

# Article Use of a Biopolymer for Road Pavement Subgrade

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**Abstract:** This paper presents an extensive series of laboratory works and a prediction model on the design of a road pavement subgrade with Xanthan Gum (XG) biopolymer. The experimental works were carried out using mixtures of conventional aggregate for road pavement construction and XG at the ratios of 0%, 1%, 2%, and 5%, by dry weight. Unconfined compressive strength (UCS) and California bearing ratio (CBR) tests were conducted during the experimental works at the end of the various curing periods (4, 8, 16, and 32 days). An example of an improvement in the UCS values for a specimen with 5% XG addition tested at the end of 4-daycuring yields about a 200% increment by the end of a 32-daycuring. The CBR values of clean aggregates were found to be increased by about 300% by 5% XG addition for all curing periods applied. Furthermore, the energy absorption capacity of the aggregates was observed to be increased significantly by both XG inclusion and curing period. Moreover, scaled conjugate gradient (SCG) training algorithm-based models developed for the prediction of CBR and UCS test results displayed a very high estimation performance with the regression coefficients of R<sup>2</sup> = 0.967 and R<sup>2</sup> = 0.987, respectively. Evidently, XG biopolymer is provably of use as an alternative inclusion in road pavement subgrades constructed with conventional aggregates.

**Keywords:** biopolymer; aggregate; unconfined compressive strength; California bearing ratio; prediction model

## 1. Introduction

The need for soil improvement in construction and in infrastructure activities that arise due to rapid population growth is of increasing importance across the world. The fact is that soil improvement techniques still remain challenging for researchers and engineers in practice, although it is among the most studied subjects in geotechnics. Specifically, due to the significant environmental concerns regarding the harmful effects of cementitious binders, such as toxicity, on the natural ecosystem, the number of the studies on alternative chemical approaches have increased substantially in order to provide a healthier and safer environment [1–3].

In an effort to address the environmental concerns associated with traditional cementitious binders, a range of biopolymers have been introduced as potential alternative materials for soil stabilization as well as to enhance the mechanical properties of various earth materials containing sand, clay, mine tailing, waste materials, silt, and sand–clay mixtures [4–11]. For example, direct shear testing data reported by Cabalar [12] showed a significant increment (up to about 300% by 5% XG addition) in shear strength as the XG content increased regardless of curing period. Bouazza et al. [4] revealed a significant decrease in the hydraulic conductivity of silty sand mixed with biopolymer due to the poreclogging effect. Ayeldeen et al. [13] pointed out a substantial increment in the optimum moisture content ( $w_{opt}$ ), unconfined compressive strength ( $q_u$ ), modulus of elasticity (E),



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and cohesion (c) values of the soils by biopolymer additions. Chen et al. [6] studied the uniaxial and triaxial response of mine tailings with various contents of XG biopolymer and realized an increment of about 145% and 175% in the  $q_u$  and deviatoric stress values, respectively. Dehghan et al. [14] carried out a comparative study of various polymer applications by using different testing machines, which resulted in the highest deviatoric stress and lowest hydraulic conductivity values when XG was used in the soils. Chang and Cho [15] showed a significant increment in the undrained shear strength ( $s_u$ ), internal angle of friction ( $\phi$ ), and cohesion (c) values of a soil mixed with the biopolymer addition. Smitha and Rangaswamy [16] carried out cyclic triaxial tests on silty sands treated with biopolymer at various curing times (3 days, 7 days, and 28 days), and proposed the use of biopolymers in the remediating of the liquefaction potential. Recently, Cabalar and Demir [10] employed XG biopolymer to enhance the  $s_u$  values of samples with different water content and sand grain size/shape.

The fact is that there are a limited number of studies which have been carried out on the use of biopolymers in road pavement designs, although much research is available on their response in soil element tests [5,17]. Therefore, this paper aims to describe the results of extensive laboratory works into the use of biopolymer in road pavement subgrade design. The paper identifies the experimental results on the conventional aggregate used for road construction prepared with water and the XG biopolymer at varying proportions ranging from 0% to 3% based on the dry weight. The equipment employed in these mixtures were unconfined compressive strength (UCS) and California bearing ratio (CBR) testing machines. The laboratory tests were performed at the end of 4-, 8-, 16-, and 32-day curing time periods in order to perform a systematic analysis of the development of curing time on the response of such mixtures. Furthermore, data sets were created based on the results of the experimental studies, and prediction models were developed to predict both the CBR and UCS results.

## 2. Experimental Study

## Materials and Methods

Crushed rock grains (CG), described as conventional aggregate for road construction, and Xanthan Gum (XG) biopolymer were used during the experimental studies. The commercially purchasable CG samples were obtained by mechanically crushing the rocks naturally available in and around the Gaziantep region in southern central Turkey into angular grains that ranged from 0.06 mm to 19.0 mm in size. The properties of the CG samples, classified as well-graded gravel (GW) using the unified soil classification system (USCS), were selected to mimic the Type I Gradation B in accordance with ASTM D1241-15 [18]. Specific gravity (Gs) value of the CG grains was examined to be 2.65. It was in the form of calcium carbonate. Roundness (R) and sphericity (S) for these grains were estimated at about 0.16 and 0.55 by employing the research by Muszynski and Vitton [19]. Apparently, the CG grains have been investigated and are widely regarded as highly angular [19–22]. The XG is a polysaccharide-based biopolymer obtained by the bacteria named Xanthomonas campestris. The XG polymer, regularly utilized in various applications including food, cosmetics, and agriculture industries, has a combination of mannoses ( $C_6H_{12}O_6$ ), glucoses  $(C_6H_{12}O_6)$ , and glucuronic acid  $(C_6H_{10}O_7)$ . There have been numerous studies published over last decades proving the potential of XG for soil improving in geotechnical engineering applications [12,17], as it generates a viscous solution with high shear stability when it is mixed with water [5,23,24].

Required amounts of CG and XG samples were mixed together with water until homogenous specimens were obtained for testing in both UCS and CBR machines by considering the ratios between the size of the testing molds and soil grains. The compacted specimens were tested in accordance with the ASTM D2166 [25] in order to understand their responses at the end of various curing times. The samples were prepared using an identical method, compacted into molds measuring 150 mm in diameter and 175 mm in

height, and evaluated under un-soaked conditions (in accordance with ASTM D1883 [26]) to analyze their CBR performance (Table 1).

Table 1. Test scheme emp	oloyed during t	he experimental study.
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Name of the Specimens	Host Material	Admixture Material	Admixture Content (%)	Curing Days	Total Number of Specimens Tested	Test Setup
Clean GW GW with 1% XG GW with 3% XG GW with 5% XG	GW	XG biopolymer	0 1 3 5	3, 7, 14, 28 3, 7, 14, 28 3, 7, 14, 28 3, 7, 14, 28 3, 7, 14, 28	16	UCS, and CBR

GW = well-graded gravel; XG=xanthan gum; UCS: unconfined compressive strength; CBR: California bearing ratio.

## 3. Experimental Results and Discussion

Figures 1 and 2 present the grains' size distribution, scanning electron microscopy (SEM) picture and shape characteristics, respectively. As can be seen, 90% of the crushed rock grains had a size of less than 19 mm with an angular shape, whilst the XG grains had an irregular shape.



Figure 1. Grain size distribution of GW samples used during the tests.

Figure 3 presents the effect of XG biopolymer on the UCS testing results of specimens tested at the end of 4- and 32-daycuring times. The unconfined compressive strength ( $q_u$ ) value for the well-graded crushed rock grains (GW), tested after 4-daycuring time, was observed to be about 110 kPa, while it was found to be about 460 kPa at the end of a 32-daycuring time. This is a more than fourfold increase. Such a finding is attributed to the calcium carbonate (CaCO<sub>3</sub>) form of the grains as this type of geomaterials could have different engineering properties from other earth materials. The fact is that the unexpectedly observed low driving resistance in the 1982 North Rankin platform construction prompted research on the engineering behavior of geomaterials with a CaCO<sub>3</sub> composition [27]. Since then, numerous studies on the engineering behavior of soils with a calcium carbonate form have been carried out [28–32]. In the present laboratory investigation, the grains mixed with the optimum amount of water were thought to increase the cementation, and thus the  $q_u$  value of the surface area available to react chemically increases. It can be seen that the cementation through the grains increased in proportion to the amount of XG in the

samples. This indicates that the chemical reactions that took place through the compounds  $C_6H_{12}O_6$ ,  $C_6H_{10}O_7$ , and  $CaCO_3$  contributed positively to the overall behavior. A closer look at Figure 1 shows that the maximum  $q_u$  value of the clean sample was increased to 360 kPa and 1020 kPa with 5% XG addition tested at the end of a 4- and 32 day-curing period, respectively. In addition to the cementation that took place between the soil grains themselves, such an increase in the  $q_u$  values was likely due to the XG biopolymer, which provided an interparticle bonding among the soil grains by hydrogels. The XG biopolymer in voids acted as a bridge between the soil grains, and thus increased the  $q_u$  values of the samples. Many studies in the literature have recently made similar observations on such influences of various biopolymers [5–7,9,10,13,33–35].





Figure 2. (a) Picture of GW and (b) SEM picture of XG grains.



**Figure 3.** UCS testing results for the samples tested at the end of a (**a**) 4-day and(**b**) 32-day curing period.

Figure 4 shows the effect of curing period on the  $q_u$  values of crushed rock grains only and those with 5% XG biopolymer. The  $q_u$  value for clean grains tested was observed to increase to 110 kPa after a 4-daycuringtime, 160 kPa after an 8-daycuringtime, 270 kPa after a 16-daycuringtime, and to 460 kPa after a 32-daycuringtime. Furthermore, the grains with 5% XG tested after a 4-daycuringtime had a  $q_u$  value of 360 kPa whilst this value increased to 660 kPa after an 8-daycuringtime, 890 kPa after a 16-daycuringtime, and to 1020 kPa after a 32-daycuringtime. Similar findings on the effect of curing time on different soil types mixed with XG biopolymer at various contents have been reported by many researchers including [7,9,33,34,36,37]. The significant increase is due to the dehydration of biopolymers that leads to the strengthening of the XG biopolymer cement bridges formed between the grains of soil.



**Figure 4.** Effect of curing period on the UCS testing results for (**a**) GW only, and (**b**) GW with 5%XG samples.

Figure 5 presents all the testing results of the UCS experiments illustrated in a bar chart. As can be seen clearly, the results were found to be strongly affected by both the (i)

XG biopolymer content and (ii) curing time period. Such effects of the biopolymer on some other soil types have also been observed [35,38].





Figure 6 presents the energy absorption capacity of samples tested in a UCS machine. The energy absorption capacity, which plays a significant role in the deformation and failure of geomaterials, is important for estimating the engineering response of the samples treated with XG biopolymer. The most striking point in the plot area is that the energy absorption capacity of the clean gravel samples had the lowest value in all the curing periods employed during the experimental studies. It can be clearly seen that the XG biopolymer addition in the gravel samples substantially increased the energy absorption capacity of the mixtures, although at varying rates depending on the curing period employed and amount of XG added. A similar increase in the energy absorption capacity resulting in a much higher ductility for the samples has been reported by some researchers [5,9,13,39].



Figure 6. Energy absorption capacities of the samples.

Figure 7 presents the CBR performance of samples with various XG contents tested at the end of different curing periods. The CBR values, typically reported as soil resistance at either 2.54 mm or 5.08 mm penetration depth, are used as a measure of strength and bearing capacity of soils to be used in subgrade and subbase pavements. It can be seen from the Figure 7 that XG addition in gravel samples exhibits a significant enhancement in CBR performance. It has been found that both the curing period and the XG ratio had a considerable effect on the CBR testing results. For example, the CBR value for the gravel sample tested at the end of a 4-daycuringtime was seen to increase from about 10% to 38% by 5% XG biopolymer addition. Similar to the analysis of the UCS testing results, such significant increases in the CBR values of the samples examined are thought to be due to the biopolymer bridges between the soil grains. Significant increases in the results of the experiments reported by Fatehi et al. [8] support the findings in the present study.



Figure 7. CBR values of the samples.

Road subgrade pavements may be designed in a coordinated way by using both the CBR testing results and the HD 26/06 [40] presented in Figure 8. Based on the results obtained, Table 2 suggests two different pavement design alternatives. It was observed that the XG content in the samples tested after the 4- and 8-daycuringtimes had a partial effect on the design thickness, while for those tested after the 16- and 32-day curing times, it did not affect the design thickness.

Despite the fact that the CBR test provides excellent information for designing road pavement subgrades, the test has some disadvantages including the large amount of soil required to test in the laboratory, and the fact that it istime-consuming to carry out. On the other hand, UCS testing is relatively easy to carry out, and requires a small amount of soil [41]. Thus, a series of correlations specifically valid for the tests performed here in this investigation have been developed to predict the CBR of the stabilized specimens by using the more easily and quickly reached q<sub>u</sub> values (Figure 9). The CBR values increase with the q<sub>u</sub> values and curingperiod employed. The influence of XG on the samples becomes more obvious the higher the amount of XG in the mixtures.



Figure 8. Capping and sub-base thickness design [40].

Table 2. Summary of testing results.

Curing Period	Sample	CBR (%)	q <sub>u</sub> (kPa)	Energy Absorption Capacity (kJ/m <sup>3</sup> )	Pavement Design Alternatives		
					Alternative 1		Alternative 2
					Subbase (mm)	Capping (mm)	Subbase (mm)
- 4-Day -	Clean GW	10.5	110	80	150	195	173
	GW with 1% XG	12.7	170	92	150	173	162
	GW with 3% XG	32.6	280	173	150	n.a.	150
	GW with 5% XG	38.2	360	201	150	n.a.	150
	Clean GW	12.1	160	100	150	230	165
	GW with 1% XG	18.0	360	198	150	n.a.	150
	GW with 3% XG	35.4	620	430	150	n.a.	150
	GW with 5% XG	46.5	660	284	150	n.a.	150
	Clean GW	15.7	270	213	150	n.a.	150
	GW with 1% XG	21.2	510	425	150	n.a.	150
	GW with 3% XG	42.8	780	385	150	n.a.	150
	GW with 5% XG	60.0	890	338	150	n.a.	150
	Clean GW	24.6	460	236	150	n.a.	150
	GW with 1% XG	35.9	670	391	150	n.a.	150
	GW with 3% XG	54.2	880	342	150	n.a.	150
	GW with 5% XG	73.3	1020	316	150	n.a.	150

GW: well-graded gravel; XG: xanthan gum; CBR: California bearing ratio;  $q_u$ : unconfined compressive strength value.



**Figure 9.** The q<sub>u</sub> versus CBR testing results for the samples.

This investigation further presents a comparative study of an economic analysis for the use of XG polymer in the construction industry. Since the experimental results show the 3% XG addition in CG samples to be the most optimum, it has been determined that about 30 kg of XG is required to effectively improve 1 ton of CG sample to be used in a road course. Considering that a kilogram of XG is USD 1.75 in the world market, it is estimated that there will be a cost of USD 52.5 to improve 1 ton of CG sample to be used on a construction site. On the other hand, in the view of the research by Consoli et al. [42], Park [43], and Consoli et al. [44], the cost of the amount of Portland cement required for the same work in the field may be determined as about USD 1.2 [45]. Although this difference seems high at first glance, considering the negative effects of Portland cement on the natural surroundings and human health during the production and application processes, the XG is thought to provide significant advantages in the long term [46–48].

### 4. Prediction Model

The results obtained from the experimental studies have been compiled for the purpose of processing with information processing techniques. A prediction model based on the scaled conjugate algorithm (SCG) training algorithm has been improved. Moller [49] improved a model that employs conjugate directions, but differs from other conjugate gradient algorithms that perform a line search in every iteration, as it does not execute a line search in each iteration. The most important factor in choosing this training algorithm was that it exhibits the highest prediction success with the data set and the developed architecture. Vinodhkumar et al. [50] used fly ash to subgrade the stabilization of SCG used in many geotechnical estimation problems. For the purpose of liquefaction evaluation [51], in the analysis of soft soil settlement [52], and for the prediction of lateral stress of cohesionless soils [53] SCG-based prediction models were developed. Again, in different problem types and application examples of geotechnology, estimation models with different training algorithms displayed successful results [54–57].

It is preferable that the generated data set is large in order to train the prediction models in the most appropriate way using this training algorithm. In this direction, the Monte Carlo stochastic simulation type was implemented to expand the data set. The Monte Carlo simulation is a class of numerical computation algorithms that are widely used in many fields and are used to obtain a number of numerical results with a large number of repeated random samplings. It is very useful in estimating the results of physical processes involving stochastic events. It has become a frequently used data generation instrument in geotechnical engineering and in the elimination of uncertainty in soil features [58], in seismic field response analysis [59,60], in overcoming spatial variability in soil deposits, in the analysis of slope stability, in reliability analysis of geotechnical structures [61], and in bearing capacity analysis of shallow foundations [62].

The amount of data in the data set was increased to 100 with the Monte Carlo simulation. At this stage, statistical details such as the standard deviation, min., max., and mean values of the original experimental data were taken into account inherently by the simulation. The frequency distribution of the parameters in the expanding data set is given in Figure 10. The developed prediction model is randomly divided into sections for training, validation, and testing stages as 60%, 20%, and 20%. In the input layer, the XG content, curing period, strain measured in UCS tests, penetration in CBR tests, and energy absorption were determined as input parameters. The hidden layer was designed as five neurons and the output layer was designed as CBR and qu. The developed model was a feed-forward model organized in layers that allows one-way information flow. The error was distributed backwards in this model. With back propagation, it was possible to update each of the weights in the network so that the actual output was closer to the target output. Two different models with the same architectural features were developed for each of the output parameters. The flowchart summarizing the generation of the data set and the development of the estimation model is given in Figure 11. A predictive model comprising three layers, namely, an input layer, a hidden layer, and an output layer, was developed. The architecture of the developed predictive model is shown in Figure 12. In the training of the developed model, the SCG training algorithm, which shows fast and high prediction success, was used. The degree of effectiveness and achievement of the developed prediction models was assessed in terms of the mean squared error (MSE) and R2. In terms of the MSE value, which represents the contrast between the anticipated and factual values, the best validation performance was achieved for both parameters at the 9th and 34th epoch cycles, respectively (Figure 13). The error distribution frequencies demonstrated that the models developed for both parameters clustered at a very low level of error values of a significant number of predictions (Figure 14). The regression curves of the prediction model for the CBR showed a significant level of success. The high success of the prediction model for CBR was achieved with the regression coefficient  $R^2 = 0.9665$ . A similar level of high performance was obtained with the model developed for  $q_u$  with the regression coefficient  $R^2 = 0.9865$  (Figure 15). Undoubtedly, the experimental results that make up the data set used, and the quality of the stochastically produced data based on these results, have a great share in the success of the developed models with such a high correlation coefficient. However, both the chosen training algorithm and the specified architecture of the network justify the adoption of soft computing techniques as part of a common methodology for estimating geotechnical parameters.



Figure 10. Cont.



**Figure 10.** Frequency distribution of the parameters in dataset; (**a**) XG content, (**b**) curing period, (**c**) penetration, (**d**) strain and (**e**) energy absorption.



Figure 11. Flowchart of the prediction models.



Figure 12. Architecture of the prediction model.



Figure 13. Best validation performance curves of the predictions of; (a) CBR and (b) qu.



Figure 14. Error frequency distribution of the predictions of (a) CBR and (b) q<sub>u</sub>.



**Figure 15.** Scatter plots of output versus target values of (a) CBR and (b)  $q_u$  by prediction models.

## 5. Conclusions

The mixtures of conventionally used aggregates (crushed rock grains) and xanthan gum (XG) biopolymer at different contents were tested by employing an extensive series of unconfined compressive strength (UCS) and California bearing ratio (CBR) tests. The gravel samples with 0%, 1%, 2%, and 5% XG biopolymer additions by dry weight were tested at the end of 4-, 8-, 16-, and 32-daycuringtimeperiods. Moreover, prediction models were also developed from an estimation of the CBR and UCS testing results. The conclusions reported here point out five new facets as follows:

- 1. The unconfined compressive strength (q<sub>u</sub>) value of clean gravel samples was found to be increased significantly with both XG biopolymer addition and curing time period employed.
- 2. The XG biopolymer addition in the CG samples substantially increased the energy absorption capacity of the mixtures at varying rates (from 15% to 400%) depending on the curing period employed and amount of XG biopolymer added.
- 3. The XG biopolymer addition in gravel samples pointed to a substantial increase in the CBR performance. Both the curing period and amount of the XG biopolymer were found to be significantly effective on the CBR testing results.
- 4. The XG content in the gravel samples tested after the 4- and 8-daycuringtimes had a partial effect on the design thickness while, for those tested after the 16- and 32- daycuringtimes, it did not affect the design thickness.
- 5. The SCG algorithm-based models, developed to predict the change in the UCS and CBR test results of gravel with the addition of XG, exhibited a high accuracy prediction success with the regression coefficients of  $R^2 = 0.967$  and  $R^2 = 0.987$ , respectively. These results demonstrate that models based on sets with high data quality can show significant success in estimating the geotechnical properties of soils.

This points to the fact that the XG biopolymer could be used as an alternative binding material in road subgrade pavement construction and provide significant advantages.

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#### References

- 1. Worrell, E.; Price, L.; Martin, N.; Hendriks, C.; Media, L.O. Carbon dioxide emissions from the global cement industry. *Annu. Rev. Energy Environ.* **2001**, *26*, 303–329. [CrossRef]
- De Jong, J.T.; Mortensen, B.M.; Martinez, B.C.; Nelson, D.C. Bio-mediated soil improvement. *Ecol. Eng.* 2010, 36, 197–210. [CrossRef]
- 3. Chang, I.; Minhyeong, L.; Tran, A.T.P.; Lee, S.; Kwon, Y.M.; Im, J.; Cho, G.Y. Review on biopolymer-based soil treatment (BPST) technology in geotechnical engineering practices. *Transp. Geotech.* **2020**, *24*, 100385. [CrossRef]
- 4. Bouazza, A.; Gates, W.P.; Ranjith, P.G. Hydraulic conductivity of biopolymer-treated silty sand. *Géotechnique* **2009**, *59*, 71–72. [CrossRef]
- Chang, I.; Im, J.; Prasidhi, A.K.; Cho, G.C. Effects of Xanthan gum biopolymer on soil strengthening. *Constr. Build. Mater.* 2015, 74, 65–72. [CrossRef]
- Chen, R.; Ramey, D.; Weiland, E.; Lee, I.; Zhang, L. Experimental investigation on biopolymer strengthening of mine tailings. J. Geotech. Geoenvironmental Eng. 2016, 142, 06016017. [CrossRef]
- 7. Cabalar, A.F.; Wiszniewski, M.; Skutnik, Z. Effects of xanthan gum biopolymer on the permeability, odometer, unconfined compressive and triaxial shear behavior of a sand. *Soil Mech. Found. Eng.* **2017**, *54*, 356–361. [CrossRef]
- Fatehi, H.; Abtahi, S.M.; Hashemolhosseini, H.; Hejazi, S.M. A novel study on using protein-based biopolymers in soil strengthening. *Constr. Build. Mater.* 2018, 167, 813–821. [CrossRef]
- 9. Cabalar, A.F.; Awraheem, M.H.; Khalaf, M.M. Geotechnical properties of a low-plasticity clay with biopolymer. *J. Mater. Civ. Eng.* **2018**, *30*, 04018170. [CrossRef]
- 10. Cabalar, A.F.; Demir, S. Fall-cone testing of different size/shape sands treated with a biopolymer. *Geomech. Eng.* **2020**, *22*, 441–448. [CrossRef]
- 11. Reddy, N.G.; Nongmaithem, R.S.; Basu, D.; Rao, B.H. Application of biopolymers for improving the strength characteristics of red mud waste. *Environ. Geotech.* 2020, *9*, 340–359. [CrossRef]
- 12. Cabalar, A.F. Ground Improvement by Bacteria and Synthetic Polymers. Master's Thesis, University of Gaziantep, Gaziantep, Turkey, 2002.
- 13. Ayeldeen, M.K.; Negm, A.M.; El Sawwaf, M.A. Evaluating the physical characteristics of biopolymer/soil mixtures. *Arab. J. Geosci.* 2016, *9*, 371. [CrossRef]
- 14. Dehghan, H.; Tabarsa, A.; Latifi, N.; Bagheri, Y. Use of xanthan and guar gums in soil strengthening. *Clean Technol. Environ. Policy* **2019**, *21*, 155–165. [CrossRef]
- 15. Chang, I.; Cho, G.C. Shear strength behavior and parameters of microbial gellan gum-treated soils: From sand to clay. *Acta Geotech.* **2019**, *14*, 361–375. [CrossRef]
- 16. Smitha, S.; Rangaswamy, K. Effect of Biopolymer Treatment on Pore Pressure Response and Dynamic Properties of Silty Sand. *J. Mater. Civ. Eng.* **2020**, *32*, 04020217. [CrossRef]
- 17. Lee, S.; Chung, M.; Park, H.M.; Song, K.I.; Chang, I. Xanthan Gum Biopolymer as Soil-Stabilization Binder for Road Construction Using Local Soil in Sri Lanka. *J. Mater. Civ. Eng.* **2019**, *31*, 06019012. [CrossRef]
- ASTM D1241-15:2016; Standard Specification for Materials for Soil-Aggregate Subbase, Base, and Surface Courses. ASTM International: West Conshohocken, PA, USA, 2016.
- 19. Muszynski, M.R.; Stanley, J.V. Particle shape estimates of uniform sands: Visual and automated methods comparison. *J. Mater. Civil Eng.* **2012**, 24, 194–206. [CrossRef]
- 20. Powers, M.C. A new roundness scale for sedimentary particles. J. Sediment. Petrol. 1953, 23, 117–119. [CrossRef]
- Youd, T.L. Factors controlling maximum and minimum densities of sands. In Evaluation of Relative Density and Its Role in Geotechnical Projects Involving Cohesionless Soils; ASTM STP523; ASTM: West Conshohocken, PA, USA, 1973; pp. 98–112.
- 22. Santamarina, J.C.; Cho, G.C. Soil Behaviour: The role of particle shape. In *Advances in Geotechnical Engineering: The Skempton Conference*; Thomas Telford: London, UK, 2004; pp. 604–617.
- Garcia-Ochoa, F.; Santos, V.E.; Casas, J.A.; Gómez, E. Xanthan gum: Production, recovery, and properties. *Biotechnol. Adv.* 2000, 18, 549–579. [CrossRef]
- 24. Rosalam, S.; England, R. Review of xanthan gum production from unmodified starches by Xanthomonas comprestris sp. Enzym. Microb. Technol. 2006, 39, 197–207. [CrossRef]
- ASTM D2166:2010; Standard Test Method for Unconfined Compressive Strength of Cohesive Soil. ASTM International: Philadelphia, PA, USA, 2010.
- ASTM D1883:2021; Standard Test Method for California Bearing Ratio of Laboratory Compacted Soils. ASTM International: West Conshohocken, PA, USA, 2021.

- 27. King, R.; Lodge, M. Northwest Shelf development-the foundation engineering challenge. In Proceedings of the International Conference on Calcareous Sediments, Perth, Australia, 15–18 March 1988; pp. 333–342.
- Fookes, P.G. The geology of carbonate soils and rocks and their engineering characterisation and description. In Proceedings of the International Conference on Calcareous Sediments, Perth, Australian, 15–18 March 1988; pp. 787–806.
- 29. Coop, M.R. The mechanics of uncemented carbonate sands. *Géotechnique* 1990, 40, 607–626. [CrossRef]
- 30. Lord, J.A.; Clayton, C.R.I.; Mortimore, R.N. *Engineering in Chalk*; Construction Industry Research and Information Association: London, UK, 2002.
- 31. Porcino, D.; Caridi, G.; Ghionna, V.N. Undrained monotonic and cyclic simple shear behaviour of carbonate sand. *Géotechnique* **2008**, *58*, 635–644. [CrossRef]
- 32. Wang, G.; Zha, J.J. Particle breakage evolution during cyclic triaxial shearing of a carbonate sand. *Soil Dyn. Earthq. Eng.* **2020**, *138*, 106326. [CrossRef]
- Latifi, N.; Horpibulsuk, S.; Meehan, C.L.; AbdMajid, M.Z.; Rashid, A.S.A. Xanthan gum biopolymer: An eco-friendly additive for stabilization of tropical organic peat. *Environ. Earth Sci.* 2016, 75, 825. [CrossRef]
- 34. Muguda, S.; Booth, S.J.; Hughes, P.N.; Augarde, C.E.; Perlot, C.; Bruno, A.W.; Gallipoli, D. Mechanical properties of biopolymerstabilised soil-based construction materials. *Géotechnique Lett.* **2017**, *7*, 309–314. [CrossRef]
- Qureshi, M.U.; Chang, I.; Al-Sadarani, K. Strength and durability characteristics of biopolymer-treated desert sand. *Geomech. Eng.* 2017, 12, 785–801. [CrossRef]
- Ayeldeen, M.; Negm, A.; El-Sawwaf, M.; Kitazume, M. Enhancing mechanical behaviors of collapsible soil using two biopolymers. J. Rock Mech. Geotech. Eng. 2017, 9, 329–339. [CrossRef]
- Singh, S.P.; Das, R. Geo-engineering properties of expansive soil treated with xanthan gum biopolymer. *Geomech. Geoengin.* 2020, 15, 107–122. [CrossRef]
- Choi, S.G.; Chang, I.; Lee, M.; Lee, J.H.; Han, J.T.; Kwon, T.H. Review on geotechnical engineering properties of sands treated by microbially induced calcium carbonate precipitation (MICP) and biopolymers. *Constr. Build. Mater.* 2020, 246, 118415. [CrossRef]
- Khatami, H.R.; O'Kelly, B.C. Improving mechanical properties of sand using biopolymers. J. Geotechn. Geoenvironmental Eng. 2013, 139, 1402–1406. [CrossRef]
- HD26/06:2006; Pavement Design and Maintenance-Foundations, Volume 7, Design Manual for Roads and Bridges (DMRB). The Stationery Office: London, UK, 2006.
- 41. Ghorbani, A.; Hasanzadehshooiili, H. Prediction of UCS and CBR of microsilica-lime stabilized sulfate silty sand using ANN and EPR models; application to the deep soil mixing. *Soils Found.* **2018**, *58*, 34–49. [CrossRef]
- Consoli, N.C.; Cruz, R.C.; Floss, M.F.; Festugato, L. Parameters Controlling Tensile and Compressive Strength of Artificially Cemented Sand. J. Geotech. Geoenviron. Eng. 2010, 136, 759–763. [CrossRef]
- 43. Park, H. Study for Application of Artificial Neural Networks in Geotechnical Problems. In *Artificial Neural Networks-Application;* IntechOpen: London, UK, 2011. [CrossRef]
- Consoli, N.C.; Ferreira, P.M.V.; Tang, C.S.; Marques, S.F.V.; Festugato, L.; Corte, M.B. A unique relationship determining strength of silty/clayey soils: Portland cement mixes. Soils Found. 2016, 56, 1082–1088. [CrossRef]
- Statista. Cement Production in the United States from 2010 to 2022. 2020. Available online: https://www.statista.com/statistics/21 9343/cement-production-worldwide/?gclid=EAIaIQobChMIovKHtdP5\_gIVA\_d3Ch2JxgZhEAAYAiAAEgL\_h\_D\_BwE (accessed on 13 April 2023).
- 46. Van den Heede, V.P.; De Belie, N. Environmental impact and life cycle assessment (LCA) of traditional and 'green' concretes: Literature review and theoretical calculations. *Cem. Concr. Compos.* **2012**, *34*, 431–442. [CrossRef]
- 47. Habert, G. *Eco-Efficient Concrete: Environmental Impact of Portland Cement Production;* Woodhead Publishing Series in Civil and Structural Engineering; Elsevier: Amsterdam, The Netherlands, 2013.
- 48. Andrew, R.M. Global CO<sub>2</sub> emissions from cement production. *Earth Syst. Sci. Data* **2018**, *10*, 195–217. [CrossRef]
- 49. Møller, M.F. A scaled conjugate gradient algorithm for fast supervised learning. Neural Netw. 1993, 6, 525–533. [CrossRef]
- 50. Vinodkumar, S.B.S. Artificial Neural Network Modelling and Economic Analysis of Black Cotton Soil Subgrade Stabilized with Flyash and Geotextile. *Int. J. Earth Sci. Eng.* **2016**, *9*, 81–86.
- 51. Egbueri, J.C.; Igwe, O.; Omeka, M.E.; Agbasi, J.C. Development of MLR and variedly optimized ANN models for forecasting the detachability and liquefaction potential index of erodible soils. *Geosyst. Geoenviron.* **2022**, *2*, 100104. [CrossRef]
- 52. Li, G.; Han, C.; Mei, H.; Chen, S. Application of the WNN-Based SCG Optimization Algorithm for Predicting Soft Soil Foundation Engineering Settlement. *Sci. Program. Smart Internet Things* **2021**, 2021, 9936285. [CrossRef]
- Kisi, O.; Uncuoglu, E. Comparison of three back-propagation training algorithms for two case studies. *Indian J. Eng. Mater. Sci.* 2005, 12, 434–442.
- 54. Cevik, A.; Sezer, E.A.; Cabalar, A.F.; Gokceoglu, C. Modeling of the uniaxial compressive strength of some clay-bearing rocks using neural network. *Appl. Soft Comput.* **2011**, *11*, 2587–2594. [CrossRef]
- Yildiz, O.; Berilgen, M. Artificial Neural Network Model to Predict Anchored Pile-Wall Displacements on Istanbul Greywackes. *Tek. Dergi* 2020, *31*, 10147–10166. [CrossRef]
- 56. Cabalar, A.F.; Karabas, B.; Mahmutluoglu, B.; Yildiz, O. An IDW-based GIS application for assessment of geotechnical characterization in Erzincan, Turkey. *Arab. J. Geosci.* 2021, 14, 2129. [CrossRef]

- 57. Yıldız, Ö. Correlation Between Spt and Pmt Results for Sandy and Clayey Soils. *Eskişehir Tech. Univ. J. Sci. Technol. A-Appl. Sci. Eng.* **2021**, 22, 175–188. [CrossRef]
- Rathje, E.M.; Kottke, A.R.; Trent, W.L. Influence of input motion and site property variabilities on seismic site response analysis. J. Geotech. Geoenviron. Eng. 2010, 136, 607–619. [CrossRef]
- 59. Field, E.H.; Jacob, K.H. Monte-Carlo simulation of the theoretical site response variability at Turkey Flat, California, given the uncertainty in the geotechnically derived input parameters. *Earthq. Spectra* **1993**, *9*, 669–701. [CrossRef]
- 60. Andrade, J.E.; Borja, R.I. Capturing strain localization in dense sands with random density. *Int. J. Numer. Methods Eng.* **2006**, 67, 1531–1564. [CrossRef]
- 61. Wang, Z.Z. Deep Learning for Geotechnical Reliability Analysis with Multiple Uncertainties. J. Geotech. Geoenviron. Eng. 2022, 148, 06022001. [CrossRef]
- 62. Ravichandran, N.; Mahmoudabadi, V.; Shrestha, S. Analysis of the bearing capacity of shallow foundation in unsaturated soil using Monte Carlo simulation. *Int. J. Geosci.* 2017, *8*, 1231–1250. [CrossRef]

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