SCIENTIFIC REPORTS

natureresearch

Received: 24 April 2019 Accepted: 24 September 2019 Published online: 09 October 2019

OPEN A Novel Analytical Model for Pore **Volume Compressibility of Fractal Porous Media**

Gang Lei¹, Nai Cao², Brian J. McPherson³, Qinzhuo Liao¹ & Weiging Chen¹

Over the past decades, many scholars have been studying the pore volume compressibility (PVC) of porous media. However, the fundamental controls on PVC of porous media are not yet definitive. Some scholars suggest a negative correlation between PVC and initial porosity, while others suggest a positive correlation. Motivated by this discrepancy, this paper presents a new analytical model to study the PVC of fractal porous media. The predictions are compared with test results and thereby validated to be accurate. In our attempt not only to complement but also to extend the capability beyond available models, the derived model accounts for multiple fundamental variables, such as the microstructural parameters and rock lithology of porous media. Results suggest that, there is a negative correlation between PVC and initial porosity, if all other parameters are fixed, the relationship between initial porosity and PVC is not monotonic. In addition, PVC decreases with rougher pore surfaces and smaller initial minimum pore radius. Besides providing theoretical foundations for quantifying PVC of porous media, this analytical model could be applied to estimate pore structure parameters of porous media using inverse modeling.

Pore volume compressibility (PVC) of porous media is a key parameter for characterizing coupled fluid transport and stress in reservoir rock¹⁻⁸. PVC is of particular interest to the petroleum industry, especially for elastic energy evaluation, design, drilling and completion of wells, production forecasts, and material balance studies^{2,9–13}. The earthquake seismology community also relies on PVC assessments for analysis of induced seismicity potential14,15.

For a porous media with pore volume V_p , the PVC of porous media c_p may be determined as^{13–20}:

$$c_p = \frac{1}{V_p} \frac{\partial V_p}{\partial p_p} = -\frac{1}{V_p} \frac{\partial V_p}{\partial p_{eff}}$$
(1)

where c_p represents the pore volume compressibility (MPa⁻¹), V_p represents the pore volume (cm³), p_p represents the pore pressure (MPa), and p_{eff} represents the effective stress (MPa).

In general, there are three traditional approaches to evaluate PVC including laboratory tests¹⁶⁻²⁶, numerical methods^{27,28}, and theory-based evaluation methods^{20,29-32}. Probably the most common method is laboratory experimental testing, which may be classified into direct measurement methods and indirect measurement methods. In the specific content of the research described in this paper, relevant laboratory test methods, together with their characteristics, are summarized in Table 1.

The volume methods^{20-23,33,34} are probably the most commonly used measurement techniques to determine PVC. However, as stated in the literature^{6,13,33,34}, during the experiments, the systematic errors resulting from deformation of pressurized parts (such as micro interstice between the sample and the sleeve in the core holder, core holder itself, connection pipes, etc.) exist and will affect the results. For example, according to some researchers⁶, the permeability difference between the first and second measurements in confining pressure loading-unloading processes varied much. Tarokh A.³⁴ and Asaei H.³³ also pointed out that the necessity of system calibration during the undrained and drained volumetric measurement tests. Specifically, the changes in loading/unloading process of confining pressure and pore pressure/effective stress during the tests lead to the

¹King Fahd University of Petroleum & Minerals, College of Petroleum Engineering & Geosciences, Dhahran, 31261, Saudi Arabia. ²China University of Petroleum, College of Petroleum Engineering, Beijing, 102249, China. ³University of Utah, Energy & Geoscience Institute, Salt Lake City, 84108, United States. Correspondence and requests for materials should be addressed to W.C. (email: jerromy@kfupm.edu.sa)

Experiment models		Characteristics of the models				
Direct measurement methods	Volume ^{20-23,33,34}	1. It's a direct and simple measurement method. 2. The test is time-consuming, costly and may generate biased results without a systematic calibration.				
	Mercury intrusion ¹⁹	1. There is no micro interstice in the test process. 2. In combination with the $\rm N_2$ adsorption results and the mercury intrusion volumes, the compression of the matrix can be determined accurately.				
Indirect measurement methods	Sonic velocity ²⁴	It can be used to predict PVC under reservoir conditions.				
	Permeability test ^{25,26}	It can quantify the uncertainty.				
Notes: Both direct measurement methods and indirect measurement methods are costly and time-consuming.						

Table 1. Laboratory experiment methods for pore volume compressibility.

.....

change in the shape of the testing system (sleeve, core holder, pipe and other accessories) which make an extra change of volume especially for the jacketed drained tests. Physically speaking, this fluid volume change may cause a negative effect on the PVC of the porous media determination and increase the value of PVC. Although some researchers^{6,33,34} suggested using the systematic calibration tests to reduce this measurement error, the tests may make the volumetric measurement test process more time-consuming and costly. Thus, the test results of the volumetric method are usually costly and sometimes over-estimated especially without proper systematic calibrations. Nevertheless, it is worth noting that the repetitive stress treatment will also lead to changes in the pore structure of porous media. As an alternative direct measurement method, mercury intrusion method¹⁹ can be used to measure the PVC of porous media accurately, which eliminates the effects of micro interstice by avoiding using core holder. It is generally believed that, during the mercury intrusion porosimetry (MIP) measurements, one can easily observe the compression of samples as mercury intrusion pressure increases. The compression volume of porous media is the difference between the change of the mercury volume and the change of the pore filling volume (i.e., $\Delta V_{compression} = \Delta V_{mercury} - \Delta V_{pore-filling}$). Guo *et al.*¹⁹ conducted MIP tests on cylindrical coal samples with the diameter of 25 mm and the length of 50 mm, which were extracted from the middle of the coal blocks. And they crushed remaining blocks for N2 adsorption analyses. Results from MIP tests¹⁹ suggested there existed a linear relation between the mercury volume and intrusion pressure change when the pressure ranged from 7.35 MPa to 32.2 MPa (i.e., the ratio of $\Delta V_{mercury}$ and Δp is a constant). Then, after determining the value of $\Delta V_{pore-filling}$ with N₂ adsorption analysis, they estimated the value of $\Delta V_{mercury}/\Delta p$. Finally, the PVC of the coal matrix was determined by dividing $\Delta V_{mercury}/\Delta p$ by the matrix volume ΔV_m . Besides the direct measurement methods¹⁹⁻²³, many indirect measurement methods (e.g., sonic velocity method²⁴ and permeability test method^{25,26}) have been used for PVC determination. More details about the sonic velocity method and permeability test method can be found in the literature^{24–26}.

By and large, the experiments are costly, and the test results are usually affected by experimental error. Due to the discrepancies in physical properties of core samples and experimental methods, there are many inconsistencies in the tests' results. As an alternative, some effective numerical methods have been proposed to simulate fluid flow in reservoir rocks, and coupling PVC is important for such^{27,28}. However, numerical methods demand computationally-intensive calculations and typically predicted results are subject to significant uncertainties, especially as the ones induced by numerical dispersion²⁹, as well as other similar constraints^{29,30}. Theoretical methods for assessment of PVC may be classified into empirical models^{20,21,31,32}, analytic models^{2,13} and other complex models³⁵⁻³⁷. Hall²¹, Horn³¹ and Jalalh³² used empirical correlations to predict PVC. Based on matching experimental data of 12 samples (i.e., 5 sandstones and 7 limestones) with the porosity ranging from 2% to 26%, Hall²¹ derived the empirical correlation of PVC. As one of the earliest and primary formula, Hall's correlation has been widely used in petroleum engineering. Newman²⁰ compared the PVC data of 256 samples with porosity ranging from 1% to 35% (e.g., 197 sandstone samples and 59 limestone samples) with that from Hall's correlation and found PVC predicted from Hall's correlation was in poor agreement with the experimental data. Newman²⁰ stated that PVC of various types of rocks with a certain porosity varied widely. In addition, Jalalh³² suggested that Hall's correlation should be used with caution. Horn³¹ proposed the correlation of PVC for consolidated carbonates. However, the predicted results from Horn's model were PVC of porous media with different lithologies under 75% of the lithostatic pressure. To avoid using the compilation published dataset (e.g., initial porosity and PVC) of rocks with various lithologies, Jalalh³² proposed a correlation for PVC prediction of carbonate rocks. Although the above correlations²¹⁻²³ to some extent, can be applied to predict PVC of porous media, these correlations contain empirical parameters, which have no clear physical meaning and vary with reservoirs. Recently, Li et al.^{2,13} proposed an analytical model based on porosity and rock lithology parameters to calculate the PVC of the reservoir rock. Besides the empirical models and analytic models, some scholars also calculated the PVC using other complex models. Khatchikian³⁵ analyzed the PVC of core samples using the Gassman equation, in which parameters were evaluated via geophysical log analysis. Poston and Chen³⁶ and Yildiz³⁷ analyzed rock compressibility with material balance and production data.

All of the above studies convince us that, limited by the complex pore structure, relevant theoretical methods for predicting PVC are very scarce. What's more, some research results from different theoretical models are inconsistent with each other. For example, the PVC predicted by Li's model is quite different from the values determined by the correlation proposed by Hall²¹. Specifically, Li's model suggested that the larger the porosity is, the larger that PVC will be, which is a contrast to the conclusion from other studies^{6,21,32} that indicated a greater PVC corresponds to a reduced porosity. Additionally, Li *et al.*^{2,13} stated that the positive correlation between PVC and initial porosity was validated by the experiments conducted by de Oliveira *et al.*¹⁸ and Guo *et al.*¹⁹. However, after careful examination, we find that the results from de Oliveira *et al.*¹⁸ cannot validate Li's model. The main

reason is that the curve of PVC versus porosity was plotted at different pressure stages for each core, hence the results are not the same as those from Li *et al.*^{2,13}. Furthermore, results from Guo *et al.*¹⁹ suggest that the PVC of porous media is affected by several factors, such as the initial porosity, moisture content, and macerals, etc. Though Guo *et al.*¹⁹ found the PVC of medium-volatile bituminous (mvb) and low-volatile bituminou (lvb) coals exhibited a positive correlation to initial porosity, they also found there was no correlation between the PVC and porosity for the high-volatile A bituminous (hvAb) coals. Moreover, Li's model was based on the assumption that porosity is constant during deformation, which is questionable. In most cases, PVC is not just related to porosity, but also affected by other pore structure parameters^{29,30,38}. To the best of our knowledge, previous researches did not relate the full complement of pore structure parameters to PVC, and the fundamental controls on PVC are not yet definitive.

As stated in the literatures, the interspaces in most of porous media have fractal characteristics^{39–45}. Since Mandelbrot firstly introduced the concept of the fractal to describe self-similarity of fractal objects³⁹, many studies have been conducted to study the fractal feature of porous media^{40–45}. Many scholars have found and suggested that fractal geometry could be applied to well characterize the complex porous structure of porous media. As a result, we take the microstructure of porous media into account and derive an analytical solution to predict PVC, based on fractal theory. Compared with the previous studies, this new model doesn't contain empirical constants. Furthermore, it can help to reduce the uncertainty in flow through porous media and obtain data with high accuracy. As the outline of this work, the analytical model for PVC is provided in the following section. Then, the results are analyzed, followed by the discussions of the derived model. Finally, the conclusions are presented.

Methods

Theoretical model for PVC. As suggested by decades of literature, the pore structure of reservoir rocks can be well described and quantified by fractal approach^{39–45}. For the sake of simplicity, the cross-sectional shapes of pores in porous media are described by circles. Meanwhile, besides assuming capillary radius does not change in the direction of flow, Euclidean dimension should be assigned as 2 in this work. Then, with a fractal approach, the equations for pore surface area at zero stress A_{p0} (μ m²) and pore volume before deformation V_{p0} (μ m³) are^{29,44,45}:

$$\begin{cases} A_{p0} = \frac{\pi r_{max}^{D_{f0}} D_{f0}}{2 - D_{f0}} (r_{max \ 0}^{2 - D_{f0}} - r_{min \ 0}^{2 - D_{f0}}) \\ V_{p0} = \frac{4\pi r_{max}^{D_{f0}} D_{f0}}{3(3 - D_{f0})} (r_{max \ 0}^{3 - D_{f0}} - r_{min \ 0}^{3 - D_{f0}}) \end{cases}$$
(2)

where r_{max0} represents the initial maximum pore radius (µm), D_{f0} is the initial pore fractal dimension (dimensionless), r_{min0} represents the initial minimum pore radius (µm). The correlation of D_{f0} and the initial porosity φ_0 (dimensionless) can be expressed as^{27,43}:

$$\varphi_0 = (r_{\min 0}/r_{\max 0})^{2-D_{f_0}} \tag{3}$$

Affected by effective stress, the pore structure of porous media will change, and Eq. 2 may be rewritten as^{29,43}:

$$\begin{cases} A_p = \frac{\pi r_{max}^{D_f} D_f}{2 - D_f} (r_{max}^{2 - D_f} - r_{min}^{2 - D_f}) \\ V_p = \frac{4\pi r_{max}^{D_f} D_f}{3(3 - D_f)} (r_{max}^{3 - D_f} - r_{min}^{3 - D_f}) \end{cases}$$
(4)

where A_p represents the pore surface area (μ m²), V_p represents the pore volume (μ m³), r_{max} represents the maximum pore radius (μ m), D_f is the fractal dimension of pore after deformation (dimensionless), r_{min} represents the minimum pore radius (μ m).

Assume that the specific surface area of porous media remains constant as effective stress increases, the following expression can be obtained as^{29,46,47}:

$$\frac{A_{p0}}{V_{p0}} = \frac{3(3 - D_{f0})}{4(2 - D_{f0})} \frac{(r_{max0}^{2 - D_{f0}} - r_{min0}^{2 - D_{f0}})}{(r_{max0}^{3 - D_{f0}} - r_{min0}^{3 - D_{f0}})} = \frac{A_p}{V_p} = \frac{3(3 - D_f)}{4(2 - D_f)} \frac{(r_{max}^{2 - D_f} - r_{min}^{2 - D_f})}{(r_{max}^{3 - D_f} - r_{min}^{3 - D_f})}$$
(5)

By solving Eq. 5 for D_{f} the stress-dependent fractal dimension may be written as^{29,47}:

$$D_f = 2 - \frac{\left(2 - D_{f0}\right)r_{max0}}{\left(3 - D_{f0}\right)r_{max} - \left(2 - D_{f0}\right)r_{max0}}$$
(6)

Combining Eqs 3 and 6, the stress-dependent porosity φ (dimensionless) is:

$$\varphi = (r_{min}/r_{max})^{\frac{(2-D_f_0)r_{max0}}{(3-D_f_0)r_{max}-(2-D_f_0)r_{max0}}}$$
(7)

As discussed in a previous study²⁹, the relationship between the stress-dependent equivalent pore radius r (µm) and effective stress p_{eff} is:

$$r = r_0 \left\{ 1 - 4 \left[\frac{3\pi (1 - \nu^2) p_{eff}}{4E} \right]^3 \right\}$$
(8)

where r_0 is the equivalent radius before deformation (μ m), β is the power law index (dimensionless), *E* represents the rock elastic modulus (GPa), and ν represents the Poisson's ratio (dimensionless).

Based on Eq. 8, the following equation is:

$$\begin{cases} r_{max} = r_{max0} \left\{ 1 - 4 \left[\frac{3\pi (1 - v^2) p_{eff}}{4E} \right]^{\beta} \right\} \\ r_{min} = r_{min0} \left\{ 1 - 4 \left[\frac{3\pi (1 - v^2) p_{eff}}{4E} \right]^{\beta} \right\} \end{cases}$$
(9)

Substituting Eq. 9 into Eq. 7, the stress-dependent porosity φ may be rewritten as:

$$\varphi = (r_{min0}/r_{max0})^{\frac{(2-D_{f0})r_{max0}}{(3-D_{f0})r_{max}-(2-D_{f0})r_{max0}}}$$
(10)

Based on Eq. 1, the PVC c_p may be defined as¹³:

$$c_p = -\frac{1}{V_p} \frac{\partial V_p}{\partial p_{eff}} = -\frac{1}{\varphi} \frac{\partial \varphi}{\partial p_{eff}}$$
(11)

Subsequently, the porosity correlation may be obtained through the integration of Eq. 11^{20,32,38} as follows:

$$\varphi = \varphi_0 e^{-c_p p_{eff}} \tag{12}$$

Combining Eqs 10 and 12, the resulting expression relating porosity and effective stress is:

$$\ln\left(\frac{\varphi_{0}}{\varphi}\right) = \frac{(r_{max0} - r_{max})(2 - D_{f0})(3 - D_{f0})}{\left[(3 - D_{f0})r_{max} - (2 - D_{f0})r_{max0}\right]} \ln\left(\frac{r_{max0}}{r_{min0}}\right) = c_{p}p_{eff}$$
(13)

This relationship between $\ln(\varphi_0/\varphi)$ and p_{eff} is linear, and the slope of the straight line represents PVC. By plotting the curve of $\ln(\varphi_0/\varphi)$ and p_{eff} an estimate of PVC of porous media may be estimated with simple linear regression.

Workflow of PVC determination. According to our proposed model, the suggested workflow for PVC determination may be summarized as follows:

Step 1: Based on the initial average porosity φ_0 and initial average permeability K_0 (µm²) of a porous medium, pore structural parameters, such as r_{max0} , r_{min0} , and the initial fractal dimension of pore D_{f0} , may be determined using Eqs 3, 14 and 15 from the literature²⁹,

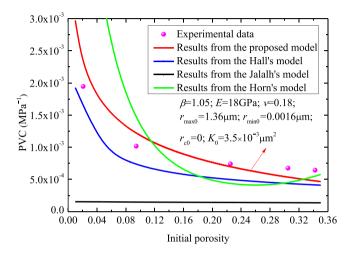
$$K_{0} = \frac{2^{D_{T0}} \pi D_{f0} r_{max0}^{D_{f0}} r_{max0}^{3+D_{T0}-D_{f0}} - r_{c0}^{3+D_{T0}-D_{f0}}}{16A_{0}L_{0}^{D_{T0}-1} \frac{1}{3+D_{T0}} - D_{f0}}$$
(14)

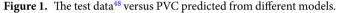
$$\begin{cases} A_{0} = \frac{A_{p0}}{\varphi_{0}} = \frac{\pi r_{max0}^{2} D_{f0}}{2 - D_{f0}} \left(\frac{r_{max0}^{2 - D_{f0}}}{r_{min0}^{2 - D_{f0}}} - 1 \right) \\ L_{0} = \sqrt{A_{0}} = r_{max0} \sqrt{\frac{\pi D_{f0}}{2 - D_{f0}}} \left(\frac{r_{max0}^{2 - D_{f0}}}{r_{min0}^{2 - D_{f0}}} - 1 \right) \\ \\ D_{T0} = 1 + \frac{\ln \left\{ \frac{1}{2} \left[1 + \frac{1}{2} \sqrt{1 - (r_{min0} / r_{max0})^{2 - D_{f0}}} + \frac{\sqrt{\left[1 - \sqrt{1 - (r_{min0} / r_{max0})^{2 - D_{f0}}} \right]^{2 + \frac{1}{4} \left[1 - (r_{min0} / r_{max0})^{2 - D_{f0}}}{1 - \sqrt{1 - (r_{min0} / r_{max0})^{2 - D_{f0}}}} \right] \right]} \\ \end{pmatrix}}{\ln \left[\frac{D_{f0} - 1}{\sqrt{D_{f0}} \sqrt{\frac{1 - \varphi_{0} - \pi}{4\varphi_{0} - 2 - D_{f0}}} \frac{r_{max0}}{r_{min0}}}{r_{min0}} \right] \end{cases}$$
(15)

where A_0 is the initial cross-sectional area of porous media (μ m²). L_0 is the initial capillary representative length (μ m). D_{T0} is the initial tortuosity fractal dimension (dimensionless).

Author	Year	Model correlations for c_p (10 ⁻⁴ MPa ⁻¹)	Characteristics of the models
Hall ²¹	1953	$c_p = 2.587 \varphi_0^{-0.4358}$	
Horne ³¹	1990	$c_p = 1.4504e^{4.026 - 23.07\varphi_0 + 44.28\varphi_0^2}$	1. The empirical relationships are proposed by non-linear regression curve fitting. 2. These models do not take rock lithology into account.
Jalalh ³²	2006	$c_p = \frac{1.4504}{(0.9574 + 0.3539\varphi_0^{1.05})}$	curve niting. 2. These models do not take rock nitiology into account.
Zhu ¹³	2018	$c_p = 0.3(1 - 2\nu)\varphi_0/E$	1. It takes rock lithology into account. 2. It shows a positive correlation between PVC and φ_0 which is against the results of other models.







Step 2: Select parameters *E*, *v*, and the values of effective stress p_{eff} , and then calculate the parameters r_{max0} and r_{min0} using Eq. 9. Then, the stress-dependent porosity φ may be determined with Eq. 10;

Step 3: Based on Eq. 13 and its plot, the PVC c_p may be estimated using linear regression.

Results

Model validation. As previously discussed, reports using analytical methods to study PVC are scarce⁴⁸. Some typical correlations for PVC, together with their characteristics, are summarized in Table 2.

Figure 1 compares the measured PVC⁴⁸ and that predicted by our derived model and other models in Table 2 (e.g. Hall's model²¹, Horne's model³¹ and Jalalh's model³²). In the experiment of da Silva Jr G.P. *et al.*⁴⁸, the PVC tests were conducted on clean and dry rock samples with K_0 of $3.5 \times 10^{-3} \mu m^2$ and φ_0 of 18.8%. In our proposed model, the parameter *E* assigned was 18 GPa, ν assigned was 0.18 and β assigned was 1.05. Besides, to ensure the parameter K_0 is $3.5 \times 10^{-3} \mu m^2$, the critical radius for irreducible water saturation assigned is 0, the initial porosity 18.8%, with the values of initial maximum and minimum radii at $1.36 \mu m$ and $0.0016 \mu m$, respectively. Figure 1 reveals that the predicted PVC of our derived model is consistent with that determined by experimental data⁴⁸, and our predictions are more consistent with experimental data than those predicted by previous models.

Figures 2 and 3 compares the PVC values predicted by the derived model with test data²⁴. In the experiment of He *et al.*²⁴, the PVC tests were carried out on six rock samples with a permeability test method and a triaxial stress method. The parameters applied in the calculations are summarized in Table 3. Since the relative error is less than 6.0%, results (Figs 2 and 3) show that the predicted results of our model are in agreement with the corresponding test data²⁴. Results (see Fig. 2) also demonstrate that the PVC is not only related to φ_0 , but also is affected by other pore structure parameters. For example, the PVC of Core 1 with an initial porosity 4.4% is less than that of Core 4 with initial porosity 3.5%. However, the PVC of Core 4 with initial porosity 3.5% is larger than that of Core 3 with initial porosity 3.2%. Thus, the effects of pore structure parameters on PVC should probably be considered to elucidate primary controls on it.

Figure 4 presents the comparison between the predictions of PVC and experimental data reported in the work of Guo *et al.*¹⁹. In the experiments¹⁹, PVC tests were conducted on 21 coal samples with an initial maximum pore radius of $0.1 \,\mu\text{m}$. In the calculation, the r_{max0} was assigned as $0.1 \,\mu\text{m}$, the r_{min0} was assigned with $0.001 \,\mu\text{m}$, the *E* was assigned with 52 GPa, and the ν was assigned as 0.25. Results (Fig. 4) suggest that the predictions are consistent with the measured experimental data¹⁹. Additionally, simulated results also indicate that the relationship between initial porosity and PVC is not monotonic, suggesting that PVC is correlated not only to φ_0 , but also to other pore structure parameters.

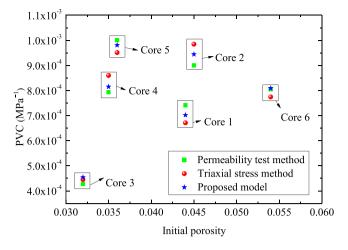


Figure 2. Experimental data²⁴ versus the predictions: the results from different methods.

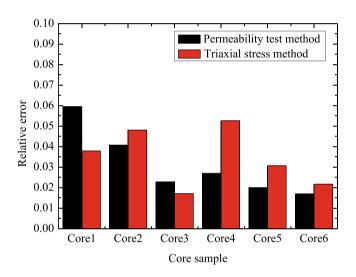


Figure 3. Experimental data²⁴ versus the predictions: the relative error.

Core No.	$r_{min0} (10^{-5} \mu m)$	$r_{max0} (10^{-2} \mu m)$	$K_0 (10^{-6} \mu m^2)$	$arphi_{0}$ (%)	E (GPa)	ν	β
Core 1	2.0	2.35	0.26	4.4	28	0.18	1.109
Core 2	1.7	1.70	0.14	4.5	28	0.18	1.069
Core 3	5.0	2.32	0.18	3.2	28	0.18	1.195
Core 4	3.0	1.80	0.12	3.5	28	0.18	1.105
Core 5	5.0	2.50	0.24	3.6	28	0.18	1.080
Core 6	5.0	3.65	8.0	5.4	28	0.18	1.083

Table 3. Parameters applied in the proposed model.

Parameter influence. Figure 5 presents PVC versus the power law index β . In the calculation, the r_{max0} was 1 µm, the r_{min0} was 0.001 µm, the initial porosity φ_0 assigned was 9%, the rock Poisson's ratio ν assigned was 0.17, and the rock elastic modulus *E* assigned was 40 GPa. Figure 5 shows that PVC monotonically decreases as power law index β increases⁴⁶.

Figure 6 shows the PVC variation with different rock elastic modulus. For the calculations necessary to assemble this plot, the r_{max0} was 1 µm, the r_{min0} was 0.001 µm, the initial porosity φ_0 assigned was 23%, parameter ν was 0.17 and β was 1.3. Figure 6 suggests that the PVC decreases as the parameter *E* increases. The main reason for this is that the larger *E* corresponds to the smaller contact surface radius, which leads to the smaller PVC. As a result, reservoir rocks with relative "softer" lithology can yield higher compressibility¹³.

Figure 7 demonstrates the PVC versus the parameter r_{min0}/r_{max0} . In the calculation, the initial porosity φ_0 assigned was 9%, parameter *E* assigned was 20 GPa, ν assigned was 0.17, and β assigned was 1.3. PVC increases

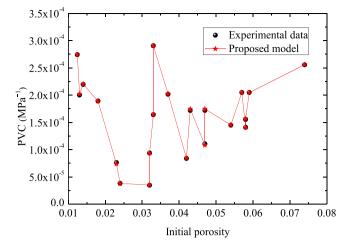


Figure 4. Experimental data¹⁹ versus the predicted results.

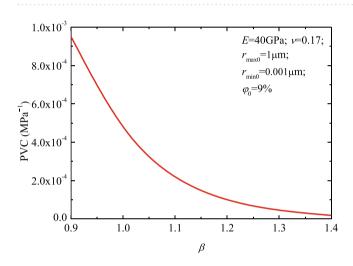


Figure 5. The PVC versus power law index β .

with r_{min0}/r_{max0} (Fig. 7), indicating that smaller pores exhibit lower stress sensitivity than larger pores. Increases of parameter r_{min0}/r_{max0} (increases in the initial minimum radius r_{min0}) lead to increase of PVC.

Discussions

Effect of pore aspect ratio on PVC. It's well known that the real cross-sectional shapes of pores are complex and highly irregular⁹. Zimmerman⁹ suggested that the influence of pore aspect ratio (i.e., the ratio of pore's height to its width) on PVC of porous media was significant, which could not be neglected. As stated in the literature⁹, the PVC of an elliptical tubular pore c_{pe} is

$$c_{pe} = c_{pr} \left(\frac{\alpha}{2} + \frac{1}{2\alpha} \right) \tag{16}$$

where c_{pr} represents the PVC of the circular tubular pore, whose area is the same as that of the elliptical tubular pore (MPa⁻¹), and α is the pore aspect ratio. Equation 16 shows that, when $\alpha = 1$, c_{pe} is equal to c_{pr} , which is expected. Moreover, c_{pe} is impossible less than c_{pr} , which illustrates that, when other properties are the same, an elliptical tubular pore is easier to be compressed than a circular tubular pore.

Based on Eqs 9 and 16, the equivalent pore radius of elliptical tubular pores can be modified as

$$\begin{cases} r_{maxe} = r_{max0} - (r_{max0} - r_{max}) \sqrt{\left(\frac{\alpha_{max}}{2} + \frac{1}{2\alpha_{max}}\right)} \\ r_{mine} = r_{min0} - (r_{min0} - r_{min}) \sqrt{\left(\frac{\alpha_{min}}{2} + \frac{1}{2\alpha_{min}}\right)} \end{cases}$$
(17)

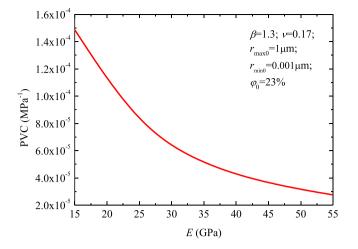


Figure 6. The PVC versus rock elastic modulus.

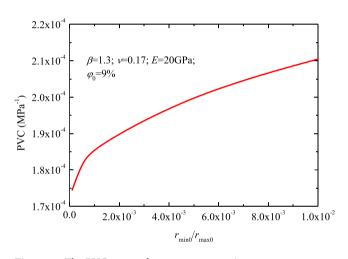


Figure 7. The PVC versus the parameter r_{min0}/r_{max0}

where r_{maxe} represents the equivalent maximum pore radius (µm), r_{mine} represents the equivalent minimum pore radius (µm), α_{max} is the pore aspect ratio of the maximum pore, and α_{min} is the pore aspect ratio of the minimum pore. For the sake of simplicity, the values of pore aspect ratio of each elliptical pore are assumed to be equal. Then, Eq. 17 can be rewritten as

$$\begin{cases} r_{maxe} = r_{max0} - (r_{max0} - r_{max}) \sqrt{\left(\frac{\alpha_{av}}{2} + \frac{1}{2\alpha_{av}}\right)} \\ r_{mine} = r_{min0} - (r_{min0} - r_{min}) \sqrt{\left(\frac{\alpha_{av}}{2} + \frac{1}{2\alpha_{av}}\right)} \end{cases}$$
(18)

where α_{av} is the average pore aspect ratio of the elliptical pores in the porous media. Substituting Eq. 18 into Eqs 7 and 10 is rewritten as

$$\varphi = (r_{min0}/r_{max0})^{\overline{(3-D_{f0})r_{max0}} - (2-D_{f0})r_{max0}}$$
(19)

Then, with the same method stated above, PVC of porous media accounts for pore aspect ratio can be determined. Figure 8 demonstrates the PVC versus the parameter α_{av} . Results (Fig. 8) suggest that porous media with more elliptical pores (e.g., prolate pores and oblate pores) has a larger value of PVC. Similar results were also shown in the literature⁹.

Advantages and limitations of the derived model. The analytical model lays a theoretical foundation for predicting the PVC of porous media. With this new analytical solution, the uncertainty in flow through porous media could be reduced and higher data accuracy could be obtained. Moreover, it can be applied to estimate more

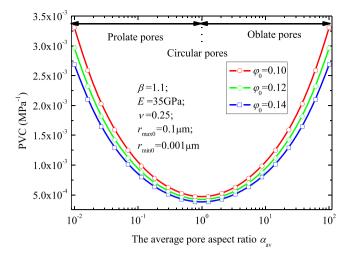


Figure 8. The PVC versus the parameter α_{av} .

accurate microstructure parameters of porous media using inverse modeling. However, our derived model is limited to matrix core samples, as it ignores the deformation of joints and fractures. And we are trying to study the PVC of fractured porous media. In addition, the pore aspect ratio distribution of the real pores in porous media is neglected, which may result in the calculation errors.

Conclusions

A novel analytical model to predict porous media PVC is derived. Predictions deduced from the derived analytical solution agree well with the test results. And the predicted PVC values are robust. Followings are the main conclusions:

- 1. Porous media PVC is affected by its porous media microstructural parameters and rock lithology. When all the other parameters are fixed, there is a definitive negative correlation between PVC and initial porosity. However, if all the other parameters are inconstant, the relationship between initial porosity and PVC is not monotonic. The blind application of pore compressibility-initial porosity relationships may lead to excessive uncertainty in any analyses based on those relationships. Thus, the specific pore structure parameters for various types of rocks need to be defined through further study to improve the accuracy of the PVC prediction, and in turn production prediction.
- 2. Porous media with relative "softer" lithology may yield larger PVC. In addition, a smaller value of PVC corresponds to rougher pore surfaces. As rock lithology (e.g., Poisson's ratio, and elastic modulus) is affected by the rock physical properties (e.g., mineral component, organic matter distribution, and clay content), when making a prediction about PVC, the rock physical properties should be considered.
- 3. The new analytical model, considering porous media microstructure and rock lithology, is useful for PVC prediction of porous media. It can help to reduce the uncertainty in flow through porous media. What's more, besides providing theoretical foundations for quantifying PVC of porous media, this new analytical model could also be applied to estimate pore structure parameters of porous media using inverse modeling.

Data Availability

The datasets generated during and/or analyzed during the current study are available from the corresponding author on reasonable request.

References

- 1. Bishop, A. W. The influence of an undrained change in stress on the pore pressure in porous media of low compressibility. *Geotechnique* 23, 435–442, https://doi.org/10.1680/geot.1973.23.3.435 (1973).
- Li, C. L., Chen, X. & Du, Z. A new relationship of rock compressibility with porosity. In SPE Asia Pacific Oil and Gas Conference and Exhibition, https://doi.org/10.2118/88464-MS (2004).
- Neto, L. B., Kotousov, A. & Bedrikovetsky, P. Elastic properties of porous media in the vicinity of the percolation limit. *Journal of Petroleum Science and Engineering* 78, 328–333, https://doi.org/10.1016/j.petrol.2011.06.026 (2011).
- 4. Fatt, I. Pore volume compressibilities of sandstone reservoir rock. *Journal of Petroleum Technology* **10**, 64–66, https://doi.org/10.2118/970-G (1958).
- 5. Berge, P. A. & Berryman, J. G. Realizability of negative pore compressibility in poroelastic composites. *Journal of Applied Mechanics* **62**, 1053–1062, 0.1115/1.2896042 (1995).
- Zhu, S. Y. et al. A semi-analytical model for pressure-dependent permeability of tight sandstone reservoirs. Transport in Porous Media 122, 1–18, https://doi.org/10.1007/s11242-018-1001-x (2018).
- Srinivasacharya, D., Srinivasacharyulu, N. & Odelu, O. Flow and heat transfer of couple stress fluid in a porous channel with expanding and contracting walls. *International Communications in Heat and Mass Transfer* 36, 180–185, https://doi.org/10.1016/j. icheatmasstransfer.2008.10.005 (2009).

- A., A. R. Impact of stress sensitive permeability on production data analysis. In SPE Unconventional Reservoirs Conference, https:// doi.org/10.2118/114166-MS (2008).
- 9. Zimmerman, R. W. Compressibility of Sandstones (Elsevier, 1990).
- Fatt, I. Compressibility of sandstones at low to moderate pressures. AAPG Bulletin 42, 1924–1957, https://doi. org/10.1306/0BDA5B8E-16BD-11D7-8645000102C1865D (1958).
- Sampath, K. A new method to measure pore volume compressibility of sandstones. *Journal of Petroleum Technology* 34, 1360–1362, https://doi.org/10.2118/10545-PA (1982).
- Shedid, S. & Moustafa, E. A. A. Influence of rock permeability and asphaltene content of crude oil on pore volume compressibility: an experimental approach. *Petroleum Science and Technology* 28, 27–41, https://doi.org/10.1080/10916460701856633 (2010).
- Zhu, S. Y. et al. An analytical model for pore volume compressibility of reservoir rock. Fuel 232, 543–549, https://doi.org/10.1016/j. fuel.2018.05.165 (2018).
- Li, T., Cai, M. F. & Cai, M. A review of mining-induced seismicity in china. International Journal of Rock Mechanics and Mining Sciences 44, 1149–1171, https://doi.org/10.1016/j.ijrmms.2007.06.002 (2007).
- W., M. M. & N., H. R. Correlations between formation properties and induced seismicity during high pressure injection into granitic rock. *Engineering Geology* 175, 74–80, https://doi.org/10.1016/j.enggeo.2014.03.015 (2014).
- Jalalh, A. A. Compressibility of porous rocks: Part i. measurements of hungarian reservoir rock samples. Acta Geophysica 54, 319–332, https://doi.org/10.2478/s11600-006-0025-8 (2006).
- Mbia, E. N., Fabricius, I. L., Krogsboll, A., Frykman, P. & Dalhoff, F. Permeability, compressibility and porosity of jurassic shale from the norwegian-danish basin. *Petroleum Geoscience* 20, 257–281, https://doi.org/10.1144/petgeo2013-035 (2014).
- de Oliveira, G. L. P. et al. Pore volume compressibilities of sandstones and carbonates from helium porosimetry measurements. Journal of Petroleum Science and Engineering 137, 185–201, https://doi.org/10.1016/j.petrol.2015.11.022 (2016).
- 19. Guo, X., Yao, Y. & Liu, D. Characteristics of coal matrix compressibility: An investigation by mercury intrusion porosimetry. *Energy* & *Fuels* 28, 3673–3678, https://doi.org/10.1021/ef5004123 (2014).
- Newman, G. H. Pore-volume compressibility of consolidated, friable, and unconsolidated reservoir rocks under hydrostatic loading. Journal of Petroleum Technology 25, 129–134, https://doi.org/10.2118/3835-PA (1973).
- 21. Hall, H. N. Compressibility of reservoir rocks. Journal of Petroleum Technology 5, 17–19, https://doi.org/10.2118/953309-G (1953).
- Braun, R., Stammnitz, T., Schelle, H. & D., S. A laboratory method for analyzing the pore volume change. In *7th ISRM Congress*, https://doi.org/10.1016/0148-9062(92)92675-3 (1991).
- Pimienta, L., Fortin, J. & Gueguen, Y. New method for measuring compressibility and poroelasticity coefficients in porous and permeable rocks. *Journal of Geophysical Research - Solid Earth* 122, 2670–2689, https://doi.org/10.1002/2016jb013791 (2017).
- He, J., Ling, K. & Pei, P. Calculation of rock compressibility by using the characteristics of downstream pressure change in permeability experiment. *Journal of Petroleum Science and Engineering* 143, 121–127, https://doi.org/10.1016/j.petrol.2016.02.030 (2016).
- 25. Suman, A. Uncertainties in rock pore compressibility and effects on seismic history matching. Master's thesis (Stanford University, 2009).
- Suman, A. & Mukerji, T. Uncertainties in rock pore compressibility and effects on time lapse seismic modeling-an application to nome field. In SEG Annual Meeting, https://doi.org/10.1190/1.3255684 (2009).
- Ghanbarnezhad, M. R. & Javadpour, F. Applying method of characteristics to determine pressure distribution in 1d shale-gas samples. SPE Journal 19, 361–372, https://doi.org/10.2118/168218-PA (2014).
- Khoshghalb, A. & Khalili, N. A stable meshfree method for fully coupled flow-deformation analysis of saturated porous media. Computers and Geotechnics 37, 789–795, https://doi.org/10.1016/j.compgeo.2010.06.005 (2010).
- Lei, G., Dong, Z., Li, W., Wen, Q. & Wang, C. Theoretical study on stress sensitivity of fractal porous media with irreducible water. Fractals 26, 1850004, https://doi.org/10.1142/S0218348X18500044 (2018).
- Lei, G., Dong, Z., Li, W., Wen, Q. & Wang, C. A fractal model for the stress-dependent permeability and relative permeability in tight sandstones. *Journal of Canadian Petroleum Technology* 54, 36–48, https://doi.org/10.2118/173897-PA (2015).
- 31. Horne, R. N. Modern well test analysis: A computer-aided approach. (Petroway, 1990).
- Jalalh, A. Compressibility of porous rocks: Part ii. new relationships. Acta Geophysica 54, 399–412, https://doi.org/10.2478/s11600-006-0029-4 (2006).
- H, A. & M, M. Experimental measurement of compressibility coefficients of synthetic sandstone in hydrostatic conditions. *Journal of Geophysics and Engineering* 10, https://doi.org/10.1088/1742-2132/10/5/055002 (2013).
- Tarokh, A., Detournay, E. & Labuz, J. Direct measurement of the unjacked pore modulus of porous solids. Proceedings of the Royal Society A 474, https://doi.org/10.1098/rspa.2018.0602 (2018).
- Khatchikian, A. Deriving reservoir pore-volume compressibility from well logs. SPE Advanced Technology Series 4, 14–20, https:// doi.org/10.2118/26963-PA (1996).
- Poston, S. W. & Chen, H. Y. The simultaneous determination of formation compressibility and gas-in-place in abnormally pressured reservoirs. In SPE Production Operations Symposium, https://doi.org/10.2118/16227-MS (1987).
- Yildiz, T. Prediction of *in-situ* formation compressibility from production data. In SPE/ISRM Rock Mechanics in Petroleum Engineering, https://doi.org/10.2118/47379-MS (1998).
- Zhang, R., Z., N. & F., Y. Shale stress sensitivity experiment and mechanism. Acta Petrolei Sinica 36, 224-231, https://doi. org/10.7623/syxb201502012 (2015).
- 39. Mandelbrot, B. B. The fractal geometry of nature. (W. H. Freeman and Co., 1982).
- Katz, A. J. & Thompson, A. H. Fractal sandstone pores: implications for conductivity and pore formation. *Physical Review Letters* 54, 1325–1328, https://doi.org/10.1103/PhysRevLett.54.1325 (1985).
- Hansen, J. P. & Skjeltorp, A. T. Fractal pore space and rock permeability implications. *Physical Review B* 38, 2635, https://doi. org/10.1103/PhysRevB.38.2635 (1988).
- Anderson, A. N., McBratney, A. B. & FitzPatrick, E. A. Soil mass, surface, and spectral fractal dimensions estimated from thin section photographs. *Soil Science Society of America Journal* 60, 962–969, https://doi.org/10.2136/sssaj1996.03615995006000040002x (1996).
- Cai, J., Yu, B., Zou, M. & Luo, L. Fractal characterization of spontaneous co-current imbibition in porous media. Energy & Fuels 24, 1860–1867, https://doi.org/10.1021/ef901413p (2010).
- Verma, A. & Pitchumani, R. Fractal description of microstructures and properties of dynamically evolving porous media. International Communications in Heat and Mass Transfer 81, 51–55, https://doi.org/10.1016/j.icheatmasstransfer.2016.11.008 (2017).
- 45. Yu, B. & Li, J. Some fractal characters of porous media. Fractals 9, 365-372, https://doi.org/10.1142/S0218348X01000804 (2001).
- Russell, A. R. How water retention in fractal soils depends on particle and pore sizes, shapes, volumes and surface areas. Geotechnique 64, 379–390, https://doi.org/10.1680/geot.13.P.165 (2014).
- Lei, G., Cao, N. & Wang, H. J. A non-linear flow model for porous media based on conformable derivative approach. *Energies* 11, 2986, https://doi.org/10.3390/en11112986 (2018).
- da Silva, J. G. P. et al. Petrophysical studies of north american carbonate rock samples and evaluation of pore-volume compressibility models. Journal of Applied Geophysics 123, 256–266, https://doi.org/10.1016/j.jappgeo.2015.10.018 (2015).

Acknowledgements

The authors are grateful for financial support from the Deanship of Scientific Research at King Fahd University of Petroleum and Minerals (Project No. SB181033), the National Natural Science Foundation of China (Grant No. 51604013), and the State Major Science and Technology Special Project of China during the 13th Five-Year Plan (Grant No. 2016ZX05025-003-007).

Author Contributions

G.L. and N.C. derived the theoretical model and wrote the main manuscript. B.M., Q.L. and W.C. revised the manuscript. All the authors discussed the results and commented on the manuscript. W.C. supervised the work. Q.L. and W.C. conceived and led the project.

Additional Information

Competing Interests: The authors declare no competing interests.

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit http://creativecommons.org/licenses/by/4.0/.

© The Author(s) 2019