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Validation strategy of reduced-order two-fluid flow models based on a hierarchy of direct numerical simulations

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Abstract

Whereas direct numerical simulation (DNS) have reached a high level of description in the field of atomization processes, they are not yet able to cope with industrial needs since they lack resolution and are too costly. Predictive simulations relying on reduced order modeling have become mandatory for applications ranging from cryotechnic to aeronautic combustion chamber liquid injection. Two-fluid models provide a good basis in order to conduct such simulations, even if recent advances allow to refine subscale modeling using geometrical variables in order to reach a unified model including separate phases and disperse phase descriptions based on high order moment methods. Such models must be resolved using dedicated numerical methods and still lack assessment of their predictive capabilities. The present paper constitutes a building block of the investigation of a hierarchy of test-cases designed to be amenable to DNS while close enough to industrial configurations, for which we propose a comparison of two-fluid compressible simulations with DNS data-bases. We focus in the present contribution on an air-assisted water atomization using a planar liquid sheet injector. Qualitative and quantitative comparisons with DNS allow us to study strength and weaknesses of the reduced-order modeling and numerical approach in this specific configuration and set a framework for more refined models since they already provide a very interesting level of comparison on averaged quantities.

Introduction

Engines safety and efficiency are two of the main priorities given to the aeronautical and space industries. In the combustion chamber, the multi-scale and multi-physics phenomena are very complex and their interaction still animate the research domain. The primary atomization plays a crucial part in the way the engines work, thus must be thoroughly studied to understand its impact on high frequencies instabilities and on the generation of droplets evaporating and eventually reacting with the gaseous flow field. The former have been encountered in the past and can lead to critical damages of rockets and while the latter is nowadays a key concern in the aeronautic industry since facing strong restrictions from the International Civil Aviation Organization norms [1]. Even though experimentations must be conducted to enable simulation validation and to understand the observed physical phenomena, predictive numerical simulations are mandatory, at least as a complementary tool to understand the physics but even more to conceive new combustion chambers and predict instabilities and droplet distributions they may generate in a given configuration.

In sub-critical condition, downside an air-assisted coaxial injector, three two-phase flow topologies are to be found: at the injector exit, the two phases are separated by a smooth interface. Downstream a polydisperse spray of droplets is

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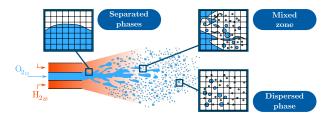


Fig. 1: Description of the various regimes and flow topologies in jet atomization for cryotechnic injectors in subcritical conditions.

carried by the gaseous phase. In between, shear stress caused by strong velocity gradients tears the liquid core apart and ligaments are formed. This process is called primary atomization. The ligaments get thinner and thinner until they break into droplets during the secondary atomization process. In this *mixed region*, the subscale physics and the topology of the flow are very complex. The typical range of flow numbers in sub-critical cryogenic cylindrical jet in real configuration are, for the liquid Reynolds number, $Re_L = 1.0e5$, for the hydrodynamic Weber number, $We_H = 1.0e5$. In the aeronautical simplex atomizers employed on mid-range engines, the typical liquid Reynolds number of the liquid sheet flowing out from the atomizer is of the order of $Re_L = 1.0e3$, while the hydrodynamic Weber number is $We_H = 10 - 100$. Experimental test benches such as for cryogenic combustion, Mascotte operated by the French Aerospace Lab (ONERA), offer some experimental data but usually at lower flow numbers and are very costly in time and very expensive to operate and to instrument. As a result, numerical simulations are adequate to increase our understanding of the physics and perform early-stage optimizations, thus accelerating developments while reducing the costs.

Direct numerical simulations (DNS) in real configuration of such engines are still out of reach, CPU needs being too high due to the high Reynolds and Weber numbers. Therefore predictive numerical tools using reduced-order models must be developed. However great care must be taken on the choices of these models in order to both have solid mathematics properties and to lead to predictive simulations after a validation process.

The strategy retained at ONERA is to perform numerical simulations of the primary atomization from the injection to the combustion of the spray by coupling reduced-order models. One leading course of action consists in coupling Eulerian models, more specifically Kinetic-Based-Moment Methods (KBMM) to describe the disperse flow (see [2, 3, 4]) and diffuse interface models (DIM) to reproduce the separated phases and the *mixed region*. These models are implemented in the industrial CFD code CEDRE [5]. While the predictiveness of KBMM solvers in dispersed flow have already been demonstrated, it is not yet the case for the diffuse interface models (DIM) which are meant to handle the challenging *mixed region*.

Among the hierarchy of DIM, well-known models such as the multi-species compressible Navier-Stokes, referred as the four equation model have been massively adopted in the industry [6] but have shown their limitations as they neglect the fluids thermodynamics disequilibrium in the mixing zones. Therefore, recent efforts have been done to increase the disequilibrium description of the phases by implementing and testing the so-called five equation model [7] accounting for two temperatures [8] or even the Baer-Nunziato model [9], also called seven equation model, whereby two temperatures, two pressures and two velocities are solved. Stemming from rational thermodynamics or Least Action Principle, the complexity of these models are three-folds: 1) the macroscopic set of equations of these models often include non-conservative terms, 2) these models can not be derived from physics at small scale of interface dynamics, thus require closure of interfacial quantities such as the interfacial velocity or the interfacial pressure, 3) the thermodynamics has to be postulated and requires assumptions. The mathematical properties of the Baer-Nunziato model have been studied by [10, 11, 12] among others and many closure have been proposed for the interfacial terms based on wave-type considerations and the entropy inequality. In [13], a theoretical framework for the derivation of supplementary conservation laws for systems of partial differential equation including first-order non-conservative terms has been proposed, thus extending the Godunov-Mock standard approach for systems of conservation laws [14, 15]. The theory has brought about entropy supplementary conservative equations together with constraints on the interfacial quantities and the definition of the thermodynamics for non-miscible fluids and also when accounting for some level of mixing of the two phases. Nonetheless, this study has also emphasized the risk of inconsistency between the system and the associated postulated thermodynamics when accounting for non-ideal effects. Indeed most multi-fluids thermodynamics approaches are based on the assumption of no interactions between the fluids, resulting in equipping each fluid with its own thermodynamics and then defining mixing thermodynamics quantities by taken arithmetic average of each phase contribution. However in many industrial configurations, such as in jet atomizations, the fluids face non-ideal effects such as compaction or surface tension, questioning the validity of having an isolated phase thermodynamics approach. In [16], the authors propose to build a multi-fluid thermo-dynamics starting from a single fundamental thermodynamics differential equation of the mixture and a set of pressure laws. The derivation exhibits a natural decomposition of thermodynamics quantities into an isolated phase contribution and mixing terms, expressed in terms of the stated pressure laws. Thus, given any pressure law including non-ideal effects, the method yields the consistent thermodynamics variables as well as the associated extended system of equations. A strongly connected question for such systems is the ability to derive an entropic symmetrization in the sense of Godunov-Mock and the related constraints on the decomposition, as well as the study of the spectrum and hyperbolicity. The proposed framework introduced in [13] allows to shed some light on these questions. Nevertheless, in the case of Baer-Nunziato model, the lack of strict convexity of the proposed entropies prevents its Godunov-Mock symmetrization. Based on the new developments in [16], we envision equipping the Baer-Nunziato system with an extended thermodynamics closure will lead to a strictly convex entropy and thus to its symmetrization in the sense of Godunov-Mock. This is the subject of current research. Besides, next generation two-phase flow models adding sub-scale effects emerge [17, 18] and add again some mathematical challenges.

As a result, while the mathematical properties of these Eulerian models are still under current investigation, even the most basic element of the hierarchy of models, that is the Bear-Nunziato model, gives rise to numerical challenges. The applications we are seeking are characterized by strong gradients and discontinuities, thus need also to be assessed numerically to highlight their promising predictiveness before being widely deployed in the industry. We thus focus on the Bear-Nunziato *seven equation model* in this study, which will constitute a very good first candidate for reduced-order simulations and numerical strategy before tackling more recent and refined models.

Therefore, a hierarchy of specific test cases aiming at reproducing real engine configurations has been selected and reproduced with DNS in order to build an assessment tool to validate sophisticated reduced-order models such as *seven equation model*. In [19], we have started with an air-assisted water atomization using a coaxial injector, which in addition provides experimental results from the LEGI test bench. The comparison has shown good agreements in terms of liquid core length and important CPU gains between the *seven equation model* implemented in the CEDRE code and the DNS results obtained with the ARCHER code. It has also shown the limits of diffuse interface models to capture complex liquid structures such as ligaments, rings or deformed droplets and encourages to add a sub-scale description of the interface dynamics through geometric variables such as the interfacial area density, the mean and Gaussian curvatures as proposed in [18].

In the present work, we carry on the construction of a hierarchy of DNS test-cases to validate this reduced-order DIM. We propose a complementary second test case, an air-assisted water atomization using this time a planar injector rather than a co-axial injector. This planar injector reproduces in terms of Weber and Reynolds number the liquid sheet flowing out a swirling atomizer used in agricultural applications [20], $Re_L = 1.5e3$ and $We_R = 4.0e2$ and p = 1bar. The Reynolds and Weber numbers are also typical from the mid-range aeronautical engines. As analyzed in the present contribution, this test case offers also an atomization regime, which makes it complementary with the first test case in order to eventually validate our reduced-order models on a cryogenic coaxial injection.

This paper is organized as followed. In the first Section 1, we introduce the mathematical properties of the reducedorder model and the model used for the DNS. Then in Section 2, the numerical methods implemented in the two codes, CEDRE and ARCHER are presented. In Section 3, the investigated configuration is described. Finally in Section 4, we present the results obtained in both simulations and provide a qualitative and quantitative comparisons. We finally conclude on the reduced order model assessment.

1 Mathematical modelling

At the top of the hierarchy of diffuse interface models [21] stands the Baer-Nunziato model [9], also called the *seven* equation model, accounting for full disequilibrium of the phases. This first-order non-linear non-conservative system of partial differential equations is composed of a mass, momentum and energy equation for each phase and a seventh equation on the volume fraction α to reconstruct the interface. The extended form proposed in [22] introduces an interfacial pressure, $p_{\rm I}$, and an interfacial velocity, $v_{\rm I}$, that need to be closed. From this seven-equation model, the instantaneous relaxation of the pressures and the velocities leads to the *five-equation* model [7] and relaxing also instantaneously the temperatures, one obtains the compressible multi-species Navier-Stokes equations referred as the *four-equation* model. These three models define a hierarchy of diffuse interface model and each of them are hyperbolic and appropriate for reactive two-phase flow or interface problems.

In cryogenic applications, the pressure of the phases may be considered to relax instantaneously, but due to the strong velocity and temperature gradients at the interface, it is unrealistic to assume hydrodynamic and thermal instantaneous relaxations. Whereas single velocity models are sufficient in the separated zone with an adapted resolution mesh, it is not the case in the mixed region and thus fail at predicting the atomization process. Therefore the Baer-Nunziato model appears as the best two-velocity model candidate for the present study.

Nonetheless, stemming from rational thermodynamics, the macroscopic set of equations can not be derived from physics at small scale of interface dynamics and thus require closure of interfacial pressure and velocity as well as to postulate the thermodynamics. The theory on the existence of a supplementary conservative equation to first-order order system of partial differential equation including non-conservative terms [13] has brought about supplementary

conservative equations together with constraints on the interfacial quantities and the definition of the thermodynamics of the mixture. In the present work, we use a non-miscible fluid thermodynamics, where the mixture entropy is defined by the mass averaged sum of the phasic entropies with no mixing effect, together with a closure proposed in [23] obtained through a discrete element method approach [24]. To the convection part described in [23], where no surface tension is accounted for, we let the two phases relax towards an equilibrium state thanks to sources terms. Only mechanical and hydrodynamic relaxations are accounted for in the present study. They are modeled as in [23] through a pressure difference term and a drag term. Each term is driven by a characteristic time, which can be either finite to account for disequilibrium, or in the limit of a zero characteristic time, to account for an instantaneous relaxation and thus making any disequilibrium disappear. As described in next Section 2, we have used an instantaneous pressure relaxation but a finite velocity relaxation.

The direct numerical simulation solves the incompressible Navier-Stokes equations and takes into account surface tension. Then, the interface is implicitly derived by the zero of a Level Set of a scalar function and its motion is captured by the transport of the Level Set function at the hydrodynamic speed, combined with a projection technique [25]. To guarantee the conservation of mass, we also transport the volume-of-fluid function (VOF), defined as the liquid volume fraction expressed in terms of the level set function. The benefits of a VOF formulation coupled with a Level Set function are to conserve mass and to have access to geometrical properties of the interface.

2 Numerical methods

2.1 CEDRE Solver

The numerical methods employed to solve the Baer-Nunziato model are implemented in the multiphysics computational fluid dynamics software CEDRE [5] working on general unstructured meshes and organized as a set of solver [5] developed at the french aerospace lab ONERA. The solver *SEQUOIA* is in charge of the diffuse interface model.

A Strang splitting technique is applied on a multi-slope HLLC with hybrid limiter solver [23, 26] to achieve a time-space second-order accuracy on the discretized equations. The issue encountered when discretizing the non-conservative terms is tackled in [23] by assuming (1) the interfacial quantities p_I and v_I to be local constants in the Riemann problem, (2) the volume fraction to vary only across the interfacial contact discontinuity v_I . As a result, the non conservative terms vanish, v_I and p_I are determined locally by Discrete Equation Method (DEM) [24] at each time step and stay constant during the update. Thus, phases are decoupled, the system splits into two conservative sub-systems to which we apply the multi-slope HLLC with hybrid limiter solver.

Depending on the application, the relaxations are assumed either instantaneous or finite in time. In the present test case, it is reasonable to assume a instantaneous pressure relaxation but one need to consider a finite velocity relaxation since the interface dynamic is mainly driven by the shear stress induced by a high velocity difference between the phases at the injection.

To obtain the relaxed pressure, one needs to solve a simple ordinary differential equation (ODE). Since the characteristic time is taken to be infinitely small, the problem reduces to apply an iterative procedure as a Newton method to solve a second order equation and obtained a single equilibrium pressure. Detailed of the equation can be found in [23]. As for the velocities, since we want to account for finite relaxation time, the associated ODE takes the form:

$$\partial_t \vec{v_d} - \frac{A^o}{\varepsilon_v} \vec{v_d} = 0, \text{ with } A^o = \frac{\rho^o}{\alpha_l^o \rho_l^o \alpha_o^o \rho_o^o}, \tag{1}$$

where $\vec{v_d}$ is the slip velocity vector, ε_v is the characteristic relaxation time, superscript o denotes the state before relaxation, α_k , ρ_k denote respectively the volume fraction and the partial density of the liquid phase, k = l, and the gas phase, k = g, and ρ is the mixture density, $\rho = \alpha_l \rho_l + \alpha_2 \rho_g$. A first numerical approach is to fix a remaining slip velocity ratio target at each computational time step Δt . It defines the characteristic relaxing time as

$$\frac{\varepsilon_{\nu}}{A^{o}} = \ln\left(\frac{v_{d}(\Delta t)}{v_{d}^{o}}\right) \Delta t. \tag{2}$$

An instantaneous velocity relaxation is in practice also possible and manipulating the ODE leads to a unique relaxed velocity, which is the mass weighted average of the two velocities before relaxing. In the present simulation, we have however been using the finite velocity relaxation.

2.2 ARCHER Solver

As for the DNS, we have used the High-Performance-Computing code ARCHER developed at the CORIA laboratory. It was one of the first code worldwide, undertaking the simulation of liquid-jet atomization under a realistic diesel injection configuration [27]. It solves on a Cartesian mesh the one-fluid formulation of the incompressible Navier-Stokes equation, viz.

$$\partial_t(\rho \vec{v}) + \nabla \cdot (\rho \vec{v} \otimes \vec{v}) = -\nabla p + \nabla \cdot (2\mu \vec{D}) + \vec{f} + \gamma H \delta_s \vec{n}$$
(3)

where \vec{v} is the hydrodynamical velocity vector, p is the pressure field, \vec{D} the strain rate tensor, f a source term, μ the dynamic viscosity, p the density, p the surface tension, p the unit normal vector to the liquid-gas interface, p its mean curvature and p is the Dirac function characterizing the locations of the liquid gas interface. For solving Equation (3), the convective term is written in conservative form and solved using the improved Rudman technique presented in Vaudor2017. The latter allows mass and momentum to be transported in a consistent manner thereby enabling flows with large liquid/gas density ratios to be simulated accurately. The viscosity term is computed following the method presented by [28]. To ensure incompressibility of the velocity field, a Poisson equation is solved. The latter is solved using a MultiGrid preconditioned Conjugate Gradient algorithm (MGCG) [29] coupled with a Ghost-Fluid method [30] to take into account the pressure jump due to the presence of surface tension.

For transporting the interface, use is made of a coupled Level Set and volume-of-fluid (CLSVOF) solver, in which the Level Set function accurately describes the geometric features of the interface (its normal and curvature) and the VOF function ensures mass conservation. The mixture density is calculated from the VOF (or liquid volume fraction) as $\rho = \rho_l \alpha_l + \rho_g (1 - \alpha_l)$. The dynamic viscosity used (μ_l or μ_g) depends on the sign of the Level Set function. In mixed cells, a specific treatment is performed to evaluate the dynamic viscosity, following the procedure of [28]. The temporal integration is performed through a second-order Runge-Kutta scheme. For more information about the ARCHER solver, the reader can refer to e.g. [27, 31, 32, 33].

3 Description of the configuration

To attest the reduced-order model introduced in Section 1 with direct numerical simulation, we propose the study of the atomization of an air-assisted flat liquid sheet at high Reynolds and Weber number. The reason for choosing this test case are two folds: first it makes a complementary test case to the air-assisted coaxial atomization analyzed in [19] in terms of injection type while still offering an atomized regime, second while the Reynolds and Weber numbers are farther away from cryogenic applications, they still are typical from the mid-range aeronautical engines.

3.1 Air-assisted liquid sheet atomization

Atomization of air-assisted flat liquid sheets have been widely experimentally investigated such as in [34, 35] and [36]. The behavior of such flow is mainly driven by several parameters. The ratio of the norm of the gas velocity and the liquid velocity, v_g/v_l , and the momentum flux ratio M are predominant to determine the breakup regime. Then the width of liquid injection, d_l and the relative gaseous Weber number, W_R , influence also the breakup length, the breakup frequency and the liquid sheet vibrating frequency [36]. M and W_R are defined as:

$$M = \frac{\rho_g v_g^2}{\rho_l v_l^2}, \qquad We_R = \frac{\rho_g (v_g - v_l)^2 d_l}{\gamma}. \tag{4}$$

Other flow parameters, that are used for liquid atomization of cylindrical jet can be adapted as well, such as the liquid Reynolds number, $Re_L = \rho_l v_l d_l / \mu_L$, the liquid Weber Number, $We_L = \rho_l v_l^2 d_l / \gamma$.

However, they are less important for air-blast atomizer because, for high momentum ratio M, the effect of the dynamics of the liquid jet is very low. The atomization process is then mostly driven by the shear that is induced by high gas velocity with respect to the liquid velocity. On the contrary, the dynamics of the gaseous flow is determinant in particular in the vicinity of liquid-gas layer. Thus, the gas longitudinal velocity profile normal to the issued liquid-gas surface is determinant for the development of the first instabilities [34]. For experiments, it is of primary importance to characterize the gas boundary layer that depend on the geometry of the air-blast injector upstream of the injection location. From these initial Kelvin-Helmholtz-types of instability, if the liquid thickness is small, a coupling occurs between instabilities on both sides of the liquid sheet leading to the flag effect. From this feature shared by most of liquid sheet atomization systems based on air blast, several processes are involved in the disintegration of the liquid sheet. For

instance, the liquid sheet flapping induce variation of the liquid thickness. In the stretched part, this thinness can induce perforation of the liquid sheet leading to the emergence of a hole surrounded by a liquid rim. The accumulation of liquid within these rims or in other part of the liquid sheet under the effect of surface tension can create ligaments, which are finally destabilized by Raleigh-Plateau-types of instability. In many industrial applications, to reach high injection rate with an efficient atomization, the flow conditions are such that turbulence is induced at least in the gas flow. The turbulent nature of the two-phase flow complicates then the previously described instabilities adding a transient stretching effect and a possible collision between liquid elements. This is where the numerical simulation of the entire flow is supposed to help the design of injection systems. Accordingly, the numerical test case has been design to be as close as possible of these typical conditions. The limitation comes from the mesh resolution that should be fine enough to capture most of these phenomena.

To design the appropriate test case we refer to previous study that have classified break-up mechanism with respect to velocity ratio ([34, 35]). At low speed ratio, the liquid sheet oscillates with a potential low amplitude growth of the liquid core. Moreover the atomization happens following streamwise and spanwise ligament break-up and the spray angle is particularly low. It is called the *cellular breakup regime*. This regime would be very challenging for computation requiring a very long computational domain together with high mesh resolution to capture the decreasing liquid thickness. Then at medium ratio, vorticity becomes more important and the breakup is controlled by streamwise structure of liquid detaching from the principal liquid core. The high amplitude of the sinusoidal wave induces a high spray angle. This is the *streamwise ligaments breakup* [37]. Finally, very high v_g/v_l brings to a complete and immediate disintegration of the liquid sheet. In [36], the authors also observed that high relative velocity usually leads to strong sinusoidal oscillations of the liquid flow inducing an high spray angle and short sheet breakup length, called *flag-effect* [36].

These last two observations indicate that a high velocity ratio is suitable to promote an efficient atomization with a quite large spray angle in order to reduce the required length of the computational domain. High velocity ratio also increase the momentum ratio which is beneficial to reduce the liquid core length at least in cylindrical liquid jet atomization [38, 39, 40]. In addition, having high velocity and momentum ratio will lead to simulation that is closer to most industrial application. The limitation comes from the turbulence that leads to smaller length scale as the Reynolds increasing. Similarly, it is expected that the final droplet sizes decrease as the velocity ratio increases leading to higher Weber number. It has been chosen not to inject turbulent fluctuations of velocity at the inlet, though this may seem less realistic for real applications, it allows to more deterministic comparison between numerical approaches and postpones slightly the creation of smallest length scales. Finally, the density ratio has to be high enough to ensure a realistic representation of a liquid and a gas phase that is typically of a thousandth for air and liquid water at atmospheric pressure. However, less is the density ratio less is the interaction between phases again leading to a less efficient atomization. At least, in engines very often the gas is pressurized leading to density ratio of the order of a hundredth. Based on these principles, the present configuration has been set by adjusting flow parameters in order to promote a fast atomization, limit the liquid core penetration and having a density ratio realistic for aircraft engines. A reasonably high momentum M=18.7 is obtained with a moderately high speed ratio, $v_g/v_l=43$ and a density ratio $\frac{\rho_g}{\rho_l}=1/100$. To reduce the role played by the surface tension, since it is not solved by the diffuse interface model, we have chosen a high relative gaseous Weber number, $We_R = 403$. As we will see in Section 4, we obtain a regime resembling the *streamwise* ligaments breakup, with a short liquid core, ligaments and an atomized spray.

3.2 Geometry and description of various meshes

The simulated domain described in Figure 2a shows the boundary conditions of the simulation. ① is the liquid injection plan, ② is the gas injection plan, ③ and ﴿3⟩ are periodic plans, ④, ⑤ and ⑥ are outflow plans. The liquid injection height, d_l , the gas injection height, d_g , the x-y-z length of the box, L_x , L_y , L_z , are given in Table 1.

units	ر ا	۱,	,	$ _{L_v}$,	Phase	$\rho (kg/m^3)$	p (MPa)	$\gamma(N/m)$	μ (Pa.s)
	d_l		L_{x}	Ly	L_z	Liquid	100	0.1	0.01	0.0001
(mm)	1	16	16	4	16	Gas	1	0.1	0.01	0.0001
(a) Dimensions						(b) Fluids physical properties				

Table 1: Dimensions and physical properties of the configuration.

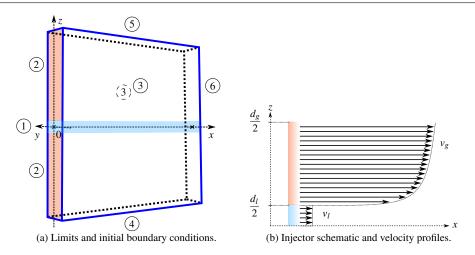


Fig. 2: Geometry, limits and boundary conditions of the configuration.

Figure 2b defines the velocity profile of the gas and the liquid, which are symmetric with respect to the x-axis and y-invariant. The gas velocity profile v_g given in Equation (5) is typical for turbulent pipe flow [41].

$$v_g = v_g^{avg} \frac{7}{6} \left(\frac{2|z| - d_l}{d_g - d_l} \right)^{\frac{1}{6}} + v_l.$$
 (5)

The average gas velocity v_g^{avg} is $65 \, m/s$. An offset equal to $v_l = 1.5 \, m/s$ ensures the continuity of the velocity profile at the injection plan. The domain is initially filled with a liquid sheet in the x-y plan, as thick as the liquid slit as shown in Figure 2a. Table 1b states the fluid properties in terms of density ρ , surface tension coefficient, γ , and viscosity, μ .

The ARCHER simulations are performed on a Cartesian mesh $512 \times 128 \times 512$ with a cell size equal to $\Delta x = 3.125\,10^{-5}\,m$, so a total of 101M faces, 33.6M cells and 32 cells in the liquid slit. In terms of degrees of freedom, which is defined as the product of the number of variables solved and the number of cells, ARCHER solves 42.0M. CEDRE simulations have been performed on two meshes composed of tetrahedral cells. The first, referred later on as *CEDRE* (*MR*), proposes a medium refinement level with 148k faces, 71.7k cells and 788k degrees of freedom, and the second, referred later on as *CEDRE* (*HR*), a high refinement level with 1.11M faces, 546k cells, thus 6.01M degrees of freedom. *CEDRE* (*MR*) has only 10 cells in the slit, while *CEDRE* (*HR*) has 20 cells. The data are summarized in Table 2. In

	Face number	Cell number	$\min(\Delta x)/d_l$
CEDRE (MR)	0.148M	71.7k	10
CEDRE (HR)	1.11M	546k	20
ARCHER	101M	33.6M	32

Table 2: Mesh statistics of the three simulations.

terms of degrees of freedom, there is a factor 7.6 between the two CEDRE simulations, and similar factor, 7.0, between the high refined CEDRE simulation and the DNS. The three simulations all together encompass thus a large level of refinements.

In order to compare the results of the DNS to the results obtained with CEDRE, one must consider the fact that the DNS solver is incompressible, thus there is no acoustic impacting the liquid sheet and its density is constant. To restrain the acoustic role in the CEDRE compressible solver, we have enlarged the computational domain by a factor 5 in the x and z direction and meshed it with a very coarse mesh to avoid any reflecting waves as shown in Figure 3. The minimum cell size is located along the liquid slit as one notices on Figure 3b.

Furthermore the use of a compressible thermodynamics in CEDRE through the Stiffened-Gas equation of state makes it impossible to maintain the liquid density constant. The temperature of the phases have been modified to obtain the same initial pressure and density conditions as in Table 1b and in practice, the liquid density almost stays constant as shown on Figure 4.

The convection time t_{conv} of the system is defined as $t_{conv} = L_x/v_l$. The liquid is quickly accelerated and flows at an averaged speed of $v_l \approx 15 \, m/s$ at $x = 3 \, mm$ as we will see in Section 4 in Figure 14c. Hence the convection time is

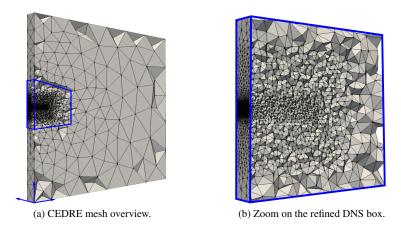


Fig. 3: Clip of the CEDRE mesh on the plane y = 0 but keeping whole elements.

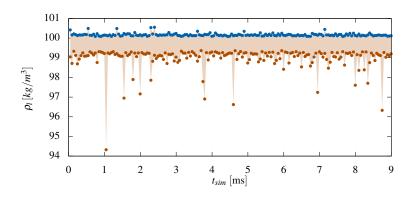


Fig. 4: CEDRE (MR) instantaneous liquid density ρ_l over time, • maximum value, • minimum value.

approximately equals $t_{conv} \approx 1 \, ms$. The minimum simulation time of the three simulations is $8 \, ms$, which corresponds to approximately height convective times, yielding a priori satisfying statistical convergences for each simulation. The simulation information are summarized in Table (3). The total CPU cost is defined as the product of the number of

	Total t _{sim}	CPU cost for $t_{sim} = 9 ms [h]$	Degrees of freedom
CEDRE (MR)	18	8.5410^3	0.788M
CEDRE (HR)	10.5	69.310^3	6.01M
ARCHER	14	245 10 ³	42.0M

Table 3: Simulation time and costs comparisons.

processors, N_{proc} , times the computational time for a given simulation time, t_{sim} . The three simulations have not run in overall the same amount of simulation time, due to time, ressource and statistical convergence constraints. Therefore, only partial comparison in terms of CPU costs can be proposed. For $t_{sim} = 9 \, ms$, we see that ARCHER is 3.5 times more costly than CEDRE (HR), the latter being 8.1 times more costly than CEDRE (MR). However, as we will see in Section 4, time simulation needed to gain statistical convergence differs from one simulation to another. In overall *CEDRE* offers quicker stastical convergence than ARCHER with a significant reduction of degrees of freedom, hightlighting again the interest of reduced-order model simulations for industrial configurations.

Before moving on to the Section 4, where we analyze and discuss the results obtained with the DNS and the diffuse interface model, Figure 5 offers a global overview of the simulations performed with ARCHER and CEDRE. On the left hand side of Figure 5, we have drawn a volume rendering of the liquid volume fraction α_l obtained with the CEDRE (HR) simulation. On the right hand side is shown the level set solved by ARCHER, indicating the position of the interface.



Fig. 5: Instantaneous overview of the simulations: volume rendering of the liquid volume fraction, α_l high low (CEDRE (HR) - left) and level set in grey (ARCHER - right).

4 Results and discussion

We propose a qualitative and quantitative comparison of the results of the simulations performed with CEDRE and ARCHER in order to, first, understand the behavior of each numerical method, second, emphasize the main conceptual differences between them and, finally, evaluate to which extent CEDRE reduced order model is predictive and why is it departing from the DNS results.

This section is organized as follows: we start by assessing the DNS reliability to identify the most relevant region where the DNS can stand as a trustworthy benchmark. Then, we provide a comparison of the atomization global characteristics obtained by each simulations through the volume fraction time evolution and averaging. We further detail the comparison with statistical analyses of the flow through first and second order moments based on the liquid volume fraction and velocities.

4.1 Identification of the DNS region of validity

Since the DNS results have to be reliable to assess the predictiveness of the reduced order model, an analysis of the IRQ_K criterion described in [42] is first performed. This indicator, based on the mean curvature, has been used in several studies to assess the quality of the resolution [43]. The main advantage of this criterion is to evaluate the quality of complex configuration simulations, such as the present one, without running the simulation with several levels of mesh resolution to achieve a proper mesh convergence study. This criterion is defined as $IRQ_K = 1/(\Delta x 2H)$, where Δx is the grid size and H the mean curvature. This criterion highlights the under-resolved regions of the simulation where its value diminishes. For instance, a droplet described with 4 mesh cells along its radius has an $IRQ_K = 2$. Therefore, the lower the IRQ is, the lower is the resolution of the liquid (or gas) structure highlighted. Note that the threshold value of 2 chosen here is arbitrary and the user is expected to choose a value that is the most adequate to a given simulation. Instead of investigating the individual IRQ_K for each structure, the IRQ_K PDF can be studied to obtain a better picture of the resolution level of the overall simulation.

In this work, the IRQ_K is extracted from two specific regions of the jet: in the main liquid core, where the criterion should behave perfectly since most wrinkling of the interface are expected to be captured, and in the most critical secondary atomization region, where liquids structures encounter fragmentation/breakup processes that can lead to under-resolved liquids structures. Theses two regions of interest are illustrated in Figures 6a, 6b.

The PDF of IRQ_K , shown in Figures 6c, 6d, gives useful information about the quality of the simulation. In the first region of the liquid sheet, most of the IRQ values of the PDF (around 95%) are located beyond the critical zone of low IRQ, $IRQ_K \in [-2:2]$, as shown in Figure 6c: this range is indicated by two red dotted lines in the figure. As expected, the resolution is sufficient here to describe the main physical phenomena such as instabilities on the liquid surface and the flapping mechanism. However, in the second region, the PDF is compressed close to the critical IRQ_K zone, hence only around 60% of the interface is well resolved (Figure 6d). It indicates that the DNS results should be taken with caution for large x^* . This can be explained by the production of droplets of small scale due to atomization of the flapping sheet. Note that this kind of simulations at high Weber and Reynolds numbers are quite challenging in term of computational costs, explaining the difficulty to reach higher IRQ in the most atomized or dispersed region. Besides, we specifically have chosen two different regions with opposite behavior to assess the pertinence of the criterion.

Consequently, the DNS appears sufficiently trustworthy until the jet become more dispersed, due to the presence of very small droplets. In addition, in the present work, CEDRE simulation has not been coupled with any specialized reduced-order model, such as KBMM, to better describe the dispersed flow. It is unlikely the diffuse interface model alone will capture properly this part of the flow. The whole analysis will therefore be conducted in the zone $x^* \in [0-4d_l]$ along the streamwise axis.

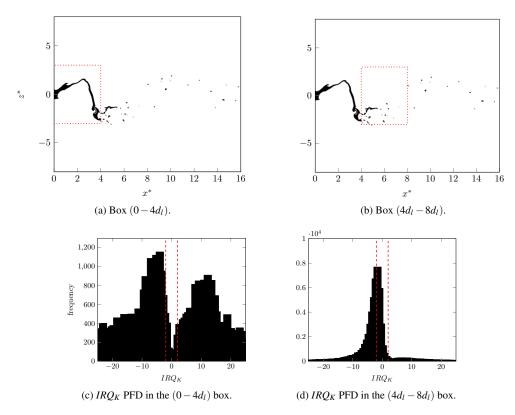


Fig. 6: IRQ_k PDF analysis at time t = 12ms (bottom), in two regions identified by the red dashed rectangles drawn on the plan $y^* = 0$ showing liquid volume fraction α_l (top).

4.2 Evaluation of the atomization global characteristics of both numerical approaches

To begin with, we would like to evaluate broadly the macroscopic features of the investigated flow. We first analyze the time evolution of the liquid volume fraction in order to reveal the expected flag effect mentioned in Section 3. Then we interest ourselves to the liquid core penetration as it is usually a key feature measured in experiments.

4.2.1 Time evolution

Figure 7 shows the temporal evolution of the liquid volume fraction obtained with the interface capturing technique (left) and the diffuse interface model (right). The time-frame starts at a given simulation time $t_{sim} = t_0$ with a δt frame rate and stops after nine iterations.

In the first place some inherent properties linked to these numerical methods are clearly observable: results obtained with the CLSVOF method exhibit a sharp interface between liquid and gas, i.e. a one cell transition between $\alpha_l = 0$ or $\alpha_l = 1$ at the interface. On the contrary, the liquid volume fraction obtained with the seven equation model allows a wide range of α_l to be found across the interface. Consequently, a smooth transition between liquid and gas can be observed.

When comparing the instantaneous snapshots, the local representation of the interface is clearly different due to the intrinsic modeling gap between a sharp and a diffuse interface modeling. Nevertheless, these differences are less obvious when considering that the diffuse interface approach may be interpreted in terms of some statistical probability

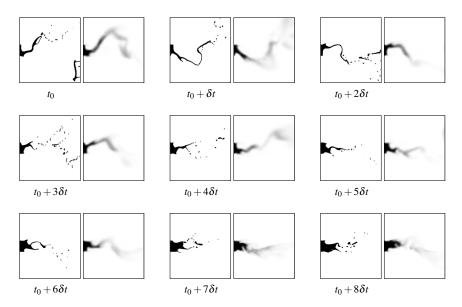


Fig. 7: Time lapse of liquid volume fraction near the injector (ARCHER), $\alpha_l = 0$ Left: ARCHER, right: CEDRE. We define t_0 as the starting time and δt as the time step.

to find the liquid phase, i.e. 0.5 value of liquid volume fraction does not actually mean that there is actually 50% of liquid phase and gas phase but that pure liquid may be found there with a probability of 50%.

Focusing on large scale motions, Figure 7 reveals a sinusoidal flapping. Measuring this flapping frequency could be done by Fourrier transform of a signal characteristic of the flapping varying over time. However, while this procedure is conducted in experiments since operators can record the signal in time for a large number of flapping, it is nonetheless hardly applicable to the present numerical simulations including only few flapping events. Instead, we have chosen an arbitrary initial time t_0 at which both simulations are synchronized. The global flapping evolution of both numerical approaches are much the same inferring that, despite the different representation of the interface, the liquid sheet flapping frequency is similar. One may have also noticed at the end of Figure 7, that both simulations exhibit a transient regime during which we observe compaction of the thin flapping liquid sheet starting to be thicker and shorter. Then the liquid sheet stretches again at the very end of the time-lapse for both simulations.

4.2.2 Liquid core penetration

One key quantity in the study of liquid injection is the liquid penetration length. For transient injection, for which no liquid is initially present, the liquid spray grows from the injector outlet and penetrates into the chamber. The liquid core penetration length is then easily obtained at the first break-up event. Since the present case focuses on the established state of the flow, we cannot monitor such event. Worst, the flow has undergone multiple break-ups through time and the spray has reached the outlet of the computational domain. Experimentally, some apparatus may give a picture of the spray with high contrast between a zone where the spray is present and a zone where there is nearly no liquid and average it over time. Since this procedure is hard to apply on numerical simulations, we choose to study the time averaged liquid volume fraction, $\langle \alpha_l \rangle_l$, along the streamwise direction (x-axis) in Figure 8.

The liquid profile along the axis obtained by the DNS ranges from unity close to the injector slit towards zero further downstream, once atomization and dispersion have occurred. The high resolution profile CEDRE (HR) of the diffuse interface model matches nicely the DNS data. It is a noticeable result that despite of the difference on the representation of the interface the evolution of the liquid concentration is accurately captured. The CEDRE (MR) profile on the contrary shows a certain discrepancy with the reference DNS result. This suggests a correlation with the mesh resolution, which can be explained as follows: the diffuse interface approach integrates a part of the interface statistics by representing the phase transition by a smooth function rather than by a discontinuity as for the DNS. The diffuse interface model contains thus an underlying averaging procedure related to the mesh resolution, causing the observed discrepancy with the medium refined mesh.

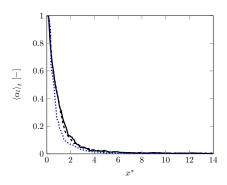


Fig. 8: Averaged liquid volume fraction $\langle \alpha \rangle_t$ along streamwise axis. — ARCHER, ---- CEDRE (HR), ---- CEDRE (MR).

4.2.3 Discussion on small-scale representations

Turbulence is intrinsically impossible to be reproduced and thus to be predicted locally in space and time by simulations. Accordingly, only statistical characteristics of turbulent flows can be predicted. With this in mind, DNS simulation has the meaning of a numerical procedure that can be used directly without any modeling assumptions to generate flow samples having the same statistical characteristics as the real investigated flow, such as the averaged velocity. DNS instantaneous results can not be considered as the true realization of the flow, but rather possible realizations. Our understanding of turbulence in liquid-gas flow and in particular for this test case is not complete, but it may be a reasonable hypothesis that the unpredictable characteristics are present. It is even possible that the complex interaction between phases across the interface enforce the unpredictability of the exact flow. Thus, it is possible to expect that a small perturbation of the DNS can lead to a significant position change of some droplets later on.

On the contrary, as explained in Figure 7, the diffuse interface model makes explicit this non-determination of the interface real position by estimating the probability of the interface presence in each cell. The diffuse interface approach is then potentially representing correctly the real flow, but it is highly relying on the closure of the models, such as the velocity relaxation time introduced in Equation (1) or the interfacial pressure and speed.

To conclude, on these preliminary comparisons, while the two models show a very different representation of small-scales due to the distinct interface modeling, large-scale motions seems reasonably in good agreements and sufficient to recover global features of the atomization process such as liquid penetration and spray angle.

Beyond the global characteristic of the atomization, numerical simulations give also access to more complete data set of results. In particular, for this established flow, the time averaging procedure provides local statistics of the flow. The following part is thus dedicated to statistical analysis of results obtained by diffuse interface method compared to the reference DNS data. To ensure a fair comparison the domain is limited to the well-resolved part $\langle 0, 4d_l \rangle$.

4.3 Statistical analysis

To push further the comparison of the simulations, we now provide statistical analyses of the flow. The first paragraph evaluates first-order moments with the time averaged liquid volume fraction and the time averaged hydrodynamical velocity components. Then, the second paragraph discusses about the second-order moments obtained from the liquid volume fraction and velocity fluctuations.

4.3.1 First-order moments

Time averaged liquid volume fraction Isolines of the time averaged liquid volume fraction $\langle \alpha \rangle_t$ with its spatial evolution on the $y^* = 0$ plane are drawn in Figure 9. The averaging time is $t_{sim} = 9 \, ms$. The axis are non-dimensionalized with respect d_l , the thickness of the liquid injector slit.

A good agreement is observed in both methods: the isolines almost match each other and contours of liquid volume fraction are similar. However, the isolines extend a bit further along the x-axis for the DNS than those of the diffuse interface model. This effect is probably due to the numerical dissipation, since the DNS mesh is about four time refined in each direction compared to CEDRE (HR) mesh. The isolines extend slightly more for the DNS case, by a small margin due. Interestingly, from the lower value of isolines, we can clearly see qualitatively the spray angle of the

simulations. The angle is a little wider for the DNS confirming that DNS is more subjected to *dispersion* than the diffuse interface model. This effect is nearly noticeable from the HR diffused interface simulation but clearly visible from the MR simulation.

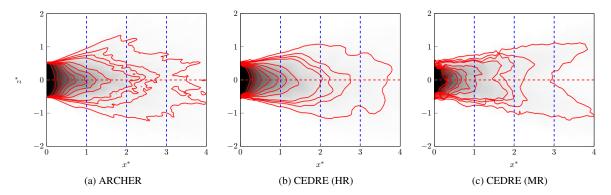


Fig. 9: Averaged liquid volume fraction isolines $\langle \alpha_l \rangle_t = 0.1$ and $\alpha_l = 0.1$, dashed located at $\alpha_l = 0.1$ and $\alpha_l = 0.1$. Reader must take care to the fact that the $\alpha_l > 0.1$ are is different for the three slices.

Time averaged liquid volume fraction profiles along the transverse direction (z) are depicted for different x positions in Figure 10. The positions of transverse profiles are shown on Figure 9. Again, the diffuse interface model is very close

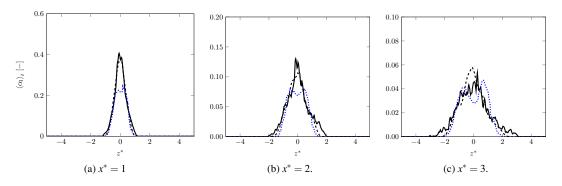


Fig. 10: Averaged liquid volume fraction $\langle \alpha \rangle_t$ along Figure 9 dashed lines. — ARCHER, ----- CEDRE (HR), ----- CEDRE (MR).

to the DNS reference simulation, but confirms the slightly higher dispersion in the reference DNS, visible at least on the CEDRE (MR) case. These comparisons suggest that the seven equation model is able to better capture the liquid phase dispersion in this specific atomization process than the DNS. This surprising result may again be due to the mesh resolution, which is higher for the DNS independently of the method use to represent the interface. Another possible explanation, involving this time the representation of the interface, could be that droplets formed during the atomization process are thrown away by the flapping motion of the liquid sheet. Once they are ejected, they have a relative transverse velocity component with respect to the surrounding gas phase. The relaxation of this slip velocity has not the same mechanism in the DNS that aims at solving the force acting at the liquid surface, whereas the diffuse interface models it (see Equation (1)). The correct resolution of these forces by the DNS depends on the mesh resolution, hence is difficult to achieve for droplets having a radius of the order of the mesh resolution. This may lead to these slight differences on the dispersion, the DNS approach estimating a longer time of relaxation than the diffused interface approach.

As a concluding remark, in futur work, we could characterize the relaxation time of the velocity relaxation based on the dispersion observed in the results to close the diffuse interface model.

Mean velocities Time averaged transverse velocity contours are illustrated in the $y^* = 0$ plane in Figure 11 for both formalisms.

Initial velocity profiles are very similar in the range $x^* \in [0:1]$. Then $\langle v_z \rangle_t$ tends to spread vertically in the DNS, whereas in the diffuse interface model the transverse velocity remains closer to the $z^* = 0$ axis. The same behavior

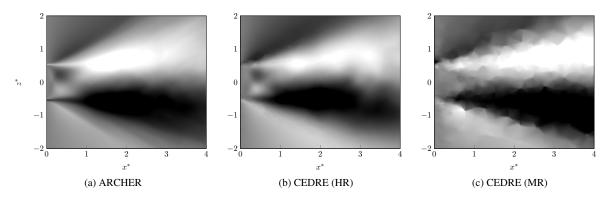


Fig. 11: Averaged tansverse velocity $\langle v_z \rangle_t = -3$ 3m/s at $y^* = 0$.

was observed in the previous paragraph for the liquid volume fraction. Velocities maximum and minimum are, to some degree, higher in the DNS, which is not surprising since some numerical diffusion is expected to happen on the coarser mesh used for the seven equation model computation. In the DNS, $\langle v_z \rangle_t$ velocities display a sharp variation along the $z^*=0$ axis, when $z^*>0$ $\langle v_z \rangle_t$ is negative otherwise $\langle v_z \rangle_t$ is positive. On the contrary, the diffuse interface model lets a slight interaction between positive and negative velocities on the $z^*=0$ axis, the transition being smooth.

Transverse velocity profiles are shown in Figure 12 for different locations. For $z^* > 0$, profiles of the DNS and the

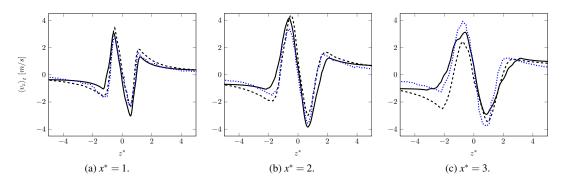


Fig. 12: Averaged tansverse velocity $\langle v_z \rangle_t$ along Figure 9 dashed lines. — ARCHER, ----- CEDRE (HR), ----- CEDRE (MR).

seven equation model are similar in terms of values and slope. Although, for negative value of z^* , a discrepancy is found at $z^* = -2$. In the DNS, the velocity is rising when further progressing in the x axis, whereas in the diffuse interface model the velocity decreases. This gap could eventually be filled by integrating along the y axis to gain statistical convergence.

Similar comparisons are performed on the time averaged streamwise velocity, $\langle v_x \rangle_t$, in Figure 13. An excellent agreement is observed with respect to the diffuse interface model results. Again, the intensity of the velocity is slightly smaller due to numerical dissipation inherent to the diffuse interface model. This is confirmed by analyzing the velocity profiles at different locations shown in Figure 14.

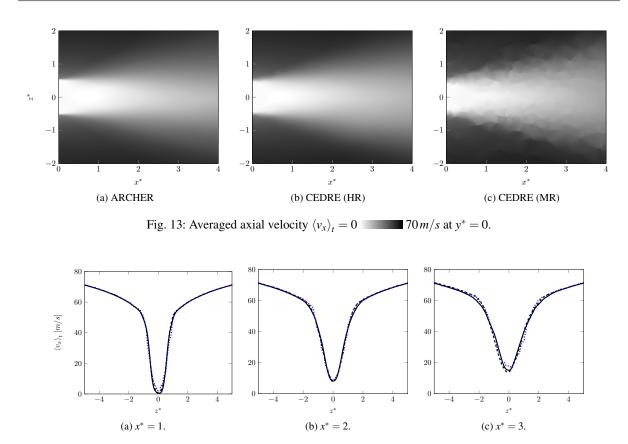


Fig. 14: Averaged axial velocity $\langle v_x \rangle_t$ along Figure 9 dashed lines. — ARCHER, ----- CEDRE (HR), ----- CEDRE (MR).

The next paragraph is dedicated to the study of turbulent statistics through the analysis of the second order moments of the flow using the liquid volume fraction and velocity components fluctuations.

4.3.2 Second-order moments

Mean components of the Reynolds stress tensor To study more deeply statistic of the flow, we have computed the second order moments based on the liquid volume fraction and velocity fields. Three kind of second order moment emanate from these quantities: the liquid volume fraction variance, $\overline{\alpha'_l\alpha'_l}$, nine components of the Reynolds stress tensor, $\overline{v'_iv'_j}$, and the three components of the liquid turbulent flux $\overline{\alpha'_lv'_l}$.

The analysis of the Reynolds stress tensor allows a validation of the turbulence characteristics observed in the diffuse interface model. Figure 15 shows the averaged transverse Reynolds stress tensor component $\langle v_z'v_z' \rangle$ contour in the $y^*=0$ plane. Turbulence intensity is higher downstream in both formalisms. Again, the intensity obtained with the seven equation model is slightly smaller but the overall results are close to the one obtained with the DNS.

Figure 16 illustrates the transverse Reynolds stress tensor component for different locations in the streamwise direction. As mentioned before, the maximum turbulence intensity is lower than the DNS but the trend of the curve are very similar in both methods, confirming the ability of the diffuse interface model to represent the fluctuating velocities.

The same analysis is performed on the longitudinal Reynolds stress component $\langle v_x'v_x' \rangle$, shown in Figure 17. Here, some differences are observed: turbulent intensity in the DNS is higher, but also more spread vertically compared to the results obtained with the diffuse interface model, for which the turbulence fluctuations are located closer to the main axis.

Concerning transverse Reynolds stress tensor profiles along the z-axis shown in Figure 18, an overall good agreement is found between the DNS and the diffuse interface model results. Nevertheless, a peak of turbulent intensity is found in the $x^* = 3d_l$ profile around $z^* = 2$ in the CEDRE results. As mentioned previously, the flow seems to expand downstream in the seven equation model results.

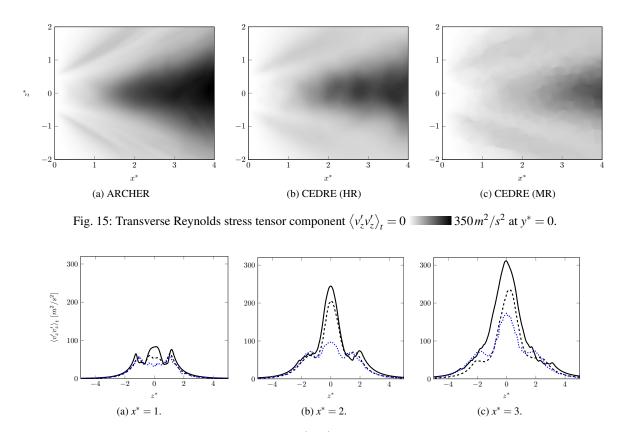


Fig. 16: Transverse Reynolds stress tensor component $\langle v_z'v_z'\rangle_t$ along Figure 9 dashed lines. — ARCHER, —— CEDRE (HR), —— CEDRE (MR).

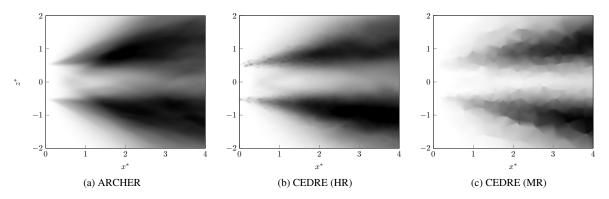


Fig. 17: Longitudinal Reynolds stress tensor component $\langle v_x'v_x'\rangle_t$. $\langle v_x'v_x'\rangle_t \in [0\,m^2/s^s,300\,m^2/s^2]$

Transversal turbulent liquid flux The turbulent liquid flux $\langle \alpha'_l v'_z \rangle_t$ represents the transport of the liquid volume fraction induced by velocity fluctuations. This quantity is important for atomization modeling [42], where this term is usually modelled with a turbulent viscosity approach.

Using the plane $y^* = 0$ as in previous paragraphs, $\langle \alpha'_l v'_z \rangle_t$ contours are summarized in Figures 19,20.

This variable behavior combines the effects pointed out earlier on the liquid volume fraction and the transverse velocity fluctuation: the turbulent liquid flux is more spread in the DNS case due to the higher spray angle. The turbulent liquid flux intensity is lower in the seven equation model. These results confirms that the liquid dispersion is higher in the DNS results.

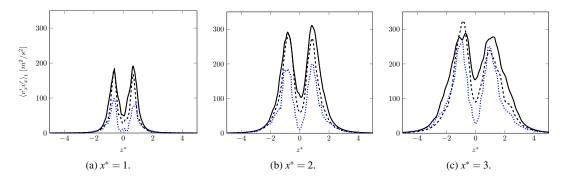


Fig. 18: Longitudinal Reynolds stress tensor component $\langle v_x'v_x'\rangle_t$ along Figure 9 dashed lines. — ARCHER, ----- CEDRE (HR), ----- CEDRE (MR).

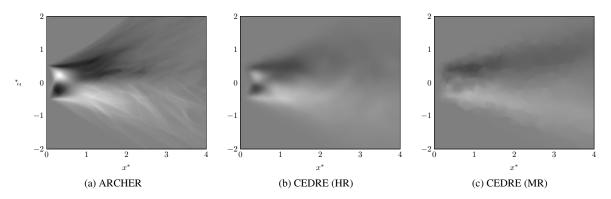


Fig. 19: Transversal turbulent liquid flux tensor component $\langle \alpha_l' v_z' \rangle_t = -1.5$ 1.5 m.s⁻¹ at $y^* = 0$.

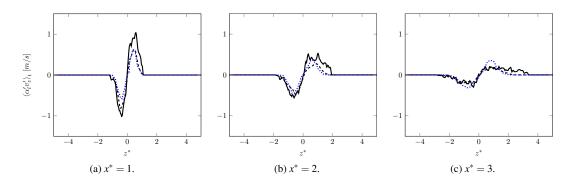


Fig. 20: Transversal liquid flux tensor component $\langle \alpha'_l v'_z \rangle_t$ along Figure 9 dashed lines. — ARCHER, — CEDRE (HR), — CEDRE (MR).

Discussion on second-order moments The second-order moment statistics exhibit some differences between both numerical approaches that are most probably related to the different representation of the small scale features of the flows, and more particularly to the representation of the liquid-gas transition as already attested with the global feature flow comparison at the beginning of the section.

In addition, it can be pointed out that it is more difficult to achieve the statistical convergence, as shown by remaining fluctuations in all the second-order moment figures. To show the effect of small scale structure on the second-order fluctuations, let us first consider the variance of the liquid volume fraction, defined as

$$\overline{\alpha_l'\alpha_l'} = \overline{\alpha_l\alpha_l} - \overline{\alpha_l} \ \overline{\alpha_l}. \tag{6}$$

Since locally there can either be liquid or gas, the admissible values of α_l are only one and zero respectively, thus the probability density function $P(\alpha_l) = (1 - \overline{\alpha_l})\delta(\vec{x}) + \overline{\alpha_l}\delta(\vec{x})$ yielding

$$\overline{\alpha_l'\alpha_l'} = \overline{\alpha_l} - \overline{\alpha_l} \ \overline{\alpha_l} = \overline{\alpha_l} (1 - \overline{\alpha_l}). \tag{7}$$

The sharp interface representation of the interface preserves this feature as shown in Figure 5, since the product $\overline{\alpha_l}(1-\overline{\alpha_l})$ is always null, whereas the diffuse interface model gives necessarily lower resolved variance level since $\overline{\alpha_l}(1-\overline{\alpha_l})$ is not null in zones where the interface has been diffused (see Figure 7), yielding a lower variance. This variance gap has not disappeared in the diffuse interface approach. If the construction of the diffuse interface approach is based for instance on some probability to find the liquid, the same statistical approach induces that a certain amount of variance is related to this probability, this part is somehow included as a model and hidden at the resolved scale.

Furthermore, the turbulent liquid flux includes also this kind of effect, by considering at one location and time there can be only liquid and gas. It can be shown that

$$\overline{\alpha_l'v'} = \overline{\alpha}(1 - \overline{\alpha})(\overline{v_l} - \overline{v_g}) = \overline{\alpha_l'\alpha_l'}(\overline{v_l} - \overline{v_g}). \tag{8}$$

Thus, the turbulent liquid flux is related to the variance and the difference of velocity between phases. Since the resolved part of the diffuse interface underestimates the variance, it penalizes the turbulent liquid flux. Here again, it is due to the fact that second-order moments are sensitive to the small-scales feature of the flow.

On the same line not all the features of the flow are perfectly represented by the sharp interface approach (DNS), since for low mesh resolution the precision on the determination of the interface position will decrease leading to other kind of numerical artefacts. For low resolution, the methods that preserve the sharp interface transition to keep also the total amount of each phase forces somehow the phase inclusion to remain at the resolution level. This has been shown on Figure 6d, for the low resolution part of the simulation, an accumulation of surface that has a curvature related to Δx appears showing that the numerical method start to limit the atomization process to preserve droplet that can be captured with the present mesh resolution.

Finally, the implication of the reduction of variance can also be demonstrated for Reynolds stress correlation, as an example the same PDF of α_l implies

$$\overline{v'v'} = \overline{\alpha_l} \ \overline{v_l'v_l'} + (1 - \overline{\alpha_l}) \ \overline{v_g'v_g'} + \overline{\alpha_l' \alpha_l'} (\overline{v_l} - \overline{v_g})^2. \tag{9}$$

The Reynolds stress contains three contributions: a part in the liquid phase, a part in a gas phase and a last part due to the velocity difference between gas and liquid. This last contribution is proportional to the variance of α_l . Thus the under estimation of the variance by the diffuse interface approach reduces also the Reynolds stress. This effect can be observed on Figure 18 and it is more pronounced for the MR case than for the HR case.

To conclude this discussion, the fact that the diffuse interface model underestimates the variance does not mean that the diffuse interface model produces wrong result, but that a part of second-order moments is included in the statistical representation of the transition between the gas and liquid.

Conclusions

In the present work, we have proposed to pursue the evaluation of reduced-order models to perform predictive simulations of the primary atomization in engines ranging from cryotechnic to aeronautic applications. As a baseline comparator, we have relied on the DNS results of a hierarchy of specific test-cases. The original test-case consisted in an air-assisted water atomization using a coaxial injector with experimental results from the LEGI test bench [19]. In the present paper, we have selected a second test-case, an air-assisted water atomization using this time a planar injector rather than a co-axial injector. This planar injector reproduces in terms of Weber and Reynolds numbers the liquid sheet flowing out a swirling atomizer used in agricultural applications [20], $Re_L = 1.5e3$ and $We_R = 4.0e2$ and p = 1 bar. The Reynolds and Weber numbers are also typical from the mid-range aeronautical engines. As analyzed in the present contribution, this test-case offers also an atomization regime, which makes it complementary with the first test case in order to eventually evaluate and assess our reduced-order models, the final aim being a cryogenic coaxial injection.

We have thus qualitatively and quantitatively compared the results of simulations performed with CEDRE for the diffuse interface reduced-order model and ARCHER for the DNS. We have first assessed the DNS reliability through the use of the IRQ criterion to identify the most relevant region where the DNS can stand as a trustworthy benchmark. Then, we have provided a comparison of the atomization global characteristics obtained by each simulations through the volume fraction time evolution and spatial mean penetration of the liquid core. These preliminary comparisons have shown that, while the two models show a different representation of small-scales due to the distinct interface modeling, large-scale motions seems in reasonably good agreement and sufficient to recover global features of the atomization process such as liquid penetration and spray angle. We have further detailed the comparison with statistical analyses of the flow through first and second-order moments based on the liquid volume fraction and velocities limited to the well-resolved part $\langle 0,4d_l \rangle$ of the computational domain. The first-order moments have brought out a slightly higher dispersion of the reference DNS than the diffuse interface model resolution and tend to indicate that enough resolution

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is essentiel for the latter model. The second-order moments have confirmed the liquid higher dispersion for the DNS. We finally have analyzed why the diffuse interface model underestimates the variance and emphasized that it does not mean that the diffuse interface model produces wrong result, but that a part of second-order moments may be included in the representation of the transition between the gas and liquid. To summarize, we have understood the behavior of each numerical method and identified the main conceptual differences between them.

The comparison has finally shown good agreements, together with an important CPU gains between the *seven* equation model implemented in the CEDRE code and the DNS results from the ARCHER code.

The diverging modeling of the small-scale between the two approaches has brought out the need to examine in future works the underlying averaging process coming from the diffuse interface modeling, which is linked to the mesh resolution and produces numerical dissipation leading to a lost of amplitude of the fields. It also suggests to add a subscale description of the interface dynamics through geometric variables such as the interfacial area density, the mean and Gaussian curvatures as proposed in [18]. It is current research area part of the PhD thesis [44].

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Compliance with Ethical Standards

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