Study of deformation and failure in an anisotropic rock with a three-dimensional discrete element model

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Abstract

This paper is devoted to numerical analysis of deformation and failure of transversely isotropic rocks. A three-dimensional discrete element (DEM) model is proposed in the framework of the particle flow code (PFC). The anisotropic rocks are characterized by a matrix phase in which non-persistent weak layers are embedded. The mechanical behavior of the matrix is described by a non-linear bond contact model while that of weak layers by a smooth joint contact model. The local elastic and strength properties in the bond and smooth joint models are calibrated from the corresponding macroscopic properties. Numerical predictions are compared with experimental data obtained from triaxial compression tests performed on a clayey rock, Tournemire shale. The anisotropic behavior of both elastic modulus and failure strength is well reproduced. The influence of confining stress on the failure strength of shale rock is also captured. A series of three dimensional numerical simulations are further performed for different orientations of weak layers and confining stresses. The effect of weak layers and confining stress on both local cracking process and macroscopic failure mode of rock samples is investigated and discussed.

Keywords: Anisotropic rocks, Three dimensional discrete element model, Weak layers, Smooth joint contacts, Nonlinear bond model, Confining stress effect

1. Introduction

Inherent anisotropy is one of the most representative features of many rocks, especially in sedimentary and metamorphic rocks. The micro-structure of anisotropic rocks is generally characterized by oriented fabric elements such as bedding or weak layers, oriented mineral grains and pores, as well as oriented joints. The deformation and strength properties of anisotropic

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rocks are strongly dependent on the loading orientation with respect to these fabric elements.

A large number of experimental studies have been conducted on different kinds of anisotropic rocks. It is not easy to make an exhaustive review of all previous studies and only some representative ones are mentioned here. For instance, [Niandou et al. \[1\]](#) have investigated the effect of weak layers orientation on the plastic deformation and failure strength of Tournemire shale under different values of confining stress. It is found that depending on the loading orientation with respect to weak layers, the failure process of this rock can be characterized by three mechanisms, cracking of clayey matrix, sliding along weak layers and mixed cracking-sliding. [Cho et al. \[2\]](#) have studied the deformation and failure strength of three different types of anisotropic rocks and obtained similar results. [Fjr and Nes \[3\]](#) have performed uniaxial and triaxial compression tests on Mancos shale to investigate the effect of confining stress on failure process. Some other studies have focused on the fracture initiation and propagation in transversely isotropic rocks [\[4–6\]](#). Most of previous studies have shown that the geometrical and mechanical properties of weak layers played an essential role on the deformation and failure process of anisotropic rocks.

Based on experimental studies, different kinds of analytical strength criteria have been proposed. Also without giving an exhaustive review, the first generation of criteria have been directly deduced from those for isotropic rocks by introducing some empirical functions to reproduce the evolution of main strength parameters with loading orientation, for instance cohesion and frictional angle [\[7, 8\]](#). Then, some authors have developed more physically-based three dimensional strength criteria by considering a set of weak joints in rock samples [\[9, 10\]](#). The failure strength of anisotropic rocks is controlled by the weak joints when the loading orientation is between 15° and 75° [\[11\]](#) with respect to these joints. In a more rigorous way, the representation theorem of tensorial functions has been proposed and applied to the formulation of strength criteria of anisotropic rocks [\[12–14\]](#). More recently, some authors have proposed the critical plane approach [\[15\]](#) and the fabric tensor based method [\[16\]](#) for the description of mechanical strength of anisotropic rocks.

In order to complete the analytical approaches mentioned above and also to better capture the local cracking mechanism of rocks and soils, alternative numerical approaches have been developed, especially with particle-based methods. In these methods, the failure of rocks and soils is related to the cracking or breaking of contact surfaces between grains. Among various numerical methods, the particle flow code(PFC) is one of the widely used ones. The basic principles of this method can be found in [\[17, 18\]](#). With this method, it is possible to describe the individual motion of grains and the local deformation of contact surfaces. Although ini-

40 tially developed for soil-like materials, with the help of bonded contact models, this discrete method has also successfully been applied to rock-like cohesive materials [19–22]. Recently, by introducing smooth joint contact models [23, 24], the particle flow method has been extended to describe anisotropic rocks, both in two-dimensional [25–28], and in three-dimensional configurations [29, 30]. Unlike analytical criteria, in these numerical models, it is possible to consider
45 the effect of spatial distribution and orientation of weak layers on strength of anisotropic rocks. Some modified smooth-joint contact models have been proposed for modeling jointed rock masses [31–33]. The particle flow models have further been applied to the analysis of stress-induced borehole breakout around underground structures [34] and modeling of hydraulic fracturing [35].

50 However, in most previous studies, simple models have been used for both bond and smooth joint contacts. In particular, in those models, the shear strength is a linear function of normal stress. As a consequence, those models are not able to well reproduce the mechanical strength of rocks in a wide range of confining stress. In our previous study [36], we have proposed an improved nonlinear bond model for isotropic rocks. The proposed nonlinear bond model is
55 able to well capture the effect of confining stress on the mechanical response of isotropic rocks. The motivation of the present study is to describe the mechanical behavior of anisotropic rocks under a large range of confining stress. The following methodology is adopted. The nonlinear bond model is first extended to anisotropic rocks. The elastic and strength parameters of the model depend on the orientation of bond contacts. Smooth joint contacts are then introduced to
60 represent the inherent weak layers in anisotropic rocks. A unified model is further proposed to describe the mechanical strength of smooth joint contacts. The present study shall significantly improve the previous studies and provide an efficient numerical model for the description of deformation and failure process of anisotropic rocks.

The present paper is organized as follows. The numerical procedure for the generation of
65 anisotropic rock samples is first presented. The formulation of the unified model for both bond and smooth joint contacts is then given. After the calibration of the model’s parameters, three dimensional simulations of triaxial compression tests are performed on an anisotropic clayey rock, Tournemire shale. Numerical results are compared with experimental data. A series of sensitivity calculations are further realized. The obtained results are analyzed in order to
70 investigate the effect of weak layers and confining stress on the deformation and failure behavior of anisotropic rock samples.

In the present paper, the following sign convention will be adopted. The compressive normal stress is denoted as a positive value and the tensile normal stress as a negative one.

2. Generation of anisotropic rock samples

75 In the framework of discrete element method for rock-like materials, the continuum rock mass is replaced by an assembly of discrete particles which are connected by bonded contact interfaces. In the case of isotropic materials, the contact interfaces are randomly distributed in space without preferential orientations. In anisotropic materials, mechanical properties are orientation dependent. We assume that the anisotropic properties are due to the presence of
80 oriented weak layers. The orientation of weak layers is defined by the angle θ with respect to $x - y$ plane in the global coordinates frame, as illustrated in Fig. 1. In order to define the loading orientation with respect to weak layers, a local coordinates frame is also introduced. At the microscopic level, anisotropic rocks are represented by an isotropic rock mass in which weak layers are embedded. The isotropic rock mass is composed of a random assembly of
85 particles with bonded contacts. The weak layers are represented by smooth joint contacts. Therefore, the following numerical procedure is proposed for the generation of anisotropic rock samples. An isotropic distribution of bonded contacts is first constructed. A number of smooth joint contacts are then inserted in the selected orientation θ , which is defined by the angle with respect to the $x - y$ plane (see Fig. 2). For the insertion of smooth joint contacts in the isotropic
90 rock matrix, a number of reference contacts are first selected by the following method. The orientation of each contact is defined by the vector line linking the centers of two neighboring particles $O_1 - O_2$ as shown in Fig. 3. The orientation of the linking line is given by the angle $90 - \theta$ with respect to the $x - y$ plane. The angle $90 - \theta$ is further decomposed into two angles, respectively as α in the $y - z$ plane and β in the $x - z$ plane. If two angles α and β both
95 meet the specified values, then the contact between these two neighboring particles is chosen as the reference contact O . Each reference contact is further taken as the center point of a smooth joint zone which is assumed to be penny shaped (see Fig. 3). The size of each smooth joint zone or weak layer zone is further defined by its radius R . Finally, all contacts inside the penny shaped weak layer zone are considered as the smooth joint contacts, such as C_1 and C_2
100 in Fig. 3.

Fig. 1: Definition of weak layer orientation

Fig. 2: Illustration of anisotropic rock sample generation

Fig. 3: Illustration of choice of smooth joint contacts

The spatial distribution of contact number is dependent on the shape and size of numerical sample. If a constant radius R is used for all weak layers, the number of smooth joint contacts inside each weak layer zone will depend on its orientation. In order to avoid this inconvenient geometrical effect and obtain a quasi constant number of smooth joint contacts when the shape and size of rock samples are modified, we assume that the radius of weak layer zone R is a function of its orientation angle θ as follows:

$$\begin{cases} R = (1 + f_R(\theta)) R_0 \\ f_R(\theta) = r_R |\cos(\pi/2 - \theta)| \end{cases} \quad (1)$$

R_0 denotes the radius of the weak layer zone with $\theta = 0$. r_R is a dimensionless parameter introduced here to obtain a quasi constant number of smooth joint contacts for different orientations of weak layer zones. Its value depends on the shape and size of numerical sample. For a three dimensional cubic sample, as the size of sample is identical along three axes, the radius of weak layer zone should also be the same in all orientations. Therefore, in this particular case, one gets $r_R = 0$.

By using the numerical procedure described above, seven anisotropic rock samples are generated. The size of all the samples is $40 \times 40 \times 80 \text{ mm}^3$. The average radius of particles is taken as 1 mm . The choice of this value is motivated by the fact that the average radius of particles should be small enough with respect to the size of samples, for instance 40 to 50 times smaller. Further, according to the size of rock samples considered here, the values of R_0 and r_R are

respectively taken as 1 mm and 0.3. Seven different orientations of weak layers are considered, ranging from 0° to 90° with a constant interval of 15° . Three representative samples are shown in Fig. 4. In these Figures, we also show the spatial distribution of bond contacts and smooth joint contacts. One can see that the number of smooth joint contacts in all anisotropic rock samples is nearly the same and about 400. This indicates that the proposed generation procedure is able to correctly reproduce anisotropic rock samples containing weak layers in different orientations.

Fig. 4: Three representative anisotropic rock samples and corresponding spatial distribution of bond contacts and smooth joint contacts

3. Presentation of contact models

In order to describe the mechanical behavior of anisotropic rocks, we propose here a unified mechanical model for the bond contact in the rock matrix and the smooth joint contact in the weak layers. The proposed model is then implemented in the standard 3D Particles Flow Code. The formulation of the model is presented in this section.

3.1. Bond contact model

Before failure of bond contacts, their mechanical behavior is described by an elastic model. In the present study, the emphasis is put on the failure process of bond contacts. The elastic behavior of bond contacts is described by a simple linear model already implemented in the PFC3D code [37]. The local force-displacement relations are given by:

$$F_n = k_n u_n \quad (2)$$

$$\Delta F_s = -k_s \Delta u_s \quad (3)$$

125 F_n and u_n respectively denote the normal force and relative displacement at the contact; ΔF_s and Δu_s are the incremental shear force and relative displacement. k_n is the secant normal elastic stiffness while k_s is a tangent shear elastic stiffness.

When the local contact forces reach critical values, the bond contact is broken. The breakage of contact is defined by a local failure criterion. In the standard PFC3D code, two linear failure criteria are available [18, 38], namely the contact bond model (CBM) and parallel bond model (PBM). As mentioned above, those models are not able to correctly take into account the effect of normal force on the shear strength of bond contacts. In our previous study [36], a nonlinear failure criterion has been developed and successively applied to modeling the mechanical strength of isotropic rocks for a wide range of confining stress. This model is here
135 extended to anisotropic rocks.

The proposed nonlinear failure criterion is illustrated in Fig. 5. Two failure mechanisms are considered, respectively the tensile failure and shear failure. The tensile failure occurs when the normal contact force $F_{t,f}$ exceeds the normal strength φ_t . For the shear failure, it is known that the shear strength of contact is dependent on the compressive normal force F_n . As a consequence at the macroscopic scale, the macroscopic shear strength of rocks is strongly sensitive to confining stress. In order to consider this feature, the shear strength is described by a bi-linear function of the normal contact force. When the normal contact force is less than the transition threshold φ_{cr} , the shear strength is defined by the cohesion φ_s and the frictional angle ϕ_1 . When the normal contact force is higher than φ_{cr} , a second frictional angle ϕ_2 is introduced to define the shear strength under high confining stress. In general, we have $\phi_2 < \phi_1$ due to the fact that initial micro-cracks in rocks are closed and the asperity of some micro-cracks can be destroyed when the confining pressure is high. Physically, the transition normal contact force φ_{cr} defines two regimes of shear failure in rocks respectively under low and high confining stress. The value of φ_{cr} can be identified from the macroscopic failure surface

obtained from triaxial compression tests under a large range of confining stress, as mentioned in [36]. The failure criterion for contact interface is then expressed in the following form:

$$F_{t,f} = \varphi_t, \text{ tensile failure} \quad (4)$$

$$F_{s,f} = \begin{cases} 0 & , F_n < \varphi_t \\ \varphi_s + F_n \tan \phi_1 & , \varphi_t \leq F_n \leq \varphi_{cr} \\ \varphi_s + \varphi_{cr}(\tan \phi_1 - \tan \phi_2) + F_n \tan \phi_2 & , F_n \geq \varphi_{cr} \end{cases} \quad (5)$$

As a difference with classical soil-like materials, most rocks are cohesive materials. In the particle-based models as that used here, discrete particles are bonded by contact interfaces. When a contact interface is broken, its tensile strength or inherent cohesion is assume to be completely destroyed. The breakage of contact interface can be seen as an equivalent process to micro-cracking in rocks. It is known that the surfaces of micro-cracks in most rocks are not fully smooth. Under a compressive normal stress, those micro-cracks are closed and exhibit some residual shear strength. This residual shear strength is here interpreted by a residual value of the friction coefficient of contact interface denoted by ϕ_r . The residual strength envelop is shown in Fig. 5 and is described by the following criterion:

$$F_{s,r} = \begin{cases} 0 & , F_n \leq 0 \\ F_n \tan \phi_r & , F_n > 0 \end{cases} \quad (6)$$

Fig. 5: Peak and residual strength envelopes of bi-linear criterion for bond contact and smooth joint contact

3.2. Smooth joint contact model

In the unified model proposed in this study, the failure of smooth joint contacts is described by the same relations as those for the bond contacts, given in 4, 5 and 6. However, the strength

parameters (cohesion and frictional coefficients) of the smooth joint contacts are deteriorated with respect to those of the bond contacts. Furthermore, after failure, the relative motion of particles around a broken smooth contact is different with that of particles around a broken bond contact. A comparison between two kinds of contacts is given in Fig. 6. For a broken bond contact, two neighboring particles are restricted to rolling one to another around the contact interface as shown in Fig. 6(a). However, for a broken smooth joint contact shown in Fig. 6(b), the pair of particles can slide along the orientation of weak layer θ and move each to other with a limited overlap.

Fig. 6: Relative motions of two neighboring particles around a broken bond contact and a broken smooth joint contact

3.3. Anisotropy of elastic stiffness

In particle-based models, the elastic behavior is described by the local normal and shear elastic stiffness coefficients of contact surfaces, respectively denoted as k_n and k_s . The issue here is to calibrate these local elastic coefficients from the macroscopic elastic properties measured from laboratory tests. For this purpose, a number of numerical investigations have been performed, for instance [39, 40]. It is found that it is possible to establish some empirical relations between the local elastic coefficients and macroscopic elastic modulus and Poisson's ratio. The local tangent elastic stiffness k_s can be related to the normal one k_n by the ratio coefficient k_r such that $k_s = k_r \cdot k_n$. Further, the ratio k_r depends on the macroscopic Poisson's ratio and varies in the range 1.0-3.0. These previous results are here adopted. However, in isotropic materials, the local elastic stiffness coefficients are kept constant for all contacts of different orientations. This is not the case for anisotropic materials. The elastic stiffness coefficients k_n and k_s of a contact should vary with its relative orientation with respect to the weak layers. For instance, the elastic stiffness of contacts parallel to the weak layers is generally smaller than

that of contacts in other orientations. Inspired by [41], the following relations are proposed:

$$\begin{cases} k_n = (1 + r_k \cdot f(\phi, \theta)) \cdot k_n^0, & k_s = (1 + r_k \cdot f(\phi, \theta)) \cdot k_s^0 \\ k_n^0 = 2E_c \cdot (R_1 + R_2), & k_s^0 = k_r \cdot k_n^0 \\ f(\phi, \theta) = a / (b + (1 - b) e^{-c\delta}) - a, & \delta = \arctan |\tan(\phi - \theta)| \end{cases} \quad (7)$$

ϕ is the orientation angle of contacts. k_n^0 and k_s^0 denote the elastic stiffness of contacts for $\phi = \theta$. As mentioned above, the value of k_n^0 is calculated from the elastic modulus E_c and the radius of two neighbouring particles, denoted by R_1 and R_2 . The value of k_s^0 is related to that of k_n^0 through the ratio coefficient k_r .

Three parameters a , b , and c are introduced in the function $f(\phi, \theta)$ to account for the spatial variation of local elastic stiffness of contacts. This function defines the ratio between the stiffness of contacts with the direction angle ϕ and that with the angle θ . The variation of $f(\phi, \theta)$ with the relative angle δ is presented in Fig. 7 for different values of b while the values of a and c are equal to 0.1. The maximum value of $f(\phi, \theta)$ defines the anisotropy degree of elastic stiffness and it is sensitive to the value of b . The maximum value of $f(\phi, \theta)$ is found for $\delta = 90^\circ$. It means that the maximum of elastic stiffness is found for the contacts which are perpendicular to weak layers. At the macroscopic scale, with the help of the function $f(\phi, \theta)$, it is possible to describe the variation of elastic modulus with loading orientation in anisotropic rocks. The values of three parameters a , b and c can be identified from experimental values of elastic modulus measured in uniaxial or triaxial compression tests performed in different loading orientations.

Fig. 7: Illustration of the function $f(\phi, \theta)$, $\delta = \arctan |\tan(\phi - \theta)|$

3.4. Anisotropy of mechanical strength

Similarly to the elastic stiffness, the mechanical strength parameters of a contact are also dependent on its orientation with respect to the weak layers. According to previous studies

[36, 42], among five parameters involved in the failure criterion of contacts defined above, the tensile strength φ_t and the pure shear strength φ_s have a more significant effect than other parameters on the macroscopic mechanical strength. Therefore, it is assumed that their values vary with the relative orientation angle of contacts with respect to the weak layers orientation $\phi - \theta$. A similar variation function as that for the elastic stiffness is used, that is:

$$\begin{cases} \varphi_t = (1 + r_s \cdot f(\phi, \theta)) \cdot \varphi_{t0}, \varphi_s = (1 + r_s \cdot f(\phi, \theta)) \cdot \varphi_{s0} \\ f(\phi, \theta) = a / (b + (1 - b) e^{-c\delta}) - a, \delta = \arctan |\tan(\phi - \theta)| \end{cases} \quad (8)$$

φ_{t0} and φ_{s0} are the strength parameters for the contacts parallel to the weak layers, i.e. $\phi = \theta$. For the sake of simplicity, the values of three parameters a , b and c are the same as those for the elastic stiffness.

4. Three-dimensional simulation of conventional triaxial compression test

In order to assess the efficiency of the proposed model, three-dimensional simulations are performed to investigate macroscopic responses of anisotropic rocks in conventional triaxial compression tests. Numerical results are compared with experimental data obtained on Tournemire shale from the Massif Central in France. This is a clayey rock with sub-horizontal parallel weak layers. A series of conventional triaxial compression tests were performed on this rock with different values of confining stress and loading orientations [1].

4.1. Calibration of model's parameters

In view of performing numerical simulations, a three dimensional sample is first generated by using the procedure proposed above. As shown in Fig. 4, the numerical sample is a cuboid of 40mm wide and 80mm high. It is constituted of about 20,000 randomly distributed particles. The largest radius of particle is 1.2 mm, and the smallest one is 0.8 mm. It is noted that the mechanical behavior of samples may be affected by the choice of particle size. According to a large number of previous studies, for instance [36, 43], the particle size effect is largely reduced when the sample size is about 50 times larger than the average particle radius. This is nearly the case for the present study. Other geometric parameters can be found in Table 1 and Table 2. Parallel weak layers are inserted in the sample with the algorithm proposed above. However, in practice, the selection of smooth joint contacts inside the penny shaped weak layers is a delicate task. Indeed, it is difficult to identify the contacts whose orientation is exactly perpendicular to the weak layers. Therefore, it is necessary to introduce a small angle tolerance for the selection of smooth joint contacts. In the present study, we have taken $\pm 5^\circ$

and $\pm 4^\circ$ as the tolerances of the angles α and β respectively. There is no theoretical criteria
 190 to choose such angel tolerances. Their values should be small enough so that the thickness of
 weak layers is much smaller than the sample size. Further the reference radius of smooth joint
 contact zone R_0 , i. e. the radius of the smooth joint contact zone with $\theta = 0$ as defined in (1),
 is taken as 2 mm.

After the numerical sample is generated, the elastic and strength parameters are calibrated
 195 respectively for the bond and smooth joint models. This is done during two stages. In the
 first stage, the local elastic parameters are identified from the macroscopic elastic properties
 obtained in triaxial compression tests by an iterative procedure. We first set some large values
 for the local strength parameters of the bond and smooth joint models so that no cracking of
 contacts occurs and its effect on elastic response is eliminated. The coefficient k_r is initially
 200 set to the value of 2.0. The maximum value $f_{\max}$ of the function $f(\phi, \theta)$ is taken as 5.0. The
 stiffness coefficients k_n^0 and k_s^0 of the weak layers with the orientation 0° are obtained from the
 contact elastic modulus E_C^0 , which is calculated from the macroscopic Young modulus E^0 . The
 elastic stiffness coefficients k_n^{90} and k_s^{90} of the contacts with the orientation 90° are determined
 from the contact elastic modulus E_C^{90} which is calculated from the macroscopic Young modulus
 205 E^{90} . Then, the value of $f_{\max}$ is updated and adjusted. After several iterations, the final local
 elastic parameters of two bond models can be obtained.

In the second stage, the elastic parameters identified during the first stage are fixed while the
 strength parameters involved in two contact models are identified by using macroscopic failure
 stresses obtained in triaxial compression tests performed under two representative orientations,
 210 for instance 0° and 45° . The identification procedure is further divided into two steps. In
 the first step, the peak stress from a test under a low confining stress and with the loading
 orientation 0° is used. In this case, as the axial stress is perpendicular to weak layers, the
 effect of weak layers is generally small and is neglected. Only the failure of bond contacts
 is considered for this loading orientation. The values of two frictional coefficients $\tan \phi_1$ and
 215 $\tan \phi_2$ are initially taken as identical. Starting from some arbitrary large values, the values of
 φ_t and φ_s are step by step updated until the experimental peak stress is well reproduced by
 the numerical prediction. In the second step, the peak stress from a test under a low confining
 stress and with the loading orientation 45° is used. For this orientation, the role of weak layers
 is dominant. By keeping the strength parameters of bond contacts unchanged, the strength
 220 parameters of the smooth joint model are updated to reproduce the experimental peak stress.
 Finally, taking two tests under a high confining stress, the values of two frictional coefficients
 $\tan \phi_1$ and $\tan \phi_2$ as well as the transition threshold φ_{cr} are fitted from experimental peak

stresses. Note that in some cases, it is needed to make a updating of elastic parameters due to the interaction between elastic deformation and failure process. The set of parameters obtained for Tournemire shale are given in Table 1 and Table 2.

Table 1: Input parameters for three-dimensional sample generation

Parameters used in $f(\phi, \theta)$	Elastic parameters	Strength parameters
Variables a, c	0.1, 0.1	0.1, 0.1
Variables b, $f_{\max}$	$1.23 * 10^{-2}$, 9.0	$1.23 * 10^{-2}$, 9.0
Variable r_k	1.0	—
Variable r_s	—	0.15

Table 2: Geometrical, physical and mechanical parameters for bond model and smooth joint model

model			
3D Sample			
Width of sample (mm)	W	40.0	
Height of sample (mm)	H	80.0	
Total grain number in sample		20916	
Average radius (mm)	$\bar{r}$	1.0	
Initial void ratio		0.2	
The reference radius (mm)	R_0	2.0	
Coefficient r_R in function $f_R(\theta)$	r_R	0.5	
Mechanical parameters		Bond model	Smooth joint model
Normal contact stiffness for test (N/m)	k_n^0	$5.6 * 10^8$	$8.0 * 10^7$
Shear contact stiffness for test (N/m)	k_s^0	$2.8 * 10^8$	$4.0 * 10^7$
Inter-particle coefficient of friction	$\tan\phi_1$	0.36	0.6
Inter-particle coefficient of friction	$\tan\phi_2$	1.9	1.3
Normal bond strength (N)	φ_{t0}	$2.5 * 10^4$	$0.42 * 10^4$
Shear bond strength (N)	φ_{s0}	$8.0 * 10^4$	$0.73 * 10^4$
The critical normal stress (N)	φ_{ncr}	$2.0 * 10^5$	$1.5 * 10^5$
Inter-particle coefficient of friction	$\tan\phi_r$	0.05	0.05

Note: These parameters for the smooth joint model are calculated with the average radius of weak layer zone $\bar{r}$.

4.2. Experimental verification

In order to verify the consistency of determined parameters, the macroscopic axial elastic modulus and peak stress of Tournemire shale are predicted by the proposed model. In Fig. 8(a), the variation of axial elastic modulus for two different confining stresses (5MPa and 50MPa) are

230 presented. One can see that the proposed model correctly reproduces the anisotropic property of macroscopic elastic modulus. In Fig. 8(b), the variation of peak stress with confining stress is presented for two loading orientations (0° and 45°). It is found that the nonlinear pressure dependency of peak stress is well described by the unified bond and smooth joint model.

Fig. 8: Comparison of axial elastic modulus and peak stress between numerical results and experiment data for Tournemire shale

In order to further check the performance of the numerical model, other numerical simulations are performed for five confining stresses (1MPa, 5MPa, 20MPa, 40MPa and 50MPa) and seven loading orientations (ranging from 0° to 90°). The obtained numerical axial stress-strain curves are presented in Fig. 9. For all confining stresses, the strain-stress curves are clearly dependent on loading orientation. On the other hand, for a given loading orientation, the mechanical response is influenced by confining stress. In particular, for loading orientations close to 0° or 90° , there is a clear transition from brittle to ductile behavior when the confining stress increases. This is a typical property of most rocks. For loading orientations around 45° , this transition seems less pronounced. For such orientations, the failure process of anisotropic rocks is strongly influenced by the frictional sliding along weak layers. With further experimental data, the smooth joint contact model can be improved to better capture this transition feature. For a quantitative comparison, the numerical values of peak differential stress are compared with experimental data in Fig. 9(e). A very good agreement is obtained. For all loading orientations, the peak stress as well as the residual stress increase when the confining stress is higher. There are two maximum values of peak stress obtained either at 0° or 90° . The minimum value of peak stress occurs between 30° and 60° for all confining stresses. For convenience, two strength anisotropy coefficients are usually defined as follows:

$$K_1 = \frac{(\sigma_1 - \sigma_3)_\parallel}{(\sigma_1 - \sigma_3)_\perp} \quad (9)$$

$$K_2 = \frac{(\sigma_1 - \sigma_3)_{\max}}{(\sigma_1 - \sigma_3)_{\min}} \quad (10)$$

K_1 defines the ratio between the peak stresses in the principal directions, respectively parallel and perpendicular to the weak layers, and K_2 gives the ratio between the maximum and minimum peak stress. The values of these two coefficients for Tournemire shale under different confining stresses are shown in Fig. 10. The value of K_1 is nearly constant and equal to 1.0, indicating that the strength difference between the two principal directions is very small. The value of K_2 decreases from 1.96 to 1.47 with the increase of confining stress from 1MPa to 50 MPa. This implies that the strength anisotropy is attenuated when the confining stress becomes high. These numerical results are also consistent with the experimental data obtained from other anisotropic rocks [11].

Fig. 9: Stress-strain curves and peak differential stress for Tournemire shale samples with different loading orientations and under various confining stresses

Fig. 10: Variation of anisotropy coefficients of mechanical strength versus confining stress

5. Further analysis of deformation and failure process

After the description of macroscopic stress-strain responses of anisotropic rocks in the previous section, the spatial distribution of deformation and broken contacts in three dimensional specimens are now discussed.

5.1. Spatial distribution of micro-cracks

We adopt here the terminology commonly used for rock-like materials. When a cohesive contact between two particles is broken according to the failure criteria defined above, the contact is seen as a micro-crack.

In Fig. 11, we show the stress-strain curves and the evolution of broken contact numbers in triaxial compression tests with three loading orientations ($0^\circ, 45^\circ, 90^\circ$) and two confining stresses (1MPa and 40MPa). In order to better capture the failure process of samples in the different tests, four characteristic stages are identified on the stress-strain curve of each test. The stage 1 corresponds to the initiation of micro-cracks, the stage 2 is defined by the peak differential stress, the stage 3 is related to the coalescence of micro-cracks and the stage 4 represents the onset of macroscopic cracks and the beginning of residual strength phase. In this study, we put the emphasis on the macroscopic cracking stage. Therefore, unless specified, all the results presented in the subsequent figures are collected at the stage 4, namely at the points A4, B4, C4, D4, E4 and F4 shown in Fig. 11.

It is found that the local cracking process is both influenced by confining stress and loading orientation. In a general way and for two confining stresses considered here, in the matrix zone, the number of tensile cracks is systematically higher than that of shear cracks. For the low confining stress of 1MPa, the number of shear cracks is very small. It increases when

the confining stress reaches 40MPa. This means that the failure process of the matrix zone is dominated by tensile cracking, and the shear cracking becomes significant only when the confining stress is high enough. However, in the weak layers, the number of shear cracks is higher than that of tensile cracks, except for the case of 1MPa confining stress and with the orientation of 90° . In this case, the weak layers are parallel to the axial stress. When the weak layers are weakly confined, many contacts are broken by extension. In all other cases, it seems that the shear cracking is dominating against the tensile cracking. However, the difference of number between tensile and shear cracks is much less important for the weak layers than for the matrix zone. It seems that the failure process inside the weak layers is characterized by a combined shear and tensile cracking mode.

In Fig. 12, one gives the repartition of different kinds of cracks for seven loading orientations and three confining stresses. These results confirm that the failure process of the matrix zone is dominated by tensile cracks and the failure of the weak layers by combined tensile and shear cracking. When the confining stress is high, the failure of weak layers is controlled by shear cracks for all loading orientations. Under a low confining stress, this is also the case for the loading orientations between 0° and 30° . But for $\theta \geq 30^\circ$, it seems that the tensile cracking plays an important role in the weak layers. On the other hand, the total number of both tensile and shear cracks for different loading orientations and confining stresses can be further deduced from Fig. 12. It is found that for all loading orientations, the number of tensile cracks is dominating under low confining stress while the number of shear cracks continues to increase and becomes dominating when the confining stress is high enough.

In addition, the spatial distribution of micro-cracks in three dimensional samples is presented in Fig. 13 for five loading orientations and two confining stresses. It is found that for the two principal orientations, namely $\theta = 0^\circ$ and $\theta = 90^\circ$, one can observe a diffuse distribution of micro-cracks. For other orientations in the range of $15^\circ \leq \theta \leq 60^\circ$, there is clearly the formation of oriented localized cracking bands. The orientation of localized bands is nearly parallel to the weak layers. Therefore, for these loading orientations, the macroscopic failure is strongly controlled by that of the weak layers.

Moreover, for a deep investigation of the relationship between the failure mode and microscopic cracking process, the statistical analysis of spatial orientations of cracked contacts is performed and the obtained result is shown in Fig. 14 for three selected loading orientations and two confining stresses. It is interesting to observe that the spatial orientations of cracked bonds are strongly correlated with the loading orientation with respect to the weak layers.

Fig. 11: Number evolution of different kinds of micro-cracks for three selected loading orientations and two confining stresses of 1MPa and 40MPa (black for total crack number, red and yellow respectively for tensile and shear cracks in weak layers, blue and green respectively for tensile and shear cracks in matrix phase)

Fig. 12: Repartition of micro-cracks in matrix phase and weak layers for different loading orientations and confining stresses

Fig. 13: Spatial distribution of cracked contacts for different loading orientations under two different confining stresses (red and yellow for tensile and shear cracks in weak layers; blue and green for tensile and shear cracks in matrix phase)

Fig. 14: Spatial distribution of cracked contacts orientations for different loading orientations under low and high confining stresses (blue for matrix phase; red for weak layers)

5.2. Spatial distribution of displacement

On the other hand, the spatial distribution of particles displacements inside three dimensional samples is evaluated and shown in Fig. 15(a). Notice that the bottom surface of samples is blocked in the vertical direction. According to these results, it seems that the displacement pattern is more significantly influenced by loading orientation than by the confining stress. For instance, the displacement distributions are very similar for two principal orientations, 0° and 90° , for which the axial stress is respectively perpendicular and parallel to the weak layers. One obtains a quasi vertical gradient of displacement for these two cases. For other loading orientations in which the weak layers are inclined to the axial stress. The displacement distribution is clearly affected by the presence of weak layers and one obtains an inclined displacement gradient. We can distinguish two blocks. The upper one is sliding with respect to the lower one along an inclined direction. However, the spatial distribution of displacement does not provide an obvious description of macroscopic failure process of samples. For this reason, we introduce

the following displacement localization coefficient, which is defined by:

$$F_{coe} = \frac{|D_{i+1} - D_i|}{|(D_{i+1} - D_i)_{\max}|} \quad (11)$$

The quantity $(D_{i+1} - D_i)$ defines the displacement difference between two adjacent particles, and $(D_{i+1} - D_i)_{\max}$ the biggest value obtained in the sample. This coefficient helps us to capture the localization mode of relative displacement between particles. The obtained spatial distribution of the displacement localization coefficient is presented in [Fig. 15\(b\)](#). It is interesting to observe that the macroscopic failure mode in anisotropic rocks is strongly affected by the loading orientation with respect to the weak layers. When the applied stress is either perpendicular or parallel to the weak layers, one obtains a diffuse failure mode with some randomly distributed local failure zones. But there are no major localized bands. However, when the loading orientation is inclined to the weak layers, one can identify one or several major localization bands. The inclination of those bands is influenced by both the confining stress and loading orientation. For a given loading orientation, the inclination angle increases when the confining stress is higher. But for a loading orientation between 45° and 60° , it seems that the inclination angle of localized bands is nearly parallel to that of the weak layers and it is little affected by the confining stress.

Fig. 15: Spatial distribution of displacement and displacement localization coefficient in samples for different loading orientations and confining stresses

6. Concluding remarks

In this paper, we have developed a new particle-based model for modeling deformation and strength properties of anisotropic rocks. A numerical procedure has been proposed to generate oriented weak layers in a three dimensional rock sample. Each anisotropic sample is composed of bond contacts in the matrix phase and smooth joint contacts in the weak layers. We have further proposed a unified nonlinear model for the description of tensile and shear failure for both the bond and smooth joint contacts. The comparison between numerical predictions and

320 experimental data has shown that the proposed model was able to well reproduce the effect of confining stress on the elastic and strength properties of anisotropic rocks. The cracking process at the microscopic scale has been studied. In a general way, the failure of matrix phase is dominated by the tensile cracking while the shear cracking becomes more and more important when the confining stress increases. In the weak layers, the shear cracking is the
 325 dominant process, in particular under a high confining stress. Under a low confining stress, the tensile cracking plays an important role. For a given confining stress, the tensile cracking in the weak layers is more important when the loading direction is parallel to the weak layers. About the macroscopic failure mode of samples, it is found that when the loading direction is either parallel or perpendicular to the weak layers, one obtains a diffuse failure mode. For
 330 other situations, significant inclined localization bands can be formed. In particular, when the inclination angle of weak layers is between 45° and 60° , the localized bands are nearly parallel to the weak layers. In our future studies, we shall investigate time-dependent deformation and failure as well as hydromechanical interactions.

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