

1 **Simulating the molecular density distribution during multi-** 2 **phase fluid intrusion in heterogeneous media**

3 Mingzhi Wang^{a,b,c*,#}, Beimeng Qi^{d,#}, Yushi Liu^{a,b,c}, Abir Al-Tabbaa^e, Wei Wang^{a,b,c}

4 ^{a#} School of Civil Engineering, Harbin Institute of Technology, Harbin, 150090, CN

5 ^b Key Lab of Structures Dynamic Behavior and Control of the Ministry of Education, Harbin Institute
6 of Technology, Harbin, 150090, CN

7 ^c Key Lab of Smart Prevention and Mitigation of Civil Engineering Disasters of the Ministry of
8 Industry and Information Technology, Harbin Institute of Technology, Harbin, 150090, CN

9 ^{d#} College of Quality & Safety Engineering, China Jiliang University, Hangzhou, 310018, CN

10 ^e Department of Engineering, University of Cambridge, Cambridge, CB2 1PZ, UK

11 *Corresponding author.

12 E-mail address: mwang@hit.edu.cn (M. Wang);

13 [#]These authors and affiliations contributed equally to this work.

14 **Abstract**

15 A computational recovery of multi-phase intrusion was discussed with the modified multi-relaxation
16 time Lattice Boltzmann method (MRT-LBM). Originally proposed dual-matrix computation is
17 developed to address the different phase separation and interface tracking for the multi-phase problem.
18 A comprehensive validation is performed with the previously theorized observation of the mercury-
19 water system. Results show that the dual-matrix computation is feasible to provide converged output
20 under narrowed density difference down to 18%. The wetting and non-wetting behaviour resulted
21 from form solid-fluid interaction is realized with arbitrary boundaries, in which the contact variance

22 is up to 4.14%. The linear relations described by Laplace's law and Washburn's equation were three-
23 dimensionally recovered with determination coefficients of 96.34% and 94.19%, respectively. A third
24 fluid intrusion status of partial-intrusion is captured in addition to complete-intrusion and non-
25 occupation in porous boundary, demonstrating the advanced function of the phase-separation and
26 interface tracking in problems with further increased heterogeneity.

27 **Keywords:** Porous media; Multi-phase fluid; Surface tension; Molecular density distribution; Lattice
28 Boltzmann method

29 **1. Introduction**

30 Multi-phase fluid intrusion into porous networks is a phenomenon commonly existing in problems of
31 lipid transportation (Lacatusu et al., 2019), petroleum extraction (Negahban et al., 2020), organic
32 matter emulsions (Perazzo et al., 2015) and carbon sequestration (Espinet and Shoemaker, 2013).
33 Intrusive fluid plays a crucial part in the above natural and engineering processes, where a fluid phase
34 pushes through a solid medium immersed in another liquid phase (Huppert, 1986). A comprehensive
35 understanding of the behaviour directs the design and engineering of fluid network and porous media.
36 Experimentally, the intrusion behaviour was studied with homogeneous properties such as pressure,
37 turbulence intensity and flow rate (Coasne et al., 2009; Wang et al., 2018). Although experimental
38 observation contributed to a macroscopic understanding of the multi-phase fluid behaviour, it was
39 pointed out that the microscopic interphase detection was inadequate with common approaches
40 (Hudgins, 1981). More specifically, porous media's opacity raises the difficulty to capture the
41 molecular density distribution within (Thomas et al., 2004). Hence, the essential information of 3-
42 dimensional molecular density distribution is in absence.

43 Alternatively, computational fluid dynamics (CFD) suggests a computational realization to simulate
44 the intrusive problem (Thabet and Thabit, 2018). Macroscopically, Navier-Stokes (NS) equations
45 following incompressible assumption offer a solution for intrusion behaviour in relatively large water

46 bodies (Cantero et al., 2007; Ungarish, 2005). Microscopically, molecular dynamics (MD) following
47 the spherical assumption have been adopted to simulate intrusion in nanoscale and below (Coasne et
48 al., 2009; Kim et al., 2019). Lattice Boltzmann method (LBM) is a mesoscale methodology
49 simultaneously considering the local molecular density and global fluid behaviour (Zhang, 2014),
50 where both the incompressible assumption and spherical assumption are invalid (Raabe, 2004). In
51 practice, modelling water transport in systems such as soil particles (Sun, 2018), cement particles
52 (Zhou et al., 2017), and blood vessels (Tiwari and Chauhan, 2019) requires mesoscale methodology
53 because of the intermediate Knudsen number (Pourfattah et al., 2020). More specifically, the above
54 micrometre media's characteristic system length is not large enough to neglect the discontinuity in
55 the fluid-surface region in NS solution (Basser et al., 2017). The MD solution focusing on molecules
56 and atoms in media in μm^3 requires particles amount to a magnitude order of 10^{16} , overwhelming the
57 affordable budget (Lane et al., 2010). Additionally, a mathematical description alternative to
58 analytical geometry must process the heterogeneous boundary of arbitrary media. In previous porous
59 formation studies, voxel-based algorithms were developed to realize random media processing
60 (Byholm et al., 2009; Tian et al., 2020; Wang et al., 2019). To sum, the 3D matrix-based LBM for
61 intermediate Knudsen number (Raabe, 2004) is a feasible CFD solver with adaptability to
62 computational chemistry to provide 3D molecular density distribution in heterogeneous media.

63 The intrusion phenomenon study was initiated from the capillary fluid dynamics proposed by
64 Washburn equations (Edward W. Washburn, 1921). The classic model adopted parallel tubes as the
65 solid boundary for mercury intrusion (E. W. Washburn, 1921). Governing by the surface tension
66 described by Laplace's law, the local difference in capillary interconnection was reflected by the
67 various access of the intruding fluid under the same pressure (Valentinuzzi et al., 2011). Modern fluid
68 dynamics has been developed into two directions, which are top-down and bottom-up approaches
69 (Seiffert, 2017). The top-down philosophy on intrusion simulation was demonstrated by the attempts
70 to solve the partial differential equations integrating NS equations, Washburn equations and Laplace

71 equations (Limache et al., 2007; Tarek and Lee, 2018). On the other hand, the bottom-up approaches
72 such as MD and LBM assembled the small scale mechanism to recover from large scale phenomenon
73 (Yoshimoto et al., 2013). Classic models function as endpoint validation instead of the starting point
74 calculation in the latter approach. MD recovery of the surface tension emphasized the Newtonian
75 interaction among molecules and atoms (Yoshimoto et al., 2013), in which the microscale intrusion
76 simulation results were compared with the Laplace equation (Park et al., 2001) and Washburn
77 equation (Dimitrov et al., 2007). However, the abovementioned problem of the computational budget
78 forced MD solutions to adopt simplified boundary of free volume (Park et al., 2001) and single tube
79 (Coasne et al., 2009; Dimitrov et al., 2007; Kim et al., 2019), preventing further extension in arbitrary
80 media. LBM recovery of the multi-phase phenomenon emphasizes the statistical distribution of local
81 fluid density with the Boltzmann equation (Zhang and Tian, 2008). Previous 2D LBM attempts
82 (Baakeem et al., 2020; Hyväluoma et al., 2004) on the mesoscale intrusion demonstrated the
83 feasibility of recovering surface tension with the Shan-Chen model (Shan and Chen, 1994). To
84 further develop the LBM methodology for intrusion problem, the following aspects should be
85 contributed. Firstly, the single relaxation time (SRT) collision operator (Bhatnagar et al., 1954; Qian
86 et al., 1992) adopted in previous solutions can be upgraded with the latest multi relaxation time (MRT)
87 collision operator to improve the computational stability (Coreixas et al., 2020). The streaming
88 calculation with a single matrix should be modified to provide confirmative phase separation (Lee et
89 al., 1998) and straightforward data registration (Khare et al., 2019) during the multi-phase interface
90 detection. More importantly, a 3D realization is needed to prepare the method for realistic problems.
91 This paper proposed a 3D MRT-LBM scheme to simulate the mesoscale intrusion into arbitrary
92 porous media. Mercury and water were adopted as comparing phases to dock the previous theory on
93 capillary fluid dynamics. The scheme integrates the Shan-Chen model to compute the multi-phase
94 redistribution through the bottom-up approach from surface tension recovery to macroscopic fluid
95 behaviour. Validation with the Laplace equation and Washburn equations was performed in the

96 previously reported cylindrical boundaries. The adaptability to arbitrary media was demonstrated by
 97 direct application in boundary-free volume, solid surface, single tube, parallel tubes and random
 98 porous media. The dual-matrix computation enables the registration of the multi-phase fluid for in-
 99 process monitoring. The work demonstrates an LBM solution to simulate molecular density
 100 distribution during the intrusion into heterogeneous media.

101 **2. Methods**

102 **2.1. Multi-relaxation time Lattice Boltzmann method (MRT-LBM)**

103 The LBM engine in this study adopted D3Q19 MRT-LBM through independent programming (Wang,
 104 2017). The core equations of the fluid density development were given by Eq. 1 (D'Humières et al.,
 105 2002) and Eq. 2 (Raabe, 2004).

$$106 \quad f(\mathbf{x} + \mathbf{e}_i \delta t, t + \delta t) - f(\mathbf{x}, t) = -\mathbf{M}^{-1} \cdot \mathbf{S} \cdot [\mathbf{M} \cdot f(\mathbf{x}, t) - \mathbf{M} \cdot f^{eq}(\mathbf{x}, t)] \quad (1)$$

$$107 \quad f^{eq}(\mathbf{x}, t) = w_i \rho \left[1 + \frac{\mathbf{e}_i \cdot \mathbf{u}}{c_s^2} + \frac{(\mathbf{e}_i \cdot \mathbf{u})^2}{2c_s^4} - \frac{\mathbf{e}_i \cdot \mathbf{u}}{2c_s^2} \right] \quad (2)$$

108 Where $f(\mathbf{x}, t)$ is the fluid density distribution, \mathbf{x} is the lattice coordinates, t is the fluid progression
 109 time, \mathbf{M} is the 19×19 transform matrix for MRT simulation (Premnath and Abraham, 2007) as given
 110 by **Appendix A**, \mathbf{S} is the collision matrix for MRT simulation as provided by Eq. 3 (Premnath and
 111 Abraham, 2007), $f^{eq}(\mathbf{x}, t)$ is the equilibrium density calculated with Maxwell-Boltzmann equilibrium
 112 distribution (Abdoul-Carime et al., 2015; Qian et al., 1992), \mathbf{e}_i is the velocity vectors as given by Eq.
 113 4 (Premnath and Abraham, 2007; Zhang et al., 2013), w_i is the density weighting factors as provided
 114 by Eq. 5 (Premnath and Abraham, 2007; Zhang et al., 2013), ρ is the macroscopic density
 115 distribution, $c_s^2 = 1/3$ is the lattice sound speed, \mathbf{u} is the macroscopic velocity distribution, and i is
 116 an integer between 0 to 18 for the D3Q19 simulation.

$$117 \quad \mathbf{S} = \text{diag}[1, 1.19, 1.4, 1, 1.2, 1, 1.2, 1, 1.2, 1, 1, 1, 1, 1, 1, 1, 1, 1.98, 1.98, 1.98] \quad (3)$$

$$118 \quad e_i = \begin{bmatrix} 0 & 0 & 0 & 1 & -1 & 0 & 0 & 1 & 1 & -1 & -1 & 0 & 0 & 0 & 0 & 1 & -1 & 1 & -1 \\ 0 & 1 & -1 & 0 & 0 & 0 & 0 & 1 & -1 & 1 & -1 & 1 & -1 & 1 & -1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 1 & -1 & 0 & 0 & 0 & 0 & 1 & 1 & -1 & -1 & 1 & 1 & -1 & -1 \end{bmatrix} \quad (4)$$

$$119 \quad w_i = \left[\frac{1}{3}, \frac{1}{18}, \frac{1}{18}, \frac{1}{18}, \frac{1}{18}, \frac{1}{18}, \frac{1}{18}, \frac{1}{36}, \frac{1}{36} \right] \quad (5)$$

120 The macroscopic density distribution was calculated with Eq. 6 (Chen and Doolen, 1998).

$$121 \quad \rho(\mathbf{x}, t) = \sum_{i=0}^{18} f(\mathbf{x}, t) \quad (6)$$

122 Where $\tau = 1$ is a relaxation time related to the kinematic viscosity and F is the force applied to the
 123 lattice's liquid. The dual-matrix computation was further proposed by dividing the fluid matrix into
 124 two matrices representing phase-I and phase-II, respectively. Eq. 7-9 presents the formula to calculate
 125 3D dual-phase fluid motion.

$$126 \quad f(\mathbf{x}, t) = f_I(\mathbf{x}, t) + f_{II}(\mathbf{x}, t) \quad (7)$$

$$127 \quad f_{I||II}(\mathbf{x} + e_i \delta t, t + \delta t) - f_{I||II}(\mathbf{x}, t) = -M^{-1} \cdot S \cdot [M \cdot f_{I||II}(\mathbf{x}, t) - M \cdot f_{I||II}^{eq}(\mathbf{x}, t)] \quad (8)$$

$$128 \quad f_{I||II}^{eq}(\mathbf{x}, t) = w_i \rho_{I||II} \left[1 + \frac{e_i \cdot \mathbf{u}_{I||II}}{c_s^2} + \frac{(e_i \cdot \mathbf{u}_{I||II})^2}{2c_s^4} - \frac{e_i \cdot \mathbf{u}_{I||II}}{2c_s^2} \right] \quad (9)$$

129 The macroscopic velocity distribution was calculated with Eq. 10 and 11 (Benzi et al., 2006; Shan
 130 and Chen, 1993; Zhang, 2013).

$$131 \quad u_I(\mathbf{x}, t) = \frac{1}{\rho_I(\mathbf{x}, t)} \sum_{i=0}^{18} f_I(\mathbf{x}, t) \cdot e_i + \frac{\tau F_I(\mathbf{x}, t)}{\rho_I(\mathbf{x}, t)} \quad (10)$$

$$132 \quad u_{II}(\mathbf{x}, t) = \frac{1}{\rho_{II}(\mathbf{x}, t)} \sum_{i=0}^{18} f_{II}(\mathbf{x}, t) \cdot e_i + \frac{\tau F_{II}(\mathbf{x}, t)}{\rho_{II}(\mathbf{x}, t)} \quad (11)$$

133 The interaction between the two phases was accounted for through the computation of the inter-force.
 134 If the force terms take the value of zero, the two phases' motion will independently follow the
 135 Maxwell-Boltzmann equilibrium distribution, and no phase separation will be formed. In the mercury
 136 intrusion phenomenon, the phase separation between phase-I and phase-II is essential to obtain the
 137 phase progression paths. Therefore, the force term calculated with the Shan-Chen model (Shan et al.,

138 1993) was further introduced.

139 **2.2. Integrating the Shan-Chen model**

140 The fluid phases of the triple-phase simulation were initially registered as phase-I and phase-II. The
141 solid phase was registered as phase-S. The force term of phase-I was calculated with Eq. 12

$$142 F_I(x, t) = F_{I-I}(x, t) + F_{I-II}(x, t) + F_{I-S}(x, t) \quad (12)$$

143 Where $F_I(x, t)$ is the force applied on the phase-I in the lattice of x , F_{I-I} is the force from the phase-
144 I in the lattice other than x , F_{I-II} is the force form the phase-II in the lattice other than x and F_{I-S} is
145 the force form the solid phase when the lattice x in contact with the tangible interface. F_{I-I} , F_{I-II} and
146 F_{I-S} were calculated with Eq. 13-15, respectively, based on the original Shan-Chen model
147 (Parmigiani et al., 2016; Shan et al., 1993).

$$148 F_{I-I}(x, t) = -G_{I-I}\psi_I(x, t) \sum_{i=1}^{18} w_i \psi_I(x + e_i, t) \quad (13)$$

$$149 F_{I-II}(x, t) = -G_{I-II}\psi_I(x, t) \sum_{i=1}^{18} w_i \psi_{II}(x + e_i, t) \quad (14)$$

$$150 F_{I-S}(x, t) = -G_{I-S}\psi_I(x, t) \sum_{i=1}^{18} w_i \psi_S(x + e_i, t) \quad (15)$$

151 G is an interaction coefficient; ψ is the effective mass calculated with Eq. 16 (Shan et al., 1993; Shan
152 and Chen, 1993). $G < 0$ represents attractive inter forces and $G > 0$ represents repulsive forces. The
153 density of the solid phase was fixed as $\rho_S = 5.3$.

$$154 \Psi(x, t) = 1 - e^{-\rho(x,t)} \quad (16)$$

155 The computation of the force terms F_{II} followed the same approach, and the involved coefficients of
156 interaction were G_{II-II} , G_{II-I} and G_{II-S} . Table 1 presents the interaction coefficient adopted in this
157 study.

G_{I-I}	G_{I-II}	G_{I-S}
-0.05	2.5	-0.1

G_{II-II}	G_{II-I}	G_{II-S}
-0.8	2.5	0.1

Table 1: Coefficient of interaction in the triple-phase Shan-Chen model

158

159 In the original Shan-Chen model, the bulk fluid phase's internal pressure was calculated with Eq. 17
 160 (Benzi et al., 2006; He et al., 1999; Qin et al., 2018).

$$161 \quad P(\mathbf{x}, t) = \rho(\mathbf{x}, t)c_s^2 + \frac{1}{2}c_s^2 G \psi(\mathbf{x}, t)^2 \quad (17)$$

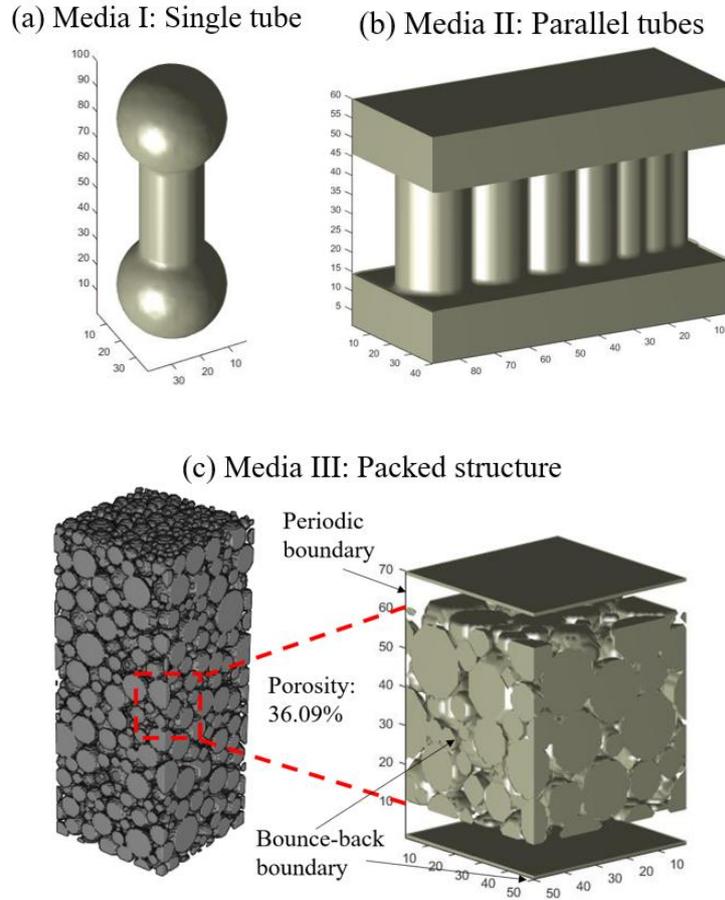
162 Where the right-hand consists of the density term and the interaction term. In this study, the density
 163 terms were considered the sum of the two phases, and the interaction term was expanded with the I-
 164 I, II-II, I-II interaction. Eq. 18 presents the modified formula for bulk pressure computation.

$$165 \quad P = (\rho_I + \rho_{II})c_s^2 + \frac{1}{2}c_s^2 (G_{I-I}\psi_I^2 + G_{II-II}\psi_{II}^2 + G_{I-II}\psi_I\psi_{II}) \quad (18)$$

166 2.3. Boundary conditions

167 Multiple simulations were performed with boundary-free volume, solid surface, single tube, parallel
 168 tubes and random porous media. The standard Laplace-Young test (Kuzmin and Mohamad, 2010;
 169 Parmigiani et al., 2016) was conducted within a 50×50×50 cubic volume, and periodic boundary
 170 condition was adopted on the six surfaces of the cube. The bubble formation was performed under
 171 the α group and β group with different density distribution. Surface droplet simulation was completed
 172 within a 20×40×40 volume to determine the contact angle. The volume's bottom surface was defined
 173 as solid-phase with no-slip bounce back condition (D'Humières et al., 2002). Single tube simulation
 174 was performed in a 30×30×100 virtual device as presented in Fig. 1(a), and no-slip bounce back
 175 condition was adopted on the liquid-solid interface. Parallel tubes simulation was performed in a
 176 40×90×80 virtual device as illustrated in Fig. 1(b), and no-slip bounce back condition was adopted
 177 on the liquid-solid interface. The last simulation of intrusion into porous media was performed with
 178 an extracted structure from polydisperse particle packing (Wang et al., 2019), as presented in Fig.
 179 1(c), whose porosity was 36.09%. The overall volume of the porous medium was 50×50×70. No-

180 slip bounce back condition was adopted on the liquid-solid interface, top surface and bottom surface.
 181 Periodic boundary condition was assumed on the rest four surfaces of the volume.



182

183

184 Fig. 1 (a) Previously reported boundary (Hou et al., 2019; Kim et al., 2019). (b) Classic multi-tube boundary. (c) The porous border
 185 in this work.

186 **2.4. Molecular density**

187 The density distribution $\rho(\mathbf{x}, t)$ of the LBM represents the number of molecules in 3D lattices (He
 188 and Luo, 1997). Table 2 presents the conversion from the molar volumes of water and mercury to the
 189 target LBM density. The target density was realized by the calibration of the interaction coefficients,
 190 including G_{I-I} , G_{I-II} , G_{II-S} , G_{II-II} , G_{II-I} and G_{II-S} . The simulation was conducted until the steady-
 191 state was reached. In this study, the stable-state was defined as the iteration when the overall density
 192 change was within 0.5%.

	Phase label	Phase-I	Phase-II
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A	Chemical formula	H ₂ O	Hg
B	Mass density	10 ³ kg/m ³	13.6×10 ³ kg/m ³
C	Relative molecular mass	18	200
D	Mass of $\frac{\text{Carbon-12}}{12}$	1.66 × 10 ⁻²⁷ kg	
E	Converted mass (C · D)	2.99 × 10 ⁻²⁶ kg	3.32 × 10 ⁻²⁵ kg
F	Avogadro constant	6.022 × 10 ²³ mol ⁻¹	
G	Molecule number density ($\frac{B}{E \cdot F}$)	5.56 × 10 ⁴ mol/m ³	6.80 × 10 ⁴ mol/m ³
H	Target LBM density (G _I : G _{II})	1	1.22

Table 2 Conversion from molecular properties to LBM density

193

194 3. Result and discussion

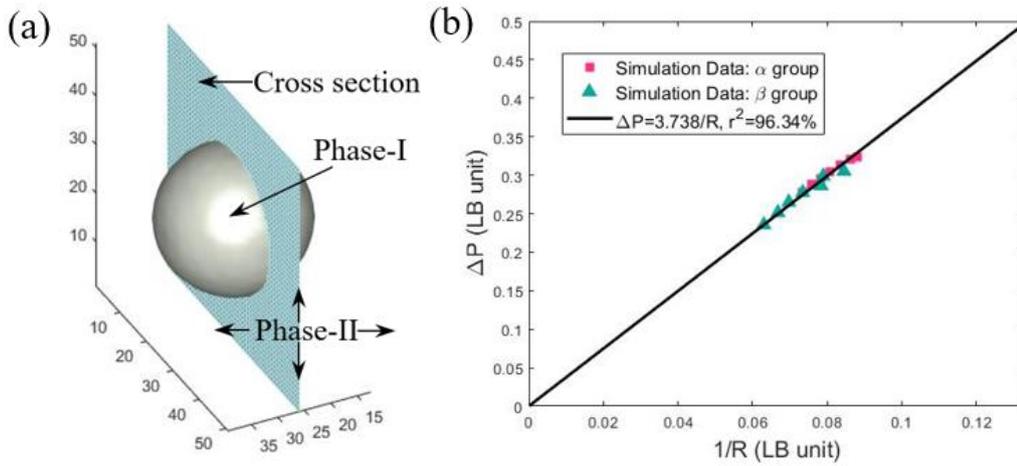
195 3.1. Laplace-Young test and fundamental performance

196 Fig. 2(a) presents the 3D visualized result of the bubble formation and the cross-sectional area for the
 197 2D illustration. Fig. 2(b) shows the correlation between internal pressure difference and the radius of
 198 the bubble. The resulted pressure difference is inversely proportional to the radius of the bubble. The
 199 linear relationship of the Laplace testing equation, as given by Eq. 19, was recovered with a
 200 coefficient of determination of 96.34%.

$$201 \quad P = \frac{\sigma}{R} \quad (19)$$

202 Where ΔP is the pressure difference between the internal region and the outer region of the bubble,
 203 σ is the surface tension term, and R is the radius of the bow. Previous Shan-Chen models also
 204 demonstrated Laplace's law's recovery with a single matrix computation (Shan and Chen, 1993).
 205 However, the origin point (0,0) was not always passed due to the multi-phase registration difficulty
 206 (Dauyeshova et al., 2018; Kuzmin and Mohamad, 2010; Qin et al., 2018). In this study, the proposed
 207 method makes the multi-phase registration, as presented in Fig. 3, a straightforward step without the

208 extra step of phase identification.



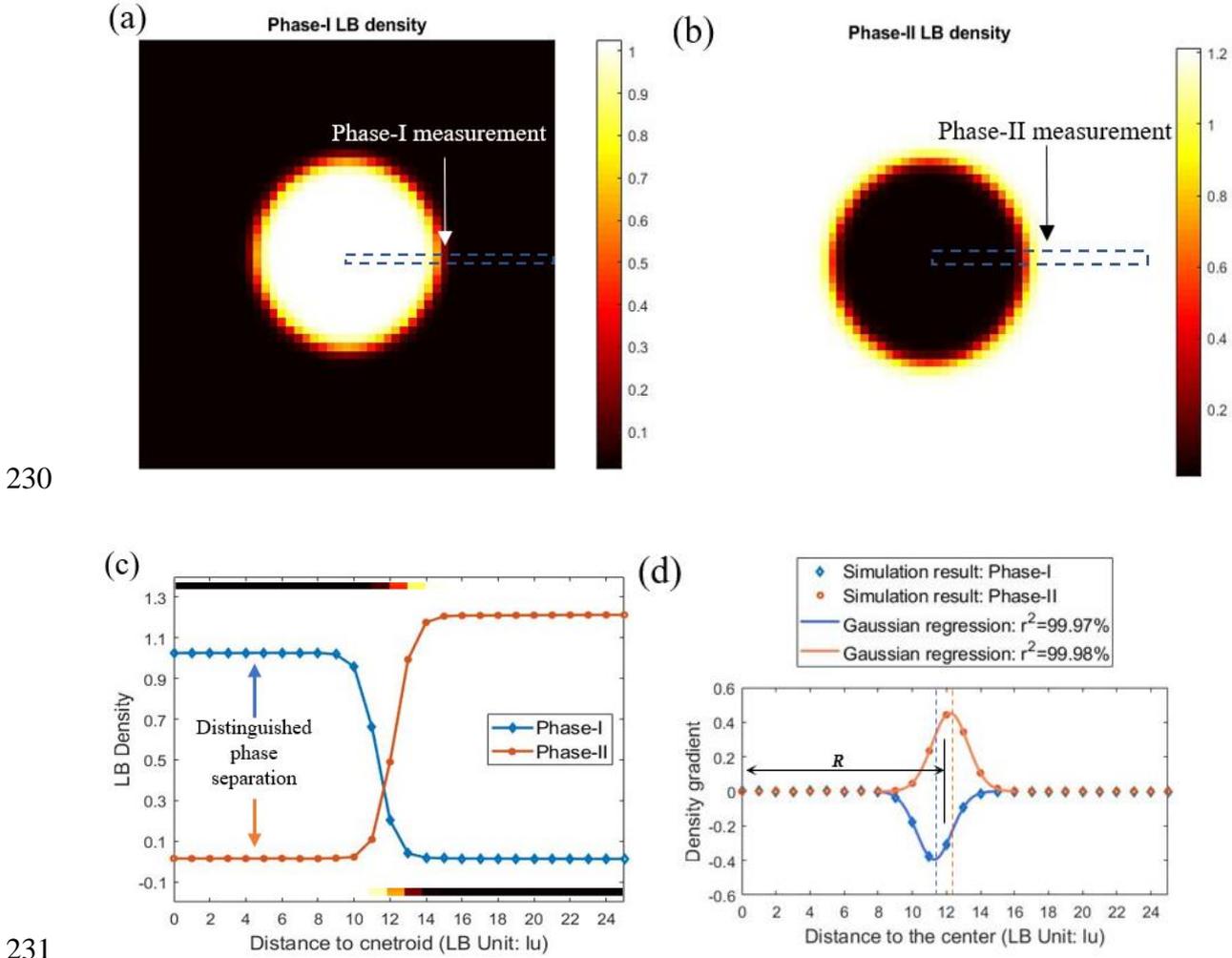
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210

Fig. 2 Validation with Laplace-Young test

211 The application of the dual matrix computation further enabled the realization of narrowed density
212 difference. Previously (Shan and Chen, 1993), the density inside the bubble was inevitably higher
213 than the external pressure to an order of magnitude of 10, based on which the matrix was identified
214 as high-density fluid and low-density fluid. Consequently, the separation of phases with similar
215 densities became highly challenging since the minor gradual change can hardly support the interface
216 distinguishment. In comparison, the dual-matrix computation in this study performs the collision
217 computation for phase-I and phase-II, respectively. As a result, a solution to obtain separated phases
218 from the beginning (registration) is provided from the program architecture. The 3D phases
219 distribution of phases with relative densities was then tracked throughout the computation. Fig. 3(a)
220 presents the cross-sectional density distribution results of phase-I, and Fig. 3(b) shows the density
221 distribution results of phase-II in the same multi-phase system. Macroscopically, Fig. 3(c) presents
222 the density profile along the measurement area. The stabilized density of phase-I and phase-II was
223 1.025 and 1.213, respectively. Through adopting the reported coefficients of interaction, the
224 macroscopic densities of water and mercury were realized from a microscopic basis. Fig. 3(d)
225 presents the density gradient profile along the measurement area. The measurement of the bubble
226 radius (R) took the distance between the midpoint of peaks and the whole volume centre. The

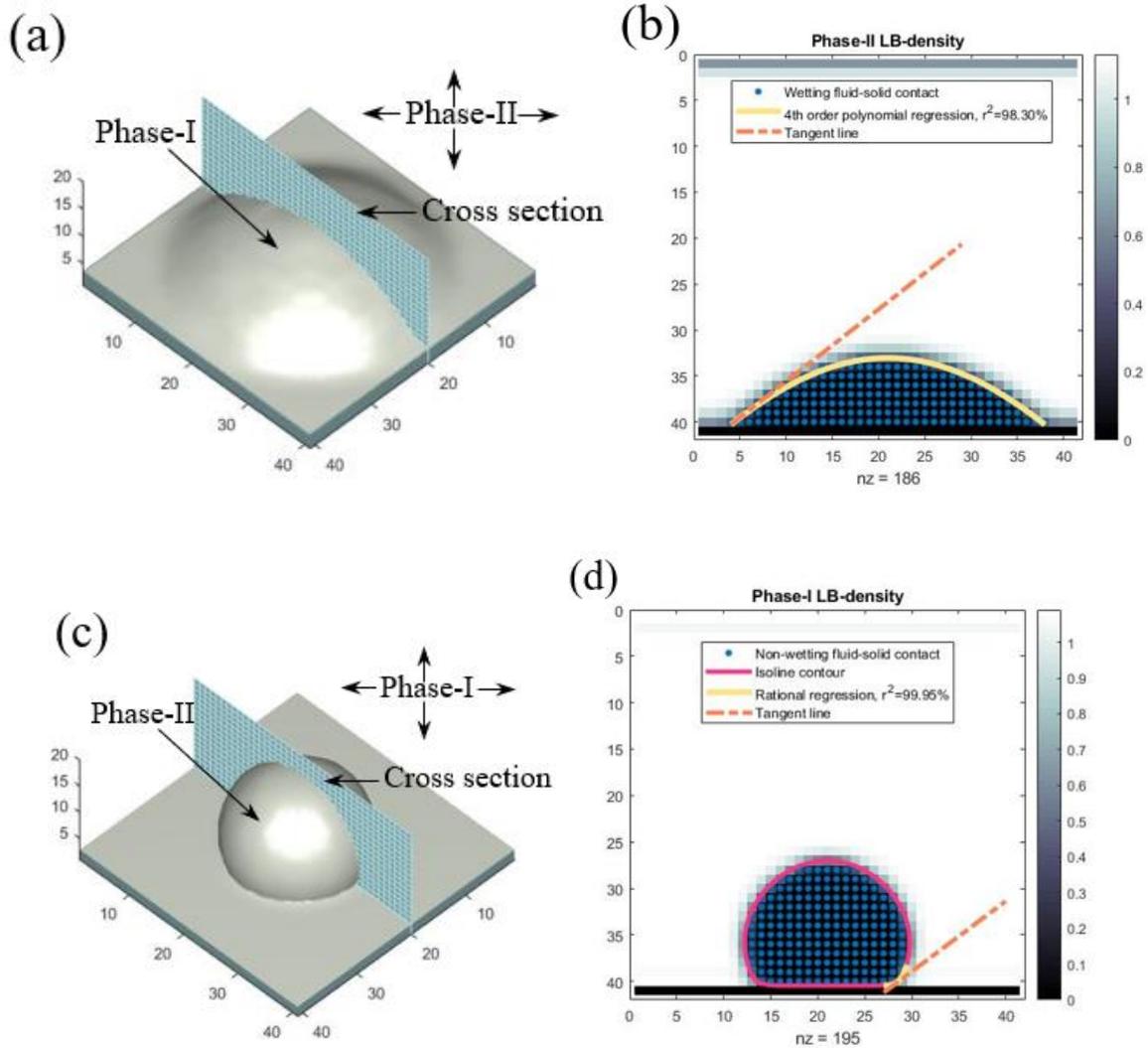
227 thickness of the interface region was within $8l_u$, where l_u is the LBM system's unit length (Zhang et
 228 al., 2013). Compared with previous single matrix Shan-Chen models, the density difference of the
 229 stable phases was reduced from 33% (Parmigiani et al., 2016; Shan and Chen, 1993) to 18%.



232 Fig. 3 (a) Cross-sectional of phase-I in the bubble formation simulation. (b) Cross-sectional of phase-I in the bubble formation
 233 simulation. (c) LBM Density profile along the measurement area. (d) Density gradient profile along the measurement area.

234 The surface droplet test was performed with a solid surface, phase-I and phase-II. Fig. 4(a) presents
 235 the realized 3D droplet formation of phase-I surrounded by phase-II. Fig. 4(b) illustrates the
 236 cross-sectional result of the visualized data. The contact angle was measured at the intersection of the
 237 three phases. The test with phase-I resulted in a contact angle of 38.12° . Fig. 4(c) presents simulation
 238 with phase-II surrounded by phase-I, where the non-wetting interaction was realized with 3D density
 239 distribution. Fig. 4(d) shows the cross-sectional result of the visualized molecular diffusion, and the

240 resulted contact angle was macroscopically obtained as 142.82° . Consequently, the sum of the two
 241 contact angles resulted in 180.94° . Therefore, the wetting ($<90^\circ$) and non-wetting ($>90^\circ$) behaviour
 242 caused by surface tension was realized. The presented solution for multi-phase separation is essential
 243 to obtain the interface between phases with similar density. Hence, securing contact angles becomes
 244 consequently possible.



245

246

247 Fig. 4 (a) A wetting surface droplet of phase-I surround by phase-II. (b) The cross-sectional view of (a). (c) A non-wetting surface
 248 droplet of phase-II surround by phase-I. (d) The cross-sectional view of (c).

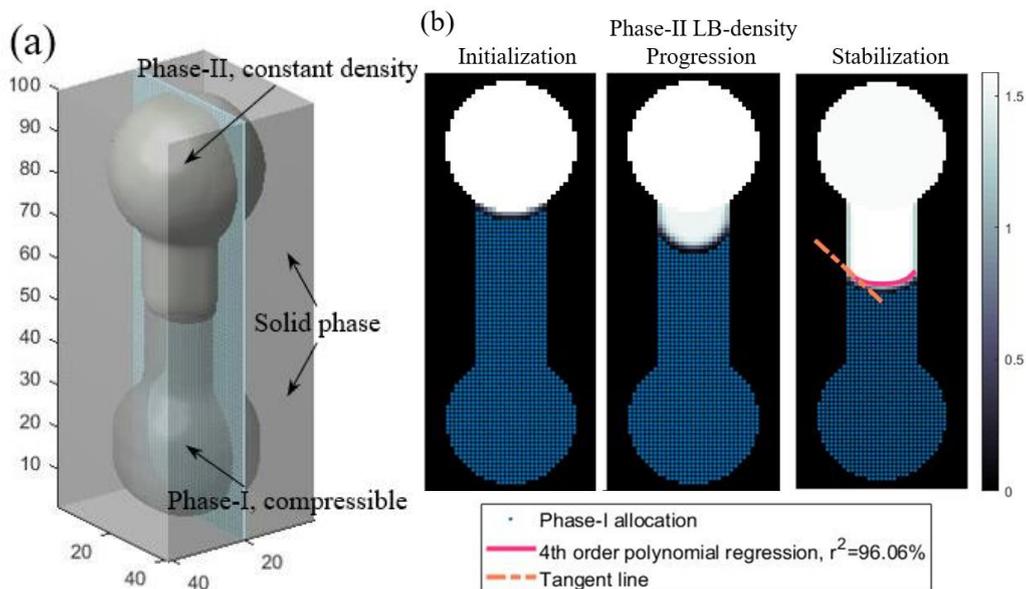
249 3.2. Application in single-tube scenario

250 Fig. 5(a). presents the application of the proposed method in a single-tube scenario. The molecular
 251 density of phase-II in the top pore initially adopted a uniform distribution with a constant value of

252 1.5618, which is higher than the target mercury density to initiate intrusion. Fig. 5(b) presents the
 253 dynamics process of phase-II from initiation to final stabilization. It was found that the contact angle
 254 in the progression stage was higher than in the stabilization stage, which was resulted from the non-
 255 equilibrium of the fluid interactions and motion.

256 Measurement of contact angle resulted in a value of 137.13° , which was 4.14% higher than that of
 257 the droplet test. The contact angle difference was caused by the discrete solution to the Boltzmann
 258 equation for the arbitrary problem instead of the continuous solution for a particular problem
 259 (Gressman and Strain, 2011). The demonstrated application suggests a digital means to control the
 260 simulated intrusion behaviour with user-specified densities. The progression of phase-II in the pore-
 261 neck is a density increasing process, causing the extension of progression length. The final
 262 stabilization indicates a certain progression length within the pore neck under a fixed density
 263 difference in the numerical environment.

264 Consequently, access to the bottom pore of phase-II can be granted when the pore neck is shorter than
 265 the progression length. The single-tube intrusion and surface droplet demonstrate the 3D realization
 266 of surface tension with the proposed model in fundamental boundaries. The following study presents
 267 the performance of the computational framework in more complex scenarios.



268

269

Fig. 5 (a) The virtual device of the pore-neck simulation. (b) Progression process of phase-II.

270 **3.3. Validation with Washburn equation**

271 The multi-tube simulations were performed with a division of isolated tubes, as presented by Fig.
 272 6(a), and a division of connected lines, as shown by Fig. 6(d). Fig. 6(c) demonstrates the virtual device
 273 in which the connected tubes simulation was performed. In both divisions, phase-II's initial molecular
 274 density in the top volume initially adopted a uniform distribution with a constant value of 1.5618. It
 275 was found in the isolated tubes simulation that increased tube radius led to an increment of the
 276 progression length. Without 3D distribution, the diffusive Washburn equation previously provided a
 277 general description of the relationship between progression depth and tube radius given by Eq.20
 278 (Guancheng and Guancheng, 2018).

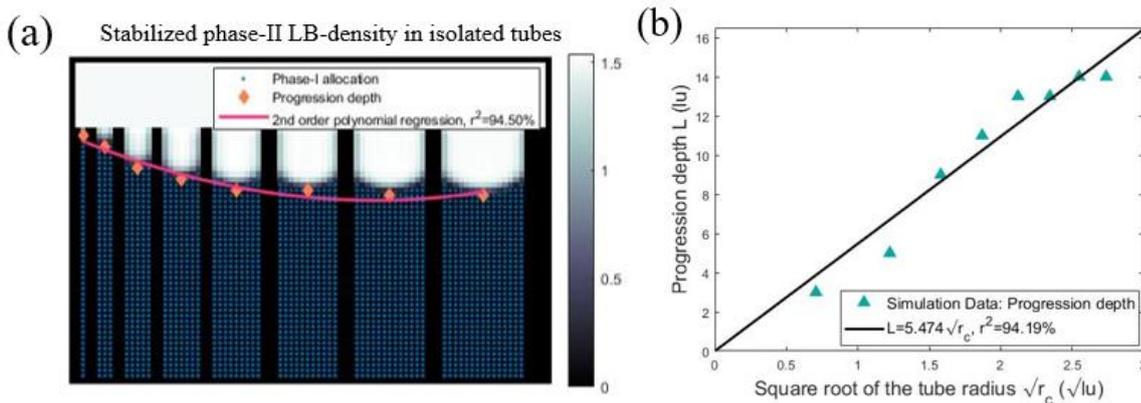
$$279 \quad L = \sqrt{\frac{\gamma r_c t \cos \theta}{2\eta}} \quad (20)$$

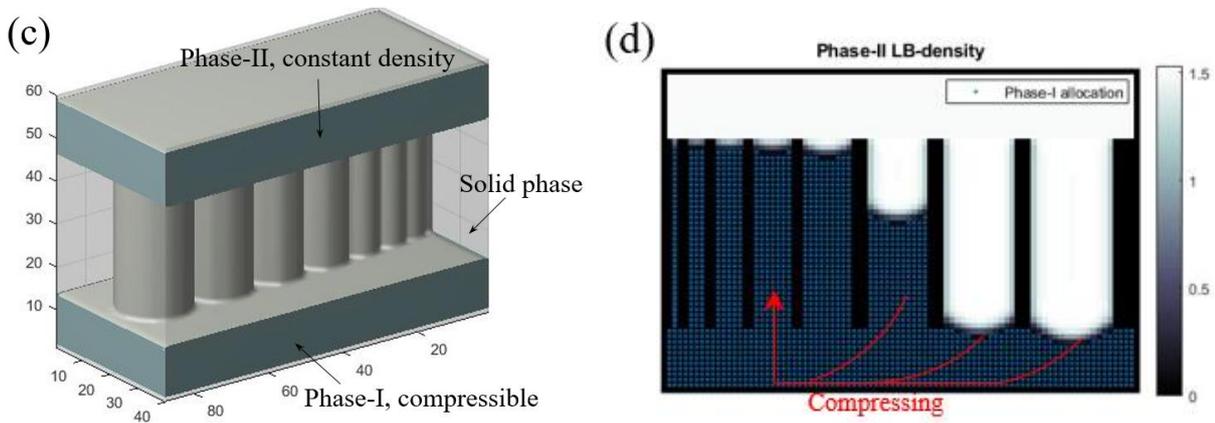
280 Where L is the progression depth, γ is the surface tension, r_c is the tube's radius, t is the progression
 281 time, θ is the contact angle, and η is the dynamic viscosity. Under the same Shan-Chen coefficient of
 282 interaction and lattice speed of sound, the above parameters were the same controlled variables except
 283 for r_c . Eq. 20 indicated that the progression depth L should be in a first-order linear relationship with
 284 the square root of the tube radius $\sqrt{r_c}$. In comparison, Fig. 6(b) presents a successful recovery of the
 285 linear relationship from the 3D data independently obtained from the isolated tubes division with a
 286 94.19% coefficient of determination.

287 The progression depth was governed by both the permeative flow and the diffusive flow in the
 288 connected tubes division. Results in Fig. 6(d) shows that the pressure rebalancing caused by the tube
 289 interconnection further amended the morphology of the stabilized density distribution. The diameter
 290 threshold of the complete intrusion for each tube was previously given by the permeative Washburn
 291 equation as given by Eq.21 (Diamond, 2000).

$$292 \quad d_c = \frac{-4\gamma \cos \theta}{p} \quad (21)$$

293 Where d_c is the diameter of the cylinder being intruded, and P is the pressure. Eq. 21 indicated that a
 294 wider tube radius tended to have less difficulty performing intrusion into the opposite volume under
 295 the same path length. As a result, intrusion behaviour into porous media naturally processes the
 296 function of radius selection. In this study, the radius selection feature was further realized with 3D
 297 data of each cross-section, as presented in Fig. 6(d). Results show that the neck radius's increment led
 298 to an extended progression length of the digital fluid, and the bottom-up approach has successfully
 299 recovered the radius-depth relationship in the classic model. Although Washburn's work has been
 300 acknowledged for reflecting the two-phase interaction under his traditional model, it has been an
 301 argument that the derivative pore size evaluation method is inappropriate for practical media with
 302 increased boundary complexity (Diamond, 2000). The problem raised is that the pore size, pore-neck
 303 length and pore morphology cannot be as adequately defined with overly simplified properties,
 304 including pore size, porosity and neck length. In the state-of-the-art solution of the multi-phase fluid
 305 problem in the heterogeneous boundary, the pore-structure were digitally described with phase
 306 information in each 3D coordinate (Shimizu and Tanaka, 2017). After testing the simulated fluid
 307 behaviour with limits adopted in previous theories, the feasibility to apply the proposed LBM in the
 308 complex boundary is further performed with a porous-medium case in the following section.





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Fig. 6 (a) Simulation with the isolated group. (b) Validation with the Washburn equation Eq. 16. (c) The virtual device of the

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connected tubes simulation. (c) Simulation with the corresponding group.

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3.4. Intrusion into media with increased heterogeneity

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Fig. 7 presents the visualized result of phase-II intrusion into a random porous-medium, in which Fig.

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7(a) shows the early stage of the intrusion and Fig. 7(b) shows the stabilized phase-II. The cross-

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sectional results of the simulation are demonstrated by Fig. 7(c) and Fig. 7(d). It was found in the

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reported realization that phase-II intruded into the porous medium through a path formed by the large

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pores. Residual phase-I was primarily detected in tiny pores and necks. The decreased intrusion into

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smaller pores agrees with the practical observation (E. W. Washburn, 1921). Furthermore, results

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show that the intrusion status into pores with similar sizes was not always identical, which was caused

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by varying pore-necks. The 3D monitoring of the process suggests that the pores' geometrical

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influences and pore-necks with irregular shapes can introduce a local variation of phase distribution.

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Hence, one single parameter of pore size (d_c) is inadequate to reflect the pore space's morphology

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microscopically. However, the permeative Washburn equation can provide a rough estimation of the

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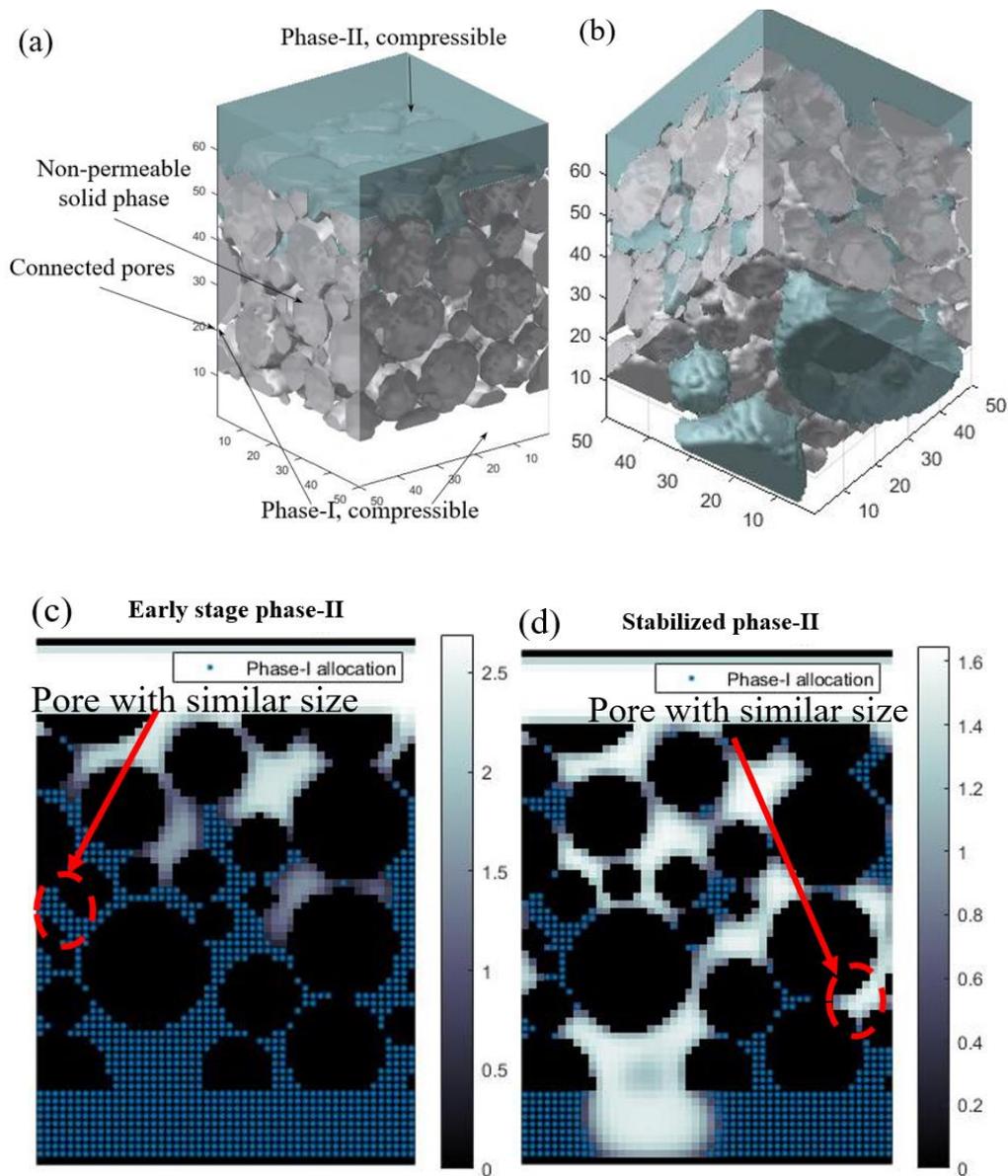
pore sizes. Modern computational chemistry has pointed out a solution to the solid-phase

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representation with a 3D description of each coordinate's information. The work presented in this

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paper further extend such philosophy towards the fluid phase within.



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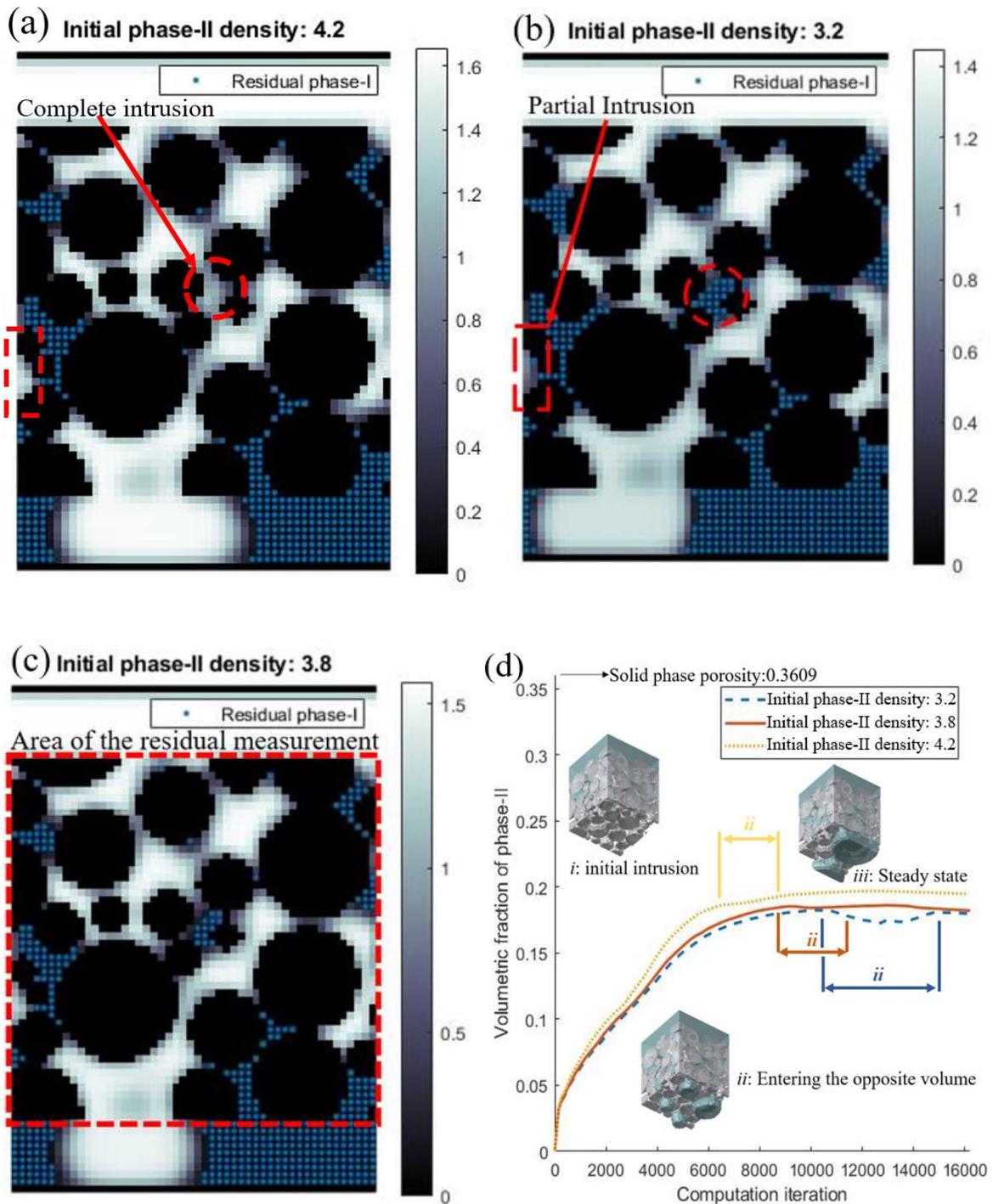
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Fig. 7 (a) Visualized results of early-stage phase-II intrusion. (b) Visualized results of late-stage phase-II intrusion. (c) 2D cross-sectional view of early-stage phase-II intrusion. (d) 2D cross-sectional view of late-stage phase-II intrusion.

Further investigation was performed with varied phase-II molecular densities upon initialization. Fig. 8(a) presents the 2D cross-sectional results from a uniform density distribution of 4.2, in which the circled area highlight the complete intrusion upon stabilization. In comparison, Fig. 8(b) presents the results from an initial density distribution with 3.2, in which the decreased phase-II pressure resulted in residual phase-I in the circled area. Hence, varied access to irregular-shaped pore driven by different pressure differences was realized with a full map description of molecular density distribution. It is further argued here that fluid-phase intrusion into porous media possesses the third

339 status in addition to complete-intrusion and non-occupation. The squared area in Fig. 8(b) presents a
340 partial intrusion in one of the pore space, whereas the same zone in Fig. 8(a) is of complete-intrusion
341 status. In a non-simplified pore network presented by the adopted porous-medium, the pore
342 morphology's spherical assumption is further invalid since the actual pore is connected with a pore-
343 neck of a non-solid phase. Fig. 8(c) presents the visualized results from applying an intermediate
344 density of 3.8, and the above-discussed pore space shows a noticeable migration of the fluid interface.
345 Fig. 8(d) presents the pore volume's dynamic occupation by phase-II alone with the computational
346 time, whose measurement was three-dimensionally obtained in the zone marked in Fig. 8(c). The
347 results show that the stabilized occupation of phase-II over the volume increased with the raised
348 pressure difference. The in-progress monitoring of the process also describes a rarely discussed
349 behaviour that a retreat of phase-II from the bottom volume occurred before the final stabilization
350 (Fig. 8(d)-ii). In a complex pore network, multiple paths were formed by the solid phase for the fluid
351 intrusion, and the effective length of each path is not necessarily the same. However, the percolation
352 of the global network is simultaneously influenced when a local pore-neck is broken through.
353 Representing the systematic behaviour with final stage outcome and macroscopic properties
354 assembled from the volume is insufficient when a more comprehensive understanding of the system
355 is desired. The clear phase separation provided by the proposed dual-matrix computation enables the
356 above capturing of the fluid interface and the multi-phase 4D molecular density distribution. Through
357 a thorough representation of the molecular map over time and space, computational chemistry
358 predicting detailed information in each coordinate is prepared to investigate beyond the boundary of
359 previous assumptions.



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361

362 Fig. 8 (a) Local interaction under initial LBM density of 4.2. (b) Local interaction under initial LBM density of 3.2. (c) In-progress
 363 monitoring under initial LBM density of 3.8. (d) Macroscopic monitoring of phase-II intrusion.

364 4. Conclusion

365 Fluid intrusion into 3D media is a complex process of heterogeneous transport, in which the molecular
 366 density distribution is of great significance for chemical engineering. One major challenge to model

367 the process is the different phase separation and interface tracking during the multi-phase evolution
368 within 3D solid boundaries. This work presented a solution to the problem with the proposed dual-
369 matrix computation MRT-LBM initially, enabling in-progress monitoring of separated phases and
370 initialization to stabilization. Application of the kinetics model in the mercury-water system was
371 demonstrated to compare the work with previously theorized observation of capillary dynamics.
372 Results show that narrowed density difference down to 18% was realized with separately tracked 3D
373 fluid distribution in each computational iteration for the first time. Performance of the Laplace-Young
374 test model presented a well-recovered linear relation between pressure difference and the reciprocal
375 of the bubble radius. The droplet test demonstrated a successful integration with the Shan-Chen model
376 to three-dimensionally realize the wetting and non-wetting solid-fluid contact with stabilized contact
377 angles. A further comparison was performed with classic boundaries previously assumed by capillary
378 dynamics after presenting the bottom-up solution's actual performance. Realization in single-tube
379 boundary demonstrates a minor variance of the contact angle result up to only 4.14%. The Washburn
380 equation was recovered under parallel-cylinder limits with a 94.19% coefficient of determination.
381 The sensitivity to cylinder radiused intrusion behaviour was three-dimensionally achieved from the
382 bottom of local surface tension. The spherical assumption in previous capillary dynamics is
383 inadequate to reflect the pore space's morphology in media with increased heterogeneity.

384 Based on the philosophy of representing heterogeneous media with labelled 3D matrix, this work and
385 its kind extend the systematic description from solid-phase to fluid-phase. Results show that the
386 pressure-dependent access to pores with various sizes was still functional after applying the MRT-
387 LBM in media with increased heterogeneity. However, it was found that phase-II's volumetric
388 occupation was not solely contributed by the difference in access to the pores. The stabilized intrusion
389 processes a status of partial-intrusion in addition to complete-intrusion and non-occupation. The
390 interface migration resulting from varied initial pressure indicates that the local fluid's actual
391 morphology in intruded pores is dynamically modified instead of being constant. The computational

392 realization of intrusion behaviour also presents a time-dependent vision of the simultaneous fluid
 393 progression in multiple paths formed by pores. A local breakthrough of the narrow pore-neck in one
 394 path resulted in a global retreat of the fluid phase assembled in the other paths. Starting from the
 395 current knowledge, the modelling of the 4D behaviour of multi-phase fluid intrusion in realistic media
 396 is a challenging task still requiring more specific investigation. The addressed phase-separation and
 397 interface-tracking are essential for a comprehensive establishment of the molecular density map's
 398 computational description for a broader range of problems in chemical engineering science.

399 **Appendix A. MRT transform matrix**

$$400 \quad T = \begin{bmatrix} 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 \\ -30 & -11 & -11 & -11 & -11 & -11 & -11 & 8 & 8 & 8 & 8 & 8 & 8 & 8 & 8 & 8 & 8 & 8 & 8 \\ 12 & -4 & -4 & -4 & -4 & -4 & -4 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 \\ 0 & 1 & -1 & 0 & 0 & 0 & 0 & 1 & -1 & 1 & -1 & 1 & -1 & 1 & -1 & 0 & 0 & 0 & 0 \\ 0 & -4 & 4 & 0 & 0 & 0 & 0 & 1 & -1 & 1 & -1 & 1 & -1 & 1 & -1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & -1 & 0 & 0 & 1 & 1 & -1 & -1 & 0 & 0 & 0 & 0 & 1 & -1 & 1 & -1 \\ 0 & 0 & 0 & -4 & 4 & 0 & 0 & 1 & 1 & -1 & -1 & 0 & 0 & 0 & 0 & 1 & -1 & 1 & -1 \\ 0 & 0 & 0 & 0 & 0 & 1 & -1 & 0 & 0 & 0 & 0 & 1 & 1 & -1 & -1 & 1 & 1 & -1 & -1 \\ 0 & 0 & 0 & 0 & 0 & -4 & 4 & 0 & 0 & 0 & 0 & 1 & 1 & -1 & -1 & 1 & 1 & -1 & 1 \\ 0 & 2 & 2 & -1 & -1 & -1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & -2 & -2 & -2 & -2 \\ 0 & -4 & -4 & 2 & 2 & 2 & 2 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & 1 & -2 & -2 & -2 & -2 \\ 0 & 0 & 0 & 1 & 1 & -1 & -1 & 1 & 1 & 1 & 1 & -1 & -1 & -1 & -1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & -2 & -2 & 2 & 2 & 1 & 1 & 1 & 1 & -1 & -1 & -1 & -1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & -1 & -1 & 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & -1 & -1 & 1 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & -1 & -1 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & -1 & 1 & -1 & -1 & 1 & -1 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & -1 & -1 & 1 & 1 & 0 & 0 & 0 & 0 & 1 & -1 & 1 & -1 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 1 & -1 & -1 & -1 & -1 & 1 & 1 \end{bmatrix}$$

401 **Conflicts of interest**

402 There are no conflicts to declare.

403 **Credit Author Statement**

404 **Mingzhi Wang:** Conceptualization, Methodology, Software, Validation, Formal analysis,
 405 Investigation, Data Curation, Writing - Original Draft, Writing - Review & Editing. **Beimeng Qi:**
 406 Investigation, Writing - Review & Editing, Visualization. **Yushi Liu:** Investigation. **Abir Al-Tabbaa:**
 407 Supervision. **Wei Wang:** Project administration.

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