

*Article*

# **Experimental Investigation of the E**ff**ects of Water and Polymer Flooding on Geometric and Multifractal Characteristics of Pore Structures**

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**Abstract:** During water and polymer flooding for enhanced oil recovery, pore structures may vary because of the fluid–rock interactions, which can lead to variations in petrophysical properties and affect oil field production. To investigate the effects of fluid flooding on pore structures, six samples were subjected to brine water, dual-system, and alkaline–surfactant–polymer (ASP) polymer displacement experiments. Before and after experiments, samples were scanned by X-ray CT. Thin sections, X-ray diffraction, and high pressure mercury injection tests were also carried out to characterize mineralogy and fractal dimension of pore systems before experiments. Experiment results show that water flooding with low injection pore volume ratio (IPVR) can improve reservoir quality since total porosity and connected porosity of samples rise after the flooding and the proportion of large pores also increases and heterogeneity of pore structure decreases. However, water flooding with high IPVR has reverse effects on pore structures. Polymer flooding reduces the total porosity, connected porosity, the percentage of small pores and enhances the heterogeneity of pore structures. It can be found that pore structures will change in fluid flooding and appropriate water injection can improve reservoir quality while excessive water injection may destroy the reservoir. Meanwhile, injected polymer may block throats and destroy reservoirs. The experimental results can be used as the basis for oil field development.

**Keywords:** multifractal analysis; pore structure; displacement experiment; fractal dimension; water flooding; polymer flooding

## **1. Introduction**

Certain physical properties of a rock, for instance, porosity and permeability, are a function of the pore system within the rock [\[1\]](#page-16-0). The analysis of pore structures for reservoir characterization is of great significance, since it can be used not only for evaluation of the heterogeneity of rocks and reservoir classification, but also for the prediction of rock properties and estimation of the resource potential [\[2\]](#page-16-1). Thus, a large number of studies have been made to characterize the pore structures of conventional and unconventional reservoirs [\[2](#page-16-1)[–16\]](#page-16-2). The geometric, topological, and fractal characteristics of pore systems have been analyzed using various techniques, e.g., scanning electron microscopy (SEM), mercury injection capillary pressure (MICP), nuclear magnetic resonance spectroscopy (NMR), X-ray computed tomography (X-ray CT), small-angle neutron scattering (SANS), and gas (i.e., N2 and CO2)



adsorption [\[17](#page-16-3)[–30\]](#page-17-0). Apart from these parameters, multifractal features of pore structures have also been calculated to evaluate the heterogeneity of the rocks [\[31](#page-17-1)[–33\]](#page-17-2). Generally, the singularity strength range in multifractal theory reflects the homogeneity degree of rocks. A large value indicates that the rock is more heterogeneous [\[32\]](#page-17-3).

Most previous studies have focused on characterization of the static pore system of the rocks, and little attention has been paid to the analysis of "dynamic" pore systems of samples. For example, the pore systems are different before and after the water or polymer flooding, since the fluid–rock interaction, such as clay mineral expansion and moving of grains, will change the pore structures [\[34\]](#page-17-4). Changes in pore structure could lead to variations in the properties of the rocks and make the reservoir quality better or worse. For example, Wang et al., (2005) characterized the fractal property of the pore system of sandstone before and after water flooding based on MICP data. They showed that the water flooding increased the fractal dimension and the heterogeneity of the pore structure. Li et al., (2011) investigated the change in pore sizes, and fractal characteristics of pore structures, in sandstones and mudstones before and after water adsorption based on SEM images. They found that the porosity and fractal dimension rose. Gharbi et al., (2013) analyzed the effects of  $CO<sub>2</sub>$  injection in carbonates on the pore structures and connectivity. They concluded that the pore and throat size became larger and the porosity and permeability increased after CO<sub>2</sub> was injected into the rocks. Recently, Al-Khulaifi et al., (2019) demonstrated that dissolution in carbonates by  $CO<sub>2</sub>$  saturated brine leads to changes in the pore structures using X-ray CT technique.

Previously published studies only investigated the impacts of water flooding on fractal dimension and pore size of pore systems. Moreover, the effects of polymer flooding on pore structures have hardly ever been investigated. This study presents a more comprehensive investigation of the effects of water and polymer flooding on the multifractal and geometric properties of pore systems, using sandstone from the mature Yangsanmu oil field, as a case study. This field has undergone 40 years of water injection. Although a high production yield is still maintained, the water cut is as high as 90% and production cost is rising because of the high cost of water injection development and wastewater treatment. In order to find an economic and effective scheme of improved oil recovery (IOR), field experiments involving different approaches will be carried out, including increased water injection, dual-system flooding, and alkaline–surfactant–polymer (ASP) flooding. Before large-scale field experiments commence, it is necessary to analyze the influence of different displacement media (water and polymer) on reservoir pore structure through experimental tests. Six sandstone samples from the Yangsanmu Field were therefore chosen for this purpose. This study is very meaningful for the Yangsanmu oil field, since the variation in the pore structures induced by water and polymer flooding has never been analyzed. Experimental results can be used as the basis for selecting displacement fluid types and parameters in oil field development.

In addition to commonly used petrophysics parameters, such as porosity and permeability, it should be noted that study of pore structures in this work focuses on two aspects: (1) data distribution of pore throat radius, (2) geometric features of pore throat based on image analysis. The former can be obtained from data and analysis of high-pressure mercury intrusion porosimetry (HPMI) curves, CT scanned images, and 3D digital core model based on CT scan data. The latter can be analyzed with images of thin sections and CT scan data. Statistical methods (e.g., cross-plot chart), fractal analysis, and multifractal analysis are employed in the data and images analysis mentioned above.

The paper is organized as follows: a brief introduction to the geological setting of the study area is presented in Section [2.](#page-2-0) The samples used in the work, the procedure of water and polymer flooding experiments, and fractal theory are described in Section [3.](#page-3-0) Next, Section [4](#page-8-0) presents a comprehensive analysis of the lithofacies, mineral, and pore characteristics of the samples and the effects of fluid displacement on pore structures. Finally, Section [5](#page-15-0) summarizes the findings of the study.

#### <span id="page-2-0"></span>**2. Geological Setting**

Samples were selected from the Guantao Formation in Yangsanmu oil field, Huanghua Depression, Bohai Bay Basin. The Huanghua Depression is located in the center of the Bohai Bay Basin, eastern China, and is one of the four major oil-bearing depressions in the basin [\[35,](#page-17-5)[36\]](#page-17-6). It is a long and narrow depression running southwest to northeast (Figure [1A](#page-2-1)). Yangsanmu Field lies between the Kongdian Uplift and Qinan Sag in the depression (Figure [1B](#page-2-1)) and has produced petroleum for about 50 years. The field is geologically located at a faulted-anticline whose long axis points runs southwest–northeast.<br>The anticline is separated by a normal factor of the anticline is separated by a normal factor of the anticode The anticline is separated by a northeastern normal fault which is sealing (Figure [1B](#page-2-1)). In the past 40  $\frac{1}{2}$ years, there have been four wells drilled in the area and the latest, well Y11A, was drilled in October years, after have been four wells drifted in the area and the latest, well Y11A, was drifted in October 2018 and is at the center of the anticline (Figure [1C](#page-2-1)). The well Y11A penetrated a braided bar sandstone existend bar are center of the anticiditie (1.gate 1.6). The went 11111 perfectation a brandical bar sandstone reservoir, the size of which is approximately  $0.5 \times 1$  km in area (Figure [1D](#page-2-1)) [\[37\]](#page-17-7).

<span id="page-2-1"></span>

**Figure 1.** Geological setting of the study area showing its location, structural features, and **Figure 1.** Geological setting of the study area showing its location, structural features, and sedimentary facies. (A) Bohai Bay Basin and location of Huanghua Depression in the basin. (B) Structure of the Huanghua Depression. The study area, the Yangsanmu oil field, is located in the Kongdian Uplift in the depression. (C) Structure map of the Yangsanmu oil field. Core samples came from well Y11A, which is near the center of the faulted-trap. (D) Sedimentary facies map of the oil field. There is an oil-filled braided bar sandstone reservoir at the location of the well Y11A.

Above basement rocks, there are Paleogene, Neogene, and Quaternary sediments in the Huanghua Depression (see Figure [2\)](#page-3-1). The Paleogene is subdivided into three formations including Kongdian (Ek), Shahejie (Es), and Dongying (Ed) while the Neogene includes the Guantao (Ng) and Minghuazhen (Nm) Formations. There is a regional unconformity between Dongying (Ed) and the Guantao Formation [\[37\]](#page-17-7). There are three members in Ng and the target reservoir for this study is the second member (Ng2) (Figure [2\)](#page-3-1). During the Ng2 stage, the climate of the Bohai Bay Basin was mid-subtropical warm and humid and the basin was structurally at a stage of slow subsidence [\[37](#page-17-7)[,38\]](#page-17-8).

<span id="page-3-1"></span>

**Figure 2.** Generalized Cenozoic-Quaternary sequence framework and stratigraphy of the Huanghua **Figure 2.** Generalized Cenozoic-Quaternary sequence framework and stratigraphy of the Huanghua Depression, Bohai Bay Basin, eastern China. The well logs on the right are from the Well Y11A. Depression, Bohai Bay Basin, eastern China. The well logs on the right are from the Well Y11A.

#### <span id="page-3-0"></span>**3. Samples, Experiments, and Methodology**

#### *3.1. Samples*

*3.1. Samples*  The samples used in this study are from the well Y11A which was drilled in October 2018 in Yangsanmu oil field. Fifty-six meters of continuous core in the Ng Formation (including 30 m in the Ng2 Member) was recovered from the well. Six samples from three depth sections were collected as listing in Table [1.](#page-5-0) These samples can be divided into 3 groups based on their depths and samples whose depth difference is 1–2 cm belong to the same group. Samples within the same group have the same lithofacies, petrological characteristics, and similar porosity and permeability (see Table [1\)](#page-5-0). The lithofacies of samples 6-003 and 7-008 are parallel bedded sandstones, while that of sample 10-010 is massive sandstone. For the investigation of the effects of both water and polymer flooding on rock properties, six experiments are carried out.

#### *3.2. Water and Polymer Flooding Experiments*

The multiphase flow experiments were carried out on six samples, three groups of two taken at adjacent depths, to study the influence of displacement by different fluid media on pore structures, which can improve our understanding of the advantages and disadvantages of water and polymer flooding approaches, and provide useful guidance for designing new protocols for enhanced oil recovery (EOR).

Types of the tested injection fluid including brine, polymer–surfactant dual-compound polymer/ surfactant system, and triple-compound alkali/surfactant/polymer system (abbreviated as ASP). Components of the polymer, surfactant, and alkali are partially hydrolyzed polyacrylamide (HPAM), iodate surfactant, and sodium carbonate respectively, which are commonly used in EOR in the oil field (Table [2\)](#page-5-1).

The experiment was carried out under 20 ◦C at test center of Energy Development Co., CNOOC. The injection pressure varied and is listed in Table [1.](#page-5-0) The schematic of the experiment process is presented in Figure [3](#page-5-2) and the key processes in the experiments were as follows.

- (1) Step 1: sample preparation and dry scan. The six water-wetting core plug samples were packed into carbon fiber holders which are transparent to  $X$  rays. After that, each of the dry samples was scanned by X ray CT for 4 h and 57 min.
- (2) Step 2: oil-saturated sample preparation. All the samples were vacuumed for 2 h with Castable Vacuum System (CVS). After that, all the six samples were saturated with brine of 2343 mg/L in salinity which was the same as that of the formation water in the study area. The injection velocity of brine was 0.05 mL/min and saturation took 1.5 h. Then, oil was injected at a rate of 0.02 mL/min for 1.5 h at which time the samples were completely saturated with oil. Viscosity of the simulated oil was 5 mPa $\cdot$ S at 20  $\cdot$ C. In order to recognize oil in the CT images, 7 vol% Diiodomethane (CH2I2) was added to the oil as indicator to improve the response to X-rays in the CT scan after flooding.
- (3) Step 3: water flooding experiments. Experiment nos.1, 2, 3 and 5, were carried out according to the experimental plan in Table [1.](#page-5-0) After the experiments, each sample was scanned by X ray CT for 4 h and 57 min.
- (4) Step 4: multiphase flooding and scan. Dual-system polymer/surfactant (Experiment no. 4) and ASP (Experiment no. 6) were injected to displace the oil. The injection pressures were 0.15 MPa and 0.23 MPa, respectively. The injection velocity was 0.05 mL/min. Samples were scanned by X ray CT after the experiments, as described above.

In the experiment plan, the injected volume of fluids was measured with injection pore volume ratio (abbreviated as IPVR). It is the ratio of injected fluid volume to pore volume. In the study of displacement effect, this measurement method is more reasonable.

Before and after the displacement experiment, all the samples were scanned using X ray CT twice. Three-dimension digital images of these samples were built. Based on these digital rocks, the geometric and fractal properties were analyzed. For the processing of X ray CT data, a traditional workflow was implemented including 3D reconstruction, median filtering, and binarization process, pore-network extraction, and calculation of pore-throat diameter distributions statistics and analysis [\[17\]](#page-16-3).

<span id="page-5-2"></span>

**Figure 3.** Workflow of the experiments. **Figure 3.** Workflow of the experiments.

<span id="page-5-0"></span>

Experiment No.	Sample No.	Depth/m	Porosity/%	Permeability/ $10^{-3}$ um <sup>2</sup>	Strata	Displacement Plan	Injection Pressure
	$6 - 003F$	1451.17	28.7	2110	$Ng2-3$	High water IPVR: 50 PV	0.023 MPa
C.	6-003G	1451.18	29.2	2149	$Ng2-3$	Low water IPVR: 1.25 PV	$0.023$ MPa
3	7-008F	1456.50	29.7	4060	$Ng2-3$	Low water IPVR: 1.25 PV	$0.015$ MPa
4	7-008G	1456.51	28.6	3501	$Ng2-3$	Dual-system IPVR: 1 PV	$0.15$ MPa
5.	10-010F	1472.34	21.0	1590	$Ng2-4$	Low water IPVR: 1.25 PV	$0.01$ MPa
6	$10-010G$	1472.36	20.9	1286	$Ng2-4$	<b>ASP IPVR: 1 PV</b>	$0.23$ MPa

**Table 1.** Sample information and plan of displacement experiment.

Note: the core plug is a cylinder which is 3 cm in length and 2.5 cm in diameter. IPVR: injection pore volume ratio. ASP: triple-compound alkali/surfactant/polymer system.



<span id="page-5-1"></span>

Note: HPAM: hydrolyzed polyacrylamide.

## 3.3. Analytical Methods *and Methods and Methods and Methods and Methods and Methods and Methods and Methods* **<b>***and Methods and Methods and Methods* **<b>***and Methods and Methods* **<b>***and Met*

**Note: HPAM: hydrolyzed polyacrylamide**  *3.3. Analytical Methods*  scan parameters and data reconstruction parameters are listed in Table [3.](#page-6-0) The image matrix of the scan In this study, the 3D CT scan was carried out using a BRUKER Micro-CT SkyScan 1173. The main result is 2240  $\times$  2240 pixels. Scan resolution is 13.84  $\mu$ m. The vertical interval of CT slices is 10  $\mu$ m.

Porosity and permeability were measured using routine helium test methods. Size of the plunger sample was 2.5 cm in diameter and 3 cm in length. X-ray diffraction (XRD) of common minerals, clay minerals, and their relative contents were conducted using D/max-2500 X-ray diffractometer. The test condition was 25 °C and 40% of air humidity. Grain size was analyzed with laser particle sizer MS2000 manufactured by Malvern PANalytical. High-pressure mercury intrusion porosimetry (HPMI) for pore structure was performed under 20 °C using Autopore IV 9500 mercury intrusion tester. The test pore scale ranges from 0.003 to 1000 µm. Direct observation and multifractal analysis of images of thin section are performed to characterize pore structures. Oil-bearing conditions of the samples are analyzed with fluorescent thin sections.

<span id="page-6-0"></span>

<b>Scan Parameters</b>		<b>Data Reconstruction Parameters</b>				
Camera binning	$1 \times 1$	Post-alignment (pixels)	$-11.50$			
Image pixel size $(\mu m)$	13.84	Smoothing	2			
Source voltage (kV)	130	Smoothing kernel	$\theta$			
Source current $(\mu A)$	60	Ring artefact correction	18			
Filter	$0.25$ mm brass	Threshold for defect pixel mask (%)	$\Omega$			
Exposure (ms)	1400	Beam hardening correction (%)	18			
Rotation step $(°)$	0.220	Minimum for CS to Image Conversion	0.004500			
Use $360^\circ$ rotation	<b>YES</b>	Maximum for CS to Image Conversion	0.015000			
Frame averaging	ON	Reconstruction duration per slice (s)	3.527647			
Scan duration	4 h:57 m					

**Table 3.** CT scan and data reconstruction parameters.

Note: CS: compressed sensing.

*3.4. Theory and Methodology of Fractal and Multifractal Analysis for Pore Structure Characterization*

#### 3.4.1. Fractal Analysis of HPMI Results

Fractal geometry dates from the 1970s. It is a useful tool in the description of irregularity and randomness of objects and can be used to characterize complex structures [\[20](#page-17-9)[,27](#page-17-10)[,39–](#page-17-11)[41\]](#page-17-12). Distribution and geometrical structures of pores in rocks have fractal characteristics [\[27](#page-17-10)[,32](#page-17-3)[,42\]](#page-17-13).

The cumulative volume of pores is the integral of pore radius distribution density function to pore radius [\[16,](#page-16-2)[43\]](#page-18-0). The cumulative volume of pores whose radius is larger than *r* (*Nr*) can be presented as follows:

$$
N_r = \int_r^{r_{max}} f(r) dr = ar^{-D}
$$
 (1)

where  $r_{max}$  is the maximum radius of pores in  $\mu$ m;  $f(r)$  is the pore radius distribution density function; *a* is a constant and *D* is the fractal dimension of the pore structure. From Equation (1) and the sphere model of pores, the cumulative volume of pores (*Vr*−) whose radius is smaller than *r* can be presented as follows:

$$
V_{r-} = -\frac{aD\alpha}{3 - D} \left( r^{3 - D} - r_{min}^{3 - D} \right)
$$
 (2)

where  $r_{min}$  is the minimum radius of pores in  $\mu$ m and  $\alpha$  is a scale factor constant related to pore structure. So, the volume proportion of pores (*S*) whose radius is smaller than *r* is:

$$
S = \frac{V_{r-}}{V} = \frac{r^{3-D} - r_{min}^{3-D}}{r_{max}^{3-D} - r_{min}^{3-D}}
$$
(3)

where  $V$  is the total pore volume of the rock in  $\mu$ m. For reservoirs with complex pore structures, the maximum pore radius is far greater than the minimum pore radius. Hence, Equation (3) can be simplified to:

$$
S = \left(\frac{r}{r_{max}}\right)^{3-D} \tag{4}
$$

In sandstones, the *rmax* of rocks is commonly far greater than *rmin* and meets the simplification condition of Formula (4) [\[44\]](#page-18-1).

In capillary pressure analysis using the mercury intrusion method, the capillary pressure  $P_c$  is inversely proportional to pore radius and the relationship is presented as:

$$
P_c = \frac{2\sigma\cos\theta}{r} \tag{5}
$$

where  $P_c$  is capillary pressure in MPa;  $\sigma$  is interfacial tension and  $\theta$  is wetting angle. In a mercury injection test, the pressure corresponding to *rmax*, the maximum pore throat radius, is the initial capillary pressure (*Pmin*). From Equations (4) and (5), it can be deduced that

$$
S = \left(\frac{P_c}{P_{min}}\right)^{D-3} \tag{6}
$$

Furthermore,

$$
lgS = (D-3)lgP_c + lgP_{min}
$$
\n(7)

In Formula (7), *S* can be calculated by injected mercury saturation and *Pmin* can be read from the mercury injection curve. The fractal dimension (*D*) of pore structures can be determined by linear regression analysis of the mercury injection curve.

#### <span id="page-7-0"></span>3.4.2. Multifractal Analysis of CT and Thin Section Images

In the HPMI test, the result is a one-dimensional curve corresponding to the overall response of the pore structure of the sample with *x*-axis of mercury saturation and *y*-axis of displacement pressure. It can be treated as distribution of pores and throats which have different radiuses. Pore features reflected in the capillary pressure curve have one simple fractal dimension [\[44\]](#page-18-1). But in the X ray CT image, geometry of every pore and throat can be imaged. Heterogeneity of pore structures is more detailed, and multifractal analysis is used to describe the heterogeneity of pores [\[32\]](#page-17-3).

Grassberger (1990) proposed the theory and an optimized box-assisted method of multi-fractal analysis [\[45\]](#page-18-2). Multifractal analysis has been used widely in image processing and can provide a continuous spectrum of fractal dimensions [\[40\]](#page-17-14). In this paper, an optimized box-assisted method is employed. According to multifractal theory,

$$
N(\varepsilon) = \varepsilon^{-f(\alpha)} \tag{8}
$$

where  $\varepsilon$  is a small measure scale;  $N(\varepsilon)$  is the number of boxes in the subset;  $\alpha$  is an index which reflects the singular degree of a small range and is related to its position in the image;  $f(\alpha)$  is a singular spectrum and it presents density of parameter  $\alpha$  with a continuous function. The density distribution function of  $\alpha$  can be further weighted summed as:

$$
X(q,\varepsilon) = \sum_{i=1}^{N(\varepsilon)} P_i^q(\varepsilon) = \varepsilon^{\tau(q)}
$$
\n(9)

where  $X(q,\varepsilon)$  is the partition function of *q* with scale  $\varepsilon$ ; *q* is moment order of distribution;  $\tau(q)$  is mass exponent function, which is expressed as:

$$
\tau(q) = -\lim_{\varepsilon \to 0} \frac{\log \sum_{i=1}^{N(\varepsilon)} P_i^q(\varepsilon)}{\log \varepsilon} \tag{10}
$$

In the description of multi-fractal with *q*-*D<sup>q</sup>* parameters, the generalized Renyi dimension *D<sup>q</sup>* is given by:

$$
D_q = \begin{cases} \frac{1}{q-1} \lim_{\varepsilon \to 0} \frac{\log \sum_{i=1}^{N(\varepsilon)} P_i^q(\varepsilon)}{\log \varepsilon} = \frac{\tau(q)}{q-1}, q \neq 1\\ \lim_{\varepsilon \to 0} \sum_{i=1}^{P_i(\varepsilon)} \frac{\log P_i(\varepsilon)}{\log \varepsilon}, q = 1 \end{cases}
$$
(11)

Using the Legendre transformation, the above two descriptions of multi-fractal parameters can be correlated as [\[32\]](#page-17-3):

$$
\alpha(q) = \frac{d\tau(q)}{dq} \tag{12}
$$

$$
f(\alpha) = q\alpha(q) - \tau(q) \tag{13}
$$

# <span id="page-8-0"></span>**4. Results and Discussion** *4.1. Mineral and Pore Features of the Samples*

#### <span id="page-8-3"></span>4.1. Mineral and Pore Features of the Samples

As mentioned above, the six samples used in the displacement experiment were collected from the members above, the six samples ased in the displacement experiment were conceted non-<br>three depths. It means that there were two parallel samples whose features were more or less the same at each depth. Mineral components of the three groups of samples are listed in Table [4.](#page-8-1) The samples of at each depth. Mineral components of the three groups of samples are listed in Table 4. The samples of at each depth. *Inneral components of the three groups of samples are noted in taste 1. The samples of* the three groups had very similar contents of quartz, potash feldspar, plagioclase, calcite, dolomite, and total clay minerals. The microscopic oil-bearing condition and plane porosity of the three sample and total clay minerals. The microscopic oil-bearing condition and plane porosity of the three sample groups were similar (Figure [4\)](#page-8-2).  $\frac{1}{\sqrt{2}}$  and  $\frac{1}{\sqrt{2}}$  characteristics of the samples of the geometric and fractal properties of the geometric and  $\frac{1}{\sqrt{2}}$ 

Apart from the mineral characteristics of the samples, the geometric and fractal properties of pore If the matterial characterizates of the samples, are geometric and mean properties of pote structures of the samples were characterized using HPMI data. There is a wide "platform" in the mercury injection curve of each sample in Figure [4.](#page-8-2) The "platform" has a wide range of mercury saturation which indicates a wide range of mercury saturation which indicates a wide range of pore and throat size. The injection pressure of the "platform" is low and this indicates a wide range of pore and throat size. The injection pressure of the "platform" is low and this indicates a wate range or pore and throat size. The injection pressure or the "platform" is tow and this indicates that the pore and throat size of the "platform" is large. Stated thus, the geometry of capillary relative that the pore and those size of the phatform to large. Stated that fully divergence of the phatrophone of these samples indicate distribution of pores are relatively homogeneous (Figure [4\)](#page-8-2). pressure curves or these samples marchic alsensation or pores are relatively homogeneous (rigure 1).<br>In addition, it can be also concluded that sample 7-008 has a more homogeneous pore distribution and In addition, it can be also concreated that sample? Soo has a more nonegeneous pore distributed and the larger total connected pore volume than the other two. This can be also verified quantitatively from the HPMI parameters, such as maximum mercury injection saturation of the samples (Table [5\)](#page-9-0). saturation of the samples (Table 5).

<span id="page-8-1"></span>

Sample	Ouartz	Potash		Calcite	Dolomite			<b>Relative Content of Clay Minerals</b>									
No.		Feldspar	Plagioclase			Pyrite	Clay	S			C	I/S	C/S	$S\%$	$I\%$	$S\%$	$C\%$
$6 - 003$	39	18	31									87		85	LD.		
7-008	37	20	34				$\mathcal{D}$		n.			81		85	15		
10-010	38	21	28						b.	15		69		85	15		

**Table 4.** Quantitative analysis of mineral components of rock and clay with X-ray diffraction. **Table 4.** Quantitative analysis of mineral components of rock and clay with X-ray diffraction.

<span id="page-8-2"></span>

Figure 4. Lithological features of the three sample groups.

<span id="page-9-0"></span>

Sample No.	<b>Displacement</b> Pressure/MPa	<b>Maximum Pore-</b> Throat Radius/µm	Median Pressure/MPa	Median Radius/µm	<b>Average Pore-</b> Throat Radius/µm	Maximum Injected $S_{H\sigma}/\%$
$6 - 003$	0.024	30.430	0.092	7.996	10.520	79.8
7-008	0.014	53.190	0.051	14.430	14.830	90.3
10-010	0.041	17.750	0.127	5.795	6.839	83.6

**Table 5.** Capillary pressure curve parameters of the three sample groups.

Note:  $S_{Hg}$ : mercury saturation.

The relationship of displacement pressure (Pc) and water saturation (Sw) has segmented characteristics and presents as four straight lines with the different gradients in the lgPc-lgSw scatter diagram (Figure 5). According to Formula (7), fractal geometry parameters are derived from Figure [5.](#page-9-1) The three samples have similar fractal parameters (Table [6\)](#page-10-0). From the fractal geometry parameters listed in Table [6,](#page-10-0) four characteristics can be indicated: The three samples have similar fractal parameters (Table 6). From the fractal geometry parameters (Table 6). From the fractal geometry parameters (Table 6). From the fractal geometry param

- (1) Since parameters *Pc* and *Sw,* which are derived from HPMI test, are a response to pore radius and its distribution, the heterogeneity of pore radius distribution has segmented characteristics in the study area. and its distribution, the heterogeneity of port radius distribution  $\frac{1}{2}$
- (2) Pores in the same radius range of the three samples have similar fractal dimension. Distribution of pores with a radius within the range of 9.704–23.68  $\mu$ m, which have a lower fractal dimension, of ports with a radius within the range of 9.704–23.06 μm, which range a lower fractal dimension, are more homogeneous than that of pores with a radius larger than 23.68 μm or smaller than  $9.704 \mu m$ . are more homogeneous than that of pores with a radius larger than 23.69 μm or smaller than
- (3) In Figure [5,](#page-9-1) the second part (segment ②) of the four segmented lines which has a high gradient has the smallest fractal dimension of HPMI curve (Table [6\)](#page-10-0). It corresponds to the level part of capillary pressure curve whose mercury saturation ranges from about 10% to 60% (Figure [4\)](#page-8-2). Pores in this range make up more than 45% pore volume in the samples (Figure [4](#page-8-2) and Table [6\)](#page-10-0). Pores in this range make up more than 45% pore volume in the samples (Figure 4 and Table 6).  $\sigma$  in Figure 5, the second part (segment  $\mathcal{D}$ ) of the four segmented lines which has a high gradient  $\frac{h}{h}$  fractal dimension of HPMI curve (Table 6). It corresponds to the level part of capillary pressure curve whose mercury saturation ranges from about 10% to 60% (Figure 4).
- (4) Fractal dimension of pore radius distribution of large pores (with a radius larger than 23  $\mu$ m and 17.75  $\mu$ m for sample 10-010) and small pores (with a radius smaller than about 0.021  $\mu$ m) is very high and larger than 2.9. It means pore radius distribution of large pores and small pores high and larger than 2.9. It means pore radius distribution of large pores and small pores mentioned above are very heterogeneous (Table [6\)](#page-10-0). mentioned above are very heterogeneous (Table 6).

<span id="page-9-1"></span>

**Figure 5.** The lgPc-lgSw scatter diagrams of different samples. The relationship between Pc and Sw has segmented characteristics. The data marked with red arrow are pore radius  $(\mu m)$  at the intersection points.

Sample No.	Line <b>Section</b>	<b>Radius of Pore</b> and Throat/um	Pc/MPa	$\mathbf{S}\mathbf{w}/\mathbf{0}$	Fractal Dimension	Relational Expression and <b>Correlation Coefficient</b>
	➀	23.680-105.260	$0.007 - 0.031$	95.04-100.00	2.9686	$y = -0.0314x + 1.9344$ $R^2 = 0.8869$
$6 - 003$	$\circled{2}$	9.704-23.680	$0.031 - 0.076$	49.53-95.04	2.2254	$y = -0.7746x + 0.8191$ $R^2 = 0.9773$
	3	$0.021 - 9.704$	0.076-34.903	20.53-49.53	2.8674	$y = -0.1326x + 1.5297$ $R^2 = 0.995$
	$\circled{4}$	$0.004 - 0.021$	34.903-206.845	17.46-20.53	2.9116	$y = -0.0884x + 1.4571$ $R^2 = 0.907$

Table 6. Fractal features of pores based on high-pressure mercury intrusion porosimetry (HPMI) data.

<span id="page-10-0"></span>

Sample No.	Line <b>Section</b>	<b>Radius of Pore</b> and $Throat/\mu m$	Pc/MPa	$\mathbf{S}\mathbf{w}/\mathbf{w}$	Fractal Dimension	Relational Expression and <b>Correlation Coefficient</b>
7-008	$\circled{1}$	23.680-105.260	$0.007 - 0.031$	88.55-100.00	2.9256	$y = -0.0744x + 1.8472$ $R^2 = 0.8246$
	(2)	9.710-23.680	$0.031 - 0.076$	35.53 - 88.55	2.2361	$y = -0.7639x + 0.6874$ $R^2 = 0.9861$
	(3)	$0.021 - 9.710$	0.076-34.903	8.50-35.53	2.7831	$y = -0.2169x + 1.2509$ $R^2 = 0.9874$
	$\circled{4}$	$0.004 - 0.021$	34.903-206.845	$8.22 - 8.50$	2.9871	$y = -0.0129x + 0.9419$ $R^2 = 0.4358$
	$\textcircled{1}$	17.750-105.260	$0.007 - 0.031$	95.65-100.00	2.9742	$y = -0.0258x + 1.945$ $R^2 = 0.9676$
10-010	$\circled{2}$	7.369-17.750	$0.031 - 0.076$	49.96-95.65	2.2310	$y = -0.769x + 0.9366$ $R^2 = 0.9383$
	$\circled{3}$	$0.021 - 7.369$	0.076-34.903	13.27-49.96	2.7898	$y = -0.2102x + 1.4525$ $R^2 = 0.9968$
	$\circled{4}$	$0.004 - 0.021$	34.903-206.845	12.06-13.27	2.9467	$y = -0.0533x + 1.2198$ $R^2 = 0.6166$

**Table 6.** *Cont.*

#### *4.2. E*ff*ects of Fluid Displacement on Pore Structures*

#### 4.2.1. Geometric Characteristics

After water flooding at low water IPVR, the quality of relative good reservoirs, that have high porosity and relatively homogeneous pore radius distribution, can be further improved. For example, samples 6-003 and 7-008 have high porosity (>29%) and relatively homogeneous pore radius distribution as discussed in Section [4.1](#page-8-3) of this paper. After 1.25 PV water flooding (Experiment no.2), porosity of sample 6-003G increased from 29.2% to 32.5%. Connected pores (connected porosity), as measured by 3D CT model, increased from 29.1% to 32.4% (Table [7\)](#page-11-0) and the relative proportion of large pores whose radius was greater than 124.58 µm increased (Figure [6B](#page-11-1)). It means pore connectivity becomes better. The range of  $\Delta \alpha$ , which is defined as the difference between the maximum and minimum value of  $\alpha$ , decreased from 0.7574 to 0.7528 (Figure [7E](#page-12-0)). Since heterogeneity decrease with the range of  $\Delta \alpha$  [\[32\]](#page-17-3), the above decreasing of  $\Delta \alpha$  range indicates the heterogeneity of reservoir pore structure is weakened. Similar changes happened for the sample 7-008F (Figure [8E](#page-12-1), Table [7\)](#page-11-0).

Water flooding at high water IPVR decreases both connected porosity and total porosity of reservoirs. In Experiment no.1, with sample 6-003F, connected porosity and total porosity decrease by 3.1% and 3.0%, respectively (Table [7\)](#page-11-0). Statistics of pore radius distribution in Figure [6A](#page-11-1) show the increase in small pores and decrease in large pores with a pore diameter threshold of 96.89  $\mu$ m. The increase in  $\Delta \alpha$  from 0.7661 to 0.8714 indicates that distribution of pore radius becomes more heterogeneous after 50 PV flooding (Figure [7F](#page-12-0)). Water flooding of at high water IPVR may decrease the pore connectivity (Figure [8C](#page-12-1),D). Comparing results of Experiment nos.1 and 2, it can be concluded that volume of injected water controls the influence of water flooding on pore structures. It is inferred that at the early stage of water flooding, matrix and small grains began to move and some of the fine-grained components were washed away. Large pores which are main channel of flooding water can expand and the average pore radius increase. Meanwhile, pore structures become more homogeneous than that before water flooding. As more and more water was injected into the pores, water injection pore volume ratios increased and the average radius of movable grains in flooding also increased. This means larger grains move with flooding water in the pore network. The possibility that small pores and throats are blocked by these moving particles will increase greatly. The connectivity of pores will decrease and pore radius distribution will become more heterogeneous.

Polymer–surfactant dual-compound system and the triple compound ASP system are commonly used displacement fluids in EOR. The influence of the two systems on pore structures was tested and the results were compared with that of water. Controlled Experiments nos.3 and 4 used water and the polymer–surfactant dual-compound system (abbreviated to dual-system). The dual-system caused the

total porosity of sample 7-008G to decrease from 28.6% to 22.0% and connected porosity to decrease from 28.5% to 21.7%. Pore connectivity became poor and the relative proportion of isolated porosity increased to 3× the original (Table [7\)](#page-11-0). The proportion of small pores whose diameters were under 96.89 µm increased while that of large pores decreased (Figure [6D](#page-11-1)).

<span id="page-11-0"></span>

<b>Experiment No.</b>		1		$\overline{2}$	3		
Displacement Media		Water 50 PV		Water 1.25 PV	Water 1.25 PV		
Sample No.		$6 - 003F$		$6-003G$	7-008F		
<b>Parameters</b>	<b>Before</b> Displacement	After Displacement	<b>Before</b> Displacement	After Displacement	<b>Before</b> Displacement	After Displacement	
Total porosity	28.7%	25.7%	29.2%	32.5%	29.7%	$30.2\%$	
Connected porosity	28.5%	25.4%	29.1%	32.4%	29.6%	30.1%	
Isolated porosity	$0.2\%$	0.3%	$0.1\%$	$0.1\%$	$0.1\%$	0.1%	
Proportion of isolated pores	$0.7\%$	1.1%	$0.3\%$	0.3%	0.3%	0.2%	
<b>Experiment No.</b>		4		5	6		
Displacement Media		Polymer-Surfactant Dual-Compound: 1 PV		Water 1.25 PV	<b>ASP:1 PV</b>		
Sample No.		7-008G		10-010F	10-010G		
Parameters	<b>Before</b> Displacement	After Displacement	<b>Before</b> Displacement	After Displacement	<b>Before</b> Displacement	After Displacement	
Total porosity	28.6%	22.0%	21.0%	19.3%	20.9%	13.4%	
Connected porosity	28.5%	21.7%	20.5%	18.6%	20.3%	11.5%	
Isolated porosity	$0.1\%$	$0.3\%$	$0.6\%$	0.7%	0.6%	1.9%	
Proportion of isolated pores	$0.4\%$	1.2%	2.8%	3.5%	3.0%	14.3%	

**Table 7.** Porosity change of total pores, connected pores and isolated pores after displacement.

<span id="page-11-1"></span>

**Figure 6.** Distribution of pore throat diameters before and after displacement experiments. Figures **Figure 6.** Distribution of pore throat diameters before and after displacement experiments. Figures from (**A**–**F**) correspond to the results of Experiment no.1 to no.6, respectively. The sample from (**A**–**F**) correspond to the results of Experiment no.1 to no.6, respectively. The sample petrophysical and experimental parameters are l[ist](#page-5-0)ed in Tables 1 and [2.](#page-5-1)

<span id="page-12-0"></span>

Figure 7. Multifractal features of sample 6-003 before and after displacement experiments. The left figures and table, including (A,B,E) are results of Experiment no.2 in which 1.25 PV water is injected while the right is for Experiment no.1 in which 50 PV water is injected. (A,B) CT images of sample 6-003G before and after displacement, respectively. (C,D) CT images of sample 6-003F before and after displacement, respectively. (E,F) Multifractal features of these CT images. The sample petrophysical and experimental parameters are listed in Tables 1 and 2. and experimental parameters are listed in Tables 1 and 2. and experimental parameters are listed in Tables [1](#page-5-0) and [2.](#page-5-1) 

<span id="page-12-1"></span>

Figure 8. Multifractal features of sample 7-008 before and after displacement experiments. The left figures and table, including (A,B,E) are results of Experiment no.3 in which 1.25 PV water is injected while the right is for Experiment no.4 in which 1 PV polymer-surfactant dual-compound system is injected. (A,B) CT images of sample 7-008F before and after displacement, respectively. (C,D) CT images of sample 7-008G before and after displacement, respectively. (**E**,**F**) Multifractal features of these CT images. The sample petrophysical and experimental parameters are listed in Tables [1](#page-5-0) and [2.](#page-5-1)

In the controlled Experiment no.6, ASP injection caused total porosity to decrease significantly from 20.9% to 13.4%, and connected porosity decreased from 20.3% to 11.5%. The relative proportion of isolated porosity increased from 3.0% to 14.3% (Table [7\)](#page-11-0). The proportion of pores with a diameter larger than 96.89 µm decreased while the proportion of small pores with a diameter under 69.21 µm increased (Figure [6F](#page-11-1)). In the multifractal analysis of the CT image, Δα increased from 0.7233 to 0.7615 and indicated that the distribution of pore radius became more heterogeneous after the ASP flooding (Figure [9F](#page-13-0)).  $a_{\text{source}} \sim \text{GFT}$ 

Overall, chemical flooding decreased porosity and increased the heterogeneity of pore structures. In Figure [10A](#page-14-0), the distribution of retained polymer in the space can be visualized in the digital core model. Some narrow "neck" connecting adjacent pores is blocked such as (a) in Figure [10C](#page-14-0). Large pores can be partially filled and divided into small pores just like (b) in Figure [10B](#page-14-0),C. Small pores around the large pore are wholly or partially filled as (c–e) in Figure [10B](#page-14-0),C. It can be concluded that the mechanism of chemical flooding's influence on pore structures is the blocking and filling of the residual polymer. Considering the above mechanism, choosing polymers that have suitable molecular residual polymer. Considering the above mechanism, choosing polymers that have suitable molecular size and structure is very important in EOR. filling of the residual polymer. Considering the above mechanism, choosing polymers that have summer inorderin

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**Figure 9.** Multifractal features of sample 10-010 before and after displacement experiments. The left **Figure 9.** Multifractal features of sample 10-010 before and after displacement experiments. The left figures and table, including  $(A,B,E)$  are results of Experiment no.5 in which 1.25 PV water is injected while the right is for Experiment no.6 in which 1 PV ASP is injected. (A,B) CT images of sample 10-010F before and after displacement, respectively. (C,D) CT images of sample 10-010G before and after displacement, respectively. (**E**,**F**) Multifractal features of these CT images. The sample petrophysical and experimental parameters are listed in Tables [1](#page-5-0) and [2.](#page-5-1)

#### 4.2.2. Multifractal Parameters before and after Multiphase Flooding

Multifractal analysis is used in 2D image analysis of both thin sections and CT images to describe microscopic heterogeneity of pores before and after multiphase flooding. The "heterogeneity of pores" we discussed with analysis of 2D pictures here is mainly the geometrical heterogeneity of pores and statistical heterogeneity of pore radius distribution.

<span id="page-14-0"></span>

no.6. Pore distribution model after ASP flooding. The area in green is pores and that in brownish-red is polymear rate ined in pores  $Pictures$  in  $(BC)$  are the same  $CT$  image hefore and efter  $\Delta SB$  flooding. polymesr retained in pores. Pictures in (B,C) are the same CT image before and after ASP flooding. Figure 10. Pore structure changes after the ASP displacement experiment. (A) The result of Experiment

Firstly, multifractal analysis of the 2D thin section image was made to describe the geometrical indicate the difference in pore structure heterogeneity of the reservoir sands. In  $f(\alpha)$ - $\alpha$  crossplot, the geometry of  $f(\alpha)$ - $\alpha$  curves of the samples 10-010 and 6-003 are similar while that of sample 7-008 is obviously different (Figure [11\)](#page-14-1). Quantitatively, the width and height of the curves are different. The width of  $\alpha$  (range of  $\alpha_{max}$ – $\alpha_{min}$ ) and maximum  $f(\alpha)$  of the samples all decrease in the order of samples 10-010, 6-003, and 7-008 (Figure [11\)](#page-14-1). heterogeneity of pores before flooding. The  $f(\alpha)$ - $\alpha$  crossplots and multifractal parameters in Figure 11

<span id="page-14-1"></span>

**Figure 11.** Multifractal features of pore structures calculated from thin sections.

Furthermore, multifractal analysis was made on the CT images of the samples before and after displacement experiments based on the multifractal theory in Section [3.4.2.](#page-7-0) According to the ranges of ∆α in Figure [11,](#page-14-1) heterogeneity of pore structures increase in the order of sample 7-008, 6-003 and 10-010. At the pore scale, multifractal features of CT images indicate heterogeneity of pore structures. The multifractal characteristics of six samples are demonstrated in Figures [7](#page-12-0)[–9.](#page-13-0) According to the data and curves from Figure [7](#page-12-0) to Figure [9,](#page-13-0) average  $\Delta \alpha$  of the three sample groups before displacement

experiments are 0.76175, 0.6838, and 0.8011, respectively, in the order of sample 6-003, 7-008 and 10-010. So the pore structure of sample 7-008 is the most homogeneous while that of 10-010 is the most heterogeneous. From either fractal or multifractal features mentioned above, it can be observed that the original pore structure heterogeneity of the samples on a multi-scale increase in the sequence of 7-008, 6-003, and 10-010.

Multifractal parameters change after the displacement experiments. For Experiment no.2 with 1.25 PV water injection, although the geometry of curves and the maximum *f*(α) before and after the experiments are similar, the ∆α decreases slightly after water flooding (Figure [7E](#page-12-0)). In Figure [7F](#page-12-0), it can be observed the two curves coincide when  $\alpha$  is in the range 1.80–2.30, and the curve before displacement is enclosed by that after displacement. It is obvious that  $\Delta \alpha$  increases after the experiment. The geometry of curves in the Figure [7F](#page-12-0), Figure [8E](#page-12-1),F and Figure [9F](#page-13-0) are similar such that the *f*(α)-α curves of samples after displacement are gentler and wider.

#### <span id="page-15-0"></span>**5. Conclusions**

This study presents an experimental investigation of the effects of water flooding and polymer flooding on the characteristics of pore systems including the distribution of pore radius and geometrical features of pores based on six high-porosity rocks. Firstly, the lithofacies and mineral components were described based on the drilling core observation and X-ray diffraction, which provides the basic geological information for the samples. Subsequently, the fractal dimension of pore structures of these samples was analyzed using the HMPI data, revealing the heterogeneity of the pore systems. Finally, the multifractal and geometric characteristics of pore structures of samples before and after the water and polymer flooding were calculated and compared to CT images. The findings of the study are as follows.

- (1) Although fractal analysis of HPMI, multifractal analysis of thin sections, and CT images are different in scale and information types, their results of heterogeneity analysis of pore structures are the same.
- (2) Water flooding changes petrophysics (e.g., porosity) and the distribution of the pore radius of reservoirs. For reservoirs with high porosity, water flooding of low water IPVR can improve reservoir quality slightly. Both total porosity and connected porosity increase somewhat after the flooding. The proportion of large pores increases and heterogeneity of pore radius distribution decreases. However, the water flooding of high water IPVR worsens the pore size and rock properties. The mechanism of the above phenomena in the study area is the change of matrix/grain moving during flooding.
- (3) On the other hand, polymer flooding has an adverse effect on the improvement of reservoir quality. First, total porosity and connected porosity decrease after the polymer flooding. Moreover, the relative proportion of small pores rises, and distribution of pore radius of reservoirs become more heterogeneous.

This study will help geologists understand the change in rock properties induced by water flooding and polymer flooding. Such a variation will affect the recovery rate from different IOR schemes.

**Author Contributions:** X.Z. designed the experiment, made fractal analysis, and write the original draft; C.L. validated the method and data; Y.W. processed the CT data; T.Z. made multifractal analysis; H.W. (Hongwei Wang) carried on the displacement experiment; H.W. (Hanwei Wang) and X.W. made thin section analysis; D.H. prepared the samples. All authors have read and agreed to the published version of the manuscript.

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