

Article Effect of Fine-Grained Particles and Sensitivity Analysis of Physical Indexes on Residual Strength of Granite Residual Soils

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Abstract: Recently, stability analyses of structures built of granite residual soils, for example, earth dams or other urban structures, particularly when under vibration, are being recognized as much more important than previously imagined. In such analyses, it is emphasized that the residual strength should be utilized considering the seismic effect. Therefore, the residual strength of granite residual soils must be evaluated accurately in order to reduce the damage to structures built on them. This paper presented a laboratory study designed to examine the effect of fine-grained particles (FGPs; particle size ≤ 0.075 mm) on residual strength by the multistage procedure of the Bromhead ring shear test and evaluate the physical indexes forecasting the residual strength of granite residual soils using soil samples composed of fifteen different percentages of FGPs artificially adjusted from a reservoir embankment soil sample. The results showed that the residual strength decreased along with the increase in FGPs and that the residual frictional angle was rarely dependent on the ratio of FGPs when the ratio was over 90%. Even in the residual state, a small amplitude of fluctuation in shear stress still existed and was affected by the coarse-grained particles (CGPs; particle size \geq 0.075 mm), such as the quartz particles in the granite residual soils. It was also found that the amplitude of fluctuation was smaller when the FGP fraction was greater. In addition, under the same normal stress, the peak strength and residual strength decreased with an increase in the ratio of FGPs. Then, they remained almost the same when the ratios of FGPs were equal to 85% and 90%, respectively, and the post-peak attenuation tended to increase initially with an increase in the FGPs and then remained almost the same. Moreover, based on the sensitivity analysis, the order of influence of physical indexes on the residual frictional angle was also ranked for the granite residual soils.

Keywords: granite residual soil; residual strength; fine-grained particles; amplitude of fluctuation; correlation

1. Introduction

The stability of earth dams under vibration has become one of the most serious problems for civil engineers, particularly after the recent experiences of large earthquakes in the world. To analyze such problems, residual strength parameters have attracted much attention in recent decades due to their great significance in stability analyses when evaluating the influence of large earthquakes on foundation settlements [1–3] or the stability of slopes that have experienced landslides [4]. On the other hand, landslides are clearly one of the most serious natural disasters on earth; they cause great loss of life and severe destruction of the social economy. With the rapid development of urbanization and transportation in China, granite residual soils are used in many areas, especially in coastal areas [5,6]. However, under the action of earthquakes, a large number of landslides, vibration subsidence, and ground fissures are caused in such granite residual areas. In recent years, with the continuous improvement of scientific and technological innovations, as well as



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the attention that is being paid to special problems, research on granite residual soils has been increasing. Granite residual soils are the product of a series of physical and chemical weathering of the parent rock granite. Compared with other kinds of soils, granite residual soils belong to one of the special soils due to the following reasons that are different from other soils. In terms of engineering properties, granite residual soils have been clarified as having higher shear strength and bearing capacity and lower compressibility under natural conditions [7]. In terms of mineral composition, granite residual soils are mainly composed of quartz and kaolinite and lesser amounts of soluble salt and organic matter. In terms of particle composition, relatively greater amounts of granite residual soils are larger than 0.5 mm or less than 0.075 mm in size, while fewer amounts are between 0.075 and 0.5 mm in size [8]. However, it should be pointed out that the research on granite residual soils has not formed a complete system, compared with loess or soft soil, due to the delay in starting research on these soils.

The mechanical properties of many kinds of soils have been the object of extensive research for decades. The existing studies on the residual strength of various soils are mainly focused on clay or clayey soil, and a relatively consistent theory has been realized for evaluating the residual strength, like the effect of the shear rate [9–18], consolidation ratio [14,16], and normal stress [17,18] on the residual strength of this clay or clayey soil. Normal stress refers to the weight applied to soil samples during shearing. Moreover, the relationships between residual strength and related indexes, such as the plasticity coefficient, FGPs, CGPs, and so on, have also been shown for clayed soil in a lot of the literature. The plasticity coefficient mainly contains liquid limit, plastic limit, and plasticity index, where the liquid limit refers to the boundary moisture content between the plastic and semi-solid states of cohesive soil, and lastly, the plasticity index can be determined by liquid limit minus plastic limit. However, it should be noted that granite residual soils contain a lot of coarse-grained particles (CGPs), which means the present theory on the residual strength may not be suitable for granite residual soils.

Moreover, there is little research using sensitivity analysis for the strength of granite residual soils. The related indexes for predicting the residual strength of clayed soil, liquid limit, plastic limit, plasticity index, FGPs, and CGPs were selected as the specific factors in this sensitivity analysis under consideration in this study. Therefore, it is worth conducting this study to analyze the effects of different kinds of soil indexes on the residual strength parameters of granite residual soils.

The residual strength parameters of many kinds of soils, namely residual frictional angle ϕ_r and cohesion, can be obtained through laboratory tests. Due to the obvious characteristics of their structure and probable fissures, the cohesion of granite residual soils is neither stable nor credible, and it has been suggested that the residual frictional angle be obtained by indoor geotechnical tests that have high credibility [8]. Thus, this paper is also focused on evaluating the main factors influencing the residual frictional angle by the sensitivity analysis and exploring the possibility of predicting the residual frictional angle by the available indexes for granite residual soils.

The main objective of this study is to expound the action mechanism of fine-grained particles (FGPs) on the residual strength of granite residual soils. At the same time, the possibility of predicting the residual frictional angle of granite residual soils by means of the available indexes based on the sensitivity analysis, including the Atterberg limits, the fractions of different kinds of particles, and the relative grading parameter, $\frac{r_{CGP}}{r_{FGP}}$, is illustrated, where r_{FGP} and r_{CGP} are the ratio of FGPs and CGPs, respectively. Moreover, the effect of the fraction of FGPs on the residual strength and peak strength under a normal stress of 201 kPa, as well as a comparison with the published prediction models for the residual frictional angle, is also discussed. In this study, ring shear tests and basic physical property tests, namely grain size analyses, liquid limit tests, and plastic limit tests, were conducted on all samples.

2. Materials and Methodologies

2.1. Materials and Sample Treatment

Bishop et al. [19] measured the residual strength of undisturbed and remolded samples of five kinds of soils by a ring shear apparatus and demonstrated that the residual stress was independent of the initial structure of the soil. Thus, remolded soil samples that were remolded from one soil of the study site were suitable for conducting this study to analyze the effect of FGPs on the residual strength relatively precisely. The samples, comprising granite residual soils, were taken from Hojo, Matsuyama, Japan, as a suitable material for reservoir embankments according to the engineers of Ehime Prefecture, Japan. The basic physical indexes and mineral composition of the taken soils in this study were shown in Tables 1 and 2, respectively, where all physical indexes in Table 1 were obtained based on JIS A 1204 and JIS A 1205 [20], and the mineral composition in Table 2 was determined by X-ray diffraction. In Table 1, the uniformity coefficient is one of the indicators that reflects the distribution of different particle groups of different sizes, and whether the soil particle size distribution is good or not can be determined by this indicator. Normally, if the value of the uniformity coefficient is bigger than 10, we can judge if the soil grading is good. However, if this value is too big, like the sample in this study, we can judge if the soil grading is the gap gradation. The above physical indexes in Table 1 followed the general rule of granite residual soils. A standard for reservoir embankment soils, based on the ratio of FGPs, was proposed by the Japanese Institute of Countryology and Engineering [21]. For this purpose, the soil samples, composed of fifteen different percentages of FGPs, were artificially prepared from the above material by varying the FGPs using a 0.075 mm sieve. Each sample was filtered through a 0.425 mm sieve because a grain size of more than 0.425 mm cannot be used in liquid-plastic limit tests, as specified in the JIS A 1205 test guide [20]. The ratios of FGPs were from 0% to 100%, as shown in Table 3.

Table 1. Physical indexes of granite residual soil taken from the study site.

Water Content (%)	Void Ratio, e	Average Particle Size, d_{50} (mm)	Uniformity Coefficient, C _u	Curvature Radius <i>, C</i> c	Specific Gravity, G _s	Gravel Content (%)	Sand Content (%)	Silt and Clay Content (%)
						>2 mm	0.075–2 mm	<0.075 mm
26.26	0.84	0.32	85.65	0.37	18.30	26.00	34.10	39.90

Table 2. Mineral composition of granite residual soil taken from the study site.

Quartz	Kaolinite	Illite	Hematite
62.3	31.9	3.7	2.1

Table 3. Ratios of CGPs and FGPs, r_{CGP} and r_{FGP} , respectively, in samples used in drained ring shear tests.

No.	Sample Characters	Ratios of CGPs and FGPs in Each Sample Used in Drained Ring Shear Tests (%)			
	_	CGPs: 0.075–0.425 mm	FGPs: 0–0.075 mm		
1	HM1	100	0		
2	HM2	70.59	29.41		
3	HM3	60.01	39.99		
4	HM4	51.62	48.38		
5	HM5	44.46	55.54		
6	HM6	38.38	61.62		
7	HM7	32.42	67.58		
8	HM8	28.58	71.42		

No.	Sample Characters	Ratios of CGPs and FGPs in Each Sample Used in Drained Ring Shear Tests (%)			
		CGPs: 0.075–0.425 mm	FGPs: 0–0.075 mm		
9	HM9	24.59	75.41		
10	HM10	21.40	78.60		
11	HM11	15.09	84.91		
12	HM12	10.26	89.74		
13	HM13	6.25	93.75		
14	HM14	2.88	97.12		
15	HM15	0	100		

Table 3. Cont.

The Atterberg limits of all the samples belong to the common clay mineral group on the Casagrande plasticity chart [22], shown in Figure 1. All samples were classified as low clay (CL) according to the Unified Soil Classification System (USCS).

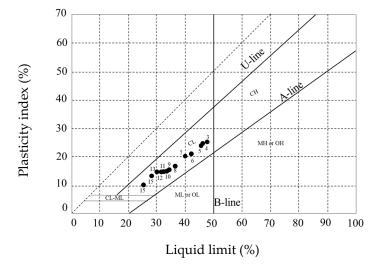


Figure 1. The plasticity of soil samples is plotted on the plasticity chart.

2.2. Methodologies

For the next step, tests to determine the physical properties, including the liquid limit, plastic limit, and plasticity index, were conducted based on the standard of JIS A 1205 [20].

Three test methods are commonly used to measure the shear strength, namely the direct shear box test, the triaxial shear test, and the ring shear test, among which the triaxial shear test is the most popular, as it is able to regulate the drainage conditions and to gauge the pore water pressure. However, it has been demonstrated that the triaxial shear test is not suitable for obtaining the residual strength of soil for two reasons. Firstly, the strain exerted on a specimen is limited, especially for sliding zone soils with a great amount of CGPs [23]. Secondly, the strength along the sliding surface is difficult to determine. It is worth noting, however, that this type of test has a great advantage in obtaining the residual strength of soil with the ring shear apparatus; that is, the ring shear apparatus can continuously shear the soil in the desired direction of displacement without changing the cross-sectional area of the sample. This allows the orientations of the particles to be completely parallel to the shearing direction and the residual strength of the soil to be determined in a more convenient way [24]. Therefore, it is worth suggesting that the ring shear test be utilized to obtain the residual strength of the soil. In this study, the Bromhead ring shear apparatus, shown in Figure 2, was used to determine the residual strength of granite residual soils. It has the advantages of simple operation, reasonable cost, and strong practicability. Proving rings are used for obtaining the shear stress by the strain of the rings. There are four main test procedures for determining the residual frictional

angle of soil with the Bromhead ring shear apparatus: the single stage, pre-shearing stage, multistage, and proposed "flush" stage procedures. Full descriptions of these procedures can be found in Stark and Vettel [24] and Anderson and Hammoud [25]. Compared with the other procedures for Bromhead ring shear tests, the multistage procedure can save quite a lot of time.

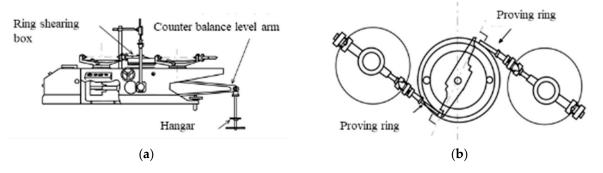


Figure 2. Schematic diagrams of the Bromhead ring shear apparatus: (**a**) side view of the apparatus and (**b**) aerial view of the specimen container ready for shearing.

In this study, the drained ring shear tests were organized into two main steps, namely consolidation and shearing. As explained in the section on the material preparation, the soil samples that passed through a 0.425 mm sieve were packed into a shear box with inner and outer diameters of 60 mm and 100 mm, respectively. Skempton [26] showed that the residual strength values obtained from laboratory tests were almost the same under normal consolidation or overconsolidation conditions, but the time required by normal consolidation to obtain the residual strength was much longer than by overconsolidation. Based on this finding, the condition of overconsolidation was applied in the present study for preparation the samples before shearing. The value of the pre-consolidation pressure was calculated by the weight of a 10 m high embankment, equal to nearly 200 kPa. Thus, considering the situation of the weight that was applied to normal stress in the ring shear apparatus, the stress of 270 kPa was used as the overconsolidation for the pre-consolidation pressure. So and Okada [14] and Li et al. [15] showed that the effect of the overconsolidation ratio on the residual strength was unworthy of being mentioned, which implies that the 270 kPa of pressure used for overconsolidation in this research is appropriate. After consolidation for more than 2 days, the soil samples were sheared slowly at a shear rate of 0.05 mm/min to ensure that no pore water pressure would occur [16]. Scaringi and Di Maio [27] also pointed out that the effect of the shear rate on the residual strength could be ignored as long as the shear rate was less than 0.1 mm/min.

Shear stress τ and horizontal displacement *D* were calculated based on Equations (1) and (2), respectively, according to previous studies [28,29]. The maximum data acquisition rate of the Bromhead ring shear apparatus could be 1000 readings per second. In this study, the data were obtained every 10 s due to the simplicity of data processing and the storage of used SIM cards, but the stress–displacement curve can be obtained as planned.

$$\tau = \frac{3(F_1 + F_2)}{\left\{4\pi \left(R_2^3 - R_1^3\right)\right\}}$$
(1)

$$D = (R_1 + R_2)\pi\omega \frac{t}{360}$$
(2)

where F_1 and F_2 are the measured torsion forces, R_1 is the inside sample radius, equal to 3 cm, R_2 is the outside sample radius, equal to 5 cm, ω is the rate of displacement (deg/min), and *t* is the time in minutes.

For the sensitivity analysis, a single-factor analysis and multiple regression analysis were both used to illustrate the effect of physical indexes on the residual frictional angle. In the single-factor analysis, the determination coefficient (\mathbb{R}^2), which ranges from 0 to 1, was selected to evaluate the sensitivity of related indexes to the residual frictional angle. The closer to 1 the determination coefficient is, the more sensitive to the residual strength of the granite residual soil the index is. In the multiple regression analysis, adjusted \mathbb{R}^2 , which also ranges from 0 to 1, was selected to show the degree of fitting of regression lines to observed values. Detailed information about the sensitivity index can be found in [30,31].

3. Results and Discussion

3.1. Effect of FGP Content on the Strength of Granite Residual Soils

The residual stress levels of fifteen soil samples were determined through the multistage procedure, as shown in Figure 3. The shear stresses at the peak and residual states are referred to as the peak strength and the residual strength, respectively. It was evident that it took a great deal of time to reach the residual strength, whereas it took a short amount of time to reach the peak strength. The distance to the peak strength was less than 0.5 cm. Based on different studies [9,24], as well as this study, it is difficult to say exactly when the residual strength will be reached with different types of soils. However, both the peak strength and the residual strength decreased with the increasing fraction of FGPs under the same normal stress.

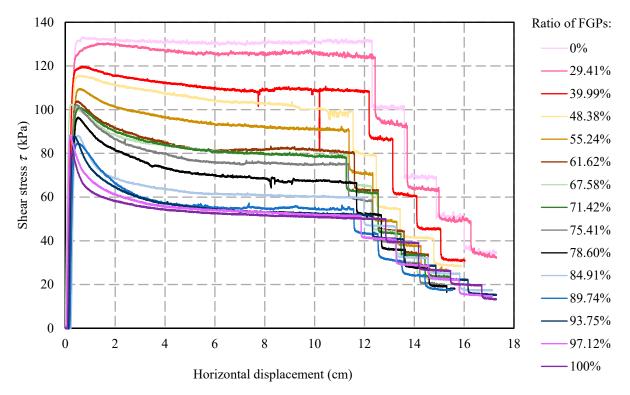


Figure 3. Shear stress versus horizontal displacement for all samples.

Meanwhile, another phenomenon that should be noted in the shear tests is the fluctuation of shear stress in the residual state. Some representative examples under a normal stress of 201 kPa were picked and shown in Figure 4. It is widely recognized that even in the residual state, a small amplitude of fluctuation still existed and remained stable when the phenomenon of particle orientation occurred [27,32]. In Figure 4, it is seen that even after a long horizontal displacement in the shearing process, a small amplitude of fluctuation still existed and was relatively regular. The shape of the shear band is not an ideal flat layer, which we can understand easily because CGPs, like quartz and kaolinite particles, existed in the sample. During shearing, complex interactions resulting from bigger contact surfaces led to the fluctuation of shear stress. Moreover, it is evident that as the fraction of FGPs increased, the amplitude of such fluctuations under the same normal stress decreased.

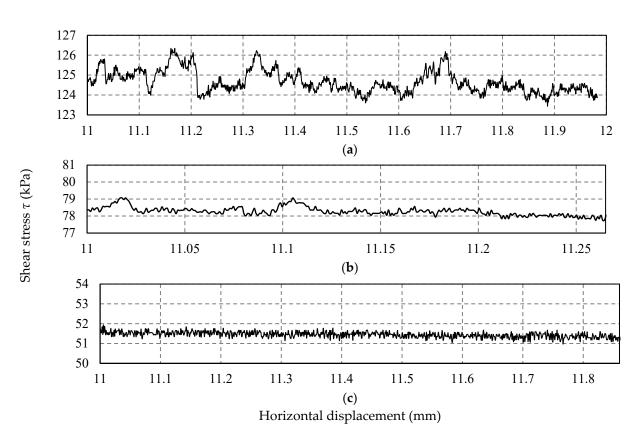


Figure 4. Fluctuations in the residual state of soil samples under a normal stress of 201 kPa for different ratios of FGPs: (a) 29.41%, (b) 71.42%, and (c) 97.12%.

The residual frictional angles, which can be determined from the data in Figure 3, are summarized in Table 4, along with the soil properties. In this table, the ratio of FGP (r_{FGP}) and index of the CGP to FGP contents ($\frac{r_{CGP}}{r_{FGP}}$) can be obtained by the grain size distribution curve. The liquid limit (w_L) and plastic limit (w_P) can be determined by the liquid limit test and the plastic limit test, respectively, and the plasticity index (I_P) is equal to the liquid limit minus the plastic limit. Notably, it is found that the residual frictional angles of the samples vary considerably, from 13.9° to 32.9°. It is also evident that the liquid limit, plastic limit, and plasticity index increase with an increase in FGPs, whereas the residual frictional angle is inversely proportional to the liquid limit, plastic limit, plasticity index, and ratio of FGPs.

The peak strength and residual strength versus the ratio of FGPs under a normal stress of 201 kPa are shown in Figure 5. The peak strength is seen to first decrease with an increase in the FGP content and then remain almost the same when the ratio of FGPs is more than 85%. Similarly, the residual strength is seen to first decrease with an increase in the FGPs and then remain almost the same when the ratio of FGPs is equal to around 90%. From both peak strength and residual strength against the FGP fractions, we can find that the decrease value in strength is big when the ratio of FGPs increased from 0 to 100%. We can understand that compared to FGPs, the peak strength and residual strength are highly affected by CGPs, which can be attributed to the complex interactions between particles, as observed by Wen et al. [33]. The greater the CGPs, the higher the peak strength and residual strength. Moreover, Skempton [4] also proved that the residual strength is affected almost entirely by the minerals of soil when the clay fraction exceeds 50%, and any further increase in clay content will not affect the residual strength. The results obtained in the present study are considered to be appropriate. Moreover, in Figure 5, it is evident that the difference in value equaled the peak strength minus the residual strength, which is called the post-peak attenuation, and this value increased with the increasing FGPs. This means that the greater the FGP fraction, the stronger the post-peak intensity attenuation, which

could provide instructions for slope protection in the aspect of controlling the FGP fraction in the slope.

Sample Character	r _{FGP} (%)	r _{CGP} r _{FGP}	w _L (%)	w _P (%)	I _P (%)	$\phi_{ m r}$ (°)
HM1	0	×	×	×	×	32.94
HM2	29.41	2.40	24.65	×	×	30.85
HM3	39.99	1.50	25.10	14.68	10.42	27.81
HM4	48.38	1.06	28.43	15.08	13.35	25.75
HM5	55.54	0.80	30.87	15.58	15.29	23.69
HM6	61.62	0.62	31.50	16.00	15.50	21.66
HM7	67.58	0.47	32.74	16.96	15.78	21.47
HM8	71.42	0.40	33.82	18.36	15.46	20.41
HM9	75.41	0.32	34.45	18.97	15.48	19.90
HM10	78.60	0.27	36.64	19.49	17.15	18.01
HM11	84.91	0.17	40.16	19.96	20.2	15.98
HM12	89.74	0.11	42.01	20.42	21.59	14.15
HM13	93.75	0.06	45.19	20.81	24.38	13.90
HM14	97.12	0.03	46.27	21.18	25.09	13.87
HM15	100	0	47.03	21.69	25.34	13.97

Table 4. Soil properties and residual frictional angle of each granite residual soil sample.

 \times means that the value could not be obtained.

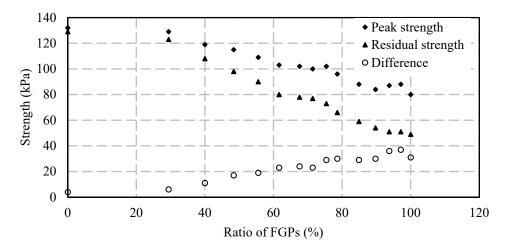


Figure 5. Peak strength and residual strength versus the ratios of FGPs under a normal stress of 201 kPa.

3.2. Sensitivity Analysis of Available Indexes on the Residual Frictional Angle of Granite Residual Soils

The available indexes were selected, including the ratio of FGPs, the relative grading parameter, the liquid limit, the plastic limit, and the plasticity index. The correlations between the residual frictional angle and all the available indexes are given in Figure 6. The determination coefficient (R²) was introduced to show the relationship between the residual frictional angle and the available indexes. It was found that all the values for R² were greater than 0.87. These values showed that the compatibility of the fitting line to the determined values was high. Based on the results of the sensitivity analysis, the order of impact is $r_{\text{FGP}} > w_{\text{L}} > w_{\text{p}} > I_P > \frac{r_{\text{CGP}}}{r_{\text{CGP}}}$. Additionally, a multiple regression analysis was also conducted to illustrate the correlation between the residual frictional angle and available physical indexes, as shown in Table 5. The prediction model can be shown as $\phi_{\text{r}} = -0.0413 \times r_{\text{FGP}} + 3.0793 \times \frac{r_{\text{CGP}}}{r_{\text{FGP}}} - 0.5188 \times w_{\text{p}} - 0.2945 \times I_P + 35.8379$. A high adjusted R² that was equal to 0.8482 implied that the degree of fitting of the regression lines to observed values was good.

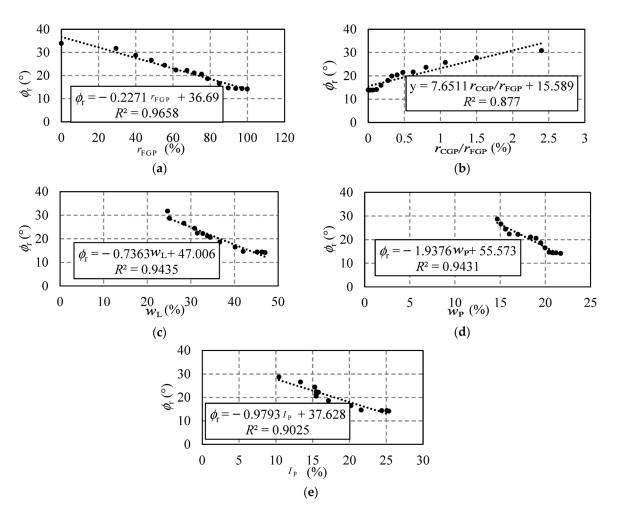


Figure 6. Residual frictional angle versus available indexes of granite residual soil: (**a**) ratio of FGPs, (**b**) relative grading parameter, (**c**) liquid limit, (**d**) plastic limit, and (**e**) plasticity index.

Table 5. Multiple regression analysis results for the residual frictional angle.

Factor	Intercept	r _{FGP} (%)	r _{CGP} r _{FGP}	w _L (%)	w _p (%)	I _P (%)
Coefficient	35.8379	-0.0413	3.0793	0	-0.5188	-0.2945
Multiple R R ²			0.991	0		
R ²			0.982	.1		
Adjusted R ²			0.848	32		

Based on the above experimental results and analysis, it is evident that the sensitivity analysis can provide a simple and effective approach to optimizing the effects of related physical indexes on the residual frictional angle of granite residual soils. The analysis method can not only provide a possible prediction of the residual frictional angle based on easily available indexes but it can also rank the effect of their influences. This can provide researchers and engineers with useful tools for evaluating and predicting the effects of related indexes on residual strength. However, as has been pointed out from the correlations of the residual frictional angle versus the plastic limit and the plasticity index, respectively, some nonlinear relationships seemed to exist, which may be due to the soil mechanism. A more comprehensive study should be performed in the near future.

After a full comparison, it was seen that the ratio of the FGPs to the total soil, including the FGP and CGP contents, was mostly related to the residual frictional angle according to the highest value of the coefficient of determination, as shown in Figure 6. In addition, it could be evidently found that the residual frictional angle remained almost the same when

this ratio of FGPs was more than 90%, which was due to the fact that contact between the CGPs and other grained particles hardly ever occurred.

The determination coefficients of the linear correlations among the parameters are shown in Table 6. It is evident that as a fundamental index, the ratio of FGPs seems to be a good tool for estimating the residual frictional angle, liquid limit, and plastic limit for granite residual soil. However, it should be pointed out that the correlations between the residual frictional angles and the available indexes are shown for just one type of soil. Future work, focusing on different types of embankment soils and pointing out a more precise formula for predicting the residual strength, should also be performed.

Table 6. Determination coefficients (R²) of linear correlations among parameters.

Index	φ _r (°)	w _L (%)	wp (%)	I _P (%)	r _{FGP} (%)
$\phi_{\rm r}$ (°)	_	0.94	0.94	0.90	0.96
w _L (%)	0.94	-	0.91	0.97	0.95
w _p (%)	0.94	0.91	-	0.82	0.96
$I_{\rm P}^{\rm r}$ (%)	0.90	0.97	0.82	_	0.89
r _{FGP} (%)	0.96	0.95	0.96	0.89	-

3.3. Discussion of the Different Prediction Models for Residual Frictional Angles by Representative Indexes

In geotechnical engineering, a lot of studies have been conducted to predict the geotechnical parameters using the index and physical properties of soils, and several reliable models are available to predict the mechanical behavior of different types of soils. The latest techniques, such as machine learning techniques, are available to develop the predicting models for kinds of indexes of soil [34–37]. However, due to the particularity of granite residual soil that was stressed above in terms of engineering properties, mineral composition, and particle composition, the attempts to use machine learning techniques to predict the strength of granite residual soil were few. Moreover, a lot of the literature [38-42] has shown the correlations between the residual frictional angle and the available indexes, but most studies have focused on clay or clayey soil. That is to say that previous prediction models may not be suitable for granite residual soils that have certain structural features and/or fissures. Thus, a discussion on the comparisons between the previous prediction models and the models built in this paper for the residual frictional angles by the available indexes was necessary. Figure 7 shows comparisons between the observed and the predicted values of the residual frictional angles for granite residual soils. The prediction models were from Wen et al. [33], where $\phi_r = 18,345 \times r_{FGP}^{-1.7458}$ is the index of the ratio of FGP, $\phi_r = 22.097 \times \frac{r_{CGP}}{r_{CGP}} + 7.7491$ is the index of the CGP to FGP contents, and $\phi_{\rm r} = 455.85 \times w_{\rm L}^{-1.0384}$ is the index of the liquid limit. It is easy to see in Figure 7 that the observed and predicted values of the residual frictional angles were greatly different for granite residual soils by the representative indexes selected here. The differences in values, which were calculated by the absolute value of the observed value minus the predicted value, respectively, were even more than 20. Thus, the predictions of the residual frictional angles were different for different kinds of soils, and the reason should be largely related to the differences in the origins and source materials of soils, as well as the differences in mineral compositions, and their interactions within the slip zones. However, the models pointed out in this study could provide a reference for determining the residual frictional angle of granite residual soil. Additionally, more comprehensive and complex indexes for predicting the residual strength of kinds of soils should be found in the near future.

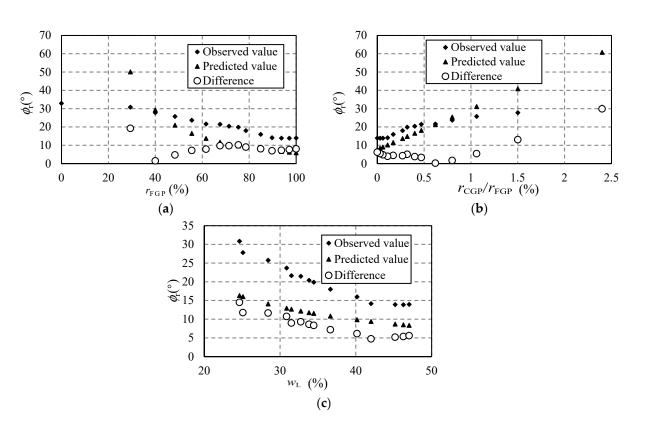


Figure 7. Comparison between observed and predicted values of residual frictional angles for granite residual soils by different indexes: (**a**) ratio of FGPs, (**b**) relative grading parameter, and (**c**) liquid limit.

From the above results, it can be pointed out that previous prediction models for clay or clayey soil were not suitable for predicting the residual frictional angle of granite residual soils. However, at the same time, it is worth noting that the difference seen in Figure 7b is very small, especially when the relative grading parameter, $\frac{r_{CGP}}{r_{FGP}}$, is less than 1. That is to say, when the content of CGPs is less than the content of FGPs, the proposed prediction model for clay or clayed soil based on $\frac{r_{CGP}}{r_{CGP}}$ seems to be also suitable for granite residual soil.

4. Conclusions

Drained ring shear tests, grain size analyses, liquid limit tests, and plastic limit tests were carried out on granite residual soils to clarify the effect of FGPs on the residual strength of granite residual soils. Then, the correlations between the residual frictional angle of granite residual soils and the available indexes, which could be obtained in a short time, were proposed and compared. The results presented have led to the following general conclusions.

The residual state of granite residual soils was able to be determined in a long horizontal displacement when the orientation of the particles occurred and was then kept stable. However, a small amplitude of fluctuation in shear stress still existed and was relatively regular in the residual state. The shape of the shear band was not an ideal flat layer, which was caused by the CGPs, such as the quartz particles. It was seen that the lower the FGP fraction was, the greater the amplitude of the fluctuation would be.

Under the same normal stress, the peak strength and residual strength decreased with an increase in the ratio of FGPs and then remained almost the same when the ratios of FGPs were equal to 85% and 90%, respectively. In addition, the post-peak attenuation tended to increase with the increasing FGPs.

The residual frictional angle is rarely dependent on the ratio of FGPs when the ratio of FGPs is around 90%, which was possibly due to the fact that contact between CGPs and other grained particles hardly ever occurred.

Though predictions of the residual frictional angles seem to be possible for granite residual soils, we have to note that the models proposed in this study are not suitable for different kinds of soils. However, the residual frictional angle of granite residual soils was seen to be closely related to the available indexes used in this study, and it is evident that the influences of kinds of available indexes on the residual frictional angle can be ranked in order of $r_{\text{FGP}} > w_{\text{L}} > w_{\text{p}} > I_P > \frac{r_{\text{CGP}}}{r_{\text{CGP}}}$.

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