Research Article

Reservoir Characteristics of the Lower Silurian Longmaxi Shale in Zhaotong Region, Southern China

Chao Luo, Nanxin Yin, Hun Lin, Xuanbo Gao, Junlei Wang, and Hanqing Zhu

1Chongqing University of Science & Technology, Chongqing 401331, China
2Research Institute of Petroleum Exploration and Development, CNPC, Beijing 100083, China

Correspondence should be addressed to Chao Luo; lc_121989@163.com

Received 8 July 2020; Revised 24 July 2020; Accepted 31 July 2020; Published 25 August 2020

Copyright © 2020 Chao Luo et al. This is an open access article distributed under the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.

The lower Silurian Longmaxi Formation hosts a highly productive shale gas play in the Zhaotong region of southern China. According to core observation, X-ray diffraction analyses, and scanning electron microscopy (SEM) observations, the shale comprises primarily quartz, carbonate minerals, and clay minerals, with minor amounts of plagioclase, K-feldspar, and pyrite. The clay mineral content ranges from 15.0% to 46.1%, with an average of 29.3% in the Zhaotong region. Organic geochemical analyses show that the Longmaxi Formation has good potential for shale gas resources by calculating total organic carbon, vitrinite reflectance, and gas content. Scanning electron microscope images demonstrate that reservoir pore types in the Longmaxi shale include organic pores, interparticle pores, intercrystalline pores, intraparticle pores, and fractures. Reservoir distribution is controlled by lithofacies, mineral composition, and geochemical factors. In addition, we investigated the relationships between reservoir parameters and production from 15 individual wells in the Zhaotong region by correlation coefficients. As a result, the brittleness index, total organic carbon (TOC), porosity, and gas content were used to define high-quality reservoirs in the Longmaxi shale. Based on these criteria, we mapped the thickness and distribution of high-quality reservoirs in the Longmaxi Formation and selected highlighted several key sites for future exploration and development.

1. Introduction

Shale gas is one of the main forms of unconventional natural gas. It occurs within certain organic-rich shale and is generally present in an adsorbed or free state [1–4]. China was the third country to commercially develop shale gas, after the United States and Canada [5–7]. The Changning, Weiyuan, Zhaotong, and Fuling marine shale gas demonstration zones achieved a combined annual output of $79 \times 10^8$ m$^3$ in 2017 [8]. China has great potential for additional shale gas exploration, and the production of shale gas in the country is forecast to reach $800 \text{–} 1000 \times 10^8$ m$^3$ by 2030 [9].

Despite their production potential, shale gas reservoirs are often highly heterogeneous [10, 11] and have poor petrophysical properties [12–14]. Parameters such as shale thermal maturity, organic matter content, net thickness, burial depth, recoverable area, gas content, and Young’s modulus are used to describe shale gas reservoirs [15]. Hashmy et al. define high-quality unconventional gas reservoirs as having petrophysical properties that are conducive to good flow [16]. Zou et al. proposed criteria for evaluating unconventional gas reservoirs, including depositional environment, thermal evolution, pore and fracture development, and tectonic preservation condition [17]. Successful shale gas development is dependent on the discovery of high-quality reservoirs [18].

The shale gas well has low natural productivity in Longmaxi Formation, so it needs fracturing transformation to obtain higher production. Evaluation of high-quality reservoirs is the key to shale gas development in this area. The previous evaluation system analyzes the characteristics of high-quality reservoirs from the perspectives of shale rock [19], mineral [20], physical property [21], gas bearing [22], geochemistry [23], and resource potential [24], but the relationship between reservoir parameters and gas well production is rarely discussed. In this paper, we characterized the Longmaxi Formation’s shale gas reservoirs in the Zhaotong region of the Sichuan Basin, southern China, by...
core observation, X-ray diffraction analyses, and scanning electron microscopy (SEM) observations. As a result, we quantified the reservoir properties of Longmaxi Formation and selected the best parameters for shale gas reservoir evaluation. Our results provide a theoretical framework to support future shale gas exploration and development in southern China and similar regions elsewhere.

2. Regional Geological Setting

The Sichuan Basin, in southwestern China, contains petroferous deposits that can be found over an area of approximately \(26 \times 10^4 \text{ km}^2\). The Sichuan Basin is bounded by the Longmenshan Fault to the west, the Chengkou–Fangxian and Xiangguang faults to the north, and the Shizong–Mile and Danchi–Du’an faults to the south (Figure 1). The Zhao-tong region lies to the south of the Chuanann fold belt in the southern Sichuan Basin [25].

Southern China experienced intense tectonic compression in the Late Ordovician–Early Silurian [26]. As the Paleo-Tethys Ocean subducted during the Early–Middle Ordovician, the northern Yangtze Cratonic Basin shrank [27]. Moderate bathymetric uplift drove a transition from marine to restricted marine conditions at this time [28]. In the Sichuan Basin’s hypoxic deep-water shelf environment, the moderately uplifted bathymetry, low-energy conditions, and low-sedimentation rate allowed for the accumulation of thick, widespread marine shale. This marine shale sequence includes the black graptolitic shale of the Longmaxi Formation [29]. Gamma values in the Sichuan Basin shale sequence peak in the Wufeng Formation (at the Ordovician–Silurian transition), before gradually decreasing upward. The Longmaxi shale is an important source rock in the Sichuan Basin [30, 31], where it is widespread and 55–516 m in thickness. The Longmaxi shale is divided into two parts from bottom to top: the lower part is rich in organic matter and graptolites, and is the main gas-producing layer; the upper part is a thick succession of silty shale, which formed in a shallow-water sandy shelf environment.

3. Database and Methodology

This study utilized 221.98 m of 3 cores, 132 slices of core, X-ray diffraction data from 52 samples, source rock data from 91 samples (vitrinite reflectance, TOC, and macerals), scanning electron microscopy (SEM) observations from 72 samples, and porosity-permeability measurements from 32 samples.

Powdered shale samples were analyzed for TOC content using a LECO CS-230 carbon-sulfur analyzer at 25°C and 30% humidity. Vitrinite reflectance \(R_v\) was measured using a Zeiss mpv-sp microphotometer. An X’Pert Pro X-ray diffractometer was used to determine the mineralogical compositions and clay fractions. These three tests were conducted at the State Key Laboratory of Oil and Gas Reservoir Geology and Exploration at the Southwest Petroleum University in Chengdu, China.

Twelve samples were selected to investigate the shale pore types and morphologies. The analyses were conducted using a FEI Quanta 200F field emission scanning electron microscope (FE-SEM) at the State Key Laboratory of Petroleum Resources and Prospecting at the China University of Petroleum in Beijing. The samples were treated with an argon ion profile and an ion sputtering coating. Imaging was carried out at 24°C and 35% humidity. The scanning electron microscope was used to determine the microscopic pore structure characteristics (morphology, types, and distribution) of the shale samples [32].

A nitrogen adsorption experiment was carried out at \(-196°C\) using a Quadrasorb SI specific surface analyzer. Before the experiment, samples were degassed for 20 hours under vacuum at a temperature of 110°C.

4. Results

4.1. Mineralogy. X-ray diffraction analyses show that the shale mineralogies include quartz, feldspar, calcite, dolomite, pyrite, and clay. Quartz is the most abundant mineral, with an average content of 30.50%. The average contents of calcite and dolomite are 17.24% and 14.12%, respectively. The clay mineral content ranges from 15.0% to 46.1%, with an average of 29.3%. The clay mineral compositions include mainly illite (49%–73%, with an average of 54.0%) and chlorite (8%–28%, with an average of 15.4%), followed by illite/montmorillonite (12%–41%, with an average of 28.8%) (Table 1). The brittleness index is the sum of the quartz and feldspar contents. The brittleness index of sample ZT1-4 is the highest (0.499), and the brittleness index of sample ZT1-2 is the lowest (0.139).

4.2. Lithology. The Longmaxi Formation is approximately 50–200 m thick in the Zhaotong region. Six main lithofacies were identified from the 221.98 m Longmaxi Formation core: siliceous shale, carbonaceous shale, calcareous shale, silty shale, gray mudstone, and muddy siltstone (Figure 2).

The siliceous shale from the Longmaxi core is laminated and dark in color. A high content of cryptocrystalline silica makes this facies very hard overall, and the covering area of graptolite content is generally <30%. The carbonaceous shale is foliated with a large amount of carbonized organic matter and a high TOC content. The most abundant minerals are quartz, clays, feldspar, pyrite, and calcite. The calcareous shale has well-developed horizontal bedding and a high calcite content. The graptolite coverage area is generally <10%. The silty shale contains dark, organic-rich clay and lighter particles of quartz, feldspar, and other detritus. Detrital particles account for 25%–45% of the total mineralogy. The gray mudstone has a light gray color and is composed of clay minerals with fine silt. The muddy siltstone contains clastic particles of quartz and feldspar, with horizontal to wavy bedding.

The siliceous and carbonaceous shales formed in a reducing, deep-water environment. These lithofacies are found in the lower part of the Longmaxi Formation, where the deep-water shelf environment was conducive to the deposition of source rocks. The TOC content of these lithofacies is >2%, which is favorable for shale gas. Calcareous shale, silty shale, gray mudstone, and argillaceous siltstone mainly occur in the upper part of the Longmaxi Formation. The upper part of the formation was deposited in a shallow shelf environment, and
Figure 1: Continued.
it records the gradual transition from anoxic, reducing conditions to oxygen-rich, oxidizing conditions. Preservation potential for organic matter was poor, so the organic carbon content of these deposits is <2%.

4.3. Organic Geochemical Characteristics

4.3.1. TOC. The TOC content of the Longmaxi shale reaches a maximum of 4.79 wt.%, with an average of 2.76 wt.%. The TOC content varies according to lithofacies, with siliceous shale and carbonaceous shale having the highest TOC contents. There is also a gradual upward-decreasing trend in TOC content in the lower part of the Longmaxi shale.

4.3.2. Thermal Maturity. Vitrinite reflectance ($R_o$) values for the Longmaxi shale are between 1.95% and 3.13%, with an average of 2.48%. The $R_o$ values indicate that the source rock is highly mature and that it has reached the hot gas window.

4.3.3. Gas Content. Core analyses indicate that the adsorbed gas content of Longmaxi shale is 1.6–2.1 m$^3$ t$^{-1}$. Previous studies have shown that the adsorbed gas content of shale is positively correlated with TOC content [33]. This is due to the strong adsorption potential of gas on organic compounds [34]. In shales, large amounts of gas can be adsorbed on the surface of kerogen, so high TOC contents can indicate large gas volumes and high adsorption capacity for shale gas. Shale gas content is also affected by mineral composition, porosity, and other factors [35].

4.4. Reservoir Storage Space. Pores form the main reservoir space in shales. Scanning electron microscope images reveal
### Table 1: Mineralogy of shale samples from the Zhaotong region.

<table>
<thead>
<tr>
<th>Sample ID</th>
<th>TOC (%)</th>
<th>$R_o$ (%)</th>
<th>Quartz (%)</th>
<th>K-feldspar (%)</th>
<th>Plagioclase (%)</th>
<th>Calcite (%)</th>
<th>Dolomite (%)</th>
<th>Pyrite (%)</th>
<th>Clay (%)</th>
<th>I/S</th>
<th>I</th>
<th>K</th>
<th>C</th>
</tr>
</thead>
<tbody>
<tr>
<td>ZT1-1</td>
<td>2.15</td>
<td>2.46</td>
<td>12.1</td>
<td>0.8</td>
<td>1.6</td>
<td>29.3</td>
<td>21.2</td>
<td>1.7</td>
<td>33.3</td>
<td>12</td>
<td>73</td>
<td>2</td>
<td>13</td>
</tr>
<tr>
<td>ZT1-2</td>
<td>2.56</td>
<td>2.64</td>
<td>11.5</td>
<td>0.7</td>
<td>1.7</td>
<td>19.8</td>
<td>15.4</td>
<td>4.8</td>
<td>46.1</td>
<td>22</td>
<td>64</td>
<td>2</td>
<td>12</td>
</tr>
<tr>
<td>ZT1-3</td>
<td>3.31</td>
<td>2.47</td>
<td>37.2</td>
<td>0.6</td>
<td>4.9</td>
<td>19</td>
<td>17.4</td>
<td>2.4</td>
<td>18.5</td>
<td>41</td>
<td>49</td>
<td>1</td>
<td>9</td>
</tr>
<tr>
<td>ZT1-4</td>
<td>4.15</td>
<td>2.51</td>
<td>48.3</td>
<td>0.8</td>
<td>0.8</td>
<td>8.7</td>
<td>15.6</td>
<td>3.5</td>
<td>22.3</td>
<td>41</td>
<td>50</td>
<td>1</td>
<td>8</td>
</tr>
<tr>
<td>ZT1-5</td>
<td>4.79</td>
<td>2.59</td>
<td>28.9</td>
<td>0.9</td>
<td>4</td>
<td>13</td>
<td>15.8</td>
<td>6</td>
<td>31.4</td>
<td>28</td>
<td>58</td>
<td>2</td>
<td>12</td>
</tr>
<tr>
<td>ZT1-6</td>
<td>2.31</td>
<td>1.95</td>
<td>37.9</td>
<td>1.1</td>
<td>9.5</td>
<td>7.4</td>
<td>4.8</td>
<td>4</td>
<td>35.3</td>
<td>26</td>
<td>51</td>
<td>2</td>
<td>21</td>
</tr>
<tr>
<td>ZT1-7</td>
<td>3.13</td>
<td>2.02</td>
<td>29.3</td>
<td>1.6</td>
<td>4.2</td>
<td>9.9</td>
<td>5.9</td>
<td>3.2</td>
<td>45.9</td>
<td>23</td>
<td>52</td>
<td>2</td>
<td>23</td>
</tr>
<tr>
<td>ZT1-8</td>
<td>1.17</td>
<td>2.42</td>
<td>34.2</td>
<td>1.3</td>
<td>8.1</td>
<td>12.3</td>
<td>4.5</td>
<td>1.3</td>
<td>38.3</td>
<td>26</td>
<td>51</td>
<td>2</td>
<td>21</td>
</tr>
<tr>
<td>ZT1-9</td>
<td>1.88</td>
<td>2.49</td>
<td>30.4</td>
<td>3.1</td>
<td>9.3</td>
<td>16.6</td>
<td>5</td>
<td>3.1</td>
<td>32.5</td>
<td>18</td>
<td>54</td>
<td>2</td>
<td>26</td>
</tr>
<tr>
<td>ZT1-10</td>
<td>0.91</td>
<td>2.35</td>
<td>37.9</td>
<td>4.6</td>
<td>6.5</td>
<td>12</td>
<td>3.9</td>
<td>0.6</td>
<td>34.5</td>
<td>20</td>
<td>50</td>
<td>2</td>
<td>28</td>
</tr>
<tr>
<td>ZT1-11</td>
<td>3.35</td>
<td>3.13</td>
<td>17.9</td>
<td>0.9</td>
<td>2.3</td>
<td>36.5</td>
<td>23.1</td>
<td>2.7</td>
<td>16.6</td>
<td>32</td>
<td>53</td>
<td>2</td>
<td>13</td>
</tr>
<tr>
<td>ZT1-12</td>
<td>0.86</td>
<td>2.41</td>
<td>24.3</td>
<td>0.9</td>
<td>6.1</td>
<td>31.4</td>
<td>21.5</td>
<td>0.8</td>
<td>15</td>
<td>32</td>
<td>52</td>
<td>2</td>
<td>14</td>
</tr>
<tr>
<td>ZT1-13</td>
<td>3.17</td>
<td>2.59</td>
<td>41.8</td>
<td>0.8</td>
<td>4.6</td>
<td>16.4</td>
<td>14.9</td>
<td>2</td>
<td>19.5</td>
<td>37</td>
<td>52</td>
<td>1</td>
<td>10</td>
</tr>
<tr>
<td>ZT1-14</td>
<td>3.47</td>
<td>2.43</td>
<td>35.1</td>
<td>0.7</td>
<td>5.5</td>
<td>13.7</td>
<td>20.1</td>
<td>2.2</td>
<td>22.7</td>
<td>38</td>
<td>50</td>
<td>2</td>
<td>10</td>
</tr>
<tr>
<td>ZT1-15</td>
<td>4.16</td>
<td>2.67</td>
<td>30.7</td>
<td>1.1</td>
<td>1.2</td>
<td>12.6</td>
<td>22.7</td>
<td>4.4</td>
<td>27.3</td>
<td>36</td>
<td>51</td>
<td>2</td>
<td>11</td>
</tr>
</tbody>
</table>

**Figure 2:** Shale facies of the Longmaxi Formation in the Zhaotong region: (a) carbonaceous shale; (b) siliceous shale, dark in color and hard, with a high SiO$_2$ content; (c) calcareous shale, contains high angle fractures that are filled with calcite; (d) silty shale, light layers contain mainly quartz and feldspar, while the dark layers contain high clay and organic matter contents; (e) gray mudstone, light gray in color; (f) muddy siltstone, displays wavy to horizontal bedding.
Figure 3: Continued.
several pore types in the Longmaxi shale samples, including organic pores, intercrystalline pores, intraparticle (intrap) pores, and interparticle (interp) pores (Figure 3). The organic pores are widely developed in the shale and formed during the later stages of thermal evolution. When source rocks reach the threshold for hydrocarbon generation, pores form in the organic matter as hydrocarbons are produced and expelled. The organic pores generally have laminar, pitted, ellipsoidal, polygonal, and irregular shapes. Organic pore sizes are highly variable in the Longmaxi shale, ranging from 10 to 1500 nm. These pore sizes are medium–large and can develop within both nanoscale and microscale organic matter (Figures 3(a) and 3(j)). Interparticle pores and intraparticle dissolved pores are both considered intergranular pores and mainly formed via late diagenetic processes, though there are a few primary interparticle pores (Figures 3(b), 3(d), 3(e), and 3(i)). Pyrite intercrystalline pores are widely developed in the shale [36]. When pyrite aggregates are partially dissolved, the resulting pores are filled with organic matter and newer pyrite crystals [37–42]. The organic matter in the Longmaxi shale is often coated with pyrite particles. Calcite and dolomite intraparticle dissolved pores are relatively small and rare (Figures 3(c) and 3(f)) in the Longmaxi shale. The dissolved pores appear to be complete, and there is no evidence of extrusion deformation, which indicates that they formed during burial.

4.5. Reservoir Properties. The Longmaxi shale has porosities between 0.83% and 6.70%, with an average of 4.70%. The permeability is very low, ranging from 0.0028 to 0.0417 μD, with an average of 0.0176 μD. The specific surface area is between 1.72 and 29.31 m² g⁻¹, with an average value of 9.88 m² g⁻¹. The throat radius values range from 3.0 to 19.8 nm, with an average of 7.5 nm. The total pore volumes of the Longmaxi shale range from 49 to 388 × 10⁻³ ml g⁻¹, with an average of 93.70% from 15.2 to 37.4 × 10⁻⁴ ml g⁻¹, with an average of 5.8 × 10⁻⁴ ml g⁻¹. Mesopore volumes are distributed between 41.4 and 287.0 × 10⁻³ ml g⁻¹, with an average of 110.0 × 10⁻⁴ ml g⁻¹. Micropores, mesopores, and macropores (>50 nm) constitute 4.70%, 89.43%, and 5.87% of the total pore volume, respectively, indicating that mesopores are dominant in the Longmaxi shale.

5. Discussion

5.1. Selection of Parameters for Reservoir Evaluation. We used well data from the Zhaotong region to investigate the relationships between reservoir parameters and gas production from the Longmaxi Formation. We used open-flow productivity data from 15 wells, which had each been fractured by similar amounts prior to measurement. Reservoir parameters have different effects on gas production from shale, and these effects can be determined using correlation coefficients.

We used correlation coefficients to determine the importance and effect of each input and output index. We let the input index terms be \( X_1, X_2, \ldots, X_m \). The greater the correlation coefficient between the input index \( X_i \) and the output index, the stronger the relationship between \( X_i \) and the output index. The correlation coefficient \( R_i \) is defined as

\[
R_i = \frac{\text{Cov}(X_i, Y)}{\sqrt{D(X_i)} \sqrt{D(Y)}}. \tag{1}
\]

Mud, silica, calcium, organic matter, and kerogen contents, thermal maturity, total porosity, gas saturation, and pore pressure gradient were selected as input indices, and gas production was used as the output index. The parameters that were used to evaluate reservoir properties were selected using the correlation coefficient \( R_c \). The controlling geological parameters will vary between different shale gas reservoirs.

We used logged cores from the Zhaotong region to extract parameters such as mud content, brittleness index, silica content, calcium content, TOC, kerogen content, total porosity, gas saturation, pore pressure gradient, and \( R_c \). The total gas content is expressed as the actual gas production after fracturing. By studying the correlation coefficients between these
reservoir parameters and gas production, we found that the brittleness index, TOC, porosity, and gas content have the strongest influence on gas production, with correlation coefficients > 0.35, while $R_p$, pore pressure gradient, argillaceous content, siliceous content, and calcium content have little effect on gas production, with correlation coefficients < 0.35.

By analyzing shale gas reservoir parameters in the Zhaotong area, we determined that the brittleness index, TOC, porosity, and gas content are the most influential parameters for gas production (and therefore reservoir quality). The highest observed correlation coefficients were between brittleness index and gas production (0.6426), followed by TOC and gas production (0.5776); correlation coefficients between porosity and gas production (0.4951) and gas content and gas production (0.3698) were lower. The correlation coefficients reveal that the most influential parameters on gas production are brittleness index $>$ TOC $>$ porosity $>$ gas content (Figure 4).

5.2. High-Quality Reservoir Definition and Distribution. The evaluation criteria for shale reservoirs in the Zhaotong region include TOC, gas content, porosity, and brittle mineral index. We have shown that these are the four key parameters that influence shale gas production. To be considered high-quality reservoirs in the Longmaxi Formation should meet the following criteria: TOC $>$ 4%, gas content $>$ 4 $\text{m}^3 \text{t}^{-1}$, porosity $>$ 5%, and brittleness index $>$ 0.45 (Table 2).

The shale in the upper part of Longmaxi Formation was deposited on a shallow-water sandy shelf. Shale deposition in this environment was discontinuous, and it is therefore unlikely that the shale forms effective reservoirs for industrial exploitation. We mapped the thickness of high-quality reservoirs in the lower Longmaxi Formation using the identification criteria described above. Our results show that the next phase of shale gas exploration and development should focus on the northern and central parts of the study area (Figure 5).

6. Conclusions

In this study, reservoir characteristics of the lower Silurian Longmaxi shale were analyzed in the Zhaotong region, southern China. Some important findings are summarized as follows:

1. The Longmaxi shale contains six main lithofacies: siliceous shale, carbonaceous shale, calcareous shale, silty shale, gray mudstone, and muddy siltstone. The concentration of brittle minerals is high, which is conducive to the formation of natural and artificial fractures

<table>
<thead>
<tr>
<th>Key parameters</th>
<th>Criteria</th>
</tr>
</thead>
<tbody>
<tr>
<td>TOC</td>
<td>$&gt;4%$</td>
</tr>
<tr>
<td>Gas content</td>
<td>$&gt;4 \text{ m}^3 \text{ t}^{-1}$</td>
</tr>
<tr>
<td>Porosity</td>
<td>$&gt;5%$</td>
</tr>
<tr>
<td>Brittleness index</td>
<td>$&gt;0.45$</td>
</tr>
</tbody>
</table>

Figure 4: Longmaxi shale gas reservoir parameters and gas production in the Zhaotong region: (a) brittleness index; (b) TOC; (c) porosity; (d) gas content.

Table 2: Identification criteria for high-quality reservoirs in the Zhaotong region.
Geochemical analyses (TOC, $R_o$, and gas content) show that the Longmaxi shale has good potential for shale gas resources. The primary reservoir space consists of organic pores, intercrystalline pores, interparticle pores, and intra-particle pores. Most of the pores are 2–50 nm in size (mesopores). Open-flow production data were used to investigate the relationships between various reservoir index parameters and gas production from the Longmaxi Formation.

Data from fifteen wells in the Zhaotong region were used, and each had experienced a similar amount of fracturing. The results show that TOC, gas content, porosity, and brittleness index are the most influential parameters for shale gas production from the Longmaxi Formation. We propose that high-quality Longmaxi shale gas reservoirs in the Zhaotong region should be defined using the following criteria: TOC $> 4\%$, gas content $> 4 \text{ m}^3 \text{ t}^{-1}$, porosity $> 4\%$, and brittleness index $> 0.45$.

Our mapping of the high-quality Longmaxi shale gas reservoirs in the Zhaotong region indicates that the next phase of exploration and development should focus on the northern and central parts of the study area.

**Abbreviations**

<table>
<thead>
<tr>
<th>Symbol</th>
<th>Description</th>
</tr>
</thead>
<tbody>
<tr>
<td>$X_i$</td>
<td>Input index</td>
</tr>
<tr>
<td>$m$</td>
<td>Number of parameters</td>
</tr>
<tr>
<td>$R_i$</td>
<td>Correlation coefficient of single factor</td>
</tr>
</tbody>
</table>

Covariance of cov ($x, y$): $x$ and $y$
Variance of $D(x)$: $x$
Variance of $D(y)$: $y$
$R_o$: Vitrinite reflectance
$R^2$: Correlation coefficient.

**Data Availability**

The data used to support the findings of this study are available from the corresponding author upon request.

**Disclosure**

The findings achieved herein are solely the responsibility of the authors.

**Conflicts of Interest**

The authors declare that they have no conflicts of interest.

**Acknowledgments**

This study was financially supported by the National Science Technology Major Project (No. 2016ZX05015), Petro-China Innovation Foundation (No. 2019D-5007-0210), National Natural Science Foundation of China (Grant No.51904050), Chongqing Natural Science Foundation Project (Nos. cstc2019jcyj-msxmX0725 and cstc2019jcyj-msxmX045), and Science and Technology Research Program of Chongqing Municipal Education Commission (Grant No. KJQN201901531).
References


[27] X. Liang, G. Wang, Z. Xu et al., “Comprehensive evaluation technology for shale gas sweet spots in the complex marine mountains, South China: a case study from Zhaotong national


