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### $38^{th}$ International Symposium on Combustion

# Optimized chemistry for Large Eddy Simulations of wrinkled flames

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### Colloquium: TURBULENT FLAMES.

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### Optimized chemistry for Large Eddy Simulations of wrinkled flames

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#### Abstract

State-of-the-art LES models have made significant progress in the prediction of heat release and flame propagation for a wide range of combustion regimes. Predicting pollutants remains however a difficult issue, especially in situations where sub-grid scale wrinkling is high. A novel strategy, named COPLES (Chemistry OPtimized for LES), is presented in this paper to account for the effect of sub-grid scale wrinkling on pollutants formation in a transported chemistry context and under flamelet regime assumption. New chemical mechanisms are built through an optimization process to recover the properties of filtered flames. Two alternative formulations are proposed. The first one consists in optimizing the COPLES parameters to retrieve the structure of Filtered Planar Flame (FPF) and to include separately the impact of sub-grid scale wrinkling. The second formulation targets directly a collection of Filtered Wrinkled Flamelets (FWF), so that the influence

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of turbulence on the chemical flame structure is intrinsically accounted for. The two approaches are successfully validated on 1-D freely propagating premixed flames and then challenged against the standard Thickened Flame for LES model on a turbulent premixed swirled combustor, experimented at Cambridge University. Whereas all formulations retrieve the temperature field, the COPLES-FWF model improves significantly the prediction of CO formation.

Keywords: Turbulent combustion modeling, Large Eddy Simulation,pollutants, flame wrinkling2010 MSC: 00-01, 99-00

#### 1. Introduction

Prediction of pollutants formation in Large Eddy Simulation (LES) requires complex chemistry [1]. Issues relative to the computational cost induced by detailed chemistry are tackled by resorting either to chemistry reduction [2] or to tabulation techniques [3, 4]. By storing in a pre-processing
step all thermo-chemical information in a look-up table, tabulated chemistry
is extremely competitive in terms of CPU time. However, it lacks flexibility
when the encountered flame structures differ from the tabulated archetypes

- 9 [5]. Large discrepencies on the prediction of CO in a diluted combustion burner were for instance observed in the work of Lamouroux *et al.* [6]. Meanwhile, the progress in reduced mechanisms and the increase of available
- <sup>12</sup> computational power enable a direct use of transported chemistry. Recently, analytic mechanisms have been for example introduced in LES [7, 8]. Also, virtual optimized schemes, developed to capture both heat release [9] and <sup>15</sup> pollutant formation [10, 11] over a wide range of flame regimes have been successfully applied to LES of turbulent premixed flames.

Within both reduced and tabulated chemistry formalisms, the closure of <sup>18</sup> filtered species balance equations is the key of turbulent combustion modeling. The LES combustion model must address two issues [12]: (i) it has to handle situations where the flame front is thinner than the LES grid.

- <sup>21</sup> Commonly used solutions are either to filter [13] or thicken [14] the species equations at a scale larger than the mesh size; (ii) it must include a model for integrating sub-grid scale turbulent effects, for instance through a wrinkling
- <sup>24</sup> factor [15] or a FDF [16]. We focus here on models based on a geometrical description of the flame front [12], which are efficient to compute flames in

complex geometries at low computational costs. While geometrical models

- have been able to predict heat release and flame propagation in various con-27 ditions [7, 13], intermediate species prediction remains challenging [17]. A recent work by Abou-Taouk et al. [18] has focused on the inclusion of (i) directly in the reaction mechanism by optimizing Arrhenius parameters on
- filtered flames. The method recovers well the structure of filtered planar laminar flames but is not able to predict intermediate species concentrations if the flame is wrinkled.
- 33

Indeed, as observed in a turbulent flame DNS [19], filtered quantities, especially intermediate species such as CO, are influenced by the surface of the flame contained at the sub-filter scale. The recent work developed by 36 Mercier *et al.* [20] includes these effects on pollutant formation by defining a new flame archetype, which takes sub-grid scale flame wrinkling intrinsically

- into account. The model relies on the Filtered Wrinkled Flamelets (FWF) 39 archetype, obtained by manufacturing two-dimensional wrinkled flames, which are filtered at the LES filter size. FWF has been used to build-up a filtered
- chemical look-up table in order to model the unclosed terms of the filtered 42 progress variable equation. Simulations of the swirling stabilized Cambridge flame [21] showed that accounting for sub-filter flame wrinkling on the chem-
- ical flame structure improves the prediction of intermediate species such as 45 CO [20]. Whereas the benefit of FWF has been demonstrated within a tabulated chemistry framework, accounting for the impact of SGS flame wrin-
- kling on the species formation in a reduced chemistry context remains an 48 open question.

The objective of the present work is to extend the work of Mercier et

- <sup>51</sup> al. [20] in a reduced chemistry context. Developments are made under a flamelet regime assumption. Contrarily to classical LES models [14], the impact of sub-filter turbulence on CO formation [22, 20] is accounted for. Other
- <sup>54</sup> physical phenomena which may impact the formation of CO, such as flame generated turbulence or counter-gradient transport, are not tackled. The selected methodology features the development of optimized filtered schemes to
- <sup>57</sup> retrieve the properties of the FWF flame archetype. The paper is organized as follow: model equations are detailed in Sec. 2, the filtered mechanism generation is presented in Sec. 3 whereas validations in both 1-D and 3-D
  <sup>60</sup> turbulent premixed flames configurations are shown in Sec. 4.

#### 2. Chemistry Optimized for LES of turbulent flames

#### 2.1. Model equations

In LES, the balance equation of the filtered species mass fraction  $\widetilde{Y}_k$  reads:

$$\frac{\partial \overline{\rho} \widetilde{Y}_k}{\partial t} + \nabla \cdot \left( \overline{\rho} \widetilde{u} \widetilde{Y}_k \right) = \overline{\text{RHS}(\Phi)}$$
(1)

where u is the flow velocity and  $\Phi = (P, T, Y_1, ..., Y_N)$  is the thermochemical state vector with P and T the pressure and temperature.  $\overline{\varphi}$  and  $\widetilde{\varphi}$  denote Reynolds and Favre averaging of quantity  $\varphi$ , respectively. The unclosed filtered Right Hand Side  $\overline{\text{RHS}(\Phi)}$  reads:

$$\overline{\text{RHS}(\mathbf{\Phi})} = \overline{\tau}_k + \nabla \cdot \left(\overline{\rho D_k \nabla Y_k}\right) + \overline{\rho \dot{\omega}_k^{\mathcal{A}}(\mathbf{\Phi})}$$
(2)

where  $D_k$  is the molecular diffusivity of species  $k, \overline{\tau}_k = -\nabla \cdot (\overline{\rho} \widetilde{uY_k} - \overline{\rho} \widetilde{uY_k})$ <sup>69</sup> is the sub-grid scale convective term and  $\dot{\omega}_k$  the chemical reaction rate of species k parametrized by the set of kinetic rate parameters  $\mathcal{A}$ . Because of non-linearities of the terms that compose Eq.2, the RHS cannot be directly estimated from the filtered thermochemical variable [12]:  $\overline{\text{RHS}(\Phi)} \neq \text{RHS}(\overline{\Phi})$ .

The concept of Chemistry OPtimized for LES (COPLES) is to identify a function RHS<sup>\*</sup>, which verifies the equality  $\overline{\text{RHS}(\Phi)} = \text{RHS}^*(\overline{\Phi})$ . The <sup>75</sup> following formulation of RHS<sup>\*</sup> is retained for that purpose:

$$\operatorname{RHS}^* = \nabla \cdot \left( \overline{\rho} \alpha^* \widetilde{D} \nabla \widetilde{Y}_k \right) + \overline{\rho} \widetilde{\dot{\omega}}_k^{\mathcal{A}^*}$$
(3)

with:

72

$$\overline{\rho}\widetilde{\omega}_{k}^{\mathcal{A}^{*}} = W_{i}\sum_{j=1}^{N_{R}} A_{j}^{*} \left(\nu_{kj}^{b} - \nu_{kj}^{f}\right) \\ \times \prod_{i \in \mathcal{S}_{j}} \left(\frac{\overline{\rho}\widetilde{Y}_{i}}{W_{i}}\right)^{n_{ij}^{*}} \exp\left(\frac{-E_{a,j}}{\mathcal{R}\widetilde{T}}\right)$$
(4)

where  $N_R$  is the number of reactions,  $S_j$  are the species involved in reaction j, and  $\nu_{kj}^b$ ,  $\nu_{kj}^f$  are respectively the backward and forward stoechio-<sup>78</sup> metric coefficients of species k in reaction j. Variables with \* superscripts are model parameters:  $\alpha^*$  is constant in space and identical for each species and  $\mathcal{A}^* = (A_j^*, E_{a,j}^*, n_{ij}^*)$  where  $A_j^*$  are the pre-exponential constants,  $E_{a,j}^*$ the activation energies and  $n_{ij}^*$  the reaction orders of the modeled chemical mechanism.

The parameters are optimized through a genetic algorithm [9, 11] to recover the properties of an ensemble made of N canonical 1-D target flames. The optimization process consists in minimizing the following function:

$$\zeta(\mathcal{A}^*, \alpha^*) = \sum_{n=1}^{N} \left( \frac{\|\widetilde{\varphi}_n^* - \widetilde{\varphi}_n^{ref}\|_2}{\|\widetilde{\varphi}_n^{ref}\|_2} + \beta \frac{|f_{\varphi,n}^* - f_{\varphi,n}^{ref}|}{f_{\varphi,n}^{ref}} \right)$$
(5)

where  $\varphi_n$  and  $f_{\varphi,n}$  are respectively the thermo-chemical spatial profile and <sup>87</sup> the specific global flame properties of the n-th 1-D flame targeted by the optimized scheme. Superscript *ref* and \* refer to the target flame and to the solution obtained with optimized parameters, respectively.  $\beta$  is a weighting parameter set to 1 in the present work.

The choice of the reference canonical flames is critical. The retained filtered archetype must be representative of the sub-grid turbulent flame struc-<sup>93</sup> ture encountered for various level of sub-grid flame wrinkling. As discussed in [20], the issue is to account for the influence of the subfilter flame front geometry on the pollutant formation at the resolved scale. Two archetypes <sup>96</sup> are discussed in the following section: the Filtered Planar Flames (FPF) and the Filtered Wrinkled Flamelets (FWF).

#### 2.2. Reference filtered flame archetypes

90

99 2.2.1. Optimization on Filtered Planar Flames (FPF)

The first solution to build-up the filtered optimized scheme is to isolate the impact of sub-grid scale wrinkling from the filtering process. The identification of diffusion and kinetic rate parameters is split in two steps.

i) A collection of 1-D freely propagating laminar flames is computed for various equivalence ratios  $\phi$  using a detailed chemical scheme and then filtered in the spatial dimension with a Gaussian filter of size  $\Delta$ . This collection of Filtered Planar Flames (FPF) provides the filtered reference thermo-chemical quantities  $\tilde{\varphi}_{\text{FPF}} = \tilde{\varphi}_{\text{FPF}}(x, \phi, \Delta)$  on which is trained the optimized scheme. This step leads to the identification of parameters  $\mathcal{A}_{\text{FPF}}^* = (\mathcal{A}_{j,\text{FPF}}^*, \mathcal{E}_{a,j,\text{FPF}}^*, n_{ij,\text{FPF}}^*)$  and  $\alpha_{\text{FPF}}^*$ , function of  $\phi$  and  $\Delta$  as shown in Tab. 1.

ii) The introduction of sub-grid scale flame wrinkling  $\Xi_{\Delta}$  is done *a posteriori* by multiplying pre-exponential constants and the diffusive correction coefficient by  $\Xi_{\Delta}$ :  $\mathcal{A}^* = (\Xi_{\Delta} A^*_{j,\text{FPF}}, E^*_{a,j,\text{FPF}}, n^*_{ij,\text{FPF}})$  and  $\alpha^* = \Xi_{\Delta} \alpha^*_{\text{FPF}}$ . This operation, which is common in many turbulent LES combustion model

- <sup>114</sup> [12, 14] does not affect the filtered flame structure but ensures that the filtered flame propagates at a speed  $S_{\Delta} = \Xi_{\Delta} S_l$ , where  $S_l$  is the unstretched laminar flame speed. However, as pointed out in [20], this assumption in-
- <sup>117</sup> cludes biases in the prediction of some pollutants, such as CO. To address this issue, wrinkling patterns can be included in the filtering process.
  - 2.2.2. Optimization on Filtered Wrinkled Flamelets (FWF)

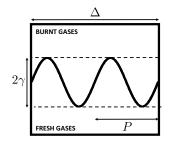


Figure 1: Schematical view of sub-filter sinusoidal flame pattern.

120 A 2-D wrinkled flame pattern, shown in Fig. 1, is manufactured by approximating the flame front position by a sinusoidal function of amplitude  $\gamma$  and wavelength P. Embedded in a 2-D square of size  $\Delta$ , this flame 123 pattern of wrinkling  $\Xi_{\Delta}$  contains a number of wavelengths  $n_{\Delta} = \Delta/P$ . Assuming that the flame is in the flamelet regime, the 2-D flame structure is manufactured from a 1-D laminar premixed flame computed with 126 detailed chemistry. The reconstruction algorithm as well as the possible physical range covered by wrinkling parameters  $\gamma$  and  $n_{\Delta}$  are detailed in 120]. The manufactured wrinkled flame is then 2-D filtered and, due to 129 the periodicity of the sine function, filtered thermo-chemical variables reduce to a single dimension x, perpendicular to the flame front propagation:  $\tilde{\varphi}_{\text{FWF}} = \tilde{\varphi}_{\text{FWF}}(x, \phi, \Delta, n_{\Delta}, \Xi_{\Delta})$ . The filtered database serves as an ensemble of targets for the filtered optimized scheme. This step leads to the identification of parameters  $\mathcal{A}^* = (\mathcal{A}^*_{j,\text{FWF}}, E^*_{a,j,\text{FWF}}, n^*_{ij,\text{FWF}})$  and  $\alpha^* = \alpha^*_{\text{FWF}}$ . The parameter dependencies of the new filtered optimized scheme are listed in Tab. 1. While the simplified approach to represent wrinkled flames neglects several physical phenomena, such as local variations in temperature due to turbulence, it has been shown to recover with reasonable accuracy the effect of sub-filter wrinkling on pollutants formation [20].

Table 1: Summary of Filtered Optimized Model with FPF and FWF flame libraries.

	FPF	FWF
$A_j^*$	$\Xi_{\Delta} A_{j,\mathrm{FPF}}^*\left(\phi,\Delta\right)$	$A_{j,\mathrm{FWF}}^{*}\left(\phi,\Delta,\Xi_{\Delta},n_{\Delta} ight)$
$E^*_{a,j}$	$E_{a,j,\mathrm{FPF}}^{*}\left(\phi,\Delta\right)$	$E_{a,j,\mathrm{FWF}}^{*}\left(\phi,\Delta\right)$
$n^*_{ij}$	$n_{ij,\mathrm{FPF}}^{*}\left(\phi,\Delta\right)$	$n_{ij,\mathrm{FWF}}^{*}\left(\phi,\Delta ight)$
$lpha^*$	$\Xi_{\Delta}\alpha_{\rm FPF}^{*}\left(\phi,\Delta\right)$	$\alpha_{\rm FWF}^*\left(\phi,\Delta,\Xi_{\Delta},n_{\Delta}\right)$

### 2.2.3. Influence of FPF and FWF archetypes on the filtered chemical flame structure

- FPF and FWF archetypes are both manufactured from a 1-D laminar premixed methane/air detailed chemistry solution obtained using the GRI3.0 mechanism [23] at an equivalence ratio  $\phi = 0.75$ . Filtered temperature and
- <sup>144</sup> CO mass fractions are plotted in Fig. 2. FWF solutions (lines) are shown for one flame pattern ( $n_{\Delta} = 1$ ) but for different values of sub-grid scale flame winkling. For  $\Xi = 1$ , the FWF profiles degenerate as expected towards the

<sup>147</sup> FPF solution (symbols). When the sub-grid scale flame wrinkling increases, the filtered thermal layer is thickened. Fig. 2 (right) shows that the CO peak is also enhanced by the sub-grid scale wrinkling. The total mass of CO <sup>150</sup> contained in the filter box of surface  $\Delta^2$  is:  $\mathcal{M}^{\Delta}_{CO}(\Xi_{\Delta}) = \int_{\Delta^2} \rho Y_{\text{CO}} ds$ .

The ratio  $\mathcal{M}_{CO}^{\Delta}(\Xi_{\Delta})/\mathcal{M}_{CO}^{\Delta}(\Xi_{\Delta}=1)$  is plotted in terms of  $\Xi_{\Delta}$  in Fig. 3 for two LES filter size values:  $\Delta = 4\delta_l^0$  and  $8\delta_l^0$ , where  $\delta_l^0$  is the laminar flame thickness. To avoid superposition of sine branches, the possible number of 153 flame patterns within the filter box is limited to  $n_{\Delta}^{max} = E[\Delta/2\delta_l^0]$ , where E[.]refers to the integer part of a number. The normalized mass of CO is therefore shown in Fig. 3 for all possible number of flame patterns  $(n_{\Delta} = (1, 2))$  for 156  $\Delta = 4\delta_l^0$  and  $n_{\Delta} = (1, 2, 3, 4)$  for  $\Delta = 8\delta_l^0$ ). A significant increase of CO mass is first observed when the SGS wrinkling grows. The mass of CO remains however lower than the value (dashed line) obtained under infinitely 159 thin flame front assumption:  $\mathcal{M}_{CO}^{\Delta}(\Xi_{\Delta}) = \Xi_{\Delta} \mathcal{M}_{CO}^{\Delta}(\Xi_{\Delta} = 1)$ . This is an effect due to the non-zero  $Y_{CO}$  equilibrium value [20]. Moreover,  $n_{\Delta}$  has little impact on the mass of CO. 162

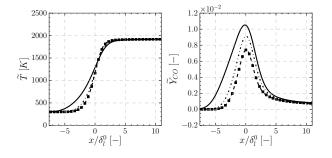


Figure 2: Illustration of the FPF and FWF flamelet libraries for  $\phi = 0.75$ ,  $\Delta = 4\delta_l^0$  and  $n_{\Delta} = 1$ . Legend:  $\blacksquare$  FPF flame. - - FWF flamelet with  $\Xi_{\Delta} = 1$ . - . - FWF flamelet with  $\Xi_{\Delta} = 1.5$ . — FWF flamelet with  $\Xi_{\Delta} = 2.4$ .

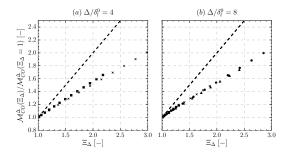


Figure 3: Normalized mass of CO in a subfilter box as a function of  $\Xi_{\Delta}$  for  $\phi = 0.75$ and two different filter sizes  $4\delta_l^0$  and  $8\delta_l^0$ . Squares:  $n_{\Delta} = 1$ . Crosses:  $n_{\Delta} = 2$ . Triangles:  $n_{\Delta} = 3$ . Circles:  $n_{\Delta} = 4$ . Dashed line: unitary line  $\mathcal{M}_{CO}^{\Delta}(\Xi_{\Delta}) = \Xi_{\Delta} \mathcal{M}_{CO}^{\Delta}(\Xi_{\Delta} = 1)$ .

#### 3. Filtered mechanism generation

In the present work, the COPLES method is applied to predict both the thermal flame structure, including heat release and flame propagation speed, and the CO production. The chemical scheme retained as a basis for the optimization procedure is based on the virtual chemistry concept [9, 10, 11]. This strategy relies on the optimization of a virtual mechanism composed of virtual reactions and virtual species whose properties are also optimized. The scheme is first made of the following two-step main virtual mechanism which converts  $CH_4$  and  $O_2$  into an intermediate species (I) which is then transformed through into a set of  $N_p$  virtual products  $P_k$ .

$$\alpha_{CH_4}CH_4 + \alpha_{O_2}O_2 \to \alpha_I I \tag{R1}$$

$$\alpha_I I \to \sum_{k=1}^{\kappa=N_p} \alpha_{P_k} P_k \tag{R2}$$

The number of virtual products (here  $N_p=4$ ) as well as the stoichiometric coefficients  $\alpha_{P_k}$  are optimized to retrieve real burnt gases temperature and enthalpy over the whole range of equivalence ratio conditions, as detailed in [11].  $\alpha_F$ ,  $\alpha_{Ox}$ ,  $\alpha_I$  are given by fuel composition.

<sup>177</sup> Complementary independent virtual sub-mechanisms are devoted to the prediction of real pollutant species such as CO, NOx or soot precursors (PAH). By dedicating each sub-mechanism to a unique pollutant prediction,
<sup>180</sup> this approach enables an efficient separation between slow and rapid chemical species. The following complementary virtual sub-mechanism is added

here to predict the CO mass fraction:

$$\alpha_F F + \alpha_{Ox} Ox \to CO \tag{R3}$$

$$CO \rightleftharpoons V_1$$
 (R4)

- where CO is the targeted pollutant species and  $V_1$  is a virtual species. Free Gibbs energy of reaction (R4) is identified to retrieve the CO mass fraction at equilibrium conditions [11].
- The COPLES method is then applied to optimize the molecular diffusion constant  $\alpha^*$  and the kinetics rate parameter  $\mathcal{A}^*$  required to close Eq. 3. As the main virtual mechanism is independent from the virtual CO sub-mechanism, the optimization process will be performed sequentially.

i) The diffusion constant  $\alpha^*_{Main}$  and kinetics parameters  $\mathcal{A}^*_{Main}$  of reactions (R1)-(R2) are first optimized to retrieve the temperature profile and the flame propagation speed over a wide range of sub-grid scale wrinkling conditions. The objective function introduced in Eq. 5 is therefore defined with  $\tilde{\varphi} = \tilde{T}(x)$  and  $f_{\varphi} = S_{\Delta}$ , where  $S_{\Delta}$  is the filtered flame consumption speed. Reference database is made of the filtered flame archetypes presented in section 2.2.

ii) Parameters  $\alpha_{CO}^*$  and  $\mathcal{A}_{CO}^*$  relative to reactions (R3)-(R4) are then optimized to retrieve the CO production and consumption. The same reference database is used with a different objective function:  $\tilde{\varphi} = \widetilde{Y}_{CO}(x)$  and  $f_{\varphi} = \operatorname{Max}(Y_{CO}).$ 

The optimized pre-exponential constant of (R3), written  $A_3^*$ , and the optimized parameter  $\alpha_{CO}^*$  obtained when using FPF and FWF flames as optimization targets are illustrated in Fig. 4 for a filter size  $\Delta = 4\delta_l^0$ . Both pre-exponential constant and diffusion factor differ rapidly as the sub-grid scale flame wrinkling increases.

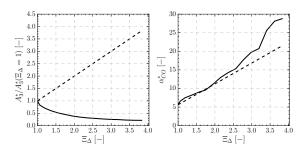


Figure 4: Evolution of  $A_3^*$  and  $\alpha_{CO}^*$  with the wrinkling factor for  $\Delta = 4\delta_l^0$  and  $n_{\Delta} = 2$ . Legend: - - COPLES-FPF model. — COPLES-FWF model.

#### 4. Results

#### 4.1. 1-D flame computations

207

To verify the realizability of COPLES modeling, filtered optimized schemes trained on FWF and FPF archetypes are used to compute 1-D planar fil-

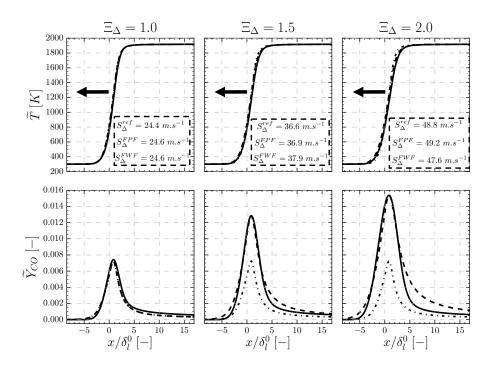


Figure 5: Evaluation of the performance of the COPLES modeling strategy on 1-D flames for an equivalence ratio  $\phi = 0.75$ .  $n_{\Delta}$  is set to 2 and  $\Delta$  to  $4\delta_l^0$ . Legend: — Reference flames. - . - COPLES-FPF model. - - - COPLES-FWF model.

tered premixed flames, wrinkled at the sub-grid scale, at an equivalence ratio  $\phi = 0.75$  and with  $n_{\Delta} = 2$ . Figure 5 shows that COPLES solutions match as desired the FWF archetypes for different values of wrinkling factor. Note that the case  $\Xi_{\Delta} = 1$  corresponds to a filtered laminar premixed flame.

<sup>213</sup> While the flame consumption speed added in Fig. 5 remains well predicted for all values of  $\Xi_{\Delta}$ , the COPLES-FPF does not capture the influence of the sub-grid scale flame wrinkling on the filtered flame structure.

#### 216 4.2. LES of a turbulent premixed burner: the Cambridge configuration.

The Cambridge SwB burner jointly studied at Cambridge University and Sandia laboratories [21] is selected to challenge the proposed LES combustion <sup>219</sup> model. The burner is composed of a central bluff-body and two concentric annular tubes in which  $CH_4$ /air mixtures are flowing. In the retained operating conditions, a mixture with mean velocity  $U_i = 8.31$  m/s and equivalence <sup>222</sup> ratio  $\phi_i = 0.75$  flows in the inner tube while a mixture of mean velocity  $U_o = 18.7$  m/s and equivalence ratio  $\phi_o = 0.75$  flows through the outer one. The burner is isolated by a large co-flow with mean velocity  $U_{cf} = 0.4$  m/s. <sup>225</sup> Details about the burner can be found in [21].

The YALES2 low-Mach number solver [24] is retained to solve the conservation equations. It features a fourth-order finite volume discretization and a fourth-order time integration using an explicit temporal scheme. An unstructured mesh containing 6 Million nodes and with a mesh size  $\Delta_x =$ 0.5 mm within the flame front is used. The flow field is transported using a standard low Mach formulation for the equations along with the Sigma model [25] for Reynolds sub-grid stresses.

The tested turbulent combustion models tested are the dynamic TFLES <sup>234</sup> [14] and the COPLES models. The virtual chemical schemes described by reactions (R1)-(R2) and (R3)-(R4) are selected for chemistry modeling. COPLES schemes are optimized on either FPF or FWF archetypes, accord-

- <sup>237</sup> ingly to section 2.2. A simple model has been derived for  $n_{\Delta}$  in [20] by assuming infinitely thin flame front. Recent simulations of the Cambridge configuration performed using tabulated chemistry based on FWF archetypes
- however showed a small influence of  $n_{\Delta}$  on the LES solutions [20].  $n_{\Delta}$  is hence

set constant to 2 in the simulations. The filter size retained to generate the reference database is  $\Delta = 4\delta_l^0$ , enabling a resolution of 5 nodes across the

flame reaction zone. The corresponding TFLES thickening factor is approximately 5 throughout the flame front. The wrinkling factor is computed using the modified Charlette model [26]. In accordance with previous studies of the Cambridge burner [27], the fractal dimension is set to β = 0.5.

Instantaneous 2-D views of CO mass fraction predicted by both COPLES-FPF and COPLES-FWF simulations are qualitatively compared in Fig. 6

- (left). The amount of CO mass fractions predicted by COPLES-FPF in the reactive layer remains identical for all axial positions. A similar quantity of CO produced is found in COPLES-FWF simulation in the vicinity of the
- <sup>252</sup> bluff body. However, the amount of CO predicted by the COPLES-FWF simulation significantly increases in the downstream direction, from 2 cm above the burner exit. This enhancement of CO production is due to the <sup>255</sup> sub-grid scale flame wrinkling, as shown in Fig. 6 (right).

To obtain statistics, filtered temperature and species mass fraction are averaged over 6 flow through times. Means of filtered functions can be compared to means of non-filtered experimental data when the mean flame brush is much higher than the filter size [28]. However, as the mean flame brush is here close to the LES filter size for z < 30mm, the mean experimental quantities cannot be directly compared to simulated means. The experimental profiles are then first filtered with the LES filter at the filter size  $\Delta = 4\delta_l^0$ . As thermo-chemical quantities gradients are dominated by radial contributions, filtering is done in 1-D on the radial axis. This approach is justified by the fact that experimental probes averaging volumes are much smaller than  $\Delta$  (temperature and major species measurements are limited by the sampling resolution of 103  $\mu$ m and the laser beam diameters of 0.22 mm [21]) and the LES filtering hence predominates. The impact of filtering on both mean experimental profiles of temperature and CO mass fraction is significant as shown in Fig. 7 for axial position z=10mm.

Fig. 7 shows the mean temperature and the mean CO mass fractions at different axial positions z in the burner. Agreement on the mean temperature is fair for any of the turbulent combustion models, with only slight discrepancies on the flame opening angle. Pronounced differences between models are observed for mean  $\tilde{Y}_{CO}$ . TFLES modeling significantly overestimates the CO mass fraction at all the axial positions. This overestimation of intermediate species profiles by the thickening operator is inherent to the TFLES approach, as discussed in [9, 20]. Filtered Optimized Chemistry improves

<sup>279</sup> significantly the peak of CO prediction. COPLES-FPF and COPLES-FWF give similar results below z=30 mm, where the flame wrinkling is moderate. However, for z=40 mm and z=50 mm, the introduction of wrinkling in
<sup>282</sup> filtered flame structure improves significantly predictions.

Predicted profiles are however thinner than experimental data. These discrepancies may be attributed to differential diffusion effects, significant in this configuration [29], but which are not captured in the present virtual mechanism formulation. Measurements show that differential diffusion implies an increase of the atomic equivalence ratio from 0.75 to 0.8 across the flame front[29]. As more CO is produced when  $\phi = 0.8$ , experimental profiles are expected to be higher than simulations, as observed in Fig. 7.

The following post-processing aims at removing the error induced by the

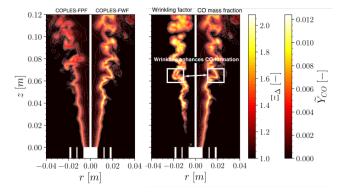


Figure 6: 2-D instantaneous fields on the plane  $\theta \equiv 0$  [ $\pi$ ]. Left: comparison between  $\widetilde{Y}_{CO}$  field obtained with COPLES-FPF (left) and COPLES-FWF (right) models. Right: comparison between  $\Xi_{\Delta}$  (left) and  $\widetilde{Y}_{CO}$  (right) from COPLES-FWF simulations.

<sup>291</sup> omission of differential diffusion effects in the present simulations. The mass of CO per unit of axial length is computed for that purpose in cylindrical coordinates as follows:

$$\mathcal{I}_{CO}^{z=z_0} = \int_{\theta=0}^{2\pi} \left( \int_{r=0}^{R} r\{\widetilde{Y}_{CO}\}(r,\theta) \mathrm{d}r \right) \mathrm{d}\theta \tag{6}$$

where {.} refers to Favre averaging in time and R is a radius covering the entire reaction zone up to the co-flow where  $\tilde{Y}_{CO}$  vanishes. Experiments show that the equivalence ratio variation along r induced by differential diffusion, remains roughly identical at any axial locations [29]. By selecting as a reference the plane located at z = 10mm, where the sub-grid scale flame wrinkling is resolved ( $\Xi_{\Delta} \approx 1$ ), the relative mass of CO per unit of axial length is therefore defined as  $\delta \mathcal{I}_{CO}^z = \mathcal{I}_{CO}^z - \mathcal{I}_{CO}^{z=10mm}$ .  $\delta \mathcal{I}_{CO}^z$  is plotted against z for experimental data and each of the simulations in Fig. 8. While TFLES over-estimates the CO integral evolution, the model featuring lami-

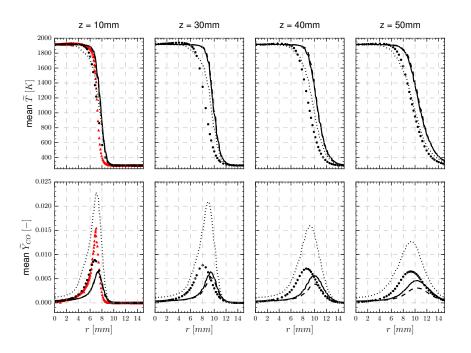


Figure 7: Radial profiles of mean  $\tilde{Y}_{CO}$ . Black circles: filtered experimental data. Red triangles: non filtered experimental data (shown for z=10mm). Dotted lines: TFLES model. Dashed lines: COPLES-FPF. Plain lines: COPLES-FWF.

<sup>303</sup> nar premixed flames as optimization targets under-estimates it because the influence of growing sub-grid scale flame wrinkling is not considered. Adding the wrinkling influence in the target flame archetype leads to an excellent
 <sup>306</sup> agreement with experimental data.

### 5. Conclusion

A new methodology developed to model the influence of sub-grid scale <sup>309</sup> wrinkling on flame structure initially developed in a tabulated chemistry context [20] has been extended to transported chemistry. Conservation equations are re-written with optimized Arrhenius coefficients and molecular diffusion

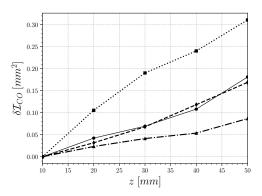


Figure 8: Integral of CO mass fractions  $\mathcal{I}_{CO}$  in planes  $(r, \theta)$  as a function of the axial positions z. Legend: •--• Experimental data.  $\blacktriangle - \cdot - \bigstar$  COPLES-FPF model.  $\blacklozenge - - \diamondsuit$  COPLES-FWF model.  $\blacksquare \cdot \cdot \cdot \blacksquare$  TFLES model.

- factor to retrieve a set of reference flames. Two approaches have been stud-312 ied. In a first case, the optimization is done by targeting laminar premixed flames and including wrinkling with the standard technique. A second possibility is to optimize coefficients on the newly developed 2-D manufactured 315 wrinkled flames proposed in [20]. The simulation of a 3-D turbulent premixed burner has shown a significant advantage of the models based on optimization over a classical TFLES model which tends to over-estimate CO quantities. 318 Moreover, adding the influence of wrinkling thanks to the FWF archetype improves significantly the results quality. Discrepancies observed between LES and experiments are attributed to the omission of preferential species 321 transport in the model, which has a significant influence on the chemical structure of the turbulent flame configuration investigated here [29]. Future
- <sup>324</sup> work will aim at improving the optimization of molecular diffusion in order to include these complex transport phenomena in the Filtered Optimized

Chemistry model.

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