

# Numerical Generation of Multidimensional Flamelet Databases using an Adaptive Wavelet Method

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## Abstract

The Wavelet Adaptive Multiresolution Representation (WAMR) code is used for the numerical time integration of the one-dimensional laminar diffusion flames equations in trans-critical and supercritical conditions, where the thermodynamic and transport properties exhibit large changes. These steep gradients are efficiently captured by the WAMR algorithm with an a-priori defined accuracy and an associated large reduction of the number of degrees of freedom, allowing a highly efficient flamelet database generation for flows which usually operate under supercritical and near-critical conditions.

*Keywords:* Flamelet, Wavelet, Supercritical

## Introduction

The requirement of high performance in liquid rockets and diesel engine combustion can be achieved by increasing the pressure in the combustion chamber. This could lead to the injection of oxidizer and/or fuel at pressure and temperature values exceeding the critical point. Beyond this point the fluid is in supercritical thermodynamic conditions. In trans-critical and near-critical conditions the thermodynamic and transport properties are characterized by abrupt variations.

In this context a study of the one-dimensional laminar diffusion flames for non-premixed combustion at high pressure conditions is proposed. Their behaviour have been deeply investigated by Kim et al. [1, 2] using a direct approach, where the solution is given in the mixture fraction space. By following this approach, they performed steady-state analysis for kerosene/LOx rocket combustion [1] and hydrogen/liquid oxygen [2] in supercritical states. Unsteady effects of non-premixed methane/oxygen flame structures at supercritical pressures have been instead explored by Lapenna et al. [3], choosing an arbitrary non-uniform grid suitably compressed towards the oxidizer side, where higher resolution is required to capture the steep gradients characterizing the solution. The main purpose of the current work is to overcome this limitation, by using a wavelet-based collocation method to build a dynamically adaptive grid using a mathematical method for the selection of the grid points that ensures an a-priori prescribed accuracy.

The Wavelet Adaptive Multiresolution Representation (WAMR) code [4, 5] is the framework used in this work to generate steady-state solutions of one-dimensional flamelet equations. This method has been implemented by Grenga [6] for massive parallel application on high performance computing and it was also verified [5, 7] for a wide range of test cases - compressible and incompressible flows described by reacting Navier-Stokes equations in primitive variables in 1-, 2- and 3-D geometries. WAMR is particularly suited for the solution of multidimensional continuum physics problems having a strong multiscale character. It generates a dynamically adaptive grid able to capture any desired accuracy, and produces an automatically verified solution. In addition, the efficient implementation minimizes the memory footprint and the computing time, reducing the required computational resources.

Using the WAMR algorithm to determine the dynamically adaptive grid for the flamelet problem, the computational cost is expected to be largely reduced: steep gradients are well captured by the algorithm, with a relative reduced number of grid points and a consequent extreme reduction of the computational cost. Therefore, accurate chemical kinetic mechanisms involving a large number of chemical species and reactions can be used to solve flamelet problems. Furthermore, more complex and expensive Equations of State (EoS) can be adopted to better describe the fluid behaviour in non-ideal conditions.

These features allow the generation of multidimensional flamelet databases for high-pressure combustion devices which usually operate under supercritical con-

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Proceedings of the European Combustion Meeting 2019

ditions. Small size databases will be obtained through the WAMR algorithm. It will optimize the tables along multiple directions, like for example mixture fraction, pressure and scalar dissipation rate.

### The wavelet representation

In this context, a dyadic structure of the grid is used to build adaptive grids through the wavelet-based collocation method. Following this methodology, the function values can be reconstructed as the sum of wavelet functions, where their amplitudes represent the difference between the actual value of the function and the one obtained through wavelet interpolation at the corresponding resolution level. This difference represents the local error; it decreases increasing the wavelet interpolation order and/or increasing the number of refinement levels because of a better reconstruction of the function value is obtained. The adaptive grid is built looking at the values of the wavelet amplitudes: if they are lower than an a-priori user-prescribed threshold parameter  $\varepsilon$  the grid point is simply removed, otherwise it becomes a point requested for the wavelet representation, namely an essential point. The final grid will be only composed by essential, neighbouring and non-essential points: the solution is advanced only on the essential and neighbouring points, while the non-essential points are included to complete stencils needed in various operations on the sparse grid. Complete details about the grid constructions can be found in the work of Grenga [6] and Wirasaet [8].

### The flamelet model

The unsteady flamelet equations taken by Pitsch and Peters [9] are considered for adiabatic case, at constant pressure and unity Lewis number,

$$\frac{\partial Y_i}{\partial t} = \frac{\chi}{2} \frac{\partial^2 Y_i}{\partial z^2} + \frac{\dot{\omega}_i}{\rho} \quad i = 1, \dots, N_s \quad (1)$$

$$\frac{\partial T}{\partial t} = \frac{\chi}{2} \frac{1}{c_p} \frac{\partial^2 h}{\partial z^2} - \frac{\chi}{2} \frac{1}{c_p} \sum_{k=1}^{N_s} h_k \frac{\partial^2 Y_k}{\partial z^2} - \frac{1}{\rho c_p} \dot{\omega}_T \quad (2)$$

where  $t$  is the time,  $Y_i$  represents the mass fractions of the  $i$ -th species,  $\chi$  is the scalar dissipation rate,  $z$  is the mixture fraction variable,  $\dot{\omega}_i$  is the production rate for the  $i$ -th species due to chemical reactions,  $\rho$  is the density,  $T$  is the temperature,  $c_p$  is the specific heat at constant pressure,  $h$  is the enthalpy of the mixture,  $N_s$  is the total number of mixture components,  $h_k$  is the enthalpy of the  $k$ -th species, and  $\dot{\omega}_T = \sum_{k=1}^{N_s} h_k \dot{\omega}_k$  is the rate of

enthalpy production due to the variation in the composition of the mixture. The scalar dissipation rate is expressed as a function of the mixture fraction as shown by Girimaji [10],  $\chi = \chi_{max}^0 \exp(-2\text{erfc}^{-1}(2z))^2$ .

The flamelet equations are solved considering the  $\text{CH}_4/\text{O}_2$  RAM accelerator kinetic mechanism (RAMEC) Petersen et al. [11], taking into account 38 chemical species and 190 reactions.

### Real gas equation of state

In this work the three-parameters Redlich-Kwong/Peng-Robinson (RK-PR) [12] EoS is used to evaluate the thermodynamic properties of the fluid: this choice allows to have an accurate representation of the real fluid properties in an efficient way [1].

It takes the form

$$p = \frac{\rho R_u T}{M_w - b\rho} - \frac{a\alpha(T)\rho^2}{(M_w + \delta_1 b\rho)(M_w + \delta_2 b\rho)} \quad (3)$$

where  $p$  is the pressure,  $R_u$  is the universal gas constant and  $M_w$  is the molecular weight. Through the parameters  $a$  and  $b$  the effects of the attractive and repulsive van der Waals forces are considered in the model, respectively; these parameters are functions of the thermodynamic variables at critical conditions (temperature and pressure,  $T_c$  and  $p_c$ ) and of the third parameter  $\delta_1$ . They can be found also in the two-parameter cubic SRK (Soave-Redlich-Kwong) EoS and PR (Peng-Robinson) EoS, where  $\delta_1$  is instead an assigned constant. The additional degree of freedom of RK-PR EoS introduced by [12],  $\delta_1$ , (note that  $\delta_2 = f(\delta_1)$ ) leads to a better description of the fluid behaviour in terms of density, with respect to the two-parameter cubic SRK EoS and PR EoS usually used. Finally,  $\alpha(T)$  is a temperature correction factor taking into account the polarity of the species, it depends on the reduced temperature (defined as  $T/T_c$ ) and an acentric factor. Exhaustive description of RK-PR EoS including the definitions of all parameters can be found in Cismondi et al. [12].

For a multi-components mixture the RK-PR EoS (3) is defined using conventional mixing rules, details are accurately described in Kim et al. [1, 2].

### Validation of the thermodynamic properties

The thermodynamic properties based on the RK-PR EoS are here compared to the data taken from the National Institute of Standard and Technology (NIST) database [13], considering a pure methane compound, whose critical temperature is  $T_{c,\text{CH}_4} = 190.564$  K. Figures 1-2 show the values of  $\rho$  and  $c_p$  for different values of the pressure, in the temperature range 100–400 K: for

$T \geq T_c$  the fluid is in supercritical conditions. The continuous lines, representing the simulations results, are in good agreement with the reference data, represented by the dots, even if slight errors are present in the zone where there is a transition from subcritical to supercritical conditions. These inaccuracies are attributed to the limitations of the RK-PR EoS, although it provides a more accurate modelling of the density in comparison with the two-parameter EoS. Comparison data for the two-parameter EoS are provided in the study of Kim et al. [1] for saturated hydrocarbons with varying carbon number: the SRK EoS seems to well predict the density for species having a higher critical compressibility factor, instead the PR EoS works better for the larger hydrocarbons characterized by lower critical compressibility factors.

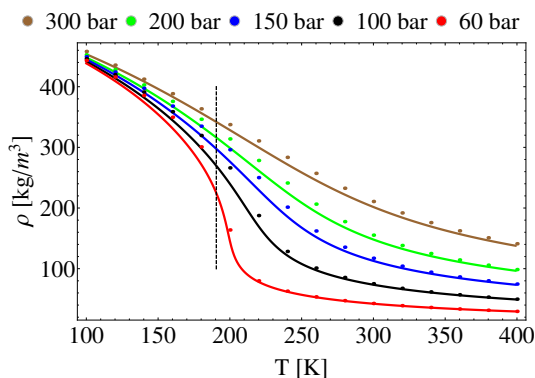


Figure 1: Density at different pressure and temperature values; the dots represent the NIST data, while the continuous lines are the values from RK-PR EoS; the dashed line represents the critical temperature for methane,  $T_{c,CH_4} = 190.564$  K.

## Results and discussion

The flamelet equations are initially integrated for  $p = 60$  bar and  $\chi_{max}^0 = 200$  s<sup>-1</sup>, choosing  $\varepsilon = 10^{-3}$  and sixth-order wavelet functions. The critical pressures and temperatures are  $p_{c,CH_4} = 45.992$  bar and  $T_{c,CH_4} = 190.564$  K for the methane,  $p_{c,O_2} = 50.430$  bar and  $T_{c,O_2} = 154.581$  K for the oxygen [13]. The oxygen and methane are injected at temperatures equal to  $T_{O_2}^{in} = 120$  K and  $T_{CH_4}^{in} = 1346$  K, so they are in liquid-like state and supercritical state, respectively.

The time integration of the flamelet equations is performed through DVODE and the steady-state is supposed to be reached when the root mean square (RMS) of the equations right hand side (RHS) becomes lower than a fixed prescribed minimum value. The steady-state solution is represented in Fig. 3 in terms of tem-

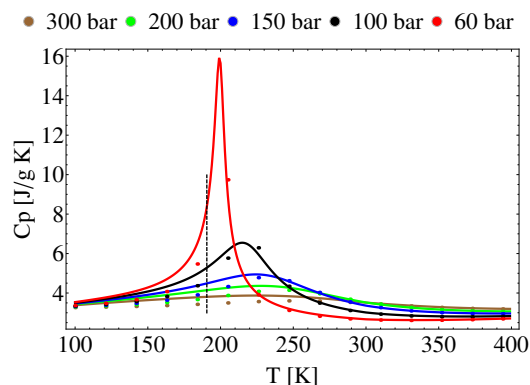


Figure 2:  $c_p$  at different pressure and temperature values; the dots represent the NIST data, while the lines are the values from RK-PR EoS; the dashed line represents the methane critical temperature for methane,  $T_{c,CH_4} = 190.564$  K.

perature: the number of grid points, at the chosen space accuracy, is 80.

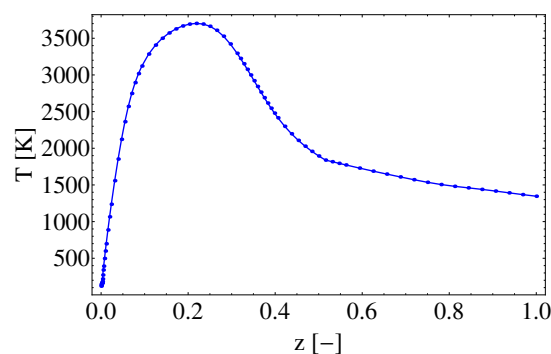


Figure 3: Steady-state solution - temperature for a wavelet threshold parameter  $\varepsilon = 10^{-3}$ .

A tool to show the efficiency of the wavelet compression is represented by the compression degree  $\pi$  defined as the ratio between the number of grid points of the adaptive mesh and a reference uniform grid having the same minimal spacing. In the current test, the compression ratio is equal to  $\pi \approx 98\%$ . A large grid points concentration is present in the vicinity of  $z = 0$ , where the maximum reached resolution level is  $L = 8$ : here strong variations of the  $c_p$  are present, as shown in Figs. 4-5. This result highlights the excellent capability of the wavelet method to well capture strong variations of the variables, adding grid points at higher resolution levels to ensure the achievement of the prescribed accuracy.

The computational cost associated with the evaluation of the thermodynamic properties in near-critical

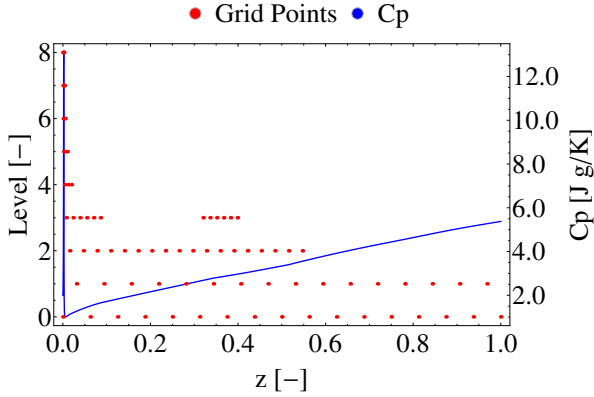


Figure 4:  $c_p$  and grid points at different resolution levels; the wavelet threshold parameter is  $\varepsilon = 10^{-3}$ .

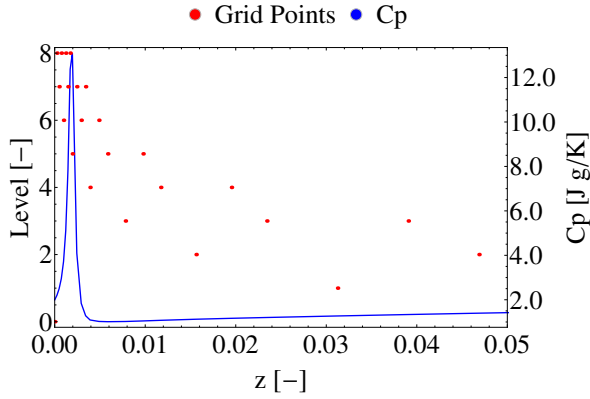


Figure 5:  $c_p$  and grid points at different resolution levels for  $z = 0 - 0.05$ ; the wavelet threshold parameter is  $\varepsilon = 10^{-3}$ .

and supercritical state according with RK-PR EoS represents approximately the 95 % of the requested time to compute the RHS of Eqs. 1-2. The result can be justified by the highly expensive combination rules adopted to evaluate the thermodynamic properties through the RK-PR EoS for a multi-component mixture. Because of the RHS has to be evaluated in each point of the grid, the use of an adaptive grid allows to reduce substantially the total computational time needed to reach the steady-state.

Table 1 summarizes the results of different simulations, for  $p = 60$  bar,  $\chi_{max}^0 = 200$  s $^{-1}$  and  $\varepsilon$  varying from  $10^{-2}$  to  $10^{-4}$ : a decrease of the threshold parameters corresponds to an upward trend of the number of grid points  $N_p$ ,  $L$  and  $\pi$ . Indeed, higher resolution levels have to be added in order to obtain more accurate representations of the solution. In particular, Fig. 6

shows how the solution representation changes in the three cases looking at the temperature in the vicinity of  $z = 0$ , where the maximum resolution level is typically reached because of the extreme variations of the  $c_p$ . Figure 6 shows clearly that using  $\varepsilon = 10^{-2}$  the wavelet-based algorithm will capture only the temperature trend in the range  $z = 0 - 5 \times 10^{-3}$ ; conversely, in the cases with  $\varepsilon = 10^{-3}$  and  $\varepsilon = 10^{-4}$  WAMR automatically refines the grid, the triangular symbols represent the added points, capturing also the relatively small temperature variations.

$\varepsilon$	$L$	$N_p$	$\pi$
$10^{-2}$	2	35	$\approx 54\%$
$10^{-3}$	8	80	$\approx 98\%$
$10^{-4}$	11	114	$\approx 99\%$

Table 1: Maximum resolution level, number of grid points and compression ratio with respect to the threshold parameters, with  $p = 60$  bar and  $\chi_{max}^0 = 200$  s $^{-1}$ .

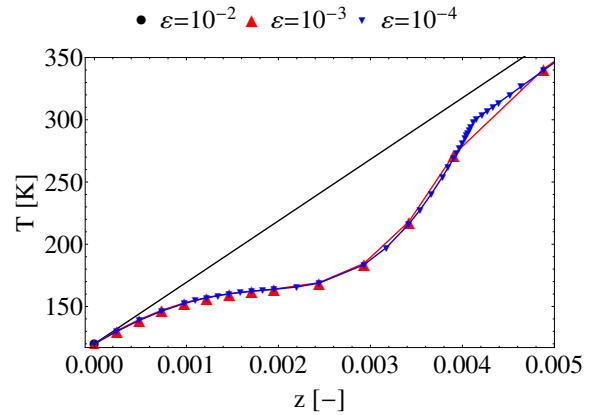


Figure 6: Temperature with respect to the mixture fraction for three threshold parameters, with  $p = 60$  bar,  $\chi_{max}^0 = 200$  s $^{-1}$ .

The pressure effects on steady-state solutions have been investigated in the range  $p = 60 - 160$  bar, with  $\chi_{max}^0 = 100$  s $^{-1}$ . Sixth order wavelet functions and a threshold equal to  $\varepsilon = 10^{-3}$  are again used for the wavelet representation. By increasing the pressure, an upward trend for maximum temperature and CO concentration can be observed in Figs. 7-8. Table 2 shows the variation of the maximum resolution with respect to pressure: higher values of the compression ratio are reached for  $p = 60$  bar. This is due to a localized-high temperature variation in the vicinity of  $z = 0$ , that the wavelet-based method is able to accurately capture: the largest number of grid points is concentrated near  $z = 0$ .

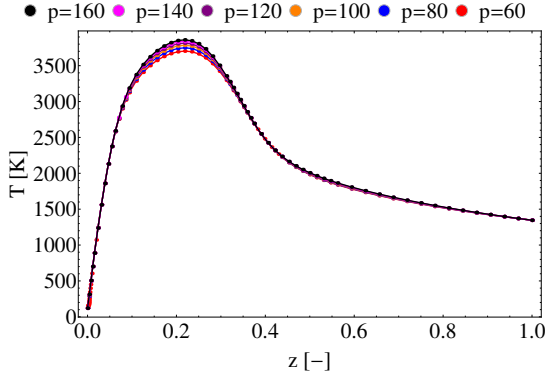


Figure 7: Temperature with respect to the mixture fraction in the pressure range  $p = 60 - 160$  bar, with  $\chi_{max}^0 = 200 \text{ s}^{-1}$ ; the threshold parameter is  $\varepsilon = 10^{-3}$  and the wavelet order is 6.

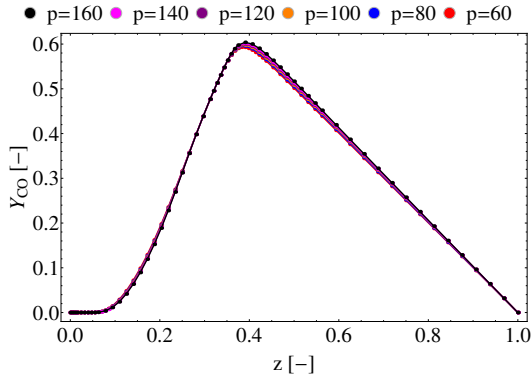


Figure 8:  $Y_{CO}$  with respect to the mixture fraction in the pressure range  $p = 60 - 160$  bar, with  $\chi_{max}^0 = 200 \text{ s}^{-1}$ ; the threshold parameter is  $\varepsilon = 10^{-3}$  and the wavelet order is 6.

$p$ (bar)	$L$	$N_p$	$\pi$
60	8	80	$\approx 98\%$
80	4	63	$\approx 68\%$
100	4	63	$\approx 68\%$
120	4	63	$\approx 68\%$
140	4	63	$\approx 68\%$
160	4	61	$\approx 68\%$

Table 2: Maximum resolution level, number of grid points and compression ratio with respect to pressure.

## Conclusions and future work

The WAMR framework has been used to generate steady-state solutions of the flamelet equations in near-critical and supercritical conditions, using the RAMEC kinetic mechanism. To well describe the fluid behaviour at these conditions, the three-parameters RK-PR EoS

has been adopted. The features of the method and the main achievements can be summarized as:

- The density and  $c_p$  of the methane at different pressures and temperatures have been evaluated through the RK-PR EoS. These results are in good agreement with reference data.
- By fixing the pressure ( $p = 60$  bar), the scalar dissipation rate ( $\chi_{max}^0 = 200 \text{ s}^{-1}$ ) and the threshold parameter ( $\varepsilon = 10^{-3}$ ), the capability of the wavelet method to well capture strong variations of the solutions has been shown: grid points are added only where higher resolution levels are required to ensure the achievement of the prescribed accuracy. The excellent capability of the wavelet compression with respect to a reference uniform grid having the same minimal spacing has been shown evaluating the compression degree, equal to  $\pi = 98\%$ .
- The evaluation of the thermodynamic properties at grid points in near-critical and supercritical conditions is particularly expensive. The associated computational time represents the 95% of the total computational time requested for the RHS evaluation at each grid point. By using dynamically adaptive grids the number of DOFs is extremely reduce with respect to a reference uniform grid having the same minimal spacing. As a result, the time integration of the flamelet equations results much less expensive.
- By increasing the values of the threshold parameters from  $\varepsilon = 10^{-2}$  to  $\varepsilon = 10^{-4}$ , higher refinement levels are reached, more grid points are added and the compression ratios are larger. Furthermore, smaller solution variations are well captured with smaller threshold parameters.
- Finally, the pressure effects on steady-state solutions have been investigated, fixing  $\varepsilon = 10^{-3}$ ,  $\chi_{max}^0 = 100 \text{ s}^{-1}$  and varying the pressure from  $p = 60 - 160$  bar. Higher resolution levels are only reached in the vicinity of the critical conditions of the mixture, i.e. where the  $c_p$  variations are larger.
- This work represents the first step to build the multidimensional tabulated flamelets through the use of the wavelet-based collocation method. They will be obtained through the simulation at different conditions (e.g., pressure and scalar dissipation rate). The wavelet method will be also used

to determine if it is necessary to perform the simulation for given  $p$  and  $\chi_{max}^0$  in order to obtain a multi-dimensional table with the defined accuracy. Preliminary results have been just obtained for the range  $p = 60 - 160$  bar and  $\chi_{max}^0 = 100 - 4000$  s<sup>-1</sup>.

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## Acknowledgements

The present work has been supported by the Italian Ministry of Education, University and Research (MIUR) and the Institute for Combustion Technology (RWTH Aachen University).

Funding from of the European Research Council (ERC) under the European Unions Horizon 2020 research and innovation program under grant agreement No 695747 is acknowledged.

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