



# Pore-scale evaluation of CO<sub>2</sub> miscible displacement in porous rocks induced by convection and diffusion: implications for CO<sub>2</sub> geo-sequestration

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Received: 31 December 2024 / Revised: 18 March 2025 / Accepted: 15 April 2025  
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## Abstract

CO<sub>2</sub> enhanced oil recovery plays an important role in carbon storage and utilization. However, the incomplete understanding of the underlying microscopic convection–diffusion mechanisms in complex pore structures has constrained the broader industrial application of CO<sub>2</sub> geo-sequestration. This work develops a pore-scale numerical model considering molecular convection–diffusion to investigate CO<sub>2</sub>–oil miscible displacement in two- and three-dimensional porous structures of conglomerate rocks. The effects of CO<sub>2</sub> injection rates and pore structure properties on convection–diffusion are analyzed. By reconstructing the distribution of unexploited pores, the CO<sub>2</sub> sweep efficiency is quantitatively evaluated. Furthermore, a sequestration factor is proposed to evaluate the CO<sub>2</sub> storage capacity during miscible displacement. Convection significantly enhances the CO<sub>2</sub> mass fraction in fractures with high flow rates. Subsequently, CO<sub>2</sub> gradually diffuses into matrix pores without velocity distribution. Both convection and diffusion contribute to improving CO<sub>2</sub> displacement efficiency. Diffusion facilitates the dissolution of CO<sub>2</sub> into oil within small-diameter pores, and convection effectively mobilizes oil in large pore bodies. Developed and homogeneous pore structures enhance CO<sub>2</sub> displacement efficiency, whereas CO<sub>2</sub> flows along the main flow channels in heterogeneous pore structures, resulting in lower displacement efficiency. Diffusion plays a crucial role in CO<sub>2</sub> storage within porous media. At low injection rates, dissolved CO<sub>2</sub> is trapped in poorly connected and blind-end pores. The injection rate is negatively correlated with the sequestration factor.

**Keywords** Pore-scale simulation · CO<sub>2</sub> miscible displacement · Porous media · Convection and diffusion

## 1 Introduction

Reducing CO<sub>2</sub> emissions is essential for effectively controlling global warming and maintaining ecological balance (Iyer et al. 2022; Lee and Zhao 2023; Franck et al. 2024; Xu et al. 2024; Shang et al. 2024). Carbon Capture, Utilization,

and Storage (CCUS) is a key strategy for reducing greenhouse gas emissions and enhancing the efficient development and utilization of fossil fuels (Edouard et al. 2023; Ge et al. 2023; Liu et al. 2023). As traditional oil and gas resources diminish, the development of low-permeability and tight oil reservoirs presents substantial potential (Du et al. 2023; Lu et al. 2024; Qin et al. 2024). CO<sub>2</sub> miscible flooding greatly enhances oil recovery and is a crucial aspect of CCUS (Liu et al. 2023; Zhang et al. 2023). The injected CO<sub>2</sub> dissolves in the crude oil, reducing density and viscosity and thereby enhancing the mobility of oil (Prasad et al. 2023; Cai et al. 2024b). Despite extensive efforts made in CO<sub>2</sub>-enhanced oil recovery (CO<sub>2</sub>-EOR) at the reservoir scale (Bachu. 2016; Alfarge et al. 2017), understanding the microscopic miscible flooding mechanisms remains challenging due to the fluid–fluid interactions associated with complex pore topology. This limits the in-depth application of CO<sub>2</sub>-EOR. Therefore, it is essential to establish a pore-scale model to reveal the microscopic miscible flooding

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mechanisms, providing theoretical guidance for optimizing CO<sub>2</sub> injection strategies and enhancing recovery.

Immiscible (Al-Bayati et al. 2018), near-miscible (Seyyedi and Sohrabi. 2020; Behnoud et al. 2023), and miscible flow (Yuan et al. 2023; Wan et al. 2024) are three modes of CO<sub>2</sub>-EOR, which depend on the pressure and temperature conditions. In immiscible multiphase flows, the displacement is affected by contact angle and interfacial tension, which may result in oil being trapped within complex pore networks (Yang et al. 2025). Near-miscible flow occurs when CO<sub>2</sub> has low solubility in oil, allowing for mass transfer at the two-phase interface region (Alhosani et al. 2021). However, in miscible flows, the absence of interfacial tension between CO<sub>2</sub> and oil components allows CO<sub>2</sub> to displace oil trapped in complex pore networks through dissolution, thereby enhancing oil recovery (Ren et al. 2024). Actually, the temperature and pressure conditions of low-permeability and tight reservoirs are considerably higher than the minimum miscibility pressure (Wang et al. 2023b). Consequently, CO<sub>2</sub>-oil miscible flow is a common scenario in engineering applications. The dispersion of CO<sub>2</sub> in porous media is a complex process affected by convection, diffusion, and pore structure properties. Experimental methods have been extensively employed to investigate the CO<sub>2</sub>-oil miscible flow. Core flooding experiments provide globally sensitive parameters, such as injection pressure and flow rate, to predict internal flow characteristics (Chen et al. 2022a). Additionally, by integrating with nuclear magnetic resonance (NMR), residual oil distribution characteristics are further analyzed, allowing for the assessment of CO<sub>2</sub> sweep efficiency (Wei et al. 2020; Li et al. 2021). Core-based experiments provide insights primarily into global flow behaviors and cannot examine the internal microscopic convection–diffusion mechanisms. Microfluidic experiments, combined with microscopic imaging systems, facilitate visual and quantitative description of miscible and immiscible flows (Ho et al. 2021; Zou et al. 2024). It directly observes the interaction mechanisms between CO<sub>2</sub> and oil at the pore-scale (Hao et al. 2022). However, the fabrication process for high-precision microfluidic chips with complex pore topology is intricate, and there are significant differences compared to the actual three-dimensional (3D) pore structures of reservoirs.

Numerical simulation has become a commonly used technique for investigating complex fluid flow behaviors within micro- and nanoscale pores (Ramstad et al. 2019; Wang et al. 2024a; Yin et al. 2024). Molecular dynamics (MD) simulations provide a detailed understanding of the mechanisms underlying CO<sub>2</sub>-oil miscible flow at the molecular level, accurately describing molecular collisions, adsorption, and diffusion processes (Cai et al. 2024a; Wu et al. 2024). However, MD simulations require substantial computational resources for complex

pore systems and prolonged simulation durations. It is commonly employed to investigate the flow characteristics within single nanopores. Pore-scale simulations considering adsorption, convection, and diffusion effects establish a bridge between macroscopic flows and the microscopic flow mechanisms described by MD simulations (Chen et al. 2022b; Yang et al. 2023). It accurately replicates the CO<sub>2</sub>-oil miscible flow within complex pore topology and produces representative results, offering valuable insights to inform the development process (Chowdhury et al. 2022; Wang et al. 2023a). Numerous studies have investigated CO<sub>2</sub>-oil miscible flow through pore-scale simulations. Wang et al. (2022) modified the pore-scale simulation parameters based on MD simulation results, developing a multiple relaxation time lattice Boltzmann method that accounts for the competitive adsorption and diffusion behaviors in CO<sub>2</sub>-oil miscible system. For the CO<sub>2</sub>-oil miscible displacement process, Zhu et al. (2024) analyzed the convection–diffusion effects of CO<sub>2</sub>-oil in two-dimensional (2D) porous media using pore-scale simulations. They concluded that molecular convection and diffusion influence the displacement patterns, while fracture inclination and connectivity affect breakthrough events. Currently, the mechanisms by which convection–diffusion affects CO<sub>2</sub>-oil miscible flow remain unclear in reservoirs due to the complex pore topology. Randomly generated geometric models fail to capture the actual pore structure properties of porous rocks, making it difficult to accurately assess CO<sub>2</sub> sweep efficiency. Additionally, a significant amount of research has focused on investigating CO<sub>2</sub>-oil miscible displacement process for enhanced recovery, while the assessment of CO<sub>2</sub> sequestration capacity has received little attention.

Therefore, a comprehensive analysis of the molecular convection–diffusion effects of CO<sub>2</sub>-oil miscible flow is performed within 2D and 3D porous media, integrating advanced image processing techniques to quantitatively assess CO<sub>2</sub> sweep efficiency and sequestration capacity. First, 2D and 3D porous structures that accurately reflect the actual pore topology are constructed using micro-CT images of conglomerate rocks. Then, a pore-scale numerical model considering molecular convection–diffusion is developed to simulate CO<sub>2</sub>-oil miscible displacement at different injection rates within porous structures. Convection–diffusion effects are identified in complex pore–fracture networks. Finally, the distribution characteristics of unexploited pores are reconstructed, and a sequestration factor is proposed to evaluate the CO<sub>2</sub> storage capacity under different injection rates.

## 2 Image reconstruction of complex pore structures

### 2.1 Micro-CT experiments

Two conglomerate samples, S1 and S2, are selected from the Mahu Depression for micro-CT scanning experiments. The samples exhibit well-developed intergranular pores and microfractures, with strong pore connectivity. The porosities of S1 and S2 are 12.9% and 11.2%, respectively, while their permeability values are 0.87 and 0.30 mD. The porosity and permeability of the selected samples align with the distribution range of conglomerate reservoirs in the Mahu Depression (Tang et al. 2025), confirming their representativeness. In addition, the considerable difference in permeability between the two samples provides an opportunity to analyze the impact of pore structure properties on fluid flow. Cylindrical samples with a diameter of 5 mm are cut from standard cores using the wire-cutting method for CT scanning. The scanning equipment is manufactured by Sanying Precision with a resolution of 1.86  $\mu\text{m}$ . Figure 1 illustrates the scanning results of the conglomerate rocks, revealing a significant presence of intergranular pores and microfracture structures. S1 exhibits well-developed intergranular pores and microfractures, demonstrating strong connectivity (Fig. 1a). In contrast, S2 primarily features microfractures, with particles arranged closely together (Fig. 1b). The pore structure properties obtained from the CT scanning experiments correspond to the porosity and permeability characteristics of the samples.

### 2.2 Reconstruction of 2D and 3D porous media

Due to the strong heterogeneity of conglomerate rocks, the pore structures of different slices exhibit significant

variations. To construct 2D porous media, slices with porosity closely matching that of the sample are selected. Furthermore, an interpolation algorithm is implemented to enhance the image resolution to 0.93  $\mu\text{m}$ , facilitating the identification of matrix pores. Images are cropped for threshold segmentation to extract the complex pore structures. The interactive threshold segmentation method based on grayscale values is combined with the top-hat segmentation method to extract large pore bodies and microfractures respectively. The segmentation results are fused by arithmetic addition. Since pore structures are isolated in a 2D perspective, they cannot form connected flow channels. However, these pores may be interconnected to form complex pore networks in the 3D perspective. To construct 2D connected pore networks, distance transformation and watershed algorithms are introduced to separate the rock matrix and connect isolated pores (Fig. 2a). Firstly, the matrix area is marked through image segmentation, and the shortest distance from the marked area to the boundary is counted to generate a distance map. Then, the watershed algorithm based on morphology theory is applied to generate segmentation lines to separate the rock matrix and connect isolated pores. Finally, 2D porous structures of conglomerate rocks are established for CO<sub>2</sub>-oil miscible flow based on CT images. In 2D porous media, the pore diameter follows a unimodal distribution (Fig. 2b). Well-developed fracture structures exist in S1, and the pore diameters are broadly distributed within the 6 to 12  $\mu\text{m}$ . In contrast, the pore diameters are concentrated in the range of 6 to 10  $\mu\text{m}$  in S2.

Since the 3D simulation is computationally expensive, a subdomain with a size of 186<sup>3</sup>  $\mu\text{m}^3$  is extracted for model reconstruction. Representative elementary volume analysis demonstrates that when the model size surpasses this threshold, the porosity gradually stabilizes. The grayscale images are filtered and segmented to generate a 3D structure (Fig. 2c). To quantitatively describe the complex

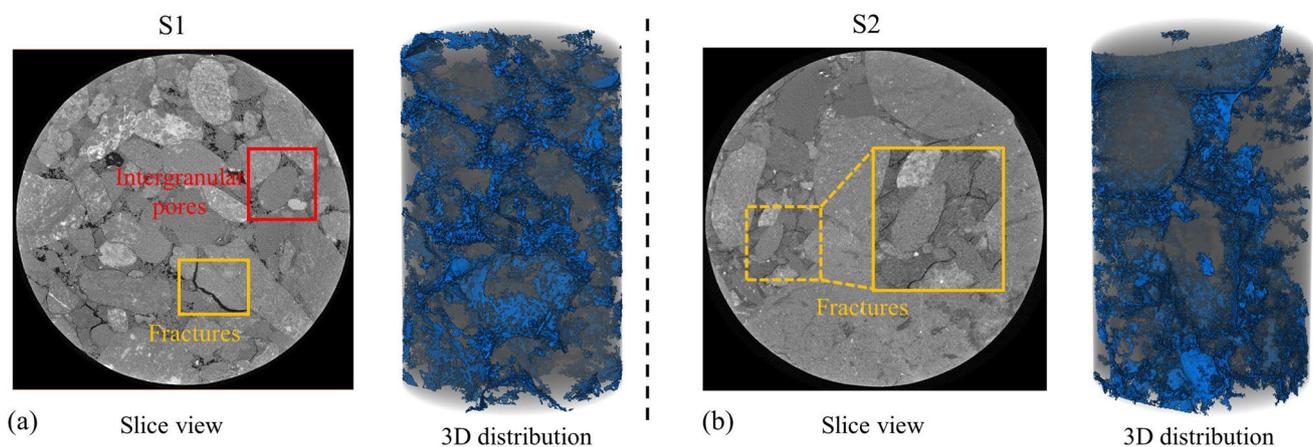
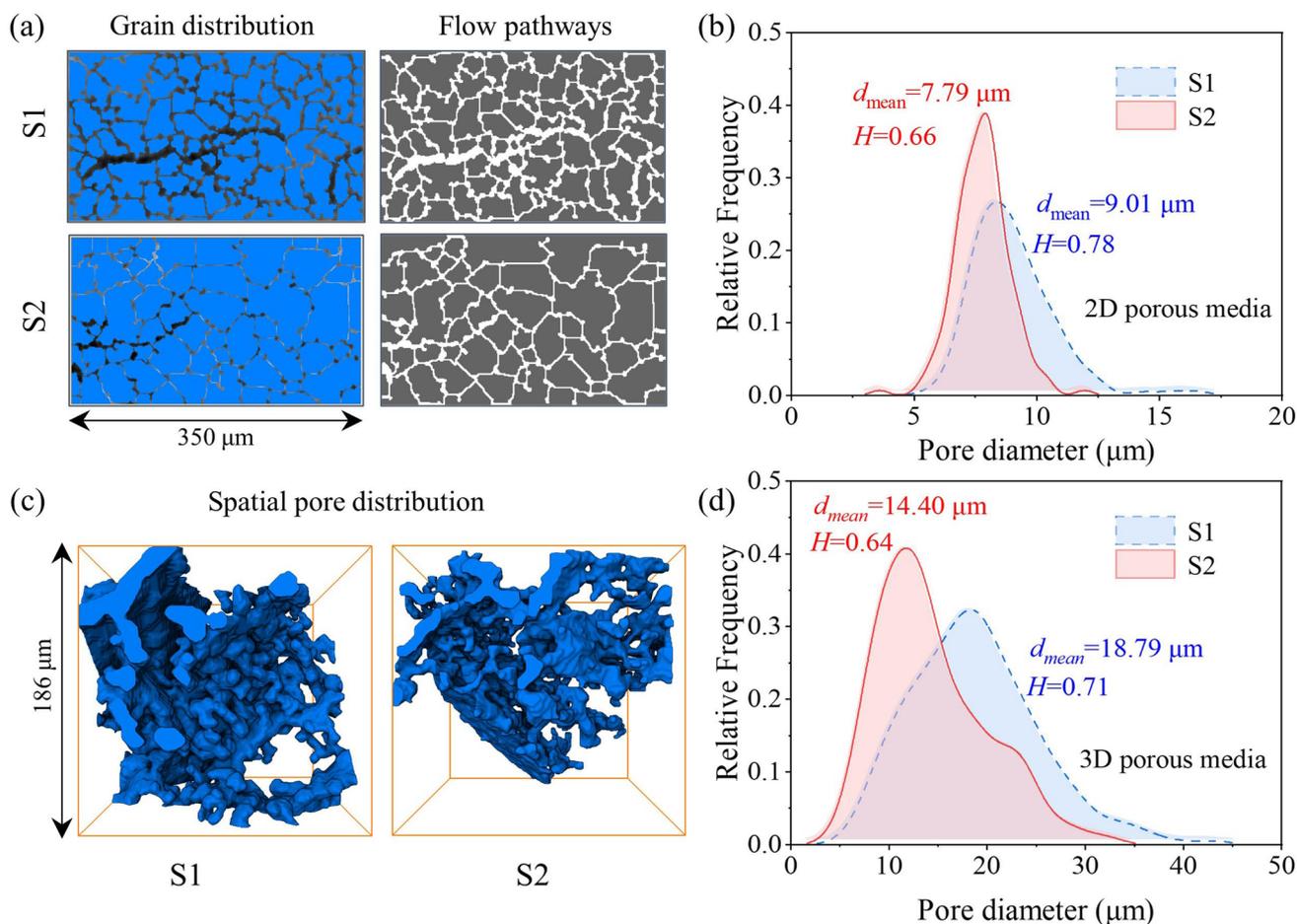


Fig. 1 CT scanning results of conglomerate rocks. **a** S1; **b** S2



**Fig. 2** Pore structure properties of conglomerate rocks. **a** Generation of 2D porous media; **b** Pore size distribution of 2D porous media; **c** 2D pore structures; **d** Pore size distribution of 3D porous media

pore structures, the watershed algorithm is applied to identify pore-throat structures and generate the pore network model. Well-developed fracture structures exist in 3D porous media and the fractures are connected with matrix pores, forming complex pore networks. The pore diameters of S1 are mainly distributed in the range of 10 to 25  $\mu\text{m}$ . The pore sizes of S2 are relatively small and the distribution is concentrated. The pores within the diameter of 10 to 15  $\mu\text{m}$  account for 41% of the total (Fig. 2d).

In addition, pore heterogeneity significantly influences the flow process. Entropy is introduced to describe the heterogeneity of the pore size distribution (Zhang et al. 2022):

$$H = - \sum_k P(k) \log P(k) \quad (1)$$

where  $k$  represents the specific pore size distribution range, and  $P(k)$  is the pore size distribution frequency within the range  $k$ .

When the pore sizes in the model are uniform, the value of entropy is 0, indicating a homogeneous pore size distribution. The larger the entropy, the stronger the heterogeneity of pore structures. Based on this, the heterogeneity for 2D porous media of S1 and S2 is calculated to be 0.66 and 0.78, respectively, while the heterogeneity for 3D porous media of S1 and S2 is calculated to be 0.64 and 0.71, respectively.

### 3 Pore-scale model for CO<sub>2</sub>-oil miscible flow

#### 3.1 Numerical model

The numerical model assumes that CO<sub>2</sub>-oil is mixed at the molecular scale and they share the velocity and pressure fields, with no interfacial tension between CO<sub>2</sub> and oil components. Since the impact of adsorption on fluid flow is negligible in microscale porous media, adsorption effects are not considered in the CO<sub>2</sub>-oil flow process. A fluid mixture containing oil and CO<sub>2</sub> components is

defined to obtain the global velocity and pressure fields. During the miscible displacement process, bulk oil, bulk CO<sub>2</sub>, and dissolved CO<sub>2</sub>-oil may coexist in the fluid mixture. The mass transfer between components in the fluid mixture is controlled by molecular convection and diffusion, and the diffusion velocity follows Fick's law.

The transport for multi-component fluids satisfies the conservation of momentum (i.e., the NS equation):

$$\bar{\rho} \left( \frac{\partial \mathbf{u}}{\partial t} + \nabla \cdot \mathbf{u} \cdot \mathbf{u} \right) = -\nabla p + \nabla \cdot \boldsymbol{\tau} + f \tag{2}$$

where,  $\bar{\rho}$  is the density of the fluid mixture,  $\mathbf{u}$  is the average velocity field,  $p$  is the pressure,  $\boldsymbol{\tau}$  is the stress tensor, and  $f$  is the body force.

Additional equations are introduced to solve the transport of CO<sub>2</sub> and oil components in a fluid mixture. The mass conservation equation for each component is:

$$\frac{\partial \rho_i}{\partial t} + \frac{\partial(\rho_i \mathbf{u})}{\partial x} = -\frac{\partial M}{\partial x} \tag{3}$$

where  $\rho_i$  is the mass-average density of component  $i$  in the mixture, and  $M$  is the relative mass flux. The relative mass flux term reflects the differing motions of each individual component. The concentration gradient mainly affects the mass transfer between components. A diffusion-like term is given for the diffusion effects:

$$M = -\frac{\alpha}{\bar{\rho}} \frac{\partial \rho_i}{\partial x} \tag{4}$$

where,  $\alpha$  is the molecular diffusion coefficient.

Assuming the system contains components  $i$  and  $j$ , during the miscible flow process, the increase in the mass of component  $i$  is equal to the decrease in the mass of component  $j$ . Therefore, summing all the terms in the expanded form of Eq. (3) across all components yields the standard continuity equation:

$$\frac{\partial \bar{\rho}}{\partial t} + \frac{\partial(\bar{\rho} \mathbf{u})}{\partial x} = 0 \tag{5}$$

The mass fraction of component  $i$  is defined as the ratio of the mass of component  $i$  to the total mass of the fluid mixture. The mass fraction is described by transforming the fluid densities:

$$\varphi_i = \frac{\rho_i}{\bar{\rho}} \tag{6}$$

where  $\varphi_i$  is the mass fraction of component  $i$ .

Substituting Eq. (4) and Eq. (6) into Eq. (3) to obtain the general convection–diffusion equation (Teng et al. 2021):

$$\frac{\partial(\bar{\rho} \varphi_i)}{\partial t} + \frac{\partial(\bar{\rho} \mathbf{u} \varphi_i)}{\partial x} = \frac{\partial}{\partial x} \left( \alpha \frac{\partial \varphi_i}{\partial x} \right) \tag{7}$$

The mass fraction of CO<sub>2</sub> is obtained by solving the mass fraction equations of the CO<sub>2</sub> component. The sum of the mass fractions of CO<sub>2</sub> and oil components must be 1. Therefore, the mass fraction of the oil component defined as the constraint component is obtained by the constraint equation:

$$\sum_{i=A,B}^N \varphi_i = 1 \tag{8}$$

The physical properties of the fluid mixture are directly calculated from the properties of the CO<sub>2</sub> and oil components and their proportions in the fluid mixture. Partial volume ( $V_{si}$ ) is defined as the equivalent volume of component  $i$  under standard conditions. The sum of the partial volumes of all components equals the volume  $V$  of the fluid mixture:

$$1 = \sum_{i=A,B}^N \frac{V_{si}}{V} = \sum_{i=A,B}^N \frac{M_i / \rho_{si}}{M_i / \rho_i} = \sum_{i=A,B}^N \frac{\rho_i}{\rho_{si}} \tag{9}$$

where  $\rho_{si}$  is the actual thermodynamic density of component  $i$ , and  $M_i$  is the mass of component  $i$ .

Combined with Eq. (6), it can be transformed into:

$$1 = \sum_{i=A,B}^N \frac{\bar{\rho} \varphi_i}{\rho_{si}} \tag{10}$$

Therefore, the density of fluid mixture can be obtained by the mass fraction and thermodynamic density of each component:

$$\frac{1}{\bar{\rho}} = \sum_{i=A,B}^N \frac{\varphi_i}{\rho_{si}} \tag{11}$$

In addition, arbitrary constitutive fluid properties such as viscosity can be obtained by:

$$\bar{\chi} = \sum_{i=A,B}^N \varphi_i \chi_{si} \tag{12}$$

where  $\bar{\chi}$  is the property of the fluid mixture, and  $\chi_{si}$  is the actual fluid property of component  $i$ .

The CO<sub>2</sub> density and viscosity parameters are obtained from the NIST standard reference database at 60 °C and 15 MPa. Based on this, the density and viscosity ratios of oil-CO<sub>2</sub> are adjusted to 2 and 20, highlighting the simulation effects. Additionally, referring to the studies by Zhu et al. (2024) and Li et al. (2016), the diffusion coefficient is estimated to be  $2 \times 10^{-9}$  m<sup>2</sup>/s. During the miscible flow

of supercritical CO<sub>2</sub> and oil, the density and viscosity of fluid mixture decrease with increasing CO<sub>2</sub> mass fraction. Substituting the density parameters into Eq. (11) yields the expression for the density of fluid mixture as a function of CO<sub>2</sub> mass fraction (Fig. 3a). The relationship between the density and CO<sub>2</sub> mass fraction shows a power function. As the CO<sub>2</sub> mass fraction increases, the density decrease rate decreases gradually. Similarly, by combining Eq. (12), the expression for the viscosity of fluid mixture as a function of CO<sub>2</sub> mass fraction is obtained (Fig. 3b). The viscosity is linearly negatively correlated with the CO<sub>2</sub> mass fraction.

### 3.2 Validation of CO<sub>2</sub>-oil miscible flow

The CO<sub>2</sub>-oil miscible flow numerical model is validated by comparing the simulation results with the microfluidic experiments conducted by Li et al. (2023). The microfluidic model is initially saturated with oil, and CO<sub>2</sub> is injected from the left side at a velocity of 0.004 m/s. CO<sub>2</sub> dissolves the oil in the vertical channel under diffusion, increasing the sweep area. The distribution of CO<sub>2</sub> mole fraction is consistent with the results of microfluidic experiments during the displacement (Fig. 4a). As the displacement proceeds, CO<sub>2</sub> dissolves the oil in the vertical channel, and the oil mole fraction gradually decreases. Along the the direction of CO<sub>2</sub> diffusion, the molar fraction of oil increases, and the

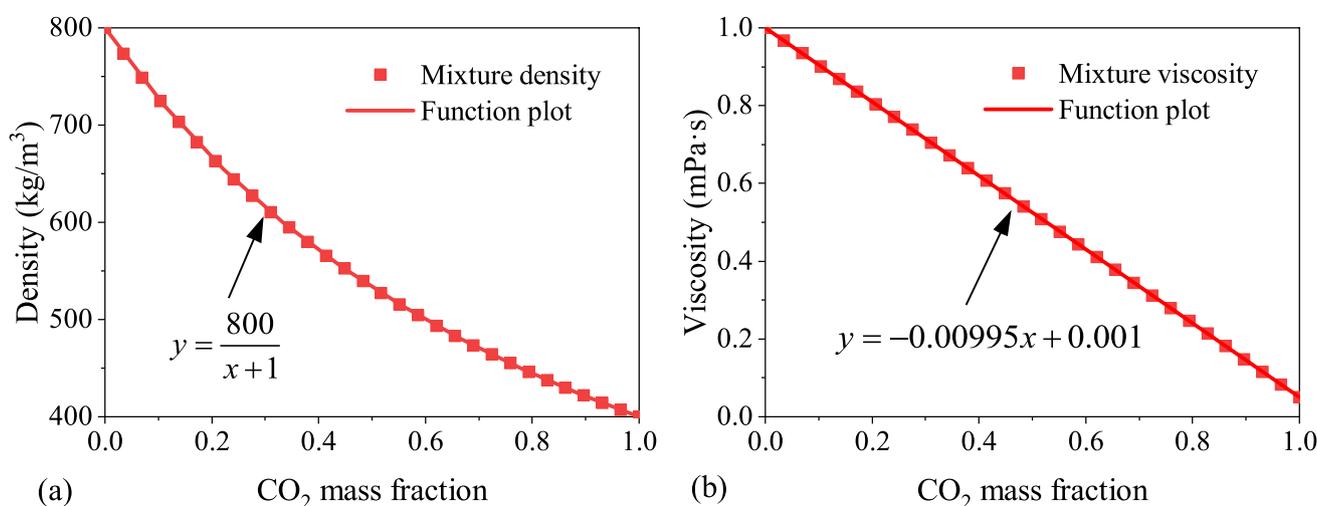


Fig. 3 Variation of miscible fluid properties. a Density; b Viscosity of fluid mixture are functions of CO<sub>2</sub> mass fraction

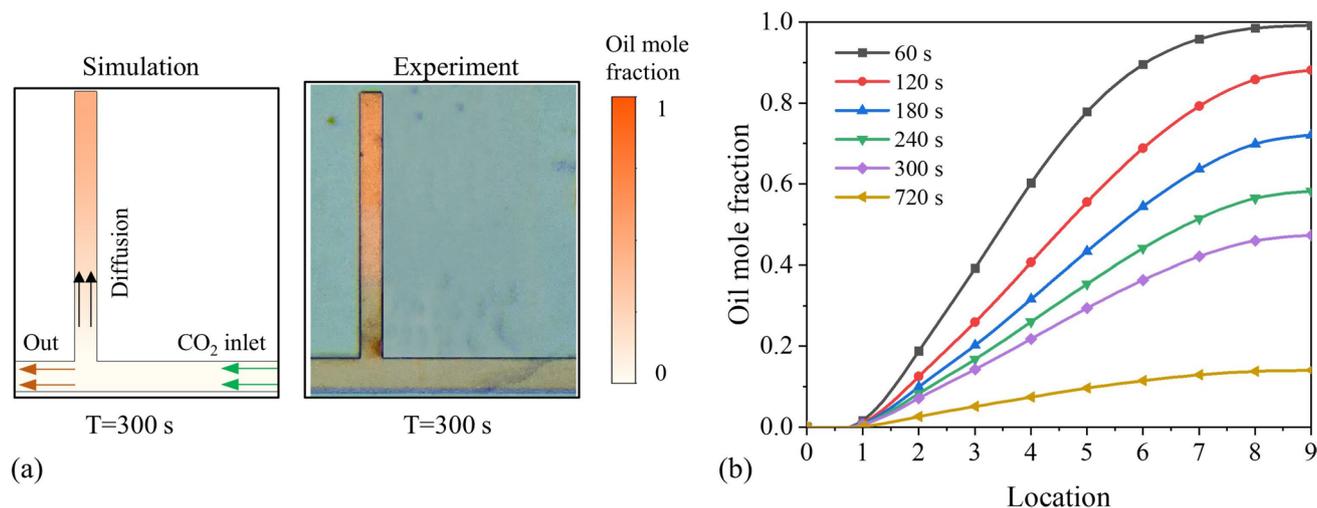


Fig. 4 Experimental verification of the CO<sub>2</sub>-oil miscible flow numerical model. a Oil mole fraction distribution in microfluidics obtained from simulation and experiment; b Variation of oil mole fraction along the diffusion direction

increase rate of oil mole fraction gradually decreases in the vertical channel (Fig. 4b). The distribution of oil mole fraction corresponds to the analysis results of Li et al. (2023). Therefore, the numerical model is reasonable for the prediction of CO<sub>2</sub>-oil miscible flow.

### 3.3 2D and 3D simulation schemes

To complete the numerical discretization calculation, the complex pore topology is divided into a series of hexahedral meshes, with the element size of 1 μm. The meshing of the complex pore system is completed in snappyHexMesh. The hexahedral background mesh is generated through the blockMesh module to cover the surface model of the pore topology, retaining the grids in the surface model to complete the meshing. Flow processes are solved in *x*, *y*, and *z* directions for 3D porous media. Symmetric boundary conditions are introduced for 2D porous media, in which the flow processes are solved in the *x* and *y* directions. The solution is completed in the CFX-solver manager using the second-order backward Euler algorithm to deal with transient flow processes with a solution accuracy of 10<sup>-6</sup>.

CO<sub>2</sub>-oil miscible displacement processes are conducted in pore systems of saturated oil at different CO<sub>2</sub> injection rates (Table 1). The appropriate CO<sub>2</sub> injection volume is crucial for subsequent analysis. A low CO<sub>2</sub> injection volume prevents CO<sub>2</sub> from breaking through at the outlet, while continuous CO<sub>2</sub> injection results in CO<sub>2</sub> dissolving into the oil in poorly connected networks and blind-end pores, ultimately

causing the recovery efficiency to approach unity. Therefore, both excessively low and high CO<sub>2</sub> injection volumes are unsuitable for analyzing the influencing factors of miscible displacement. In the simulation, 1.5 PV of CO<sub>2</sub> is injected to analyze the miscible displacement process under different conditions. Convection and diffusion jointly affect CO<sub>2</sub> dissolution. The Peclet number is introduced to describe the strength of convection and diffusion effects. A large Peclet number indicates a high flow rate, where convection dominates the concentration changes, while a small Peclet number suggests that diffusion is the primary influence on concentration changes. The Peclet number can be calculated as the ratio of injection velocity to the diffusion coefficient (Wang et al. 2024b):

$$Pe = \frac{u_0 \cdot h_0}{\alpha} \quad (13)$$

where  $u_0$  is the initial flow velocity and  $h_0$  is the fluid height. For porous media flows,  $h_0$  is determined by porosity ( $\phi$ ) and permeability ( $K$ ):

$$h_0 = \sqrt{\frac{12K}{\phi}} \quad (14)$$

## 4 Results and discussion

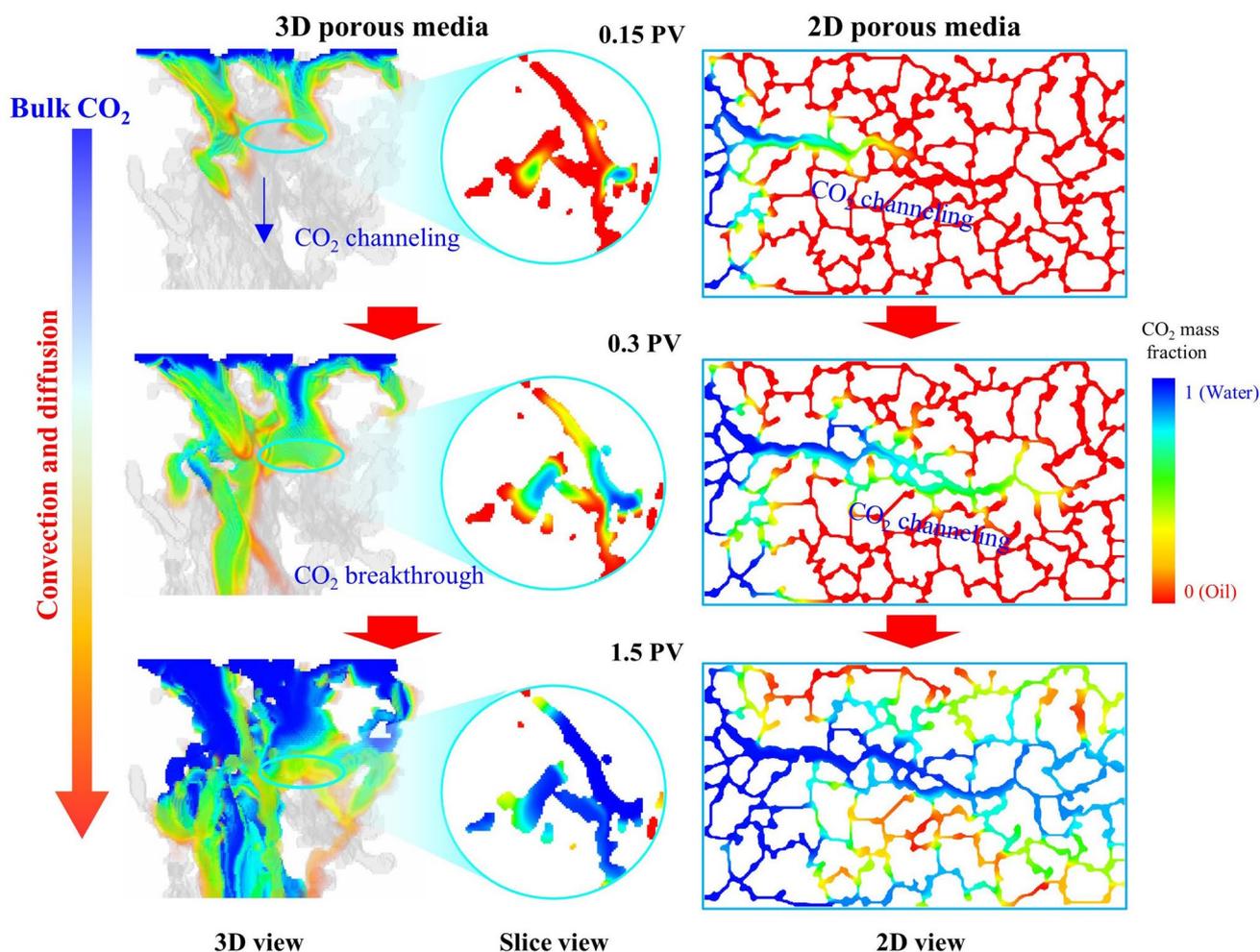
### 4.1 Convection and diffusion effects in the miscible displacement process

The CO<sub>2</sub>-oil miscible displacement processes in 2D and 3D porous media are obtained respectively. Figure 5 illustrates the displacement process of model S1. There is no distinct interface between CO<sub>2</sub> and oil components, indicating that CO<sub>2</sub> is dissolved in the oil during the displacement. Without the effect of capillary force, the injected CO<sub>2</sub> prefers to flow along the pore center and quickly breaks through the outlet along the dominant channels. CO<sub>2</sub> channeling is significant in fracture structures and breaks through the outlet earlier. Subsequently, CO<sub>2</sub> gradually occupies the pore spaces under convection and diffusion effects. After the breakthrough, due to the concentration difference of CO<sub>2</sub> in fractures and matrix pores, CO<sub>2</sub> gradually dissolves into the matrix pores and expands the swept area.

Convection and diffusion are the important mechanisms of mass transfer in miscible flows. The convection and diffusion phenomena are explained based on the 2D simulation results. The mass transfer between CO<sub>2</sub>-oil components controlled by convection is caused by the pressure gradient. Due to the constant injection rate, fluid pressure decreases along the flow direction. Therefore, the variation of CO<sub>2</sub> mass fraction caused by the convection is dominant along

**Table 1** Simulation schemes

Structures	CO <sub>2</sub> injection rate (m/s)	Injection volume (PV)	Peclet number
S1	0.001	1.5	0.968
2D porous media	0.005	1.5	4.84
	0.01	1.5	9.68
	0.05	1.5	48.4
	0.001	1.5	0.826
S2	0.005	1.5	4.13
	0.01	1.5	8.26
	0.05	1.5	41.3
S1	0.0005	1.5	1.06
	0.001	1.5	2.12
	0.005	1.5	10.6
	0.01	1.5	21.2
	0.05	1.5	106
S2	0.0005	1.5	0.61
	0.001	1.5	1.22
	0.005	1.5	6.1
	0.01	1.5	12.2
	0.05	1.5	61



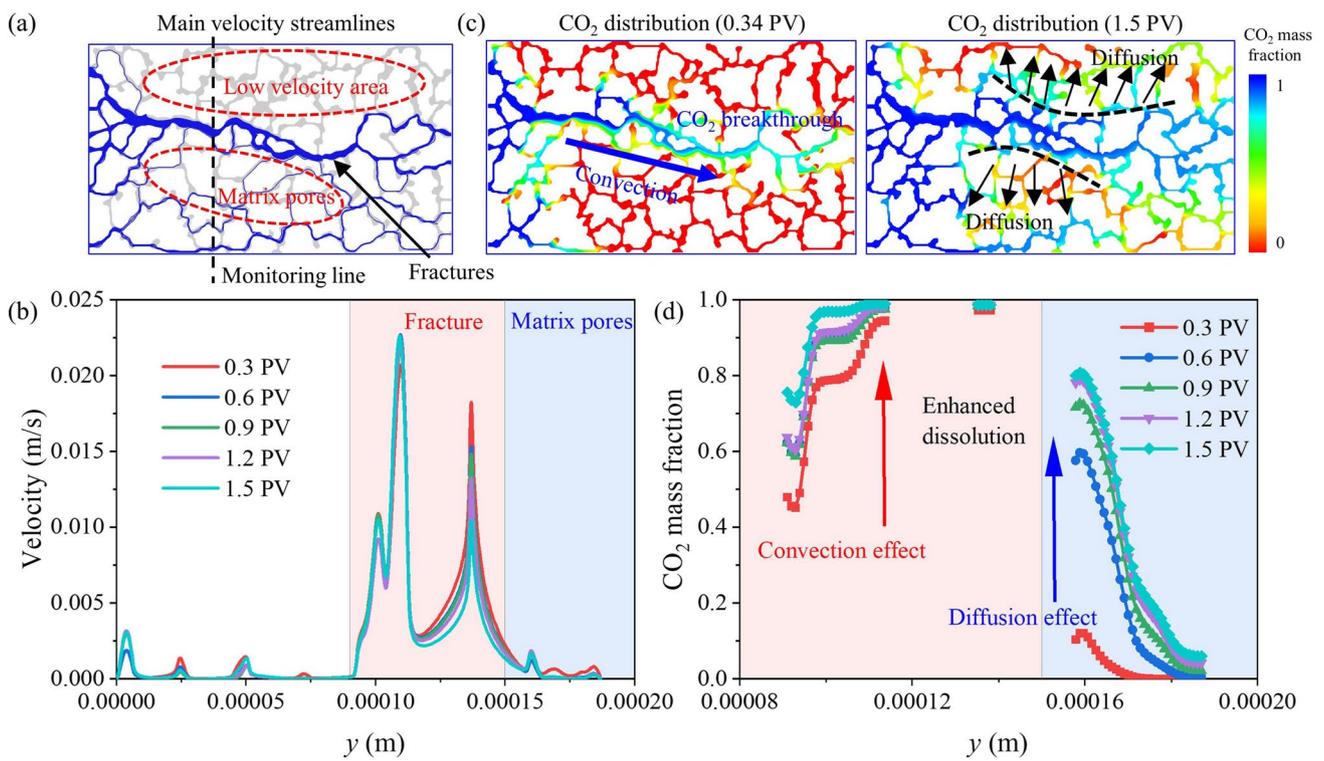
**Fig. 5** Variation of CO<sub>2</sub> mass fraction in 2D and 3D porous media during miscible displacement

the flow direction. In addition, due to CO<sub>2</sub> channeling, convection dominates the miscible displacement before CO<sub>2</sub> breakthrough. Diffusion is caused by concentration differences between components. After the breakthrough, the bulk CO<sub>2</sub> in fractures diffuses into the oil-saturated matrix pores in different directions (Zhu et al. 2024). The distribution of velocity streamlines in the pore system reveals a concentration in the fracture structures (Fig. 6a), where the velocity values are significantly higher than those in the matrix pores (Fig. 6b). Affected by the fracture inclination angle, only a few velocity streamlines are distributed at the bottom of the model. In the upper region and certain areas at the bottom of the porous media, there are no velocity streamlines, indicating that the flow velocity is minimal in the matrix pores (Fig. 6a), with diffusion dominating the mass transfer between CO<sub>2</sub> and oil components (Fig. 6c). The changes in CO<sub>2</sub> mass fraction in fractures and matrix pores are extracted. Under the convection effect, the mass fraction of CO<sub>2</sub> in fractures increases rapidly after injecting

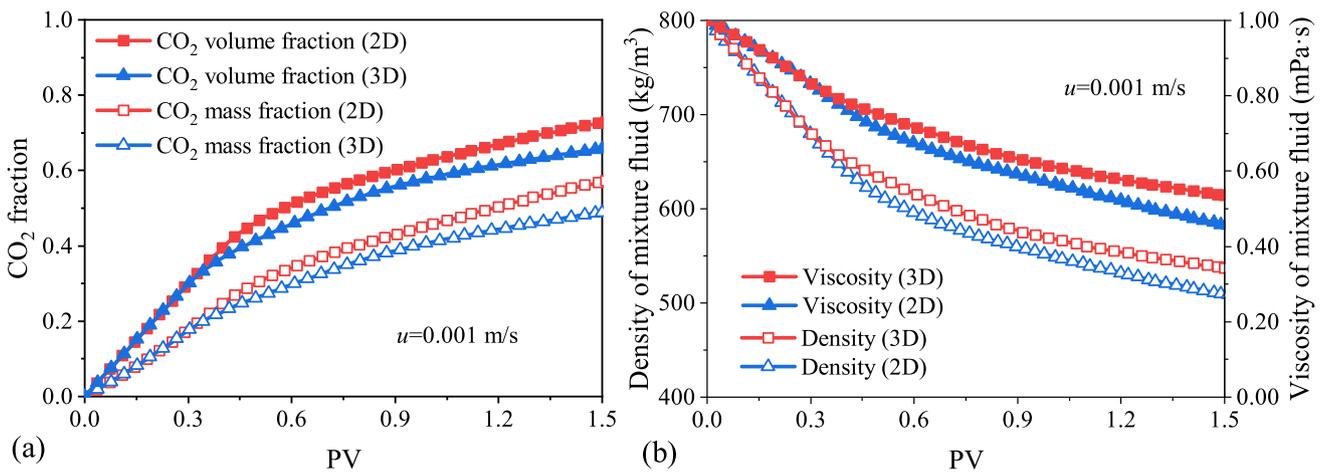
a small amount of CO<sub>2</sub>. In contrast, due to the diffusion effect, the mass fraction of CO<sub>2</sub> in the matrix pores increases slowly with increasing CO<sub>2</sub> injection amount (Fig. 6d). Furthermore, with continued CO<sub>2</sub> injection, the concentration difference of CO<sub>2</sub> in fractures and matrix pores decreases, and the increase rate of CO<sub>2</sub> mass fraction gradually slows down.

#### 4.2 Fluid flow characteristics

The mass fraction and volume fraction of CO<sub>2</sub> increase during the displacement process (Fig. 7a). Due to the constant injection rate, the volume fraction of CO<sub>2</sub> increases linearly with increasing injection volume before the breakthrough event. The mass fraction is less than the volume fraction during the displacement because the injected CO<sub>2</sub> reduces the density of the fluid mixture. CO<sub>2</sub> breaks through the outlet earlier in 3D pore systems, resulting in a lower oil recovery compared to the simulation results



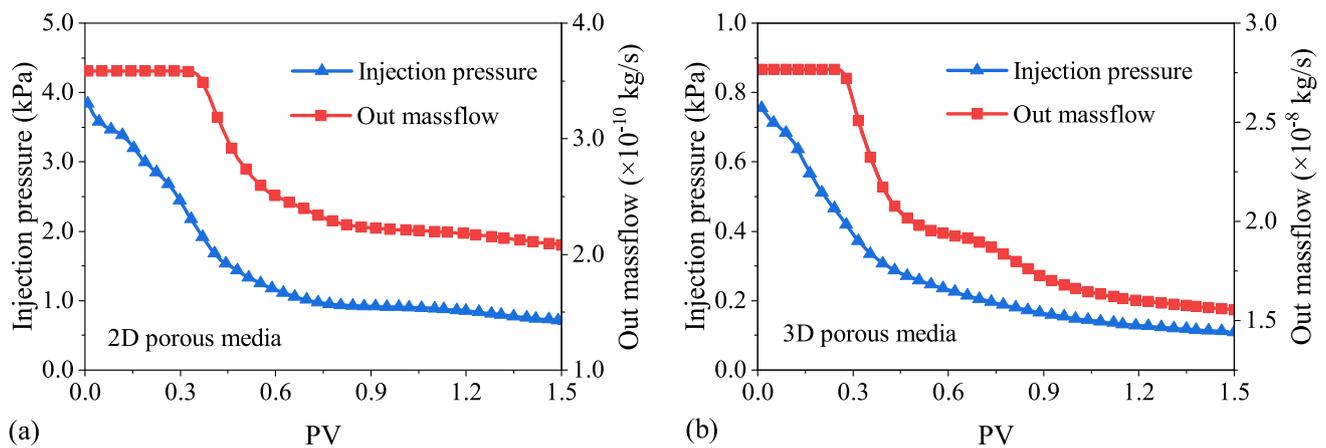
**Fig. 6** Convection–diffusion in fractures and matrix pores. **a** Velocity streamlines distribution in porous media; **b** Velocity values in fractures and matrix pores; **c** CO<sub>2</sub> mass fraction distribution in porous media; **d** CO<sub>2</sub> mass fraction changes in fractures and matrix pores



**Fig. 7** Variation of **a** CO<sub>2</sub> mass fraction and volume fraction, and **b** The density and viscosity of the fluid mixture during the displacement process

of 2D porous systems. The increasing rates of CO<sub>2</sub> mass fraction and volume fraction gradually decrease after the CO<sub>2</sub> breakthrough. Besides, the increasing rate remains high after injecting 1.5 PV of CO<sub>2</sub> due to the continuous dissolution of CO<sub>2</sub> into the oil under the diffusion effect. With the continuous injection of CO<sub>2</sub>, the oil will be completely displaced in complex pore systems. The

density and viscosity of the fluid mixture are functions of the CO<sub>2</sub> mass fraction. As the volume of CO<sub>2</sub> injected increases, the density and viscosity of fluid mixture gradually decrease (Fig. 7b). After injecting 1.5 PV of CO<sub>2</sub>, the fluid viscosity in the 3D and 2D pore systems decreased by 46.5% and 54.3%, respectively, while the fluid density decreased by 32.9% and 36.4%.



**Fig. 8** Variation of injection pressure and outlet mass flow in **a** 2D and **b** 3D porous media

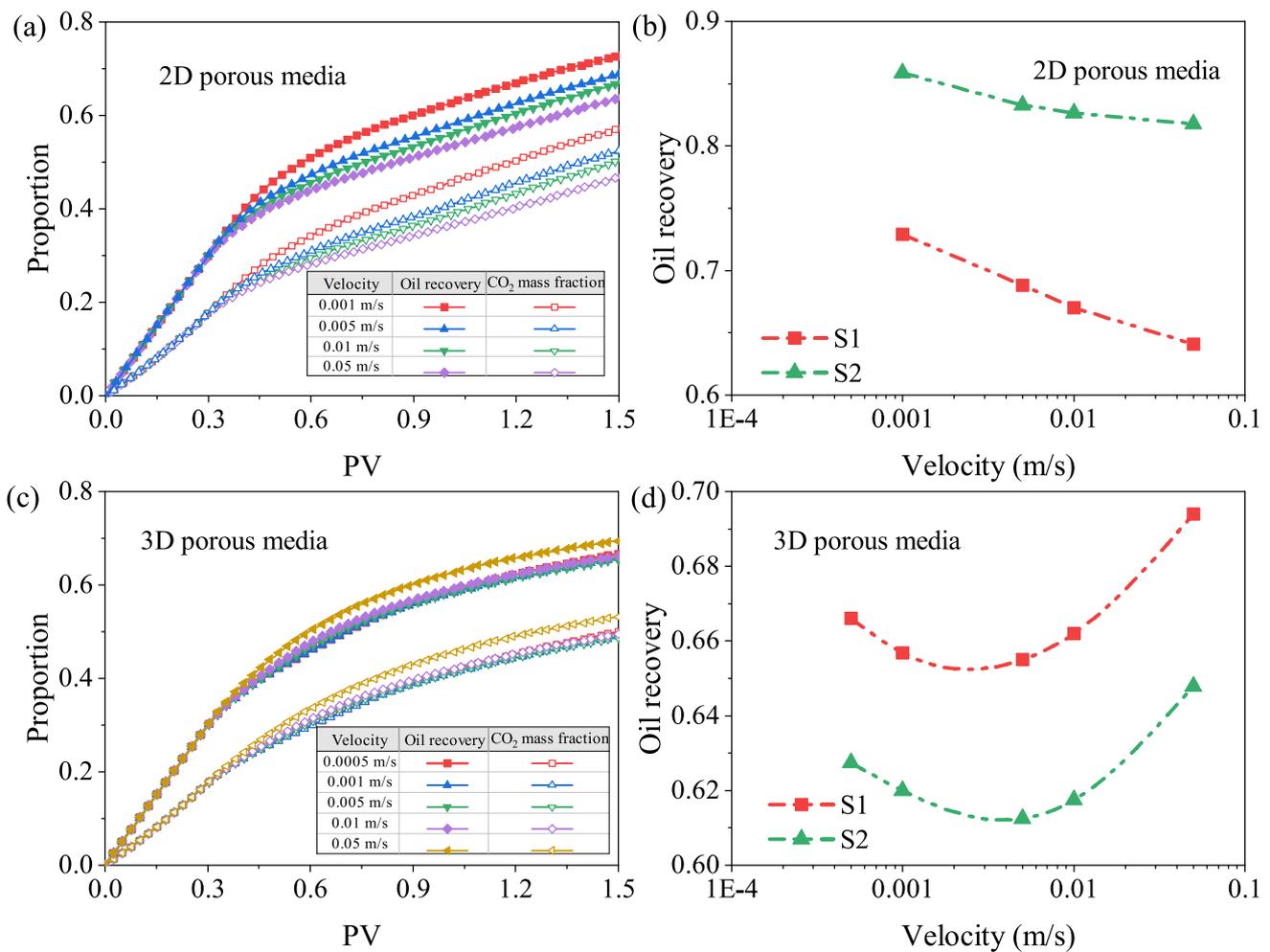
The injection pressure decreases with increasing  $\text{CO}_2$  injection volume in 2D (Fig. 8a) and 3D (Fig. 8b) porous media, as the injected  $\text{CO}_2$  reduces the density and viscosity of the fluid mixture. Before  $\text{CO}_2$  breakthrough, the outlet mass flow remains constant, with a significant amount of oil flowing out of the pore system. The presence of bulk and dissolved  $\text{CO}_2$  in the pore system results in a significant reduction in fluid pressure. After the breakthrough, the outlet mass flow decreases rapidly, indicating that a large amount of bulk  $\text{CO}_2$  is exiting the pore system due to strong convection effects. Subsequently, the pressure and outlet mass flow decline gradually, indicating that  $\text{CO}_2$  continues to dissolve in the oil through the diffusion effect.

### 4.3 Effect of injection velocity and pore structure properties

The injection velocity affects the convection and diffusion behaviors within complex pore structures, with its impact appearing to differ between 2 and 3D perspectives (Fig. 9). In 2D porous media, high injection velocity causes  $\text{CO}_2$  to break through prematurely at the outlet (Li et al. 2023). Conversely, at low injection rates, the strong diffusion effect delays breakthrough and expands the  $\text{CO}_2$  sweep range. Thus, injection velocity is negatively correlated with  $\text{CO}_2$  mass fraction and oil recovery (Figs. 9a, b). In 3D porous media, the convection–diffusion effects differ significantly from those in 2D porous media. Velocity variations have a slight influence on oil recovery within the range of 0.0005 to 0.01 m/s, but recovery improves significantly when the injection velocity increases to 0.05 m/s (Fig. 9c). As the injection rate increases, the oil recovery displays a trend of first decreasing and then increasing (Fig. 9d). This suggests that strong convection effects in 3D porous media may increase displacement channels and enhance recovery (Ren et al. 2024).

The variations of outlet mass flow under different injection velocities are further analyzed (Fig. 10). To facilitate comparison, the outlet mass flow rates are normalized. The attenuation characteristics of the outlet mass flow provide valuable insights into  $\text{CO}_2$  sequestration and oil recovery. In a 3D porous medium, the volume of injected fluid corresponding to the breakthrough event is nearly constant at different  $\text{CO}_2$  injection velocities (Fig. 10a, b). However, the outlet mass flow decays slowly at high injection velocities, indicating a high concentration of the oil component in the fluid mixture. Additionally, diffusion effects may delay the  $\text{CO}_2$  breakthrough event and the decline in outlet mass flow at low injection velocities. Therefore, the diffusion effects caused by low flow velocity and the convection effects caused by high flow velocity can improve the oil recovery in 3D porous media. As a result, the oil recovery decreases first and then increases with increasing injection rate, with the critical velocity of 0.005 m/s. In 2D porous media, high injection rates cause  $\text{CO}_2$  to break through the outlet prematurely, and the outlet mass flow decays rapidly, corresponding to poor displacement efficiency (Fig. 10c, d). Due to differences in pore structure properties, the relationship between injection rate and recovery varies between 2 and 3D porous media. Therefore, within the same pore topology, the Peclet number is negatively correlated with oil recovery in 2D porous media, while in 3D porous media, the relationship shows an initial decrease followed by an increase in oil recovery.

The distribution of  $\text{CO}_2$  mass fraction in the complex pore structures is extracted to analyze the displacement behavior at different injection rates (Fig. 11). The diffusion effect becomes pronounced at low injection rates due to the extended diffusion time. In this scenario,  $\text{CO}_2$  dissolves into the oil along the vertical direction, enhancing the sweep efficiency (Fig. 11a). However, limited by the diffusion rate, it takes a long time to achieve satisfactory displacement



**Fig. 9** Effect of injection rates on miscible displacement. In 2D porous media, **a** Changes in CO<sub>2</sub> mass fraction and oil recovery and **b** Oil recovery as a function of injection rate. In 3D porous media and **c**

Changes in CO<sub>2</sub> mass fraction and oil recovery and **d** Oil recovery as a function of injection rate

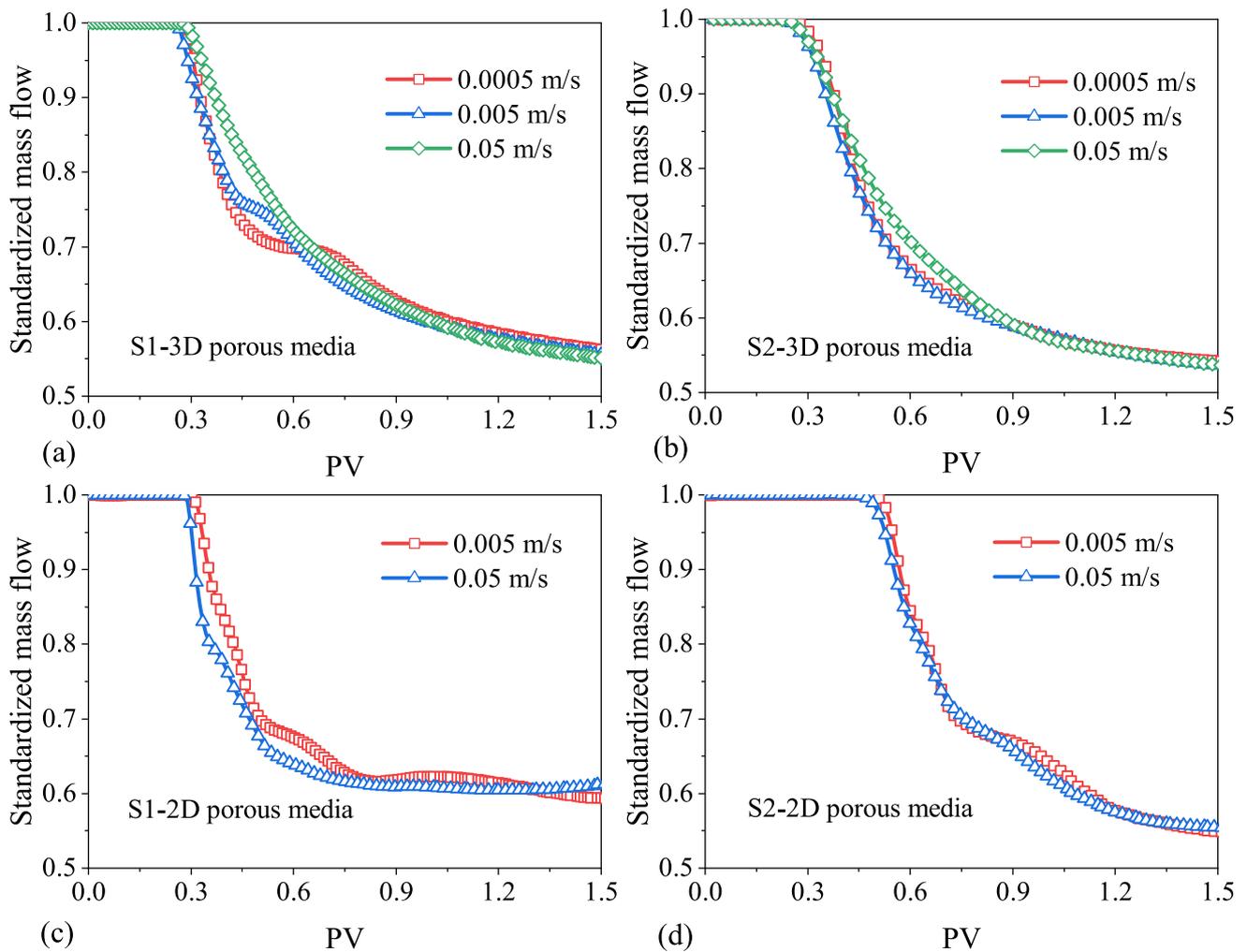
results. High injection rates indicate strong convective effects, resulting in a sharp interface region between CO<sub>2</sub> and oil components. Under high injection rates, the flow pathways of CO<sub>2</sub> may increase due to the large injection pressure, making CO<sub>2</sub> easier to break through narrow channels. Especially in 3D porous structures, CO<sub>2</sub> breaks through pore spaces that diffusion struggles to access at high injection rates (Fig. 11b). However, with the same volume of CO<sub>2</sub> injected, the reduced displacement time weakens the diffusion effect at high injection rates.

Pore topology also affects the convective-diffusion between CO<sub>2</sub> and oil. Due to differences in pore size and distribution within pore systems, the oil recovery of the two models is inconsistent (Fig. 9). The mean pore diameters of 2D porous media (models S1 and S2) are comparable (Fig. 2b); however, S1 exhibits stronger heterogeneity, with an entropy value of 0.78. The injected CO<sub>2</sub> primarily flows through preferential channels, limiting the sweep efficiency

(Fig. 11a). In contrast, the increased homogeneity of S2 promotes a uniform displacement pattern, leading to enhanced displacement efficiency. For 3D porous media, although S1 exhibits slightly higher heterogeneity than S2, its larger pore sizes contribute to enhanced displacement efficiency (Fig. 11b). Pores with diameters exceeding 15 μm account for 71.62% in S1, whereas the mean pore diameter is only 14.4 μm in S2 (Fig. 2d).

#### 4.4 Quantitative description of CO<sub>2</sub> sweep efficiency

Image processing techniques are applied to the simulation results to extract swept areas and unexploited areas of CO<sub>2</sub> miscible flooding, quantitatively describing the CO<sub>2</sub> sweep efficiency. Firstly, the flow channels are identified and pore spaces are extracted based on the CO<sub>2</sub> mass fraction distribution through image segmentation technology (Fig. 12a).

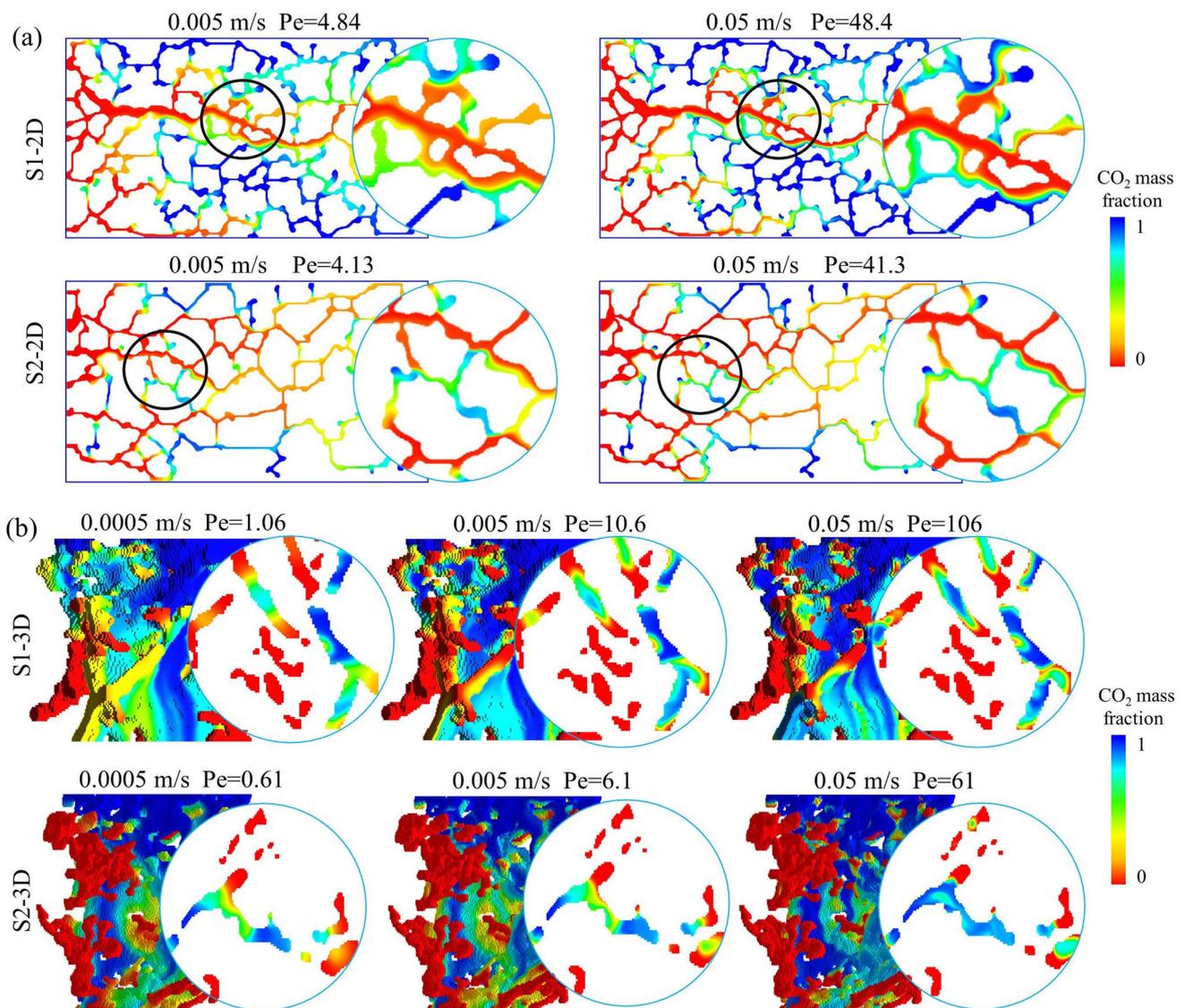


**Fig. 10** Effect of CO<sub>2</sub> injection rates on outlet mass flow. **a** S1 and **b** S2 of 3D porous media; **c** S1 and **d** S2 of 2D porous media

To identify the CO<sub>2</sub> sweep area, the RGB images of the CO<sub>2</sub> mass fraction are converted to grayscale images through the blue channel. The grayscale values are negatively correlated with the CO<sub>2</sub> mass fraction, so gray and black regions with varying grayscale values in the images represent the CO<sub>2</sub> sweep areas. Combined with threshold segmentation, the CO<sub>2</sub> sweep areas are marked based on the gray value distribution (Fig. 12b). Then, the distribution of unexploited pores is obtained by subtracting the CO<sub>2</sub> sweep area from the total pore-throat channels using arithmetic expressions. Finally, the watershed algorithm is applied to segment and identify the pore-throat structures (Fig. 12). The segmented pores are distinguished using different colors, enabling a quantitative analysis of the distribution of unexploited pores. For 3D porous media, a circular function is used to automatically extract 100 evenly spaced slices of the CO<sub>2</sub> mass fraction images along the  $z$  direction. The CO<sub>2</sub> mass fraction images are also converted into grayscale images with equivalent physical size. In this way, threshold segmentation

is performed to obtain 3D CO<sub>2</sub> sweep areas and the distribution characteristics of unexploited pores.

Figure 13 presents the distribution characteristics of unexploited pores, with residual oil in different pores distinguished by various colors in 2D porous media. Due to the convective effect, the oil in the pores near the inlet and within fractures is completely displaced. The bulk CO<sub>2</sub> gradually dissolves into the matrix pores along the fractures due to the diffusion effect. In 2D porous media, low injection rates enhance diffusion effects, leading to widespread CO<sub>2</sub> sweep areas. Conversely, high injection rates result in strong convective effects, making the diffusion of CO<sub>2</sub> into matrix pores along fractures less pronounced, and oil in rough pore surfaces and blind-end pores is not effectively mobilized (Fig. 13). The absence of developed fracture structures in S2 suppresses CO<sub>2</sub> channeling, significantly enhancing the CO<sub>2</sub> sweep efficiency (Fig. 13). In 3D porous media, the displacement efficiency at the injection velocity of 0.005 m/s is the worst. Both decreasing and increasing the injection rates

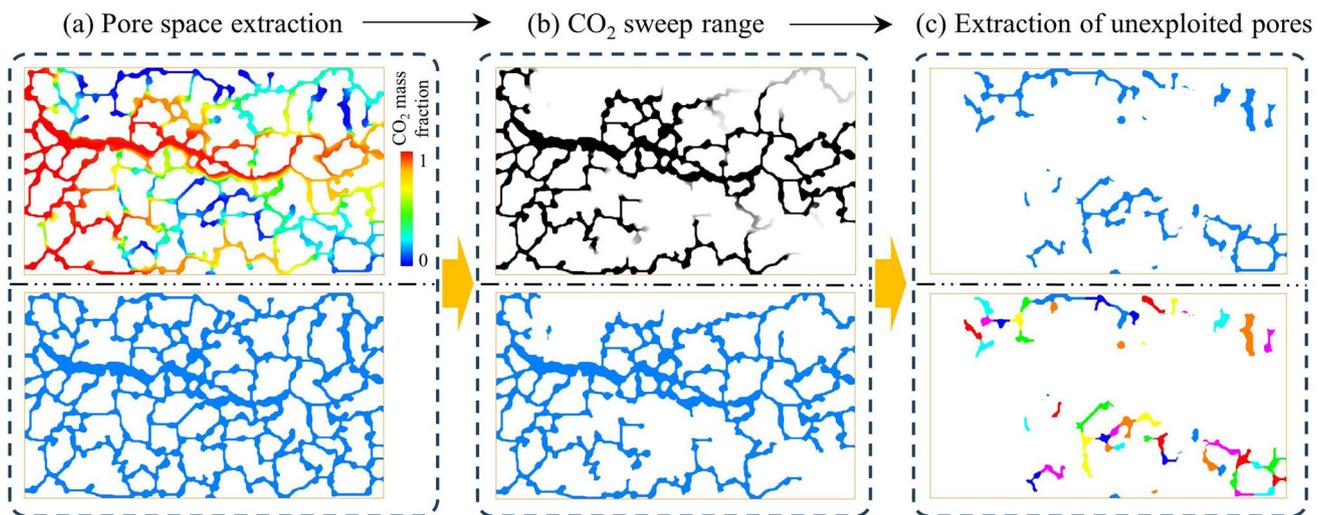


**Fig. 11** Distribution of CO<sub>2</sub> mass fraction in **a** 2D and **b** 3D porous media after injecting 1 PV of CO<sub>2</sub>

improve the displacement efficiency (Fig. 13c and d). At low flow rates, strong diffusion effectively mobilizes the oil in blind-end pores, while increasing injection rates enhances convection effects, expands the sweep area, and significantly improves recovery.

The distribution characteristics of unexploited pores are obtained under different injection rates (Fig. 14). In 2D porous media of S1, the unexploited pores exhibit an approximately unimodal distribution at low injection rates, with pore diameters mainly concentrated in the range of 6–12  $\mu\text{m}$ , accounting for 66.6% of the total (Fig. 14). In contrast, the unexploited pores display a distinct bimodal distribution at high injection rates, with pore diameters distributed in the ranges of 0–4  $\mu\text{m}$  and 8–14  $\mu\text{m}$ , making up 36.0% and 44.2%, respectively. This indicates that

strong diffusion effects significantly mobilize the oil in small pores at low injection rates, but the displacement efficiency is poor in large pore bodies due to the limited diffusion rate. On the contrary, the oil in large pores is effectively displaced due to strong convection effects at high injection rates, but the oil in small pores is less mobilized. Similarly, the unexploited pores exhibit a unimodal distribution at low injection rates in model S2, with 72.1% of unexploited pores distributed in the 6–12  $\mu\text{m}$  diameter range (Fig. 14). At high injection rates, the unexploited pores shift to a bimodal distribution. Due to convection effects, the proportion of unexploited pores in the 6–12  $\mu\text{m}$  diameter range decreases to 48.3%, while the proportion of unexploited pores in the 0–6  $\mu\text{m}$  diameter range increases to 48.4%.



**Fig. 12** Quantitative description of the CO<sub>2</sub> sweep efficiency. **a** Extraction of pore-throat channels; **b** Identification of CO<sub>2</sub> sweep areas by image transformation; **c** Analysis of unexploited pores

The effect of injection rate on the distribution of unexploited pores is consistent in 2D and 3D porous media. At high injection rates, oil in large pores is effectively mobilized in 3D porous media, and the diameter of unexploited pores exhibits a distinct unimodal distribution (Fig. 14d). At low injection rates, the proportion of unexploited pores with small diameters significantly decreases. The unexploited pores exhibit a distinct bimodal distribution in model S1, with pore diameters primarily distributed in 0–5 μm and 10–15 μm. Due to the smaller pore size in model S2, the unexploited pores display a unimodal distribution at low injection rates, with the diameter of unexploited pores increasing as the injection rate decreases.

## 5 Discussion of CO<sub>2</sub> sequestration

### 5.1 Assessment of CO<sub>2</sub> sequestration capacity

Dissolution and mineralization storage are typically considered to be the permanent CO<sub>2</sub> capture and sequestration mechanisms. During the CO<sub>2</sub> miscible displacement process, a portion of the CO<sub>2</sub> dissolves into the crude oil and is expelled from the outlet, while the remaining CO<sub>2</sub> is trapped within complex pore structures. In pore spaces with higher mobility, CO<sub>2</sub> may be gradually expelled over time. CO<sub>2</sub> trapping primarily results from its dissolution into fluids that become immobilized in inaccessible pore spaces. Therefore, the CO<sub>2</sub> mass fraction within the pore system is insufficient for assessing sequestration capacity. An enhanced evaluation method for carbon sequestration is proposed, which incorporates the velocity distribution. The velocity values within porous structures are normalized, and

the sequestration factor ( $S$ ) is then computed as the ratio of CO<sub>2</sub> mass fraction ( $\varphi_{\text{CO}_2}$ ) to the normalized velocity:

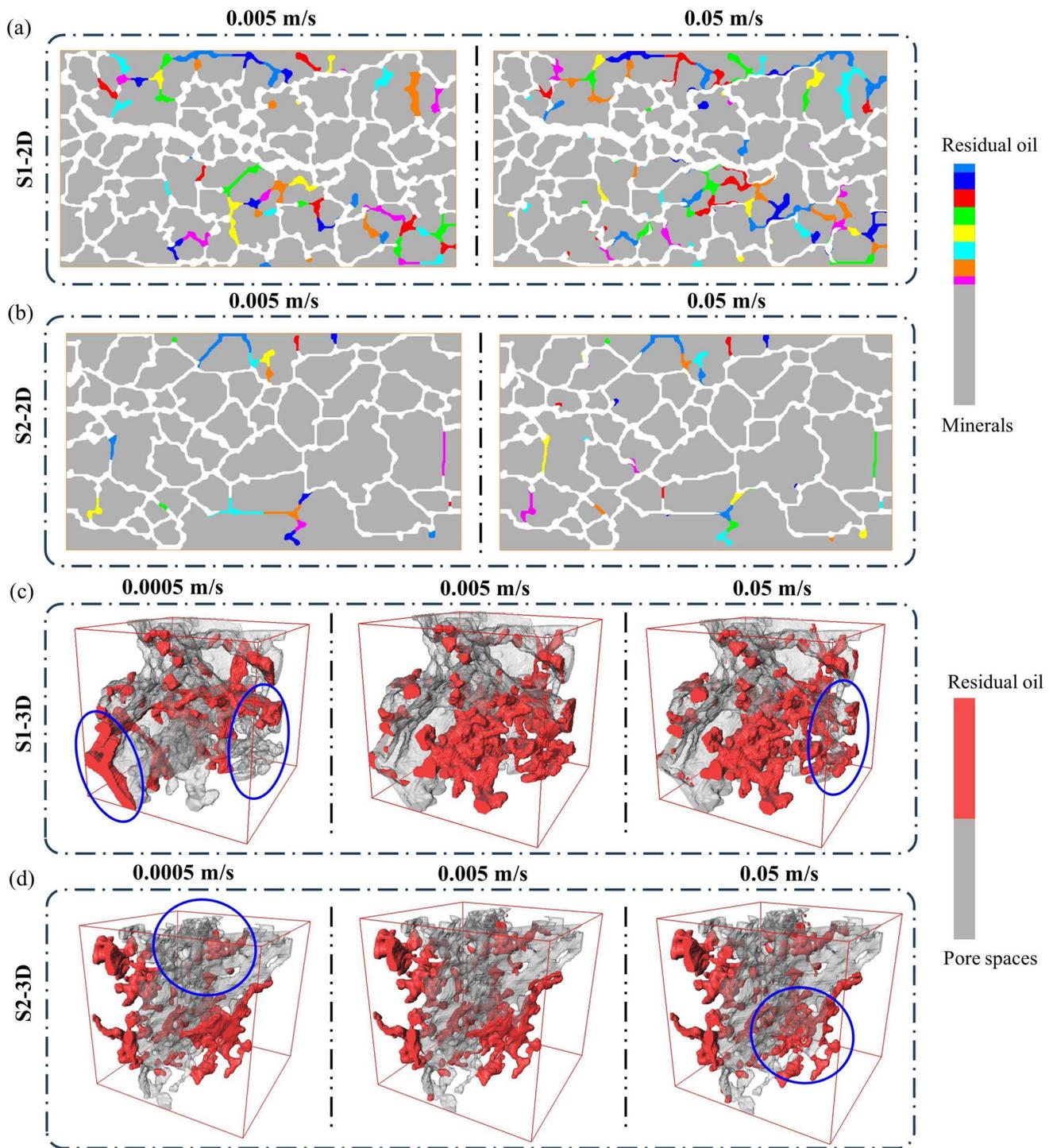
$$S = \frac{\varphi_{\text{CO}_2} \cdot u_{\text{max}}}{u} \quad (15)$$

where  $u_{\text{max}}$  is the maximum velocity and  $u$  is the velocity value of the grid node in porous media. A larger sequestration factor indicates a higher CO<sub>2</sub> concentration and reduced fluid mobility in pore spaces, which is favorable for long-term sequestration.

Figure 15 illustrates the CO<sub>2</sub> sequestration characteristics of model S1 at a flow rate of 0.001 m/s. CO<sub>2</sub> concentration is high within fractures, yet the flow exhibits greater mobility, resulting in a weaker sequestration capacity. Additionally, regions with lower CO<sub>2</sub> concentration and slower velocity demonstrate a reduced sequestration potential. However, regions where CO<sub>2</sub> concentration is high but fluid mobility is lower exhibit enhanced sequestration capacity. These areas are typically associated with poor connectivity.

### 5.2 Effect of injection rate on CO<sub>2</sub> sequestration

The average sequestration factor in porous media is calculated to analyze the impact of injection rate on sequestration (Fig. 16). At the same injection rate, the CO<sub>2</sub> concentration in the porous media rises as the CO<sub>2</sub> injection volume increases, leading to enhanced sequestration capacity. At the early stage of CO<sub>2</sub> injection, the sequestration factor increases slowly, followed by an accelerated growth rate. This suggests that CO<sub>2</sub> primarily occupies high-velocity channels due to convective effects. After breakthrough, CO<sub>2</sub> gradually diffuses into regions favorable for sequestration.

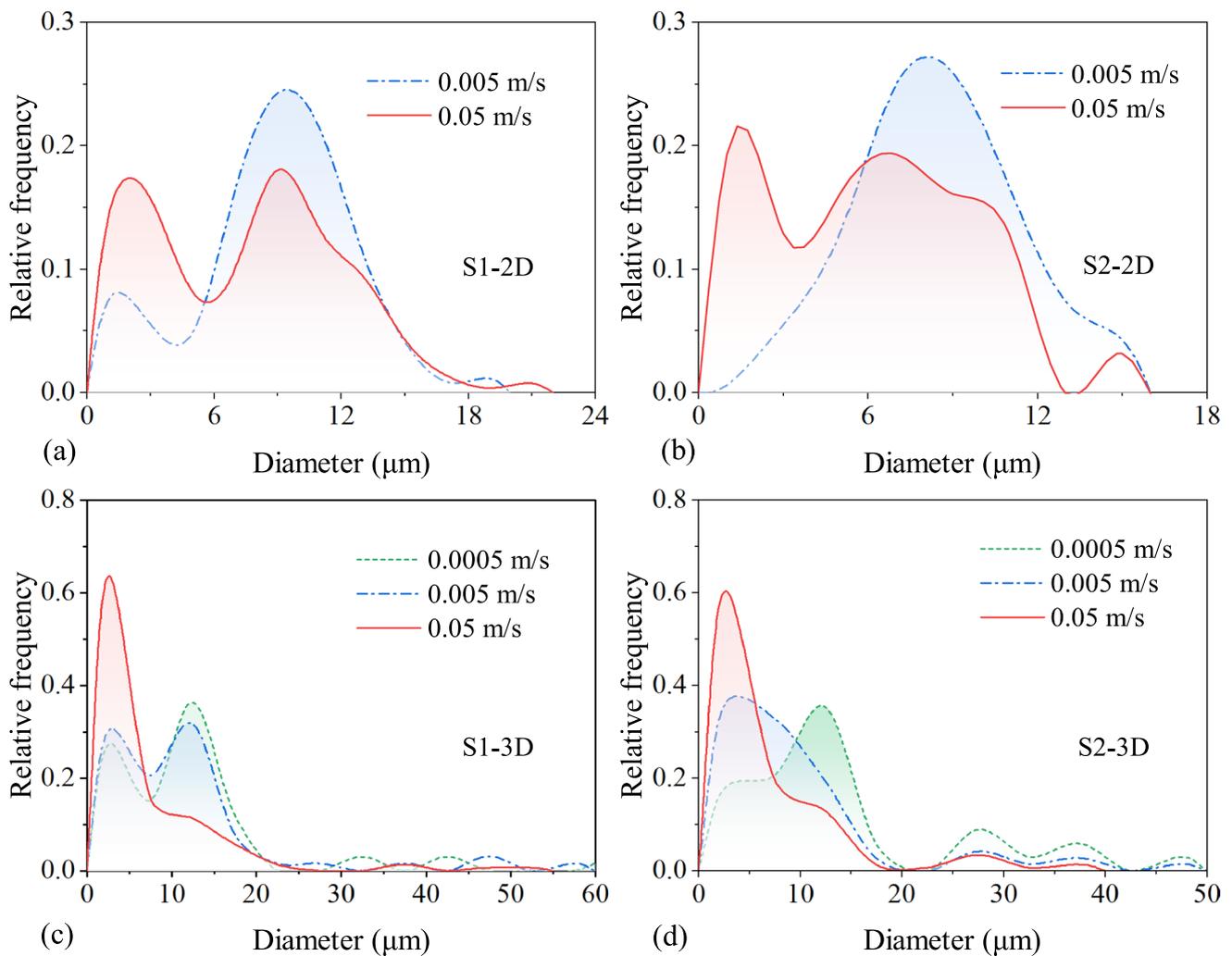


**Fig. 13** Distribution characteristics of unexploited pores. Distribution of unexploited pores in 2D porous media of **a** S1 and **b** S2. Distribution of unexploited pores in 3D porous media of **c** S1 and **d** S2

In addition, the sequestration factor exhibits a fluctuating increase in 2D porous media (Fig. 16). This behavior is attributed to the complex pore-throat structures, where CO<sub>2</sub> breaks through multiple flow channels during the displacement process, causing a reduction in sequestration capacity.

In contrast, the 3D pore structure model, which is relatively simpler with larger pore throat sizes, shows a steady increase in sequestration capacity as CO<sub>2</sub> is injected (Fig. 16).

The injection rate has a significant impact on sequestration capacity. It is observed that as the injection rate



**Fig. 14** The relative frequency of unexploited pores as a function of pore diameter. Unexploited pore size distribution of **a** S1 and **b** S2 in 2D porous media, and unexploited pore size distribution of **c** S1 and **d** S2 in 3D porous media

increases, the  $\text{CO}_2$  sequestration capacity decreases in 2D and 3D porous media. Although a higher injection rate in the 3D porous media results in an increased  $\text{CO}_2$  mass fraction, the rapid flow rate limits the diffusion of  $\text{CO}_2$  into the small diameter and blind-end pores within a short period (Fig. 14). These small diameter and poorly connected pores represent favorable regions for  $\text{CO}_2$  sequestration. Therefore, a lower injection rate promotes the thorough diffusion of  $\text{CO}_2$ , enabling it to dissolve and be effectively trapped within these poorly connected pores.

Combining the simulation results, the  $\text{CO}_2$  miscible displacement process can be optimized to improve the displacement and storage efficiency. A higher injection rate helps  $\text{CO}_2$  occupy large-sized pores and fracture structures, effectively displacing oil in large pore bodies. According to the simulation results of 3D porous media, the convection effect is significant when the injection velocity is greater

than 0.005 m/s. To improve oil recovery from heterogeneous and blind-end pores, extended shut-in periods are necessary to enhance the diffusion effects. This facilitates the full dissolution of  $\text{CO}_2$ , reducing the viscosity and density of the crude oil, and enhancing the sweep efficiency. Additionally, the injected  $\text{CO}_2$  is thoroughly dissolved and trapped within the complex pore networks and blind-end pores, improving the sequestration efficiency.

## 6 Conclusions

This work develops a pore-scale numerical model for  $\text{CO}_2$ -oil miscible flow. The convection and diffusion mechanisms in complex pore topology are comprehensively analyzed from 2 and 3D perspectives. To optimize  $\text{CO}_2$  injection strategies, the  $\text{CO}_2$  sweep efficiency and sequestration

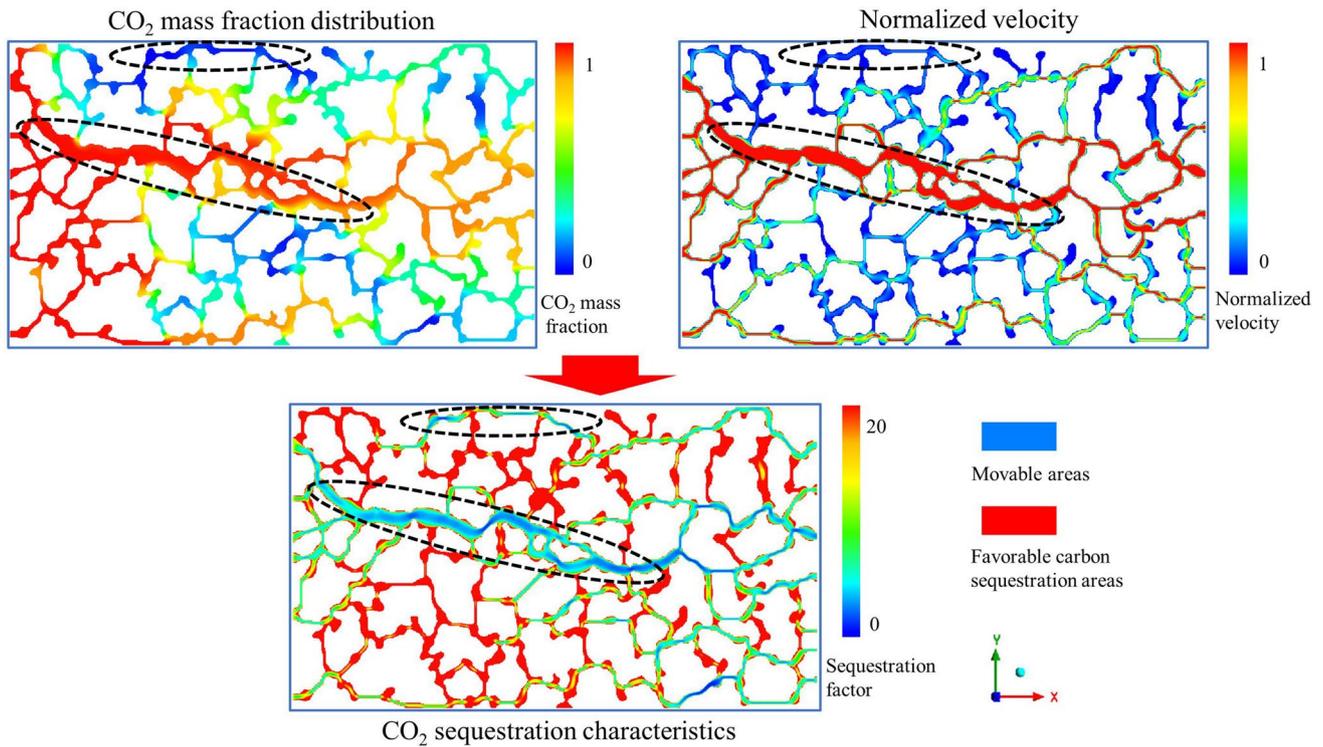


Fig. 15 Evaluation of CO<sub>2</sub> sequestration capacity in complex porous media

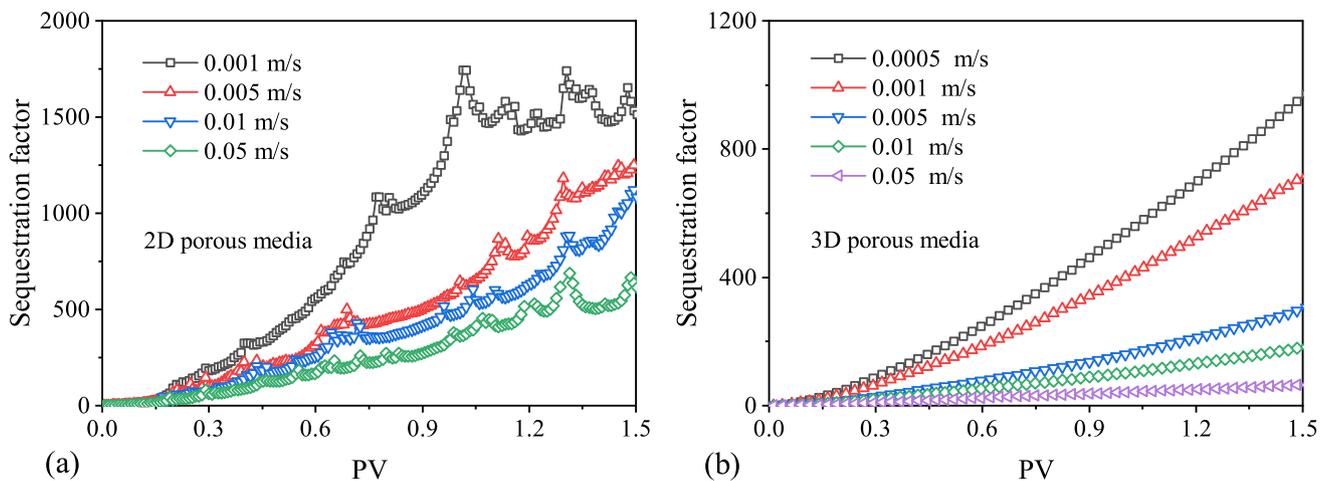


Fig. 16 Sequestration characteristics under different CO<sub>2</sub> injection velocities. **a** 2D porous media; **b** 3D porous media

capacity in complex porous media are evaluated under different injection rates and pore structure properties. The following conclusions are drawn:

- (1) Convection dominates displacement before the CO<sub>2</sub> breakthrough, followed by the diffusion of CO<sub>2</sub> from the fractures into the matrix pores. Convection significantly increases the CO<sub>2</sub> mass fraction in fractures with high flow rates, while the CO<sub>2</sub> mass fraction increases

slowly in the matrix pores due to diffusion effects. Injected CO<sub>2</sub> reduces fluid pressure, and the injection pressure decreases during CO<sub>2</sub> miscible flooding. The oil recovery increases linearly before the breakthrough, and the increasing rate gradually slows down due to diffusion effects.

- (2) The relationship between injection rate and oil recovery differs in 2D and 3D porous media, but the pore mobilization mechanisms are consistent. In 2D porous media,

the injection rate is negatively correlated with oil recovery. In 3D porous media, as the injection rate increases, the oil recovery first decreases and then increases, with the critical velocity being approximately 0.005 m/s. Diffusion effects significantly mobilize oil in small pores at low injection rates, while convection effects predominantly mobilize oil in large pore bodies at high injection rates.

- (3) The CO<sub>2</sub> sequestration capacity is evaluated. Diffusion is an important microscopic mechanism for CO<sub>2</sub> sequestration. The injection rate is negatively correlated with the sequestration factor. At low injection rates, CO<sub>2</sub> diffuses into heterogeneous and blind-end pores. The regions with low velocity distribution are favorable areas for CO<sub>2</sub> storage. However, fractures with high velocity are not conducive to long-term storage of CO<sub>2</sub>.

**Acknowledgements** This work was supported by National Natural Science Foundation of China (42172159, 52404048), China Postdoctoral Science Foundation (2023M743870), Postdoctoral Fellowship Program of CPSF (GZB20230864), and Frontier Interdisciplinary Exploration Research Program of China University of Petroleum, Beijing (2462024XKQY002).

**Author contributions** Xiangjie Qin: Methodology, software, supervision, validation, writing. Han Wang: Methodology, software, supervision. Jinsui Wu: Software, methodology, conceptualization. Gang Wang: Formal analysis, review and editing. David A. Wood: Supervision, validation, writing. Jianchao Cai: Methodology, funding acquisition, review and editing.

## Declarations

**Conflict of interest** The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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