Multi-species Fluid Flow Simulations using a Hybrid Computational Fluid Dynamics - Molecular Dynamics Approach

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The constrained Lagrangian dynamics modeling in the hybrid computational fluid dynamics (CFD) - molecular dynamics (MD) approach is improved for the simulation of multi-species polyatomic fluid. The primitive formulation of the classical Lagrangian dynamics equation is replaced by conservative form to account for multi-species fluid system. Also, the equation is applied on molecules instead of individual atom, to preserve the linear momentum between continuum and particle domain without encountering the unfavorable numerical break-down of molecular bonding. We verify our hybrid CFD-MD simulation package by analyzing a nano-scale transient Couette flow of a single monatomic fluid. The multi-species polyatomic Lagrangian dynamics modeling has been evaluated by analyzing two different fluid models: the mixture of two monatomic fluids and a polyatomic molecular fluid under the short-range potential. These two applications verify the accuracy of the proposed model and evaluate the hybrid CFD-MD approach as a tool to describe the complex flow field near the solid obstacle.

I. Introduction

The hybrid computational fluid dynamics (CFD) - molecular dynamics (MD) approach is getting more attraction as a potential answer in describing the nano-scale flow phenomena. In this approach, the fluid system is divided into subdomains and individual subdomain is solved by either the continuum solver or the particle-based solver. Conventionally, the macroscopic flow region where the continuum hypothesis is valid is resolved by the continuum formulation and the material interface (e.g. fluid/solid or fluid/fluid) is analyzed by higher degree-of-freedom particle formulation. Compared with the classical CFD or MD methodology, this approach is expected to provide the high-resolution solution near the wall boundary within the acceptable computational cost.

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A number of scientific studies have been published which improve the hybrid technique and/or apply this approach to various nano-scale flow fields. These researches can be categorized to constrained Lagrangian dynamics, ^{1–5} alternating Schwarz method, ^{6–8} and direct flux exchange, ^{9–12} according to the formulation of hybrid schemes and the characteristics of variables exchanged in the overlapping region. Of these methods, the constrained Lagrangian dynamics applies the constrained Lagrangian dynamics equation to impose the hybrid MD boundary condition. Continuum and particle solvers exchange density properties (i.e., conservative variables) and they are coupled in time space. Compared to other counterparts, this method is easy to implement, is directly applicable to the unsteady flow simulation, and its molecular samples are less noisy than the flux properties.

Meanwhile, this approach is only valid for the single-species monatomic fluid flow since the constrained Lagrangian dynamics equation does not consider the mass variation of fluid particles. So, the direct application of the classical constrained Lagrangian dynamics equation to multi-species fluid domain results in the break-up of momentum conservation. Also, the application to the polyatomic fluid whose atomic mass are different ends up with the numerical break-up of chemical bond.

This motivates us to refine the classical constrained Lagrangian dynamics equation for the application to multi-species and polyatomic fluid flow. The equation is reformulated to provide the linear momentum conservation. Also, the equation is applied on the molecules instead of individual atoms, to prevent the numerical break-up of chemical bond. We implement this equation on our hybrid CFD-MD simulation package which has been introduced in our previous article⁵ and apply it to solving multi-species and polyatomic fluid flow.

We introduce the hybrid CFD-MD approach and describe the Lagrangian dynamics equation for multispecies polyatomic fluid particles in Section II. Numerical methods and the hybrid interface on individual solvers are addressed in Section III. Section IV is dedicated to present numerical solutions of the transient Couette flow in different fluid systems. The first system consists of two monatomic fluids whose chemical properties are equivalent to the liquid argon with the variation in mass. The next one contains the polyatomic molecules whose molecular structure is water (hydrogen oxide) while the long-range interaction is not considered. We summarize our studies and propose further applications in Section V.

II. Hybrid CFD-MD Approach for Multi-species Polyatomic Fluid

II.A. The Hybrid CFD-MD Approach

A detailed structure of the fluid domain for the hybrid CFD-MD approach is described in Figure 1. CFD solves the flow region where the continuum hypothesis is valid while MD analyzes the complex microscopic flow feature near the solid obstacle. Overlapping region is placed sufficiently far from the solid stationary wall to prevent the direct influence of molecular-level physics.

The overlapping region is designed sufficiently large to contain five individual layers with sufficient spacing. From the bottom, we have the particle-to-continuum and continuum-to-particle (denoted as 'MDtoCFD' and 'CFDtoMD', respectively) layers where hybrid boundary condition for CFD and MD are imposed. The external force layer for particle systems is placed on the top (farthest from the material interface) of the overlapping region. These three "active" layers are separated by the buffer layer, which is designed to prevent direct interaction between particles in above "active" layers.

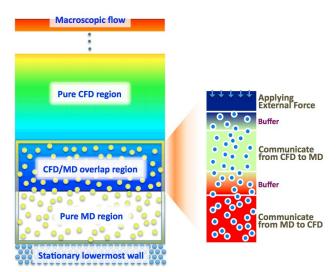


Figure 1. Schematic Diagram of the Hybrid Domain with Detailed View of Overlapping Zone: Left figure expresses the composition of hybrid simulation domain and the right figure presents individual layers in the overlapping region.

Hybrid CFD boundary condition on MDtoCFD layer is imposed by averaging molecular properties located in this layer. This boundary condition is prone to suffer from the statistical error,^{7,11} since the finite number of particles participate in sampling process in space and time. Therefore, the delicate determination of coupling parameters are very important for

acquiring the noise-free hybrid solution. The distance from the material interface and the size of sampling layer determines the scale of statistical error in space; how long the molecular properties will be accumulated ("sampling duration") and how often these samples are applied to the continuum solver ("sampling interval") also affects the sampling noise in time.

The hybrid MD boundary condition is imposed by referencing the continuum solution in this layer. A single set of continuum solution is imposed to higher degree-of-freedom molecular domain through the constrained Lagrangian dynamics equation. This equation constrains particles to attain the macroscopic flow property (conservative properties) on average, while preserving their degree-of-freedom of translational motion. Details on this equation will be presented in Section II.B.

In the uppermost layer, a fictitious external force is exerted on particles to preserve the system ensembles of the particle domain. This force function is designed to be short-range so as not to influence the motion of the particles past the buffer layer in the CFDtoMD domain. The force stiffens as the particles approach outer region to prevent the particles from drifting out of the particle domain. We apply a cost-effective classical external force model by Nie et al.²

II.B. Constrained Lagrangian Dynamics for Multi-species Fluid Simulation

Once the hybrid simulation accomplished for the monatomic system, it was developing for the more realistic problem, which is multi-species polyatomic fluids including water molecules. The first step of the development was start with modifying to the equation of motion in coupling CFDtoMD region.² The average velocity of particles in Jth cell is equal to the velocity u_J in continuum cell, and it can be depicted as eq. 1 with taking Lagrangian derivative.

$$\frac{Du_J(t)}{Dt} = \frac{\sum_k m_k \frac{d\dot{x}_k(t)}{dt}}{\sum_k m_k} \tag{1}$$

where v_k is the velocity of k^{th} particle and N_J is the number of particles in the cell, and m_k is the mass of k^{th} particle.

The Classical MD equation of motion can be generalized to obtain the constraint by adopting the fluctuation in the acceleration of each particles, ζ_k

$$\frac{F_k}{m_k} = \ddot{x_k}(t) = \frac{Du_J(t)}{Dt} + \zeta_k = \frac{\sum_k m_k \ \ddot{x}_k(t)}{\sum_k m_k} + \zeta_k = \frac{\sum_k F_k(t)}{\sum_k m_k} + \zeta_k$$
 (2)

$$\zeta_k = \ddot{x_k}(t) - \frac{\sum_k F_k(t)}{\sum_k m_k} = \frac{F_k(t)}{m_k} - \frac{\sum_k F_k(t)}{\sum_k m_k}$$
(3)

where ζ_k is a variance on each particles adequate to

$$\sum_{k} m_k \zeta_k = 0 \tag{4}$$

and $m_k = m$ only for monatomic system.

Finally, constrained particle dynamics equation was modified with the conventional equation of motion considering multi-mass to simulate polyatomic CFD-MD coupling hybrid simulation, it can be written as:

$$\ddot{x_k}(t) = \frac{F_k}{m_k} - \frac{1}{m_k} \frac{\sum_{i=1}^{N_J} F_i}{\sum_{i=1}^{N_J} m_i} - \frac{m_k}{\Delta t_{MD}} \left\{ \frac{\sum_{i=1}^{N_J} m_i \dot{x_i}}{\sum_{i=1}^{N_J} m_i} - u_J(t + \Delta t_{MD}) \right\}$$
(5)

The forces on the cell caused by particle interactions with other particles are revised with averaged force and velocity in the cell and informed velocities from CFD computation. The acceleration of the cell is now constrained instead of the average acceleration of the particle in the cells in this equation. Again, these two quantities are the same when all of the masses of atoms are the same.

III. Development of a Hybrid CFD-MD Simulation Package

We address the numerical schemes and hybrid interface of individual CFD and MD solvers in brief: More details can be found in Ref. 5.

III.A. Continuum Incompressible Flow Solver

The current in-house continuum hydrodynamics code solves the unsteady incompressible Navier-Stokes equations. In this work, the pseudo-compressibility method¹³ is adopted to form a hyperbolic system of equations which can be marched in pseudo-time. For time-accurate unsteady simulation, a dual time stepping method is adopted and it is combined with the LU-SGS (Lower-Upper Symmetric Gauss-Seidel) scheme¹⁴ for the implicit time integration. The inviscid fluxes are upwind-differenced using Osher's flux-difference splitting scheme.¹⁵ For higher-order spatial accuracy, the MUSCL (Monotone Upstream-centered Schemes for Conservation Laws)¹⁶ approach is used on the inviscid flux calculation. Viscous fluxes are calculated using conventional second-order central differencing.

III.B. Particle Dynamics Solver

Newton's conservation of momentum is employed at the atomic level to propagate the system's motion through time evolution. In this work the most commonly used Lennard-Jones (12-6) intermolecular force potential model¹⁷ is employed to calculate pair-wise interactions of particles in the system. A cut-off distance is introduced to reduce the computational cost and is set to be 2.2 magnitude of atomic characteristic length.¹⁸ The most common velocity Verlet algorithm¹⁷ is employed for time integration of the equations of motion of the interacting particles and to compute molecular trajectories in the simulation. In this work, the MD simulations were performed by using an appropriately modified version of the Large Atomic Molecular Massively Parallel Simulator (LAMMPS). It is a classical molecular dynamics open-source code written in C++ and developed by Sandia National Labs.¹⁹

III.C. Implementation of Hybrid Schemes and Interface

The file-based communicator is implemented on each solver to exchange conservative properties at every sampling interval. CFD solver stores the instantaneous solution at that time instance, while MD solver produces the backward sample over the sampling duration. Thus, transferred boundary information is extrapolated along the temporal space so as to avoid the time-lagging pattern in the boundary. CFD solver directly applies these extrapolated properties as the hybrid boundary condition at each time instance. MD solver inputs these values on employed constrained Lagrangian dynamics formulation. MD solver also applies the external force function in the uppermost layer.

The unit conversion function is also incorporated in CFD solver. This function changes the non-dimensional CFD solution into non-dimensional MD unit and vice versa. Considering the current formulation of CFD solver, the artificial pressure property needs to be converted to an equivalent molecular mass density. We acquire the relation between artificial compressibility P and density ρ by comparing the mass conservation equation and artificial compressibility formulation:

$$\frac{\partial P}{\partial t} = a^2 \frac{1}{\rho} \frac{\partial \rho}{\partial t} \tag{6}$$

This relation, written in discretized form, provides the hybrid number density and/or artificial pressure boundary conditions. CFD solutions in the hybrid MD boundary layer is rewritten in density form as,

$$\rho_{N+1} = \frac{\rho_N}{1 - \frac{P_{N+1} - P_N}{\sigma^2}} \tag{7}$$

Likewise, sampled molecular density is converted to equivalent artificial pressure at the hybrid CFD boundary layer as,

$$P_{N+1} = P_N + a^2 \left(1 - \frac{\rho_N}{\rho_{N+1}}\right) \tag{8}$$

From above equations, a denotes the artificial speed of sound and N, N+1 stands for the time step.

Coupling parameters, such as location and size of hybrid layers in space and sampling interval and sampling duration in time, are delicately determined by the reference to previous studies^{2–4,6,8–10} and preliminary measurement of noise level on pure molecular dynamic domain. We also apply the replica sampling approach²⁰ in case the individual hybrid solution suffers from the excessive sampling noise. This approach averages multiple independent simulations from the different initial Maxwell-Boltzmann distribution to find the non-fluctuating solution. The solution from N replicas provide the same order of accuracy as an individual solution from N times larger domain: this approach (running multiple small tasks instead of one big task) is computationally more effective in view of scheduling on many supercomputing resources.

IV. Numerical Results

IV.A. Problem Description and Validation

The application problem is a transient Couette flow problem, which is widely used for the verification of the hybrid CFD-MD solver. Fluid model is the liquid argon, whose characteristic length is $\sigma = 3.405 \times 10^{-10}$ meter and the time scale is $\tau = 2.2 \times 10^{-12}$ second. The number density is $0.81m\sigma^{-3}$. The channel is $52~\sigma$ in height and the solid wall has artificial properties that are the same as those of liquid argon. The slip ratio between the fluid and the wall material is set at 0.6 to satisfy the linear velocity gradient along a vertical direction.²

The computational domain for the hybrid simulation is depicted in Figure 2. The pure MD region is specified as 10 σ , that was reported to be sufficient to prevent the excessive sampling noise on the hybrid CFD boundary condition.³ Individual hybrid layer has 2 σ in height. Hybrid CFD boundary region consists of two consecutive layers to provide the accurate boundary condition for this collocated mesh system. The width of the MD domain along the periodic direction is determined at 140 σ , after a number of numerical experiments. Both the sampling interval and the sampling duration are set to be 10 τ , considering the characteristics of our deterministic application targets.

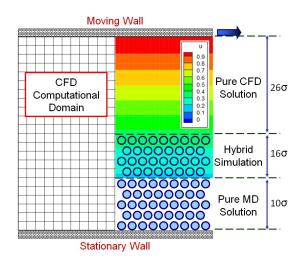


Figure 2. Computational Domain of the Couette Flow Simulation: The height of the fluid domain is 52σ ($\approx 177 \mathring{A}$). CFD mesh size is 71×27 and CFD cells at the pure MD region are treated as holes. MD domain size is about 140σ along the horizontal direction and around 26σ along the vertical direction, including the bottom wall. Periodic boundary condition is applied on the principal flow direction.

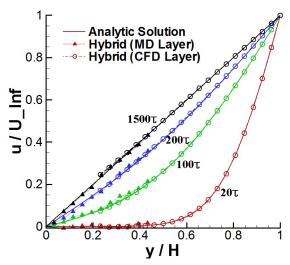


Figure 3. A Time-accurate Couette Flow Profile: The evolution of velocity field along the vertical direction is presented. CFD solution is the instantaneous profile at specified time and MD solution is spatially averaged over 2 σ in height and temporally averaged for 1 sampling durations (=10 τ). Hybrid solution presents the same flow physics as the analytic solution with the slight variation due to the sampling noise.

Figure 3 presents a transient Couette flow profile by the hybrid simulation which is compared to the analytic solution. The hybrid solution succeeds in describing the same flow physics as the analytic solution under the level of molecular dynamic sampling noise. This evaluates the accuracy of the current hybrid simulation package as a tool for solving the nano-scale flow field. This sampling noise is even diminished further through the sampling of multiple replicas.

IV.B. Transient Couette Flow Profiles in Multi-species and Polyatomic Fluids

We apply our simulation package to solving a liquid compound which consists of two monatomic molecule species varying in mass. Atomic properties are numerically designed to be equivalent to the above liquid argon system, except the mass of individual particle. The systematic density and total number of particles are still the same as the above validation problem, so as to provide the reliability on preserving other characteristic properties.

We simulated two different composition of particles to verify the constrained Lagrangian dynamic equation for multi-species fluid. The first system consists of two molecular species whose non-dimensional mass (compared to that of a liquid argon) are 0.5 and 1.5, respectively. Same number of particles are mixed to compose a fluid domain. The second system contains two species with 0.4 and 4.0 non-dimensional molecular mass whose ratio of particle numbers are 5:1.

Figure 4 presents the transient Couette flow profile of each problem. In comparison to the analytic solution, both simulations show the same flow evolution. It verifies the accuracy of the multi-species Lagrangian dynamics model. Hybrid steady-state solutions at time of 1500 τ shows a little faster velocity than the analytic solution. This difference is due to the slight slip of liquid particles near the solid obstacle, as is also observed in the pure molecular dynamic simulation in Fig. 5. The molecular dynamic simulation is capable of detecting this "natural" wall-slip phenomenon according to the inter-molecular characteristic energy. On the other hand, empirical boundary condition modelings are necessary to describe the same flow physics from pure CFD simulations. This evaluates the strength of the hybrid simulation as a way of accurately describing the complex flow pattern near the solid boundary interface.

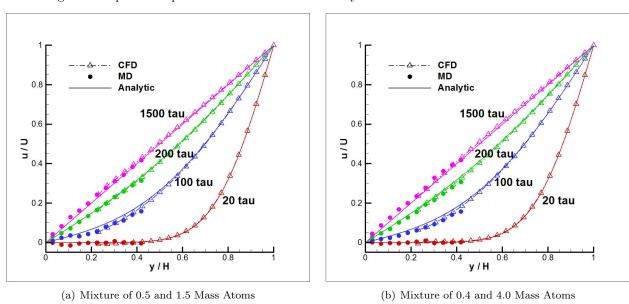
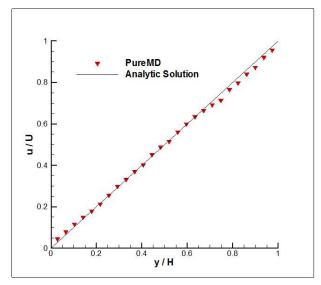
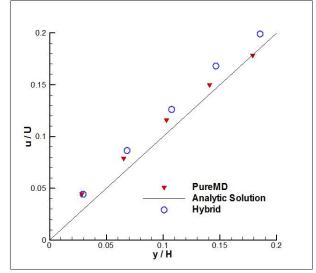


Figure 4. Couette Flow Profiles in Multi-species Liquids: Time-variant velocity profile along the vertical direction are presented. Both simulations from different particle compositions accurately describe the flow physics, which verifies the multi-species Lagrangian dyanmics model.

The next experiment solves the polyatomic molecular fluid whose molecular structure is that of water, i.e., density is $9.98 \ kg/m^3$ and viscosity is $3.0 \times 10^{-4} kg/(m \cdot s)$. Domain size and flow conditions are the same as the above validation problem, also is the hybrid layer configuration. CFD and MD simulations exchange hybrid boundary conditions at every 20 pico seconds. In the MD simulation, the bottom wall material is the disordered Lennard-Jones carbon and 6771 fluid molecules participate in flow simulation. The Coulombic interaction has been computed for a short-range (up to $8\ \mathring{A}$ in distance from individual atom), due to the





(a) Steady-state Couette Flow Profile via a Pure MD Simulation

(b) Hybrid and Pure MD Results near the Bottom Wall

Figure 5. Couette Flow Simulation by the Pure Molecular Dynamics: A mixture of 0.4 – 4.0 non-dimensional mass particles has been simulated. Buth pure MD and hybrid simulations describe the physical phenomenon of wall-slip in response to the inter-molecular characteristic energy between solid and liquid particles. Pure MD and hybrid results slightly differ far-from-the-wall region, due to different imposition of upper wall boundary condition (natural slip by particle-based method VS non-slip condition in continuum approach).

impossibility of accounting for the Coulombic effect from CFD region.

The steady-state hybrid solution is presented in Fig. 6. The result matches well with the analytic solution. It proves that the proposed constrained Lagrangian dynamics modeling is capable of solving the polyatomic molecules without harming the molecular structure. The visualized result is the averaged solution over 200 pico seconds (from 2600 to 2800 pico seconds) after the flow reached the steadystate. The instantaneous profile is highly fluctuative due to the molecular brownian motion, which is resolved as the number of molecular sample increases. Meanwhile, increasing the MD problem size will result in the excessive request on computing power: even the current simulation runs one full day with 256 CPU cores at one of most powerful supercomputers (Ranger²¹ in Texas Advanced Computing Center). It necessitates the design of numerical models to suppress the statistical noise of molecular samples.

V. Conclusion and Future Works

We have proposed the improved constrained Lagrangian dynamics model for a hybrid CFD-MD simulation in this paper. It is designed to satisfy the momentum conservation of the fluid solution and

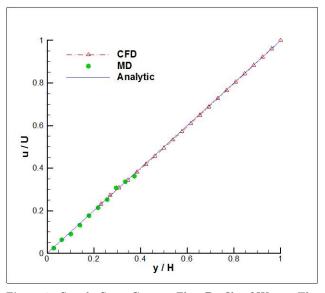


Figure 6. Steady-State Couette Flow Profile of Water: The hybrid solution averaged over 200 pico seconds is compared with the analytic solution. The close agreement between two solutions verify the accuracy of the constrained Lagranging dynamics modeling for polyatomic molecules.

avoid the numerical instability in applying the equation to polyatomic molecules. The classical constrained Lagrangian dynamics equation is reformulated to satisfy the linear momentum conservation of the multispecies fluid system and the equation is applied on the center of mass of each molecule to preserve the

chemical bond of a polyatomic molecule. We have implemented this model on our hybrid CFD-MD simulation package which consists of a pseudo-compressibility incompressible Navier-Stokes solver and a molecular dynamics solver solving the Lennard-Jones potential. The simulation package has been verified by solving the transient Couette flow profile of a single-species monatomic fluid system. We have applied our simulation package to solving the multi-species monatomic fluid. Simulations at different composition of particles present accurate solutions compared to the analytic solution, which verify the multi-species Lagrangian dynamics equation. Also, the simulation of a polyatomic fluid provides the numerical validity of imposing the constrained Lagrangian dynamics equation on molecular level. These numerical experiments, in turn, expresses the potential to apply the hybrid CFD-MD approach to any fluid systems.

The future work will be dedicated to modeling the effect of long-range interaction in hybrid simulation. Up to now, hybrid simulations fail to consider the long-range potentials since outside the hybrid region is modeled as the vacuum in view of particle domain. Mathematically modeling the long-range force field or putting the virtual slab on the border of hybrid region could be ones of potential answers.

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