

Research Article

Modeling of the Complex Modulus of Asphalt Mastic with Biochar Filler Based on the Homogenization and Random Aggregate Distribution Methods

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The disposal of agricultural straw has been a severe environmental concern in China and many other countries. In this study, the complex modulus of using biochar converted from straw as an alternative mineral filler in asphalt mastic was investigated through both laboratory tests and modeling. The experimental results indicated that the biochar can provide asphalt mastic higher stiffness than the conventional granite mineral filler. It was believed that the special porous structure of biochar providing a thicker coating layer of mineral filler increases the stiffness modulus of asphalt mastic. To consider this factor into the micromechanical model, a modified generalized self-consistent model (MGSCM) with a coating layer was proposed. Besides, the finite element (FE) microstructural model with a coating layer generated by random aggregate distribution method was used to numerically evaluate the effect of the coating layer on the complex modulus of asphalt mastics. The predicted results indicated that the generalized self-consistent model (MGSCM) with a coating layer is an efficient and accurate model for predicting the complex modulus of asphalt mastics. Moreover, the FE modeling proved that the coating layer can significantly improve the complex modulus of asphalt mastics. Therefore, the experiments and modeling carried out in this study provided insight for biochar applications to improve the performance of asphalt mixtures.

1. Introduction

The disposal of tons of straw has been a serious issue in the agricultural industry in China [1]. Converting the biomass to biofuel provides an outlet for this problem. However, a large amount of biochar waste may be generated in the meantime. Thus, it becomes an increasing issue for the utilization of carbon-based waste. One efficient treatment is to use the

biochar as the filler material in the asphalt paving industry. The utilization of carbonaceous materials as asphalt additives can be dated back to the 1960s [2]. By now, a great number of carbonaceous materials have been introduced, such as carbon black [2], coke dust [3], carbon fiber [4], and carbon nanotubes [5]. It has been evidenced that these carbon-based additives can positively improve the performance of asphalt mixture. Recently, with the development of

the biofuel industry, biochar, the by-product from the biofuel manufacture process, has been used as the new carbonaceous modifier. Zhao et al. [6, 7] investigated the performances of asphalt binders and asphalt mixtures modified by biochar from switchgrass and found that biochar can improve the resistances of rutting, cracking, and moisture-induced damages. Compared to commercial carbon-based additives, the introduction of biochar seemed to perform better. Çeloğlu et al. [8] used the biochar from the walnut crust and apricot seed shell to modify the asphalt binders and found that biochar can increase the binder stiffness and thus have a potential to enhance the rutting resistance as well. Kumar et al. [9] evaluated the performance of asphalt binders with the introduction of biochar from *Mesua ferrea* seed cover waste and found that biochar can also decrease the aging susceptibility. They also mentioned that the irregular shape of the biochar particle may also contribute to the physicochemical interaction between biochar particle and asphalt binder. Considering these merits, it should be feasible to use it as the alternative of the conventional filler materials.

To evaluate the effects of using biochar as filler material on the asphalt pavement, characterization of the performance of biochar-modified asphalt mastic is a good way to characterize the effects of the biochar. As the asphalt mastic is the composite only of asphalt binder and filler, therefore, it makes it possible to fully evaluate the interaction between filler and asphalt binder by excluding the effects of aggregate. Besides, as asphalt mastic is the binding material and the viscoelastic component of asphalt concrete, it plays a significant role in the performance of asphalt pavement [10, 11]. Therefore, it is critical to evaluate the viscoelastic property of asphalt mastic for the evaluation of the performance of asphalt pavement. To do that, complex modulus, composed of both dynamic modulus and the phase angle, is a commonly used parameter to depict the viscoelastic performance of asphalt materials [12]. However, although many studies have been conducted to investigate the effect of biochar on asphalt concrete, most of those investigations are based on experiments. To further explore the essence of biochar on strengthening asphalt pavement, modeling methods are highly required.

Currently, the method to predict the complex modulus of asphalt materials can be divided into numerical methods and analytical methods. The numerical methods based on finite element (FE) model and discrete element methods (DEMs) to perform simulation on the developed microstructural models. Many studies have been conducted to predict the complex modulus of asphalt materials based on the DEM and FE model [13–16]. However, one of the drawbacks of the numerical methods is the high cost for time and computation, which greatly limited their application. Different from numerical methods, the analysis is based on micromechanical models. In this method, the micromechanical models can predict the mechanical performance of heterogeneous materials based on the volumes of each composition, which provides a more efficient manner to analyze the interaction between particles and matrix. Since the 1920s, many micromechanical models, such as the dilute

model (DM), the Mori–Tanaka model (MTM), the self-consistent model (SCM), and the generalized self-consistent model (GSCM) were introduced to predict the complex modulus of asphalt materials [17–23]. However, these models only can predict the effective modulus but phase angle for viscoelastic asphalt materials [24–26]. Besides, because these models generally cannot consider the effects of physicochemical reinforcement and particle interaction, the predictions always underestimate the modulus of asphalt materials [10, 26–29]. Therefore, to accurately and efficiently predict the complex modulus and time-dependent characteristic of biochar filler asphalt mastic, a more rational micromechanical model is keenly desired.

Therefore, this study aimed at predicting the viscoelastic performance of biochar-modified asphalt mastic based on computational methods. To achieve these objectives, the following research tasks have been conducted:

- (i) Measuring the complex modulus of asphalt mastics through dynamic shear rheometer (DSR) tests
- (ii) Developing a micromechanical model to characterize the viscoelastic performance, especially for dynamic modulus, of biochar asphalt mastic by means of homogenization method
- (iii) Predicting and proving the effect of biochar on asphalt mastics based on the FE method by random aggregate generation method

2. Experimental Program

2.1. Material Preparation. The biochar used in this study was prepared from rice straw. The process of biochar preparation is shown in Figure 1. The dry rice straw was completely burned in an oven at 500°C for an hour. The residue ash was then collected and ground in a high-speed mixer for 30 seconds to obtain homogeneous biochar powder used as the mineral filler in this study.

A scanning electron microscope (SEM), FEI Quanta 250 FE-SEM, was used to examine the microstructure differences between conventional mineral filler, i.e., granite filler, and biochar filler. Figure 2 presents the SEM images of biochar and granite filler. It can be observed that the granite particles have a smooth fractured surface with an irregular shape, while the biochar particles are characterized with special porous structures with an uneven surface. Research also showed that this special structure can improve the antiaging properties of asphalt materials [30].

To prepare the asphalt mastics, asphalt binder with a penetration grade of 60/70 (Pen 60/70) was designed. The proportion of asphalt mastic was designed based on the stone mastic asphalt (SMA) due to the high asphalt binder and filler contents. In this study, SMA10, a commonly used asphalt mixture with a maximum aggregate size of 10 mm, was selected [31]. In this mixture, the mineral filler ratio in the gradation and the binder content in the mixture are 9% and 6%, respectively, which corresponds to a mass ratio of 58.5 : 41.5 of mineral filler to asphalt binder. The granite filler in the asphalt mastic was partially substituted by biochar filler with a volume fraction of 0%, 40%, 80%, and 100%. The

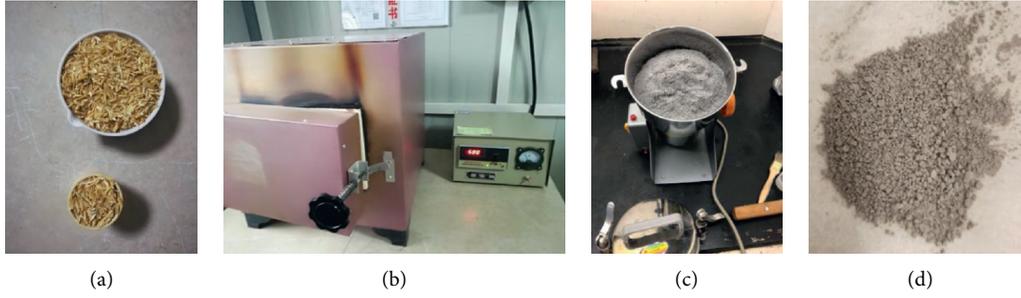


FIGURE 1: Biochar preparation progress: (a) rice straw raw material; (b) burning process; (c) grinding; (d) biochar filler.

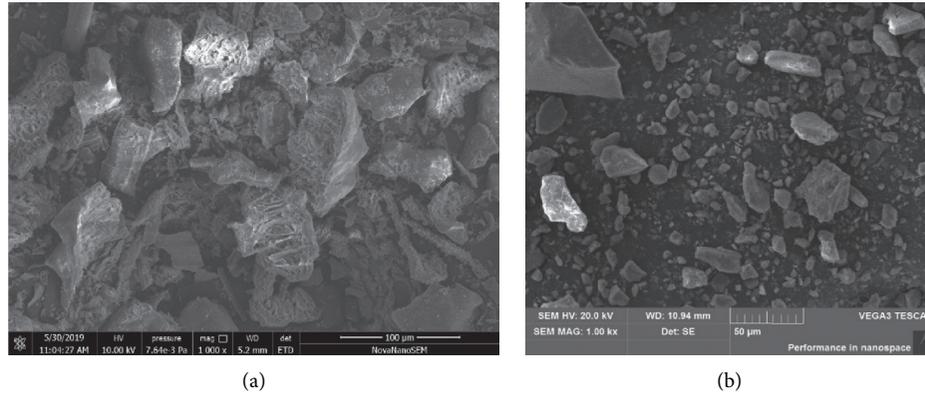


FIGURE 2: SEM images of (a) biochar and (b) granite filler.

physical properties of asphalt binder, granite filler, and biochar filler are presented in Table 1. The mixture proportions designed in volume and mass compositions in each asphalt mastic are presented in Table 2. The biochar and granite filler materials were mixed with the hot asphalt binder at 150°C for 3 minutes until the mixture was prepared homogeneously.

2.2. Laboratory Tests. To characterize the viscoelastic properties of asphalt mastic, frequency sweep tests were conducted using an Anton Paar MCR 702 direct shear rheometer (DSR). The two standardized DSR configurations, i.e., 8 mm and 25 mm diameter plates for asphalt binder and asphalt mastic, with applied sinusoidal strain were used for the frequency sweep test of asphalt mastic as shown in Figure 3. Following AASHTO-T315 [32], an 8 mm plate was used for the test at a temperature lower than 25°C and a 25 mm plate for temperature higher than 25°C. Tests were performed at the frequencies from 100 Hz to 0.1 Hz at the temperature from 0°C to 60°C with a 10°C interval. All the tests were conducted at the strain level where specimens behave linearity.

3. Master Curve Construction

The master curves were generated to present the complex moduli obtained from different temperatures to a given temperature based on the time-temperature superposition

TABLE 1: Material properties.

	Asphalt binder	Granite filler	Biochar filler
Density (g/cm ³)	1.03	2.65	2.23
Elastic modulus (GPa)	—	60	60
Poisson ratio	0.49	0.15	0.15

principle. The Williams–Landel–Ferry (WLF) formula was applied to shift the complex moduli to the reference temperature of 25°C and then the Christensen–Anderson (CA) model [33, 34] was further used to fit the shifted data. The WLF formula and the CA model are shown in the following equations:

$$\log a_T = \frac{-C_1(T - T_0)}{C_2 + (T - T_0)}, \quad (1)$$

where a_T is the shift factor, T is the test temperature, T_0 is the reference temperature, and C_1 and C_2 are constants.

$$G^*(\omega) = G_g \left[1 + \left(\frac{\omega_c}{\omega_r} \right)^{(\log 2)/R} \right]^{-R/(\log 2)}, \quad (2)$$

where $G^*(\omega)$ is complex shear modulus, G_g is glass modulus assumed to be 1 GPa, ω_r is the reduced frequency at the defining temperature (rad/s), ω_c is crossover frequency at the defining temperature (rad/s), ω is the frequency (rad/s), and R is the rheological index.

TABLE 2: Material compositions of asphalt mastics.

Asphalt mastics	Mass compositions (%)			Volume compositions (%)		
	Mineral filler	Biochar	Asphalt binder	Mineral filler	Biochar	Asphalt binder
Mastic (0%)	58.5	0.0	41.5	35.4	0.0	64.6
Mastic (40%)	36.5	20.4	43.1	21.2	14.2	64.6
Mastic (80%)	12.6	42.5	44.8	7.1	28.3	64.6
Mastic (100%)	0.0	54.2	45.8	0.0	35.4	64.6

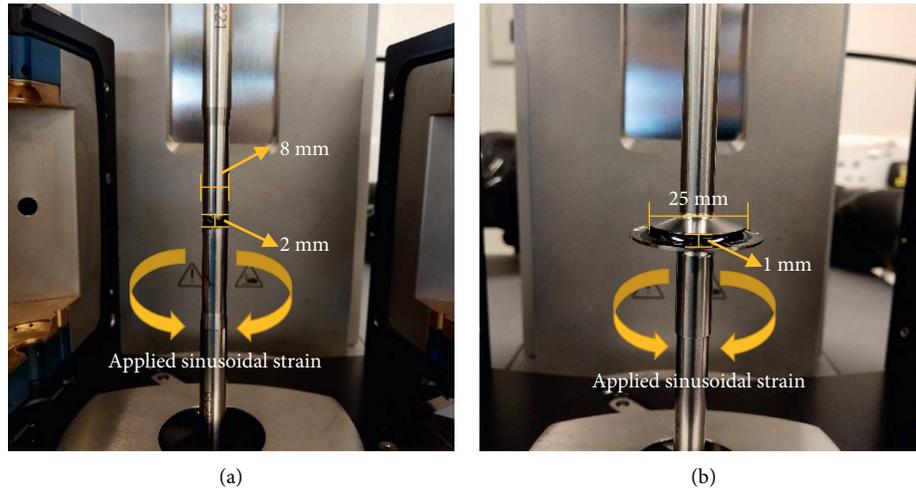


FIGURE 3: DSR measuring system used for (a) asphalt binder (8 mm plates) and (b) asphalt mastic (25 mm plates).

Table 3 presents the shift factors of WLF and parameters of the CA model of fitted master curves. Figure 4 presents a typical master curve construction of mastic (0%). It can be observed that the CA model can fit both the dynamic modulus and phase angle curves well with high consistency.

4. Modeling

Figure 5 illustrates the micromechanical model used in this paper. Figure 5(a) is a commonly used GSCM. This model is composed of three layers including the asphalt binder, aggregate, and a homogenized material layer [10]. One of the drawbacks of this model is that it cannot take the coating layer on the surface of the filler particle into the model. However, this coating layer can significantly affect the mechanical performance of asphalt mastic [30]. Therefore, this model generally underestimates the modulus of asphalt mixes. To solve this problem, a four-phase micromechanical model including the coating layer was therefore proposed to predict the complex modulus of asphalt mastic named modified generalized self-consistent model (MGSCM). This micromechanical model was proposed by Doghri [35, 36], which is composed of four different phases including effective homogeneity matrix, real matrix, coating layer, and inclusion compared with the traditional GSCM model as illustrated in Figure 5. Peng et al. [23] have developed this method for investigating the upper limit and lower limit of dynamic modulus of the asphalt concrete.

In this MGSCM model, the inclusions, mineral filler, and biochar filler were assumed as elastic components with an elastic modulus and Poisson's ratio of 60 GPa and 0.15, respectively. To describe the viscoelastic properties of asphalt binder, the complex modulus master curves of asphalt binder were expressed as the Prony series model as presented in Table 4. The Prony series parameters were determined by minimizing the storage modulus and loss modulus [37]. Figure 6 displays the master curves of asphalt binder expressed by the CA model and Prony series model. It is worth noting that the Prony series model can fit the CA model master curve with high accuracy within a wide frequency range from 10^{-4} Hz to 10^4 Hz. The process to determine the coating layer's properties may follow the flowchart presented in Figure 7 due to the complexity of physical measurement on the coating layer. The coating layer was assumed as an elastic component due to the relatively high stiffness modulus compared with asphalt binder. A Poisson's ratio of 0.15 was assumed because of its marginal effect on complex modulus perdition. The thickness of the coating layer was then determined when the complex modulus at low frequency reached the minimum relative error while this thickness was then used to determine the elastic modulus of the coating layer when the complex modulus at high frequency reached the minimum relative error. The complex modulus master curves of the asphalt mastic (0%) and asphalt mastic (100%) were predicted. Both models including GSCM and MGSCM were used to predict

TABLE 3: Parameters of the WLF formula and CA model for asphalt binder and mastics.

	Parameters	Unit	Asphalt binder	Mastic (0%)	Mastic (40%)	Mastic (80%)	Mastic (100%)
WLF formula	C_1	—	13.56	15.144	15.70	15.23	16.27
	C_2	—	132.24	144.334	148.91	149.26	157.23
	R	—	1.18	1.116	1.16	1.04	1.10
CA model	G_g	Pa	3.50E+08	5.20E+08	1.20E+09	1.00E+09	1.20E+09
	ω_c	rad/s	977	985	7.42E+02	6.28E+02	5.38E+02
R^2	$ G^* $	—	0.999	0.999	0.999	0.999	0.998
	θ	—	0.995	0.998	0.998	0.998	0.997

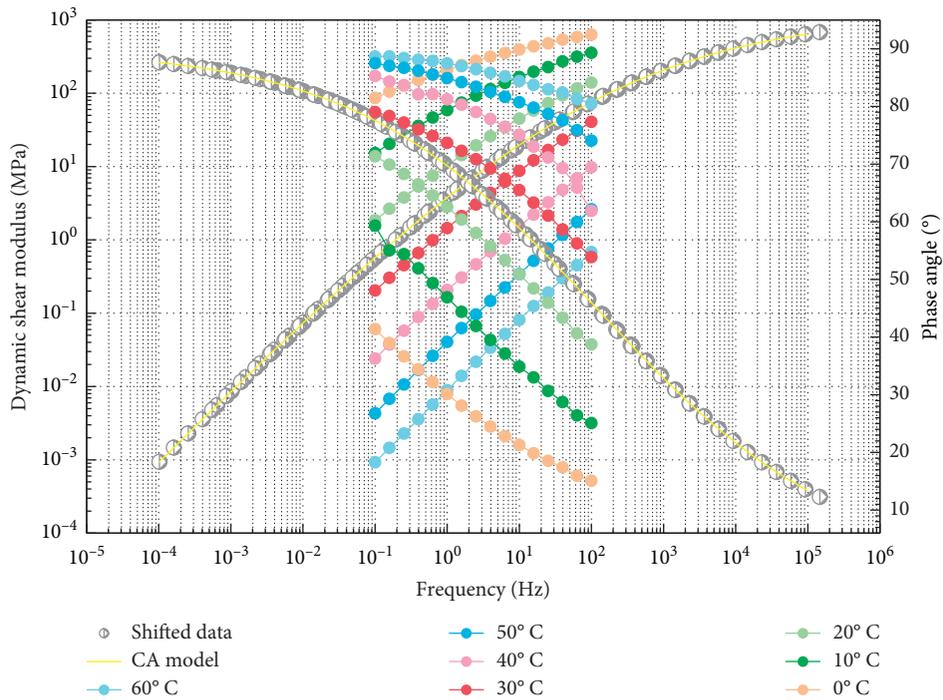


FIGURE 4: Master curve construction of mastic (0%).

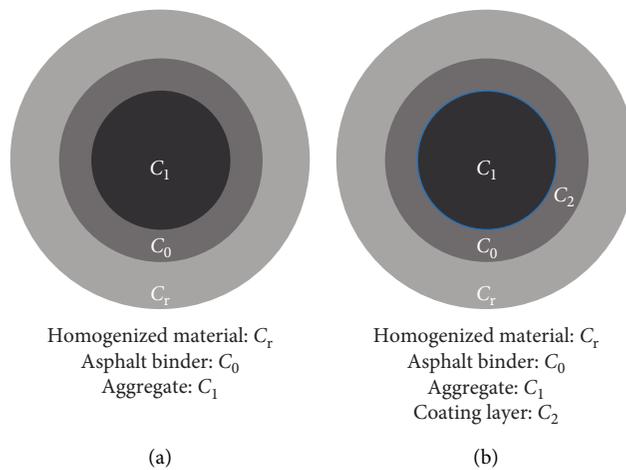


FIGURE 5: Schematic diagrams of micromechanical models: (a) GSCM and (b) MGSCM.

TABLE 4: Prony series model parameters of asphalt binder at 25°C.

Series no.	Pen60/70 $G_0 = 206.241 \text{ MPa}$	
	$\tau_i \text{ (s)}$	$\alpha_i \text{ (—)}$
1	4.955E-06	5.347E-01
2	1.851E-05	2.601E-02
3	6.916E-05	2.420E-01
4	2.584E-04	8.287E-02
5	9.652E-04	7.005E-02
6	3.606E-03	2.733E-02
7	1.347E-02	1.190E-02
8	5.033E-02	3.671E-03
9	1.880E-01	1.113E-03
10	7.024E-01	2.705E-04
11	2.624E+00	6.830E-05
12	9.804E+00	1.300E-05
13	3.663E+01	3.720E-06
14	1.368E+02	3.383E-07
15	5.112E+02	2.492E-07

the complex modulus of asphalt mastics. The MSC Digimat software system was used to conduct the modeling. The simulation process can be completed in seconds to obtain the complex moduli within the whole frequency range from 10^{-4} Hz to 10^4 Hz.

5. Results and Discussion

5.1. Complex Moduli. Figure 8 presents the complex modulus curves representing both dynamic modulus and phase angle of asphalt mastics with different biochar volume fractions. It can be observed that with the increasing volume substitution of biochar filler, the dynamic moduli of mastics increase but the phase angle decreases regarding frequency. This means that the biochar can stiffen the asphalt mastics. It is expected that the porous structure of biochar enhances the absorption of asphalt binder and then further increases the stiffness of asphalt mastics. To quantify the effect of biochar on the dynamic moduli and phase angles, their relative errors at low, high, and the whole frequency ranges are listed in Table 5. It is worth noting that a significant increase in dynamic modulus can be observed with the biochar substitutions from 0% to 100% and a 50% modulus increase can be achieved with a 100% biochar substitution. Besides, compared the differences in different frequency ranges, it can be found that the increase of dynamic modulus is substantially higher than the dynamic modulus at low frequency, and with the increase of substitution, this tendency becomes more noticeable, which means that the stiffening effect of biochar is strengthened with the biochar increase. Based on the performance of biochar mastic, it can be concluded that biochar filler can exhibit low deformation at long-term loading and high temperature, which indicates a better rutting resistance of asphalt pavement constructed by biochar filler than the conventional mineral filler.

5.2. Modeling. The complex moduli of asphalt mastic (0%) and mastic (100%) were predicted by both GSCM and

MGSCM models. The experimental and the predicted master curves for both mastics are displayed in Figures 9 and 10, and the corresponding errors are presented in Table 6. It can be seen that both models can well capture the trend of complex modulus for both mastics as indicated by high R^2 values of around 1. However, the GSCM substantially underestimates the dynamic modulus for both granite and biochar filler asphalt mastics with relative errors of 32% and 56% for mastic (0%) and mastic (100%), respectively. It is believed that the existence of the coating layer in the real mastic increases the experimental modulus of mastics. As mentioned before, due to the physiochemical reinforcement between filler particles and asphalt binder, the modulus of the coating layer will increase significantly and then further increase the overall modulus of asphalt mastic. However, this factor cannot be considered in the GSCM model. Therefore, to give a correct prediction, it is required to take the coating layer into the micromechanical model. To this end, the coating layer was introduced into the MGSCM model. From Figures 9 and 10, we can find that, with the introduction of the coating layer, significant improvement is achieved for the predicted master curves for both mastics and only the relative errors for both dynamic modulus and phase angle predictions on both mastics are narrowed down to less than 5%. Therefore, the results demonstrate that the MGSCM considering the coating layer can give an accurate prediction for the viscoelastic performance of asphalt mastics.

The properties of the coating layer are presented in Table 7. In the model, a thicker and high modulus coating layer was applied to mastic (100%) with biochar filler than the conventional filler mastic (0%) with granite filler. This is also consistent with the SEM test result, which indicates the biochar particles are characterized with special porous structures with an uneven surface. This porous structure indicates the biochar filler can have a thicker coating layer than the conventional granite filler with a smooth surface.

5.3. Dynamic Modulus Simulation based on the FE Method.

The viscoelastic property of asphalt materials is derived from that of asphalt binder. The complex modulus of the composites can be directly obtained from laboratory tests [25]. Besides, from the continuum mechanics aspect, asphalt mixtures were regarded as a representative volume element (RVE) composed of asphalt binder, aggregate particles, and air voids. Thus, the complex modulus is transferred to a calculable parameter of the resultant function of their mechanical properties, volume contents, and space location [19].

As the aggregate particle is an elastic material, the viscoelastic property of asphalt mastic is determined by asphalt matrix. For FE simulation, the linear transformation is required for the viscoelastic matrix [26]. Prony series model was adopted for linear transformation. The deviation is as follows: firstly, the sinusoidal external strain load is expressed as

$$\varepsilon(t) = \varepsilon_0 \exp(i\omega t). \quad (3)$$

By replacing $\varepsilon(t)$ with progressive relaxation modulus, the following stress expression can be obtained:

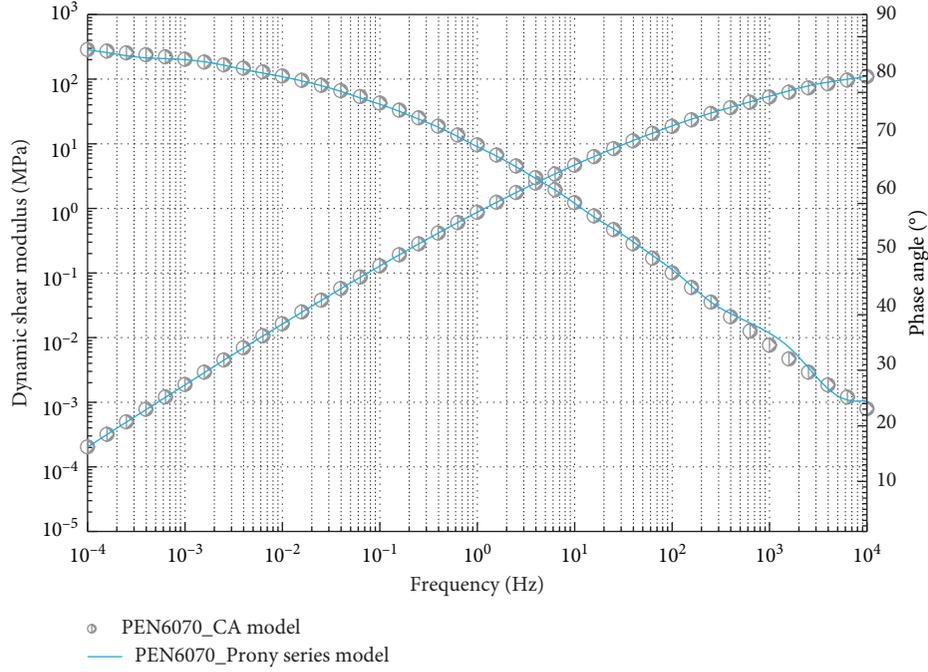


FIGURE 6: Dynamic shear modulus and phase angle master curves fitted by the CA model and the corresponding Prony series for Pen6070 at 25°C.

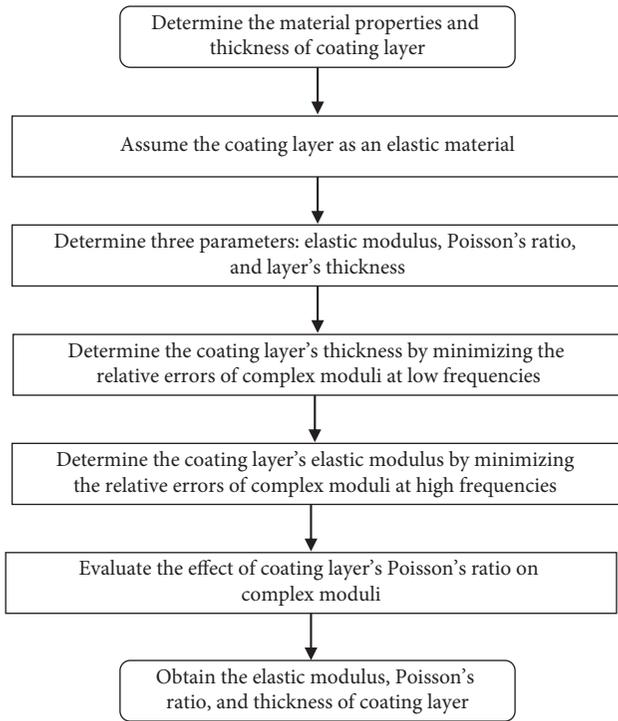


FIGURE 7: Flowchart of coating layer characterization procedures.

$$\begin{aligned}
 \sigma(t) &= E_{\infty} \varepsilon(t) - \int_0^{\infty} e(\tau) \frac{d}{d\tau} (E_{\infty} \varepsilon_0 \exp(i\omega(t - \tau))) d\tau \\
 &= E_{\infty} \left(1 + i\omega \int_0^{\infty} e(\tau) \exp(-i\omega\tau) d\tau \right) \varepsilon(t),
 \end{aligned} \tag{4}$$

where $e(t) = (E(t)/E_{\infty}) - 1$ is the relaxation formula after regulation and τ is the relaxation time.

Based on equation (4), the relationship of stress and strain can be redefined as follows:

$$\sigma(t) = E^*(\omega) \varepsilon(t). \tag{5}$$

Comparing equation (4) with equation (5), the expression of complex modulus can be written as $E^*(\omega) = E_{\infty} (1 + i\omega e(\omega))$, where $e(\omega)$ is the transformed term of $e(t)$ after Fourier transform. $e(\omega)$ can be expressed as $e(\omega) = \text{Re}(e(\omega)) + i\text{Im}(e(\omega))$. Therefore, the complex modulus can be further expressed as follows:

$$E^*(\omega) = \underbrace{E_{\infty} (1 - \omega \text{Im}(e(\omega)))}_{E_s(\omega)} + i \underbrace{E_{\infty} \omega \text{Re}(e(\omega))}_{E_l(\omega)}, \tag{6}$$

where $E_s(\omega)$ is storage modulus and $E_l(\omega)$ is loss modulus.

By rewriting equation (6), the following equation is obtained:

$$\left. \begin{aligned}
 \text{Im}(\omega e(\omega)) &= 1 - \frac{E_s(\omega)}{E_{\infty}} \\
 \text{Re}(\omega e(\omega)) &= \frac{E_l(\omega)}{E_{\infty}}
 \end{aligned} \right\}. \tag{7}$$

Therefore, the complex modulus is expressed as the progressive relaxation moduli at different frequencies, which can be used as a viscoelastic constitutive model in the FE simulation [38].

5.4. FE Results. To prove the assumption of the coating layer in the MGSCM, FE simulation was also conducted. The simulations based on mastic (0%) and mastic (100%) were performed. In the FE simulation, the complex moduli of asphalt mastic within the frequency range from 10^{-2} Hz to

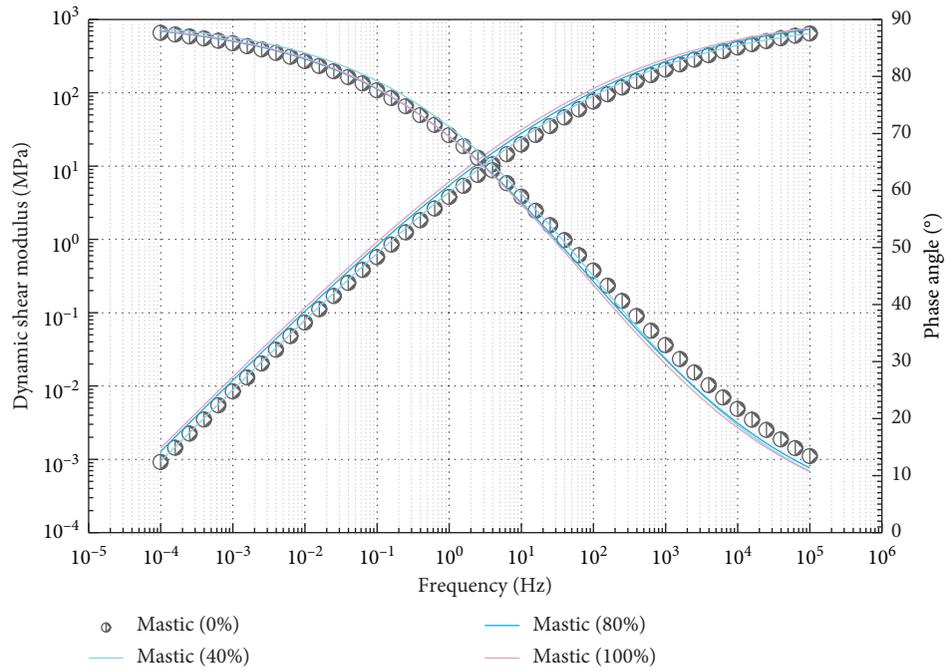


FIGURE 8: Complex modulus master curves of asphalt mastic.

TABLE 5: Relative differences in complex modulus (%).

Frequency range	Complex modulus	Mastic (40%)	Mastic (80%)	Mastic (100%)
Low frequencies (10^{-4} Hz~ 10^{-3} Hz)	Dynamic modulus	10.99	41.00	56.53
	Phase angle	1.01	0.37	0.51
High frequencies (10^3 Hz~ 10^4 Hz)	Dynamic modulus	3.50	25.02	33.98
	Phase angle	10.00	9.50	12.62
Whole frequencies (10^{-4} Hz~ 10^4 Hz)	Dynamic modulus	12.75	38.93	53.92
	Phase angle	2.97	2.61	3.47

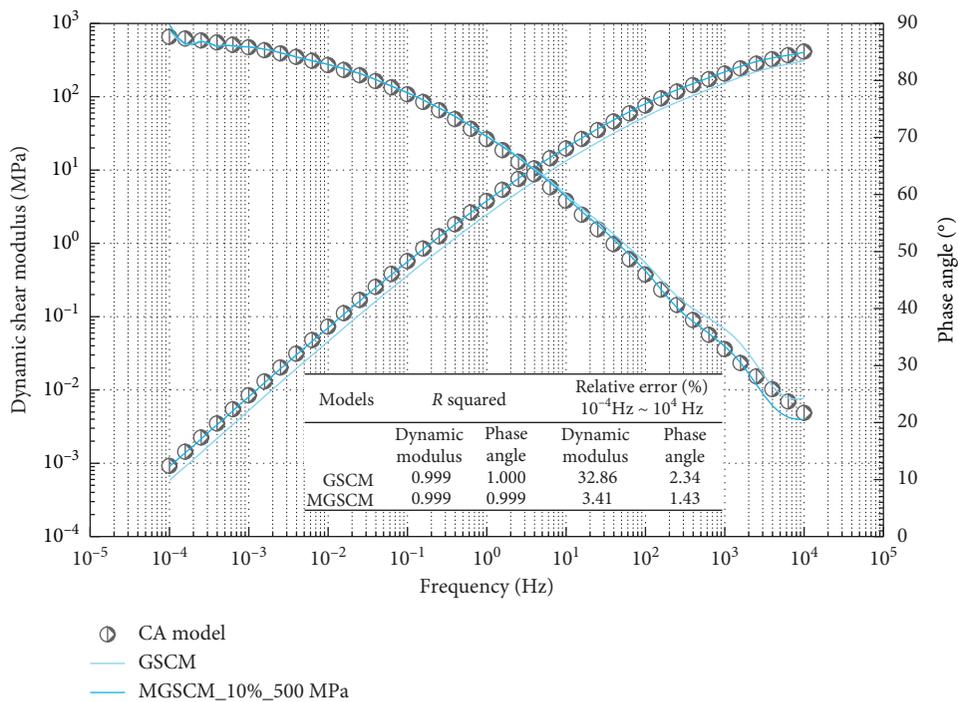


FIGURE 9: Predicted complex moduli for mastic (0%).

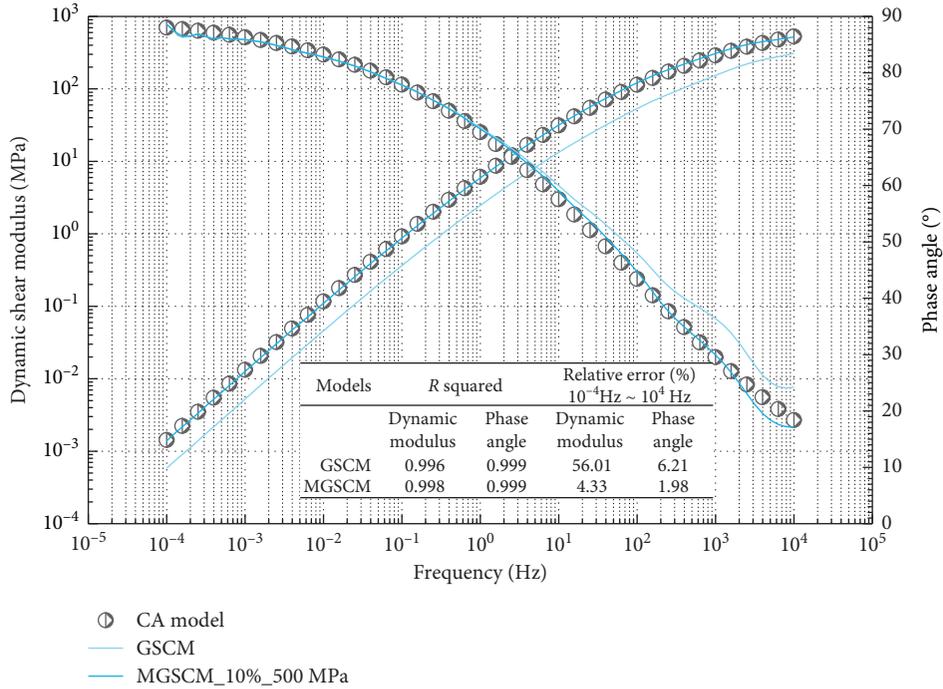


FIGURE 10: Predicted complex moduli for mastic (100%).

TABLE 6: Error analysis for complex moduli of asphalt mastics.

Mastic	Models	R squared		Relative error (%) (10 ⁻⁴ Hz~10 ⁴ Hz)	
		Dynamic modulus	Phase angle	Dynamic modulus	Phase angle
Mastic (0%)	GSCM	0.999	1.000	32.9	2.3
	MGSCM	0.999	0.999	3.4	1.4
Mastic (100%)	GSCM	0.996	0.999	56.0	6.2
	MGSCM	0.998	0.999	4.3	2.0

TABLE 7: Coating layer properties.

	Coating layer relative thickness (%)	Elastic modulus (MPa)	Poisson's ratio
Mastic (0%)	10	500	0.15
Mastic (100%)	17	800	0.15

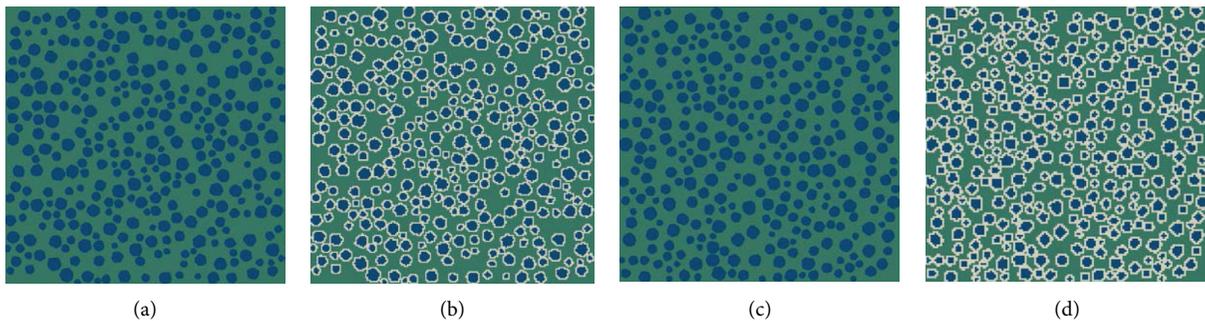


FIGURE 11: Microstructural models in the FE simulations. The microstructural model (a) without a coating layer for mastic (0%), (b) with a coating layer for mastic (0%), (c) without a coating layer for mastic (100%), and (d) with a coating layer for mastic (100%).

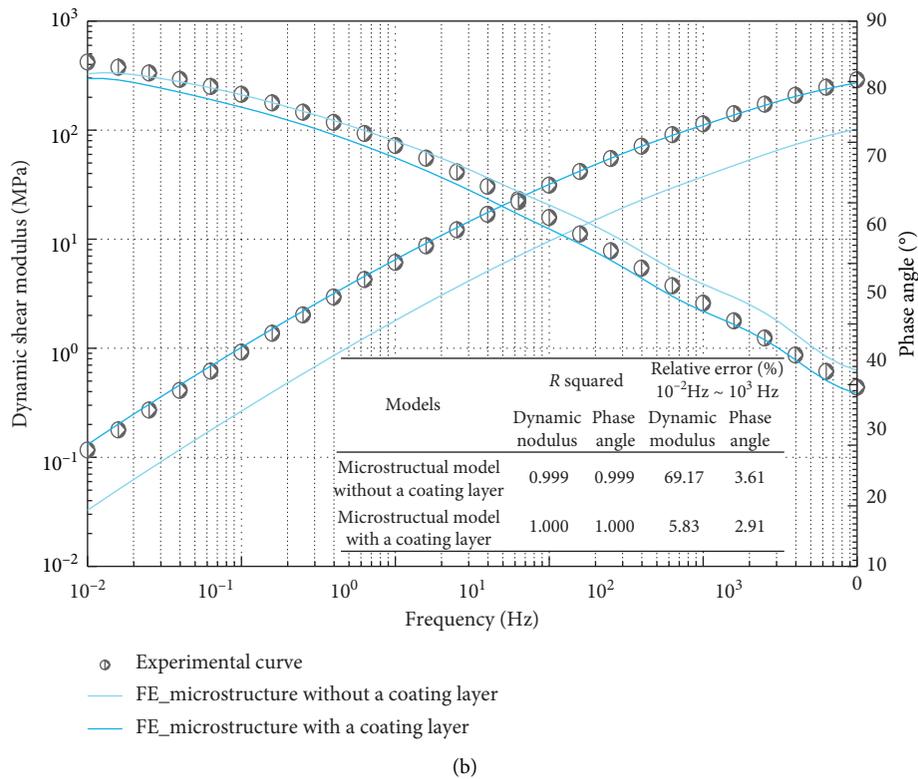
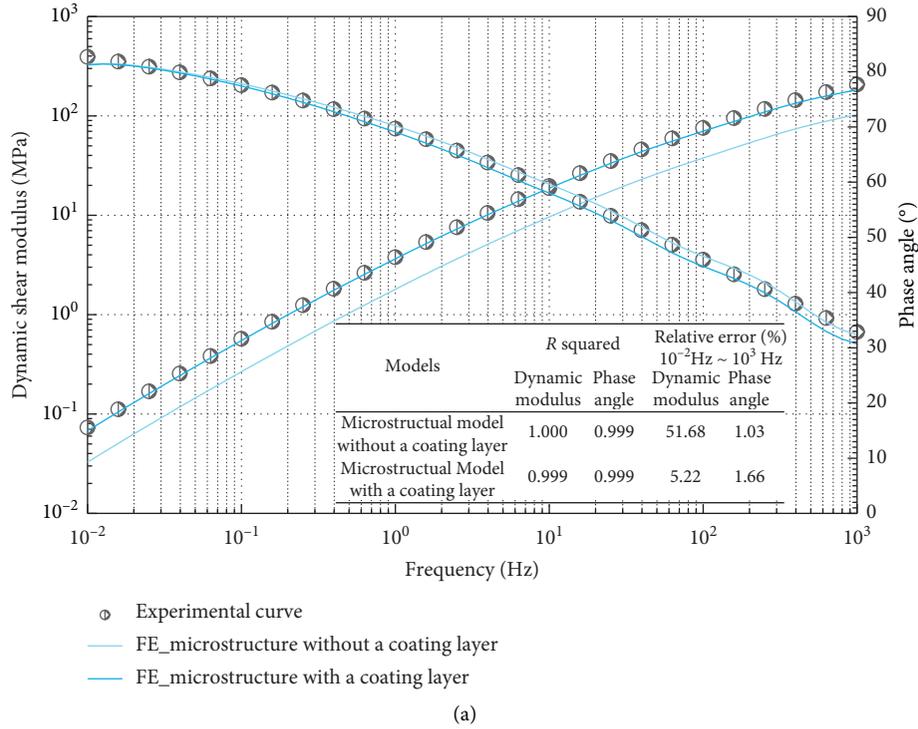


FIGURE 12: Predicted complex modulus master curves based on FE simulation. (a) Mastic (0%) and (b) mastic (100%).

10³ Hz were predicted based on the steady-state dynamic (SSD) method, which is an efficient and accurate method to predict the complex modulus of asphalt materials [39, 40]. To consider the coating layer effect, the microstructural models with a coating layer and without a coating layer were

developed based on a random aggregate distribution algorithm. The developed models for the two mastics were presented in Figure 11. The coating layer thicknesses of 1 μm and 1.35 μm were assigned to the mastic (0%) and mastic (100%), respectively. The corresponding predicted complex

modulus master curves are presented in Figure 12. It can be observed that the FE simulation based on the microstructural model without a coating layer underestimates the dynamic shear moduli within the whole frequency range for both mastics, but significant improvement was achieved for both mastics after a thin coating layer was added. This result verifies the existence of the coating layer. Besides, since the coating layer of mastic (100%) is thicker than that of mastic (0%), it also proves the assumption that the biochar filler particle is attributed to a thicker coating layer than the granite filler particle in the MGSCM.

6. Summary and Conclusions

In this study, biochar converted from straw was used as an alternative mineral filler in asphalt mastic. The complex moduli of mastics with different biochar contents were measured by laboratory tests firstly. Then, the complex moduli were predicted by the proposed micromechanical model based on homogeneous theory. Further, the complex moduli of asphalt mastics were predicted and analyzed by FE simulations based on microstructure models. Based on the outcome of this study, the following conclusions can be drawn:

- (i) The modified MGSCM by considering the coating layer can effectively predict the complex modulus of biochar-modified asphalt mastic
- (ii) The predictions based on FE simulation by random aggregate generation method have a good correlation with the predictions based on MGSCM and experimental results, which verifies the accuracy of MGSCM in the complex modulus prediction of asphalt mastic, and this method can be further extended to other areas
- (iii) Biochar filler can improve the modulus of mastic by developing a thick coating layer to improve the modulus of mastics, which would contribute to the rutting performance of asphalt pavement

Data Availability

All the data used to support the findings of this study are included within the article.

Conflicts of Interest

The authors declare that they have no conflicts of interest.

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