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Diffusion-to-Imbibition Transition in Water Sorption in Nanoporous Media: Theoretical studies

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Key Points:

- The square gradient theory-based model explains diffusion-to-imbibition transition at a critical relative humidity in nanoporous media
- The model presented has an inherent feature to represent hysteresis in adsorption and desorption isotherms.
- Hysteresis in the predicted isotherms is explained by the existence of the different energy barriers for adsorption and desorption.

1 **Abstract**

2 The ability to predict multiphase fluid transport in nanoporous rocks such as shales is
3 critical for many geoscience applications, for example unconventional hydrocarbon production,
4 geologic carbon sequestration, and nuclear waste disposal. When the pore sizes approach
5 nanoscales, the impact of the molecular interaction forces between fluids and solids becomes
6 increasingly important. These forces can alter macroscopic fluid phase behavior and control
7 transport. Recent experimental studies have shown that capillary condensation and subsequent
8 imbibition of liquid water can occur in hydrophilic nanoporous media even if the vapor phase is at
9 a critical relative humidity (rh_{crit}) well below vapor saturation. This study presents a theoretical
10 investigation of the processes controlling adsorption, capillary condensation and imbibition in
11 nanoporous media, using the square-gradient classical density functional theory. The proposed
12 theoretical model explicitly includes the relevant interaction forces among fluids and solids in
13 macroscopic porous media. Application of the model to a relative-humidity-controlled water
14 adsorption experiment is presented to demonstrate the impact of water-pore wall attractive forces
15 on multiphase water behavior in a hydrophilic silicon nanoporous medium. The model represents
16 well the measured time-dependent evolution of the water imbibition front inside the nanoporous
17 medium and also explains the diffusion-like water transport regimes observed at $rh < rh_{crit}$ and the
18 imbibition-like flow regimes observed at $rh > rh_{crit}$. The study furthermore gives an insight on
19 hysteresis phenomenon in adsorption and desorption isotherms.

20 **1 Introduction**

21 The ability to predict multiphase fluid transport in nanoporous rocks is critical for many
22 geoscience applications. For instance, in applications such as geologic carbon sequestration, and
23 nuclear waste disposal (Altman et al., 2014; Zheng et al., 2008), the long-term performance of the
24 selected sites depends on the multiphase physical and chemical interactions in nanoporous caprock
25 or clay-based barriers. Similarly, finding effective strategies for sustainable hydrocarbon
26 production from shale requires understanding of multiphase processes in the nanoporous shale
27 matrix (Alexander et al., 2011; Falk et al., 2015; Tokunaga et al., 2017). When pore sizes approach
28 nanoscales, the impact of molecular interaction forces between fluids and solids becomes
29 increasingly important. The fluid-solid interaction forces, also known as surface forces (e.g., van
30 der Waals, electrostatic, structural forces) (Churaev, 2000; Israelachvili, 2011), result from

1 electrostatic and electromagnetic fields generated by charges and oscillating molecular dipoles.
2 These forces can alter macroscopic fluid phase behavior and control related processes such as
3 sorption, wetting and transport (e.g., Li et al., 2012; Zarzycki & Gilbert, 2016; Velasco et al., 2017;
4 Zhang et al., 2017; Berthonneau et al., 2018); they can also cause microstructural changes,
5 especially in clay-rich systems (e.g., swelling, shrinking and fracturing) (e.g., Dehghanpour et al.,
6 2012; Bertonecello, 2014).

7 Recent experimental research has demonstrated the importance of fluid-solid interfacial
8 interactions on multiphase fluid behavior in nanoporous media, including in shale (e.g., Vincent
9 et al., 2017; Seeman et al., 2017; Zhong et al., 2018; Tokunaga et al., 2017; Cihan et al., 2019;
10 Chakroborty et al., 2020). We recently conducted water transport experiments in shale cores under
11 different relative humidity (rh) conditions and found that the water uptake was significantly greater
12 at rh=0.8 compared to that at rh=0.3 (Tokunaga et al., 2017; Cihan et al., 2019). The experimental
13 finding indicated an enhanced condensation of water at the higher rh. The experiments did not
14 include any measurements of the water concentration inside the sample. However, a macroscopic
15 model, based on the classical density functional theory and fitted to the water uptake measurements
16 suggested that at rh=0.8, the enhanced condensation occurred near the inlet of the core and liquid
17 like water migrated from there to the deeper parts of the core. According to the model results in
18 Cihan et al. (2019), water concentration profiles within the core for rh=0.8 and rh=0.3 differ
19 strongly. In the latter case, the simulated water concentration profiles have a diffusion-type shape
20 and are much smoother than for rh=0.8, where an imbibition-type behavior is predicted.

21 Previously, Vincent et al. (2017) observed similar phenomena experimentally in a silicon
22 nanoporous system. When they exposed a hydrophilic silicon sample with pore diameters in the
23 3–4 nm range to water vapor at sufficiently high rh, liquid water condensed near the inlet, and the
24 dense water subsequently filled the nanopores in an imbibition-like manner. Figure 1 shows a
25 schematic diagram that represents the observation of imbibition induced by adsorption and
26 condensation of water under high rh conditions. Vincent et al. (2017) also reported that the
27 transition from smooth diffusion-type concentration profiles to sharp imbibition-type profiles
28 occurred at a threshold value of $rh \approx 0.6$. The experiments presented in Vincent et al. (2017) were
29 conducted at 15 °C, and it is worth noting that based on the Kelvin equation, capillary condensation
30 in 4 nm pores occurs at $rh = 0.58$. We believe that this apparent enhanced adsorption and
31 condensation-induced imbibition at well below vapor saturation value is a result of molecular

1 interactions between water and solid in nanoscale pores which cause phase transition of water
2 vapor, first to adsorbed films and then to pore-filling liquid water. Previous molecular simulation
3 studies based on molecular dynamics, grand canonical Monte Carlo method and classical density
4 functional theory showed that nanoconfinement might influence the phase behavior of fluids (e.g.,
5 Peterson & Gubbins, 1987; Evans, 1990; Kierlik et al., 1995; Monson, 2012). However, how the
6 microscopic phenomena affect the macroscopic observation of transitioning from a diffusion-type
7 transport regime to an imbibition-type flow regime is not well understood. Exploring the basic
8 mechanisms controlling adsorption and condensation is important because the underlying fluid-
9 fluid and fluid-solid interaction forces also control flow of multiphase fluids in subsurface
10 nanoporous media.

11 This paper presents a theoretical model based on the classical density functional theory
12 (cDFT) to provide an understanding of the transition from a diffusion-type transport regime to an
13 imbibition-type flow regime in water sorption in nanoporous media. The model defined in the next
14 section, based on a description of a free energy, includes energy contributions for intermolecular
15 forces between water molecules as well as between water and solid molecules in the nanoporous
16 domain. In Section 3, we qualitatively demonstrate applicability of the model to represent the
17 condensation-induced imbibition data provided by Vincent et al. (2017), which contain optical
18 measurements of water concentration profile changes during water adsorption in a thin silicon
19 nanoporous sample ($\sim 1\text{cm} \times 1\text{cm} \times 5\mu\text{m}$). The relatively simple pore structure and homogeneous
20 mineral content, compared to natural nanoporous media such as shale, makes Vincent et al.
21 (2017)'s experimental setup suitable for modeling and understanding basic mechanisms of the
22 phase transitions. We present the remarkable features of the model to give insights on 1) both
23 diffusion-type transport regimes at low rh and imbibition-type flow regimes at higher rh , and 2)
24 hysteretic adsorption- desorption isotherms.

25 **2 Methods**

26 2.1 Modeling Approach Based on the Square Gradient Density Functional Theory

27 The modeling approach presented here is mainly based on Cihan et al. (2019). The
28 important difference in the model presented below is improved descriptions of water phase
29 behavior and surface tension, compared to our earlier model. We first summarize the development
30 of general chemical potential and Darcy-scale momentum equations for an N -component fluid

1 mixture and then present a specific model to describe the transport of liquid and vapor water. The
 2 Helmholtz free energy of an inhomogeneous system E_H at a constant temperature can be expressed
 3 as

$$E_H = \int_V \psi dV \quad (1)$$

4 where ψ is the local energy density defined as the free energy per unit volume V of a rigid porous
 5 medium. Considering the external potentials including the gravitational potential and the
 6 interaction potential of the solids acting on the N -component fluid mixture in a porous medium,
 7 the Helmholtz free energy density based on the square-gradient approximation can be expressed
 8 as

$$\psi = \phi\psi_0 + \frac{\phi^2}{2} \kappa_{ij} \nabla c_i \cdot \nabla c_j + \phi \rho \varphi_g + \phi c_i \varphi_{s,i} \quad (2)$$

9 where $\psi_0(c_1, c_2, \dots, c_N)$ is the homogeneous Helmholtz free energy density, defined in terms of
 10 energy per unit volume of void space (J/m^3), that represents the intermolecular interactions of
 11 water molecules in liquid or gaseous states. ϕ is porosity, and c_1, c_2, \dots, c_N are the molar
 12 concentrations (mol/m^3) of the components that can be in gas or liquid phase. We employ the
 13 Einstein summation convention in this paper, i.e. summation is implied over repeated indexes
 14 ($i=1, \dots, N$ and $j=1, \dots, N$). The square-gradient term, the second term on the right-hand side of Eq.
 15 (2), represents fluid-fluid interfacial energy between different fluid phases and the coefficients κ_{ij}
 16 are known as influence parameters ($\text{J}\cdot\text{m}^5/\text{mol}^2$) related to the correlation functions for molecular
 17 densities (Bongiorno et al., 1976; Yang et al., 1976). For the liquid and vapor system under
 18 isothermal conditions, it can be assumed that $\kappa_{ij} = \kappa$. A characterization of the influence factor for
 19 two-phase liquid-vapor water will be given in the next section. The last two terms of ψ include the
 20 external potential energy functions due to gravitational attraction φ_g (J/kg) and fluid-solid
 21 interaction potentials for each component, $\varphi_{s,i}$ (J/mol). ρ is the mixture density (kg) equal to $c_i M_i$
 22 where M_i is the molecular mass of the i th component (kg/mol).

23 The chemical potential, Φ_i (J/mol) for the i th component is equal to the variational
 24 derivative of E_H with respect of c_i and expressed as

$$\Phi_i = \frac{\partial \psi_0}{\partial c_i} - \nabla \cdot \phi \kappa_{ij} \nabla c_j + M_i \varphi_g + \varphi_{s,i}^* \quad (3)$$

$$\varphi_{s,i}^* = \varphi_{s,i} + c_j \frac{\partial \varphi_{s,j}}{\partial c_i}$$

1 Neglecting the inertial forces due to extremely low fluid velocities in nanodarcy permeability-
 2 porous media (Reynolds number $\ll 1$), the momentum equation for the multiphase mixture can be
 3 expressed as

$$0 = -\frac{\mu \mathbf{q}}{k} - \nabla p - \rho \nabla \varphi_g + \phi c_i \nabla (\nabla \cdot \kappa_{ij} \nabla c_j) - c_i \nabla \varphi_{s,i}^* \quad (4)$$

4 where \mathbf{q} is the Darcy velocity (m/s), k is the permeability of the porous medium (m^2), μ is the
 5 viscosity of the fluid mixture (Pa.s), and p is the fluid pressure (Pa). The first three terms in Eq.
 6 (4) resemble the classical Darcy equation for single phase flow. Eq. (4) does not include relative
 7 permeability for different phases nor does it utilize a macroscopic capillary pressure-saturation
 8 function. Instead, the last two terms in Eq. (4) explicitly account for the effects of multiphase
 9 interfacial fluid-fluid and fluid-solid interaction forces. Eq. (4) can also be expressed in terms of
 10 Φ_i as

$$\mathbf{q} = -\frac{k}{\mu} (c_i \nabla \Phi_i) \quad (5)$$

11 where, as before, the summation is implied over repeated index i ($i=1, \dots, N$). Cihan et al. (2019)
 12 applied this momentum equation and the Maxwell-Stefan diffusion equations together with the
 13 continuity equations to predict water adsorption and transport in shale. The applied model
 14 considered both water and air molecules, but the sensitivity analyses suggested that the
 15 contribution of air transport through diffusion and advection to the adsorption and transport of
 16 water may be neglected. This is consistent with the fact that diffusion through 2 nm radius
 17 capillaries at 1 atm total pressure is in the Knudsen regime, where nearly all collisions involve
 18 walls rather than other molecules. As a result, the governing equations for water sorption problem
 19 can be substantially simplified. Ignoring the contribution of air, the momentum equation for water
 20 molecules in porous media can be written as

$$\mathbf{q} = -\frac{k}{\mu} c \nabla \Phi \quad (6)$$

1 where c is the molar concentration of water (mol/m^3). The diffusive flux of the water in nanoporous
2 matrix may also be expressed as

$$\mathbf{J}_d = -\frac{cD}{RT} \nabla \Phi \quad (7)$$

3 when D is the effective binary diffusion coefficient of water-air fluid system (m^2/s), T is the
4 temperature (K) and R is the ideal gas constant ($\text{J}/\text{mol}/\text{K}$). Following Vignes's approach (Vignes,
5 1966) used in Cihan et al. (2019), the effective molecular diffusion coefficient under the two-phase
6 conditions is estimated by interpolation of the diffusivities in liquid and gas phases as
7 $D = D_{(l)}^{x_w} \times D_{(g)}^{1-x_w}$, where x_w is $c/c_{(l)}$ and $c_{(l)}$ is the saturated bulk molar concentration of liquid
8 water at a given T .

9 The continuity equation for molar concentration of the water can be expressed by

$$\frac{\partial(\phi c)}{\partial t} + \nabla \cdot (\mathbf{q} c + \phi \mathbf{J}_d) = 0 \quad (8)$$

10 The total flux of water molecules through advective and diffusive transport mechanisms
11 in nanoporous media can be expressed as

$$\mathbf{J}_t = \mathbf{q} c + \phi \mathbf{J}_d = -\left(\frac{k c^2}{\mu} + \frac{D \phi c}{RT} \right) \nabla \Phi \quad (9)$$

12 As will be shown later, in Eq. (9), the first term in the parenthesis dominates under liquid phase
13 conditions whereas the second term in the parenthesis dominates under vapor transport conditions.

14 As a result, the following second-order partial differential equations are used to describe
15 water adsorption, condensation and imbibition:

$$\frac{\partial(\phi c)}{\partial t} + \nabla \cdot \left(-\frac{k c^2}{\mu} - \frac{D \phi c}{RT} \right) \nabla \Phi = 0 \quad (10)$$

$$\Phi = \frac{\partial \psi_0}{\partial c} - \nabla \cdot \phi k \nabla c + M_w \varphi_g + \varphi_s + c \frac{\partial \varphi_s}{\partial c} \quad (11)$$

1 where Φ (J/mol) is the overall chemical potential for the water in the pore spaces. Individual
 2 definitions of $\partial\psi_0/\partial c$, κ and φ_s are given in the following sections.

3 2.1.1 Free Energy and Chemical Potential of the Homogeneous Fluid

4 In this work, we employ an equation of state to represent the homogeneous Helmholtz free
 5 energy and chemical potential of water ($\partial\psi_0/\partial c$). Developing an equation of state for water is
 6 challenging and different equations were developed in varying complexity and accuracy. We used
 7 an equation of state given by Fuller (1976), presented in Appendix A. Based on the Fuller equation
 8 of state, the chemical potential of the homogeneous fluid (Φ_0) were given by Guerrero and Davis
 9 (1980) as

$$\frac{\partial\psi_0}{\partial c} = \Phi_0 = \psi_0^+(T) + \frac{bcRT}{1-bc} - \frac{ac}{1+bc\chi} - RT \ln\left(\frac{1}{c} - b\right) - \frac{a}{b\chi} \ln(1+cb\chi) \quad (12)$$

10 where a (J.m³/mol²) and b (m³/mol) are the attraction energy and the excluded volume parameters,
 11 respectively. χ is a temperature dependent parameter introduced by Fuller (1976), and in the limit
 12 of $\chi=0$ the equation of state given in Appendix A becomes the van der Waals equation and in the
 13 limit of $\chi=1$, becomes the Redlich-Kwong-Soave equation. $\psi_0^+(T)$ is the ideal gas contribution to
 14 the energy as a function of temperature only and cancels out during the computations under
 15 isothermal conditions in this work. The equilibrium liquid, $c_{(l)}$, and vapor, $c_{(v)}$, concentrations of
 16 the coexisting phases at a given T are found from solving $p(c_{(l)}) = p(c_{(v)})$ and $\Phi_0(c_{(l)}) = \Phi_0(c_{(v)})$
 17 . As demonstrated in Figure A1, the predicted saturated density of liquid and vapor water are in
 18 reasonable agreement with a more accurate but much more complex equation of state Wagner &
 19 Pruss, 2002).

20 The equilibrium concentrations for water can be expected to vary under the influences of
 21 water-solid mineral interactions in nanoscale pores. Cihan et al. (2019) proposed an exponential
 22 function to describe macroscopically the fluid-solid interaction potential, based on coarse-grained
 23 molecular simulation studies in cylindrical nanopores. We describe the water-solid interaction
 24 potential using a similar simple expression as

$$\varphi_s = A_h \exp(-c\alpha) \quad (13)$$

1 where A_h (J/mol) and α (m³/mol) are empirical parameters that may vary depending on pore
 2 geometry, pore sizes, and fluid and solid molecule types. The magnitudes and signs of the
 3 parameters may vary depending on wettability of solids. A_h is negative and α is positive for
 4 interaction of water with hydrophilic pore walls. Eq. (13) suggests that absolute value of the
 5 interaction potential between water and the hydrophilic solid decreases exponentially with
 6 increasing concentration of water. An estimation of these parameters for the hydrophilic silicon
 7 nanoporous medium will be given in Section 3.

8 2.1.2 Influence Parameter and Surface Tension

9 The statistical mechanics definition of the influence parameter (κ) is given in terms of the
 10 molecular correlation functions (Bongiorno et al., 1976; Yang et al., 1976). A direct prediction of
 11 the influence parameter is possible only for simple fluid systems with known correlation functions.
 12 However, the influence parameter can be linked to attraction energy (a) and excluded volume (b)
 13 parameters of the equation of state as demonstrated by Carey et al. (1978) and Guerrero & Davis
 14 (1980):

$$\kappa(T) = \nu(T) ab^{2/3} \quad (14)$$

15 The temperature-dependent coefficient $\nu(T)$ in Eq. (14) is not universal and changes for different
 16 fluids. The surface tension is related to κ multiplied by the magnitude of the concentration square
 17 gradient. The definition of the surface tension according to the square gradient theory and the
 18 calculation procedure are given in Appendix B. Figure B1 shows an almost perfect fit of the square
 19 gradient theory-based model to the surface tension data for water. We estimated that the
 20 temperature dependent coefficient for water can be expressed as $\nu(T) = (0.6058T_r + 0.0556)^2$,
 21 where T_r is the ratio of the temperature to the critical temperature. The value of κ at $T=15^\circ\text{C}$ is
 22 equal to about 9.23×10^{-21} (J.m⁵/mol²). The thickness of the interfacial zone at that temperature is
 23 only in the order of a few molecular diameter (Figure B2). Representing such a thin interfacial
 24 zone requires a model resolution much smaller than a few molecular diameter (grid size ≈ 0.012
 25 nm in Appendix B). If the model resolution is decreased while keeping κ constant, the value of the
 26 surface tension changes because the concentration gradient changes. As achieving such a high
 27 model resolution is prohibitive for a macroscopic modeling study, κ is typically scaled up by the
 28 square of the numerical model grid size to compensate for the decreased concentration gradient

1 with decreasing model resolution so that the magnitude of the surface tension stays approximately
2 same (Cueto-Felgueroso & Juanes, 2018; Cihan et al., 2019). In addition to the model resolution,
3 in macroscopic modeling studies of complex porous media, κ is expected to be a function of pore
4 size distribution and connectivity. However, given the uniformity of pore sizes and the lateral
5 continuity of pores for the nanoporous medium tested in this work, as explained in the next section,
6 we assume κ is only functions of temperature and model resolution. We scale up the κ value by
7 the square of the ratio of the macroscopic model grid size to the molecular model grid size (0.012
8 nm), as expressed in Table 1, to represent the surface tension energy between the liquid and gas
9 phases.

10 2.2 Modeling Laboratory Test of Imbibition Triggered by Adsorption and Condensation

11 In this study, we used the experimental data in Vincent et al. (2017) that established the
12 migration of water in an imbibition like manner during water vapor adsorption, as conceptually
13 represented in Figure 1. Vincent et al. (2017) used a thin silicon nanoporous sample
14 ($\sim 1\text{cm} \times 1\text{cm} \times 5\mu\text{m}$). The porosity is quite high (~ 0.45), and the equivalent pore radii were reported
15 to range between 1.5-2 nm. Vincent et al. (2017) does not include a detailed image of actual pore
16 structure in their sample. The imaging studies by Elia et al. (2016), using SEM micrographs, for
17 the similar type silicon nanoporous media (porosity range = 0.34 – 0.47) indicate that the pore
18 structure involves more or less parallel and laterally connected tortuous paths. Homogeneous
19 mineral content and the simple pore structure with roughly uniform pore sizes appear to be
20 consistent with the assumptions behind the expression for the fluid-solid and the fluid-fluid
21 interactions.

22 The data provided in Vincent et al. (2017) include the measurement of the relative changes
23 in reflectance using an optical approach. The relative changes in grayscale intensity with respect
24 to the intensity at dry state were quantified to track the motion of the water inside the nanoporous
25 sample. Vincent et al. (2017) stated that there would be a close-to-linear relationship between
26 adsorbed mass and reflectance. Vincent et al. (2017) did not report an established correlation to
27 map the measured relative change in reflectance to the actual adsorbed water mass or average
28 water concentration, and thus currently we do not know if the accuracy of ‘the close-to-linear
29 relationship’ is the same for high water saturations and low water saturations. Vincent et al. (2017)
30 reported spurious spikes in reflectance that occurred during desorption and later stages of the

1 condensation. Despite the qualitative nature of the data collected, the reflectance method of
 2 Vincent et al. (2017) showed that the imbibition front in their silicon nanoporous sample could
 3 still be reasonably detected. Therefore, we focused here on representing the imbibition front using
 4 the model, rather than exactly matching the concentration values.

5 For our analyses in this work, we digitized Vincent et al. (2017)'s data given for a high
 6 relative humidity condition ($rh=0.98$) and then we expressed the relative change in intensity data
 7 in terms of average dimensionless concentrations, by simply taking the ratio of the relative
 8 intensities to the relative intensity at fully wet condition (Figure 2). The silicon nanoporous sample
 9 was exposed to water vapor at one inlet boundary, while keeping the other boundaries closed. We
 10 used the one-dimensional version of the model presented in the previous section without
 11 gravitational forces because of infinitesimally small Bond number, for both simulating the
 12 experiment in Vincent et al. (2017) and subsequent numerical analyses. The following initial and
 13 boundary conditions were employed to solve the equations:

$$\begin{aligned}
 c(x, t = 0) &= 0; \Phi(x, t = 0) = \Phi_0(c_v(0)) \\
 c(x = 0, t) &= c_v(rh); \Phi(x = 0, t) = \Phi_0(c_v(rh)), \quad (\text{inlet}) \\
 qc(x = L, t) + J_d(x = L, t) &= 0
 \end{aligned} \tag{15}$$

14 where L is the length of the sample (1 cm). An in-house computer model was employed to
 15 numerically solve the coupled second order partial differential equations in Eqs. (10-11) based on
 16 the finite volume method. The numerical model domain was finely discretized using a uniform
 17 grid size of $\Delta x = 12.5 \mu\text{m}$. The system of equations is linearized using the Newton-Raphson method
 18 and solved simultaneously by a preconditioned restarted Generalized Minimum Residual
 19 algorithm.

20 **3 Results and Discussion**

21 The numerical model was fitted to the experimental data using the Differential Evolution
 22 optimization algorithm (Price et al., 2005) to estimate the five unknown parameters listed in Table
 23 2. Figure 2 shows the model-estimated concentration profiles and the experimental data at $rh=0.98$,
 24 extracted based on the relative change in reflectance from Vincent et al. (2017). The profiles
 25 clearly show imbibition like transport of water inside the nanoporous medium. The model appears
 26 to represent the water concentration profiles at different times reasonably well. The estimated
 27 permeability appears to be very low, about 9 nanodarcy, but this is about an order of magnitude

1 greater than what we previously estimated for a Marcellus shale rock core with a porosity of 0.1
2 in Cihan et al. (2019). The estimated effective diffusion coefficients are also an order of magnitude
3 greater than the estimated values for the same shale and the reported values for other nanoporous
4 rocks (Peng et al., 2012; Zhang et al., 2017; Tokunaga et al., 2017). The ideal Knudsen diffusion
5 coefficient in a cylindrical pore of 2 nm radius is about 8×10^{-7} m²/s, which is in the same order of
6 magnitude with our estimated diffusivity value for the gas phase, $D_{(g)} = 2.78 \times 10^{-7}$ m²/s.
7 Considering that the ideal Knudsen diffusivity must be scaled down to account for the tortuosity,
8 our estimated value of $D_{(g)}$ appears reasonable.

9 The estimated $D_{(l)}$ is about two orders of magnitude less than the self-diffusion coefficient
10 of water, 1.77×10^{-9} m²/s at 15 °C (Holz et al., 2000). The finding of the reduced water diffusivity
11 is consistent with the experimental measurements in other hydrophilic nanoporous media. For
12 example, the ratio of the self-diffusivity of water to the measured diffusivity in cement paste was
13 found to be in range of 60 to 80 (Li et al., 2012; Korb et al., 2007). The measurements of the
14 reduced self-diffusivity of water in hydrophilic confined pore spaces were also supported by
15 molecular simulation studies (e.g., Kalinichev et al., 2007; Bonnaud et al., 2010; Qomi et al.,
16 2014). The molecular simulation study by Bonnaud et al. (2010) shows that the self-diffusivity
17 decreases with decreasing nanopore size. In general, based on the molecular simulations, the
18 reduced diffusivity is explained by structuring of water molecules near the hydrophilic surfaces
19 and tendency of hydrogen atoms of water to orient and move toward the surfaces, which slows
20 down the movement of water molecules. As a result, the diffusivity of water in nanoporous media
21 may become significantly lower than the diffusivity of bulk water.

22 In this work, $D_{(l)}$ does not seem to significantly affect the model results at the early stage
23 of adsorption and condensation. However, in the later stages of the condensation, because the value
24 of $D_{(l)}$ is orders of magnitude smaller than the value of $D_{(g)}$, the interpolated D , (see Section 2.1),
25 becomes smaller and smaller as the water concentration increases. As a result, in the imbibition
26 like water transport regime, the total diffusive term becomes much smaller compared to the
27 advective term.

28 Based on Eq. (9) with the estimated permeability and the diffusivities, Figure 3 shows that the
29 contribution to the total water flux is dominated by the diffusive term when the normalized water
30 concentration (or saturation) stays low, which can occur, as demonstrated below, at low rh

1 conditions. At high rh conditions where the normalized water concentration substantially increases
 2 as a result of the phase transitions to pore-filling liquids in the 2 nm radii pores, the total flux is
 3 largely due to the advective term.

4 3.1 Diffusion-to-Imbibition Transition

5 Consistent with the experimental finding reported in Vincent et al. (2017), the model results
 6 show that there exists a critical rh value (rh_{crit}) equal to 0.6. When $rh < rh_{crit}$, smooth, diffusion-
 7 type concentration profiles occur, and when $rh > rh_{crit}$, sharp and imbibition-type concentration
 8 profiles appears (e.g., Figures 4a and 4b). The diffusion-type profiles calculated for $rh=0.5$ in
 9 Figure 4a indicates that water migrates mainly with vapor diffusion and forms adsorbed films in
 10 the pores. In Figure 4b, the model calculations at early times show smooth concentration profiles
 11 as water vapor diffuses and becomes adsorbed in the pores. At later times, with the sufficient
 12 supply of water molecules under high rh conditions (0.8 in this case), the diffusion-type profiles
 13 transition into the imbibition-type profiles. The transition from adsorbed water film to pore filling
 14 liquid starts at near the inlet, and then the water migrates in an imbibition-like fashion. When $rh <$
 15 rh_{crit} , this transition does not happen and the normalized water concentration (or saturation)
 16 remains low. According to the model, the transition time for diffusion-to-imbibition depends on
 17 rh. Figure 5 shows a plot of the rh-dependence of the model-calculated elapsed times when the
 18 transition occurs at a short distance from the inlet ($x \approx 0.68$ mm). As the rh increases, the chemical
 19 potential difference between the outside and the inside of the porous medium increases, and the
 20 transition to imbibition develops more rapidly. As the rh approaches the rh_{crit} , the transition
 21 requires much longer time, consistent with time needed to diffusively build up adsorbed film
 22 thicknesses to the point of pore filling.

23 3.2 Equilibrium Behavior of Water and Adsorption-Desorption Isotherms in the Silicon 24 Nanoporous Medium

25 The occurrence of the diffusion-to-imbibition transition at high rh ($>rh_{crit}$) can be
 26 understood by evaluating the thermodynamic potential of the system. We employ a useful
 27 thermodynamic potential known as the grand potential, (Evans, 1990),

$$\Omega = \psi_0 + c\phi_s - c\Phi_0(c_v) \quad (16)$$

1 where Ω represents the grand potential density (J/m^3). Eq. (16) can be used to explain the
 2 equilibrium properties of water (i.e., the adsorbed films or pore filling condensed water) inside the
 3 nanoporous medium that is in equilibrium with water vapor (c_v) kept at different fixed rh values
 4 and chemical potentials ($\Phi_0(c_v)$).

5 Figure 6a shows a plot of the grand potential energy density as a function of the normalized
 6 water concentration for the nanoporous medium tested at various rh conditions. At $\text{rh} < 0.6$, the
 7 grand potential function shows two local minima. The minima in the potential correspond to
 8 possible stable equilibrium concentrations of water in the pore space when the equilibrium is
 9 reached. During water adsorption for $\text{rh} < 0.6$, starting from a dry state, water concentration
 10 increases and the potential reaches the first minimum where the stable adsorbed films form. There
 11 exists an energy barrier preventing the adsorbed films from growing into pore-filling condensed
 12 liquid phase. Note that there is no any initial barrier to create adsorbed films (i.e., very left side of
 13 the curves, left to the first minimum), because the water-solid attractive forces are strong and
 14 sufficient for creation of adsorbed surface layers (\sim mono- or few-molecular thicknesses).
 15 However, at low rh values, the water-solid attractive potential is not enough to form liquid bridges
 16 across the entire pores. As a result, during adsorption at $\text{rh} < \text{rh}_{\text{crit}}=0.6$, the system reaches an
 17 equilibrium with a lower water concentration, corresponding to the first minimum of the potential
 18 function. The energy barrier decreases with increasing relative humidity and finally disappears at
 19 the critical relative humidity of 0.6 for water in the silicon nanoporous medium. When $\text{rh} >$
 20 $\text{rh}_{\text{crit}}=0.6$, we do not see any stable adsorbed films, and instead the potential energy reaches a
 21 minimum with a high water concentration by taking up much more water from the outside. As a
 22 result, imbibition-type water transport regime results when $\text{rh} > \text{rh}_{\text{crit}}=0.6$.

23 Figure 6b presents a conceptual energy diagram based on Eq. (16) to explain the phase
 24 transitions. The diagram represents the free energy changes at different rh conditions ($>$ or $<$ rh_{crit}).
 25 When the fluid-solid interaction is zero, i.e., the top curve, the grand potential show two local
 26 minima corresponding to the bulk saturated liquid and vapor concentrations, as would be
 27 calculated from the equation of state. Figure 6b shows that in addition to the energy barrier for
 28 adsorption, there exists an energy barrier for desorption. For desorption, additional energy is
 29 needed to overcome the attractive forces between water molecules and between water and solid
 30 molecules. The energy associated with these attractive forces represents the second energy barrier

1 shown in Figure 6b. However, the energy barrier for desorption is much deeper than the energy
2 barrier for adsorption, and this means that a much greater chemical potential difference is needed
3 for desorption of water from pore space than for adsorption of water into pore space.

4 Figure 7 exhibits an interesting feature of the model to represent hysteresis in adsorption
5 and desorption isotherms at 15°C. The difference in the energy barriers of adsorption and
6 desorption (Figure 6b) appears to be responsible for our model prediction of hysteresis in
7 adsorption-desorption isotherms. Each point in Figure 7 was obtained by solving Eqs. (10-11) until
8 the steady state was reached under different rh boundary conditions. At equilibrium, the chemical
9 potential (Eq. 11) becomes constant throughout the domain. Although the difference in the energy
10 barriers is the reason for the calculated hysteresis of adsorption-desorption isotherms in the
11 idealized porous medium here with the bundle of more or less uniformly sized nanopores, pore
12 connectivity and pore size distributions are the other important factors for the hysteretic isotherms
13 in more complex porous media (e.g., Haines, 1930; Monson, 2012). It should be noted that the
14 model calculated isotherms in Figure 7 appear to be very sharp, especially compared to the
15 reflectance isotherms presented in Vincent et al. (2017) for $T=15^\circ\text{C}$. Sharpness or slope of the
16 isotherms presumably reflects how the pore sizes vary in the nanoporous medium. We do not know
17 exactly how the reflectance values are related quantitatively to the total adsorbed mass of the water
18 in the silicon nanoporous medium, but small changes in the pore sizes may cause variation of the
19 phase behavior (adsorbed film versus pore filling) in individual pores, and this can in turn make
20 the isotherms representing the overall behavior of the pore network smoother. The fact that the
21 model calculated isotherms look very sharp implies that the current representation of the impacts
22 of the fluid-solid interaction forces in the model needs to be improved to represent the adsorption-
23 desorption isotherms in porous media with broad pore size distributions.

24 **4 Conclusions**

25 This study presents a theoretical investigation of the processes controlling adsorption,
26 capillary condensation and imbibition in a nanoporous medium. The theoretical model, which is
27 based on the square-gradient density functional theory, explicitly includes the relevant interaction
28 forces among fluids and solids in macroscopic nanoporous media. We applied the model to a
29 relative humidity-controlled water adsorption experiment in a hydrophilic silicon nanoporous
30 medium by Vincent et al. (2017). The model represents reasonably well the data for the time-

1 dependent evolution of the water imbibition front inside the nanoporous medium that was observed
2 under a high rh boundary condition. The model also correctly represents the critical relative
3 humidity value (rh_{crit}) of 0.6 for the transition to happen from diffusion-type transport regime to
4 an imbibition-type transport regime of water. The model shows that when rh exceeds rh_{crit} , smooth
5 and diffusion-type concentration profiles change into sharp and imbibition-type concentration
6 profiles (Figures 4a and 4b). The model results indicate that the transition from adsorbed water
7 film to pore filling liquid starts near the inlet, and then the water migrates in an imbibition-like
8 fashion into deeper parts of the core. We found that for $rh > rh_{crit}$, the transition time substantially
9 increases as rh decreases towards rh_{crit} . This is because the chemical potential difference between
10 the outside and the inside of the porous medium decreases with decreasing rh . Remarkably, the
11 model presented has an inherent feature to predict hysteresis in adsorption and desorption
12 isotherms. We presented an explanation for the occurrence of hysteresis using the grand potential
13 formulated based on the model and showed that the different energy barriers for adsorption and
14 desorption lead to hysteresis in adsorption-desorption isotherms. However, our analyses show that
15 the free energy description in the model that includes the fluid-solid interaction forces will need to
16 be improved for more accurately representing the adsorption-desorption isotherms in natural
17 nanoporous media with broad pore size distributions.

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22 available at <https://doi.org/10.5281/zenodo.4480378>. The source code for this research is not
23 currently publicly posted due to the intellectual property transfer policy in our institution but is
24 available upon request from the corresponding author and approval from the Intellectual Property
25 Office (IPO@lbl.gov) of Lawrence Berkeley National Laboratory.

26

27 **Appendix A: Equation of State for Water**

28 Fuller's equation of state (1976) for water in terms of pressure (P) as a function of molar
29 concentration of water (c) and temperature (T) is expressed as

$$P = \frac{cRT}{1-cb} - \frac{c^2a}{1+cb\chi} \quad (\text{A1})$$

1 where a is the attraction energy parameter ($\text{J}\cdot\text{m}^3/\text{mol}^2$), b is the excluded volume parameter
 2 (m^3/mol), and χ is a temperature dependent dimensionless parameter introduced by Fuller
 3 (1976):

$$a = \Omega_a(\beta) \frac{R^2 T_c^2 \alpha(T_r)}{P_c}, \quad b = \Omega_b(\beta) \frac{RT_c}{P_c}, \quad \chi = \frac{1}{\beta} \left(\sqrt{\frac{1}{\beta} - \frac{3}{4}} - \frac{3}{2} \right) \quad (\text{A2})$$

4 The formulations of other parameters are presented as

$$\begin{aligned} \beta_c &= c_c b \\ Z_c(\beta) &= \frac{P_c v_c}{RT_c} = \frac{(1-\beta_c)(2+\chi_c\beta_c) - (1+\chi_c\beta_c)}{(2+\chi_c\beta_c)(1-\beta_c)^2} \\ \beta_0 &= \beta_c (7.788 - 36.8316 Z_c + 50.7061 Z_c^2) \\ \theta &= 10.9356 + 0.0285 \bar{P} \\ \beta &= \beta_c + (\beta_0 - \beta_c) \left[\frac{2}{1 + e^{\theta(T_r-1)}} - 1 \right] \\ \Omega_b(\beta) &= \beta \frac{(1-\beta)(2+\chi\beta) - (1+\chi\beta)}{(2+\chi\beta)(1-\beta)^2} \\ \Omega_a(\beta) &= \frac{(1+\chi\beta)^2 \Omega_b(\beta)}{\beta(2+\chi\beta)(1-\beta)^2} \\ q(\beta) &= \left(\frac{\beta}{0.26} \right)^{1/4} (0.480 + 1.574\omega_a - 0.176\omega_a^2) \\ \alpha(T_r) &= [1 + q(\beta)(1-T_r^{1/2})]^2 \end{aligned} \quad (\text{A3})$$

5 where T_r is the reduced temperature, T/T_c . The specific parameter values for water that is necessary
 6 for computing the equation is given as $\bar{P} = 54.2$, $T_c = 647.3\text{K}$,
 7 $P_c = 2.205 \times 10^7 \text{ Pa}$, $c_c = 17900 \text{ mol/m}^3$, $Z_c = 0.229$, $\omega_a = 0.344$.

8 Based on the Fuller equation of state, the Helmholtz free energy density of the
 9 homogeneous fluid is expressed by (Guerrero & Davis, 1980),

$$\psi_0(c) = c\psi_0^+(T) - cRT \left[\ln(1/c-b) + 1 \right] - \frac{ca}{b\chi} \ln(1+cb\chi) \quad (\text{A4})$$

1 where $\psi_0^+(T)$ is the ideal gas contribution and cancels out during the computations in this work.
 2 The equilibrium liquid, $c_{(l)}$, and vapor, $c_{(v)}$, concentrations of the coexisting phases at a given T
 3 are found by solving two algebraic equations simultaneously $p(c_{(l)}) = p(c_{(v)})$ and
 4 $\Phi_0(c_{(l)}) = \Phi_0(c_{(v)})$. Figure A1 shows that the predicted saturated density of liquid and vapor water
 5 are in reasonable agreement with the results based on the IAPWS formulation for water (Wagner
 6 and Pruss, 2002) at different temperatures. The mean difference between the calculated saturated
 7 liquid density values is about 2.5 %, and the mean difference for the calculated saturated vapor
 8 density values is about 10 %. However, at 15 °C, the difference between the liquid densities is less
 9 than 1%, while the difference between the vapor densities increase to 24 %.

10 **Appendix B: Square Gradient Theory of Surface Tension**

11 For a planar liquid and vapor interface in a non-porous medium, the equilibrium concentration
 12 distribution, according to the square gradient theory, can be described by the following second
 13 order partial differential equation and fixed concentration boundary conditions:

$$\Phi = \frac{\partial \psi_0(c, T)}{\partial c} - \kappa(T) \frac{d^2 c}{dx^2}, \quad c(x \rightarrow \infty) = c_v, \quad c(x \rightarrow -\infty) = c_l \quad (\text{B1})$$

14 The surface tension coefficient is described as

$$\gamma = \int_{-\infty}^{\infty} \kappa \left(\frac{\partial c}{\partial x} \right)^2 dx \quad (\text{B2})$$

15 By manipulation of Eq. (B1), Eq. (B2) can be expressed as functions of the saturated liquid and
 16 vapor concentrations only (Teletzke et al., 1982):

$$\gamma = \sqrt{2} \int_{c_v}^{c_l} \sqrt{\kappa(\Omega - \Omega_v)} dc \quad (\text{B3})$$

17 where

$$\begin{aligned} \Omega &= \psi_0(c) - c \Phi_0(c_v) \\ \Omega_v &= \psi_0(c_v) - c_v \Phi_0(c_v) \end{aligned} \quad (\text{B4})$$

1 and Φ_0 is the chemical potential of the homogeneous fluid as given by Eq. (12), and the
 2 equilibrium liquid, c_l , and vapor, c_v , concentrations of the coexisting phases at a given T are
 3 calculated as described in Appendix A. The temperature dependent coefficient $\nu(T)$ in the
 4 influence parameter, κ , in Eq. (14) is estimated by fitting Eq. (B3) to the surface tension data for
 5 water (Figure B1). Note that Eq. (B3) was evaluated by numerical integration, and we found that
 6 the temperature dependent coefficient for water can be expressed as $\nu(T) = (0.6058T_r + 0.0556)^2$.
 7 With the knowledge of the equation of state and the influence parameter, we numerically solved
 8 Eq. (B1) using the Finite Volume method as described in Section 2 at different grid resolutions.
 9 Then we computed the concentration profiles (Figure B2) and the surface tension from Eq. (B2).
 10 By comparing the numerical results against the data, we found that a grid size of about 0.012 nm
 11 would produce surface tension values accurate up to fourth digit. As a result, we selected this grid
 12 size as a base to scale up the influence parameter for macroscopic simulations at a micrometer-
 13 scale model resolution, as described in Section 2.1.2.

14

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Table 1. Model input parameters for water in the hydrophilic silicon nanoporous medium (pore radius~2 nm, and $T=15^\circ\text{C}$)

ϕ (-)	0.45
μ_w (Pa.s)	1.14×10^{-3}
$D_{aw(l)}$ (m^2/s)	2.25×10^{-9}
$D_{aw(g)}$ (m^2/s)	2.36×10^{-5}
a ($\text{J} \cdot \text{m}^3/\text{mol}^2$)	9.97×10^{-1}
b (m^3/mol)	1.56×10^{-5}
κ ($\text{J} \cdot \text{m}^5/\text{mol}^2$)	$9.23 \times 10^{-21} \times (\Delta x / 0.012 \text{nm})^2$

Table 2. Estimated model parameters for the hydrophilic silicon nanoporous medium

k (m^2)	8.73×10^{-21}
A_h (J/mol)	-2.36×10^4
α (m^3/mol)	3.81×10^{-5}
$D_{(g)}$ (m^2/s)	2.78×10^{-7}
$D_{(l)}$ (m^2/s)	3.90×10^{-11}

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Figure Captions

Figure 1. Conceptual diagram representing the experimental observation of adsorption and condensation-induced imbibition. Water vapor diffuses into a nanoporous medium under controlled relative humidity and temperature conditions. At high relative humidity conditions, the condensation near the inlet leads to imbibition-type water concentration or saturation profiles.

Figure 2. Comparisons of the model estimated and the measured water concentration profiles at $rh=0.98$.

Figure 3. Contributions of the diffusive and advective terms to the flux of water as a function concentration.

Figure 4. Dimensionless concentration profiles at a) $rh=0.5 (<rh_{crit})$ and b) $rh=0.8(>rh_{crit})$.

Figure 5. The model estimated times for diffusion-to-imbibition transition at 0.68 mm distance from the inlet.

Figure 6. (a) The calculated grand potential energy density (J/m^3) as a function of the normalized water concentration for water-silicon nanoporous medium at various rh . (b) The grand potential diagram representing free energy changes at different rh conditions and different energy barriers for adsorption and desorption.

Figure 7. The model estimated hysteresis in adsorption and desorption isotherms.

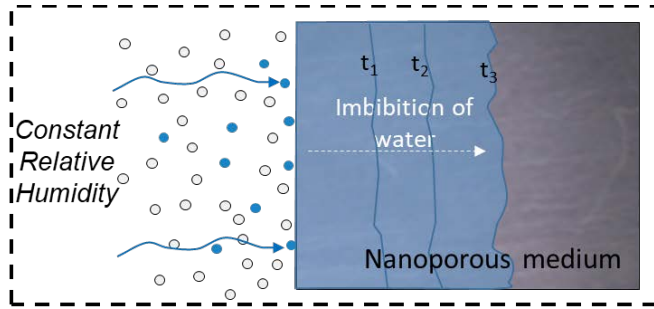
Figure A1. Comparisons of the calculated saturated density values using Fuller's equation of state (1976) and the IAPWS formulation for water (Wagner and Pruss, 2002) at different temperatures.

Figure B1. Estimation of the surface tension of water using the square gradient theory-based model. The surface tension data is based on the International Association for the Properties of Water Steam (1994).

1 **Figure B2.** Estimated water concentration profiles for a planar interface between liquid and
2 vapor water, using the square gradient theory-based model. $(\kappa/a)^{1/2}$ is roughly equivalent to a
3 molecular diameter. At 15 °C, the interface thickness is only a few molecular diameters. As the
4 temperature increases, the interface thickness increases, and at a critical temperature, the
5 interface becomes flat and surface tension vanishes.

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Transition from adsorbed film to pore-filling liquid

