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# Estimation of the joint roughness coefficient (JRC) of rock joints by vector similarity measures

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Abstract Accurate determination of joint roughness coefficient (JRC) of rock joints is essential for evaluating the influence of surface roughness on the shear behavior of rock joints. The JRC values of rock joints are typically measured by visual comparison against Barton's standard JRC profiles. However, its accuracy is strongly affected by personal bias. In the present study, a new comparison method is proposed for JRC evaluation to overcome the drawback of conventional visual comparison methods based on vector similarity measures (VSMs). The feature vectors are obtained by analyzing the angular variation of line segments of both standard JRC profiles and test profiles obtained from three kinds of natural rocks with a sampling interval of 0.5 mm. The roughness similarity degrees between test profiles and standard profiles are evaluated by the Jaccard, Dice, and cosine similarity measures. The JRC values of the test profiles are then determined according to the maximum relation index based on the similarity degrees. In the present study, a comparative analysis between the VSMs method and the JRC evaluation method using different roughness parameters demonstrated that the VSMs method is effective and accurate for JRC measurement.

**Keywords** Rock joint · Joint roughness coefficient (JRC) · Roughness amplitude · Vector similarity measure

#### Introduction

It has long been recognized that rock joints play an important role regarding mechanical properties and deformation behavior of rock masses (Du et al. 2000; Andrade and Saraiva 2008; Yong et al. 2013; Özvan et al. 2014; Chen et al. 2016). Generally, the shear resistance depends on the frictional resistance and geometric irregularities along rock joint surfaces, in which the irregularity or roughness of rock joints is the hardest quantity to estimate (Du 1999; Tang et al. 2016). In addition, joint surface roughness has a significant impact on groundwater flow and solute migration (e.g. Zimmerman and Bodvarsson 1996; Boutt et al. 2006; Zhao et al. 2014). Over the past five decades, various empirical methods (e.g. Barton and Choubey 1977; Barton 1984; Du et al. 2009), statistical methods (e.g. Maerz et al. 1990; Tatone and Grasselli 2010; Zhang et al. 2014), and fractal methods (e.g. Lee et al. 1990; Fardin et al. 2004; Shirono and Kulatilake 1997; Kulatilake et al. 2006; Babanouri et al. 2013; Li and Huang 2015) have been proposed to quantify the joint roughness.

According to Brown (1981), the joint roughness coefficient (JRC) proposed by Barton and Choubey (1977) has been accepted by researchers and engineers all over the world in rock engineering practices. Also, it has been adopted by the ISRM Commission. It is the only quantity in Barton's empirical equation that must be estimated (Tse and Cruden 1979). Maerz et al. (1990) and Fifer-Bizjak (2010) pointed out that JRC is not a measure of the joint profile geometry, but, more properly, is an empirical parameter specifically functional to the Barton–Bandis shear strength criterion for rock joints. Although JRC cannot be used to characterize three-dimensional (3D) roughness (Grasselli et al. 2002), it is still the most commonly used parameter for quantifying joint roughness (özvan et al. 2014; Maerz et al.

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1990). The tilt test (or self-weight gravity shear test) is performed on a regular basis to characterize the roughness of rock joints, and it requires transport of rock samples from the site and cutting of rock samples in the laboratory. It is difficult to collect rock joint samples of sufficient amount, and the samples are easily broken in transport or cutting (Hu and Cruden 1992). In addition, JRC evaluation by tilt test is an inverse process of shear strength analysis based on JRC-JCS model, and it is impractical to determine the rock joint roughness via a large number of tilt tests in engineering practice (Du 1994).

Barton and Choubey (1977) proposed a corresponding JRC value for ten standard profiles ranging from 0 to 20. In such methods, the JRC value of a sample can be determined by visually comparing its roughness to the standard profiles. Yet this procedure is not entirely adequate for quantifying the rock joint roughness profile in either the field or laboratory study (Beer et al. 2002; Grasselli and Egger 2003; Xia et al. 2014; Alameda-Hernández et al. 2014; Gao et al. 2015). To analyze the reliability of this traditional visual assessment method, Beer et al. (2002) performed a survey based on three granite block profiles with 125, 124, and 122 answers using an internet-based survey system. The result from a sample of ten people indicated that a wide range of JRC estimation values. Indeed, the JRC mean value and standard deviation varied significantly until the sample size exceeded 50 people. Alameda-Hernández et al. (2014) performed a similar visual estimation survey in the consideration of the knowledge and skill of the evaluators. Based on the same 12 test profiles, 74 undergraduate students showed standard deviations of JRC values ranging from 1.6 to 3.5. Nine post-graduate students showed standard deviations of 0.3-3.9, and six experts had standard deviations varying from 0.6 to 3.4. The results clearly indicated the unreliability of the JRC visual evaluating method. If the JRC values of joints are estimated inaccurately, large errors may result in the estimating of the shear strength of joints, especially when the normal stress is low.

To overcome the disadvantages of the visual comparison method, several algorithms supported by the parameters derived from digitized standard profiles have been presented for automated JRC calculations (Tse and Cruden 1979; Maerz et al. 1990; Yu and Vayssade 1991; Yang et al. 2001a, b; Tatone and Grasselli 2010; Zhang et al. 2014). Furthermore, fractal dimension values have also been reported to correlate well with JRC values (e.g. Lee et al. 1990; Huang et al. 1992; Xu et al. 2012; Jang et al. 2014; Li and Huang 2015) and numerous empirical equations were proposed for estimating JRC using fractal dimension. However, it is difficult to derive distinctive fractal dimensions for roughness profiles with self-affine characteristics and rank the suitability of these equations in engineering practice. In these quantitative assessment methods, JRC values are typically back-calculated based on a series of best-fitted roughness parameters. Although there are numbers of empirical relations between JRC values and roughness parameters with different definitions, widely accepted equations for JRC have not been established. Thus, it is necessary to develop an effective method for JRC measurement, directly using the irregularity characteristics of the standard profiles instead of curve fitting via additional roughness parameters.

Testers' subjective judgment is the major reason for assessment errors in visual comparison methods, which may be improved by introducing the similarity measures into the assessment. The effectiveness of similarity classification methods depends on how well the similarity between the standard profiles and the surface profiles for measurement is estimated. In fact, the degree of similarity or dissimilarity between the objects under study has played an important role in various scientific fields, such as pattern recognition, machine learning, decision making, and image processing (Broumi and Smarandache 2013; Majumdar and Samanta 2014; Ye 2015). In vector spaces, the Jaccard, Dice, and cosine similarity measures are often used in pattern recognition; this can effectively assess the similarity degree between the studied objects. Significantly, such vector similarity measures have not yet been applied to JRC evaluation.

In this study, the vector similarity measures were applied and profile feature vectors calculated for an objective estimation of JRC. In the vector similarity measures, the angular variations of line segments of profiles were selected to represent the irregularity characteristics of rough profiles. The feature vectors of Barton's standard profiles and test samples were obtained via inclination distribution analysis. Based on the comparisons of Jaccard, Dice, and cosine measures between the feature vectors, the JRC values of the test profiles were determined using the maximum relation index based on the similarity degree.

#### **Preliminaries**

Similarity measures are increasingly being used in various fields including data analysis and classification, pattern recognition, and decision making (Wu and Mendel 2008; Ye 2011, 2012). Vector similarity measures (VSMs) are especially useful in pattern recognition (Ye 2011). In pattern recognition and machine learning, a feature vector is a vector of numerical features that represent some object. The profile of rock joint is considered as an irregular pattern, and also can be described by the feature vector. The difference between any two profiles can be quantitatively shown by means of a similarity measure on their feature vectors. The weaknesses of existing JRC comparative

evaluation method can be eliminated by the similarity measure between the standard profiles and the test surface profiles. VSMs can be applied to JRC evaluation by obtaining and comparing the feature vectors of the irregularity characteristics from the test samples and Barton's standard profiles.

Researchers (e.g. Barton 1973; Tse and Cruden 1979; Maerz et al. 1990; Grasselli and Egger 2003) have presented roughness parameters for describing the geometric irregularities (waves) of rock joints. In addition, several algorithms of those parameters for JRC calculation have been established based on the roughness characterization analysis of the standard profiles. Among those parameters, the best results were achieved with  $Z_2$  (Eq. 1) first-derivative rootmean-square (Tse and Cruden 1979),  $R_p$  (Eq. 2) roughness profile index or profile sinuosity (Maerz et al. 1990; Hong et al. 2008), and the roughness metric  $\theta_{max}^*/(C + 1)_{2D}$  proposed by Tatone and Grasselli (2010), as follows:

$$Z_{2} = \sqrt{\frac{1}{L} \int_{x=0}^{x=L} \left(\frac{dy}{dx}\right)^{2} dx} \approx \sqrt{\frac{1}{N} \sum_{i=1}^{N-1} \left[\frac{(y_{i+1} - y_{i})}{(x_{i+1} - x_{i})}\right]^{2}}, \quad (1)$$

$$R_{\rm p} = \frac{L_{\rm t}}{L_{\rm n}} = \frac{\sum_{i=1}^{N-1} \sqrt{(x_{i+1} - x_i)^2 + (y_{i+1} - y_i)^2}}{L_{\rm n}},$$
 (2)

$$L_{\theta*} = L_0 \left(\frac{\theta_{\max}^* - \theta^*}{\theta_{\max}^*}\right)^C.$$
(3)

where x, y are the horizontal and vertical coordinates of the points along the profile;  $(x_{i+1}, y_{i+1})$ , and  $(x_i, y_i)$  represent adjacent coordinates of the profile; N is the number of the measurements over the profile with a total length L;  $L_t$  is the true profile length and  $L_n$  is the nominal profile length; C is deduced from a regression analysis considering that  $L_{\theta^*}$  is the length of the fraction of the profile with a higher inclination than a threshold value  $\theta^*$  divided by the total profile length;  $L_0$  is the normalized length of the profile fraction with a positive slope and  $\theta^*_{max}$ , the highest slope that appears in a fraction.

The irregularity of rock joint profiles can be reflected by an angular variation of line segments with respect to each small length (interval). If the horizontal interval between the adjacent points of the standard profiles is  $\mu$  and the angle of the line segment between two adjacent points is  $\theta_i$ , the formulae (1) and (2) can be rewritten as

$$Z_{2} \approx \sqrt{\frac{1}{N} \sum_{i=1}^{N-1} \left(\frac{y_{i+1} - y_{i}}{\mu}\right)^{2}} = \sqrt{\frac{1}{N}} \sqrt{\sum_{i=1}^{N-1} \left(\frac{y_{i+1} - y_{i}}{\mu}\right)^{2}}$$
$$= \sqrt{\frac{1}{N}} \sqrt{\sum_{i=1}^{N-1} (\tan \theta_{i})^{2}}$$
(4)

$$R_{\rm p} = \frac{L_{\rm t}}{L_{\rm n}} = \frac{\sum_{i=1}^{N-1} \sqrt{\mu^2 + (y_{i+1} - y_i)^2}}{(N-1)\mu}$$
$$= \frac{1}{N-1} \sum_{i=1}^{N-1} \sqrt{1 + (\tan \theta_i)^2}$$
(5)

where

$$\tan \theta_i = \frac{y_{i+1} - y_i}{x_{i+1} - x_i} = \frac{y_{i+1} - y_i}{\mu} \tag{6}$$

As shown in formulae  $Z_2$  (4),  $R_p$  (5), these roughness parameters largely depend on the inclination tan  $\theta_i$  of the individual lines along the profiles. In Eq. (3), the inclination  $\theta^*$  of the individual line segments forming the profiles are evaluated directly. Moreover, good relationships between these related statistical parameters and JRC values have been shown in previous studies. Thus, the angular variation of line segments can be used to represent the irregularity characteristics of the profiles as the feature vector. The JRC value is determined by the similarity measures of the feature vectors of the test and standard profiles.

Let  $T = (t_1, t_2, ..., t_n)$ , and  $S = (s_1, s_2, ..., s_n)$  be two *n*-dimensional vectors, which represent the feature vectors of the test object and the standard profile respectively. Then, the similarity measures between the two vectors *T* and *S* are calculated by the Jaccard similarity measure, Dice similarity measure, and cosine similarity measure.

The Jaccard index (Jaccard 1901) is defined as

$$J(T,S) = \frac{T \cdot S}{\|T\|_2^2 + \|S\|_2^2 - T \cdot S} = \frac{\sum_{i=1}^n t_i s_i}{\sum_{i=1}^n t_i^2 + \sum_{i=1}^n s_i^2 - \sum_{i=1}^n t_i s_i}$$
(7)

where  $T \cdot S = \sum_{i=1}^{n} t_i s_i$  is the inner product of the vectors Tand S,  $||T||_2 = \sqrt{\sum_{i=1}^{n} t_i^2}$  and  $||S||_2 = \sqrt{\sum_{i=1}^{n} s_i^2}$  are the Euclidean norms of T and S.

The Dice similarity measure (Dice 1945) is defined as

$$D(T,S) = \frac{2T \cdot S}{\|T\|_2^2 + \|S\|_2^2} = \frac{2\sum_{i=1}^n t_i s_i}{\sum_{i=1}^n t_i^2 + \sum_{i=1}^n s_i^2}$$
(8)

The cosine similarity measure (Salton and McGill 1987) is defined as the inner product of two vectors, which presents the cosine of the angle between two vectors. This similarity measure can be defined as follows:

$$C(T,S) = \frac{T \cdot S}{\|T\|_2 \|S\|_2} = \frac{\sum_{i=1}^n t_i s_i}{\sqrt{\sum_{i=1}^n t_i^2} \sqrt{\sum_{i=1}^n s_i^2}}$$
(9)

These three formulae (7), (8), (9) are similar in the sense that they take values in the interval [0, 1], and J(T, S), D(T, S), C(T, S) are equal to 1 when T = S.

# Determination of feature vectors for the standard profiles

Feature vectors of the standard profiles are extremely important for the JRC evaluation through VSMs, which determines the accuracy of the JRC evaluation result. In order reasonably to determine the feature vector, it is necessary to study the standard profiles (Fig. 1), as introduced by Barton and Choubey (1977), separately.

In the present study, a grayscale image processing method was used for digitizing the standard profiles. Images, also known as black and white, are composed exclusively of shades of gray, varying from black at the weakest intensity to white at the strongest. The intensity of the grayscale image ranges from 0 to 255. The cells with lowintensity values in the gray matrix were highly correlated with the center line of the profile curve. The grayscale data of the imported profile images were extracted by Matlab and saved in matrix forms. Figure 2 illustrates an example of a magnified profile in the size of 1.00 mm (L)  $\times$  1.22 mm (H). It consists of 99 pixel grids,  $n_x = 9$ pixels in width and  $n_v = 11$  pixels in height. Then, the length  $\mu$  of each pixel equals to  $L/n_x = 0.11$  mm. The  $x_i$  and  $y_i$  coordinates of the center point line can be determined by  $x_i = \mu(j-1)$  and  $y_i = \mu(\overline{i}-1)$ , where  $j \in [1, 9]$  is the



Fig. 1 Ten standard roughness profiles and corresponding JRC values by Barton and Choubey (after Hoek 2000)

column of the grayscale matrix I, and  $\overline{i}$  is the average value of the row of grayscale matrix I. By doing so, the original digitized data of both joint profiles was obtained.

The original ten images of the standard profiles by Barton and Choubey (1977) were saved in JPG format, sized in  $112 \times 906$  pixels (profile 1),  $114 \times 906$  pixels (profile 2),  $108 \times 905$  pixels (profile 3),  $86 \times 903$  pixels (profile 4),  $95 \times 905$  pixels (profile 5),  $103 \times 906$  pixels (profile 6),  $80 \times 905$  pixels (profile 7),  $77 \times 906$  pixels (profile 8),  $81 \times 903$  pixels (profile 9), and  $113 \times 907$  pixels (profile 10). The original image digitization ratio of these profiles was approximately 100 mm/900  $\approx$  0.11 mm. In previous research, the digitization interval  $\mu = 0.5$  mm was often used for analyzing roughness profiles (Yu and Vayssade 1991; Tatone and Grasselli 2010; Jang et al. 2014). In this study, ten standard profiles by Barton and Choubey (1977) were also digitized with a sampling interval of 0.5 mm, as shown in Fig. 3. Each standard profile was composed of 201  $(x_i, y_i)$  dots. The local apparent asperity dips angle  $\theta_i$  of the line segment between two adjacent points along the standard profile was calculated as

$$\theta_{i} = \arctan\left(\sqrt{\left(\frac{y_{i+1} - y_{i}}{x_{i+1} - x_{i}}\right)^{2}}\right)$$
$$= \arctan\left(\sqrt{\left(\frac{y_{i+1} - y_{i}}{\mu}\right)^{2}}\right)$$
(10)

As shown in Fig. 4, the inclination distributions of the individual line segments were plotted in histograms with a bin size of 2°. The maximum frequency counts of local apparent asperity dips were basically in  $0^{\circ}-2^{\circ}$  range. The maximum value of the asperity dips in the ten standard profiles increased with the JRC value, from the minimum value 23.12° in the standard profile 1, to 48.55° in the standard profile 10. The inclination distributions of the frequency counts of the standard profiles approximately met the exponential distribution,

$$y = a \cdot \kappa^b \tag{11}$$

The frequency count  $\kappa$  of apparent local asperity dips with higher values increased in the standard profiles that had higher JRC values. The coefficients of exponential fitting curves of the standard profiles had corresponding variant relations with increased JRC values. Also, *R*square, the coefficient of determination, decreased. For instance, the standard profile 1 had the highest frequency count value (0.61) in the range of 0° to 2°, which was more than two times larger than the standard profile 5 (0.27) and almost four times standard profile 10 (0.16). Coefficients *a* and *b* of the exponential fitting curve of standard profile 1 were 0.60 and -1.40. However, coefficient *a* was 0.27 and *b* was -0.73 in standard profile 5, and coefficient *a* was Fig. 2 Schematic diagram of principle of the joint roughness profile digitization method on the basis of image pixel analysis. **a** *Grayscale* image of the joint profile; **b** magnified zoom in 1 cm length; **c** gray matrix; **d** the digitized points



0.15 and *b* was -0.49 in standard profile 10. R-square decreased from 0.94 in standard profile 1 and to 0.66 in standard profile 10. The frequency counts of local apparent asperity dips in standard profile 10 varied from 0° to 50°, but the counts of the standard profile 1 were mainly in the range of 0°-24°. The results indicated that the ten standard profiles had distinctly different inclination distributions. Moreover, they illustrated the geometric irregularities (waves) differences between Barton's standard profiles.

The inclination distributions are presented as the feature vectors  $S^*$  with the interval of 2°. For convenient evaluation of the similarity measures, the inclination distributions were normalized by the following equation:

$$s_i = \frac{s_i^* - S_{\min}^*}{S_{\max}^* - S_{\min}^*},$$
(12)

where the element  $s_i$  is the result after normalizing vector  $S^*$ ,  $s_i^*$  is the count value of local apparent asperity dips in every 2 degrees,  $S_{\min}^*$  and  $S_{\max}^*$  are the minimum value and the maximum value of local apparent asperity dips in the vector  $S^*$ , respectively. It is important to clarify that additional local apparent asperity dips ranging between 0° and 2° may appear due to the low image accuracy of the standard profiles; these asperity dips have not been considered in the feature vector *S* is tabulated in Table 1.

# Similarity measures for JRC evaluation

# Determination of feature vector for test profiles

The test sample profiles were obtained from natural rock joints with different surface characteristics using

the mechanical hand profilograph (Du et al. 2009; Morelli 2014). The rough and irregular profiles were obtained from the bedding joints of Granite. The rough and undulating profiles were obtained from the tectonic joints of Limestone. The smooth, planar profiles were obtained from the cleavage joints of slate. These sample profiles were 10 cm long, identical to the standard profiles of Barton and Choubey (1977). The sample profiles were digitized using a similar grayscale image processing method as described in Sect. 3 for the standard profiles.

Furthermore, the inclination distributions were presented as a 15-dimensional feature vector T with the interval of 2°. For a convenient evaluation of the similarity measures, the feature vectors of the inclination distributions were expressed by the following equation:

$$t_i = \frac{t_i^* - S_{\min}^*}{S_{\max}^* - S_{\min}^*}.$$
 (13)

For the test profiles,  $t_i^*$  represents the count value of asperity dips in every 2°. The feature vectors of the test profiles are listed in Table 2. The similarity values were obtained by similarity measures between the feature vectors  $S_k$  (1, 2,..., 10) of the standard profiles and test profiles  $T_j$  (j = 1, 2,..., 9).

# JRC evaluation result

The similarity measure values of  $v_k = J(S_k, T_j)$ ,  $D(S_k, T_j)$ ,  $C(S_k, T_j)$  (k = 1, 2, ..., 10; j = 1, 2, ..., 9) were obtained by Eqs. (7), (8), (9) and the range of the  $v_k$  was normalized from [0, 1] into [-1, 1] for convenient evaluation by the following relation index:







Fig. 4 Inclination distributions of the individual line segments of each standard profile





Fig. 4 continued

$$r_k = \frac{2v_k - v_{\min} - v_{\max}}{v_{\max} - v_{\min}}.$$
 (14)

where the  $v_{\text{max}}$  and  $v_{\text{min}}$  are the maximum and minimum values of the similarity measure value  $v_k$ .

If the relation index  $r_k$  has the negative value of -1, the test profile for  $T_j$  does not have identical roughness with the k-th standard JRC profile. But, if the relation index  $r_k$  has the positive value of 1, the test profile for  $T_j$  has identical roughness with the k-th standard JRC profile. By using Eq. (14), the relation indices are shown in Table 3. The JRC values can be confirmed according to the maximum relation index. The JRC evaluation process by VSMs and relation indices is shown in Fig. 5.

For rough and irregular profiles, the JRC values of test profiles 1 and 3 are 14–16 according to the maximum

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relation index (1.00). This indicates that these two profiles have identical roughness with the 8th standard profile from the irregularity characteristics. The JRC value of test profile 2 is 18-20 according to the maximum relation index (1.00). This indicates that this profile has identical roughness with the 10th standard profile. The irregularity characteristics of this test profile are quite different from standard profile 1–3, and negative relation indices are obtained by VSMs method.

For rough and undulating profiles, Table 3 shows that the JRC values of profiles 4 and 6 are 10-12. This indicates that they have identical roughness with standard profile 6. The test profile 5 has a JRC value in the range of 6-8. This indicates that it has an identical roughness with standard profile 4. The JRC values of 0-2, 2-4, 12-14, 16-18,

0.00, 0.26, 0.60, 0.91, 0.43, 0.57, 0.29, 0.20, 0.17, 0.06, 0.14, 0.03, 0.00, 0.00, 0.00, 0.00, 0.00, 0.00, 0.03, 0.000.00, 0.23, 0.46, 0.57, 0.26, 0.29, 0.60, 0.40, 0.20, 0.31, 0.29, 0.23, 0.29, 0.20, 0.09, 0.14, 0.03, 0.06, 0.06, 0.000.00, 0.26, 0.49, 0.77, 0.23, 0.34, 0.37, 0.23, 0.51, 0.29, 0.40, 0.17, 0.40, 0.17, 0.40, 0.11, 0.00, 0.05, 0.03, 0.00, 0.03, 0.00, 0.00, 0.03, 0.00, 0.03, 0.00, 0.00, 0.03, 0.03, 0.00, 0.030.00, 0.34, 0.63, 0.89, 0.26, 0.37, 0.49, 0.11, 0.06, 0.14, 0.06, 0.03, 0.000.00, 0.37, 0.66, 0.89, 0.49, 0.43, 0.17, 0.20, 0.14, 0.23, 0.06, 0.09, 0.09, 0.06, 0.03, 0.00, 0.03, 0.000.00, 0.29, 0.69, 0.46, 0.43, 0.17, 0.69, 0.17, 0.17, 0.340, 26, 0.17, 0.14, 0.17, 0.03, 0.00, 0.60, 0.00,0.00, 0.34, 0.26, 0.49, 0.23, 0.26, 0.49, 0.26, 0.29, 0.46, 0.34, 0.26, 0.14, 0.11, 0.20, 0.06, 0.17, 0.17, 0.09, 0.03, 0.03, 0.11, 0.03, 0.00, 0.03Feature vector S<sub>k</sub> **IRC** value 12-14 14-16 16-18 18 - 2010-12 8-10 6–8 4-6 4 profile 10 Standard profile 9 Standard profile 3 Standard profile 5 Standard profile 6 Standard profile 7 Standard profile 8 Standard profile 4 profile profile Standard Standard Standard ş

**Fable 1** Normalized feature vectors of the inclination distribution for ten standard profiles

18–20 show very low possibility due to the negative relation indices.

For smooth and even profiles, there is little difference in JRC values of test profile 7 among the results using the Jaccard similarity measure, Dice similarity measure, and cosine similarity. According to the results obtained through the cosine measure, the JRC value of this profile roughness is 4-6 according to maximum relation index (1.00), the second maximum relation is 0.95 (JRC 6-8). The maximum relation index (1.00) obtained through the Jaccard similarity measure and Dice similarity measure have identical roughness with the JRC 6-8, and the second maximum relation is 0.93 and 0.94 (JRC 4-6), respectively. The difference between the maximum and the second maximum relation index was observed to be minimal and insignificant for the overall results. This agrees with Ye (2014) who has pointed out that the Jaccard and Dice similarity measures are better than the cosine method in the similarity identification. The JRC values of test profiles 8 and 9 are 2-4 due to maximum relation index (1.00). This indicates that these profiles have identical roughness as the 2nd standard profile, and the JRC values of 8-10, 10-12, 12-14, 14-16, 16-18, and 18-20 have very low possibility due to the negative relation indices.

#### Comparisons with other measures for JRC

It has long been recognized that sampling interval plays an important role in obtaining accurate estimations for roughness parameters (Yu and Vayssade 1991; Yang et al. 2001a, b; Tatone and Grasselli 2010; Jang et al. 2014; Fathi et al. 2016). However, to date, there are no widely adopted methods or suggested guidelines to determine the reasonable resolution for the measurement of discontinuity roughness (Tatone and Grasselli 2013). To solve this problem, the empirical equations for estimating JRC are generally studied by a certain sampling interval. In engineering practice, the joint profiles are usually measured by the profile comb which is only capable of obtaining measurements at a certain horizontal interval between 0.5 and 1 mm. The sampling interval of 0.5 mm could indicate more detailed geometric irregularities of joint surfaces and the correlations between statistical parameters and JRC values were studied using the same sampling interval in previous literature (e.g. Yu and Vayssade 1991; Yang et al. 2001a, b; Tatone and Grasselli 2010). Therefore, a sampling interval of 0.5 mm was used in this study and the JRC values can be calculated by following equations:

$$JRC = 61.79 \cdot Z_2 - 3.47, \tag{15}$$

 $JRC = 32.69 + 32.98 \cdot \log_{10} Z_2, \tag{16}$ 

$$JRC = 51.85(Z_2)^{0.60} - 10.37.$$
 (17)

|--|

| Test Profile<br>NO. | Description                                      | Digitized roughness profile (cm)  | Feature vector $T_j$   |
|---------------------|--|---|--|
| 1                   | Granite: rough, irregular,<br>bedding joints     |   | [0.00,0.23,0.29,0.31,0.49,0.54,0.29,0.26,0.<br>34,0.29,0.34,0.26,0.09,0.11,0.11,0.09,0.03<br>,0.09,0.06,0.00,0.00,0.00,0.03,0.00,0.00]   |
| 2                   | Granite: rough, irregular,<br>bedding joints     | 0.0 2 4 6 8 10<br>0.5   | [0.00,0.09,0.17,0.20,0.60,0.17,0.06,0.20,0.<br>60,1.43,0.17,0.11,0.23,0.17,0.11,0.09,0.06<br>,0.03,0.00,0.03,0.03,0.03,0.06,0.00,0.03]   |
| 3                   | Granite: rough, irregular,<br>bedding joints     | 0 2 4 6 8 10<br>1.5<br>1<br>0.5<br>0<br>0<br>2<br>1<br>0<br>0<br>0<br>2<br>1<br>0<br>0<br>0<br>0<br>0<br>0<br>0<br>0<br>0<br>0<br>0 | [0.00,0.40,0.49,0.20,0.54,0.94,0.06,0.31,0.<br>17,0.34,0.09,0.23,0.09,0.11,0.06,0.11,0.03<br>,0.09,0.06,0.00,0.00,0.03,0.00,0.03,0.03]   |
| 4                   | Limestone: rough,<br>undulating, tectonic joints |   | $\begin{bmatrix} 0.00, 0.26, 1.00, 0.09, 0.60, 0.54, 0.17, 0.17, 0.\\ 09, 0.11, 0.06, 0.03, 0.03, 0.06, 0.06, 0.03, 0.03\\ 0.00, 0.03, 0.00, 0.00, 0.00, 0.00, 0.00, 0.00 \end{bmatrix}$       |
| 5                   | Limestone: rough, planar,<br>tectonic joints     |   | $\begin{bmatrix} 0.00, 0.34, 0.74, 0.26, 1.37, 0.14, 0.20, 0.03, 0.\\ 29, 0.14, 0.09, 0.03, 0.09, 0.00, 0.03, 0.00, 0.03\\ , 0.00, 0.00, 0.00, 0.00, 0.00, 0.00, 0.00, 0.00 \end{bmatrix}$     |
| 6                   | Limestone: rough,<br>undulating, tectonic joints |   | $\begin{bmatrix} 0.00, 0.26, 1.00, 0.09, 0.60, 0.54, 0.17, 0.17, 0.\\ 09, 0.11, 0.06, 0.03, 0.03, 0.06, 0.06, 0.03, 0.03\\ 0.00, 0.03, 0.00, 0.00, 0.00, 0.00, 0.00, 0.00, 0.06 \end{bmatrix}$ |
| 7                   | Slate: smooth, planar:<br>cleavage joints        |   | [0.00,0.31,1.51,0.37,0.20,0.63,0.20,0.11,0.<br>11,0.03,0.06,0.03,0.03,0.00,0.00,0.00,0.00  |
| 8                   | Slate: smooth, planar:<br>cleavage joints        |   | $\begin{bmatrix} 0.00, 1.91, 1.03, 0.54, 0.34, 0.11, 0.26, 0.09, 0.\\ 00, 0.03, 0.03, 0.00, 0.00, 0.00, 0.00, 0.00, 0.00\\ 0.00, 0.00, 0.00, 0.00, 0.00, 0.00, 0.00, 0.00 \end{bmatrix}$       |
| 9                   | Slate: smooth, planar:<br>cleavage joints        | 0.2 0 2 4 6 8 10<br>0.2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0   | $\begin{bmatrix} 0.00, 1.57, 0.83, 0.97, 0.40, 0.06, 0.09, 0.03, 0.\\ 00, 0.00, 0.00, 0.00, 0.00, 0.00, 0.00, 0.00, 0.00\\ 0.00, 0.00, 0.00, 0.00, 0.00, 0.00, 0.00, 0.00 \end{bmatrix}$       |

When sampling interval is 0.5 mm, the equation for estimating JRC from  $R_p$  is

JRC = 
$$\left[3.36 \times 10^{-2} + \frac{1.27 \times 10^{-3}}{\ln(R_p)}\right]^{-1}$$
. (18)

The equation by Tatone and Grasselli (2010) to estimate JRC for sampling interval of 0.5 mm is expressed as

$$JRC = 3.95 (\theta_{\max}^* / [C+1]_{2D})^{0.7} - 7.98.$$
(19)

Table 4 presents the roughness parameters  $Z_2$ ,  $R_p$ ,  $\theta_{max}^*/[C + 1]_{2D}$ , and the results of JRC validation through the Eqs. (15)–(19). For test profile 1, the minimum JRC values and maximum value by roughness parameters are 14.26 and 15.51, respectively, which is within the JRC 14–16 range by similarity measures. For test profile 2, the JRC values obtained by Eqs. (15)–(19) are 21.96, 19.98, 20.08, 19.30, 25.40, respectively. However, according to the JRC evaluation method by Barton and Choubey (1977), the

| Test<br>(profile) no. | Method                   | Relation indices (r <sub>k</sub> ) |              |              |              |               |                |                |                |                | JRC diagnosi   |             |
|-----------------------|--------------------------|------------------------------------|--------------|--------------|--------------|---------------|----------------|----------------|----------------|----------------|----------------|-------------|
|                       |                          | JRC<br>(0–2)                       | JRC<br>(2–4) | JRC<br>(4–6) | JRC<br>(6–8) | JRC<br>(8–10) | JRC<br>(10–12) | JRC<br>(12–14) | JRC<br>(14–16) | JRC<br>(16–18) | JRC<br>(18–20) | result      |
| 1                     | r <sub>Jaccard</sub>     | -1.00                              | -0.64        | -0.15        | 0.40         | 0.27          | 0.41           | 0.70           | 1.00           | 0.58           | 0.87           | JRC (14–16) |
|                       | <i>r</i> <sub>Dice</sub> | -1.00                              | -0.55        | -0.01        | 0.51         | 0.40          | 0.53           | 0.77           | 1.00           | 0.67           | 0.90           | JRC (14–16) |
|                       | r <sub>cosine</sub>      | -1.00                              | -0.51        | 0.00         | 0.57         | 0.48          | 0.52           | 0.74           | 1.00           | 0.71           | 0.85           | JRC (14–16) |
| 2                     | r <sub>Jaccard</sub>     | -1.00                              | -0.73        | -0.42        | 0.02         | 0.00          | 0.49           | 0.50           | 0.24           | 0.66           | 1.00           | JRC (18–20) |
|                       | r <sub>Dice</sub>        | -1.00                              | -0.66        | -0.29        | 0.16         | 0.14          | 0.59           | 0.60           | 0.37           | 0.73           | 1.00           | JRC (18–20) |
|                       | r <sub>cosine</sub>      | -1.00                              | -0.72        | -0.35        | 0.06         | 0.03          | 0.52           | 0.55           | 0.29           | 0.62           | 1.00           | JRC (18–20) |
| 3                     | r <sub>Jaccard</sub>     | -1.00                              | -0.50        | 0.02         | 0.52         | 0.41          | 0.12           | 0.28           | 1.00           | 0.18           | 0.23           | JRC (14–16) |
|                       | r <sub>Dice</sub>        | -1.00                              | -0.40        | 0.14         | 0.61         | 0.50          | 0.24           | 0.39           | 1.00           | 0.30           | 0.35           | JRC (14–16) |
|                       | r <sub>cosine</sub>      | -1.00                              | -0.45        | 0.12         | 0.59         | 0.49          | 0.22           | 0.38           | 1.00           | 0.27           | 0.37           | JRC (14–16) |
| 4                     | r <sub>Jaccard</sub>     | -0.83                              | -0.94        | 0.33         | 0.93         | 0.54          | 1.00           | -0.17          | 0.71           | -0.56          | -1.00          | JRC (10–12) |
|                       | r <sub>Dice</sub>        | -0.80                              | -0.93        | 0.40         | 0.94         | 0.59          | 1.00           | -0.10          | 0.75           | -0.50          | -1.00          | JRC (10–12) |
|                       | r <sub>cosine</sub>      | -0.75                              | -0.96        | 0.39         | 0.96         | 0.61          | 1.00           | -0.11          | 0.74           | -0.52          | -1.00          | JRC (10–12) |
| 5                     | r <sub>Jaccard</sub>     | -1.00                              | -0.62        | -0.07        | 1.00         | 0.69          | 0.89           | -0.35          | 0.61           | -0.31          | -0.67          | JRC (6-8)   |
|                       | r <sub>Dice</sub>        | -1.00                              | -0.56        | 0.02         | 1.00         | 0.74          | 0.91           | -0.26          | 0.66           | -0.22          | -0.62          | JRC (6-8)   |
|                       | r <sub>cosine</sub>      | -1.00                              | -0.73        | -0.03        | 1.00         | 0.69          | 0.99           | -0.32          | 0.69           | -0.37          | -0.65          | JRC (6-8)   |
| 6                     | r <sub>Jaccard</sub>     | -1.00                              | -0.76        | 0.07         | 0.92         | 0.67          | 1.00           | -0.25          | 0.52           | -0.55          | -0.82          | JRC (10–12) |
|                       | r <sub>Dice</sub>        | -1.00                              | -0.72        | 0.16         | 0.94         | 0.71          | 1.00           | -0.16          | 0.59           | -0.49          | -0.78          | JRC (10–12) |
|                       | r <sub>cosine</sub>      | -0.97                              | -1.00        | 0.05         | 0.79         | 0.52          | 1.00           | -0.27          | 0.50           | -0.76          | -0.85          | JRC (10-12) |
| 7                     | r <sub>Jaccard</sub>     | 0.34                               | 0.08         | 0.93         | 1.00         | 0.69          | 0.59           | -0.17          | 0.29           | -0.06          | -1.00          | JRC (6-8)   |
|                       | <i>r</i> <sub>Dice</sub> | 0.42                               | 0.17         | 0.94         | 1.00         | 0.74          | 0.65           | -0.08          | 0.38           | 0.04           | -1.00          | JRC (6-8)   |
|                       | r <sub>cosine</sub>      | 0.73                               | 0.11         | 1.00         | 0.95         | 0.66          | 0.69           | -0.07          | 0.36           | -0.05          | -1.00          | JRC (46)    |
| 8                     | r <sub>Jaccard</sub>     | -0.36                              | 1.00         | 0.01         | 0.14         | -0.33         | -0.36          | -0.93          | -0.19          | -0.85          | -1.00          | JRC (2-4)   |
|                       | <i>r</i> <sub>Dice</sub> | -0.28                              | 1.00         | 0.10         | 0.24         | -0.24         | -0.27          | -0.92          | -0.09          | -0.83          | -1.00          | JRC (2-4)   |
|                       | r <sub>cosine</sub>      | 0.11                               | 1.00         | 0.13         | 0.09         | -0.45         | -0.28          | -0.95          | -0.13          | -1.00          | -0.91          | JRC (2-4)   |
| 9                     | r <sub>Jaccard</sub>     | -0.03                              | 1.00         | 0.09         | 0.18         | -0.20         | -0.60          | -0.93          | -0.37          | -0.70          | -1.00          | JRC (2-4)   |
|                       | r <sub>Dice</sub>        | 0.10                               | 1.00         | 0.22         | 0.30         | -0.08         | -0.51          | -0.91          | -0.25          | -0.63          | -1.00          | JRC (2-4)   |
|                       | r <sub>cosine</sub>      | 0.43                               | 1.00         | 0.22         | 0.17         | -0.26         | -0.59          | -1.00          | -0.33          | -0.80          | -1.00          | JRC (2-4)   |

Table 3 Results of JRC evaluation by vector similarity measures

maximum JRC value should be in the range of 18-20. Thus, the suggested JRC value by similarity measures in this paper is 18–20. For the test profile 3, the JRC values based on roughness parameters are 14.51, 15.01, 14.35, 14.97, and 17.49. The JRC value of this profile roughness suggested by this paper is 14-16 due to maximum relation index (1.00). The results by Eqs. (15), (16), (17), and (18) are in the suggested range and JRC through  $\theta_{\max}^*/[C+1]_{2D}$ is little higher. Because feature vectors refer to the absolute angle of the line segment between two adjacent points along the standard profile, the same part in roughness parameters  $Z_2$ ,  $R_p$ . But the angle value is considered to be positive or negative in roughness parameter  $\theta^*_{max}$ /  $[C + 1]_{2D}$  according to the shear directions. For test profile 4, the JRC values by roughness parameters are 9.43, 10.26, 9.88, 10.20, 9.10, which are in the value range 10-12 due to maximum relation index (1.00) by similarity measures. For test profile 5, the JRC value by similarity measures has

identical roughness with the 4th standard JRC profile (6-8). The JRC values through  $Z_2$ ,  $R_p$  are 7.10, 7.40, 7.60, and 8.09. The JRC values of test profile 6 are 9.68, 10.53, 10.13, 10.795, 15.62 through roughness parameters. However, the suggested JRC value of test profile 6 is between 10 and 12, which is the same as test profile 4. For test profile 7, the JRC values by roughness parameters are 4.726, 3.76, 5.06, 5.52, and 3.43, respectively. As we know, the JRC value suggested by the cosine measure is 4-6, due to maximum relation index (1.00). Therefore, the JRC values by Eqs. (15), (17) and (18) were also within this range. However, the results using the Jaccard and Dice similarity measure range between JRC 6 and JRC 8, which are higher than the values obtained by roughness parameters. Nevertheless, different methods of measurement may indicate the difference in the evaluation results. The Jaccard and Dice similarity measures imply stronger identification than the cosine measure (Ye 2014). For test profile



Fig. 5 Block diagram of JRC evaluation using the similarity measures of profile inclination

8, JRC values are 3.15, 0.70, 3.20, 3.88 through  $Z_2$ ,  $R_p$ , and 7.483 through  $\theta_{max}^*/[C + 1]_{2D}$ . There are obvious differences in JRC values through  $Z_2$ , which may explain JRC values even through the same roughness parameter. Moreover, the JRC value of the test profile 8 by Eq. (16) is -1.82, the solution is obviously wrong. The JRC values by Eqs. (15), (18), (19) are 2.08, 2.85, and 2.15, which are in the value range 2–4 according to maximum relation index (1.00) by similarity measures.

The JRC value is governed by how well the similarity is estimated between the standard profiles and the measured surface profile. Based on the range of JRC obtained by Eq. (14), the JRC value can be confirmed according to the relation index of two adjacent standard JRC profiles, and its value is determined by the following equation:

$$JRC_{k} = JRC_{\min}^{k} \left( \frac{r_{k-1} + 1}{r_{k-1} + r_{k+1} + 2} \right) + JRC_{\max}^{k} \left( \frac{r_{k+1} + 1}{r_{k-1} + r_{k+1} + 2} \right)$$
(20)

where JRC<sub>k</sub> is the certain value of the tested joint profile; JRC<sup>k</sup><sub>min</sub> and JRC<sup>k</sup><sub>max</sub> are the minimum and maximum values of *k*-th standard JRC profile respectively;  $r_{k-1}$  and  $r_{k+1}$  are the relation indexes of the two adjacent standard JRC profiles respectively.

Let us take the tested profile No.1 in Table as an example, and the similarity measures show that this profile well matches of k = 8th standard JRC profile and JRC value should be in the range of 14–16 (JRC<sub>min</sub> = 14 and JRC<sub>max</sub> = 16). Then, JRC value can be determined by how close is the test profile to 7th and 9th standard JRC profiles. If  $r_7$  is higher than  $r_9$ , that means the JRC value is more close to the JRC<sub>min</sub> rather than JRC<sub>max</sub>. Instead, if  $r_7$  is lower than  $r_9$ , the JRC value should be closer to JRC<sub>max</sub>. According to the result of vector similarity measures, we can obtain the JRC values by VSMSs:

$$\begin{cases} JRC_{Jaccard} = 14\left(\frac{0.70+1}{0.70+0.58+2}\right) + 16\left(\frac{0.58+1}{0.70+0.58+2}\right) = 14.96\\ JRC_{Dice} = 14\left(\frac{0.77+1}{0.77+0.67+2}\right) + 16\left(\frac{0.67+1}{0.77+0.67+2}\right) = 14.97\\ JRC_{cosine} = 14\left(\frac{0.74+1}{0.74+0.71+2}\right) + 16\left(\frac{0.71+1}{0.74+0.71+2}\right) = 14.99 \end{cases}$$

In addition, if the test profile is confirmed to be in the range of 0–2 or 18–20, the JRC values can be approximately estimated by using the following equation

$$JRC_{k} = JRC_{\min}^{k} + \frac{2r_{k+1}}{1+r_{k+1}}(k=1)$$

$$JRC_{k} = JRC_{\max}^{k} - \frac{2r_{k-1}}{1+r_{k-1}}(k=10)$$
(21)

Table 4 JRC values of the test profiles calculated by Eqs. (15)–(19)

| Test profile no. | Roughness parameters |                       |                              | JRC value          |                    |                    |                    |  |  |  |
|------------------|----------------------|-----------------------|------------------------------|--------------------|--------------------|--------------------|--------------------|--|--|--|
|                  | $\overline{Z_2}$     | <i>R</i> <sub>p</sub> | $\theta^*_{\max}/[C+1]_{2D}$ | Through $Z_2$ (15) | Through $Z_2$ (16) | Through $Z_2$ (17) | Through $R_p$ (18) | Through $\theta^*_{\text{max}}/[C+1]_{2D}(19)$ |  |  |
| 1                | 0.300                | 1.042                 | 11.808                       | 15.067             | 15.445             | 14.808             | 15.511             | 14.259   |  |  |
| 2                | 0.412                | 1.072                 | 21.093                       | 21.975             | 19.982             | 20.078             | 19.295             | 25.401   |  |  |
| 3                | 0.291                | 1.039                 | 14.336                       | 14.511             | 15.009             | 14.352             | 14.972             | 17.494   |  |  |
| 4                | 0.209                | 1.020                 | 8.100                        | 9.432              | 10.255             | 9.888              | 10.196             | 9.101  |  |  |
| 5                | 0.171                | 1.014                 | 8.895                        | 7.098              | 7.397              | 7.602              | 8.086              | 10.259   |  |  |
| 6                | 0.213                | 1.022                 | 12.853                       | 9.686              | 10.534             | 10.126             | 10.795             | 15.619   |  |  |
| 7                | 0.133                | 1.009                 | 4.553                        | 4.726              | 3.756              | 5.059              | 5.520              | 3.434  |  |  |
| 8                | 0.107                | 1.006                 | 7.026                        | 3.150              | 0.697              | 3.204              | 3.878              | 7.483  |  |  |
| 9                | 0.090                | 1.004                 | 3.839                        | 2.082              | -1.823             | 1.844              | 2.853              | 2.149  |  |  |





Fig. 7 Generation of the digitized profiles by various sampling intervals (after Kulatilake and Um 1999)

The distribution of the JRC values calculated via the statistical methods and VSMs are shown in Fig. 6. The predictions of JRC values from Eq. (20) agree well with the calculated values based on the relations with roughness parameters.

# Discussion

The roughness profile of a natural rock joint surface is continuous, the digitized roughness profile data obtained through measurement devices are available only at a certain interval of horizontal spacing. Figure 7 shows an example of generating profiles in different resolutions, and three processed profiles generated via the random midpoint displacement method (Kulatilake and Um 1999). The profile becomes smoother under larger sampling interval, and the subprime irregular undulations between smaller horizontal spacing were neglected. Hence, the JRC values of test profiles depend on the chosen sampling interval, which means the calculated JRC values vary according to the used sampling interval.

Three different sampling intervals including 0.5, 1.5, and 2.5 mm are used to indicate the angular variation of line segments along the test joint profile No.1. The asperity dips were calculated by Eq. (10), and the frequency counts were grouped by angularly spaced dips. As shown in Fig. 8, the percentage of the asperity dips in range of 0°-10° increase with the sampling interval, but the percentage of high asperity dips reduces. By 0.5 mm sampling interval, there are 1.34% asperity dips large than 40° and 6.04% in range of 30°-40°. The percentage of asperity dips in range of 30°-40° decreases to 1.75% and no asperity dip exceeds 40° when using the sampling interval of 1.5 mm. All of asperity dips are smaller than 30° by 2.5 mm sampling interval. According to the similarity theory, the feature vectors should represent the characters of object exactly. The feature values correspond to the distributions of the asperity dips here. The distributions under 0.5 mm sampling interval show much more detailed geometric irregularities (waves) of rock joints. However, the larger sampling interval makes the feature vector less accurate.

# Conclusions

JRC is one of the most important parameters utilized in calculating shear strength of rough joints in rock masses. In this study, VSMs are suggested for estimating the JRC value on the basis of the standard profiles introduced by Barton and Choubey (1977). The angular variation of line segments was used to represent the irregularity



Fig. 8 Pie chart for the percentages of asperity dips under different sampling intervals

characteristics of the profiles as the feature vectors. The feature vectors of the standard profiles were obtained based on the profile reproducing method and inclination distribution analysis. The feature vectors of a group of nine test profiles were determined according to the undulate shapes of the ten standard profiles and test samples themselves. Additionally, we proposed the Jaccard, Dice, and cosine similarity measures between the feature vector sets of test profiles and ten standard profiles. By the calculations of the similarity measures and the relation indices, we obtained the JRC value of test profiles according to the maximum relation index (1.00). Finally, the comparative analysis was provided between the VSMs methods and the JRC evaluation methods introduced by roughness parameters of  $Z_2$ ,  $R_{\rm p}$ , and  $\theta_{\rm max}^*/[C+1]_{2D}$ . The results of the proposed methods in this paper agreed well with previous methods. In addition, JRC evaluation methods based on VSMs were applicable and effective in the JRC evaluation. The vector similarity measure methods can overcome the drawback of the existing visual evaluation methods and indicate its rationality for JRC evaluation.

Joint surface roughness is scale dependent, so it is necessary to characterize surface roughness with multiple scales. For future work, more efforts will be made to finding a suitable VSMs for determining JRC values of different sized rock joints.

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