



THE UNIVERSITY *of* EDINBURGH

Edinburgh Research Explorer

## Molecular dynamics pre-simulations for nanoscale computational fluid dynamics

### Citation for published version:

Holland, DM, Lockerby, DA, Borg, MK, Nicholls, WD & Reese, JM 2015, 'Molecular dynamics pre-simulations for nanoscale computational fluid dynamics' *Microfluidics and Nanofluidics*, vol. 18, no. 3, pp. 461-474. DOI: 10.1007/s10404-014-1443-6

### Digital Object Identifier (DOI):

[10.1007/s10404-014-1443-6](https://doi.org/10.1007/s10404-014-1443-6)

### Link:

[Link to publication record in Edinburgh Research Explorer](#)

### Document Version:

Peer reviewed version

### Published In:

*Microfluidics and Nanofluidics*

### General rights

Copyright for the publications made accessible via the Edinburgh Research Explorer is retained by the author(s) and / or other copyright owners and it is a condition of accessing these publications that users recognise and abide by the legal requirements associated with these rights.

### Take down policy

The University of Edinburgh has made every reasonable effort to ensure that Edinburgh Research Explorer content complies with UK legislation. If you believe that the public display of this file breaches copyright please contact [openaccess@ed.ac.uk](mailto:openaccess@ed.ac.uk) providing details, and we will remove access to the work immediately and investigate your claim.



# Molecular dynamics pre-simulations for nano-scale computational fluid dynamics

David M. Holland · Duncan A. Lockerby · Matthew K. Borg · William D. Nicholls · Jason M. Reese

Received: date / Accepted: date

**Abstract** We present a procedure for using Molecular Dynamics (MD) simulations to provide essential fluid and interface properties for subsequent use in Computational Fluid Dynamics (CFD) calculations of nano-scale fluid flows. The MD pre-simulations enable us to obtain an equation of state, constitutive relations, and boundary conditions for any given fluid/solid combination, in a form that can be conveniently implemented within an otherwise conventional Navier-Stokes solver. Our results demonstrate that these enhanced CFD simulations are then capable of providing good flow field results in a range of complex geometries at the nano-scale. Comparison for validation is with full-scale MD simulations here, but the computational cost of the enhanced CFD is negligible in comparison with the MD. Importantly, accurate predictions can be obtained in geometries that are more complex than the planar MD pre-simulation geometry that provides the nano-scale fluid properties. The robustness of the enhanced CFD is tested by application to water flow

along a (15,15) carbon nanotube (CNT) and it is found that useful flow information can be obtained.

**Keywords** Nanofluidics · Computational Fluid Dynamics · Molecular Dynamics · Hybrid Methods · Carbon Nanotubes

## 1 Introduction

Nanofluidic technologies are advancing rapidly and a range of new technical opportunities are emerging. For example, efficient filtration of water using carbon nanotubes (Alexiadis and Kassinos, 2008; Mattia and Gogotsi, 2008), heat removal and control in high heat-flux systems such as nuclear reactors, micro/nano electro mechanical systems (MEMS/NEMS), and micro chemical reactors (Saidur et al, 2011; Wen et al, 2009). However, the prediction of the fluid mass flow rate and heat transfer in nano-scale systems presents a major barrier to their design. The existence of non-continuum effects, such as molecular layering and velocity slip near to liquid-solid interfaces, seemingly precludes efficient continuum Computational Fluid Dynamics (CFD). On the other hand, more accurate Molecular Dynamics (MD) simulations can be extremely costly in terms of the computational resources they require. For example, to simulate 200 nm<sup>3</sup> of water for 1 nano second, with a modern MD code running on 8 CPUs in parallel, can require approximately 2 days of computational time. To simulate the liquid over much larger time and space scales is beyond the reach of current computational capabilities (even with the improved computational efficiency offered by Graphical Processing Units, GPUs). This certainly prevents using such simulations within a practical iterative design process.

In this paper we demonstrate that CFD simulations can still play a major role in nano flow prediction for engineering design or, alternatively, for the initiation of steady-state MD simulations. We show that useful predictions can be readily

---

D. M. Holland · D. A. Lockerby  
School of Engineering, University of Warwick,  
Coventry CV4 7AL, UK  
E-mail: d.m.holland@warwick.ac.uk

D. A. Lockerby  
E-mail: duncan.lockerby@warwick.ac.uk (email for correspondence).

M. K. Borg · W. D. Nicholls  
Department of Mechanical and Aerospace Engineering,  
University of Strathclyde, Glasgow G1 1XJ, UK  
E-mail: matthew.borg@strath.ac.uk

W. D. Nicholls  
E-mail: william.nicholls@strath.ac.uk

J. M. Reese  
School of Engineering, University of Edinburgh,  
Edinburgh EH9 3JL, UK  
E-mail: jason.reese@ed.ac.uk

and reliably obtained in complex nano-scale geometrical domains, despite the limits of the continuum-fluid assumption, if appropriate fluid state models, viscosity relationships, and slip models are provided.

Both experiments and molecular simulations show that the continuum-fluid assumptions (e.g. local linear constitutive relationships) are still appropriate for water confined to channels of width  $\sim 1\text{--}2\text{ nm}$  (see Bocquet and Charlaix (2010) and references therein), and MD simulations have been used to show that Lennard-Jones fluids confined to geometries of  $\sim 2\text{--}3\text{ nm}$  still show continuum behaviour (Huang et al, 2007; Sofos et al, 2009; Travis et al, 1997). For nano-confined fluids below the continuum limit, however, the strain rate can vary rapidly within several molecular diameters (Todd et al, 2008) due to oscillations in the density; therefore, the stress becomes non-local. For quickly varying strain rates in homogeneous fluids the non-local stress is calculable (Todd et al, 2008) but for confined fluids this is an unsolved problem (see for example Cadusch et al (2008) and Todd (2005)). In addition, tests of continuum-fluid equation performance at the nano-scale have been restricted to extremely simple geometries, typically Poiseuille flow (e.g. Zhang et al (2012)) and other canonical cases for which Hagen-Poiseuille equations are solved with slip boundary conditions. There is currently little substantive evidence to suggest that CFD can generally be applied at the nano-scale in arbitrary flow geometries.

In this paper we make three contributions to nanofluidic modelling:

1. we propose a convenient pre-simulation MD framework that enables us to measure CFD-type properties (e.g. boundary conditions and constitutive relations) for a given solid / liquid combination;
2. we demonstrate that these fluid properties can be used to obtain highly accurate CFD predictions in complex geometries at the nano-scale, provided that a significant portion of the flow exhibits continuum bulk-like behaviour. This is distinct from previous studies (e.g. Zhang et al (2012)) that focused mainly on 1D flow configurations. Importantly, we demonstrate that accurate CFD predictions can be obtained in cases that are more complex than the MD flow configuration from which the CFD fluid parameters were obtained;
3. we demonstrate that even in highly non-continuum 3D flows, where no significant bulk flow exists (such as flow through some small diameter carbon nanotubes), qualitatively accurate, and so useful, CFD predictions can be obtained.

The paper is structured as follows: in Section 2, we define the MD procedure from which the fluid properties are extracted for a particular liquid/solid combination. In Section 3 this is applied to a Lennard-Jones fluid interacting with solid bounding surface atoms that are effectively frozen. This is

followed by nano-scale CFD predictions for three different geometries: a short channel connecting two reservoirs; a long channel connecting two reservoirs; and a channel with a geometrical irregularity connecting two reservoirs. The results in each case are compared to full MD data, which are vastly more computationally expensive and time-consuming to obtain. In Section 4, to demonstrate its applicability to highly non-continuum flows, we use our enhanced CFD to model water flow along a carbon nanotube (CNT). This example is chosen in order to explore the robustness of our approach for cases where the continuum assumption is known to be invalid. Finally, in Section 5, we discuss the applications, limitations, and potential developments of the method.

## 2 Molecular Dynamics procedure for generating fluid properties

We employ a preliminary molecular dynamics (MD) simulation to obtain fluid properties and boundary conditions that enable the effective use of a Navier-Stokes solver in nano-scale applications it is typically not suitable for. This approach could be classed as a “sequential molecular-continuum hybrid method” (see Mohamed and Mohamad (2010) for a review of hybrid methods), where ‘sequential’ refers to the fact that the MD is performed in advance of, and, so independent of, the continuum model. In contrast, in ‘concurrent’ schemes, e.g. HMM (E et al, 2009; Asproulis et al, 2012) or Domain Decomposition (O’Connell and Thompson, 1995), the MD simulations are fully coupled to a continuum model. While this is ultimately more likely to produce accurate solutions, it is certainly more computationally expensive. The sequential methodology we adopt instead is far more practical for preliminary and iterative engineering design simulations (at least, based on today’s computing capabilities). An example of a similar methodology can be found in Dongari et al (2011a,b) in which molecular free path distributions within rarefied gases are measured using MD simulations and then used within the Navier-Stokes-Fourier equations.

For the isothermal CFD simulations of nano flows we consider in this paper, we require the following fluid properties and boundary conditions: the viscosity coefficient as a function of density, the pressure as a function of density, the slip length as a function of density and shear rate, and what we here define as the ‘surface offset’ ( $\delta$ ) which defines the position of the surface, as modelled by the CFD, relative to some atomistic reference point (in this paper, the atomic centres). The implications of the choice of the dependencies the fluid properties and boundary conditions on particular variables (here, density) is discussed in Section 5.

For efficiency and convenience we propose a single MD configuration from which all of these fluid properties can be

measured and/or controlled. This enables efficient concurrent MD simulations over any range of variables considered by multiple realisations of the same MD geometry/setup. We have chosen to use non-equilibrium MD (NEMD) simulations to gather the data rather than equilibrium MD despite potential, accuracy issues (Kannam et al, 2012), because this approach would be more suitable for simulating a complex fluid-solid interaction, where slip could be strain dependent. A possible more refined approach could be to use a combination of equilibrium MD simulations and NEMD simulations where appropriate.

Figure 1 (far left) shows the MD pre-simulation domain; it is symmetrical about its centrelines and uses periodic boundary conditions in the streamwise direction (i.e. in the  $x$ -direction) and into the page (i.e. in the  $z$ -direction). The domain has *bulk*, *shear* and *interface* zones (as labelled) for measuring state, constitutive and boundary properties, respectively. Pressure and density (and also temperature, if simulating non-isothermal cases) are measured in the bulk zone. In addition to this, in the bulk zone an artificial streamwise body force ( $F_x$ ) is applied (see Figure 1, centre left), which creates a velocity profile in the domain similar to that illustrated (centre right). We assume that the equation of state in the bulk zone is unaffected by the magnitude of strain rate generated. In the shear zone the fluid is subject to a constant shear stress,  $\tau_{xy}$ , directly resulting from the bulk-zone forcing. A linear flow velocity profile is developed in the shear zone, and this is least-squares fitted. The measured strain rate and shear stress are then used to obtain a viscosity coefficient,  $\mu$ , through

$$\tau_{xy} = -\mu \frac{dU}{dy}. \quad (1)$$

In this paper we assume that shear viscosity is sufficient to describe the fluid constitutive behaviour, while accepting that the pre-simulation configuration would need to be modified to deal with extensional viscosity.

Any significant density oscillations associated with molecular layering are confined to the interface zone. In this zone we calculate what we term the ‘CFD surface displacement’ ( $\delta$ ), which is the distance that a CFD wall/surface needs to be displaced from the centres of surface atoms in order to accurately represent the boundary of the fluid (as opposed to the boundary of the solid); see  $\delta$  in Figure 1. We take this displacement to be the distance from the centre of the surface wall atom to where the fluid density becomes at least 10% of the bulk, i.e.  $\rho \geq a\rho_{bulk}$ , where  $a = 0.1$ . The linear velocity profile obtained in the shear zone is extrapolated into the interface zone to find the apparent slip length,  $\xi$ , as defined from the CFD surface (see Figure 1, centre right).

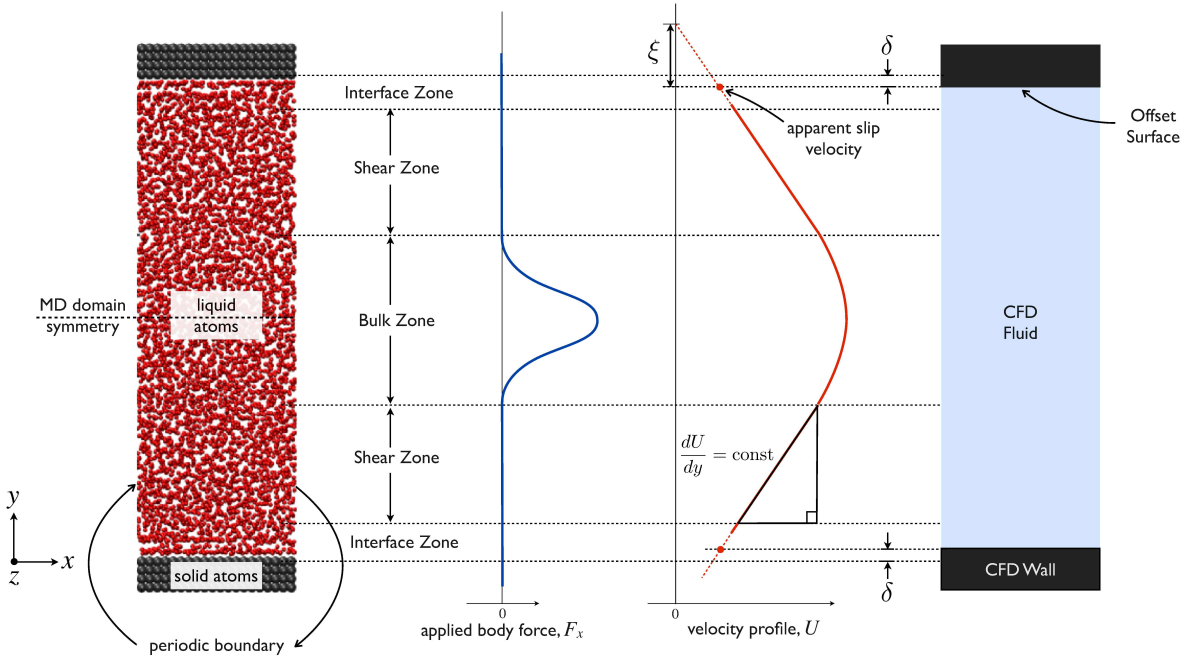
Across multiple simulations, we obtain the bulk pressure, a viscosity coefficient, the slip length, and the surface displacement, for a range of combinations of bulk den-

sity and applied shear stress. In the MD simulations the applied shear stress and bulk density are varied by modifying the body force and by adding/removing molecules, respectively, using the FADE algorithm (Borg et al, 2014). Finally, once all data is collected over the expected range of density and shear stress<sup>1</sup>, functional relationships are constructed for the desired fluid properties (using, for example, fitted polynomials) which are then used in the CFD model. The behaviour of this CFD model ultimately depends on these functional relationships, and this choice requires some experience or needs to form part of an iterative approach (this is discussed in Section 5). For the cases considered in this paper, we adopt the following: for pressure,  $p = p(\rho)$ ; for dynamic viscosity,  $\mu = \mu(\rho)$ ; surface displacement,  $\delta = \delta(\rho)$ ; and slip length  $\xi = \xi(\rho, \dot{\gamma})$ , where  $\rho$  is the bulk fluid density and  $\dot{\gamma}$  is the strain rate in the shear zone. This dependence on density would normally imply a high-speed high-Mach number flow, but in nano-scale internal flows it is possible to have substantial fluid compressibility at extremely low Mach numbers due to viscous-related pressure losses (see Gad-el Hak (2010) for a discussion of this). For this reason, capturing the influence of density on fluid properties is critical to the accurate prediction of nano-scale flows. For all of the examples considered in this paper, the influence of strain rate can be safely ignored, but we consider its effect on slip length for demonstration purposes. The fluids we consider are therefore Newtonian in the bulk; a non-Newtonian fluid, for example, would at least require  $\mu = \mu(\rho, \dot{\gamma})$ . Note that for the simulation of well-understood fluids it would not be necessary to extract all of these properties from MD pre-simulations.

### 3 CFD for nano-scale flow of a Lennard-Jones fluid

Owing to the lack of detailed and reliable experimental flow measurements at the nano-scale, in this section we compare our enhanced CFD predictions with full-scale MD simulation results. This comparison is intended to test whether flow field solutions of comparable accuracy to full MD can be obtained from our enhanced CFD in complex nano-scale geometries, without the need for *ad hoc* corrections, and at only a fraction of the cost of full MD. A Lennard-Jones (LJ) model of liquid argon is chosen, where the solid wall atoms are fixed/frozen (Thompson and Troian, 1997); the exact interatomic potentials used are given in Appendix A.1.

<sup>1</sup> in most cases, the expected ranges can be comfortably over predicted — in less familiar simulations an iterative or trial-and-error approach might need to be adopted.



**Fig. 1** Schematic of Molecular Dynamics pre-simulation for extracting fluid dynamic properties that are essential inputs to an enhanced CFD solver for nano-scale flows.

### 3.1 MD pre-simulation results

The molecular dynamics pre-simulations are performed as described in §2, using the *mdFoam* solver (Borg et al, 2010; Macpherson et al, 2007; Macpherson and Reese, 2008) that is implemented within the OpenFOAM libraries (OpenFOAM, 2013). The MD algorithm has molecules evolving using Newton’s equations of motion,  $m_i d\mathbf{v}_i/dt = \mathbf{f}_i$ , where  $\mathbf{v}_i = d\mathbf{r}_i/dt$ ,  $\mathbf{f}_i$ ,  $\mathbf{r}_i$  and  $m_i$  are the velocity, total force, position and mass, respectively, of an arbitrary molecule  $i$  in a system of  $N$  molecules at a time  $t$ . The total force per molecule  $\mathbf{f}_i$  is calculated at every time-step from the sum of pair-wise intermolecular forces between molecules, i.e.  $\mathbf{f}_i = \sum_{j=1}^N [-\nabla U(r_{ij})]$

for all  $j \neq i$ , where  $U(r_{ij})$  is the potential energy when molecules  $i$  and  $j$  are separated by  $r_{ij} = |\mathbf{r}_i - \mathbf{r}_j|$ .

The MD pre-simulation domain is constructed as illustrated in Figure 1 (far left) extending 4.08 nm and 5.44 nm in the  $x$ - and  $z$ -directions, respectively. These dimensions are principally chosen to be large enough to avoid unwanted ‘wrap-around’ effects due to the periodic boundaries. In the  $y$ -direction, each interface region extends by 0.68 nm, each shear zone extends by 3.4 nm and the bulk zone extends by 4.08 nm, giving a total height of 12.24 nm. Owing to the symmetry of the problem, properties extracted from the shear and interface zones are mirrored and averaged (thus reducing the overall sampling time). The temperature is maintained at  $T = 292.8$  K by coupling molecules to a velocity-unbiased Berendsen thermostat (Berendsen et al, 1984) with a time-constant of  $\tau_T = 21.6$  fs, applied within 36 indepen-

dent bins placed in the  $y$ -direction, with each bin being 0.34 nm thick. It has been shown that using a thermostat on a confined fluid may affect the flow properties (Bernardi et al, 2010), however, a thermostat is used in all the MD simulations in this work so that we can compare with isothermal CFD simulations. The same thermostat is used in both the pre-simulations and the full MD simulations, therefore the same error is present in both — the verification of the simulation approach is thus not undermined by any physical uncertainty introduced by the thermostat.

The pre-simulation is divided into two steps. In the first part of the simulation, the MD ensemble is set to the target density and allowed to run to a steady-state (which takes  $\sim 1.5$  million MD time-steps) with the external artificial force applied for the target strain-rate. For any molecule in the bulk region, the external forcing is given by a Gaussian distribution centered around the centerline of the simulation box:

$$F_x(y) = \bar{F} \exp(-y^2/2\sigma_s^2) \hat{\mathbf{n}}_x, \quad (2)$$

where  $\bar{F}$  is the magnitude of the Gaussian,  $\sigma_s$  is an estimate of the required width of the curve, and  $\hat{\mathbf{n}}_x$  is the unit vector in the  $x$ -direction. The relationship between the forcing magnitude and the shear-stress can be obtained by substituting equation (2) into the conservation of momentum and integrating giving:

$$\bar{F} = \frac{2\tau_{xy}}{\rho_n \sigma_s \sqrt{2\pi}}. \quad (3)$$

The second part of the pre-simulation is then used to measure the required fluid properties over an interval of around 2 million MD time-steps of 5.4 fs each.

### 3.1.1 Bulk pressure as a function of bulk density

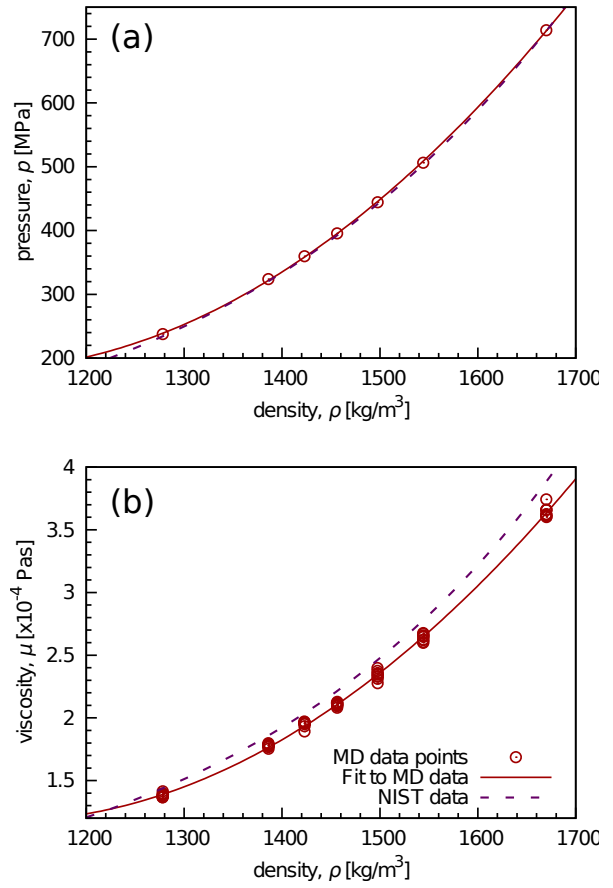
Figure 2 (a) shows MD pre-simulation measurements of pressure, obtained from the standard Irving-Kirkwood expression (Irving and Kirkwood, 1950), varying with the mass density. The MD pre-simulation results are least-squares-fitted to a 2nd order polynomial. This then serves as an equation of state within the enhanced CFD solver to connect the mass continuity equation to the momentum equation. In this case the polynomial is  $p = 0.001559\rho^2 - 3.387\rho + 2020.6$ . For reference, data from the NIST database for argon (Linstrom and Mallard, 2001) is also plotted in Figure 2 (a), and is in close agreement with our MD pre-simulation data. Clearly, in this particular case, properties for argon are well-known, but we extract the equation of state from our MD pre-simulation for the purposes of demonstration. The equation-of-state (and the viscosity equation in the following subsection) could be obtained by performing equilibrium MD simulations of a bulk fluid, however, the data is extracted from the pre-simulations here both for convenience and computational efficiency.

### 3.1.2 Dynamic viscosity as a function of density

The strain-rate is extracted from the MD shear zone by a least-squares linear fit to the relaxed and time-averaged velocity profile. The applied shear stress is measured using the Irving-Kirkwood equation and then compared with the strain rate using equation (1) to give a dynamic shear viscosity coefficient for L-J argon at a given bulk density. The viscosity coefficients measured from our MD pre-simulations of Lennard-Jones argon are shown in Figure 2 (b). A least-squares polynomial fit of 2nd order in density is also plotted:  $\mu = 7.96 \times 10^{-10}\rho^2 - 1.774 \times 10^{-6}\rho + 0.001106$ . This is then used in our enhanced CFD simulations to close the momentum equation. Again, for reference, data from the NIST database for liquid argon is also plotted in Figure 2 (b). Note, due to the breakdown of the continuum assumption and the existence of non-local stress, this state-dependent viscosity becomes only approximate when applied to a nano-confined fluid.

### 3.1.3 CFD surface displacement as a function of density

The surface displacement  $\delta$  defines the location of the CFD boundaries relative to the atomic (actual) walls. If  $\delta$  varies substantially with density (or any other fluid property), the geometry of the enhanced CFD domain becomes dependent on the CFD solution itself. However, for the fluid/solid combinations considered in this paper, over the density ranges



**Fig. 2** Data for the Lennard-Jones fluid properties: (a) pressure variation with density, and (b) viscosity variation with density. MD data points from pre-simulation (circles), fitted polynomial (solid lines) and NIST data (Linstrom and Mallard, 2001) (dashed lines).

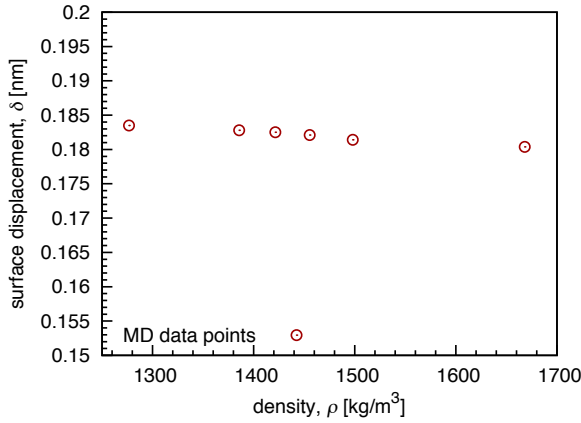
considered,  $\delta$  is effectively constant, see Figure 3. This allows us to assume that the surface displacement is fixed, which avoids the need for a complicated recursive solution and re-meshing procedure. In previous work the surface displacement has been set to the liquid-solid interaction length (Joseph and Aluru, 2008) or chosen in another arbitrary way, and in some cases neglected altogether. The liquid-solid interaction length is significantly larger than the surface displacement we propose, which may be partly responsible for the large discrepancy between continuum-fluid predictions and MD results found in these previous studies e.g. Joseph and Aluru (2008).

### 3.1.4 Slip length as a function of density and strain rate

Liquid slip velocity at surfaces is calculated using the Navier slip condition:

$$u_{slip} = \xi \dot{\gamma}, \quad (4)$$

where  $\xi$  is the slip-length and  $\dot{\gamma}$  is the shear-rate at the bounding surface. The same least-squares-fitted linear velocity pro-



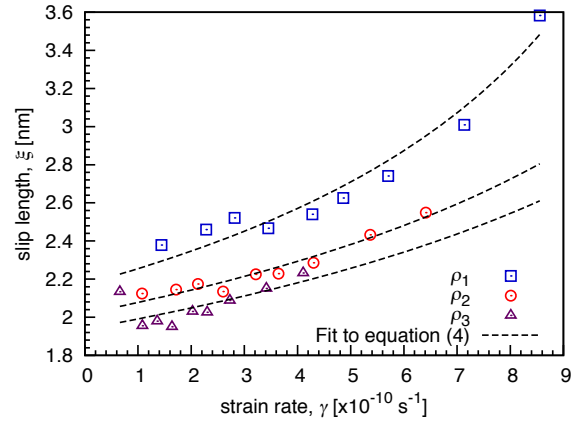
**Fig. 3** Surface displacement  $\delta$  varying with fluid density  $\rho$ , measured from each MD pre-simulation.

file from §3.1.2 is used to calculate the slip-length (as defined from the CFD surface). In this work, we only investigate steady isothermal liquid flows, therefore our slip boundary condition only needs to depend on the strain-rate (as in Thompson and Troian (1997)) and the density (Bocquet and Charlaix, 2010). In fact, the strain-rate dependence is not necessary for the example cases we consider due to the relatively low shear-rates, but here it is included for the purposes of illustration. Based on the strain-rate / slip-length relationship proposed in Thompson and Troian (1997), and assuming a linear dependence on density, a least-squares fit is performed to the following equation:

$$\xi = \frac{(c_1\rho + c_2)}{\sqrt{1 - \dot{\gamma}/\dot{\gamma}_c}}, \quad (5)$$

where  $\rho$  is the density,  $\dot{\gamma}_c$  is the critical shear rate (see Thompson and Troian (1997)), and  $c_1$ ,  $c_2$  and  $\dot{\gamma}$  are parameters of the fit to our MD pre-simulations, which are  $-1.2052 \times 10^{-12} \text{ kg}^{-1}\text{m}^4$ ,  $3.7468 \times 10^{-9} \text{ m}$  and  $1.5431 \times 10^{11} \text{ s}^{-1}$ , respectively. We leave the slip length dependence on curvature (as discussed in Einzel et al (1990)) for future refinement of this model.

Figure 4 shows our MD pre-simulation data and the least-squares fit of equation (5); results are shown for three different values of density. The slip model approximated by equations (5) and (4) is directly introduced as a Robin boundary condition in the enhanced CFD solver. The slip length for the simple fluids modelled in this paper could be measured using equilibrium MD using similar methods to Bocquet and Barrat (1994) and Hansen et al (2011). However, for ease of application and generality (e.g., for capturing the interaction of solid surfaces with non-Newtonian fluids) we use this non-equilibrium methodology.



**Fig. 4** Slip length  $\xi$  varying with strain rate  $\dot{\gamma}$  for three density values  $\rho_1 = 1276 \text{ kg/m}^3$ ,  $\rho_2 = 1447 \text{ kg/m}^3$  and  $\rho_3 = 1668 \text{ kg/m}^3$ . MD pre-simulation data points (symbols) and fit to equation (5) (dashed lines).

### 3.2 The enhanced CFD model

We perform finite-volume CFD simulations using OpenFOAM (OpenFOAM, 2013), an open source set of C++ libraries for solving partial differential equations on unstructured meshes and in parallel. Specifically, we use the laminar, compressible solver *sonicLiquidFoam*, which we have modified to a) accommodate a nonlinear equation of state, b) allow a density-dependent viscosity, and c) incorporate slip boundary conditions of the form given in equation (5). A compressible solver is used despite the very low Mach numbers, since, as discussed above, significant compressibility can occur in micro and nano geometries (Gad-el Hak, 2010; Patronis et al, 2013).

### 3.3 Simulation results

To test the reliability of our predictions using CFD enhanced with MD pre-simulation input, we compare them to results from full-domain MD calculations. We also compare results with predictions from compressible CFD with no-slip at the wall, and without modelling the CFD surface displacement (referred to as ‘no-slip CFD’). We also compare with incompressible CFD with the same slip model but no surface displacement (referred to below as ‘incomp. slip CFD’). As test cases, we choose flows that all exhibit non-continuum behaviour (e.g. slip at surfaces), but also contain a significant bulk flow region, even within the smallest features of the geometry. In §4 we consider the quality of CFD predictions in cases where such a bulk region does not exist.

The two-dimensional cases we consider in this section involve connected reservoirs that are held at different pressures; an example of a filtration configuration, say. The first case has the reservoirs connected by a straight channel 108.8 nm

long (Case 1), the second by a straight channel 231.2 nm long (Case 2), and the third by a 231.2 nm long straight channel with a cylindrical geometrical irregularity/defect with radius 0.68 nm (Case 3). The channel width (measured as the distance between the centre of opposite solid surface atoms) is 4.08 nm for all three cases. Figure 5 shows the CFD meshes for Case 1 alongside the corresponding full MD domain. Figure 6 shows the CFD and MD domain for Case 3 ( $L = 231.2$  nm, with channel width of 4.08 nm; the width at the defect is 1.7 nm). For all three cases, the pressure at the inlet and outlet reservoir are 650 MPa and 300 MPa, respectively. The full MD simulations are used to evaluate the accuracy<sup>2</sup> of the enhanced CFD predictions by comparison. As is standard CFD practice, the mesh resolution has been tested in each case to ensure mesh independence of the results.

Figures 7 (a-c) and Figures 8 (a-c) show results of pressure and density, respectively, along the centreline of each domain for each case. Both the centre line and the sampling region (where averaging is performed) are indicated on Figure 5. In Figures 7 and 8, differences between the CFD and MD results can be seen near the outermost boundaries of the reservoirs. This is because in the full-domain MD, for convenience, the reservoirs are connected by periodic boundary conditions, with a local body force imposing the pressure drop (see Docherty et al (2014) for details of this approach); in the CFD, however, boundary pressures can be specified directly and so periodicity need not be enforced.

Velocity profiles cross-channel are presented in Figure 9 (a-d) at cross-sections A and B (as indicated on Figure 5) for Cases 1 and 2. The streamwise velocity along the centre line of the channel for Case 3 is presented in 9 (e). Finally, in Table 1, predictions for the mass flow rate through each channel are given.

In all three cases, the agreement between our enhanced CFD model (the dashed lines in Figures 7, 8 and 9) and the MD results (solid lines) is extremely good for all of the flow variables considered. Also, CFD predictions of mass flow rate (arguably the most important bulk property in nano channel flow cases, and one that no-slip CFD underpredicts very substantially) are all within 4 % of the values obtained from full MD simulations. This very positive result is reassuring given the non-trivial nature of the geometry considered in Case 3, with the small non-planar irregularity in the channel. The MD simulation results show this small defect reduces the mass flow rate by more than 10 % (compared to the otherwise identical Case 2). Again, our enhanced CFD technique captures this effect accurately: the flow rate is reduced by 12 %.

Table 2 provides an indication of the computational cost for the three full-domain MD simulations. The longest sim-

ulations presented in this paper ran in parallel (on 24 CPUs) for 18 days. The laminar-flow CFD itself has a negligible cost by comparison, although, the MD pre-simulations also require the computational resources indicated in the last row of Table 2. However, these pre-simulations need only be performed once for a particular fluid/solid combination, and then used for any number of flow geometries thereafter.

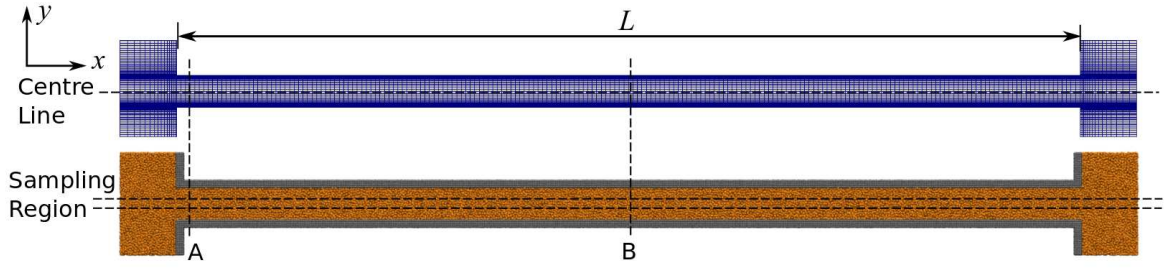
#### 4 Water flow through carbon nanotube (CNT) membranes

In this section we test the robustness of our enhanced CFD technique for cases where, in some region of the flow field, the continuum-fluid assumption is far from being valid, and where there also exist large regions of bulk fluid for which MD is prohibitively expensive. The three-dimensional flow configuration we consider is essentially the same as depicted in Figure 5, except that the two reservoirs of water, held at different pressures, are now separated by a (15,15) carbon nanotube (CNT) of length 50 nm and diameter approximately 2 nm; since the domain is periodic in the  $y$ - and  $z$ -directions this setup represents a regularly repeated array of CNTs. The flow of water through CNTs has recently been the focus of substantial research effort (Alexiadis and Kassinos, 2008) mainly due to the extremely high flow rates that have been both predicted (Nicholls et al, 2012) and measured (Mattia and Gogotsi, 2008; Whitby and Quirke, 2007). These flow rates are often expressed as an enhancement factor, which is the ratio of water flow rates along the CNT to those predicted by classical fluid dynamics (i.e. the Hagen-Poiseuille equation). The low friction associated with this water transport, and the high selectivity of CNTs, makes CNTs (and other nanotubes) excellent candidates for high-efficiency desalination and other filtration applications. The high flow rates, often reported as being orders of magnitude greater than classical flow theory predicts (Whitby and Quirke, 2007), are typically attributed to both weak surface-fluid interactions and molecular ordering/layering that enables water molecules to pass efficiently along the CNT in a semi-ordered or structured manner.

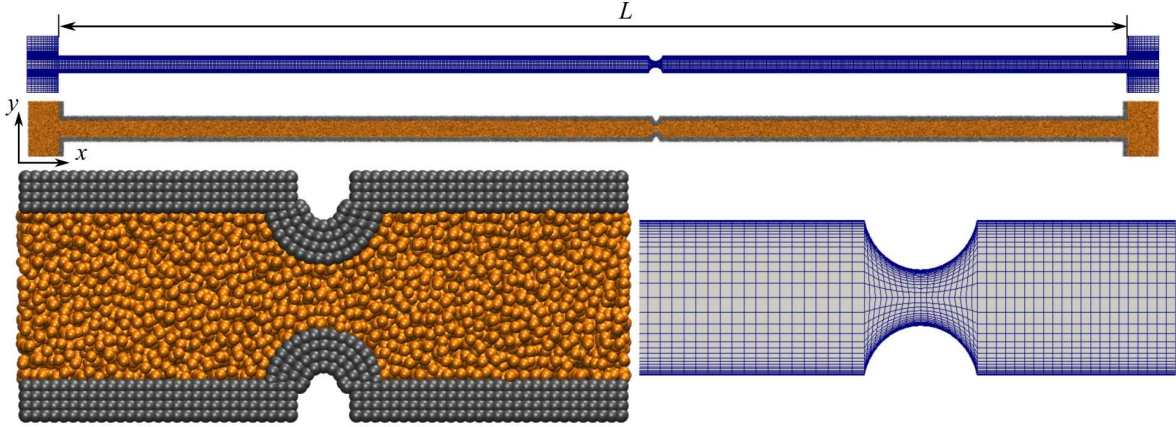
Clearly, this kind of flow is difficult to describe accurately with a continuum-fluid model, but we demonstrate below that reasonable results can still be obtained for some spatially- and temporally-averaged properties. The likely reason that our enhanced CFD estimates are reasonable is that the flow in the CNT is dictated by the liquid interaction with the smooth graphitic surface (which is adequately modelled), despite the non-continuum conditions within the fluid.

<sup>2</sup> Strictly speaking, we mean ‘MD accuracy’ here, but for brevity we just refer to ‘accuracy’.





**Fig. 5** Two-dimensional CFD mesh (top) and MD domain (bottom): Case 1,  $L = 108.8$  nm; Case 2,  $L = 231.2$  nm. Both channels are of width 4.08 nm.



**Fig. 6** Two-dimensional CFD and MD domains for Case 3 (top); close-up view of the channel irregularity (bottom) as an MD realisation (left) and a CFD mesh (right).

**Table 1** Mass flow rate predictions (per unit length, because of the 2D geometry) for each channel case and model. The percentage difference (error) between the mass flow rates predicted by the CFD models and the full MD results are presented in parentheses.

	full MD $\dot{m}_{md} \times 10^{-4}$ [kg/m/s]	enhanced CFD $\dot{m}_A \times 10^{-4}$ [kg/m/s]	no-slip CFD $\dot{m}_B \times 10^{-4}$ [kg/m/s]	incomp. slip CFD $\dot{m}_C \times 10^{-4}$ [kg/m/s]
Short Channel	3.25	3.18 (-2.3%)	1.13 (-65%)	4.21 (+29%)
Long Channel	1.57	1.51 (-3.7%)	0.53 (-66%)	2.09 (+33%)
Defect Channel	1.32	1.35 (+2.2%)	0.49 (-63%)	1.87 (+41%)

#### 4.1 MD pre-simulation results

The MD pre-simulations for this case are constructed identically to these of Section 3, including the dimensions of the geometry. Here, though, the TIP4P/2005 molecular water model is used to describe the condensed phase of water, while the solid boundary walls consist of atom-thick graphene sheets that are modelled using 663 frozen carbon atoms. The exact interatomic potentials used are given in Appendix A.2. As water is a well-known fluid, we use data from NIST (Linstrom and Mallard, 2001) for the pressure-density and density-viscosity relationships, both of which are fitted to quadratic polynomials. For the pressure-density relationship the equation used is  $p = 0.00684\rho^2 - 11.49\rho + 4655$ , and for the density-viscosity relationship we use:  $\mu = 1.413 \times 10^{-8}\rho - 2.879 \times 10^{-5}\rho + 0.01555$ .

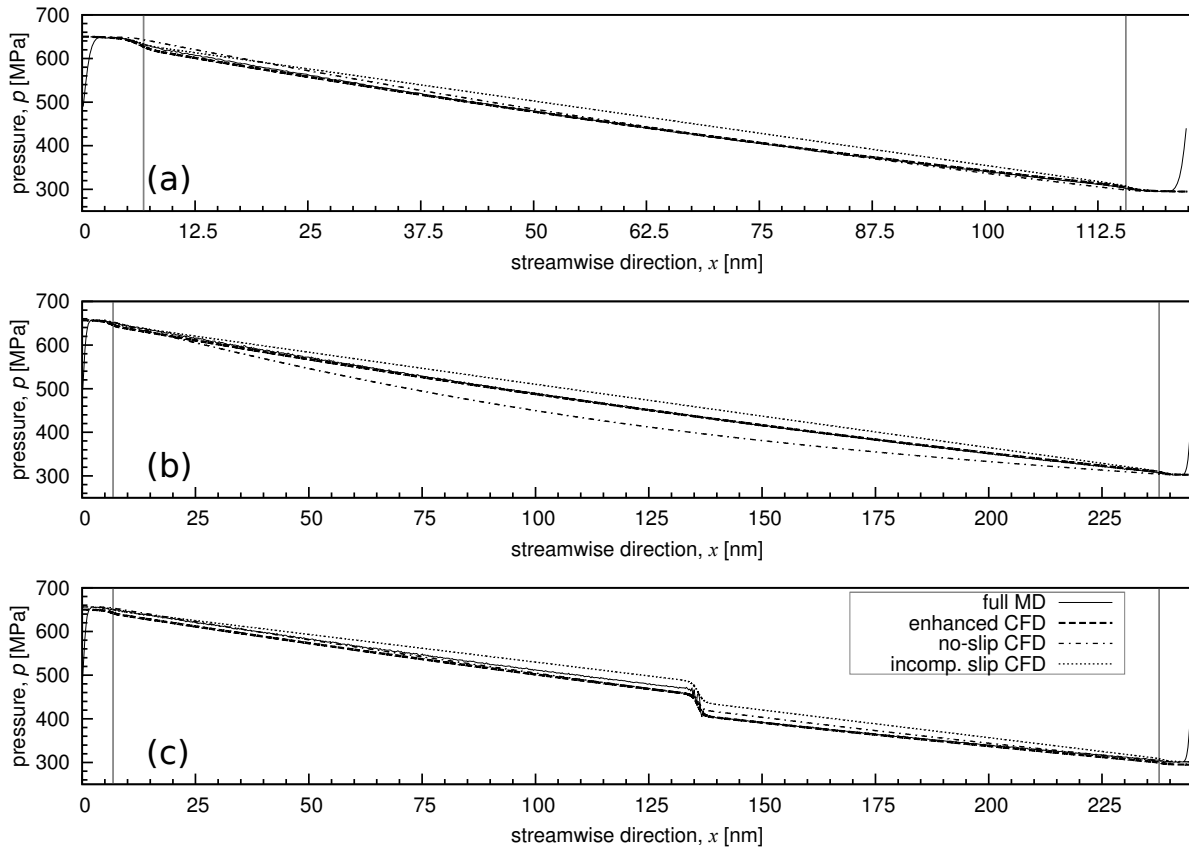
MD pre-simulations provide values for the surface displacement (i.e. from the carbon atoms to the fluid) and the slip length over the range of densities within the channel. As the strain rate is low we only use three data points to model a linear dependency of the slip length on density i.e.,

$$\xi = c_1\rho + c_2, \quad (6)$$

where  $c_1$  and  $c_2$  are parameters of the fit and are  $-2.8248 \times 10^{-10} \text{ kg}^{-1}\text{m}^4$  and  $3.3117 \times 10^{-7} \text{ nm}$ , respectively. In this case, for the enhanced CFD simulations we take  $\delta = 0.266 \text{ nm}$  and the slip length relationship is shown in Figure 10.

#### 4.2 Simulation results

We again compare our enhanced CFD predictions against full MD results and against the standard CFD models outlined in §3. The CFD mesh is chosen to be fine enough



**Fig. 7** Pressure along the centerline of (a) Case 1 (short channel), (b) Case 2 (long channel), and (c) Case 3 (defect channel). The vertical lines at  $x = 6.8$  nm and  $x = 115.6$  nm (for Case 1) and at  $x = 6.8$  nm and  $x = 238$  nm (for Cases 2 and 3), indicate the inlet and outlet positions, respectively. Full MD (—), enhanced CFD (---), no-slip CFD (-.-) and incomp. slip CFD (···).

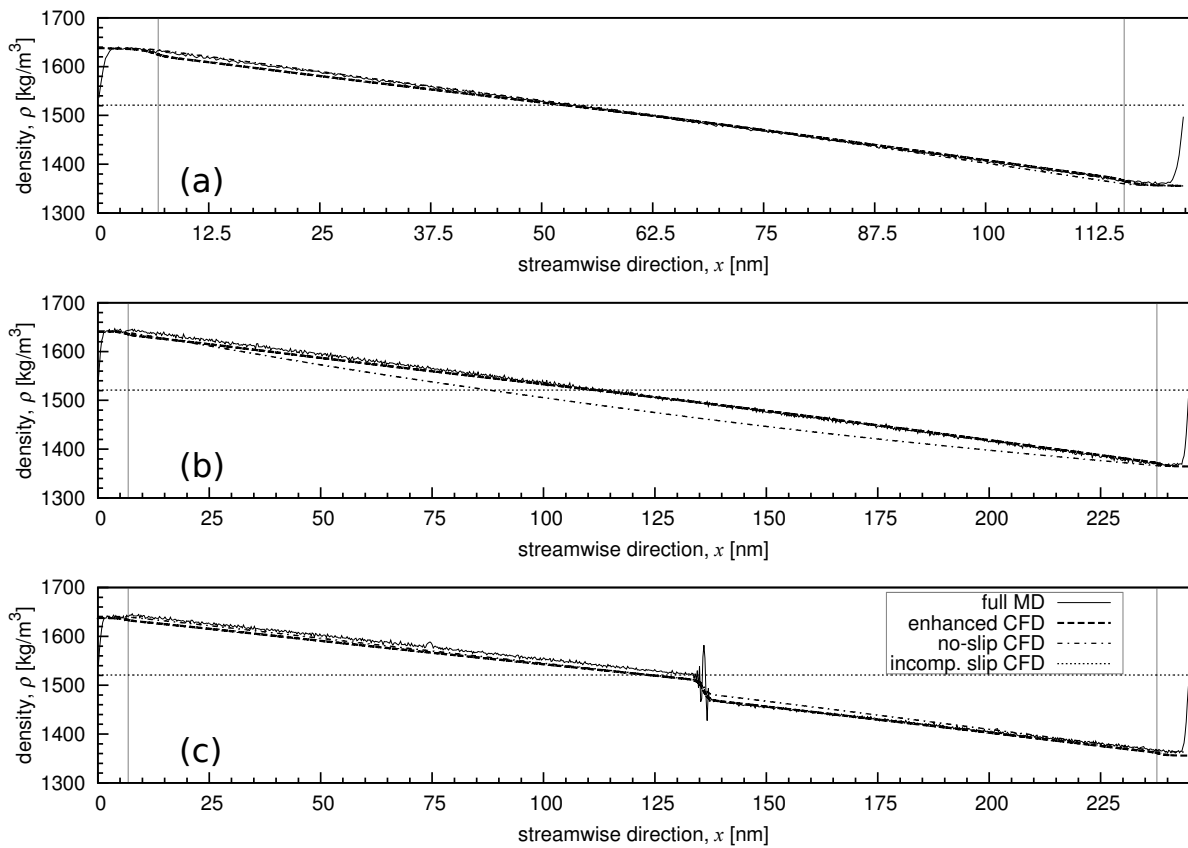
**Table 2** Computational costs: the first three rows are the full MD simulations, while the last row is the MD pre-simulation that is used to collect the data for the enhanced CFD.

	CPUs	Liquid molecules	Wall molecules	time per MD time-step	total computational time
Short Channel	24	89,146	133,424	0.7 s	10 days
Long Channel	24	162,084	275,280	1.3 s	18 days
Defect Channel	24	161,369	276,830	1.3 s	18 days
MD pre-simulations	24	5073 to 6668	4160	0.14 s	4 days per liquid/solid combination

to safely give mesh-independent results for mass flow rate; given that the cost of the CFD simulations is extremely small, achieving this poses no particular problem. The pressure difference between the reservoirs is set to be 200 MPa because it is very challenging to obtain useful information from MD using only low pressure differences due to the extended sampling times required to filter low-velocity signals from the thermal noise (Nicholls et al, 2012). These high pressure (and consequently density) differences make the CFD predictions even more challenging. The full MD simulation was performed in parallel on 48 CPUs, with the majority of the computational effort attributable to the two reservoir regions. These have dimensions  $4.4 \times 10.6 \times 10.3$  nm and are chosen to be large enough to avoid any effects on the CNT flow due

to reservoir boundaries. The intermolecular potentials used are the same as those in the pre-simulation, as given in Appendix A.2.

Figure 11 shows pressure and density plots along the centreline of the CNT; in the MD this is done within a cylinder of radius 0.1577 nm about the centerline. Due to the substantial density fluctuations within the MD simulations (see Figure 11(b)), a bulk density effectively does not exist, and the choice of the size of this sampling region can substantially affect the bulk density measured. The no-slip CFD model does not exhibit large pressure drops at the inlet and the outlet due to the much lower velocity in the tube (and therefore there are lower accelerations at the inlet and outlet) than in the slip cases. Cross-sectional velocity profiles



**Fig. 8** Density along the centerline of (a) Case 1 (short channel), (b) Case 2 (long channel), and (c) Case 3 (defect channel). The vertical lines at  $x = 6.8$  nm and  $x = 115.6$  nm (for Case 1) and at  $x = 6.8$  nm and  $x = 238$  nm (for Cases 2 and 3), indicate the inlet and outlet positions, respectively. Full MD (—), enhanced CFD (---), no-slip CFD (···) and incomp. slip CFD (-·-).

**Table 3** Water mass flow rate predictions for each model of the CNT. The percentage difference (error) between the mass flow rates predicted by the CFD models and the full MD results are presented in parentheses.

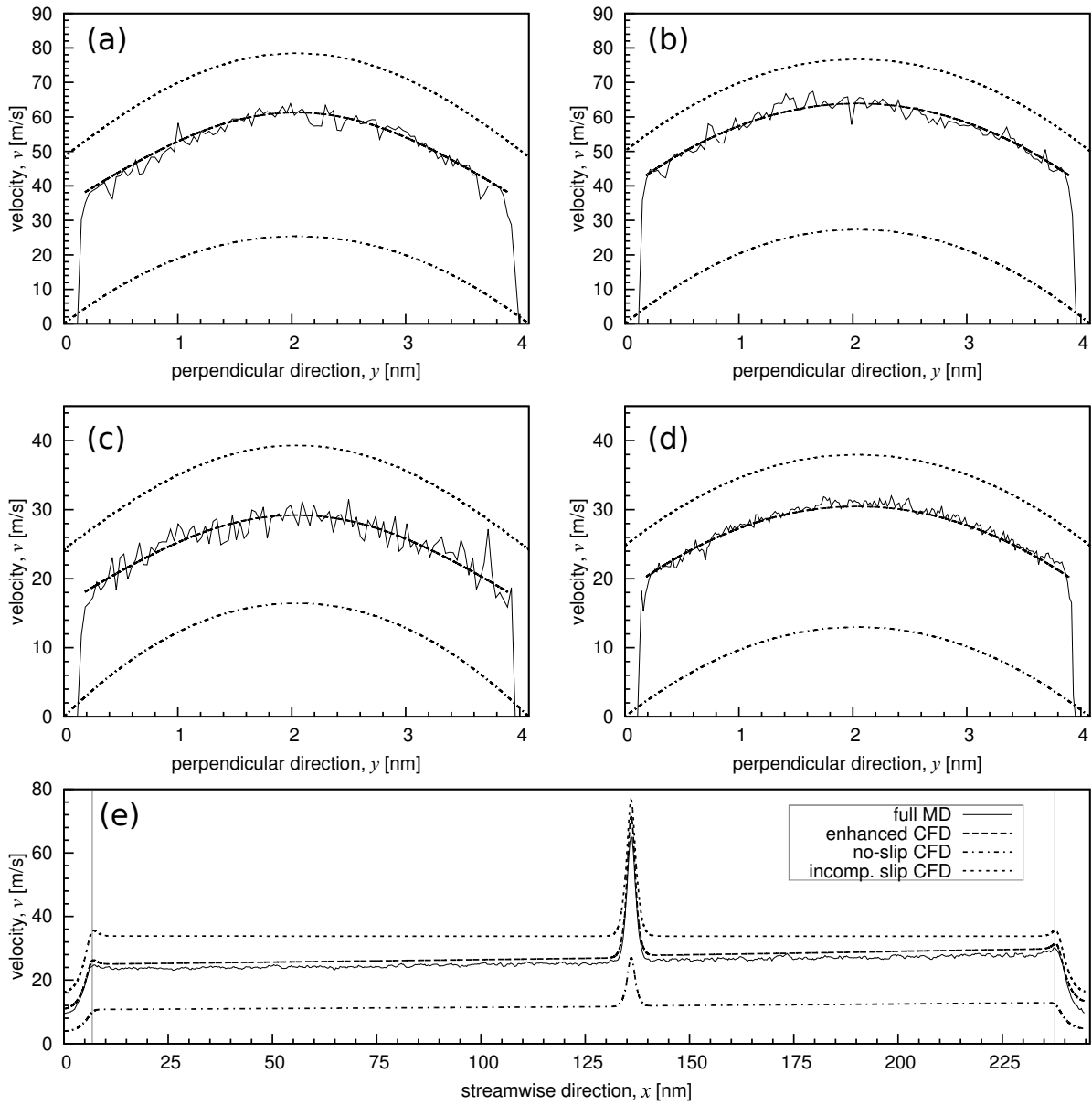
	full MD ( $\dot{m}_{md} \times 10^{14}$ kg/s)	enhanced CFD ( $\dot{m}_A \times 10^{14}$ kg/s)	no-slip CFD ( $\dot{m}_B \times 10^{14}$ kg/s)	incomp. slip CFD ( $\dot{m}_C \times 10^{14}$ kg/s)
CNT	4.3	3.3 (-23%)	0.15 (-97%)	9.0 (+109%)

in the centre of the CNT are plotted in Figure 12(a). The mass flow rate in the full MD simulation is measured to be  $4.3 \times 10^{-14}$  kg/s, which is 23 % greater than that predicted by our enhanced CFD. That this is a significant improvement on conventional CFD model predictions is indicated in Table 3.

Given the  $\sim 2$  nm diameter of the (15,15) CNT and despite the molecular layering that actually occurs within the flow field, as evidenced in Figure 12(b), our enhanced CFD approach can be considered reasonably robust in predicting important averaged fluid properties to the correct order of magnitude. These CFD results are obtained with negligible cost in comparison to full MD simulations.

## 5 Discussion and conclusions

A new procedure for solving nano-scale flows using CFD has been presented. The state, constitutive, and boundary condition information for the CFD solver is extracted from MD pre-simulations. We have demonstrated that this enhanced solver can then provide good predictions for a range of nano-scale flow geometries. A number of questions and possibilities now arise. What happens when CFD is applied far beyond the limits of its applicability? For example, how robust is the predictive performance of CFD at the nano scale? These questions have been addressed, at least to some extent, by our results for water flow along a CNT. Our answer is: CFD can be more robust than perhaps is often implied in the literature. A deeper investigation into how CFD and the continuum-fluid model perform at the limits of their applicability is needed; unfortunately, this may be restricted



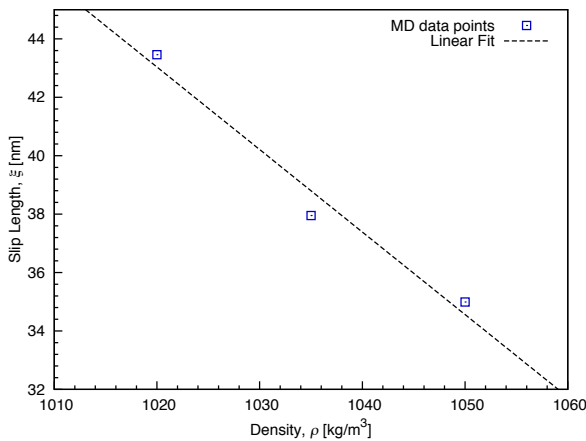
**Fig. 9** Streamwise velocity profiles for (a) Case 1 at section A; (b) Case 1 at section B; (c) Case 2 at section A; (d) Case 2 at section B; and (e) Case 3 along the centre line. The vertical lines at  $x = 6.8$  nm and  $x = 238$  nm in (e) represent the inlet and outlet, respectively. Full MD (—), enhanced CFD (---), no-slip CFD (···) and incomp. slip CFD (-·-·).

by the need to assess their accuracy by comparison with expensive MD simulations.

Another natural question relates to how these CFD simulations should be used given that, by comparison with MD, they are computationally cheap. It is not the case that CFD can replace MD for nano-scale simulations (in the same way that MD cannot replace experiment). However, there are a number of situations in which CFD enhanced with MD pre-simulations can be an invaluable affordable alternative or addition to MD. For example, in iterative conceptual design, where multiple simulations with slightly modified geometries are required; in initialising full-scale molecular dynam-

ics simulations, which would otherwise need to be simulated for a much longer time in order for the flow to develop from a stationary to a steady state (Kalweit, 2008); and in helping to locate far-field and symmetry boundaries in full-scale MD simulations, such that their influence is not felt in the flow region of interest.

There is also the possibility that enhanced CFD could be used in some cases to produce *more* realistic predictions than MD. Quite often MD simulations are performed at much higher velocities (orders of magnitude higher) than would be seen in reality, solely for the purpose of increasing the signal to noise ratio (as is the case for the CNT simulations in §4).



**Fig. 10** Slip length  $\xi$  varying with density  $\rho$  in the water/graphene case. MD pre-simulation data (symbols) with linear fit (dashed lines).

These simulations rely on the assumption that the system behaves linearly up to the extreme condition. While a full MD simulation at realistic velocities is currently extremely challenging (although not intractable (Wang et al, 2012)), a single MD pre-simulation for one fluid/solid combination is far less so. This would enable enhanced CFD to be used to investigate whether the linear response assumption is likely to be valid for a particular configuration.

A criticism of this CFD approach is that it requires an assumption beforehand about the flow and fluid behaviour. For example, the viscosity coefficient for a fluid may depend on a multitude of fluid variables with a variety of functional forms; in the examples of this paper we have assumed these functional forms based on our experience. This is true also of hybrid particle/continuum methods in general and is not unique to the method we propose. The molecular-based simulations of HMM (Ren and E, 2005), for example, have to be ‘constrained’ by the overall continuum model; the choice of how the constraint is performed (i.e. what variables are to be imposed on the MD subdomain) requires similar suppositions about how the fluid will behave. Also, in the present paper we have assumed that the channels are homogeneously filled with fluid before the simulation begins. This neglects the multi-phase, transient problems that occur in the fill-up process of a CNT or the flow through nano-pores, such as an aquaporin. Currently, these types of problems could not be solved by our enhanced CFD.

An additional advantage of the approach in this paper is that it can be deployed recursively (and not necessarily for the same CFD simulation, or by the same researcher/designer). For example, a basic pre-simulation could be used to make a first-estimate CFD prediction; subsequent MD simulations could then be used to refine and finesse the fluid and interface models, thereby producing successively more accurate CFD predictions. Users would need to approach this refine-

ment and finessing of fluid property models for enhanced CFD in the same way as they would a conventional mesh-dependency study.

## Acknowledgments

This work is financially supported in the UK by EPSRC Programme Grant EP/I011927/1 and EPSRC grants EP/K038664/1 and EP/K038621/1. Our calculations were performed on the high performance computer ARCHIE at the University of Strathclyde, funded by EPSRC grants EP/K000586/1 and EP/K000195/1.

## A Appendix

### A.1 MD intermolecular potentials for the Lennard-Jones cases

For the straight channel and defect channel simulations we use a simple monatomic fluid with the Lennard-Jones (LJ) 6-12 potential with a cut-off radius:

$$U_{LJ}(r_{ij}) = \begin{cases} 4\epsilon \left[ \frac{\sigma^{12}}{r_{ij}^{12}} - \frac{\sigma^6}{r_{ij}^6} \right] & \text{if } r_{ij} \leq r_c, \\ 0 & \text{if } r_{ij} > r_c, \end{cases} \quad (\text{A.1})$$

where  $\sigma$  and  $\epsilon$  are the length in the system and energy characteristics of the potential, and  $r_c$  is the cut-off separation. The  $\sigma$  and  $\epsilon$  properties for the liquid-liquid and wall-liquid interactions are taken from Thompson and Troian (1997):  $\sigma_{l-l} = 3.4 \times 10^{-10}$  m,  $\epsilon_{l-l} = 1.657 \times 10^{-21}$  J,  $\sigma_{w-l} = 2.55 \times 10^{-10}$  m,  $\epsilon_{w-l} = 0.33 \times 10^{-21}$  J and  $r_c = 1.36$  nm. The solid mass density is  $\rho_w = 6.809 \times 10^3$  kg/m<sup>3</sup>, and the liquid mass density is  $\rho_l = 1.431 \times 10^3$  kg/m<sup>3</sup>, where the mass of one wall or liquid molecule is  $6.6904 \times 10^{-26}$  kg. The time-step in the MD simulations is 5.4 fs.

### A.2 MD intermolecular potentials for the water in a CNT case

The rigid TIP4P/2005 water model (Abascal and Vega, 2005; Huggins, 2012; Vega and Abascal, 2011) is used. This water model consists of four interacting sites: one oxygen atom (O) with no charge but which is the centre of the Lennard-Jones potential, two hydrogen sites (H) each with a fixed point charge of  $q_H = 0.5564 e$ , and a massless site (M) with charge  $q_M = -1.1128 e$ . All oxygen atoms interact using the Lennard-Jones potential, Eqn. (A.1) with  $\epsilon_{O-O} = 0.7749 \times 10^{-21}$  J and  $\sigma_{O-O} = 3.1589 \times 10^{-10}$  m. Water-carbon interactions also use the LJ potential between carbon and oxygen atoms with  $\sigma_{C-O} = 3.19 \times 10^{-10}$  m and  $\epsilon_{C-O} = 0.709302 \times 10^{-21}$  J as in Ritos et al (2014). These values reproduce the macroscopic contact angle of a water droplet on a graphitic surface, using the methodology of Werder et al (2003). The other charged sites interact via the Coulomb potential:

$$U_C(r_{ij}) = \frac{1}{4\pi\epsilon_0} \frac{q_i q_j}{r_{ij}}, \quad (\text{A.2})$$

where  $q_i, q_j$  are the site charges and  $\epsilon_0$  is the vacuum permittivity. To reduce computational time, this potential is shifted to be zero at

$r_c = 1.0$  nm:

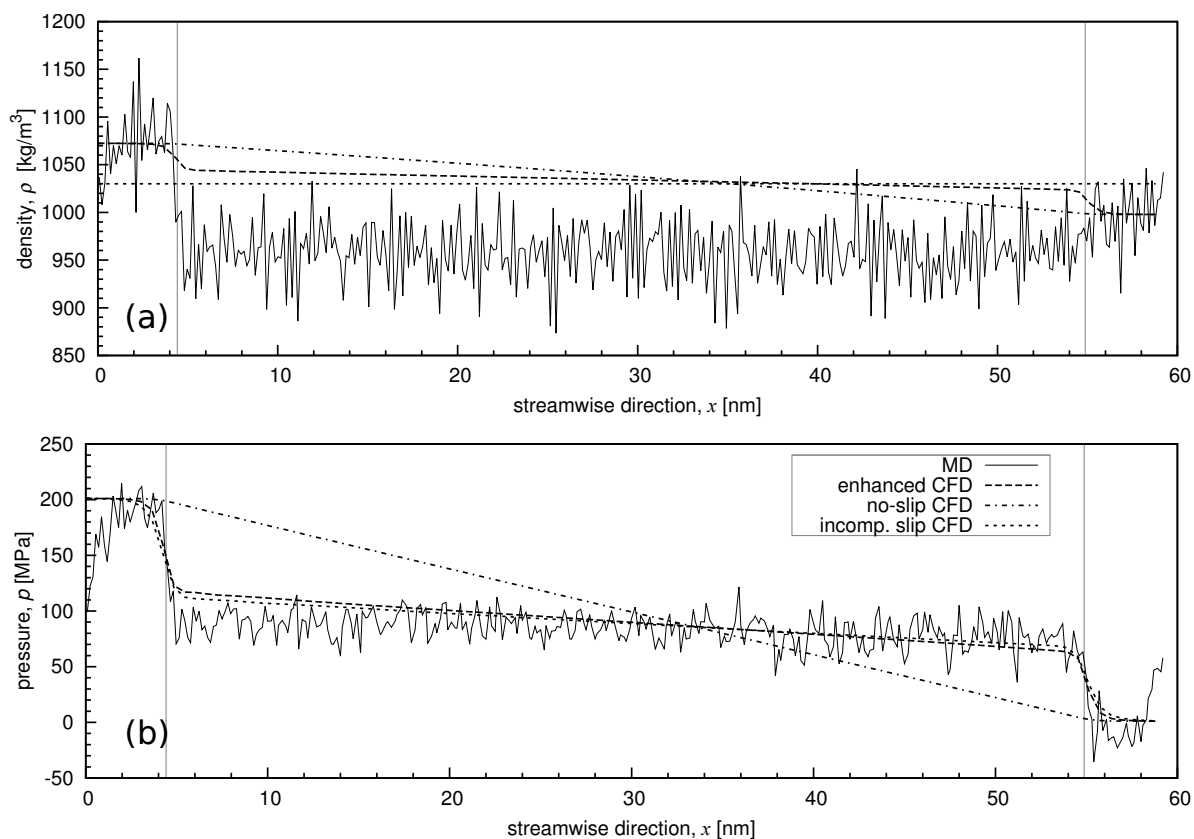
$$U_C(r_{ij}) = \begin{cases} U_C(r_{ij}) - U_C(r_c) & \text{if } r_{ij} \leq r_c, \\ 0 & \text{if } r_{ij} > r_c. \end{cases} \quad (\text{A.3})$$

The time-step for all MD water simulations is set to 2.16 fs.

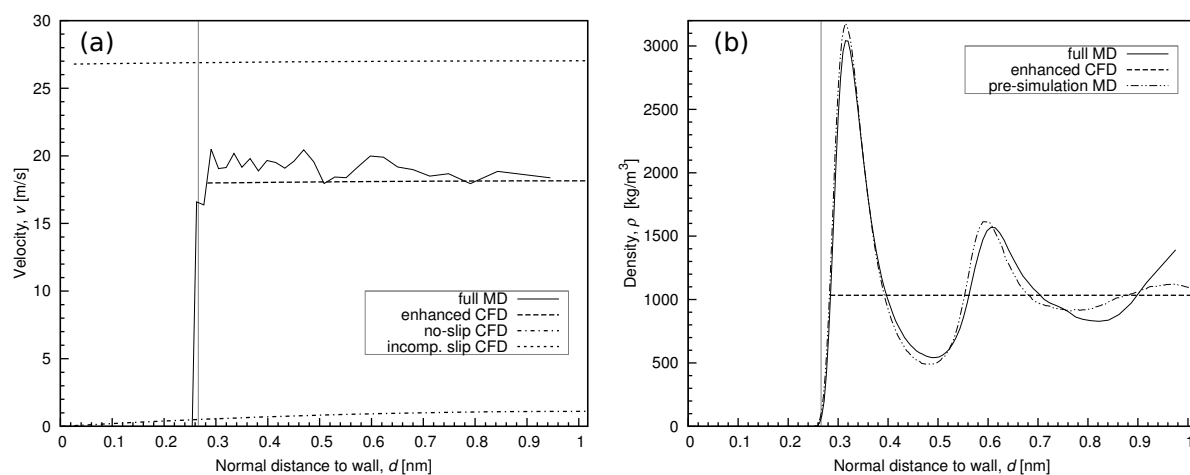
## References

- Abascal JLF, Vega C (2005) A general purpose model for the condensed phases of water: TIP4P/2005. *The Journal of Chemical Physics* 123:234,505
- Alexiadis A, Kassinos S (2008) Molecular simulation of water in carbon nanotubes. *Chemical Reviews* 108(12):5014–5034
- Asproulis N, Kalweit M, Drikakis D (2012) A hybrid molecular continuum method using point wise coupling. *Advances in Engineering Software* 46(1):85–92
- Berendsen H, Postma J, van Gunsteren W, DiNola A, Haak J (1984) Molecular dynamics with coupling to an external bath. *The Journal of Chemical Physics* 81(8):3684–3690
- Bernardi S, Todd B, Searles DJ (2010) Thermostating highly confined fluids. *The Journal of chemical physics* 132(24):244,706
- Bocquet L, Barrat JL (1994) Hydrodynamic boundary conditions, correlation functions, and kubo relations for confined fluids. *Physical Review E* 49(4):3079
- Bocquet L, Charlaix E (2010) Nanofluidics, from bulk to interfaces. *Chemical Society Reviews* 39(3):1073–1095
- Borg MK, Macpherson GB, Reese JM (2010) Controllers for imposing continuum-to-molecular boundary conditions in arbitrary fluid flow geometries. *Molecular Simulation* 36(10):745–757
- Borg MK, Lockerby DA, Reese JM (2014) The fade mass-stat: a technique for inserting or deleting particles in molecular dynamics simulations. *The Journal of Chemical Physics*, in press
- Cadusch PJ, Todd B, Zhang J, Daivis PJ (2008) A non-local hydrodynamic model for the shear viscosity of confined fluids: analysis of a homogeneous kernel. *Journal of Physics A: Mathematical and Theoretical* 41(3):035,501
- Docherty SY, Nicholls WD, Borg MK, Lockerby DA, Reese JM (2014) Boundary conditions for molecular dynamics simulations of water transport through nanotubes. *Proceedings of the Institution of Mechanical Engineers, Part C: Journal of Mechanical Engineering Science* 228:186–195
- Dongari N, Zhang Y, Reese JM (2011a) Modeling of knudsen layer effects in micro/nanoscale gas flows. *Transactions of the ASME-I Journal of Fluids Engineering* 133(7):071,101
- Dongari N, Zhang Y, Reese JM (2011b) Molecular free path distribution in rarefied gases. *Journal of Physics D: Applied Physics* 44(12):125,502
- E W, Ren W, Vanden-Eijnden E (2009) A general strategy for designing seamless multiscale methods. *Journal of Computational Physics* 228(15):5437–5453
- Einzel D, Panzer P, Liu M (1990) Boundary condition for fluid flow: Curved or rough surfaces. *Physical Review Letters* 64(19):2269–2272
- Gad-el Hak M (2010) *MEMS: Introduction and Fundamentals*. CRC press
- Hansen JS, Todd B, Daivis PJ (2011) Prediction of fluid velocity slip at solid surfaces. *Physical Review E* 84(1):016,313
- Huang C, Choi P, Nandakumar K, Kostiuk L (2007) Comparative study between continuum and atomistic approaches of liquid flow through a finite length cylindrical nanopore. *The Journal of Chemical Physics* 126(22):224,702–224,702
- Huggins DJ (2012) Correlations in liquid water for the TIP3P-Ewald, TIP4P-2005, TIP5P-Ewald, and SWM4-NDP models. *The Journal of Chemical Physics* 136:064,518
- Irving J, Kirkwood JG (1950) The statistical mechanical theory of transport processes. iv. the equations of hydrodynamics. *The Journal of Chemical Physics* 18:817–829
- Joseph S, Aluru N (2008) Why are carbon nanotubes fast transporters of water? *Nano Letters* 8(2):452–458
- Kalweit M (2008) *Molecular modelling of meso- and nanoscale dynamics*. PhD thesis, Cranfield University
- Kannam SK, Todd B, Hansen JS, Daivis PJ (2012) Slip length of water on graphene: Limitations of non-equilibrium molecular dynamics simulations. *The journal of chemical physics* 136(2):024,705
- Linstrom PJ, Mallard WG (2001) NIST chemistry webbook; NIST standard reference database no. 69 <http://webbook.nist.gov>
- Macpherson GB, Reese JM (2008) Molecular dynamics in arbitrary geometries: parallel evaluation of pair forces. *Molecular Simulation* 34(1):97–115
- Macpherson GB, Borg MK, Reese JM (2007) Generation of initial molecular dynamics configurations in arbitrary geometries and in parallel. *Molecular Simulation* 33(15):1199–1212
- Mattia D, Gogotsi Y (2008) Review: static and dynamic behavior of liquids inside carbon nanotubes. *Microfluidics and Nanofluidics* 5(3):289–305
- Mohamed KM, Mohamad AA (2010) A review of the development of hybrid atomistic–continuum methods for dense fluids. *Microfluidics and Nanofluidics* 8(3):283–302
- Nicholls WD, Borg MK, Lockerby DA, Reese JM (2012) Water transport through (7, 7) carbon nanotubes of different lengths using molecular dynamics. *Microfluidics and Nanofluidics* 12(1-4):257–264
- O’Connell ST, Thompson PA (1995) Molecular dynamics-continuum hybrid computations: A tool for studying complex fluid flows. *Physical Review E* 52:R5792–R5795, DOI 10.1103/PhysRevE.52.R5792, URL <http://link.aps.org/doi/10.1103/PhysRevE.52.R5792>
- OpenFOAM (2013) The open source CFD toolbox. <http://www.openfoam.org>
- Patronis A, Lockerby DA, Borg MK, Reese JM (2013) Hybrid continuum–molecular modelling of multiscale internal gas flows. *Journal of Computational Physics* 255:558–571
- Ren W, E W (2005) Heterogeneous multiscale method for the modeling of complex fluids and micro-fluidics. *Journal of Computational Physics* 204(1):1 – 26, DOI 10.1016/j.jcp.2004.10.001, URL <http://www.sciencedirect.com/science/article/pii/S0021999104004048>
- Ritos K, Mattia D, Calabr F, Reese JM (2014) Flow enhancement in nanotubes of different materials and lengths. *The Journal of Chemical Physics* 140(1):014702, DOI <http://dx.doi.org/10.1063/1.4846300>, URL <http://scitation.aip.org/content/aip/journal/jcp/140/1/10.1063/1.4846300>
- Saidur R, Leong KY, Mohammad HA (2011) A review on applications and challenges of nanofluids. *Renewable and Sustainable Energy Reviews* 15:1646–1668
- Sofos F, Karakasis T, Liakopoulos A (2009) Transport properties of liquid argon in krypton nanochannels: Anisotropy and non-homogeneity introduced by the solid walls. *International Journal of Heat and Mass Transfer* 52(3–4):735–743
- Thompson PA, Troian SM (1997) A general boundary condition for liquid flow at solid surfaces. *Nature* 389(6649):360–362, DOI 10.1038/38686, URL <http://www.nature.com/nature/journal1/v389/n6649/full/389360a0.html>
- Todd B (2005) Cats, maps and nanoflows: some recent developments in nonequilibrium nanofluidics. *Molecular Simulation* 31(6-7):411–428
- Todd B, Hansen J, Daivis PJ (2008) Nonlocal shear stress for homogeneous fluids. *Physical review letters* 100(19):195,901
- Travis KP, Todd BD, Evans DJ (1997) Departure from Navier-Stokes hydrodynamics in confined liquids. *Physical Review E* 55(4):4288

- Vega C, Abascal JLF (2011) Simulating water with rigid non-polarizable models: a general perspective. *Physical Chemistry Chemical Physics* 13(44):19,663–19,688
- Wang L, Dumont RS, Dickson JM (2012) Nonequilibrium molecular dynamics simulation of water transport through carbon nanotube membranes at low pressure. *The Journal of Chemical Physics* 137:044,102
- Wen D, Lin G, Vafaei S, Zhang K (2009) Review of nanofluids for heat transfer applications. *Particuology* 7(2):141–150
- Werder T, Walther JH, Jaffe RL, Halicioglu T, Koumoutsakos P (2003) On the water-carbon interaction for use in molecular dynamics simulations of graphite and carbon nanotubes. *The Journal of Physical Chemistry B* 107(6):1345–1352
- Whitby M, Quirke N (2007) Fluid flow in carbon nanotubes and nanopipes. *Nature Nanotechnology* 2(2):87–94
- Zhang H, Zhang Z, Ye H (2012) Molecular dynamics-based prediction of boundary slip of fluids in nanochannels. *Microfluidics and Nanofluidics* 12(1-4):107–115



**Fig. 11** Water density and pressure along the centerline of the CNT. The noise in the MD data is due to the relatively small number of molecules being sampled in the absence of a well defined ‘bulk-flow’ region. The vertical lines at  $x = 4.4$  nm and  $x = 55.8$  nm represent the inlet and outlet, respectively. Full MD (—), enhanced CFD (---), no-slip CFD (-·-) and incomp. slip CFD (···).



**Fig. 12** (a) Streamwise velocity cross-sectional profile in the longitudinal center of the CNT, and (b) the radial water density profile within the CNT. The vertical lines at  $x = 0.266$  nm indicate the position of the CFD surface; the CNT surface atom centres are at  $x = 0$ .