## A NEW THEORETICAL MODEL FOR GUIDING THE GAS EXTRACTION IN COAL MINES

#### by

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Based on the fractal-percolation properties, the equivalent permeability analysis of 3-D discrete fracture network models are investigated and analyzed for the first time. The 3-D fractal dimension was calculated with the 3-D fracture density, the mean major axis of fracture and the aspect ratio of major to minor axis. The reconstructed mining-induced fracture network model was used to validate that the correlation between the predicted and actual results is very strong in a sense. The equivalent permeability results can be adopted to guide the gas extraction in coal mines.

Key words: gas extraction, 3-D discrete fracture network, fracture density, percolation-fractal properties, equivalent permeability analysis

#### Introduction

The method of discrete fracture network (DFN) generation is one of the basic approaches proposed to model the transport properties in fracture reservoirs. An accurate estimation of the fracture network permeability is an important and crucial task. However, it is still a challenge to conduct fluid flow prediction even though numbers of extensive works were carried out on characterizing fractured rocks over the last years [1]. By means of relating the fracture network properties to fluid flow process, it may be an effective way to achieve the permeability estimation.

As for the reconstructed DFN model, the geometrical parameters, such as the fracture length, size, shape, density, aperture and orientation, are the fundamental data of DFN modeling. For example, the hypothesis that fractures are parallel to each other with the planar shape of disks or parallelograms and generated the Poisson disc model was proposed in [2]. The 3-D DFN reconstruction with geometrical parameters collecting from the field borehole test was achieved in [3]. The geometrical parameters for controlling the fracture network permeability were reported in [4]. The hydraulic properties of fractured rock mass, when distributed fracture aperture was correlated with fracture trace length, were studied in [5]. With the increasing of fracture length and density, the connectivity of fracture network increases [6]. The fracture permeability would reduce due to the perpendicular fractures to the direction of the flow [7].

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Natural fracture patterns present the fractal characteristics [8]. The fractal dimension (FD) shows the tendency of an object to spread or fill in the space and to describe the complexity of fracture network, see [9] and the reference therein. The percolation theory also is a powerful concept for analyzing the transport properties of random systems [4]. The equivalent permeability of 2-D fracture network can be strongly correlated to different impact parameters [10]. In the 3-D case, the fracture network properties were considered. For example, the 3-D model containing the 2-D fracture planes with power-law size distribution uniformly located in the space was studied in [11]. The percolation threshold and permeability of anisotropic 3-D fracture network was suggested in [12]. In order to handle the real-world engineering problems in mining rocks, it is necessary to develop a practical and easy technique to estimate the anisotropic fractal-percolation properties of the 3-D DFN model. Owing to motivation by the previous results, the main aims of this manuscript is to study the fractal-percolation properties and to establish the 3-D DFN model for mining fracture network reconstructed to conduct the equivalent permeability analysis.

#### The FD and Percolation theory

The fractal theory developed by Mandelbrot [13] is usually considered as one important method to describe different synthetic and natural fractal objects. Box counting is the traditional and typical method to measure FD of fractures [10]. The 2-D measuring window (MW) can be with different orientation. A series of square-boxes ( $r \times r$ ) or cube-boxes ( $r \times r \times r$ ) are used to cover the fractures in measured window (MW) or measured cube (MC). The number of square-boxes or cube-boxes accords the following relationship [14]:

$$N(r) \propto r^{-D} \tag{1}$$

where N(r) is the number of square-boxes or cube-boxes covering the fractures, r – the square or box size, and D is the value of FD.

A practical and general mathematical way to describe its connectivity, conductivity, and permeability was considered in [15]. Assuming that some sites or bonds are open to flow with a probability, p, a smaller p means a smaller connected occupied site (called an isolated cluster), and a higher p means a bigger connected occupied site. As the probability increasing to a particular value known as the percolation threshold,  $p_c$ , the connected occupied sites will connect two opposite boundaries together, see, e. g., [4]. There exists a simple analytical term known as power law [16]:

$$P(p) \propto (p - p_c)^{\mu} \quad p > p_c \tag{2}$$

where P(p) is the probability that a bond or a site connects to the spanning cluster in the domain and  $\mu$  is an exponent depending on the dimensionality of the domain not the lattice characteristics.

In the continuum percolation, some research, see, *e. g.*, [15], has assumed that there is a similar relationship between the effective permeability of a fractured matrix and percolation characteristics with eq. (2):

$$K_{\rm eff} \propto \left(p - p_c\right)^{\mu} \tag{3}$$

where  $K_{\text{eff}}$  is the effective permeability. As displayed in fig. 1, four 2-D MW in the 3-D fracture network system are chosen to study the anisotropic characteristics based on the fractal and statistical properties. The domain normal to X, Y, and Z axis are noted as MW1, MW2, and MW3, respectively. The domain parallel to the average orientation of fractures is noted as MW4. The 2-D FD ( $D_{2D}$ ) each MW is noted as the non-dimensional equation of the form:

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$$D_{2D-(\perp X, \perp Y, \perp Z, l')} \propto \left( p_{(\perp X, \perp Y, \perp Z, l')} - p_c \right)^{\mu_{(\perp X, \perp Y, \perp Z, l')}}$$
(4)

where  $D_{2D(\perp X,\perp Y,\perp Z,l')}$  is the FD of MW with different directions,  $p_{(\perp X,\perp Y,\perp Z,l')} - p_c$  is the difference between the occupancy probability with different direction and percolation threshold, and  $\mu_{(\perp X,\perp Y,\perp Z,l')}$  is a universal exponent with different direction.

Generally, the excluded area of 2-D fractures can be described by the following expression [17]:

$$A_{\rm ex} = \frac{2}{\pi} l^2 \tag{5}$$

where  $A_{ex}$  is the excluded area and *l* is the fracture length. This equation is applied for isotropic case. However, the fracture length in this 3-D model is not a constant. To consider the anisotropic case, the average fracture



Figure 1. The different MW for fractal-percolation analysis

length  $\vec{l}$  of each domain is used when analyzing  $A_{ex}$  of each MW.

The 2-D fracture density  $\rho_{2D}$  of a MW is given by [12]:

$$\rho_{2D} = \frac{N_{fr}}{S} \tag{6}$$

where  $N_{fr}$  is total fracture numbers in the domain area and S is the area of the domain.

$$\rho_{2D}' = \rho_{2D} A_{\rm ex} \tag{7}$$

# Fractal properties of 3-D DFN models with different parameters

A method for the DFN generation based on the borehole monitoring can obtain orientation of fracture and the fracture number of different intersection type on borehole wall [3]. The structural homogeneity zone, the number of fracture, the volume density frequency and the 3-D probability distribution of fracture are determined by the MATLAB Toolbox RJNS<sup>3D</sup> and Dips. Three parameters based on the field statistics and connect to the real fracture network are considered to evaluate the fractal properties of 3-D DFN models, including 3-D fracture density (denoted by  $\rho_{3D}$ , change from 0.005, 0.010, 0.015 to 0.020), the mean major axis of fracture (denoted by  $\mu_a$ , change from 10, 15, 20 to 25) and the aspect ratio of major to minor axis (denoted by K, change from 1, 3, 5 to 7). The standard deviation  $\sigma_a$ , the dip direction  $\alpha$ , and the dip angle  $\beta$  are 1, 135°, and 45°, respectively. Now, the square-box size is changing from 4, 2, 1, 0.5, to 0.25 m and the cube-box size is changing from 2.5, 2, 1.5, 1, to 0.5 m. From eq. (1), the fractal properties of 48 calculating patterns are displayed in fig. 2. If  $\rho_{3D}$  and  $\mu_a$  are constants, and  $\mu_a$  is higher, then 3-D FD (denoted by  $D_{3D}$ ) is smaller, as displayed in fig. 3(a). If  $\rho_{3D}$  and K are constant (or  $\mu_a$  and K remain stable), and  $\mu_a$  (or  $\rho_{3D}$ ) are higher,  $D_{3D}$  is larger, as shown in figs. 3(b) and 3(c). If K is larger, then the fractures are relatively slender. Compared between the conditions, the later shows a less advantage for the generation of the complex fracture network. In the case, the fractal relationship can be written:

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Figure 2. Anisotropic characteristics of DFN models with different MW



$$D_{3D} \propto \rho_{3D}, \ \mu_a, \ \frac{1}{K} \tag{8}$$

#### The anisotropic percolation: fractal properties of a 3-D DFN model

The percolation and fractal properties related with the permeability are relatively easy to get from the field statistics or DFN models. Here, eight new DFN model numbered 49 to 56 were investigated. Other parameters of 49-52 patterns are the fracture lengths in the mean major axis are, respectively, 30 for 49-52 patterns and 25 for 53-56 patterns, the standard deviation of fracture length is 1, the dip direction is 135°, the dip angle is 45°, and the aspect ratio of major to minor axis is 2. The difference between dimensionless density and dimensionless percolation threshold, denoted by  $\rho'_{2D} - \rho'_{2D-c}$ , islisted in tab. 1. The dimensionless percolation threshold, denoted by  $\rho'_{2D-c}$ , is 3.6 [4].

As presented in fig. 2, MW1, MW2, and MW3 show the differences with three principal directions of DFN models. The MW4 takes the orientation of the fractures into consideration. The 2-D FD (denoted by  $D_{2D}$ ) and  $\rho'_{2D} - \rho'_{2D-c}$  of MW are regarded as the evaluation index of anisotropic characteristics. With the increasing of 3-D fracture density (denoted by  $\rho_{3D}$ ),

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51-MW1

51-MW2

51-MW3

51-MW4

52-MW1

52-MW2

52-MW3

52-MW4 0.020

0.015

0.015

0.015

0.015

0.020

0.020

0.020

0.426

0.438

0.338

0.254

0.594

0.572

0.420

0.303

24.091

25.527

25.843

9.680

32.741

29.039

27.955

14.002

No.	$ ho_{ m 3D}$	$\rho_{2\mathrm{D}}$	$\rho'_{2D}$	$\rho'_{2D} - \rho'_{2D-c}$	No.	$ ho_{ m 3D}$	$ ho_{ m 2D}$	$\rho'_{2D}$	$\rho'_{2D} - \rho'_{2D-p}$
49-MW1	0.005	0.158	9.745	6.145	53-MW1	0.005	0.121	4.803	1.203
49-MW2	0.005	0.160	9.460	5.860	53-MW2	0.005	0.137	4.870	1.270
49-MW3	0.005	0.113	11.088	7.488	53-MW3	0.005	0.104	5.843	2.243
49-MW4	0.005	0.104	6.544	2.944	53-MW4	0.005	0.066	3.346	-0.254
50-MW1	0.010	0.291	17.391	13.791	54-MW1	0.010	0.234	9.504	5.904
50-MW2	0.010	0.320	17.745	14.145	54-MW2	0.010	0.244	9.565	5.965
50-MW3	0.010	0.227	14.287	10.687	54-MW3	0.010	0.186	12.119	8.519
50-MW4	0.010	0.193	8.825	5.225	54-MW4	0.010	0.143	5.819	2.219

20.491

21.927

22.243

6.080

29.141

25.439

24.355

10.402

Table 1. The computational results of percolation properties for 49 to 56 patterns

both  $D_{2D}$  and  $\rho'_{2D} - \rho'_{2D-c}$  of each MW are increasing gradually. However, an obvious difference occurs among four MW illustrated in fig. 2(a).  $\rho'_{2D} - \rho'_{2D-c}$  of MW1, MW2, and MW3 is much larger than that of MW4.

55-MW1

55-MW2

55-MW3

55-MW4

56-MW1

56-MW2

56-MW3

56-MW4 0.020

0.336

0.346

0.254

0.201

0.520

0.482

0.361

0.313

0.015

0.015

0.015

0.015

0.020

0.020

0.020

13.310

12.380

15.313

8.044

21.396

19.391

23.960

10.009

As shown in fig. 4,  $D_{2D}$  is plotted against  $\rho_{3D}$  and  $\rho'_{2D} - \rho'_{2D-e}$ . Due to the result [12], the equations for the different MW are presented in tab. 2. If  $\rho_{3D}$  can be determined, we can select the particular equation to evaluate the  $D_{2D}$  of MW in different directions, and present directly the feedback of the anisotropic characteristics of 3-Dreconstructed DFN models. Obviously, our method can provide a feasible approach to conduct the quantitatively analysis of the 3-D DFN.

Following the calculation of the patterns,  $D_{3D}$  is presented:

$$D_{3D} = -0.0230 \ln \left( \dot{\rho_{2D-\perp X}} - \dot{\rho_{2D-c}} \right) - 0.0303 \ln \left( \dot{\rho_{2D-\perp Y}} - \dot{\rho_{2D-c}} \right) \cdot \\ \cdot 0.1254 \ln \left( \dot{\rho_{2D-\perp Z}} - \dot{\rho_{2D-c}} \right) + 0.0775 \ln \left( \dot{\rho_{2D-\perp Y}} - \dot{\rho_{2D-c}} \right) + 2.5351 \\ \text{or} \quad 0.1132 \ln (\rho_{3D}) - 0.5178 \ln \left( \dot{\rho_{2D-\perp X}} - \dot{\rho_{2D-c}} \right) + 0.3116 \ln \left( \dot{\rho_{2D-\perp Y}} - \dot{\rho_{2D-c}} \right) + \\ + 0.0626 \ln \left( \dot{\rho_{2D-\perp Z}} - \dot{\rho_{2D-c}} \right) + 0.2465 \ln \left( \dot{\rho_{2D-\parallel Y}} - \dot{\rho_{2D-c}} \right) + 3.3327$$

The structure relationship between  $D_{2D}$  and  $D_{3D}$  is given:

$$D_{3D} = 16.4444 D_{2D-\perp X} - 2.7176 D_{2D-\perp Y} - 5.3141 D_{2D-\perp Z} - 7.1035 D_{2D-1/} - 0.7320$$
(10)

We notice that the subscripts in the eqs. (9) and (10) are the same meaning as eq. (4) referring to the orientation of the MW. The coefficients are fitted by MATLAB with the use of the least square method. From eq. (10), we may present the link of the 2-D properties to 3-D properties.

### Application on the reconstructed mining-induced fracture network model in rocks

In the reconstructed mining-induced fracture network (MFN), based on the field borehole test and statistical analysis, we consider the parameters of the mining sample, such as the

9.710

8.780

11.713

4.444

17.796

15.791

20.360

6.409



Figure 4. The difference between dimensionless density and dimensionless percolation threshold

n

...

$\frac{1}{200} \frac{1}{2} \frac{1}{200} \frac{1}{p_{20}} \frac$					
Equation	R <sup>2</sup>				
$D_{2D-\perp X} = 0.0958 \ln(\rho_{3D}) + 0.0879 \ln(\rho_{2D} - \rho_{2D-c}) + 2.029$	0.9976				
$D_{2D-\perp Y} = 0.0699 \ln(\rho_{3D}) + 0.0971 \ln(\rho_{2D} - \rho_{2D-c}) + 1.897$	0.9926				
$D_{2D-\perp Z} = 0.1296 \ln(\rho_{3D}) + 0.0908 \ln(\rho_{2D} - \rho_{2D-c}) + 2.135$	0.9796				
$D_{2D-\perp} = 0.0906 \ln(\rho_{3D}) + 0.1201 \ln(\rho_{2D} - \rho_{2D-c}) + 1.893$	0.9854				
$D_{2D-\perp X} = 0.1322 \ln(\rho_{2D} - \rho_{2D-c}) + 1.498$	0.9515				
$D_{2D-\perp Y} = 0.1301 \ln(\rho_{2D} - \rho_{2D-c}) + 1.509$	0.9628				
$D_{2D-\perp Z} = 0.172 \ln(\rho_{2D} - \rho_{2D-c}) + 1.358$	0.9187				
$D_{2D-\perp} = 0.1846 \ln(\rho_{2D} - \rho_{2D-c}) + 1.394$	0.8980				

aspect ratio of major to minor axis, rotation angle (163°), fracture orientation (266.085°/50.175°), and 3-D fracture density (0.0378), [3]. As shown in fig. 5, the mining sample is placed in the X-direction, and Y and Z is the horizontal and vertical directions of the mining face, respectively. As shown in fig. 6,  $D_{2D-\perp X}$ ,  $D_{2D-\perp Y}$ ,  $D_{2D-\perp Z}$ , and  $D_{2D-\#}$  are listed in tab. 2. From eqs. (9) and (10), we obtain  $D_{3D}$ . The fitting values of  $D_{3D}$  using  $\rho'_{2D} - \rho'_{2D-c}$  and  $\rho_{3D}$  is much better than others. To improve the accuracy of  $D_{3D}$ , the MW in different directions should be considered.

With the use of the large numbers of 2-D fracture network analysis, we have [4]:

$$K_{\rm eff} = 88.411 \left( \rho_{2D}' - \rho_{2D-c}' \right)^{0.4622} \quad (R^2 = 0.8494) \tag{11}$$

where  $K_{\text{eff}}$  represents the effective fracture network permeability and  $R^2$  is regression coefficient.

As shown in fig. 7, the MW1 is parallel to the mining face, the MW2 is parallel to the roadside, and the MW3 is parallel to the coal seam floor. The value of the MW2 is much higher than other directions when MW is parallel to the roadside. The coal rocks along the direction of roadside have a better connectivity. Gas extraction is a traditional method used for gas production. The orientation of the extracting borehole is one of the key factors to maintain the extracting efficiency and to achieve the mining safety standards. Form equivalent fracture network permeability (EFNP) calculating results based on eq. (11), the gas extracting boreholes should



be deflected to the roadside as much as possible. It can be seen that the anisotropic fractal-percolation properties of the 3-D DFN model can be practically estimated through this approach.



Figure 7. The EFNP results to the gas extraction in coal mines (for color image see journal web site)

#### Conclusion

In our work, the fractal-percolation properties were investigated and an efficient application of the 3-D DFN models in mining samples was analyzed in detail. It is showed that the 3-D FD is proportional to 3-D fracture density and the mean major axis of fracture, and that it is an inverse correlation with the aspect ratio of major to minor axis. A different combination of effect parameters brings out a quite different evolution of 3-D FD. With increases of K and  $\rho_{3D}$  (or K and  $\mu_a$ ), the 3-D FD mostly remains obvious anisotropic characteristic. For a direct description on the equivalent permeability analysis of the 3-D DFN models, it is still an open problem.

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#### Nomenclature

$A_{\rm ex}$	_	excluded area, [m <sup>2</sup> ]	$K_{\rm eff}$	_	effective permeability, [m <sup>2</sup> ]
$D^{}$	_	FD, [-]	l	_	fracture length, [m]
$D_{2\mathrm{D}}$	—	2-D FD, [–]	N(r)	_	number of square-boxes
$D_{3D}$	_	3-D FD, [-]			or cube-boxes, [–]
EFNP	—	equivalent fracture network	$N_{fr}$	_	total fracture number, [-]
		permeability, [mD]	p	_	probability, [–]
Κ	_	aspect ratio of major to minor axis, [-]	$p_{\rm c}$	_	percolation threshold, [-]

R	_	regression coefficient, [-]	μ	_	an exponent
р	_	probability, [–]	$\mu_a$	_	mean major axis of fracture, [m]
r	_	square or box size, [m]	$\rho'_{2D}$	_	dimensionless density, [-]
S	_	area of the domain, [m <sup>2</sup> ]	$\rho'_{2D-c}$	_	dimensionless percolation threshold [-]
Greek	sy	mbols	$\rho_{2D}$	_	2-D fracture density, [m <sup>-2</sup> ] 3-D fracture density [m <sup>-3</sup> ]
α	_	the dip direction, [°]	$\sigma_{\rm s}$	_	standard deviation, [-]
β	_	the dip angle, [°]	a		, L ]

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