



Energy Evolution Law of Marble Failure Process Under Different Confining Pressures Based on Particle Discrete Element Method

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The energy dissipation usually occurs during rock failure, which can demonstrate the meso failure process of rock in a relatively accurate way. Based on the results of conventional triaxial compression experiments on the Jinping marble, a numerical biaxial compression model was established by PFC2D to observe the development of the micro-cracks and energy evolution during the test, and then the laws of crack propagation, energy dissipation and damage evolution were analyzed. The numerical simulation results indicate that both the crack number and the total energy dissipated during the loading process increase with confining pressures, which is basically consistent with the experiment results. Two damage variables were presented in terms of the density from other researchers' results and energy dissipation from numerical simulation, respectively. The energy-based damage variable varies with axial strain in the shape of "S," and approaches one more closely than that based on density at the final failure period. The research in the rock failure from the perspective of energy may further understand the mechanical behavior of rocks.

Keywords: particle flow, triaxial compression, energy dissipation, damage evolution, crack distribution

INTRODUCTION

Physical failure process of the material is always accompanied with energy conversion, which has great significance to investigate the energy evolution law in the process of loading the rock materials for solving practical engineering problems (Zhang et al., 2015). The energy evolution process is accompanied with damage, and the essence of damage is the generation and the development of micro-cracks. During the process of the rock deformation and failure, the micro-cracks have some relation to the energy.

Through the laboratory experiments, we can only observe the macro-cracks when the specimen is finally destroyed, and cannot trace the distribution and development of micro-cracks during the destruction. Therefore, the development of micro-cracks of rock materials were generally simulated by numerical software. For instance, Yang et al. (2014) conducted triaxial compression tests on sandstone and studied the geometry and distribution characteristics of cracks under different confining pressures by using CT scanning technology. Yin et al. (2015) used RFPA2D to analyze the crack propagation of a single-fissure composite rock. Zhao et al. (2020) studied the crack evolution of coal samples under impact loading by CDEM method. The 2D particle flow code (PFC2D) is an

important way to study the crack propagation characteristics of rock at present because it can obtain the dynamic development of the crack easily and quickly. With the method of PFC2D, Zhang et al. (2016) studied the crack propagation of the fractured sandstone under uniaxial compression at different loading rates. Zhang et al. (2015) found that the micro-cracks have a power function relationship with axial strain. Zhou et al. (2017) studied the displacement distribution of cracks after specimens failed, the changes in the number of cracks, evolution law of crack distribution and the distribution of crack angles. Yang et al. (2018) studied the crack evolution process of mudstone under single-stage and multi-stage triaxial compression. Huang et al. (2016) carried out numerical simulation on specimens with two non-parallel cracks, and analyzed the crack initiation, propagation and coalescence process of pre-cracked specimens under triaxial compression conditions. The generation, propagation and penetration of cracks in rock are accompanied with energy dissipation, the study of rock damage and deformation from the perspective of energy is objective and closer to its failure mechanism, which develop to be an important way to reveal the mechanism of rock failure (Yang et al., 2007; Zhang and Gao, 2015). Miao et al. (2021) studied the evolution characteristics of energy dissipation, friction energy dissipation and fracture energy dissipation of granite under triaxial cyclic loading. Qin et al. (2020) analyzed the three types of strain energy and the variation of dissipation energy with axial strain. Liu et al. (2013) analyzed the relationship between the total energy and stress and strain by means of the triaxial compression experiments on marble. Based on the laboratory triaxial compression tests, Li et al. (2020), calculated the energy and its distribution under different loading rates.

At present, the research on energy depends mainly on the laboratory tests, and the laboratory tests cannot obtain energy directly, which needs complex calculations. However, the energy can be calculated quickly and simply by PFC2D. Most scholars used PFC to carry out the triaxial compression tests of rock materials which focused on the micro-cracks, and little attention was paid to the combination of energy and micro-cracks. Therefore, the numerical simulation was conducted in this paper based on the laboratory tests to obtain the distribution and number of the micro-cracks within the specimen, and analyzed the energy under different confining pressures. In addition, the energy conversion process and the influence of confining pressures on the dissipation energy were analyzed. By analyzing the micro-cracks distribution and energy conversion law, the failure mechanism of the specimen under triaxial compression was explained.

MICRO-CRACK PROPAGATION

Laboratory Uniaxial and Conventional Triaxial Compression Experiments

The laboratory experiments were conducted on the THMC multi-functional coupling test machine developed by the Wuhan Institute of Rock and Soil Mechanics, Chinese Academy of Sciences. The marble samples were taken from the Jinping Hydropower Station, and processed into cylindrical samples

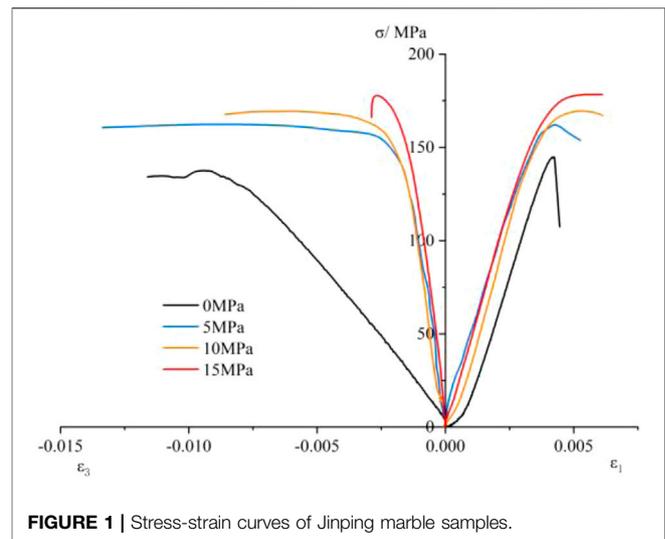


FIGURE 1 | Stress-strain curves of Jinping marble samples.

with diameter of 50 mm and height of 100 mm the triaxial compression experiments were conducted on the rock samples, with confining pressures of 0, 5, 10, and 15 MPa, respectively, and the stress-strain curves are shown in **Figure 1**. The stress-strain curve shows that the Jinping marble is a kind of classical hard brittle rock. **Figure 2** shows the failure profiles of the rock specimens, the fracture plane of marble under confining pressure of 0 MPa is more complicated than those under other confining pressures. The single fracture plane with diagonal failure occurs when the confining pressure is not zero.

Numerical Model

The contact models in PFC mainly include parallel bond model, which only transmits force, and contact bond model, which transmits both force and torque (Wang and Dai, 2019). Therefore, the parallel bond model was used in this article to numerically simulate the biaxial compression experiments. The size of the numerical model was consistent with the size of the laboratory marble sample. The investigation by Zhou et al. (2011) shows that when the particle size ratio is 1.66, the value of the particle radius has less effect on the simulation results. Thus, the particle size ratio was 1.66 here and the minimum particle radius was taken as 0.4 mm. After the model was established, the macro-mechanical parameters of the material were determined to match the corresponding meso-mechanical property parameters. The meso-parameters of the numerical model obtained by repeated debugging are listed in **Table 1**.

The uniaxial experiment was used to calibrate the meso-mechanical parameters of the specimen, and their stress-strain curves are shown in the **Figure 3**. The uniaxial strengths from the experiment and are almost identical with that from numerical model, especially at the peak of curve.

Parameter Verification by the Laboratory Experiment

To verify the numerical model in PFC2D, the numerical experiments under confining pressures of 5, 10 and 15 MPa

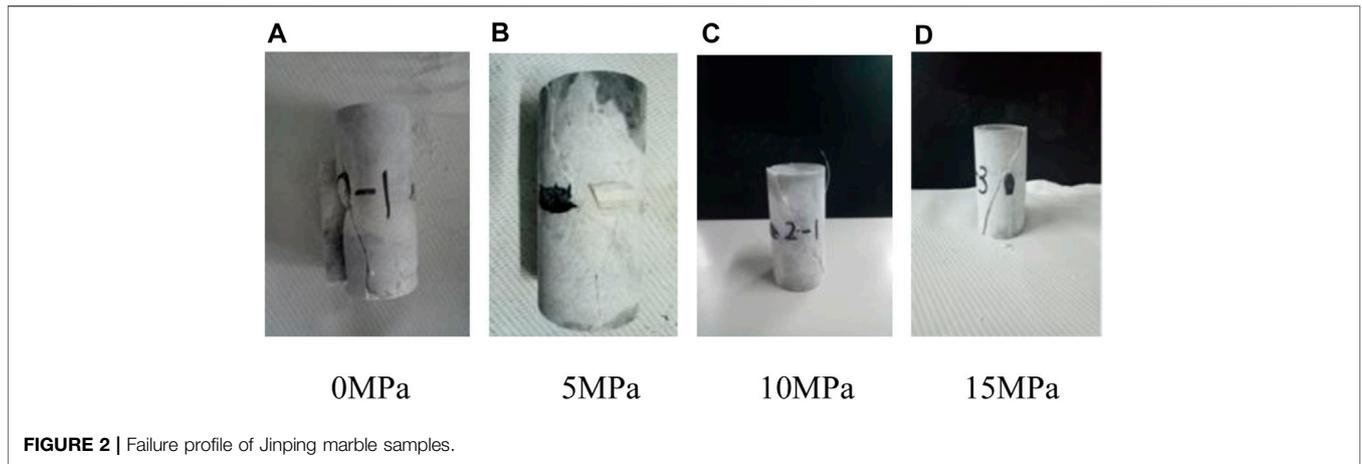


FIGURE 2 | Failure profile of Jinping marble samples.

TABLE 1 | Micromechanical parameters of numerical model.

Parameters	Values	Parameters	Values
Minimum particle size/mm	0.4	Parallel bond modulus/GPa	40
Particle size ratio	1.66	Parallel-bond normal strength/MPa	11
Density/(kg/m ³)	2,700	Parallel-bond shear strength/MPa	14
Particle contact Modulus/GPa	15.9	Ratio of normal-to-shear stiffness of the parallel bond	0.8
Particle contact stiffness ratio	0.8	Radius multiplier	1.0
Friction coefficient	0.5	–	–

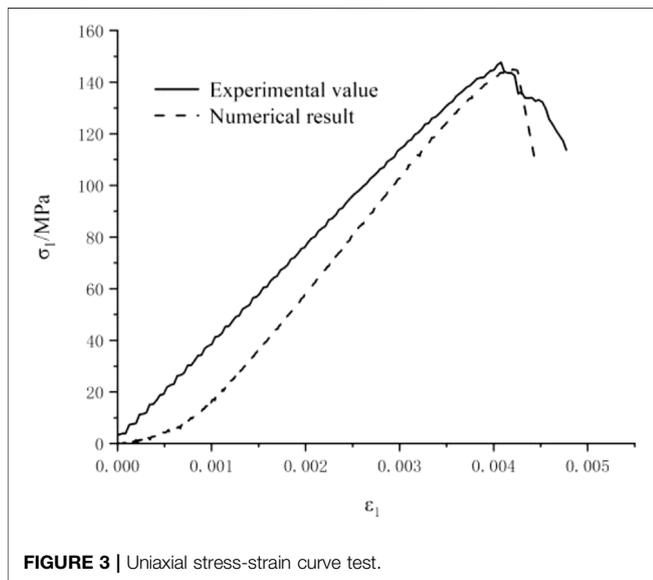


FIGURE 3 | Uniaxial stress-strain curve test.

were carried out. The peak strengths from laboratory experiments and numerical simulation under different confining pressures are listed in Table 2, which indicates that the numerical model can simulate the Jinping marble in a satisfactory way.

The Mohr-Coulomb criterion expressed by the principal stress can be written as:

$$\sigma = M\sigma_3 + N \tag{1}$$

TABLE 2 | Peak strengths from laboratory experiments and numerical simulation under different confining pressures.

Peak strength/MPa	Confining pressure/MPa			
	0 MPa	5 MPa	10 MPa	15 MPa
Numerical value	147.7	164.2	174.8	188.7
Experimental value	144.9	162.9	170.6	181.4

where M and N are strength criterion parameters. Eq. 1 indicates that the normal strength of the specimen has a linear relationship with the confining pressures (Yang et al., 2005). In addition, M and N have relationship with the internal friction angle ϕ and cohesion c (Wang et al., 2019a) as:

$$\phi = \arcsin[(M - 1)/(M + 1)] \tag{2}$$

$$c = N(1 - \sin\phi)/2 \cos\phi \tag{3}$$

Figure 4 indicates that the peak strengths, cohesions and internal friction angles of the numerical model and the marble specimen are generally similar but have some differences due to the use of round particles in parallel bond model and the influences of the samples and instruments in laboratory experiments (Zhou et al., 2017). The linear fitting correlation coefficients of numerical and laboratory experiments are 0.99 and 0.95, respectively. Linear fitting correlation coefficient from simulation experiments is larger than that from laboratory experiments, indicating that the laboratory experiment results are affected by many factors. Thus, the discreteness of laboratory

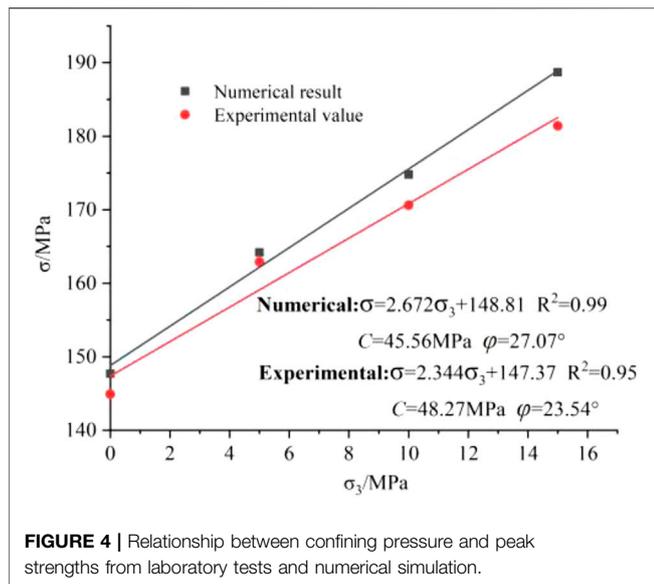


FIGURE 4 | Relationship between confining pressure and peak strengths from laboratory tests and numerical simulation.

experiments is greater than that of numerical simulation. The PFC2D used this paper to simulate the laboratory experiments can abandon the influencing factors such as sample preparation and test equipment.

Micro-Crack Propagation Law

Through the numerical simulation, the evolution process of the initiation, propagation and final penetration of the micro-cracks during the loading process of the specimen can be obtained. **Figure 5** shows the test results at 5, 10, and 15 MPa confining pressures. The pictures are the states at the pre-peak strength of 70%σ_c (σ_c is the peak strength), the post-peak strength of 45%σ_c, the residual stage and the specimen profile in laboratory, prospectively. The crack distribution of the numerical model during the failure process can be observed and the failure profile of the marble can be compared.

The whole process of macro-crack formation is shown in **Figure 5**. Under the same confining pressure, the damage or the number of micro-cracks was little and scattered before the stress reaches 70% of the peak strength. As the load approached the peak strength, the number of the micro-cracks increased, and the trend of macro-crack development was roughly observed. Then the specimens entered into the failure stage, and the micro-crack propagation accelerated, the crack at the post-peak strength of 45%σ_c extended and formed macroscopic fracture plane. When the specimens finally failed, the main shear failure plane formed, which were consistent with the failure mode of marble in the laboratory experiments.

The total number of the micro-cracks gradually increased with confining pressure. At the confining pressure of 15 MPa, the fracture plane was the widest and the cracks near the fracture plane were densest. The failure needs more energy at higher confining pressure to resist higher circumferential

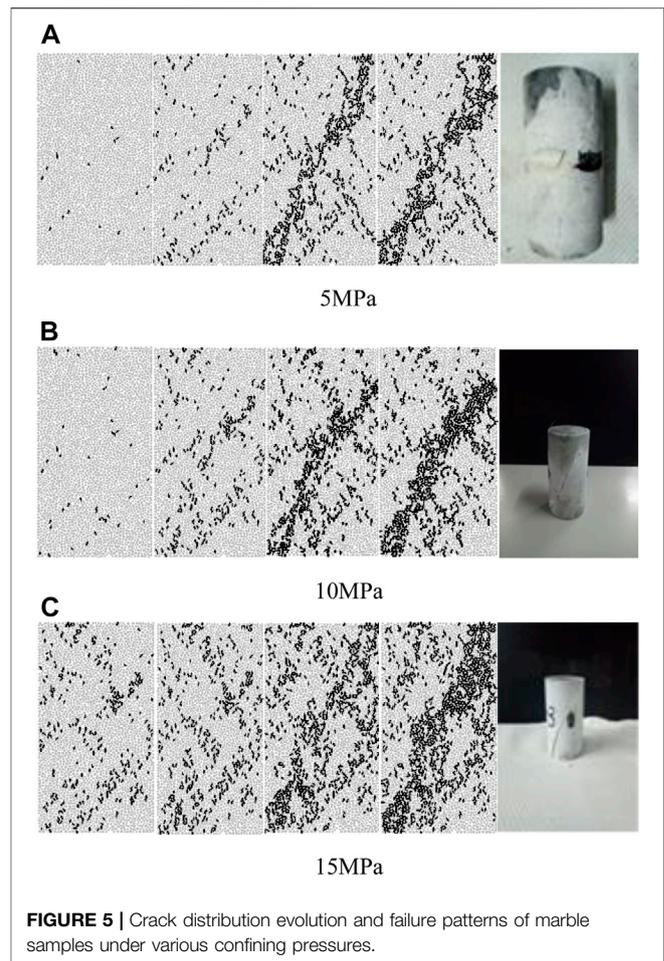


FIGURE 5 | Crack distribution evolution and failure patterns of marble samples under various confining pressures.

confinement, and thus more micro-cracks accumulated (Wang et al., 2019b).

ENERGY EVOLUTION LAW

Energy Conversion Law

Without considering the external environment, according to the first law of thermodynamics and the energy conservation law (Li et al., 2011), the boundary energy can be expressed as:

$$U = U^e + U^d \tag{4}$$

where U is the boundary energy, that is, the total energy input to the specimen by external work, U^e is the elastic strain energy, and U^d is the dissipation energy.

Energy conversion is the essence of the physical changes in materials. There are two kinds of energy conversion mechanisms, namely, the strain hardening mechanism and strain softening mechanism. The strain hardening mechanism considers that the energy input from the outside is converted into strain energy, and then accumulated inside the specimen to prevent plastic deformation of the specimen. The strain softening mechanism

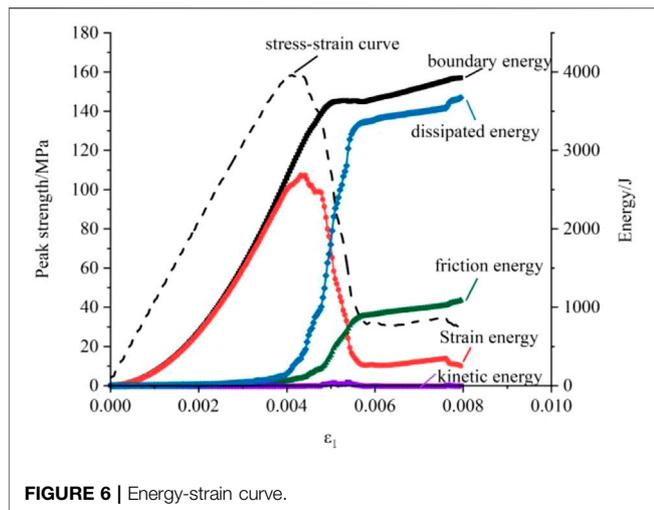


FIGURE 6 | Energy-strain curve.

considers that the strain energy is converted into dissipation energy, causing plastic deformation of the specimen (Zheng, 1990; Zhang and Gao, 2012).

The energy conversion in the rock loading is divided into four processes: energy input, energy accumulation, energy dissipation and energy release, which can be observed by PFC2D. Taking the confining pressure of 5 MPa as an example, the variation of energy with strain is shown in **Figure 6**.

Before the peak strength, most energy from external work was converted into strain energy, accumulating in the specimen, with concave strain energy curve in **Figure 6**. The strain energy increased slowly at the initial loading stage, and then gradually, the specimen behaved strain hardening. The energy dissipation before the peak strength was little, generally without friction energy and kinetic energy.

At the peak strength, the strain energy reached the maximum and the energy storage capacity of the specimen reached the limit. Subsequently, the strain energy converted into the dissipation energy at high speed, and the dissipation energy increased sharply. The specimen behaved strain softening. This stage was the failure stage, during which the micro-cracks expanded rapidly, and began to be affected by friction energy, with fast growth rate. In the later stage of failure, the strain energy stored in the specimen was released in the form of kinetic energy. Since the deformation and failure of the specimen were not severe, the kinetic energy increased insignificantly with small fluctuations.

In the residual stage, the strain energy was basically converted into dissipation energy. As a part of dissipation energy, the friction energy increased, and the residual strength in this stage was mainly provided by friction.

The investigation on the energy conversion law and the crack distribution evolution of the specimen indicates that the damage process of rock is related to the dissipation energy and friction energy which developed simultaneously with the crack. The dissipation energy and friction energy increase sharply when the micro-cracks develop rapidly. However, the strain energy decreases rapidly when the micro-cracks develop sharply.

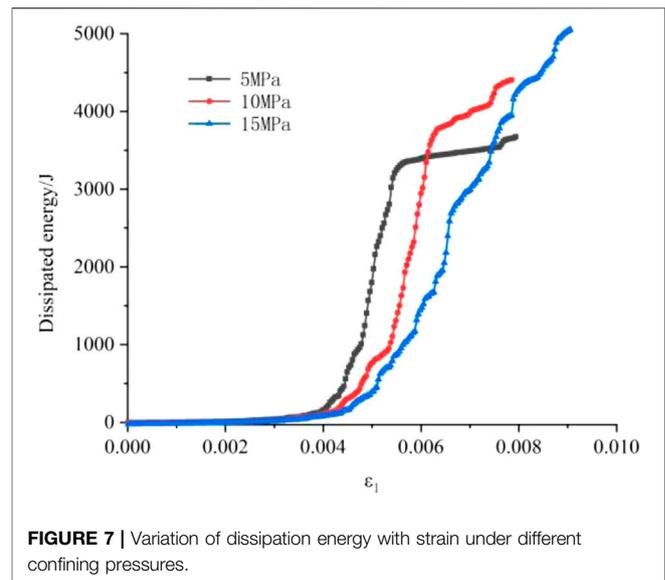


FIGURE 7 | Variation of dissipation energy with strain under different confining pressures.

Evolution Law of Dissipation Energy

In the process of the rock deformation and failure, the generation and propagation of cracks are usually accompanied with energy dissipation.

Figure 7 shows that higher confining pressure will consume more energy when the specimen fails. Under confining pressure of 5 MPa, the dissipation energy increased with the axial strain steadily at the pre-peak strength stage, sharply at the failure stage, and steadily at the residual stage of the stress-strain curve (see **Figure 6**). In the residual stage, dissipation energy increased with the confining pressures. Therefore, when the confining pressure was 15 MPa, the dissipation energy does not comply with the three-stage growth law.

The crack evolution under different confining pressures is shown in **Figure 5**. In the pre-peak stage, the micro-cracks grew slowly. The dissipation energy was low and relatively stable. In the failure stage, energy dissipation increased sharply, with rapid development of cracks. In the residual stage, the slope of the dissipation energy curve increased with the confining pressures, and the specimens had formed a complete macroscopic fracture plane, with generation of only a few cracks. The fracture plane of the specimens widened gradually with confining pressures, which led to large friction slip area of the cracks and high energy dissipation rate.

Figure 8 shows the relationship between the dissipation energy and the number of cracks under different confining pressures, which indicates that the energy dissipation curves are almost coincident with each other at the early stage, and both the crack number and the dissipation energy increase with confining pressure.

According to the crack distribution (**Figure 5**), energy is dissipated through the generation of cracks and friction slip between macroscopic cracks under a given confining pressure. In the early stage of the specimen loading, only a few micro-cracks occurred, without generation of macro-cracks, and the energy was just dissipated by the generation of micro-cracks. therefore, the dissipation energy approximately increases with the crack number in a linear way. Subsequently, the curve became concave. With the increase of micro-cracks, the macro-cracks gradually formed, the growth rate

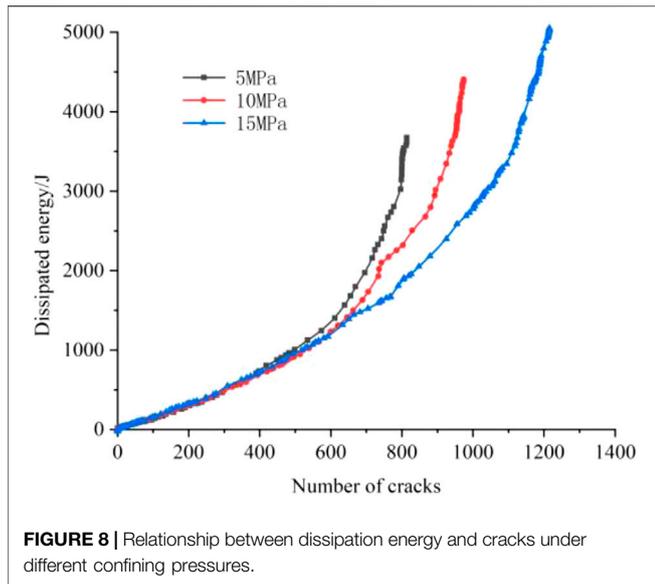


FIGURE 8 | Relationship between dissipation energy and cracks under different confining pressures.

of the dissipation energy accelerated. The development trend of the energy dissipation curves is almost vertical in the final stage. The number of cracks kept basically constant, and the energy continued to dissipate through the friction slip between the macro-cracks.

DAMAGE EVOLUTION LAW

There are many damage variables defined in different ways. In this paper, the damage variable was expressed based on the energy evolution law of micro-crack propagation in rock. The specific expression is:

$$D = \frac{U^d}{U} = \frac{U - U^e}{U} \tag{5}$$

where U is the boundary energy, U^d is the dissipation energy, and U^e is the total strain energy.

It was believed that the damage of rock materials behaves the change in density from a macroscopic view (Zhang et al., 2011). According to the method of describing the damage in terms of density, the damage variable was defined as:

$$D = \left| \frac{\varepsilon_v}{1 + \varepsilon_v} \right|^{\frac{2}{3}} \tag{6}$$

where ε_v is the volumetric strain.

In this paper, the damage variables were obtained based on energy and density under different confining pressures, as shown in Figure 9. Under the confining pressures of 5, 10, and 15 MPa, all the damage variables obtained on the base of energy and density are shaped like “S.” Two kinds of curves are highly similar in the whole process, but the damage variable obtained from

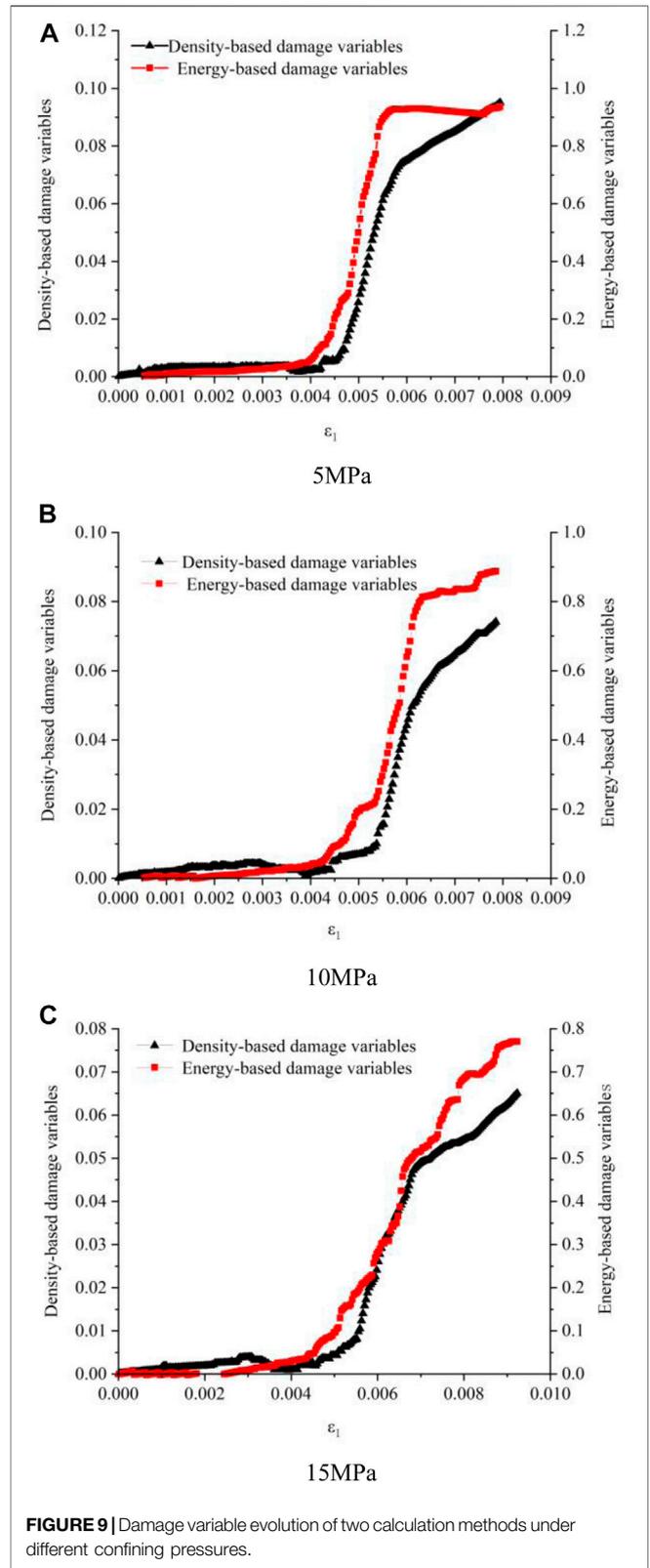


FIGURE 9 | Damage variable evolution of two calculation methods under different confining pressures.

energy is closer to 1 at the end value than the other one, which has better physical expression for the failure process of rock.

CONCLUSION

To explore the micro-crack propagation and energy evolution laws of the rock specimens under triaxial compression conditions, the numerical simulation by PFC2D program was conducted on the basis of the results of laboratory experiments, and then the variation of the micro-crack evolution and energy dissipation was analyzed. The following conclusions can be made:

1. The exerted load is basically converted into strain energy, which results in the crack generation and propagation. The micro-cracks develop slowly in the early stage but expand rapidly in the later stage due to the sudden release of strain energy, forming the macroscopic cracks finally.
2. Energy is generally dissipated by the crack generation and friction slip between macro cracks. The micro-cracks increase with confining pressure, which widens the fracture plane and dissipates more energy.
3. Confining pressure also has some effect on the damage and deformation of the rock specimen. As the confining pressure increases, the damage degree increases, but with slower accumulation speed, and the specimen deformation is greater when the rock specimen fails.

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DATA AVAILABILITY STATEMENT

The original contributions presented in the study are included in the article/Supplementary Material, further inquiries can be directed to the corresponding author.

AUTHOR CONTRIBUTIONS

All authors listed have made a substantial, direct, and intellectual contribution to the work and approved it for publication.

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Conflict of Interest: Z-RZ was employed by Railway Siyuan Survey and Design Group Co., Ltd.

The remaining authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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