized as follows. The equations for the transport of the 165iso-scalar surface and the corresponding phase indicator structure functions are 166derived in section 2. We also derive the asymptotic limits at either large or small 167scales revealing the link between two-point statistics of the phase indicator and 168some integral geometric measures of the iso-surface (volumes, surface area, mean 169and Gaussian curvature). The numerical database and post-processing procedures 170171are portrayed in section 3. Results are presented in 4. Technicalities are gathered 172in the Appendix. Conclusions are drawn in a last section.

173 2. Analytical considerations

174

2.1. Kinematics of iso-scalar excursion sets

175 Consider the scalar field $\xi(x, t)$ whose transport equation is

$$\partial_t \xi + \nabla_x \cdot u \xi = \nabla_x \cdot D \nabla_x \xi + \Xi + \dot{\omega}_{\xi}. \tag{2.1}$$

Here, \boldsymbol{u} is the fluid velocity, D the scalar diffusivity and $\dot{\omega}_{\xi}$ is the scalar reaction rate. Ξ represents any other source term such as production by a mean gradient. The iso-scalar ξ_0 forms an interface which separates the zones where $\xi(\boldsymbol{x},t) > \xi_0$ and $\xi(\boldsymbol{x},t) < \xi_0$. It is then worth defining the phase indicator function $\phi =$ 181 $H(\xi - \xi_0)$, where H denotes the Heaviside function. We then simply have:

182
$$\phi(\boldsymbol{x},t) = \begin{cases} 1 & \text{when } \xi > \xi_0 \\ 0 & \text{elsewhere.} \end{cases}$$
(2.2)

183 $\phi(\boldsymbol{x},t)$ is sometimes referred to as the excursion set of $\xi(\boldsymbol{x},t) > \xi_0$, i.e. the 184 probability that $\xi(\boldsymbol{x},t) > \xi_0$ (Elsas *et al.* 2018). The transport equation for $\phi(\boldsymbol{x},t)$ 185 writes (Hirt & Nichols 1981; Drew 1990; Vassilicos & Hunt 1996):

186
$$\partial_t \phi + \boldsymbol{u} \cdot \boldsymbol{\nabla}_{\boldsymbol{x}} \phi = S_d | \boldsymbol{\nabla}_{\boldsymbol{x}} \phi |.$$
(2.3)

 $|\nabla_x \bullet|$ denotes the norm of the gradient of any quantity \bullet and S_d is known as 187intrinsic displacement speed of the interface. Note that Eq. (2.3) is valid only in 188 the sense of distributions (Drew 1990), i.e. outside from the interface both $\partial_t \phi$ and 189 $\nabla_x \phi$ are zero, while they are equal to the Dirac delta function at the interface. 190Similarly, S_d is defined only at the surface $\xi(\mathbf{x}) = \xi_0$. Eq. (2.3) shows that in the 191laboratory coordinate system, the observer sees the interface moving at a speed 192 $\boldsymbol{w} = \boldsymbol{u} + S_d \boldsymbol{n}$ where $\boldsymbol{n} = -\nabla_{\boldsymbol{x}} \xi / |\nabla_{\boldsymbol{x}} \xi|$ is the unit vector normal to the iso-scalar 193surface. When $S_d = 0$ (as in two-phase flows in absence of phase change), the 194velocity of the interface w is equal to the fluid velocity at the interface u. 195

The displacement speed S_d is defined by (Gibson 1968; Pope 1988; Gran *et al.* 197 1996; Peters *et al.* 1998):

$$S_d = \underbrace{\frac{\nabla_x \cdot D\nabla_x \xi}{|\nabla_x \xi|}}_{S_d^d} + \underbrace{\frac{\Xi}{|\nabla_x \xi|}}_{S_d^s} + \underbrace{\frac{\dot{\omega}_{\xi}}{|\nabla_x \xi|}}_{S_d^r}.$$
(2.4)

Recall that S_d is defined only at $\xi(\boldsymbol{x}) = \xi_0$. Eq. (2.4) shows that the displacement speed can be decomposed into a scalar diffusion component S_d^d , a scalar reaction rate contribution S_d^r , and a scalar source term part S_d^s . Gran *et al.* (1996); Peters *et al.* (1998) further showed that the diffusion component of the displacement speed S_d^d can be further decomposed by projecting the diffusion term along the iso-scalar surface normal and tangential directions:

205
$$S_d^d = \underbrace{\frac{\boldsymbol{n} \cdot \boldsymbol{\nabla}_{\boldsymbol{x}} (\boldsymbol{n} \cdot \boldsymbol{D} \boldsymbol{\nabla}_{\boldsymbol{\xi}})}_{|\boldsymbol{\nabla}_{\boldsymbol{x}} \boldsymbol{\xi}|}}_{S_d^n} + \underbrace{2D\mathcal{H}}_{S_d^c}, \qquad (2.5)$$

where S_d^n and S_d^c are the normal and tangential diffusion contributions to the 206displacement speed. $\mathcal{H} = \nabla_x \cdot n/2$ is the mean curvature of the iso-surface. 207It is negative when the surface is concave in the direction of $\xi(x) > \xi_0$ and 208 convex in the opposite case. The rightmost term in Eq. (2.5) reveals that S_d^c 209depends linearly on the mean curvature of the scalar iso-surface. In presence 210of heat release, it may be more convenient to define S_d in a density weighted 211formulation (Giannakopoulos et al. 2019; Gran et al. 1996; Peters et al. 1998). 212Yu et al. (2021) derived the transport equations for the different components of 213214the displacement speed.

2.2. General two-point equations

The machinery for obtaining the two-point equations of the phase indicator field when $S_d = 0$ is described in details by Thiesset *et al.* (2020, 2021). Here, we aim at generalizing such equations for cases where the displacement speed is



Figure 1: Schematic representation of two points \boldsymbol{x}^+ and \boldsymbol{x}^- , the midpoint $\boldsymbol{X} = (X, Y, Z)$ and the separation vector $\boldsymbol{r} = (r_x, r_y, r_z)$.

119 not zero. In this goal, we start by writing the transport equations for $\phi(\boldsymbol{x},t)$ 220 at a point \boldsymbol{x}^+ and \boldsymbol{x}^- , arbitrarily separated in space (Fig. 1). Hereafter, the + 221 and - superscripts denote the quantity at the point \boldsymbol{x}^+ and \boldsymbol{x}^- , respectively. 222 Multiplying the equation at \boldsymbol{x}^+ by ϕ^- and the one at \boldsymbol{x}^- by ϕ^+ , yields:

223
$$\phi^{-}\partial_{t}\phi^{+} + \boldsymbol{u}^{+} \boldsymbol{\cdot} \phi^{-} \boldsymbol{\nabla}_{\boldsymbol{x}^{+}} \phi^{+} = \phi^{-} S_{d}^{+} |\boldsymbol{\nabla}_{\boldsymbol{x}}\phi|^{+}, \qquad (2.6a)$$

224
$$\phi^+ \partial_t \phi^- + \boldsymbol{u}^- \boldsymbol{\cdot} \phi^+ \boldsymbol{\nabla}_{\boldsymbol{x}^-} \phi^- = \phi^+ S_d^- |\boldsymbol{\nabla}_{\boldsymbol{x}} \phi|^-.$$
(2.6b)

225 Since for any quantity $[\bullet]$, we have $\nabla_{x^+}[\bullet]^- = \nabla_{x^-}[\bullet]^+ = 0$, one obtains:

226
$$\phi^{-}\partial_{t}\phi^{+} + \boldsymbol{u}^{+} \cdot \boldsymbol{\nabla}_{\boldsymbol{x}^{+}}\phi^{+}\phi^{-} = \phi^{-}S_{d}^{+}|\boldsymbol{\nabla}_{\boldsymbol{x}}\phi|^{+}, \qquad (2.7a)$$

227
$$\phi^+ \partial_t \phi^- + \boldsymbol{u}^- \cdot \boldsymbol{\nabla}_{\boldsymbol{x}^-} \phi^+ \phi^- = \phi^+ S_d^- |\boldsymbol{\nabla}_{\boldsymbol{x}} \phi|^-.$$
(2.7b)

228 Summing up these two equations gives,

229
$$\partial_t \phi^+ \phi^- + \boldsymbol{u}^+ \cdot \boldsymbol{\nabla}_{\boldsymbol{x}^+} \phi^+ \phi^- + \boldsymbol{u}^- \cdot \boldsymbol{\nabla}_{\boldsymbol{x}^-} \phi^+ \phi^-$$
230
$$= \phi^- S_d^+ |\boldsymbol{\nabla}_{\boldsymbol{x}} \phi|^+ + \phi^+ S_d^- |\boldsymbol{\nabla}_{\boldsymbol{x}} \phi|^-.$$
(2.8)

We now define the mid-point $\mathbf{X} = (\mathbf{x}^+ + \mathbf{x}^-)/2$ and separation vector $\mathbf{r} = \mathbf{x}^+ - \mathbf{x}^-$ (see Fig. 1). Using the relations $\nabla_{\mathbf{x}^+} = \frac{1}{2} \nabla_{\mathbf{X}} + \nabla_{\mathbf{r}}$ and $\nabla_{\mathbf{x}^-} = \frac{1}{2} \nabla_{\mathbf{X}} - \nabla_{\mathbf{r}}$ (Hill 2002; Danaila *et al.* 2004), we obtain:

234
$$\partial_t \phi^+ \phi^- = - \nabla_X \cdot (\sigma u) \phi^+ \phi^- - \nabla_r \cdot (\delta u) \phi^+ \phi^- + \phi^- S_d^+ |\nabla_x \phi|^+ + \phi^+ S_d^- |\nabla_x \phi|^- + 2\phi^+ \phi^- (\sigma \{\nabla_x \cdot u\})$$
(2.9)

Eq. (2.9) is the transport equation for the correlation function of the phase indicator field where S_d can take any values. $(\sigma \bullet) = (\bullet^+ + \bullet^-)/2$ and $(\delta \bullet) =$ $(\bullet^+ - \bullet^-)$. Note that Eq. (2.9) also considers flows in which the velocity divergence may not be zero. This is accounted for in the rightmost term on right-hand side of Eq. (2.9) which reads as the product of $\phi^+\phi^-$ and the average of $\nabla_x \cdot u$ between the two-points x^+ and x^- . Structure of iso-scalar sets

241 The squared increment of ϕ , i.e. $(\delta \phi)^2 = (\phi^+ - \phi^-)^2$ is related to $\phi^+ \phi^-$ by

242
$$\phi^+ \phi^- = \left(\frac{\phi^+ + \phi^-}{2}\right)^2 - \left(\frac{\phi^+ - \phi^-}{2}\right)^2$$

$$= (\sigma\phi)^2 - \frac{(\sigma\phi)}{4}$$

244
$$= \frac{1}{2} \left(\left(\phi^+ \right)^2 + \left(\phi^- \right)^2 \right) - \frac{\left(\delta \phi \right)^2}{2}$$

245
$$= (\sigma\phi) - \frac{1}{2}(\delta\phi)^2.$$
 (2.10)

For obtaining Eq. (2.10), use was made of the relation $\phi^2 = \phi$ as ϕ can take only 0 or 1 values. Substituting Eq. (2.10) into Eq. (2.9), and noting that the transport equation for $(\sigma\phi)$ is

249
$$\partial_t(\sigma\phi) = -\nabla_{\mathbf{X}} \cdot (\sigma \mathbf{u})(\sigma\phi) - \nabla_{\mathbf{r}} \cdot (\delta \mathbf{u})(\sigma\phi) + \sigma \{S_d | \nabla \phi | \} + 2(\sigma\phi)(\sigma \{ \nabla_{\mathbf{x}} \cdot \mathbf{u} \}), \qquad (2.11)$$

250 we end up with the transport equation for $(\delta \phi)^2$

251

$$\partial_t (\delta \phi)^2 = - \nabla_{\boldsymbol{X}} \cdot (\sigma \boldsymbol{u}) (\delta \phi)^2 - \nabla_{\boldsymbol{r}} \cdot (\delta \boldsymbol{u}) (\delta \phi)^2 + 2(\sigma \{ S_d | \nabla \phi | \}) - 2(\phi^- S_d^+ | \nabla_{\boldsymbol{x}} \phi |^+ + \phi^+ S_d^- | \nabla_{\boldsymbol{x}} \phi |^-) + 2(\delta \phi)^2 (\sigma \{ \nabla_{\boldsymbol{x}} \cdot \boldsymbol{u} \}).$$
(2.12)

Eq. (2.12) is the general expression for the unaveraged squared increments 252 $(\delta\phi)^2$. It generalizes the equation derived by Thiesset *et al.* (2020, 2021) to the 253case where $S_d \neq 0$ and/or $\nabla_x \cdot u \neq 0$. Compared to the equations detailed by 254This set *et al.* (2020, 2021), where only the unsteady and the two transfer terms 255(in r and X space) were present, Eq. (2.12) reveals an additional source term 256which notably depends on the correlation between a quantity related to the bulk 257phase ϕ and a surface quantity, namely $S_d | \nabla_x \phi |$. When estimated numerically, 258this type of correlation requires a specific treatment which will be described later. 259The right-hand side of Eq. (2.12) also contains an additional non-linear forcing 260term which depends on the velocity divergence. In incompressible flows, this term 261vanishes. 262

Eq. (2.12) can be applied to very different types of scalar, either passive, active or reacting, in either decaying or forced turbulence, representative of either single or two-phase flows:

• In two-phase flows with no phase change, $S_d = 0$ and one recovers the equation first derived by Thiesset *et al.* (2020, 2021). Material surfaces share also the property $S_d = 0$ (Pope *et al.* 1989).

• In case of a passive scalar with no forcing, only S_d^d contributes to S_d . When e.g. a scalar mean gradient G_{ξ} in a given direction α is superimposed, then another contribution emerges from $S_d^s = u_{\alpha}G_{\xi}/|\nabla_{\boldsymbol{x}}\xi|$.

• The present framework also applies to premixed flames. Then, ξ can be associated to the fuel or oxidizer mass fraction or to the temperature field. In this situation, S_d incorporates both S_d^d and S_d^r . Diffusion flames can also be analyzed using the present framework. In either premixed or diffusion flames, one generally define S_d in the density weighted manner (Giannakopoulos *et al.* 2019). Note also that due to heat release, one should also account for the additional term due to $\nabla_x \cdot u$.

• In two-phase flows with phase change, ξ can for instance represent the liquid volume fraction and S_d^r relates to the evaporation rate. Here again, one should account for the term due to non-zero velocity divergence. The velocity jump across the interface that originates from the evaporation rate and the density jump between the two-phase should also be accounted for.

• Eq. (2.12) also applies to the enstrophy field. In this situation, S_d contains a contribution due to diffusion effects and an additional forcing term due to vortex stretching (Krug *et al.* 2015). The present framework is thus likely to help scrutinizing the structure and kinematics of the turbulent/non-turbulent interface which is often defined through a given iso-enstrophy value.

To summarize, the new framework proposed here is very general and enables to treat a variety of different scalars (passive or reacting scalars, with or without forcing) in different flow situations (single or two-phase flows, in forced or decaying turbulence, in presence of phase change).

Because the flows under consideration can be turbulent, it is worth supplementing Eqs. (2.9) and (2.12) by some averaging operators. The choice of a specific average generally depends on the flow situations (Hill 2002; Thiesset *et al.* 2020, 2021). One can simply apply an ensemble average operator, noted $\langle \bullet \rangle_{\mathbb{E}}$, which has the advantage of commuting with time *t*, spatial *X* and scale *r* derivatives. Hence, the ensemble average of Eq. (2.12) is:

$$\partial_t \langle (\delta\phi)^2 \rangle_{\mathbb{E}} = - \nabla_{\boldsymbol{X}} \cdot \langle (\sigma \boldsymbol{u}) (\delta\phi)^2 \rangle_{\mathbb{E}} - \nabla_{\boldsymbol{r}} \cdot \langle (\delta \boldsymbol{u}) (\delta\phi)^2 \rangle_{\mathbb{E}} + 2 \langle \sigma \{ S_d | \boldsymbol{\nabla} \phi | \} \rangle_{\mathbb{E}} - 2 \langle \langle \phi^- S_d^+ | \boldsymbol{\nabla}_{\boldsymbol{x}} \phi |^+ \rangle_{\mathbb{E}} + \langle \phi^+ S_d^- | \boldsymbol{\nabla}_{\boldsymbol{x}} \phi |^- \rangle_{\mathbb{E}}) \quad (2.13) + 2 \langle (\delta\phi)^2 (\sigma \{ \boldsymbol{\nabla}_{\boldsymbol{x}} \cdot \boldsymbol{u} \}) \rangle_{\mathbb{E}}.$$

299

In the present study, we further exploit the statistical symmetry of the flow (see section 3.2) and we will consider a spatial average over a periodic domain of volume V_{box} :

$$\langle \bullet \rangle_{\mathbb{R}} = \frac{1}{V_{\text{box}}} \iiint_{X} \bullet \, \mathrm{d}X.$$
 (2.14)

Spatial averages commute with time t and r derivatives, but not with the X divergence operator. However, by periodicity, the fluxes $(\sigma \boldsymbol{u})(\delta \phi)^2$ normal to the domain boundaries vanish (Hill 2002; Thiesset *et al.* 2020). Hence, the transfer term with respect to spatial position X is zero. Assuming a divergence free flow yields $\langle (\delta \phi)^2 (\sigma \{ \nabla_x \cdot \boldsymbol{u} \}) \rangle_{\mathbb{E},\mathbb{R}} = 0$. Statistical homogeneity leads to $2\langle \sigma \{ S_d | \nabla \phi | \} \rangle_{\mathbb{E},\mathbb{R}} = \langle S_d | \nabla \phi | \rangle_{\mathbb{E},\mathbb{R}}$ and $\langle \phi^- S_d^+ | \nabla_x \phi |^+ \rangle_{\mathbb{E}} = \langle \phi^+ S_d^- | \nabla_x \phi |^- \rangle_{\mathbb{E}}$. With these simplifications, Eq. (2.12) then writes as:

311
$$\underbrace{\partial_t \langle (\delta\phi)^2 \rangle_{\mathbb{R}}}_{\text{Unsteady}} = \underbrace{-\nabla_r \cdot \langle (\delta u) (\delta\phi)^2 \rangle_{\mathbb{R}}}_{\text{Transfer-r}} + \underbrace{2 \langle S_d \rangle_s \Sigma - 4 \langle \phi^+ S_d^- | \nabla_x \phi |^- | \rangle_{\mathbb{R}}}_{S_d - \text{Term}}. \quad (2.15)$$

where $\Sigma = \langle | \nabla_{x} \phi | \rangle_{\mathbb{R}}$ is the surface density of the iso-scalar surface, i.e. the area of the iso-scalar surface divided by V_{box} . $\langle \bullet \rangle_{s}$ denotes the area weighted average. At this stage, Eq. (2.15) depends on time t and the separation vector \mathbf{r} (a 4D space). The problem can further be reduced supposing isotropy, i.e. statistical invariance by rotation of the separation vector \mathbf{r} , i.e. $\langle \bullet \rangle_{\mathbb{R}}(\mathbf{r}) = \langle \bullet \rangle_{\mathbb{R}}(|\mathbf{r}|)$. In case of anisotropic flows, one can apply an angular average, noted $\langle \bullet \rangle_{\Omega}$, over all Structure of iso-scalar sets

orientations of the vector \boldsymbol{r} (Thiesset *et al.* 2021):

$$\langle \bullet \rangle_{\Omega} = \frac{1}{4\pi} \iint_{\Omega} \bullet \sin\theta \mathrm{d}\theta \mathrm{d}\varphi,$$
 (2.16)

where the set of solid angles $\Omega = \{\varphi, \theta \mid 0 \leq \varphi \leq \pi, 0 \leq \theta \leq 2\pi\}$ with $\varphi = \arctan(r_y/r_x)$ and $\theta = \arccos(r_z/|\mathbf{r}|)$ (r_x, r_y, r_z) denotes the components of the \mathbf{r} vector in x, y, z directions, respectively). Spatially and angularly averaged statistics depend on time t and scale r, i.e. the four dimensional problem was reduced to two dimensions.

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341

319

2.3. Asymptotic limits at large and small scales

At this stage, it is worth recalling that employing two-point statistics of the phase indicator field is not new. It is widely employed for characterizing the microstructure of heterogeneous material such as porous media, composite material, fractal aggregates, and colloids. The reader can refer to the book by Torquato (2002) who discusses in great details these aspects.

Among this wide corpus of literature, it is worth mentioning the work by Kirste & Porod (1962); Frisch & Stillinger (1963) who proved that for isotropichomogeneous media, and by further assuming that the interface separating the two phases is of class C^2 , the limit of $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$ at small scales is given by:

335
$$\lim_{r \to 0} \langle (\delta \phi)^2 \rangle_{\mathbb{R}} = \frac{\Sigma r}{2} \left[1 - \frac{r^2}{8} \left(\langle \mathcal{H}^2 \rangle_s - \frac{\langle \mathcal{G} \rangle_s}{3} \right) \right].$$
(2.17)

Here, \mathcal{H} and \mathcal{G} are the mean and Gaussian curvatures, respectively. $\langle \bullet \rangle_s$ is used to denote the surface area weighted average. Berryman (1987); Thiesset *et al.* (2021) proved that Eq. (2.17) remains valid in anisotropic media by applying an additional angular average to $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$. When $|\mathbf{r}| \to \infty$, Thiesset *et al.* (2020, 2021) showed that:

$$\lim_{r \to \infty} \langle (\delta \phi)^2 \rangle_{\mathbb{R}} = 2 \langle \phi \rangle_{\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{R}}).$$
(2.18)

The limit of $\langle \phi^+ | \nabla_x \phi |^- \rangle_{\mathbb{R}}$ as $|\mathbf{r}|$ tends to zero can be expressed as follows (Teubner 1990):

344
$$\lim_{r \to 0} \langle \phi^+ | \boldsymbol{\nabla}_{\boldsymbol{x}} \phi |^- \rangle_{\mathbb{R}} = \frac{\Sigma}{2} \left[1 + \frac{r}{2} \langle \mathcal{H} \rangle_s \right].$$
(2.19)

As far as we are aware, the next terms of the small scale expansion of $\langle \phi^+ | \nabla_x \phi |^- \rangle_{\mathbb{R}}$ are not known. In the limit of large separations, we have (Teubner 1990)

347
$$\lim_{r \to \infty} \langle \phi^+ | \boldsymbol{\nabla}_{\boldsymbol{x}} \phi |^- \rangle_{\mathbb{R}} = \langle \phi \rangle_{\mathbb{R}} \boldsymbol{\Sigma}.$$
(2.20)

348 The special case $\langle \phi \rangle_{\mathbb{R}} = 0.5$ yields $\langle \phi^+ | \nabla_x \phi |^- \rangle_{\mathbb{R}}(r) = \Sigma/2$. Eq. (2.19) suggests 349 that, when $|\mathbf{r}| \to 0$, $\langle \phi^+ S_d^- | \nabla_x \phi |^- \rangle_{\mathbb{R}}$ writes:

350
$$\lim_{r \to 0} \langle \phi^+ S_d^- | \boldsymbol{\nabla}_{\boldsymbol{x}} \phi |^- \rangle_{\mathbb{R}} = \frac{\Sigma}{2} \left[\langle S_d \rangle_s + \frac{r}{2} \langle \mathcal{H} S_d \rangle_s \right], \tag{2.21}$$

351 while at large scales one may write:

352
$$\lim_{r \to \infty} \langle \phi^+ S_d^- | \boldsymbol{\nabla}_{\boldsymbol{x}} \phi |^- \rangle_{\mathbb{R}} = \langle \phi \rangle_{\mathbb{R}} \langle S_d \rangle_s \Sigma.$$
(2.22)

As discussed by Thiesset *et al.* (2021), Eq. (2.17) and similarly Eqs. (2.19) and 353(2.21) apply up to a separation r, which is twice the 'reach' of surface. The 354'reach' is a notion that pertains to non-convex bodies. It is defined as the minimal 355normal distance between the surface and its medial axis (see e.g. Federer 1959). 356 The medial axis of a given body is the set of all points having more than one 357closest point on the object's boundary. It can also be seen as the location of 358 centers of all bi-tangent spheres, i.e. the spheres that are tangent to the surface 359 in at least two points on the surface. The reach is thus given by the minimal 360 radius of these bi-tangent spheres. In some special situations (in absence of 361narrow throats or necks), it can be related to the minimal radius of curvature. 362 Otherwise, it relates to the smallest narrow throat or neck. For scales larger than 363 the reach, $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$ contains information about the morphology of the structures 364 under hand. In this respect, Adler et al. (1990); Torquato (2002); Thiesset et al. 365 (2021) showed that the scale distribution $\langle \phi^+ \phi^- \rangle_{\mathbb{R}}$ or $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$ widens when the 366 morphological content (or its tortuousness) of a given set increases. Similarly, the 367 fractal facets of aggregates are often appraised by use of correlation function of 368 the phase indicator at intermediate scales (see e.g. Sorensen 2001). In particular, 369 Morán *et al.* (2019) showed that when increasing the ratio between the largest 370 scales (the aggregate radius of gyration) and the smallest scales (the radius of 371the primary particle), the correlation function reveals an increasing range of 372 scales complying with a fractal scaling (a power law). Vassilicos & Hunt (1991); 373 Vassilicos (1992); Vassilicos & Hunt (1996) showed that $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$ might reveal 374a power law behavior whose exponent is related to the fractal dimension (more 375precisely the Kolmogorov capacity) of iso-scalar surfaces. This was investigated 376 in great details by Elsas et al. (2018) for the enstrophy, dissipation and velocity 377 gradient invariants. When several structures are present, $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{R}}$ also depends 378 on the way the different fluid structures are organized in space. The reach of 379the surface plays an important role here since it is the scale which separates the 380 zones in scale space where $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$ depends only on integral geometric measures 381 $(\Sigma, \langle \mathcal{H}^2 \rangle_s, \langle \mathcal{G} \rangle_s)$ and the range of scales for which two-point statistics become 382a morphological descriptor (Torquato 2002) for which both the geometry and 383 the additional information about the medial axis is required for the structure to 384be characterized. For scales larger than the reach, the separation r cannot be 385interpreted as the size of the structure under consideration (as it will be seen 386 later the correlation $\langle \phi^+ \phi^- \rangle_{\mathbb{R}}$ tends to 0 when the scale r is similar to the size of 387 the structure), but should rather be referred to as the morphological parameter 388 as it is generally done in morphological analysis using e.g. integral geometrical 389 390 measures (the Minkowski functional) of parallel sets (Arns *et al.* 2004; Dumouchel et al. 2022). 391

Given the asymptotic limits detailed in previous section, it seems natural to examine the limit at small and large-scales of Eq. (2.12) (or Eq. (2.9)). In Thiesset *et al.* (2021), it was demonstrated that Eq. (2.12) naturally converge to the transport equation for the surface density when $|\mathbf{r}| \rightarrow 0$. The latter can be written in the form (Pope 1988; Candel & Poinsot 1990; Drew 1990; Blakeley *et al.* 2019):

397
$$\partial_t \Sigma + \boldsymbol{\nabla}_{\boldsymbol{x}} \cdot \langle \boldsymbol{u} \rangle_s \Sigma = (\mathbb{K}_T + \mathbb{K}_C) \Sigma, \qquad (2.23)$$

where the stretch rate $\mathbb{K} = \mathbb{K}_T + \mathbb{K}_C$ measures the relative time increase of surface density. \mathbb{K}_T denotes the tangential strain rate that may include compressibility effect, and $\mathbb{K}_C = -2\langle S_d \mathcal{H} \rangle_s$ is the curvature component of the stretch rate.

401 This set et al. (2021) considered the case where $S_d = 0$ (a material surface

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Structure of iso-scalar sets 11

402 as in two-phase flows) and showed that, in the limit of small separations, the 403 X-transport term in Eq. (2.12) asymptotes the convection process of the surface 404 density Σ (the rightmost term on LHS Eq. (2.23)) while the unsteady term in Eq. 405 (2.12) obviously tends to the unsteady term in Eq. (2.23). Thiesset *et al.* (2021) 406 argued that by difference, the r-transfer term is proportional to the strain rate 407 \mathbb{K}_T , viz.

$$\lim_{r \to 0} \left[-\boldsymbol{\nabla}_{\boldsymbol{r}} \boldsymbol{\cdot} \langle (\delta \boldsymbol{u}) (\delta \phi)^2 \rangle_{\mathbb{R}} \right] = \mathbb{K}_T \boldsymbol{\Sigma} \frac{r}{2}.$$
(2.24)

409 Note that here again, this holds true in anisotropic configuration by using an
410 additional angular average. When the interface displacement speed is not zero,
411 the RHS in Eq. (2.12) has the following asymptotic limit:

408

412
$$\lim_{r \to 0} \left[2 \left(\sigma \langle S_d | \boldsymbol{\nabla} \phi | \rangle_{\mathbb{R}} \right) - 2 \left(\langle \phi^- S_d^+ | \boldsymbol{\nabla}_{\boldsymbol{x}} \phi |^+ \rangle_{\mathbb{R}} + \langle \phi^+ S_d^- | \boldsymbol{\nabla}_{\boldsymbol{x}} \phi |^- \rangle_{\mathbb{R}} \right) \right]$$
413
$$= 2 \langle S_d \rangle_s \Sigma - 2\Sigma \left(\langle S_d \rangle_s + \langle S_d \mathcal{H} \rangle_s \frac{r}{2} \right)$$
414
$$= -2 \langle S_d \mathcal{H} \rangle_s \Sigma \frac{r}{2}$$

415
$$= \mathbb{K}_C \Sigma \frac{r}{2}.$$
 (2.25)

416 Consequently, the additional term in the two-point budget due to the presence 417 of an interface displacement speed asymptotes, in the limit of small separations, 418 to the curvature component of the stretch rate.

Similarly, given that at large scales, the r-transfer term tends to zero, Eq. (2.12) should provide insights into the excursion set volume equation. We indeed obtain that at large scales, the budget simplifies to

422
$$\lim_{r \to \infty} \partial_t \langle (\delta \phi)^2 \rangle_{\mathbb{R}} = 2(1 - 2\langle \phi \rangle_{\mathbb{R}}) \partial_t \langle \phi \rangle_{\mathbb{R}}$$

423
$$= 2(1 - 2\langle \phi \rangle_{\mathbb{R}}) \langle S_d \rangle_s \Sigma, \qquad (2.26)$$

424 where use was made of the equation for the volume (Drew 1990):

425
$$\partial_t \langle \phi \rangle_{\mathbb{R}} = \langle S_d \rangle_s \Sigma. \tag{2.27}$$

Note that the volume of the excursion set $\langle \phi \rangle_{\mathbb{R}}$ reads as the probability that $\xi(\boldsymbol{x}) > \xi_0$. It is thus related to the cumulative distribution of $\xi(\boldsymbol{x})$. Assuming a Gaussian distribution for the scalar field $\xi(\boldsymbol{x},t), \langle \phi \rangle_{\mathbb{R}}$ can be written analytically as

430
$$\langle \phi \rangle_{\mathbb{R}} = \frac{1}{2} \left(1 - \operatorname{erf} \left(\frac{\xi_0}{\sqrt{2}\xi_{\mathrm{rms}}} \right) \right)$$
 (2.28)

where the subscript "rms" stands for the standard deviation of the considered 431quantity. To dig a little deeper in the interpretation of $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$, we can resort to 432some tools from mathematical morphology. This analysis is carried in Appendix 433A, where we provide a handy demonstration that at intermediate scales, $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$ 434measures the morphological content of the sets under consideration. The *structure* 435function is thus here apply named since it is a function that depends on the 436structure (actually the micro-structure) of the fluid elements. It allows some 437 geometrical features of iso-scalar sets to be inferred such as its volume, the 438439 surface area, mean and Gaussian curvatures and its transport equation naturally approaches the transport equations of surface density and volume at respectively 440

small and large scales. Note that by virtue of the Gauss-Bonnet theorem, the presence of $\langle \mathcal{G} \rangle_s$ in Eq. (2.17) indicates that $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$ depends also on the topology (the Euler characteristic) of the field under consideration.

Consequently, the present set of equations allows not only the morphology of scalar excursion sets to be described, it also accounts for its kinematic evolution through Eqs. (2.9) or (2.12). The interface retains through its geometry and kinematics the signature of the flow dynamics and, in some instances (e.g. twophase flows, TNTI), may even influence the whole flow dynamics. Therefore, we like referring this framework to as a morphodynamical theory since it is likely to provide insights into the morphological evolution of fluid elements.

451 **3. Numerical database and post-processing**

452 3.1. Direct Numerical Simulation of scalar mixing in decaying turbulence

The present analytical framework is appraised using data from Direct Numerical Simulations (DNS). We studied two flow configurations, i.e. forced turbulence (denoted by the "F" letter in Table 1) and decaying turbulence (denoted by the letter "D" in Table 1). We have also one case, noted "T", which was used for tests and validation purposes. Table 1 gathers all important simulation parameters and related statistical quantities, where N denotes the number of grid points along one coordinate axis, ν is the kinematic viscosity, and

460
$$R_{\lambda} = \frac{u_{\rm rms}\lambda}{\nu} \tag{3.1}$$

461 is the Reynolds number based on the Taylor micro-scale $\lambda = \sqrt{15\nu u_{\rm rms}^2/\langle\epsilon\rangle}$, 462 where $u_{\rm rms}$ is the root-mean-square velocity, $\langle k \rangle = \langle u_i u_i \rangle/2$ is the mean kinetic 463 energy, and $\langle \epsilon \rangle = 2\nu \langle S_{ij} S_{ij} \rangle$ is the mean energy dissipation rate, with the strain 464 rate tensor given by $S_{ij} = (\partial u_i / \partial x_j + \partial u_j / \partial x_i)/2$. Further, $\langle \xi^2 \rangle$ denotes the mean 465 scalar variance, $\langle \epsilon_{\xi} \rangle = 2D \langle (\partial \xi / \partial x_i)^2 \rangle$ is the mean scalar dissipation rate and $\lambda_{\xi} =$ 466 $\sqrt{6D \langle \xi^2 \rangle / \langle \epsilon_{\xi} \rangle}$ denotes the Corrsin length-scale. L_t and L_{ξ} denote the integral 467 length scales of the velocity and scalar fields, respectively. The Kolmogorov and 468 the Batchelor length scales are defined as

469
$$\eta = \left(\frac{\nu^3}{\langle\epsilon\rangle}\right)^{1/4} \text{ and } \eta_B = \left(\frac{\nu D^2}{\langle\epsilon\rangle}\right)^{1/4} = \frac{\eta}{Sc^{1/2}},$$
 (3.2)

470 respectively. The turbulent Péclet number $Pe_{\lambda_{\varepsilon}}$ is defined in Section 4.5.

• The forced turbulence database encompasses 6 different values of Taylor 471based Reynolds numbers R_{λ} (cases F0 to F5 in Table 1) from 88 to 530. For the 472lowest Reynolds number (F0, $R_{\lambda} = 88$), we carried out another simulation with 473four different scalar fields with different diffusion coefficients D, which correspond 474to Schmidt number variations from Sc = 0.1 to 1.0. The numerical database for 475case F0 (Sc = 1.0) to F5 is the same as the one used in Gauding *et al.* (2015, 4762017). To maintain a statistically steady state, an external stochastic forcing is 477applied to the velocity field (Eswaran & Pope 1988). The forcing is statistically 478isotropic and limited to low wave-numbers to avoid the small scales to be affected 479by the forcing scheme. The passive scalar field is fed by a uniform mean scalar 480 gradient G_{ξ} which is applied on the y-direction. Hence, the scalar field $\tilde{\xi}$ can be 481

482 decomposed into a mean field $G_{\xi}y$ and a fluctuating field ξ , i.e.,

483 $\tilde{\xi} = G_{\xi}y + \xi. \tag{3.3}$

The value of the mean scalar gradient G_{ξ} is set to unity without loss of generality. 484The indicator function is defined on the fluctuating field ξ , which is statistically 485homogeneous but not isotropic. The statistical anisotropy that is induced by the 486mean scalar gradient is further discussed in appendix F. A resolution condition 487 of $\kappa_{\rm max}\eta > 2.5$ (where $\kappa_{\rm max}$ is the maximum wavenumber achievable on the 488numerical grid and η the Kolmogorov length-scale) is maintained for all cases. As 489a consequence, the number of grid points has been increased to as high as N =490 4096^3 for case F5. The statistics presented in Table 1 and throughout the paper 491correspond to spatial and ensemble averages over M statistically independent 492493snapshots. M varies between 6 for case F5 to 106 for case F0. We have checked that the number of independent snapshots M was sufficient for two-point statistics 494to be converged. Some tests are reported in Appendix G 495

• For the decaying turbulence case, we explored two distinct situations, the first where the uniform imposed mean scalar gradient is maintained (case D0) and another where both the velocity and scalar field are decaying (case D1). For both D0 and D1, we have carried out DNS for two values for the Schmidt number (0.2 and 1.0). The initial velocity field is generated in spectral space to be random and statistically isotropic. It satisfies incompressibility and obeys a prescribed energy spectrum, i.e.,

503
$$E(\kappa, t=0) \propto \kappa^4 \exp\left(-2\left(\frac{\kappa}{\kappa_p}\right)^2\right), \qquad (3.4)$$

where κ_p is the wave-number at which the initial energy spectrum has its peak. 504We chose $\kappa_p = 15$ as a compromise between limiting confinement effects and the 505goal of reaching a high Reynolds number. The initial mean kinetic energy $\langle k \rangle$ 506 equals 10 leading to an initial Reynolds number, defined as $u_{\rm rms}(t=0)/(\nu\kappa_p)$, 507 as large as 689. For case D0, the scalar field is initialized to zero, allowing scalar 508 structures to develop naturally from the injection of energy through the imposed 509mean scalar gradient. For case D1, the scalar field decays freely from a prescribed 510spectrum, which is identical to the energy spectrum of the velocity field given by 511Eq. (3.4) with the same initial peak wave-number κ_p . Values reported in Table 5121 and throughout the paper were obtained at time t = 10, which is about one 513decade after the onset of the exponential decay of the kinetic energy. At this time, 514turbulence is highly resolved with a resolution condition $\kappa_{\max}\eta = 12.5$. For more 515details on the setup of the simulations, see Gauding *et al.* (2019). 516

• The test case T0 corresponds to decaying turbulence, but with a mesh size of 512^3 . This allowed us to test the appropriateness of the post-processing procedures. These validations are presented in the Appendix B and C and discussed hereafter in the paper.

The present DNS data were obtained by solving the Navier-Stokes equations and a scalar advection-diffusion equation using a dealiased pseudo-spectral approach. For dealiasing, a filter procedure proposed by Hou & Li (2007) is used, which ensures stability and inhibits spurious oscillations in real space. For cases F0-F5, a second order semi-implicit Adams-Bashforth/Crank-Nicolson method is used for temporal integration. For the decaying turbulence simulations D0-D1, a low-storage, stability preserving, third-order Runge-Kutta scheme is employed, where for stability, the viscous and diffusive terms are treated by an integrating factor technique. For all cases, the numerical domain is a triply periodic box with length $L_{\text{box}} = 2\pi$. The simulations have been carried out with an in-house hybrid MPI/OpenMP parallelized simulation code on the supercomputer JUQUEEN at research center Jülich, Germany.

We show some typical snapshots of the $\xi(\mathbf{x}) = 0$ iso-surface for different values 533for the Schmidt and Reynolds numbers in Fig. 2. We show only a $2\pi \times 2\pi \times \pi/2$ 534subset of the simulated domain. The interface is colored by the displacement 535speed S_d which is normalized by the velocity standard deviation $u_{\rm rms} = 2\langle k \rangle/3$. 536The color scale covers the range $-1 \leq S_d/u_{\rm rms} \leq 1$. Note that although Fig. 2 537gives another impression (remember that only a subset of the domain is presented 538 here), the volume fraction formed by the iso-scalar $\xi(\mathbf{x}) = 0$ is the same for all 539cases and is equal to 0.5. We note that while keeping R_{λ} constant (the three 540541leftmost figures in Fig. 2), a Schmidt number variation from 1 to 0.1 yields a substantial decrease of surface density. The interface is less wrinkled and the 542corrugation covers a narrower range of scales. This highlights the role of diffusion 543on the iso-surface geometrical quantities. On the other hand, an increase of the 544Reynolds number from (the four rightmost figures in Fig. 2) is followed by the 545creation of smaller and smaller wrinkles and an increase of the morphological 546content of the iso-scalar volume. $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E}}$ is thus believed to widen with R_{λ} . 547Fig. 2 also reveals that the displacement speed S_d varies mostly in zones of high 548curvature. This suggests that the curvature of the interface might play a crucial 549role for understanding the variations of the displacement speed and its different 550components. 551

552

3.2. Post-processing procedure

The computation of two-point statistics is challenging as it involves the execution 553of a convolution operation. We compute two-point statistics accurately in real 554space by a hybrid MPI/OpenMP parallelization employing the two-dimensional 555pencil domain decomposition of the DNS code. The partial angular average is 556approximated by averaging over the r_x -, r_y -, and r_z -directions. Special attention 557is required for the transfer term, which involves the divergence of a two-point 558quantity. To avoid the assumption of isotropy, the transfer term is approximated 559by a second-order finite difference scheme. For instance, in r_x -direction, the 560transfer term reads 561

562

 ∇

$$\mathbf{r} \cdot \langle (\delta \boldsymbol{u})(\delta \phi)^2 \rangle_{\mathbb{R}}(r_x, 0, 0) \approx$$

$$\frac{1}{2\Delta r_x} \left[\langle (\delta u_x)(\delta \phi)^2 \rangle_{\mathbb{R}}(r_x + \Delta r_x, 0, 0) - \langle (\delta u_1)(\delta \phi)^2 \rangle_{\mathbb{R}}(r_x - \Delta r_x, 0, 0) \right] +$$

$$\frac{1}{2\Delta r_y} \left[\langle (\delta u_y)(\delta \phi)^2 \rangle_{\mathbb{R}}(r_x, \Delta r_y, 0) - \langle (\delta u_2)(\delta \phi)^2 \rangle_{\mathbb{R}}(r_x, -\Delta r_y, 0) \right] +$$

$$\frac{1}{2\Delta r_z} \left[\langle (\delta u_z)(\delta \phi)^2 \rangle_{\mathbb{R}}(r_x, 0, \Delta r_z) - \langle (\delta u_3)(\delta \phi)^2 \rangle_{\mathbb{R}}(r_x, 0, -\Delta r_z) \right] ,$$

$$(3.5)$$

where Δr_i is the grid spacing and u_x , u_y , u_z are the velocity component in x, y, and z directions, respectively. The transfer terms in r_y - and r_z -directions are obtained by a similar procedure.

Some two-point statistics were also computed over the whole r space using the routines available through the increments library of the project pyarcher (Thiesset & Poux 2020). Because six nested loops are needed to cover the 569whole (\mathbf{X}, \mathbf{r}) -space, we make use of an openMP parallelization for enhancing the calculation speed. Full 3D two-point distributions were estimated only for 570case F0 and T0 and limited to the range of scales $-96dx \leq (r_x, r_y, r_z) \leq 96dx$ 571where most of the processes take place. By doing so, we are able to check that the 572partial angular average operated only over r_x , r_y , and r_z -directions was leading 573to similar results than those obtained from the full angular average over whole 574set of solid angles. These tests are presented in Appendix C and show that the 575partial angular average yields similar results as the full angular average. In what 576follows, only the results for the partial angular average will be presented. 577

Compared to the equation derived by Thiesset *et al.* (2020), the influence of the interface displacement results in an additional source term in Eq. (2.12). The latter highlights a correlation of the bulk phase ϕ with the surface quantity $S_{d}|\nabla_{x}\phi|$. Hence, this term requires a special treatment. Here, we adapt and develop a procedure inspired by the method of Seaton & Glandt (1986). The reader is advised to refer to Appendix B for a description and a validation of the method.

The geometrical properties of the iso-surface (local surface area, mean and Gaussian curvatures, surface conditional statistics) are extracted using the surface_operators routines of pyarcher. These are earlier versions of the routines described by Essadki *et al.* (2019); Di Battista *et al.* (2019), now available through the project Mercur(v)e.

M. Gauding, F. Thiesset, E. Varea, L. Danaila



Figure 2: Iso-surface colored by the displacement speed S_d for increasing Schmidt numbers or Reynolds numbers. (a) F0, Sc = 0.1, (b) F0, 0.4, (c) F0, 1.0, (d) F2, (e) F4, (f) F5.

590 4. Results

591

4.1. Surface conditional statistics

The analytical section presented above reveals that the displacement speed S_d 592contains many of the key physics in the behavior of iso-scalar surfaces. Depending 593on the situation, it may incorporate different processes such as diffusion, chemical 594reactions or any other source terms acting on the scalar field. It is thus important 595to understand how S_d evolves along the iso-surface when R_{λ} and/or Sc are varied. 596In our situation, the displacement speed contains up to three components, one 597due to diffusion in the normal direction noted S_d^n , another due to diffusion in 598the tangential direction $S_d^c = 2D\mathcal{H}$ and a last contribution associated with 599the imposed mean scalar gradient noted S_d^s . Their respective expressions are 600 summarized in Table 2. 601

As it is generally done in reacting flows (Gran et al. 1996; Peters et al. 1998), 602 the variations of S_d along the surface $\xi(\boldsymbol{x},t) = \xi_0$ are analyzed through surface 603 weighted average of its different components conditioned on the mean curvature 604 \mathcal{H} . These surface conditioned statistics are noted $\langle S_d^i | \mathcal{H} \rangle_s$ $(i = \{c, n, s\}$ denotes the 605 contribution to the displacement speed). Such conditional statistics are relevant 606 notably for providing insights into the curvature component of the stretch rate 607 \mathbb{K}_{C} , which reads as the mean product of the displacement speed S_{d} by the mean 608 curvature \mathcal{H} . 609

610 We first analyze the effect of R_{λ} on S_d and its components. Surface conditioned

Total
$$S_d = S_d^s + S_d^d$$

= Source $S_d^s = \frac{u_y G_{\xi}}{|\nabla_x \xi|}$
+ Diffusion $S_d^d = S_d^c + S_d^n = \frac{\nabla_x \cdot D \nabla_x \xi}{|\nabla_x \xi|}$
= Tangential diffusion $S_d^c = 2D\mathcal{H}$
+ Normal diffusion $S_d^n = \frac{n \cdot \nabla_x (n \cdot D \nabla_{\xi})}{|\nabla_x \xi|}$

Table 2: Expression of the different components of the displacement speed in forced turbulence with a mean scalar gradient G_{ξ} .



Figure 3: Surface averaged displacement speed and its components conditioned on the mean curvature \mathcal{H} for $\xi_0 = 0$. From dark to light, case F0 (Sc = 1.0) to F4. In (a) S_d (full lines), S_d^d (dashed lines) and S_d^c (dotted lines) are portrayed while S_d^n (dashed lines) and S_d^s (full lines) are displayed in (b).

statistics of S_d , S_d^d and S_d^c are portrayed in Fig. 3(a), while those of S_d^n and S_d^s are 611 displayed in Fig. 3(b). We consider here an iso-value of $\xi_0 = 0$. Note that in Fig. 612 3(a), the ordinate axis is ten times larger than the one of Fig. 3(b), which shows 613 that the source term and normal diffusion contributions of S_d are much smaller 614than the tangential diffusion component. Therefore, assuming $S_d \approx 2D\mathcal{H}$ appears 615 as a reasonable assumption irrespectively of the Reynolds number. In Fig. 3(b), 616 we also note that variations of S_d^s decrease in amplitude when R_λ increases. This 617suggests that the contribution due to the mean scalar gradient might become 618 negligible at sufficiently large R_{λ} . It is worth noting that the normal diffusion 619 component of the displacement speed S_d^n reveals a non-monotonic evolution with 620 respect to the mean curvature \mathcal{H} . When the surface is only slightly curved ($|\mathcal{H}|$ 621 is small), S_d^n is negative (positive) for positive (negative) values of \mathcal{H} , while the contrary is observed for highly curved regions. The variations of S_d^n with the 622 623 mean curvature does not depend on the Reynolds number for small values of \mathcal{H} . 624 625 The results for different Schmidt number are displayed in Fig. 4. One notes again that the tangential diffusion component of the displacement speed S_d^c , 626



Figure 4: Surface averaged displacement speed and its components conditioned by the mean curvature \mathcal{H} for $\xi_0 = 0$. From dark to light, case F0, Sc = 1.0 to Sc = 0.1. In (a) S_d (full lines), S_d^d (dashed lines) and S_d^c (dotted lines) are portrayed while S_d^m (dashed lines) and S_d^s (full lines) are displayed in (b).

is predominant thereby emphasizing the role played by curvature. All curves collapse relatively well when the mean curvature is scaled by the scalar diffusivity D. When the Schmidt number decreases, the contribution due to the source term S_d^s increases and so does the normal diffusion contribution S_d^n .

The different components of the displacement speed $\langle S_d^i | \mathcal{H} \rangle_s$ for a different iso-631 scalar value $\xi_0 = \xi_{\rm rms}$ are plotted in Figs. 5 and 6, respectively. We note here again that S_d^s and S_d^n are about 3 to 10 times smaller in amplitude than S_d^d and S_d^c . In contrast with $\xi_0 = 0$, S_d^n appears positive for all values of curvature 632 633 634 and irrespective of the Schmidt and Reynolds numbers. Although the trends are 635 quantitatively different from what was observed for $\xi_0 = 0$, we note that S_d 636 remains strongly dependent to \mathcal{H} . In addition, a carefull examination of Fig. 5 637 reveals that when \hat{R}_{λ} increases, the contribution of S_d^s and S_d^n decreases which leads to a better correlation between S_d and $2D\mathcal{H}$. We can speculate that at 638 639 asymptotically large R_{λ} , the assumption $S_d \approx 2D\mathcal{H}$ holds true irrespectively of 640 the iso-scalar value. At constant R_{λ} , the contribution of S_d^s and S_d^n increases 641 when the scalar diffusivity increases (Fig. 6). This suggests that the different 642 contributions to S_d for different iso-level ξ_0 , should be better be studied in terms 643 of Péclet number. In this context, we expect $S_d \approx 2D\mathcal{H}$ to hold with better 644accuracy when the Péclet number increases. 645

It is worth finally stressing that our conclusion that the tangential diffusion 646 dominates over the other components of the displacement speed, is built upon 647 the observations of surface weighted averaged values conditioned by the mean 648 curvature \mathcal{H} . This observable cannot reveal how S_d and its components are 649 statistically distributed for a given \mathcal{H} . There is nothing precluding that locally, 650 for a given value of mean curvature, the normal diffusion and/or the source term 651 contributions to S_d dominate over the tangential diffusion. This is likely to be 652 observed for low amplitudes of \mathcal{H} where the probability density function of \mathcal{H} 653is generally concentrated. More insights into this aspect could be provided by 654studying the joint probability density function of S_d^i and \mathcal{H} . This is far beyond 655 the scope of the present work and is left of future investigations. 656



Figure 5: Surface averaged displacement speed and its components conditioned on the mean curvature \mathcal{H} for $\xi_0 = \xi_{\rm rms}$. From dark to light, case F0 (Sc = 1.0) to F4. In (a) S_d (full lines), S_d^d (dashed lines) and S_d^c (dotted lines) are portrayed while S_d^m (dashed lines) and S_d^s (full lines) are displayed in (b).



Figure 6: Surface averaged displacement speed and its components conditioned by the mean curvature \mathcal{H} for $\xi_0 = \xi_{\rm rms}$. From dark to light, case F0, Sc = 1.0 to Sc = 0.1. In (a) S_d (full lines), S_d^d (dashed lines) and S_d^c (dotted lines) are portrayed while S_d^n (dashed lines) and S_d^s (full lines) are displayed in (b).

4.2. Second-order structure functions

The present framework is first invoked to explore the dynamics of iso-scalars with an imposed mean scalar gradient in stochastically forced turbulence. In this situation, both the flow and scalar characteristics are statistically stationary and the displacement speed has two components, one arising from the diffusive term S_d^d , and one due to the imposed mean gradient S_d^s . We focus on the particular effect of the Reynolds and Schmidt numbers.

The Reynolds number dependence of $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E},\Omega}$ for different values of the iso-scalar is first considered. Results are presented in Fig. 7 for R_{λ} ranging from 88 to 530 and for two values for the iso-scalar, i.e. $\xi_0 = 0$ (Fig. 7(a)) and $\xi_0 = \xi_{\rm rms}$ (Fig. 7(b)). $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{R},\Omega}$ is normalized by its asymptotic value at large scales, i.e. $2\langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}})$ while the separation r is normalized by $L_{\Sigma} =$

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Figure 7: Evolution of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}/2 \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}})$ with increasing R_{λ} . The separation r is normalized by $L_{\Sigma} = 4 \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}}) / \Sigma$. The local scaling exponent is also plotted in the inset. The dotted gray lines represent the asymptotic theoretical limits at large and small scales. (a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\rm rms}$.

669 $4\langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1-\langle \phi \rangle_{\mathbb{E},\mathbb{R}})/\Sigma$. Using the normalization with $L_{\Sigma} = 4\langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1-\langle \phi \rangle_{\mathbb{E},\mathbb{R}})/\Sigma$, 670 the asymptotic limits at large and small scales intersect at $r/L_{\Sigma} = 1$. Our 671 definition for L_{Σ} finds its inspiration in Lebas *et al.* (2009); Thiesset *et al.* 672 (2020). A somehow similar definition for L_{Σ} was conjectured by Peters (1992) 673 for premixed flames. In the context of the Bray-Moss-Libby model (Bray & Moss 674 1977; Libby & Bray 1980), L_{Σ} is known as the wrinkling scale (Kulkarni *et al.* 675 2021), although the surface density is defined differently by the latter authors. 676 One observes that all curves collapse at small scales where $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E},\Omega} \to \Sigma r/2$

One observes that all curves collapse at small scales where $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E},\Omega} \to \Sigma' r/2$ and at large scales where $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E},\Omega} \to 2 \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}})$. The most expert readers will probably notice that this behavior is also observed when two-point statistics of the velocity (or scalar) field are normalized by the Taylor (or Corrsin) microscale (Thiesset *et al.* 2014). Speculatively, this indicates that L_{Σ} plays for $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E},\Omega}$ the same role as the Taylor (Corrsin) microscale for normalizing the two-point statistics of the velocity (scalar) field.

At intermediate scales, the influence of the Reynolds number is perceptible. It 683 is observed that a pseudo 'inertial range' is forming whose extent increases with 684 R_{λ} . The local scaling exponent $\partial \log(\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E},\Omega}) / \partial \log(r)$ is plotted in the inset 685 of Fig. 7 and reveals that a power law with an exponent of about $\zeta \approx 0.36 - 0.38$ 686 applies over about one decade at $R_{\lambda} = 530$. As shown by Vassilicos & Hunt 687 (1996); Elsas *et al.* (2018), the distribution of $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E}}$ at intermediate scales 688 contains information about the fractal characteristics of iso-scalar surfaces. The 689 scaling exponents relate to the fractal dimension of the iso-surface by D_f = 690 $3-\zeta$. The same relation is used in the community of fractal aggregates (see e.g. 691 Sorensen 2001; Morán et al. 2019). Note that what we call here a fractal dimension 692 should rather be identified to a Kolmogorov capacity (Vassilicos & Hunt 1991; 693 Vassilicos 1992). We also exclude the possibility that the fractal dimension of 694 the intersection of the iso-scalar volume with a line (what we actually measure 695 using two-point statistics of the phase indicator) may be different from the fractal 696 dimension of the iso-volume itself (Vassilicos 1992). 697

The numerical value for D_f is found to be in the range $\{2.62 - 2.64\}$, in quite good agreement with the DNS value reported by Iyer *et al.* (2020) in the exact

same numerical configuration (they find $D_f = 2.67$ at $R_{\lambda} = 650$ for $\xi_0 = 0$ using 700 the box-counting method) and the theoretical analysis of Mandelbrot (1975) or 701 Grossmann & Lohse (1994) (also reproduced by Iyer et al. (2020)) providing a 702 value of 8/3. When $\xi_0 = \xi_{\rm rms}$, the value for the fractal dimension is roughly the 703 same although Iyer et al. (2020) showed that the fractal dimension decreases when 704the threshold ξ_0 is moved away from the mean value $\xi_0 = 0$. It is also worth noting 705 that the scale dependence of the local slope in the range $L_{\Sigma} \leq r \leq 10 L_{\Sigma}$ does 706 not exceed 5%. This is in contrast with the results presented by Iyer *et al.* (2020) 707 (see their Fig. 2) where there is no distinct scaling range for $\xi_0 = 0$. This suggests 708 that, in agreement with the observations of Elsas et al. (2018), measuring the 709 fractal dimension using the second-order structure function of the iso-scalar field 710 is probably more robust that the one inferred from the box counting method. 711

The flow under consideration is anisotropic due to the presence of the mean 712scalar gradient. We here coped with this by employing the partial angular average 713along three coordinates of r. It is thus worth evaluating if the above features for 714 $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{R}}$ are retrieved along the different directions of the separation vector 715r. This point is addressed in Appendix F where similar trends are observed, 716irrespectively of the direction. Only some small differences between the directions 717 parallel and perpendicular to the mean scalar gradient appear at the large scales. 718In appendix D, we also consider normalizing the separation r by the radius of 719 gyration R_g . The latter can be computed directly from $\langle (\delta \phi)^2 \rangle_{\mathbb{R}.\mathbb{E}.\Omega}$ by (Sorensen 720 2001; Yon et al. 2021): 721

722
$$R_g^2 = \frac{1}{2} \frac{\int_0^\infty r^4 A(r) dr}{\int_0^\infty r^2 A(r) dr}$$
(4.1)

where A(r) is the correlation function normalized in such a way that A(r) = 1 at r = 0 and A(r) = 0 at large scales, viz.

725
$$A(r) = 1 - \frac{\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E},\Omega}}{2\langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}})}$$
(4.2)

The results presented in Fig. 20 of appendix D show that the radius of gyration is a characteristic scale of the distribution $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E},\Omega}$ at large scales. Hence, R_g plays for $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E}}$ the same role as the integral length-scale for normalizing the two-point statistics of the velocity (or scalar) field.

In Appendix E, we also test the appropriateness of using the standard deviation of mean curvature $\mathcal{H}_{\rm rms}$ as a similarity variable. This type of normalization is expected to hold at small scales. Indeed, going back to Eq. (2.17), and further assuming $\langle \mathcal{G} \rangle_s \ll \langle \mathcal{H}^2 \rangle_s$, we have

734
$$\frac{\langle (\delta\phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}}{\Sigma \mathcal{H}_{\rm rms}^{-1}} = \frac{1}{2} r \mathcal{H}_{\rm rms} \left(1 - \frac{(r \mathcal{H}_{\rm rms})^2}{8} \right), \tag{4.3}$$

which is thus expected to be independent of Reynolds and Schmidt numbers when plotted in terms of $r\mathcal{H}_{\rm rms}$. The evolution of $\langle (\delta\phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ for different R_{λ} when the separation r is normalized by $r\mathcal{H}_{\rm rms}$ is presented in Fig. 24 of Appendix E. It appears that $r\mathcal{H}_{\rm rms}$ plays for the phase indicator field the same role as the Kolmogorov (or Batchelor) length-scale for normalizing the two-point statistics of the velocity (scalar) field.

The effect of Schmidt number on $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ is plotted in Fig. 8 for R_{λ} =



Figure 8: Evolution of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}/2 \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}})$ with increasing *Sc*. The separation *r* is normalized by $L_{\Sigma} = 4 \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}}) / \Sigma$. The dotted gray lines represent the asymptotic theoretical limits at large and small scales. (a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\rm rms}$.



Figure 9: Evolution of the transfer term $-\langle \nabla_r \cdot \langle (\delta u) (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R}} \rangle_{\Omega}$ normalized by $2\mathbb{K}_T \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}})$ with increasing R_{λ} . The separation r is normalized by L_{Σ} . The local scaling exponent is also plotted in the inset. The dotted gray lines represent the asymptotic theoretical limits at small scales. (a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\rm rms}$. The color legend is the same as in Fig. 7.

88 and Sc ranging from 0.1 to 1 and $\xi_0 = 0$ (Fig. 8(a)) and $\xi_{\rm rms}$ (Fig. 8(b)). 742We observe again that normalizing the separation r by L_{Σ} and $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ by 743 $2\langle \phi \rangle_{\mathbb{R},\mathbb{R}}(1-\langle \phi \rangle_{\mathbb{R},\mathbb{R}})$ yields a convincing collapse of the different curves at both small 744and large scales. The Schmidt number effects are perceptible only at intermediate 745scales where the scale distribution widens with increasing Sc. This means that 746 increasing the diffusivity of the scalar tends to decrease the morphological content 747 of the iso-scalar fields. This is the first evidence that diffusion acts as a restoration 748 749 effect which counteracts the influence of turbulent straining. More details on this aspect will be given later when examining the budgets of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$. 750

4.3. Transfer term

We now address the influence of Reynolds and Schmidt numbers on the transfer 752term $-\langle \nabla_r \cdot \langle (\delta \boldsymbol{u})(\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R}} \rangle_{\Omega}$. In Fig. 9, we consider the case where R_{λ} is ranging 753from 88 to 530 and Sc = 1.0. The transfer term is normalized by $2\mathbb{K}_T \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - 1)$ 754 $\langle \phi \rangle_{\mathbb{E},\mathbb{R}}$) while the separation is divided by L_{Σ} . This normalization is found to yield 755a good collapse of all curves at small scales. The specific evolution of the strain 756rate \mathbb{K}_T with respect to R_{λ} and Sc will be discussed later. Although visible, the 757 influence of the iso-value ξ_0 is rather limited, at least when the latter is moved 758from $\xi_0 = 0$ to $\xi_0 = \xi_{\rm rms}$. 759

In Fig. 21 of appendix D, we also report that the transfer term is independent of R_{λ} in the large-scales limit when the separation is normalized by R_g while $\langle \nabla_r \cdot \langle (\delta \boldsymbol{u})(\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R}} \rangle_{\Omega}$ is divided by a sort of turbulent strain felt at a scale R_g which can be written as $\sqrt{\langle k \rangle}/R_g$ ($\langle k \rangle$ is the turbulent kinetic energy). Consequently, R_g and $\sqrt{\langle k \rangle}/R_g$ are appropriate for normalizing the transfer term in the large scale limit. Fig. 25 of appendix E proves that the small-scale similarity variables for the transfer term are $\mathcal{H}_{\rm rms}^{-1}$ and $\mathbb{K}_T \Sigma \mathcal{H}_{\rm rms}^{-1}$ which plays for ϕ the same role as the Kolmogorov (Batchelor) scales for the velocity (scalar) field.

In Fig. 9, we also show the local scaling exponent of the transfer term. Although the scaling range appears more restricted than the one observed for secondorder moments, there seems to be a plateau forming around a value of about $\{-0.21; -0.23\}$ at the larger R_{λ} . Let us naively assume that, at intermediate scales, the flux can be written as:

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$$\langle (\delta \boldsymbol{u})(\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{R}} \sim \langle (\delta u_{||})^2 \rangle_{\mathbb{R},\mathbb{E}}^{1/2} \langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E}} \sim r^{\zeta_u/2+\zeta}.$$
 (4.4)

Here, $\delta u_{\parallel} = \delta \boldsymbol{u} \cdot \boldsymbol{r} / |\boldsymbol{r}|$ is the longitudinal increment of velocity. If we further 774 state that ζ_u , the scaling exponent for the velocity structure function, is equal 775to $\zeta_u = 2/3$, we obtain that the transfer term should scale as $r^{\zeta - 2/3} = r^{7/3 - D_f}$ 776 which for $\zeta = \{0.36; 0.38\}$ gives a scaling exponent of $\{-0.29; -0.31\}$. Our 777 numerical data indicate a value around $\{-0.21; -0.23\}$ for the transfer term 778 scaling exponent which is in reasonable agreement with this crude scaling analysis. 779 If we account for internal intermittency, i.e. $\zeta_u > 2/3$, the predicted exponent of 780 the transfer term is closer to the numerical value. Note that this reasoning holds also in the small scale limit, where $\langle (\delta u_{||})^2 \rangle^{1/2} \sim \langle (\delta \phi)^2 \rangle \sim r^1$ and hence the 781 782transfer term should scale as r^1 , which is numerically observed. To give this 783 scaling analysis a bit more strength, we use the closure proposed by de Divitiis 784(2014, 2016, 2020) which has the advantage of not relying on a parametrized 785turbulent diffusion hypothesis. When adapted to $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{R}}$, the latter writes, 786

787
$$-\langle \boldsymbol{\nabla}_{\boldsymbol{r}} \cdot \langle (\delta \boldsymbol{u}) (\delta \phi)^2 \rangle_{\mathbb{E}, \mathbb{R}} \rangle_{\Omega} = \frac{1}{2} \langle (\delta u_{||})^2 \rangle_{\mathbb{E}, \mathbb{R}, \Omega}^{1/2} \ \partial_r \langle (\delta \phi)^2 \rangle_{\mathbb{E}, \mathbb{R}, \Omega}. \tag{4.5}$$

Assuming again that $\langle (\delta u_{||})^2 \rangle_{\mathbb{E},\mathbb{R}} \rangle_{\Omega}$ scales as r^2 at small scales and $r^{2/3}$ at intermediate scales, we obtain that the transfer term should scale as r^1 and $r^{\zeta-2/3} = r^{7/3-D_f}$ at small and intermediate scales, respectively. This reasoning is in agreement with the numerical data.

While the Kolmogorov four-fifth law and Yaglom four-third law are known to provide a r^0 scaling for the transfer term of either velocity or scalar in the inertial range, the one pertaining to the phase indicator is substantially different and is proved to relate to the fractal dimension of the iso-surface. According to our elaborations, a fractal dimension of 8/3 translates into a $r^{-1/3}$ scaling for

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Figure 10: Evolution of the transfer term $-\langle \nabla_{\mathbf{r}} \cdot \langle (\delta \boldsymbol{u}) (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R}} \rangle_{\Omega}$ normalized by $2\mathbb{K}_T \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}})$ with increasing *Sc.* The separation *r* is normalized by L_{Σ} . The dotted gray lines represent the asymptotic theoretical limits at small scales. (a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\rm rms}$. The color legend is the same as in Fig. 8.

the transfer term of iso-volumes while a fractal dimension of 7/3 results in a r^0 scaling.

The effect of Schmidt number on the transfer term is displayed in Fig. 10(a) for 799 $\xi_0 = 0$ and Fig. 10(b) for $\xi_0 = \xi_{\rm rms}$. In both cases, $R_{\lambda} = 88$. When Sc increases 800 from 0.1 to 1.0, all curves collapse well at small scales thereby complying with 801 the $\{L_{\Sigma}, 2\mathbb{K}_T \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}})\}$ scaling. It is further observed that decreasing the 802 diffusivity of the scalar field (i.e. increasing the Schmidt number) acts in widening 803 the range of scales over which the transfer term operates. The same trend was 804 observed for increasing Reynolds numbers. This suggests that the appropriate 805 non-dimensional number for characterizing the phase indicator scale distribution 806 and its transfer is likely to be the Péclet number. This assertion will be discussed 807 in more details later in this paper. 808

4.4. Two-point budget

The different terms of the angularly averaged budget Eq. (2.15) for Sc = 1.0, 811 88 $\leq R_{\lambda} \leq 530$ and for two values for the iso-scalar $\xi_0 = 0$ and $\xi_0 = \xi_{\rm rms}$ 812 are presented in Fig. 11. Here again, the different terms are normalized by 813 $2\mathbb{K}_T\langle\phi\rangle_{\mathbb{R},\mathbb{R}}(1-\langle\phi\rangle_{\mathbb{R},\mathbb{R}})$ while the separation is divided by L_{Σ} . The normalization 814 by the large-scale quantities R_g and $\sqrt{\langle k \rangle}/R_g$ is reported in Fig. 22 of Appendix 815 D while the one based on $\mathcal{H}_{\rm rms}$ and $\mathbb{K}_T \Sigma / \mathcal{H}_{\rm rms}$ is plotted in Fig. 26 of Appendix 816 E.

Fig. 11 reveals that the transfer term is positive which means that, as expected, 817 the action of turbulence stirs, stretches and folds the scalar field thereby increas-818 ing its tortuousness and its morphological content. The diffusive component of the 819 interface propagation term, i.e. the term due to S_d^d , is negative and thus acts in 820 smoothing the interface. Peters (1992) used to refer to the process associated 821 with S_d as a kinematic restoration effect which appears indeed apply named 822 as it tends to counteract the influence of turbulent strain by smoothing the 823 interface. The term in the two-point budget associated with the imposed mean 824 gradient, i.e. the term due to S_d^s , is negative for an iso-scalar value $\xi_0 = 0$ and 825 positive for $\xi_0 = \xi_{\rm rms}$. This indicates that the imposed mean gradient decreases 826



Figure 11: Budget of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ with increasing R_{λ} . Full lines: transfer term, dashed lines: S_d^d -term, dash-dotted lines: S_d^s -term. All contributions are normalized by $2\mathbb{K}_T \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}})$ while the separation r is normalized by L_{Σ} . (a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\text{rms}}$. The color legend is the same as in Fig. 7.

the morphological content of the iso-scalar close to the $\xi_0 = 0$ iso-value and redistributes it to the scalar iso-values away from the mean.

The influence of R_{λ} is also visible in Fig. 11. When normalized by $2\mathbb{K}_T \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - 1)$ 829 $\langle \phi \rangle_{\mathbb{R},\mathbb{R}}$, the different terms collapse at small scales and decrease in amplitude in 830 the intermediate range of scales. When R_{λ} increases, the range of scales over which 831 the different terms of the budget are contributing, increases. Using the large-scale 832 normalization (see Fig. 22 in appendix D), the terms collapse at large scales and 833 their respective amplitude increases with R_{λ} . The evolution of the different terms 834 of the budget using the small-scale similarity variables is presented in Fig. 26 of 835 Appendix E. It is also worth noting that, at small, up to intermediate scales, 836 the relative influence of the S_d^s -term compared to e.g. the transfer term decreases 837 when R_{λ} increases. This suggests that in the limit of very large R_{λ} , the strain rate 838 and the diffusion terms balance while the source term due to the imposed mean 839 gradient remains concentrated only at the large scales. In other words, at large 840 R_{λ} , the strain rate \mathbb{K}_T and the curvature component of the stretch rate due to 841 S_d^d , i.e. $\mathbb{K}_C^d = -2\langle S_d^d \mathcal{H} \rangle_s$ balance, whilst the curvature component of the stretch 842 rate due to S_d^s , i.e. $\mathbb{K}_C^s = -2\langle S_d^s \mathcal{H} \rangle_s$ tends to zero. For $\xi_0 = 0$, the area weighted 843 averaged displacement speed is zero. Fig. 11(a) confirms that all terms tend to 844 zero at large scales in agreement with Eq. (2.22). For $\xi_0 = \xi_{\rm rms}$, only the transfer 845 term approaches zero when $r \to \infty$ while the S_d^d - and S_d^s -terms balance. The limit of the S_d^d -term at large scales is also in agreement with Eq. (2.22) which is 846 847 displayed by the horizontal gray dotted lines in Fig. 11(b). The balance between 848 the S_d^d - and S_d^s -terms at large scales suggests that the volume of the excursion 849 set which naturally decreases due to diffusion effect is exactly compensated by 850 the imposed mean gradient. 851

The effect of Schmidt number on the different terms of the budget at constant $R_{\lambda} = 88$ is displayed in Fig. 12(a) for $\xi_0 = 0$ and Fig. 12(b) for $\xi_0 = \xi_{\rm rms}$. Here again, the normalization using L_{Σ} and \mathbb{K}_T yields a good collapse of all curves in the limit of small separations. For $\xi_0 = 0$, decreasing the Schmidt number from 1.0 to 0.1, i.e. increasing the scalar diffusivity by a factor of 10, leads to a smaller amplitude of the diffusion term in the intermediate range of scales. In



Figure 12: Budget of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ with increasing *Sc.* Full lines: transfer term, dashed lines: S_d^d -term, dash-dotted lines: S_d^s -term, dotted lines: $-S_d^d$ -term. All contributions are normalized by $2\mathbb{K}_T \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}})$ while the separation *r* is normalized by L_{Σ} . (a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\text{rms}}$. The color legend is the same as in Fig. 8.

the same range of scales (i.e. up to $r \approx L_{\Sigma}$), the transfer term normalized by \mathbb{K}_T 858 appears rather insensitive to Schmidt number variations. The influence of Sc on 859 the transfer term is perceptible only at large scales where it is observed that the 860 scale at which the transfer term approaches zero decreases with increasing scalar 861 diffusivity. The third term in the budget due to the imposed mean gradient is 862 plotted as dash-dotted lines. When $\xi_0 = 0$, the latter is negative, progressively 863 tends to zero when Sc decreases, and becomes even slightly positive for Sc = 0.1. 864 This means that when Sc = 0.1, the scalar is so diffusive that the imposed 865 mean gradient becomes a gain in the budget for this particular iso-value. For 866 $\xi_0 = \xi_{\rm rms}$, the term due to the imposed mean gradient acts at rather large scales, 867 is positive and increases in amplitude when Sc decreases. At large scales the 868 budget is composed of only the diffusion and imposed mean gradient terms, while 869 the transfer term is zero. 870

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4.5. Strain and curvature components of the stretch rate

We now investigate the evolution of the different normalizing quantities with respect to R_{λ} and Sc. When both R_{λ} and Sc vary, it may be more appropriate to define the turbulent Péclet number:

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$$Pe_{\lambda_{\xi}} = \frac{\sqrt{2\langle k \rangle}/3\lambda_{\xi}}{D}$$
(4.6)

876 With this definition, the Péclet number is related to the Schmidt and Reynolds 877 number by

878
$$Pe_{\lambda_{\xi}} = \left(\frac{6R}{10}\right)^{1/2} R_{\lambda} Sc^{1/2}$$
(4.7)

where R is the scalar to mechanical time-scale ratio, i.e.

880
$$R = \frac{\langle \xi^2 \rangle}{\langle \epsilon_{\xi} \rangle} \frac{\langle \epsilon \rangle}{\langle k \rangle}$$
(4.8)

881 which may also vary with R_{λ} and Sc.

We first characterize the influence of the Péclet number on \mathbb{K}_T , \mathbb{K}_C^d and \mathbb{K}_C^s . \mathbb{K}_T is inferred from Eq. (2.24), i.e. from the slope of the transfer term in the limit of small scales. Similarly, Eq. (2.25) reveals that \mathbb{K}_C^d and \mathbb{K}_C^s can be obtained from the slope of the S_d^d and S_d^s terms, respectively, when r approaches zero. Results are portrayed in Fig. 13 where all quantities are made non-dimensional by multiplying by the Kolmogorov time scale $\tau_\eta = (\nu/\langle \epsilon \rangle)^{1/2}$.

For $Pe_{\lambda_{\xi}} > 50$, the normalized strain rate $\mathbb{K}_T \tau_{\eta}$ is nearly constant around a 888 value of about 0.25. Since this observation holds for both $\xi_0 = 0$ and $\xi_0 = \xi_{\rm rms}$, 889 this means that the different iso-scalars experience nearly the same turbulent 890 straining. The value of $0.25\tau_{\eta}$ is in agreement with the finding of Yeung *et al.* 891 (1990) who report a value of 0.28 for material surfaces. It is also consistent 892 with the phenomenological model of Thiesset *et al.* (2016b) which gives roughly 893 894 the same value of 0.28. It is argued by Girimaji & Pope (1992) that the strain rate experienced by propagating surfaces is smaller than that acting on material 895 surfaces since there will be less time for the iso-surface to align with strain. Our 896 value of 0.25 for $\mathbb{K}_T \tau_\eta$ instead of 0.28 is thus consistent with this argument. In 897 addition, when the scalar diffusivity is increased so that $Pe_{\lambda_{\xi}} < 50$, we note a 898 substantial decrease of $\mathbb{K}_T \tau_\eta$ which drops down to 0.2. This indicates that the 899 higher the diffusivity, the larger is the displacement speed, and the smaller the 900 time for the iso-surface to align with strain. The constancy of $\mathbb{K}_T \tau_n$ at large Péclet 901 numbers is also predicted by the closure of de Divitiis (2014, 2016, 2020) given 902 by Eq. (4.5). Indeed, Kolmogorov's first similarity hypothesis implies for $r \to 0$: 903

904
$$\langle (\delta u_{||})^2 \rangle_{\mathbb{E},\mathbb{R},\Omega} \sim \frac{\langle \epsilon \rangle}{\nu} r^2,$$
 (4.9)

which by virtue of Eqs. (2.17) and (2.24) gives $\mathbb{K}_T \tau_{\eta} = \text{const.}$

A careful analysis of Fig. 13 further shows that $K_C^d \tau_{\eta}$ is always negative and 906 thus counteracts the effect of turbulent straining. It also approaches a constant 907 value when Péclet increases, but at a smaller rate than \mathbb{K}_T . The influence of 908 the imposed mean gradient on the source component of the stretch rate $K_C^s \tau_\eta$ is 909 perceptible at finite Péclet number and it is observed to be negative for $\xi_0 = 0$ and 910 911 positive for $\xi_0 = \xi_{\rm rms}$. Here again, this suggests that the imposed mean gradient acts in redistributing the surface density from the mean iso-value $\xi_0 = 0$ to iso-912values away from the mean. $K_C^s \tau_\eta$ approaches zero at the highest Péclet number. 913 This indicates that in the limit of very high $Pe_{\lambda_{\xi}}$, the imposed mean gradient 914does not influence the evolution of the iso-scalar surface density, the latter being 915 driven only by diffusion and straining effects. 916

4.6. Characteristic length-scales

The previous analysis of two-point statistics highlighted the existence of three characteristic length-scales for the excursion set ϕ . The first one, L_{Σ} , is relevant for normalizing the two-point statistics at both small and large scales. The second R_g applies in the large scale limit while the third $\mathcal{H}_{\rm rms}^{-1}$ is relevant at small up to intermediate scales. Some speculations about the connection between L_{Σ} ($\mathcal{H}_{\rm rms}^{-1}$) and the Corrsin (Batchelor) microscales have already been stated earlier in this paper. We now provide more rigorous evidence for this.

First, it is worth recalling that, for isotropic media, the surface density Σ is related to the number of zero-crossings of the field $\xi(\boldsymbol{x}) - \xi_0$ (Torquato 2002). On the other hand, there exist numerous studies that highlight a close

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Figure 13: Scaling of the different components of the stretch rate $\mathbb{K} = \mathbb{K}_T + \mathbb{K}_C$ with respect to R_{λ} .(a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\text{rms}}$.

928 relation between the Taylor microscale and the number of zero-crossings of turbulent signals (see e.g. Liepmann 1949; Sreenivasan et al. 1983; Mazellier & 929 Vassilicos 2008, among others). Hence, there are reasons to expect that L_{Σ} and 930 the Corrsin microscale λ_{ξ} are intimately linked. Recall that the Corrsin microscale 931 is here defined by $\lambda_{\xi}^2 = 6D\langle \xi^2 \rangle_{\mathbb{E},\mathbb{R}} / \langle \epsilon_{\xi} \rangle_{\mathbb{E},\mathbb{R}}$. Second, given that R_g is the relevant 932 normalizing scale in the large scale limit, it seems natural to associate R_q with 933 the integral length-scale of the scalar field noted L_{ξ} . Here, L_{ξ} is computed from 934the scalar fluctuations spectrum $E_{\xi}(\kappa)$, i.e. 935

936
$$L_{\xi} = \frac{\pi}{2} \frac{\int_0^{\infty} \kappa^{-1} E_{\xi}(\kappa) \mathrm{d}\kappa}{\int_0^{\infty} E_{\xi}(\kappa) \mathrm{d}\kappa}$$
(4.10)

These arguments are tested against numerical data in Fig 14(a). While $Pe_{\lambda_{\epsilon}}$ is 937 multiplied by roughly 20, the ratio R_q/L_{ξ} and λ_{ξ}/L_{Σ} remain close to 0.5 with some 938 small departures which do not exceed $\pm 20\%$. Hence, it appears that $L_{\Sigma} \sim \lambda_{\xi}$ and 939 $R_g \sim L_{\xi}$ are good approximations. The small departures in the scaling between R_g 940 and L_{ξ} can be due to several effects. First, some confinement due to the finite ratio 941between L_{ξ} and the simulation box size can be at play. Second, the scaling between 942 R_q and L_{ξ} can also be altered by some finite Péclet numbers effects. The latter 943 are likely to reveal themselves in the evolution of R_q/L_{ξ} which is first decreasing 944 945before reaching a plateau for Péclet numbers above 50. Such finite Péclet number effects were also noticed by Shete & de Bruyn Kops (2020). As far as the scaling 946 between L_{Σ} and λ_{ξ} is concerned, it is first worth recalling that the Rice's theorem 947 is valid only if both ξ and $\nabla \xi$ have Gaussian probability density functions and are 948 statistically uncorrelated. While ξ is normally distributed, internal intermittency 949 leads to significant departure from Gaussian distributions for the scalar gradient. 950 At finite Reynolds or Péclet numbers, the assumption of statistical independence 951between ξ and its derivatives is not likely to hold. As a consequence, all data 952 from the literature (e.g. Sreenivasan et al. 1983) indicate that the Rice theorem 953 is a good approximation for turbulent signals verified within 20%. Departures are 954thus of same magnitude here. Finally, we explored here only two scalar iso-values. 955 It is not excluded that the proportionality between L_{Σ} and λ_{ξ} ceases to apply 956for some higher iso-values of ξ_0 . 957



Figure 14: (a) Ratio of the length-scales L_{ξ}/R_g , λ_{ξ}/L_{Σ} and $\mathcal{H}_{\rm rms}\eta_B$, with respect to $Pe_{\lambda_{\xi}}$ for both $\xi_0 = 0$ and $\xi_0 = \xi_{\rm rms}$. The dotted lines represent a ratio of 0.5 and 0.22. (b) Surface density Σ versus $R_g \mathcal{H}_{\rm rms}$. The lines represent the expectations using a fractal dimension $D_f = 2.62$.

Let us now focus on the scaling of \mathcal{H}_{rms} . It is first worth recalling that the 958 relation $\mathbb{K}_T \approx \mathbb{K}_C^d \sim \tau_{\eta}$ holds relatively well, except maybe at the smallest Péclet 959 numbers (Fig. 13). On the other hand, the analysis performed in section 4.1960 indicates that $S_d \approx 2D\mathcal{H}$ is a rather safe approximation. With these relations, 961 one can easily conclude that the standard deviation of the mean curvature 962 is proportional to the inverse of the Batchelor length-scale η_B . This result is 963 tested with success in Fig. 14(a) which proves that the standard deviation 964 of mean curvature is indeed proportional to the Batchelor length-scale (Due 965 to computational limitations, we were unable to estimate $\mathcal{H}_{\rm rms}$ for case F5. 966 Hereafter, we will assume $\mathcal{H}_{\rm rms} = 0.22/\eta_B$ for this case). It is worth noting 967 that DNS data give $\eta_B \mathcal{H}_{\rm rms} = \text{const.}$ even at low Péclet numbers where the approximation $\mathbb{K}_T \approx \mathbb{K}_C^d \sim \tau_\eta$ does not hold anymore. We thus believe that 968 969 970 the relation between the Batchelor length-scale and the standard deviation of mean curvature is likely to be a general result which does not necessarily requires 971 $\mathbb{K}_T \approx \mathbb{K}_C^d \sim \tau_{\eta}$. We have also tested the scaling of $\mathcal{H}_{\rm rms}$ with the Obukhov-Corrsin 972 length-scale $\eta_{OC} = (D^3/\langle\epsilon\rangle)^{1/4} = \eta/Sc^{3/4}$ (not shown), but the latter was found to 973 be inappropriate. This conclusion is consistent with the findings of e.g. Antonia 974 & Orlandi (2003); Donzis et al. (2005) which prove that the Batchelor length-975 scale is the appropriate normalizing the scalar fluctuations scale distributions 976 irrespective of the Schmidt number. 977

To conclude, for the values of ξ_0 investigated here, the geometrical characteristics scales R_g , L_{Σ} and \mathcal{H}_{rms}^{-1} of the iso-scalar fields can be related to the somehow more 'usual' characteristic scales of the scalar field: the integral, Corrsin and Batchelor length-scales, respectively. There thus exists an intimate connection between the geometrical and hydrodynamic characteristic scales.

In the appendix, we plot the local scaling exponent of $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E},\Omega}$ when the separation is made non-dimensional using either R_g (Fig. 20) or $\mathcal{H}_{\rm rms}^{-1}$ (Fig. 24). We observe in Fig. 24 that the onset of the fractal scaling range starts at a scale proportional to $\mathcal{H}_{\rm rms}^{-1}$. On the other side (Fig. 20), the end of the scaling range appears at a scale proportional to R_g . Therefore, the inner cutoff of the fractal range is related to $\mathcal{H}_{\rm rms}^{-1}$ (and hence η_B) while the outer cutoff is given by R_g (and hence L_{ξ}). Note that Sreenivasan *et al.* (1989) conjectured that for small Schmidt number, the inner cutoff should be related to the Obukhov-Corrsin length-scale 993 A fractal scaling should result in (Sreenivasan *et al.* 1989),

$$L_{\rm box} \Sigma = k_f \left(\frac{R_g}{\mathcal{H}_{\rm rms}^{-1}}\right)^{D_f - 2},\tag{4.11}$$

where k_f is the fractal prefactor and $L_{\text{box}} = 2\pi$ is used for normalization 995 as in Shete & de Bruyn Kops (2020). Figure 14(b) portrays the evolution of 996 surface density Σ with respect to $R_g \mathcal{H}_{\rm rms}$ for all Péclet numbers. The log-log 997 representation clearly indicates that a power-law is at play with an exponent in 998 very close agreement with $D_f = 2.62$ and $D_f = 2.64$ for $\xi_0 = 0$ and $\xi_0 = \xi_{\rm rms}$ 999 respectively. Surprisingly, Eq. (4.11) holds even at the lowest Péclet numbers, 1000 although there is no clear scaling range for $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E},\Omega}$. We also note that the 1001 fractal prefactor k_f in Eq. (4.11) depends on particular the choice of the iso-scalar 1002but not on the Péclet number. 1003

1004 Expressing R_g and \mathcal{H}_{rms} in terms of L_{ξ} and η_B in Eq. (4.11) yields:

1005
$$\Sigma \sim \left(C_{\epsilon} \frac{L_{\xi}}{L_t} P e_{\lambda}^{\frac{3}{2}} S c^{-1} \right)^{D_f - 2}$$
(4.12)

1006 where C_{ϵ} is the kinetic energy dissipation constant and Pe_{λ} is the Taylor based 1007 Péclet number $Pe_{\lambda} = R_{\lambda}Sc$. When expressed in terms of $Pe_{\lambda_{\epsilon}}$, Eq. (4.12) writes:

1008
$$\Sigma \sim \left(C_{\epsilon} \frac{L_{\xi}}{L_{t}} R^{-3/4} P e_{\lambda_{\xi}}^{\frac{3}{2}} S c^{-1/4} \right)^{D_{f}-2}$$
(4.13)

Eq. (4.12) indicates that for Sc = 1, and further omitting the dependence of C_{ϵ} 1009 and L_{ξ}/L_t to R_{λ} , the surface density of iso-scalars Σ should grow as $Pe_{\lambda}^{\frac{3}{2}(D_f-2)} = Pe_{\lambda_{\xi}}^{\frac{3}{2}(D_f-2)} = R_{\lambda}^{\frac{3}{2}(D_f-2)}$. If $D_f = 8/3$, we have $\Sigma \sim Pe_{\lambda} \sim Pe_{\lambda_{\xi}} \sim R_{\lambda}$ while 1010 1011 $D_f = 7/3$ leads to $\Sigma \sim Pe_{\lambda}^{1/2} \sim Pe_{\lambda_{\xi}}^{1/2} \sim R_{\lambda}^{1/2}$. The Pe_{λ} scaling derived in 1012 Eq. (4.12) is different from the one observed by Shete & de Bruyn Kops (2020) 1013 in a configuration similar to the present one (although the velocity forcing and 1014 dealiasing procedures were different). They obtained that $\Sigma \sim P e_{\lambda}^{1/2}$ over an 1015 impressive range of Péclet numbers. This result was obtained by averaging the 1016surface areas over 20 different iso-levels covering the range of scalar fluctuations. 1017 Since the fractal dimension D_f is known to vary for different iso-levels (Iyer *et al.* 1018 2020), lumping together the values for 20 iso-surface areas could have resulted in 1019a different scaling with respect to the Péclet number. Further investigations are 1020 required to confirm whether or not Eq. (4.12) holds true for the data of Shete & 1021 de Bruyn Kops (2020). 1022

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4.7. Decaying turbulence

We now proceed to the analysis of the scale-by-scale budgets in decaying turbulence. In this situation, the time derivative term in Eq. (2.15) contributes to the budget. We consider two cases where the production term associated with the imposed mean scalar gradient is either retained or deactivated. For each situation, a Schmidt number of 1.0 and 0.2 is analyzed.

We start with the case where the kinetic energy is freely decaying but the imposed mean scalar gradient is maintained. Therefore, the time derivative term



Figure 15: Budget of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R}\Omega}$ with increasing ξ_0 in decaying turbulence with imposed mean scalar gradient. Full lines: transfer term, dashed lines: S_d^d -term, dash-dotted lines: S_a^s -term, dotted lines: dt-term. All contributions are normalized by $2\mathbb{K}_T \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}})$ while the separation r is normalized by L_{Σ} . (a) Sc = 1, (b) Sc = 0.2. Three values of $\xi_0 = 0, 0.5\xi_{\rm rms}, \xi_{\rm rms}$ are displayed from dark to light.

in Eq. (2.15) is not zero but the displacement speed S_d has a source term 1031 contribution S_d^s . The different terms of the scale-by-scale budgets are presented 1032in Fig. 15 for the two Schmidt number values and for three different values of ξ_0 1033 from 0 to $\xi_{\rm rms}$. We observe that when normalized by $2\mathbb{K}_T\langle\phi\rangle_{\mathbb{R},\mathbb{R}}(1-\langle\phi\rangle_{\mathbb{R},\mathbb{R}})$ and 1034 L_{Σ} , the transfer term is almost independent of the choice of the iso-scalar value. 1035This means that the different iso-surfaces experience the same scale dependent 1036 turbulent straining. The Schmidt number variations are similar to the one already 1037 documented in the previous section. The contribution due to scalar diffusion is 1038 always negative which means that the restoration effect acts in counteracting the 1039 turbulent straining. At large scales, increasing ξ_0 and decreasing Sc is followed by 1040 a increasing amplitude of the S_d^d -term which is consistent with an increase of S_d 1041 1042 and D. The term associated with the imposed mean scalar gradient, is positive, acts at larger scales and its amplitude increases with ξ_0 . The balance between all 1043 these terms yields the time variations of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R}\Omega}$. This term has a rather small 1044 amplitude compared to the three others. We note however that at large scales 1045and for $\xi_0 > 0$, the time variations of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R}\Omega}$ are positive meaning that the 1046 volume $\langle \phi \rangle_{\mathbb{E},\mathbb{R}}$ tends to increase with time. This is consistent with the observation 1047that in decaying turbulence in presence of an imposed mean scalar gradient, the 1048 1049 variance of ξ grows in time. We also note that at large scales, all terms of the budget tend to zero when $\xi_0 = 0$ meaning that the volume $\langle \phi \rangle_{\mathbb{R},\mathbb{R}}$ for $\xi_0 = 0$ is 1050conserved. 1051

Deactivating the source term leads to $S_d^s = 0$. In this situation, the time 1052variations of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ is due to the unbalance between the transfer term and 1053 diffusion term. Results for Sc = 1.0 and 0.2 and for $\xi_0 = 0, 0.5\xi_{\rm rms}$ and $\xi_{\rm rms}$ are 1054presented in Fig. 16. Here again, we observe that the particular choice of ξ_0 does 1055not change drastically the transfer term when the latter is scaled in terms of 1056 $2\mathbb{K}_T\langle\phi\rangle_{\mathbb{R},\mathbb{R}}(1-\langle\phi\rangle_{\mathbb{R},\mathbb{R}})$. Influence of ξ_0 and Sc are much more perceptible on the 1057diffusion term and consequently the time derivative term. There is a systematic 1058decrease of the S_d^d -term at both intermediate and large scales when ξ_0 increases 1059



Figure 16: Budget of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ with increasing ξ_0 in decaying turbulence without imposed mean scalar gradient. Full lines: transfer term, dashed lines: S_d^d -term, dash-dotted lines: S_d^s -term, dotted lines: *dt*-term. All contributions are normalized by $2\mathbb{K}_T \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}})$ while the separation r is normalized by L_{Σ} . (a) Sc = 1, (b) Sc = 0.2. Three values of $\xi_0 = 0, 0.5\xi_{\rm rms}, \xi_{\rm rms}$ are displayed from dark to light.

1060 from 0 to $\xi_{\rm rms}$. We also observe that the slope of the time derivative term at 1061 small scales is negative meaning that the surface density is decreasing in time. 1062 At large scales, the unsteady term is negative, asymptotes the diffusion term and 1063 increases in amplitude with ξ_0 and Sc.

1064 In summary, forced and decaying turbulence share some common behaviors:

• The transfer term is positive in both case, meaning that turbulent straining acts in increasing the morphological content of iso-scalar sets.

• The contribution due to diffusion (the S_d^d -term) is always negative. It thus plays a restoration effect that counteracts the effect of turbulent straining.

• Increasing scalar diffusivity (decreasing Sc) always leads to a decrease of the iso-scalar morphological content. This is mainly due to the above-mentioned restoration effect, where the latter increases with D, which is consistent with the assumption $S_d^d \approx 2D\mathcal{H}$.

1073 In contrast, there are key differences between forced and isotropic turbulence 1074 which are summarized below:

• In forced stationary turbulence, the time derivative term in Eq. (2.15) is by definition zero for all scales.

• In decaying situations, depending on the iso-scalar value and the presence or absence of mean scalar gradient, the time derivative term can be either positive or negative as detailed below:

In decaying turbulence, in absence of mean scalar gradient, the time deriva tive term is systematically negative, meaning that both the surface density
 and iso-scalar volume are decreasing.

In presence of mean scalar gradient, the time derivative term can be either
 positive or negative depending on the iso-scalar value.

1085 5. Conclusion

A new theory is proposed to characterize the time evolution of iso-scalar volumes. 1086 It is based on the two-point transport equation of the phase indicator field. 1087 The main analytical tools that are convoked emanate from two, apparently 1088 disconnected, fields of physics. On the one hand, using known analytical results 1089 from the field of heterogeneous media and fractal aggregates, we have shown that 1090two-point statistics of the phase indicator allow some integral geometric quantities 1091 (volume, surface area and curvatures) and some morphological characteristics 1092 (reach, inner/outer cutoff, fractal dimension) to be measured. On the other hand, 1093 we invoked the machinery of the scale-by-scale budgets which is adapted to 1094 the kinematic equation of iso-volumes. Combining such two approaches allows 1095 1096 not only the geometry, morphology and topology of the fluid structures to be assessed; it also embeds their scale/space/time evolution. As a consequence, we 1097like referring to this framework as a morphodynamical theory. It also naturally 1098 degenerates to the transport equations for the volume and surface density in the 1099 limit or large and small scales, respectively, thereby offering promising perspec-1100 tives for modelling either scalar mixing (Catrakis & Dimotakis 1996), two-phase 1101 flows (Lebas et al. 2009) or combustive flows (Trouvé & Poinsot 1994) using a 1102 volume-surface density approach. The new set of equations derived in the present 11031104 work generalizes some previous analysis by Thiesset *et al.* (2020, 2021). It is now possible to cope with diffusive and/or reactive scalars, in presence or absence of 1105 source terms. All these processes are embedded in the interface displacement 1106 speed that may possess different contributions and different physical origins 1107 depending on the flow situation. It is an exact framework and has the potential 1108 of being applied to different flow variables in different flow situations. Hence, it 1109 is believed to offer promising perspective to probe the physics of interfaces in a 1110 broad sense. 1111

In the present work, light is shed on scalar mixing in either forced or decaying 1112 turbulence using state-of-the-art DNS data covering a large range of Reynolds 1113 and Schmidt numbers. We paid attention to the correlation between the different 1114 components of the displacement speed and the mean curvature of the interface. 1115It is shown that the tangential diffusion contribution dominates, meaning that, 1116 as a first approximation, S_d is proportional to the scalar diffusivity D and the 1117 mean curvature \mathcal{H} . This is a result of major importance which proves that there 1118 exists an intimate relation between the geometry of interface and some dynamical 1119 processes such as diffusion. Further, the geometry of the interface at a microscale 1120(i.e. at a scale r) has an influence on some macroscopic (i.e. when $r \to \infty$) 1121 processes such as the conservation of scalar iso-volumes. 1122

1123 The search for the appropriate similarity variables have shown that there 1124 exists three important characteristic length-scales for the second-order structure 1125 function of the phase indicator field.

• The first one corresponds to the inverse of the mean curvature standard deviation $\mathcal{H}_{\rm rms}^{-1}$. This scale together with $\Sigma \mathbb{K}_T$ are the similarity variables at small scales up to intermediate scales. The existence of this normalizing scale is justified by the small-scale expansion of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ (Eq. (2.17)). We also discovered that the scale beyond which a fractal scaling range starts to appear is proportional to $\mathcal{H}_{\rm rms}^{-1}$ suggesting that the inner cutoff is related $\mathcal{H}_{\rm rms}^{-1}$. It was also observed that $\mathcal{H}_{\rm rms}\eta_B$ = const. over the range of Péclet numbers investigated here. An explanation for this observation when $\mathbb{K}_T \sim \mathbb{K}_C \sim \tau_{\eta}^{-1}$ is provided. However, the

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proportionality between \mathcal{H}_{rms}^{-1} and η_B is a likely more general result which holds even at low Péclet numbers. This means that the assumption $\mathbb{K}_T \sim \mathbb{K}_C \sim \tau_{\eta}^{-1}$ is not likely to be a necessary condition.

• The second set of normalizing scales can be expressed in terms of surface 1137density Σ and volume $\langle \phi \rangle_{\mathbb{R},\mathbb{E}}$. They arise very naturally from the small-scale 1138 expansion (Eq. (2.17)) and the large scale limit of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$, respectively. It was 1139previously identified by Thiesset *et al.* (2020). These quantities are appropriate 1140for normalizing two-point statistics in the limit of either small and large scale. 1141 It was found that, for the range of ξ_0 investigated here, L_{Σ} is proportional to 1142the Corrsin length-scale, in agreement with previous analysis based on the Rice's 1143 1144theorem.

• The last set of normalizing scales is provided by R_g , the radius of gyration and the strain felt at scale R_g , viz. $\langle k \rangle^{1/2}/R_g$. These are the characteristic quantities of the large scale processes. It is found that R_g is proportional to the integral length-scale of the scalar field L_{ξ} . The local scaling exponent of $\langle \phi \rangle_{\mathbb{R},\mathbb{E}}$ was further shown to depart from a constant scaling exponent at a scale similar to R_g . Hence, the outer cutoff is related to R_g and thus L_{ξ} .

At sufficiently large R_{λ} , the distribution $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ was shown to behave 1151according to a power law in the intermediate range of scales. The corresponding 11521153scaling exponent is related to the fractal dimension that is found to be close to 8/3 in agreement with the theoretical analysis of Constantin *et al.* (1991); 1154Mandelbrot (1975); Grossmann & Lohse (1994). The fractal dimension together 1155with the inner and outer cutoff allows the surface area of the iso-scalars to be 1156estimated. Surprisingly, it was observed that this applies even at low Péclet where 1157a fractal scaling range is not likely to hold. The transfer term was also shown to 1158possess a scaling range, and we provided the value for the scaling exponent by 1159resorting to the closure proposed by de Divitiis (2014, 2016, 2020). 1160

The effect of Reynolds and Schmidt number on the different contributions of the 1161stretch rate, viz. the strain rate \mathbb{K}_T , the curvature term associated with diffusive 1162effect \mathbb{K}^d_C and the curvature term associated with the forcing \mathbb{K}^s_C is explored. It 1163is shown that in forced turbulence with an imposed mean scalar gradient, \mathbb{K}_T is 1164positive and compensated by both \mathbb{K}^d_C , which is systematically negative, and \mathbb{K}^s_C 1165whose sign depends on the iso-scalar value ξ_0 . In the limit of large R_{λ} , $\mathbb{K}_C^s \to 0$ 1166 which proves that the geometry of the interface at the smallest scales tends to be 1167independent of the type of forcing. The closure of de Divitiis (2014, 2016, 2020) 1168was also invoked to prove that \mathbb{K}_T is proportional to τ_n^{-1} . 1169

1170 Finally, we examined the scale distribution of the different terms of the scaleby-scale budget, see Eq. (2.15), for different values of R_{λ} and Sc, in either forced 1171or decaying turbulence. It was shown that the transfer term, which measures the 1172interaction between the interface and velocity field at scale r, is systematically 1173positive. This means that turbulence acts in increasing the morphological content 1174of the interface. On the other hand, the term associated with the diffusive 1175component of the displacement speed is always negative, meaning that diffusion 1176acts in counteracting turbulent straining through a so-called kinematic restoration 1177effect. Although this conclusion appears rather intuitive, it is here significantly 1178strengthened by a quantitative and analytical framework based on two-point 1179statistical equations. The last term is due to the forcing imposed by a mean 1180scalar gradient. The latter can be either positive or negative depending on the 1181 iso-scalar value. This term tends to zero in the small and intermediate range of 1182

scales when R_{λ} increases and its contribution is progressively pushed towards the 1183largest scales. This proves again that the geometry of the interface tends to be 1184independent of the type of forcing at sufficiently large R_{λ} . We also explored the 1185case of decaying turbulence, with and without the imposed scalar gradient. We 1186showed that the transfer term remains roughly independent to the iso-scalar value 1187 meaning that the different iso-scalars experience the same turbulent straining. 1188 The time-evolution of the phase indicator structure function is thus given by 1189 the balance between the S_d^d and S_d^s terms. Without the imposed mean gradient, 1190 the unsteady term was found negative meaning that both the surface density, 1191morphological content and volume are decreasing during the decay. 1192

The present work opens up attractive perspectives. First, given the amount 1193 of computational time needed to post-process this database, we have restricted 1194ourselves to a limited range of iso-scalar values. A more systematic study of the 1195evolution of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ and the different terms of the budget with respect to ξ_0 1196 is now needed. Second, we have explored the effect of Reynolds and Schmidt 1197 numbers independently. However, our database does not address the case of 1198 varying Sc and R_{λ} while keeping the Péclet number $Pe_{\lambda_{\varepsilon}}$ constant. This would 1199 allow one to conclude about the similarity of two-point statistics with respect 1200 to the Péclet number. Third, the flow configuration explored here is statistically 1201 homogeneous and hence, the scale-by-scale budgets are independent on the flow 1202 position. The next step for addressing some complex flow configurations will thus 1203 1204consist in better characterizing the effect of inhomogeneities and anisotropy.

We have focused here only on Schmidt numbers $Sc \leq 1$. For very high Schmidt 1205numbers, we expect results to be quite different. Indeed, for $Sc \gg 1$ and $R_{\lambda} \gg 1$, 1206scalar spectra are expected to reveal two distinct scaling ranges: the inertial-1207convective scaling range with an exponent close to -5/3 which extends up to the 12081209 Kolmogorov scale followed by a viscous-convective scaling range with an exponent of -1 which ends at the Batchelor scale. Consequently, for high Schmidt numbers, 1210 we expect the structure function of ϕ to reveal two distinct scaling ranges: the 1211 first with an exponent of $3 - D_{f,1}$ which corresponds to the inertial-convective 1212 range, preceded by a scaling range with an exponent $3 - D_{f,2}$ corresponding to 1213 the viscous-convective range. At very small-scales, the local scaling exponent of 12141215 $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\Omega}$ should approach 1 as shown by Eq. (2.17). Therefore, it would be of great interest in this context to measure the values for $D_{f,1}$ and $D_{f,2}$ together with 1216 their respective inner and outer cutoff length-scales using the present framework. 1217However, numerical data at high Schmidt numbers are particularly challenging 1218 to obtain since one faces numerical issues to achieve both high Reynolds (for 12191220 the inertial-convective range to establish) and high Schmidt numbers (for the diffusive-convective range to be sufficiently large). We hope that in the future, 1221such a dataset will be available so that to test the ability of the present framework 1222 to infer the scaling and the terms of the transport equation of $\langle (\delta \phi)^2 \rangle_{\mathbb{R}\mathbb{R}}$. 1223

Finally, besides turbulent mixing, the present mathematical framework should now be harnessed for giving insights into the physics of other type of interfaces such as reacting fronts, turbulent/non-turbulent layers, or two-phase flows in presence of evaporation.

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Figure 17: Graphical representation of the spatially averaged phase indicator correlation function (green) and structure function (orange) given $\phi(\boldsymbol{x})$ (blue) and $\phi(\boldsymbol{x} + \boldsymbol{r})$ (yellow).

sharing the routines allowing us to compute the surface area and curvatures 1231of iso-level-set surfaces. These are now available through the project Mercur(v)e. 1232 The authors gratefully acknowledge computing time granted by the Gauss-Center 1233 for Supercomputing (GCS) and the Juelich-Aachen Research Alliance (JARA) on 1234 the supercomputers JUQUEEN and JURECA at Juelich Supercomputing Center 1235(Germany). We are thankful to the CRIANN (Centre Régional Informatique 1236 et d'Applications Numériques de Normandie) and the GENCI TGCC Joliot 1237Curie/Irene systems (projects 2018002, 2016003 and A0092A12065) for providing 1238 us additional computation time. FT also benefited from the financial support 1239from the INSIS institute of the CNRS and the CORIA laboratory. MG received 1240financial support within the project EMCO2RE. 1241

1242 Declaration of Interests

1243 The authors report no conflict of interest.

1244 Appendix A. Interpretation of $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$ in terms of boolean operations

We here reproduce the reasoning of Thiesset *et al.* (2021) which allows interpreting $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$ in terms of boolean operations.

1247 Consider the set of points $\{x \in \mathbb{R} \mid \phi(x) = 1\}$ and its translated version at a 1248 distance r, $\{x \in \mathbb{R} \mid \phi(x + r) = 1\}$. These are displayed as the blue and yellow 1249 sets in Fig. 17. The spatially averaged correlation function $\langle \phi^+ \phi^- \rangle_{\mathbb{R}}$ then writes 1250 as the intersection (the convolution) of the sets ϕ^- and ϕ^+ , as represented by 1251 green sets in Fig. 17. Given Eq. (2.10), the spatially averaged structure function 1252 $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$ is thus given by the volume of $\phi(\boldsymbol{x})$, plus the volume of $\phi(\boldsymbol{x} + \boldsymbol{r})$, minus 1253 two times the intersection. It thus reads as the disjunctive union (or symmetric 1254 difference) of ϕ^- and ϕ^+ which is graphically represented by the orange sets in 1255 Fig. 17.

For small values of the separation vector, one sees that the orange set in Fig. 17 1256delineates the contours of the excursion set while for large scales, the disjunctive 1257union writes as twice its volume. For intermediate scales, the correlation and 1258structure function might depend on the morphology of the structures under hand. 1259Therefore, the graphical representation of $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$ in Fig. 17 allows one to easily 1260grasp that for small values of the separation $|\dot{r}|, \langle (\delta \phi)^2 \rangle_{\mathbb{R}}$ is proportional to the 1261area of the ξ_0 iso-surface, while for large scales, $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$ depends on the volume 1262 of the excursion set. For intermediate scales, $\langle (\delta \phi)^2 \rangle_{\mathbb{R}}$ becomes a morphological 1263 descriptor where the scale r plays the role of a morphological parameter. 1264

1265 Appendix B. Numerical method for computing $\langle \phi^{-}S_{d}^{+}|\nabla_{x}\phi|^{+}\rangle_{\mathbb{R}}$

The additional source term in Eq. (2.12) highlights the correlation of ϕ with 1266 $S_d | \nabla_x \phi |$. Before describing the procedure we employed for computing this term, 1267we first recall available methods to infer numerically the surface-bulk correlation 1268 $\langle \phi^- | \nabla_x \phi |^+ \rangle_{\mathbb{R}}$. One method is presented in Seaton & Glandt (1986) which is 1269also briefly described in Ma & Torquato (2018). It consists in computing the 1270 correlation function $\langle \phi_{\epsilon}^+ \phi_{\epsilon}^- \rangle_{\mathbb{R}}(r,\epsilon)$ of the fields $\phi_{\epsilon}(\boldsymbol{x})$ which denotes either the 1271dilated (when the scale $\epsilon > 0$) or eroded (when the scale $\epsilon < 0$) version of $\phi(\mathbf{x})$. 1272Here the eroded/dilated objects can simply be defined from the excursion set, i.e. 1273 $\phi(\boldsymbol{x},\epsilon) = H(\Upsilon(\boldsymbol{x})-\epsilon)$, where $\Upsilon(\boldsymbol{x})$ is the level-set field of the iso-scalar under 1274consideration. Then, the surface-bulk correlation function can be proven to be 1275equal to 1276

1277
$$\langle \phi^{-} | \boldsymbol{\nabla}_{\boldsymbol{x}} \phi |^{+} \rangle_{\mathbb{R}} = \lim_{\epsilon \to 0} \frac{1}{2} \frac{\langle \phi_{\epsilon}^{+} \phi_{\epsilon}^{-} \rangle_{\mathbb{R}}(r, \epsilon)}{\epsilon}$$
(B1)

1278 Numerically, this translates into

1279
$$\langle \phi^{-} | \boldsymbol{\nabla}_{\boldsymbol{x}} \phi |^{+} \rangle_{\mathbb{R}} = \frac{\langle \phi_{\epsilon}^{+} \phi_{\epsilon}^{-} \rangle_{\mathbb{R}}(r,\epsilon) - \langle \phi_{\epsilon}^{+} \phi_{\epsilon}^{-} \rangle_{\mathbb{R}}(r,-\epsilon)}{4\epsilon}, \qquad (B2)$$

1280 where ϵ should be chosen sufficiently small for the eroded/dilated sets remain 1281 topologically equivalent to the actual set. In practice, we found that when ϵ 1282 remains in the range $2dx \leq \epsilon \leq 4dx$, results are very similar and the surface-bulk 1283 correlation function is in very good agreement with the theoretical limits at large 1284 and small scales.

1285 The method for computing $\langle \phi^- S_d^+ | \nabla_x \phi |^+ \rangle_{\mathbb{R}}$ is somehow similar. It relies on 1286 the idea that one can define a local dilatation/erosion scale that depends on local 1287 values of S_d . At a fictive time $t + \tau$, the level-set field will be given by $\Upsilon(x, \tau) + S_d \tau$ 1288 while the one obtained at time $t - \tau$ is $\Upsilon(x, -\tau) - S_d \tau$. $S_d \tau$ plays here the same 1289 role as ϵ which thus corresponds to the special case where $S_d = \text{const.}$ Then, one 1290 can compute $\langle \phi^- S_d^+ | \nabla_x \phi |^+ \rangle_{\mathbb{R}}$ as

1291
$$\langle \phi^{-}S_{d}^{+} | \boldsymbol{\nabla}_{\boldsymbol{x}} \phi |^{+} \rangle_{\mathbb{R}} = \lim_{\tau \to 0} \frac{1}{2} \frac{\langle \phi_{\tau}^{+} \phi_{\tau}^{-} \rangle_{\mathbb{R}}(r,\tau)}{\tau}$$
(B3)



Figure 18: (a) Comparison of the spatially and angularly averaged S_d^i -terms for different values of τ , from max $|S_d|\tau = 1$ to max $|S_d|\tau = 4dx$. Case F0 $Sc = 1.0, \xi_0 = 0$. (b) Spatially and angularly averaged S_d^i -term as estimated from the level-set or its approximation using Eq. (B 5). Case T0

Sc = 1.0, $\xi_0 = \xi_{\rm rms}$. In (a) and (b), the S_d^i -terms are normalized by \mathbb{K}_T and the grey dotted lines represent the theoretical asymptotic limits at large and small scales.

1292 or numerically

1293

$$\langle \phi^{-} S_{d}^{+} | \boldsymbol{\nabla}_{\boldsymbol{x}} \phi |^{+} \rangle_{\mathbb{R}} = \frac{\langle \phi_{\tau}^{+} \phi_{\tau}^{-} \rangle_{\mathbb{R}} (r, \tau) - \langle \phi_{\tau}^{+} \phi_{\tau}^{-} \rangle_{\mathbb{R}} (r, -\tau)}{4\tau} \tag{B4}$$

where $\phi_{\tau}(\boldsymbol{x}) = H(\boldsymbol{\Upsilon}(\boldsymbol{x}) - S_d \tau)$. Here again, τ should be chosen sufficiently small 1294for the dilated/eroded system to remain topologically equivalent to the original 1295 set. Elaborating on the same reasoning as for ϵ , we have chosen τ in such a way 12961297 that $\max(|S_d|\tau)$ remains of few dx. Fig. 18(a) displays the S_d -term for different values of $\max(|S_d|\tau)$ ranging from 1 to 4dx. We considered the forced turbulence, 1298forced scalar case (F0-Sc = 1.0) for which S_d is constituted of both a diffusion 1299 component S_d^d and a source component S_d^s . Results show that the computed 1300 S_d -term is identical irrespective of the chosen value for τ . They also follow the 1301expected asymptotic limit at small scales. Throughout the present study, we have 1302 chosen max($|S_d|\tau$) = 3dx. 1303

1304 Instead of the level-set function Υ , whose computation from our data might be 1305 particularly expensive, we have used the following approximation of the level-set 1306 in the vicinity of ξ_0 :

1307
$$\Upsilon(\boldsymbol{x}) = \frac{\xi(\boldsymbol{x}) - \xi_0}{|\boldsymbol{\nabla}_{\boldsymbol{x}}\xi|(\boldsymbol{x})}$$
(B5)

We have compared the results obtained for the S_d -term by using a level-set field or the ansatz given by Eq. (B 5). The level-set field is computed from the scalar field ξ by use of the reinitialization procedure of Sussman *et al.* (1994). We start with Eq. (B 5) as an initial condition and the algorithm was run over a sufficiently large number of iterations for the level-set to be a signed distance over the whole domain. The reinitialization procedure was solved using the two-phase flow solver archer (Ménard *et al.* 2007).

Results are presented in Fig. 18(b) where the S_d -term estimated either from the level-set or its approximation (Eq. (B 5)) are compared. Here we consider the T0 dataset where there is no forcing for either the dynamical or scalar field.



Figure 19: Comparison of the different terms of Eq. (2.15) using either a full (lines) or partial angular average (symbols). (a) F0 Sc = 1.0, $\xi_0 = 0$. (b) T0.

1318 No noticeable differences are observed, and both curves compare well with the 1319 asymptotic theoretical limits at either large and small scales. This proves that 1320 our method for computing $\langle \phi^- S_d^+ | \nabla_x \phi |^+ \rangle_{\mathbb{R}}$ either from the real or approximated 1321 level-set is accurate.

1322 Appendix C. Validation of the partial angular average

We checked that results obtained by operating a partial angular average over only the three directions r_x, r_y, r_z were similar to the ones issued from the full 3D angular average. We considered here the case F0, Sc = 1.0, $\xi_0 = 0$ (Fig. 19(a)) and the T0 case (Fig. 19(b)).

A careful analysis of Fig. 19 reveals that the budget is accurately closed even 1327if one employs the partial angular average. Some very slight differences are 1328perceptible which are due to a small anisotropy. Note that, in absence of mean 1329scalar gradient, the anisotropy should be interpreted as a statistical effect. Indeed, 1330 the number of structures formed by the scalar excursion set $\xi(\boldsymbol{x}) > \xi_0$ is typically 1331 around 50-100 which might not be enough for the two-point statistics of iso-13321333 volumes to be fully converged. Increasing the number of independent simulations will very likely improve the statistical convergence and the degree of isotropy (a 1334similar situation was encountered in Thiesset *et al.* (2020)). This effect is however 1335considered to be marginal in the present analysis. The small values of the budget 1336residuals shown in Fig. 19 is a further evidence of the appropriateness of our post-1337 processing procedure for computing the triple correlation $\langle \phi^- S_d^+ | \nabla_x \phi |^+ \rangle_{\mathbb{R}}$. The 1338 transfer and unsteady term also compare favorably well with their asymptotic 1339 theoretical expressions at small and large scales. To conclude Fig. 19 provides 1340 the validation of altogether the theory (Eq. (2.15)), the DNS data and the post-1341processing procedures. 1342

1343 Appendix D. Large-scale similarity

1344 Here, we present the appropriate normalization of two-point statistics in the 1345 large-scale limit.

In Fig. 20, the second-order structure function $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ is normalized by its asymptotic large-scale value $2\langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}})$ while the separation r is normalized using the radius of gyration R_q . We observe that the different curves



Figure 20: Evolution of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega} / 2 \langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}})$ with increasing R_{λ} . The scale r is normalized by R_g . The local scaling exponent is also plotted in the inset. (a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\rm rms}$.



Figure 21: Evolution of the transfer term $-\langle \nabla_{\boldsymbol{r}} \cdot \langle (\delta \boldsymbol{u}) (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R}} \rangle_{\Omega}$ normalized by $2\langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}}) \langle k \rangle_{\mathbb{E},\mathbb{R}}^{1/2} / R_g$ with increasing R_{λ} . The local scaling exponent is also plotted in the inset. (a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\rm rms}$.

1349 corresponding to the different R_{λ} collapse well for scales above $r = 0.1R_g$. When 1350 R_{λ} increases, the scale distributions widen when R_{λ} increases and moves towards 1351 the small scales. It is further worth noting that the fractal scaling ends at a scale 1352 $r \approx R_g$ which means that R_g plays the role of the outer cutoff of the fractal 1353 scaling.

We also carried out the same analysis for the transfer term $-\langle \nabla_r \cdot \langle (\delta u)(\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R}} \rangle_{\Omega}$ which is normalized using $2\langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}}) \langle k \rangle_{\mathbb{E},\mathbb{R}}^{1/2} / R_g$. This quantity can be understood as the strain acting at a scale R_g . In Fig. 21, we observe that this normalization leads to a good collapse of the different curves in the large scales $r > 0.1R_g$. For smaller scales, the different curves depart from each other and as R_{λ} increases, the transfer rate term acts over a wider range of scales while its peak value moves towards smaller scales.

1361 The different terms of the budget Eq. (2.15), normalized by the same quantities



Figure 22: Budget of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ with increasing R_{λ} . Full lines: transfer term, dashed lines: S_d^d -term, dash-dotted lines: S_d^s -term. All contributions are normalized by $2\langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}}) \langle k \rangle_{\mathbb{E},\mathbb{R}}^{1/2} / R_g$. (a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\text{rms}}$.



Figure 23: Budget of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ with varying *Sc*. Full lines: transfer term, dashed lines: S_d^d -term, dash-dotted lines: S_d^s -term. All contributions are normalized by $2\langle \phi \rangle_{\mathbb{E},\mathbb{R}} (1 - \langle \phi \rangle_{\mathbb{E},\mathbb{R}}) \langle k \rangle_{\mathbb{E},\mathbb{R}}^{1/2} / R_g$. (a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\rm rms}$.

obey the same trend, i.e. the different curves collapse relatively well for scales larger than $0.1R_g$ and move towards smaller scales when R_{λ} is increased.

We also plot the budget for different Schmidt numbers in Fig. 23 using the 1364large-scale similarity variables. Noticeable is the shift of the transfer term towards 1365smaller r/R_q when the Schmidt number increases from 0.1 to 1.0. In contrast, 1366the diffusive term moves towards larger scales and increases in amplitude. A final 1367observation of Fig. 23 is that, for $\xi_0 = \xi_{\rm rms}$, the forcing term due to the mean 1368scalar gradient increases when Sc decreases from 1.0 to 0.1. For $\xi_0 = 0$, the budget 13691370 for Sc = 0.1 is composed of the transfer term and diffusive term while the forcing term is almost negligible. 1371



Figure 24: Evolution of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega} / \Sigma \mathcal{H}_{\mathrm{rms}}^{-1}$ with increasing R_{λ} . The scale r is normalized by $\mathcal{H}_{\mathrm{rms}}^{-1}$. The local scaling exponent is also plotted in the inset. (a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\mathrm{rms}}$. The gray dash-dotted lines denote the Batchelor type parametrization given by Eq. (E 1)

1372 Appendix E. Small-scale similarity

We here report the evolution of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega} / \Sigma \mathcal{H}_{\mathrm{rms}}^{-1}$ with increasing R_{λ} while the separation r is normalized by $\mathcal{H}_{\mathrm{rms}}^{-1}$. This scenario is tested in Fig. 24, where one observes a remarkable degree of similarity for both $\xi_0 = 0$ and $\xi_0 = \xi_{\mathrm{rms}}$. The range of scales over which this small scale similarity applies tends to increase with increasing R_{λ} . It is further worth noting that the fractal scaling starts at a scale $r \approx 20\mathcal{H}_{\mathrm{rms}}^{-1}$ (see the inset in Fig. 24). Hence, $\mathcal{H}_{\mathrm{rms}}^{-1}$ appears to be proportional the inner cutoff of the fractal scaling.

We have observed that $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ can be well represented by the following parametric expression

$$\frac{\langle (\delta\phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}}{\Sigma \mathcal{H}_{\rm rms}^{-1}} = \frac{\tilde{r}}{2} \frac{\left[1 + \left(\frac{\tilde{r}}{\tilde{\eta_i}}\right)^2\right]^{(\zeta-1)/2}}{\left[1 + \left(\frac{\tilde{r}}{\tilde{\eta_o}}\right)^2\right]^{\zeta/2}} \tag{E1}$$

where $\tilde{\bullet} = \bullet / \mathcal{H}_{rms}^{-1}$. This parametrization is inspired by the one proposed by 1383 1384Batchelor (1951) for representing the two-point statistics of the velocity field. The main interest in deriving Eq. (E1) is that it allows the fractal exponent ζ , 1385the outer and inner cutoff η_o and η_i to be estimated using non-linear least-square 1386curve fitting. By doing so, these parameters are gathered in an unambiguous way 1387which does not imply any degree of arbitrariness, notably in the estimation of the 1388 best range of scaling. This is even more relevant for low to moderate Reynolds 1389numbers. A similar approach was employed by Thiesset et al. (2016a); Krug et al. 1390 (2017). The appropriateness of this parametric expression is demonstrated in Fig. 139124 at the largest and smallest Reynolds numbers. We obtain $\eta_i \approx 10\eta_B$ which is 1392in close agreement with the prediction of Thiesset *et al.* (2016b). 1393

1394 The small-scale similarity is now tested for the transfer term $\langle \nabla_r \cdot 1395 \langle (\delta u)(\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R}} \rangle_{\Omega}$ which is normalized by $\mathbb{K}_T \Sigma \mathcal{H}_{\mathrm{rms}}^{-1}$ while r is divided by $\mathcal{H}_{\mathrm{rms}}^{-1}$. 1396 Results are presented in Fig. 25 confirming this small-scale similarity for both

1382



Figure 25: Evolution of the transfer term $-\langle \nabla_{\mathbf{r}} \cdot \langle (\delta \mathbf{u}) (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R}} \rangle_{\Omega}$ normalized by $\mathbb{K}_T \Sigma \mathcal{H}_{\mathrm{rms}}^{-1}$ while r is divided by $\mathcal{H}_{\mathrm{rms}}^{-1}$. Dark to light represent F0 to F5. The local scaling exponent is also plotted in the inset. (a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\rm rms}$.



Figure 26: Budget of $\langle (\delta \phi)^2 \rangle_{\mathbb{E},\mathbb{R},\Omega}$ with increasing R_{λ} . Full lines: transfer term, dashed lines: S_d^d -term, dash-dotted lines: S_d^s -term. All contributions are normalized by $\mathbb{K}_T \Sigma \mathcal{H}_{\rm rms}^{-1}$ while r is divided by $\mathcal{H}_{\rm rms}^{-1}$. (a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\rm rms}$.

 $\xi_0 = 0$ and $\xi_0 = \xi_{\rm rms}$. In particular, we note that it applies, at least up to the 1397scale where the transfer term is maximum, and the range of scales over which 1398 the small scale similarity applies widens with increasing R_{λ} . The maximum of the transfer term given in terms of $\mathbb{K}_T \Sigma \mathcal{H}_{\text{rms}}^{-1}$ is roughly constant and equals to 1399 1400 0.38.1401

The different terms of the budget Eq. (2.15) normalized using the small-1402 similarity variables are presented in Fig. 26. Here again, we see that the transfer 1403 term complies well with a small-scale similarity when plotted using $\mathbb{K}_T \Sigma \mathcal{H}_{rms}^{-1}$ and 1404 $\mathcal{H}_{\rm rms}^{-1}$ as similarity variables. However, the similarity holds only at the smallest 1405scales for the S_d^d -term, where the term associated with S_d^s is negligible. When R_{λ} 1406increases, this term progressively tends to zero thereby leading to a closer degree 1407 of similarity for the S_d^d -term. In conclusion, \mathcal{H}_{rms}^{-1} and $\mathbb{K}_T \Sigma / \mathcal{H}_{rms}$ play the same role as the Kolmogorov (or 1408

1409



Figure 27: Anisotropy of $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E}}$ between the direction parallel (full lines) and perpendicular (dashed lines) to the mean scalar gradient. The insets represent the local scaling exponent. For the sake of clarity only case F1, F3 and F5 are presented. (a) $\xi_0 = 0$, (b) $\xi_0 = \xi_{\rm rms}$. The small scale similarity variables have been used for normalization.

1410 Batchelor) scales for normalizing the two-point statistics of the velocity (scalar) 1411 field.

1412 Appendix F. Anisotropy effects due to the mean scalar gradient

1413 The present numerical configuration leads to statistical anisotropy due to the 1414 presence of a mean scalar gradient G_{ξ} . Since the latter is active in the *y* direction, 1415 two-point statistics are invariant by rotation around the r_y axis. Here, we infer 1416 anisotropy from the variations of $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E}}$ along the different orientations of the 1417 separation vector \mathbf{r} .

In Fig. 27, we plot $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E}}$ along the direction parallel and perpendicular 1418 to the mean scalar gradient. The parallel direction corresponds to r_{μ} while the 1419contributions along r_x and r_z were averaged because of axisymmetry. We observe 1420 that the curves corresponding to the parallel and perpendicular directions collapse 1421at small up to intermediate scales, meaning that the second-order statistics of ϕ 1422are locally isotropic. The previously discussed scaling with respect to $\mathcal{H}_{\rm rms}$ (and 1423 Σ) holds. The scaling exponent remains the same irrespective of the orientation of 1424the separation vector \mathbf{r} . This means that the estimation of the fractal dimension 1425of the present iso-scalar surfaces is quite robust and is not affected by the mean 1426scalar gradient. Differences between parallel and perpendicular directions (viz. 1427 1428 anisotropy) are perceptible only at the end of the scaling range and at large scales. It is seen that the scaling range is systematically wider in the direction 1429perpendicular to the mean scalar gradient. 1430

1431 Appendix G. Estimation of statistical errors

1432 We here address the question of statistical errors. We attribute such errors to a 1433 lack of statistical convergence. For the forced turbulence cases explored here, any 1434 spatially averaged quantity $\langle \bullet \rangle_{\mathbb{R}}$ is also averaged over M independent snapshots 1435 which constitute our ensemble \mathbb{E} .



Figure 28: Statistical errors for case F5. Error bars for each quantity $\langle \bullet \rangle_{\mathbb{R},\mathbb{E}}$ correspond to $\bullet_{\mathrm{rms}}/\sqrt{M}$. (a) $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E}}$ and its local scaling exponent (inset), (b) the different terms of the budget.

1436 The statistical error on the calculation of the mean $\langle \bullet \rangle_{\mathbb{R},\mathbb{E}}$ is then computed 1437 from $\bullet_{\mathrm{rms}}/\sqrt{M}$ where \bullet_{rms} is the standard deviation computed from M snapshots. 1438 We repeated this for $\langle (\delta \phi^2) \rangle_{\mathbb{R}}$, its scaling exponent, and the different terms of its 1439 transport equation.

1440 Case F5 is the most prone to numerical errors since it is the one for which we 1441 dispose of the smallest number of snapshots (M = 6, see Table 1). Hence, we 1442 infer errors for this particular case only.

1443 Statistical errors are displayed in Fig. 28 as the blue error-bars while the mean 1444 value $\langle \bullet \rangle_{\mathbb{E},\mathbb{R}}$ is plotted as the green curves. We observe that these errors are 1445 particularly small. The typical statistical errors on each of the plotted quantities 1446 are 1-2% for $\langle (\delta \phi)^2 \rangle_{\mathbb{R},\mathbb{E}}$ and its scaling exponent, and 3-4% for the terms of 1447 its transport equation. For the other forced cases (F0-F4), statistical errors are 1448 expected to be smaller. It is thus rather safe to conclude that statistical errors 1449 are marginal in our study.

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