

12th U.S. National Combustion Meeting
Organized by the Central States Section of the Combustion Institute
May 24–26, 2021 (Virtual)
College Station, Texas

An *in situ* adaptive tabulation based approach to multi-component transcritical flow simulation

Hongyuan Zhang¹ and Suo Yang^{1,}*

¹*Department of Mechanical Engineering, University of Minnesota – Twin Cities, Minneapolis, MN 55455, USA*

^{*}*Corresponding author: suo-yang@umn.edu*

Abstract: The studies of transcritical and supercritical flow have attracted much interest in the past 30 years. However, most of them mainly focus on the single-component system, whose critical point is constant. We use the vapor-liquid equilibrium (VLE) theory to capture the thermodynamic properties of the mixture and investigate transcritical flows (i.e., supercritical CO₂ oxy-combustion systems). In sCO₂ oxy-combustion systems, due to the presence of water from the previous cycles, the mixture critical point increases significantly, such that the phase separation could occur in both the compressor and combustor. However, the VLE solver increases the computation cost of fluid simulation significantly, which limited the size of simulations we can conduct. Naturally, tabulation methods can be used to store the VLE solutions to avoid redundant computation. However, the size of the VLE table increases exponentially with respect to the number of components. When the number of species components is greater than three, the size of the VLE table far exceeds the RAM's limit in today's standard computers. In this research, an online tabulation method based on In Situ Adaptive Tabulation (ISAT) is developed to accelerate the computation of multicomponent fluids based on VLE theory. Accuracy and efficiency are analyzed and discussed. The CFD solver used in this research is based on the Pressure-Implicit with Splitting of Operators (PISO) method. Peng-Robinson equation of state (EOS) is used in the calculations of phase equilibrium.

Keywords: *in situ adaptive tabulation (ISAT), transcritical flow, vapor-liquid equilibrium (VLE), sCO₂ oxy-combustion system, phase separation*

1. Introduction

The demand for high-performance combustor increases the chamber pressure continuously, which makes the working condition of some high-pressure combustors overlap with the supercritical region of fuel and/or oxidizer. The injection and mixing process is very different between subcritical and supercritical condition [1, 2], which could affect the cold ignition in combustors. To understand the subcritical and supercritical mixing process, a simulation tool is needed. Since supercritical region is far from the ideal gas region, real-gas effect needs to be considered to capture correct behavior. In addition, transcritical and supercritical fluid behavior can be peculiar because of the large variation of thermophysical properties such as density and specific heat near the critical point. As a result, the Computational Fluid Dynamics (CFD) modeling of supercritical flows is very challenging. Since small changes in temperature and pressure can have large effects on the structure of a fluid near the critical point, local properties are very important. Furthermore, a

Sub Topic: Particulates and Multiphase Flows

supercritical fluid lacks surface tension, which means the modeling transcritical flow needs to capture the surface tension change when the fluid goes across phase boundary. This makes simulation of transcritical flow more challenging than supercritical flow.

The studies of transcritical and supercritical injection and mixing have attracted much interest in the past 30 years. However, most of them were mainly concentrated on single component system, whose critical point is a constant value. As long as the fluid exceeds itself critical point, it goes into the supercritical state, and the classical “dense-fluid” approach is used with the assumption of a single-phase [3]. Since the real mixture critical pressure could be significantly higher than the critical pressure of each component [4], the accurate mixture critical point needs to be obtained.

Recently, some works focus on the simulation of multicomponent transcritical flow, capturing the phase separation at high pressure. To capture phase separation, most works use the vapor-liquid equilibrium (VLE) theory. Yao, et al. developed a fluids solver based on VLE to investigate the impact of diffusion models of a laminar counterflow flame at trans and supercritical conditions [5]. In Ray’s work, VLE theory is used to understand fuel droplets evaporation at high pressures [6]. A similar framework is also used in P. Tudisco’s works to understand the effect of Lewis number [7].

However, all these works are limited to two-component transcritical flow simulation. The VLE solver brings huge amount of computation cost, which limits the simulation of complex geometry, multicomponent flow. To reduce the computational cost, Tudisco, et al. interpolates the thermodynamic properties from cell-centers to cell-interfaces [8], but still can not accelerate the computation at cell-centers. Yi, et al. used a tabulation method to avoid computing of VLE model. However, the table size grows exponentially (table size M^N , M is the number of grid in the table; N is the number of components). For a flow with 4 components, table size will need several Terabyte, which makes this method completely unsuitable for combustion and many other practical problems.

In this work, we coupled *In Situ* Adaptive Tabulation with the transcritical fluid solver, to accelerate computation. Due to the ISAT method constructs the table during the computation, it only stores the necessary data, which only requires a small amount of computer storage, and achieve high computational speed [9]. The new solver with ISAT gained a great computational speed improvement.

2. Numerical Modeling

2.1 Models of thermodynamic and transport properties

In this study, We use VLE solvers to capture the phase change and determine the critical point of multicomponent mixture in transcritical flow. VLE describes the phase equilibrium between liquid and vapor phases. Solving the set of VLE equations gives the phase fraction and compositions in the two phases. If the gas mole fraction (i.e., the mole fraction of vapor phase) is equal to 1 or 0, then the system is in a purely gaseous or liquid phase, respectively. If the system falls into the two-phase region, gas fraction will be between 0 and 1, and an equilibrium between vapor and liquid will be observed. If at certain conditions, thermodynamic properties become identical between liquid and gas, it indicates the occurrence of transcritical transition from a subcritical state to a supercritical state (which could be a liquid-like or gas-like state). The fluid solver that we implemented is coupled with isobaric and isenthalpic (PHn) flash solver[10]. PHn flash and almost all other VLE solvers, are developed based on TPn flash. Specifically, PHn flash solves the VLE

Sub Topic: Particulates and Multiphase Flows

equation set at given enthalpy (H) rather than temperature. TPn flash is the most basic VLE solver, which solves the set of VLE equations at given temperature (T), pressure (P), and mole fraction of each component (n) in the system.

Isothermal and isobaric (TPn) flash: VLE is governed by fugacity equality Eq. (1) and Rachford-Rice equation [11] Eq. (2), which is an additional constraint to the equilibrium solver as used in Saha and Carroll [12] and obtained from the conservation of each component.

$$f_{i,l}/f_{i,g} = 1 \quad (1)$$

$$\sum_{i=1}^N \left\{ z_i (1 - K_i) \left/ [1 + (K_i - 1) \psi_g] \right. \right\} = 0 \quad (2)$$

$$K_i = y_i/x_i \quad (3)$$

$$\sum_{i=1}^N x_i = \sum_{i=1}^N y_i = 1 \quad (4)$$

where $f_{i,p}$ is the fugacity of component i in phase p ($p = l$: liquid; $p = g$: gas), x_i is the mole fraction of component i in liquid phase, y_i is the mole fraction of component i in gas phase, z_i is the mole fraction of component i in the feed (i.e., the whole mixture including both gas phase and liquid phase), ψ_g is the gas mole fraction, K_i is the equilibrium constant of component i .

The real fluid properties are described using the Peng-Robinson equation of state (PR-EOS) [13] as:

$$P = \frac{RT}{V - b} - \frac{a}{V(V + b) + b(V - b)} \quad (5)$$

where P , R , T and V are pressure, gas constant, temperature, and specific volume respectively. For single-component fluid, the PR-EOS parameters are given by

$$a = 0.45724 \frac{R^2 T_c^2}{p_c} \hat{a}, \quad b = 0.07780 \frac{RT_c}{p_c}, \quad (6)$$

$$\hat{a} = \left(1 + \kappa \left(1 - (T_r)^{1/2} \right) \right)^2, \quad \kappa = 0.37464 + 1.54226\omega - 0.26992\omega^2 \quad (7)$$

where subscript "c" means critical value, subscript "r" means the reduced value (e.g., $T_r = T/T_c$), ω is acentric factor.

The mixture PR-EOS parameters are calculated from the corresponding single component coefficients a_i and b_i using the mixing rule [14]:

$$a = \sum_i \sum_j \chi_i \chi_j (1 - b_{ij}) \sqrt{a_i a_j}, \quad b = \sum_i \chi_i b_i \quad (8)$$

where χ_i is the mole fraction of component i (for liquid, $\chi_i = x_i$; for gas phase, $\chi_i = y_i$), b_{ij} is a binary interaction parameter.

Liquid phase and gas phase are described by a separate multicomponent PR-EOS. Specific volume of each phase, V_p , is solved from PR-EOS. From this, the compressibility factor of each phase ($Z = PV/RT$) can also be obtained.

Sub Topic: Particulates and Multiphase Flows

The fugacity formula of PR-EOS is shown below [15]:

$$f_i = P \chi_i \exp \left[\frac{B_i}{B_{mix}} (Z - 1) - \ln(Z - B_{mix}) - \frac{A_{mix}}{2\sqrt{2}B_{mix}} \left(\frac{2\sum_j x_j A_j}{A_{mix}} - \frac{B_i}{B_{mix}} \right) \times \ln \left(\frac{Z + (1 + \sqrt{2})B_{mix}}{Z + (1 - \sqrt{2})B_{mix}} \right) \right] \quad (9)$$

where χ_i is the mole fraction of component i (for liquid, $\chi_i = x_i$; for gas phase, $\chi_i = y_i$),

$$A_i = \frac{a_i p}{R^2 T^2} \quad B_i = \frac{b_i p}{RT} \quad (10)$$

$$A_{mix} = \sum_i \sum_j x_i x_j (1 - b_{ij}) \sqrt{A_i A_j} \quad B_{mix} = \sum_i x_i B_i \quad (11)$$

Isobaric and Isenthalpic (PHn) flash: In this work, the fluid solver uses Pressure-Implicit with Splitting of Operators (PISO) method, which directly updates pressure, enthalpy, and mass fraction of every component from fluid governing equation. The equilibrium temperature T_{eq} is determined using PHn flash to evaluate other thermodynamic and transport properties. the corresponding objective function is expressed as

$$F_h = (h^* - h) / h^* \quad (12)$$

where h^* is the specific mixture enthalpy, which is obtained from the fluid solver. The enthalpy of each phase p is calculated as

$$h_p(T, P) = h_{p,ideal}(T, p) + h_{p,dep}(T, p) \quad (13)$$

where h_{ideal} is the enthalpy of component i in ideal gas state, which is evaluated by JANAF polynomials; and h_{dep} is the departure enthalpy, calculated as:

$$h_{p,dep}(T, P) = RT(Z_p - 1) + \frac{T da_p/dT - a_p}{2\sqrt{2}b_p} \ln \frac{Z_p + (1 + \sqrt{2})B_{p,mix}}{Z_p + (1 - \sqrt{2})B_{p,mix}} \quad (14)$$

where a_p , b_p and $B_{p,mix}$ are PR-EOS parameters of phase p defined in Eq. (8,11).

The enthalpy of two-phase mixture is calculated as

$$h = \psi_g h_g + (1 - \psi_g) h_l \quad (15)$$

The equation is solve by Newton iteration method. Equilibrium temperature T_{eq} is updated in PHn flash iteratively as

$$T_n = T_{n-1} + (h^* - h(T_{n-1}, P)) / C_{p,mix}(T_{n-1}, P) \quad (16)$$

$$C_{p,mix} = \frac{h(T + \Delta T, P) - h(T, P)}{\Delta T} \quad (17)$$

2.2 *In Situ* Adaptive Tabulation (ISAT)

In situ adaptive tabulation method is introduced by Pope [9] to reduce the computational cost of detailed chemistry calculations. Comparing to the traditional tabulation methods which generate table before computation, ISAT dynamically constructs a table during the computation, which enable us to only store necessary record to reduce the table size. Although, ISAT still need to calculate the target function, most of queries can be directly retrieved by linear approximation. In addition, ISAT not only balances time and space cost, but also provides good error control. Hence, it is a good choice to accelerate PHn flash solver.

The PISO based fluid solver directly updates pressure P , enthalpy h , and mass mole fraction of every component Y_m from the governing equation, and require thermodynamic model to evaluate $\phi = P/\rho$, temperature T , and gas mole fraction ψ_g , which can be solved by PHn flash solver. The relation between the given condition and solution of PHn flash solver can be denote as a function,

$$y = F(x), \mathbf{x} = (\mathbf{Y}, P, h), \mathbf{y} = (T, \phi, \psi_g)$$

For every record in the table, it contains $(\mathbf{x}_0, \mathbf{y}_0, \frac{\partial \mathbf{F}}{\partial \mathbf{x}}|_{\mathbf{x}_0}, \mathbf{M})$

The gradient, $\frac{\partial \mathbf{F}}{\partial \mathbf{x}}|_{\mathbf{x}_0}$, is evaluated numerically and used for local linear approximation,

$$\mathbf{y}_{linear} = \mathbf{y}_0 + \frac{\partial \mathbf{F}}{\partial \mathbf{x}}|_{\mathbf{x}_0} \cdot (\mathbf{x} - \mathbf{x}_0)$$

The matrix \mathbf{M} is used to define the region of accuracy, in which the local error ϵ does not exceed the tolerance ϵ_{tol} . The region of accuracy is defined by inequality

$$(\mathbf{x} - \mathbf{x}_0)^T \mathbf{M} (\mathbf{x} - \mathbf{x}_0) \leq 1$$

The points satisfying this inequality is a hyper-ellipsoid. So, the region of accuracy is also called ellipsoid of accuracy (EOA).

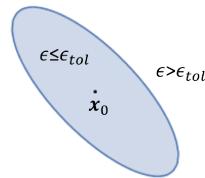


Figure 1: Sketch of region of accuracy

For initial setting, the linear term is considered as error. So, the initial \mathbf{M} can be set as

$$\mathbf{M} = \left(\frac{\partial \mathbf{F}}{\partial \mathbf{x}}|_{\mathbf{x}_0} \right)^T \left(\frac{\partial \mathbf{F}}{\partial \mathbf{x}}|_{\mathbf{x}_0} \right) / \epsilon_{tol}^2$$

. For the first query, a new record calculated and added to table. For subsequent queries (\mathbf{x}_{new}) , the closest record $(\mathbf{x}_0, \mathbf{y}_0, \frac{\partial \mathbf{F}}{\partial \mathbf{x}}|_{\mathbf{x}_0}, \mathbf{M})$ is find out.

(1). **Retrieve.** If \mathbf{x}_{new} is in the EOA of the record, then the linear approximation, \mathbf{y}_{linear} , is returned.

(2). **Growth.** If retrieve failed, then $\mathbf{y}_{new} = \mathbf{F}(\mathbf{x}_{new})$ is calculated. If $|\mathbf{y}_{new} - \mathbf{y}_{linear}| \leq \epsilon_{tol}$, the EOA is grown. The new EOA is the smallest ellipsoid covering old EOA and \mathbf{x}_{new} . \mathbf{y}_{new} is returned.

(3). **Addition.** If growth also failed, then new record is added to the table, and \mathbf{y}_{new} is returned.

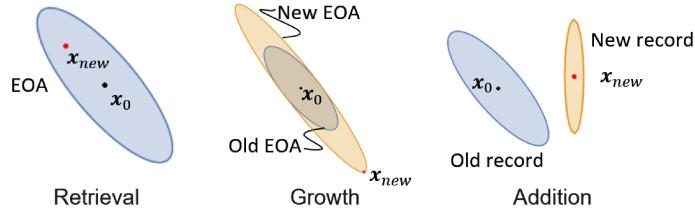


Figure 2: Sketch showing the algorithm of ISAT method

2.3 CFD simulation framework

In this investigation, a transcritical multiphase CFD solver is developed by coupling a CFD solver with the TPn flash VLE solver. At each step, the CFD solver updates fluid properties, including mixture density ρ , mixture enthalpy h and mass fraction Y_m , which are enough to determine the thermal equilibrium state. In the simulation, the partial equilibrium state, rather than the global equilibrium, is assumed to be achieved immediately at every grid point, and this partial equilibrium state can be obtained from the VLE solver. Hence, by solving PHn VLE at given (Y, P, h) , equilibrium temperature T , ϕ , and ψ_g is updated for the next time step which is shown in Fig. 3. Due to the high computational cost of VLE calculation, ISAT is used to store the VLE solution calculated by PHn flash to avoid repeated computation.

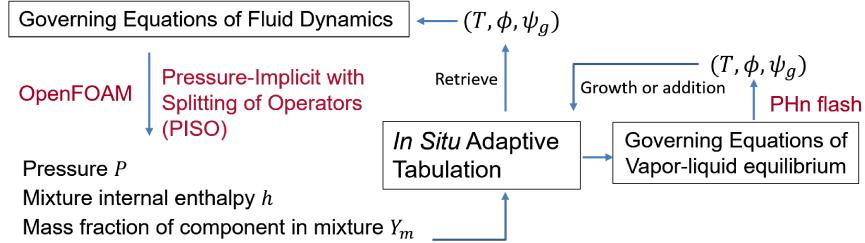


Figure 3: Flow chart of the VLE-based CFD solver.

3. Result and Analysis

3.1 Fluid simulation and performance of ISAT: 1D shock tube

In order to show the affect of VLE solver and test the performance of ISAT, a shock tube case of a $\text{CO}_2/\text{H}_2\text{O}$ mixture is tested, which includes a compression shock wave and an expansion wave. The initial condition of the test case is shown in Table 1. In the simulations, to show the

importance of EOS and VLE models in CFD simulations, three models are used and compared: ideal gas model, real fluid model (PR-EOS) without phase change (i.e., no VLE), and real fluid model (PR-EOS) with phase change (i.e., VLE). From the pressure plot in Fig. 4(a), it is apparent that expansion wave in PR-EOS with VLE model propagates slower, which is due to smaller sound speed. In isentropic process, the pressure change is reduced by phase change. Hence, sound speed $c = \sqrt{\left(\frac{\partial p}{\partial \rho}\right)_s}$ is smaller. However, the mixture in the compression shock wave is in purely gaseous phase due to the higher temperature there. Thus, the shock wave speed is not affected by phase change, and the post-compressor mixture should be in purely gaseous phase. In Fig. 4(b), because phase change is taken into account, latent heat is released when vapor partially condenses which reduces the temperature change and makes PR-EOS with VLE have the highest temperature. In Fig. 4(c), the three models show evident difference in density prediction. Specifically, comparing to the real fluid models (PR-EOS), the ideal gas model underestimates the gas density, and the effect of phase change (i.e., VLE) increases the temperature in expansion wave and reduces the density there. The red dashed line shows the vapor mole fraction predicted by the real fluid model with phase change (i.e., VLE) at different positions, which indicates that the mixture is partially condensed after the expansion wave. Also, a sharp bend (point A) in the density line only exists in the model of PR-EOS with VLE, which is corresponding to the location where mixture starts to partially condense. The Mach number of this shock tube is 1.25, which indicates that the transonic version of PISO method is able to handle the compressibility of relatively large Mach number flows.

Table 1: Initial condition for a shock tube with CO₂/H₂O mixture.

| | P (bar) | T (K) | x_{CO_2} | x_{H_2O} |
|-------|-----------|---------|------------|------------|
| left | 230 | 500 | 0.7 | 0.3 |
| right | 100 | 550 | 0.7 | 0.3 |

This shock tube simulation is also used for ISAT performance test. The shock tube (0.1mm) is evenly divided into 1000 grids. The simulation is run to 5×10^{-8} s. The simulation is run serially on a PC equipped with an Intel Core i7-8700K CPU. In Tab. 2. The running time of VLE model is about 40 times that of the ideal gas model, which shows that the VLE solver introduces a huge amount of computational cost.

Table 2: Running time for a shock tube with CO₂/H₂O mixture.

| | Ideal gas | VLE |
|-----------|-----------|------|
| Times (s) | 4s | 165s |

First, to understand the accuracy of ISAT method, two simulations are conducted. The first one use $\epsilon_{tol} = \epsilon_{tol_0} = (1K, 1 \times 10^{-6}m^2/s^2, 1 \times 10^{-2})$, which is chosen based on the magnitude of $\mathbf{y} = (T, \phi, \psi_g)$. The second one used a smaller tolerance to control the error $\epsilon_{tol} = \epsilon_{tol_0}$. Fig. 5(a-b) shows that in the first simulation, the tolerance is too large, that linear approximation is not

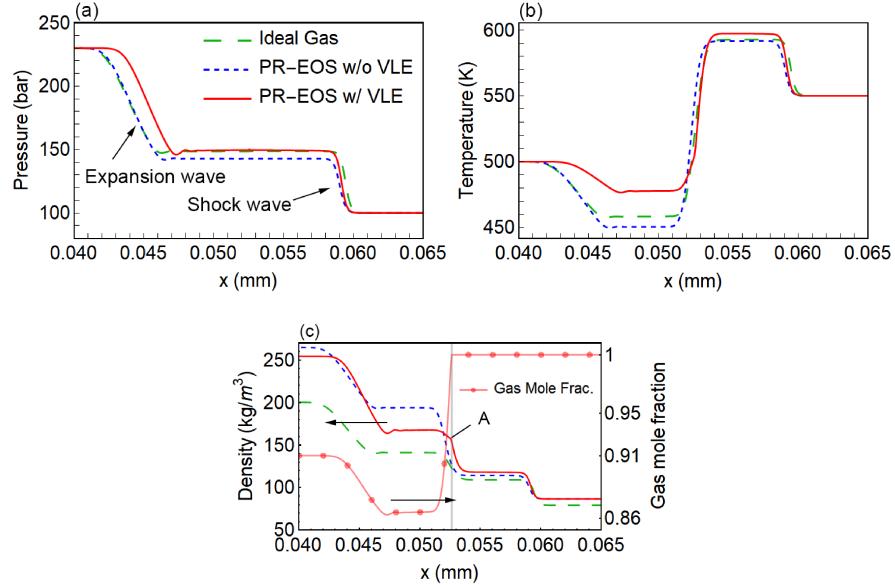


Figure 4: Simulation results of a shock tube with $\text{CO}_2/\text{H}_2\text{O}$ mixture, at $t = 2 \times 10^{-8}\text{s}$: (a) pressure; (b) temperature; (c) density (solid lines) and gas mole fraction (dashed line).

enough to obtain an accurate result. At $x = 0.04\text{mm}$, the pressure and gas mode fraction results give significant deviation. The second simulation, in Fig. 5(c-d), shows with smaller tolerance could capture the shock wave and expansion wave very well.

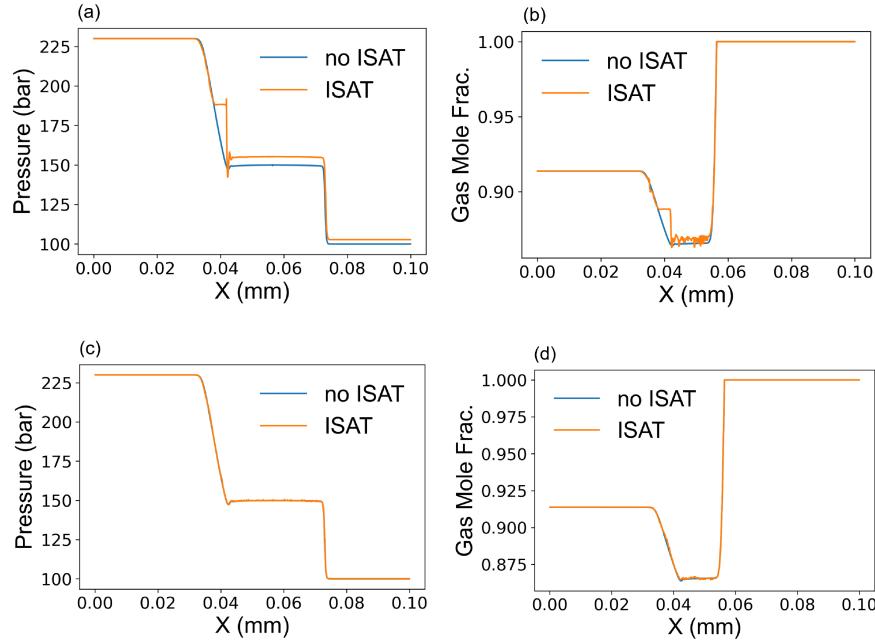


Figure 5: Comparison between result with ISAT and w/o ISAT: (a) and (b) $\epsilon_{tol} = \epsilon_{tol_0} = (1\text{K}, 1 \times 10^{-6}\text{m}^2/\text{s}^2, 1 \times 10^{-2})$; (c) and (d) $\epsilon_{tol} = 0.05\epsilon_{tol_0}$; (a) and (c) pressure plot; (b) and (d) gas mole fraction plot.

Then, we conducted a series of simulations, to find out a proper tolerance. The tolerance is $\varepsilon_{tol} = k\varepsilon_{tol_0}$. In the Fig. 6 (a) and Fig. 6 (b), we can see with the increase of the threshold ε_{tol} , the error of pressure and gas mole fraction presents an overall trend of increase. The error of the points in the red circle is acceptable for this shock tube simulation. Fig. 6 (c) shows that the running time decreases as the threshold increases. To obtain a result of acceptable accuracy, only 12s 14s is needed. Comparing the case without ISAT method (Running time 165s), ISAT method enables the simulation run about 12 times faster. This shock tube only contains two component (CO₂ and H₂O). For simulation with a larger number of components, we believe we can obtain even better speed-up factor.

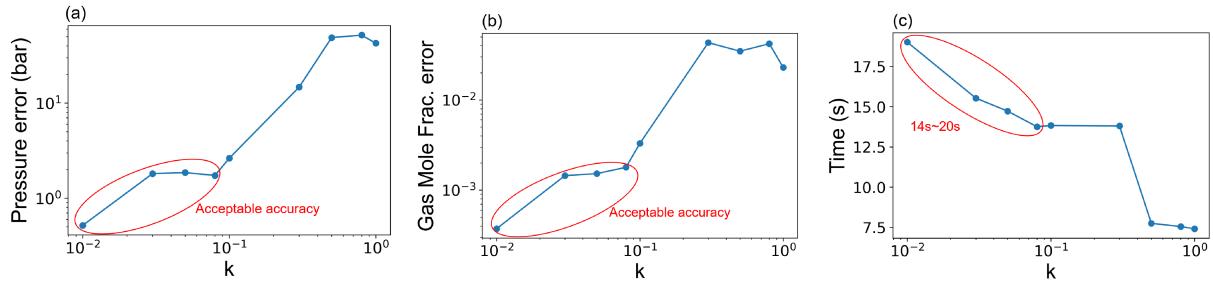


Figure 6: The affect of tolerance on ISAT performance. k versus (a) pressure error, (b) gas mole fraction error, (c) running time.

4. Conclusion

We implemented a vapor-liquid equilibrium (VLE) solvers (PHn flash) and coupled PHn flash solver with a computational fluid dynamics (CFD) solver to capture the mixing and phase separation processes of mixtures. To reduce the huge computation cost brought by vapor-liquid equilibrium (VLE) solvers, ISAT method is used to store the solution of PHn flash. A series of simulations of shock tube are conducted, to find out a tolerance which controls error within the acceptable range and also has a good speed-up factor. Finally, by choose a proper tolerance, we obtain a speed-up factor of above 12. This speed-up factor is obtained from a two-component flow. Since the VLE solver of larger number of components require more computation resource, we anticipate to obtain even better speed-up factor for simulation with more components.

5. Acknowledgements

S. Yang gratefully acknowledges the faculty start-up funding from the University of Minnesota and the grant support from NSF CBET 2023932. H. Zhang gratefully acknowledges the support from the 3M Science and Technology Doctoral Fellowship and UMII MnDRIVE Graduate Assistantship Award. Part of the computational resources was provided by the Minnesota Supercomputing Institute (MSI).

References

- [1] B. Chehroudi, D. Talley, and E. Coy, Initial growth rate and visual characteristics of a round jet into a sub-to supercritical environment of relevance to rocket, gas turbine, and diesel engines, 37th Aerospace Sciences Meeting and Exhibit (1999), p. 206.
- [2] W. Mayer and J. J. Smith, Fundamentals of supercritical mixing and combustion of cryogenic propellants, Liquid Rocket Thrust Chambers: Aspect of Modeling, Analysis, and Design, Progress in Astronautics and Aeronautics 200 (2004) 339–368.
- [3] V. Yang, Modeling of supercritical vaporization, mixing, and combustion processes in liquid-fueled propulsion systems, Proceedings of the Combustion Institute 28 (2000) 925–942.
- [4] P. Van Konynenburg and R. Scott, Critical lines and phase equilibria in binary van der Waals mixtures, Philosophical Transactions of the Royal Society of London. Series A, Mathematical and Physical Sciences 298 (1980) 495–540.
- [5] M. X. Yao, J.-P. Hickey, P. C. Ma, and M. Ihme, Molecular diffusion and phase stability in high-pressure combustion, Combustion and Flame 210 (2019) 302–314.
- [6] S. Ray, V. Raghavan, and G. Gogos, Two-phase transient simulations of evaporation characteristics of two-component liquid fuel droplets at high pressures, International Journal of Multiphase Flow 111 (2019) 294–309.
- [7] P. Tudisco and S. Menon, A vapor–liquid equilibrium induced Lewis number effect in real-gas shear layers: A theoretical study, Physics of Fluids 32 (2020) 112111.
- [8] P. Tudisco and S. Menon, Numerical Investigations of Phase-Separation During Multi-Component Mixing at Super-Critical Conditions, Flow, Turbulence and Combustion 104 (2020) 693–724.
- [9] S. B. Pope, Computationally efficient implementation of combustion chemistry using in situ adaptive tabulation, Combustion Theory and Modelling 1 (1997) 41–63.
- [10] M. L. Michelsen, Multiphase isenthalpic and isentropic flash algorithms, Fluid phase equilibria 33 (1987) 13–27.
- [11] H. Rachford Jr, J. Rice, et al., Procedure for use of electronic digital computers in calculating flash vaporization hydrocarbon equilibrium, Journal of Petroleum Technology 4 (1952) 19–3.
- [12] S. Saha and J. J. Carroll, The isoenergetic-isochoric flash, Fluid phase equilibria 138 (1997) 23–41.
- [13] D.-Y. Peng and D. B. Robinson, A new two-constant equation of state, Industrial & Engineering Chemistry Fundamentals 15 (1976) 59–64.
- [14] R. C. Reid, J. M. Prausnitz, and T. K. Sherwood, The Properties of Liquids and Gases.(Stichworte Teil 2), McGraw-Hill, 1977.
- [15] P. Yi, S. Yang, C. Habchi, and R. Lugo, A multicomponent real-fluid fully compressible four-equation model for two-phase flow with phase change, Physics of Fluids 31 (2019) 026102.