

Geographical origin discrimination and polysaccharides quantitative analysis of *Radix codonopsis* with micro near-infrared spectrometer engine

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At present, Tradition Chinese Medicine (TCM) industry in China is in the stage from the empirical development to industrial production. Near infrared (NIR) spectroscopy has been widely used in the quality control of TCM's modernization with its characteristics including rapidness, nondestruction, simplicity, economy, and so on. In this study, as one type of a portable micro NIR spectrometer, Micro NIR 1700 was used to establish the qualitative models for identification of geographical region and authenticity of *Radix codonopsis* based on discriminant analysis (DA) method. Both of the DA models had better predictive ability with 100% accuracy. In addition, a method for rapid quantitative analysis of polysaccharide in *Radix codonopsis* was also developed based on Micro NIR 1700 spectrometer with partial least-squares (PLS) algorithm. In the PLS calibration model, the NIR spectra of samples were pretreated with different preprocessing methods and the spectral region was selected with different variable selection methods as well. The performance of the final PLS model was evaluated according to correlation coefficient of calibration (R_c) , correlation coefficient of prediction (R_n) , root mean squared error of cross validation (RMSECV), and root mean squared of prediction (RMSEP). The values of R_c , R_p , RMSECV, and RMSEP were 0.9775, 0.9602, 2.496, and 2.734 g/mL, respectively. This work demonstrated that micro infrared spectrometer could be more convenient and rapid for quality

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control of *Radix codonopsis*, and the presented models would be a useful reference for quality control of other similar raw materials of TCM.

Keywords: Tradition Chinese Medicine; Micro NIR 1700 spectrometer; Radix codonopsis.

1. Introduction

Currently, the Tradition Chinese Medicine (TCM) industry in China is in the stage from the empirical development to industrial production. Many issues have occurred in the process, such as the complex sources of raw materials, uneven quality levels, the lack of strict quality control standards as well as scientific techniques, and so on. These issues hinder the development of TCM industry. Therefore, we should apply multi-disciplinary knowledge to make TCM production technology normalized, standardized, scientific, and systematized.¹ It is particularly important for raw material of TCM to establish rapid quality evaluation system because it is the starting point of TCM preparation production, and reliable quality of raw material is a crucial guarantee to the final product of TCM.

Radix codonopsis is the root of Codonopsis pilosula (Franch.) Nannf., Codonopsis pilosula Nannf. var. modesta (Nannf.) L. T Shen, or Codonopsis tangshen Oliv., belonging to the family Campanulaceae. It has been used for benefiting stomach and spleen, promoting the production of blood and body fluid. Besides, it also has the function of antitumor, antimicrobial, antioxidant, and so on.² Radix codonopsis is a kind of important raw material for numerous TCM preparations including all nourishing bolus, gynecologic Qianjin tablets, and so on. Additionally, owing to Radix codonopsis contains rich carbohydrate, amino acid, vitamin, and mineral composition, it has also been utilized into many healthcare products.

C. pilosula is mainly cultivated in the Northeast of China, Shanxi Province, Gansu Province, Henan Province, and Sichuan Province. The chemical composition and content in raw material of TCM planted in different areas vary greatly with the condition of soil, water quality, climate, and other factors, which can affect their curative effect and clinical application. Besides, TCM raw material has counterfeiting phenomenon in medicinal market due to profit-driven. Traditional quality control methods, including empirical method and microscopy method, highly depend on personal skills and cannot achieve rapid, objective, and accurate analysis. Therefore, an accurate and rapid method is necessary to develop for the identification of geographical origins and authenticity of C. pilosula. C. pilosula contains a high content of polysaccharides,^{3,4} so many literatures about polysaccharides were investigated. Polysaccharide is one of the most important active ingredients of C. pilosula, possessing antimicrobial, antitumor, and antioxidant activities.^{5–7} At present, the most usual way to determine the content of polysaccharides is phenol-sulfuric acid method.⁸ However, this method is not only complicated but also time-consuming. Thus, it is essential to establish a convenient method for rapid determination of the content of polysaccharides in C. pilosula for quality evaluation.

As a booming analytical method,⁹ near infrared spectroscopy (NIRS) has been widely applied in many fields, such as petroleum chemical industry, agriculture and food business, tobacco industry, and pharmacy^{10–13} due to its characteristics¹⁴ including rapidness, nondestruction, simplicity, low cost, and so on. In the field of TCM, NIRS has been widely employed in both qualitative analysis and quantitative determination.^{15,16} Meanwhile, it can serve as a kind of process analysis technology in on-line quality control of TCM manufacture.^{17,18} NIR spectrometer is generally expensive and bulky for routine analysis, which is not suitable for rapid onsite analysis in pharmaceutical company. Micro NIR 1700 spectrometer (VIAVI, USA) is a new and portable NIR spectrometer, following particular features such as lightweight, USB power supply or battery, etc.¹⁹ When compared with laboratoryscale instrument, it guarantees the accuracy of results but also with the advantages of portability and low cost. With the aforementioned characteristics, it is becoming a new research highlight. Pan et al.²⁰ showed variable importance in projection assignment of particle size and lobetvolin content of C. pilosula in NIR model development. Li $et al.^{21}$ showed discrimination of the geographical origin of C. pilosula using NIR diffuse reflection spectroscopy coupled with random forests and k-nearest neighbor methods. The aim of the present research is to apply Micro NIR 1700 spectrometer to establish the qualitative model for quickly discriminating geographical origins²² and the counterfeit of *C. pilosula* with discriminant analysis (DA) method.^{23,24} Meanwhile, the calibration model was constructed for quantitative analysis of polysaccharide content in *C. pilosula* by Micro NIR 1700 spectrometer and partial least square (PLS) regression. To the best of our knowledge, there was no similar report about the qualitative discrimination and quantitative analysis of polysaccharide in *C. pilosula* with micro NIR spectrometer engine.

2. Materials and Methods

2.1. Materials

In this research, a total of 102 batches of C. pilosula were collected from the medicinal market of Bozhou (Anhui Province, China). The information of samples was shown in Table 1.

2.2. Methods

2.2.1. Spectral collection

First, samples of *C. pilosula* were crushed and then screened through mesh size of 60 and dried at 60° for 24 h. The diffuse reflectance spectra of 102 samples were acquired by using a Micro NIR 1700 spectrometer (VIAVI, USA) equipped with a dualintegrated vacuum tungsten lamp, a thin-film linearly variable filter, and a 128-line element uncooled indium gallium arsenide (InGaAs) diode array. The structure of Micro NIR 1700 spectrometer was shown in Fig. 1. The reference measurement was performed with a 100% SpectralonTM reference standard before sample measurement. The wavelength ranges from 908 nm to 1676 nm. The integration time of Micro NIR was set to 5000 ms, and each spectrum was accumulated of 100 scans. Each sample was scanned three times and then averaged for analysis. Spectra were recorded at room temperature and the humidity was maintained at 40%.

2.2.2. Software

Qualitative model for quickly detecting the classification of geographical origins and authenticity of $C. \ pilosula$ samples was accomplished by using TQ Analyst (Thermo Fisher, USA) with DA method. Calibration model of quantitative analysis of polysaccharide content in $C. \ pilosula$ was built with Matlab 2015a and PLS_toolbox (Mathworkers Inc., USA).

2.3. Phenol-sulfuric acid method

2.3.1. Reference solutions

The obtained anhydrous glucose (0.6031 g) was dissolved in a small amount of distilled water, and then the solution was diluted to 100 mL. An aliquot of 10 mL solution was taken out and diluted 10 times, and the concentration of reference solution was 0.6031 mg/mL.

2.3.2. Standard curve

Seven reference solutions with different volumes (0, 0.2, 0.4, 0.6, 0.8, 1.0, and 1.2 mL) were added into seven tubes with caps, respectively. Each solution

Trade name Sample Name No. Origin Codonopsis pilosula (Franch.) Nannf. Gansu Authenticity Baitiao 1 - 15Dongdang 16 - 30Northeast Shanxi Ludang 31 - 45Codonopsis tangshen Oliv. Sichuan Chuandang 46 - 57Codonopsis pilosula Nannf. var. Wendang 58-72Gansu modesta (Nannf.) L. T Shen Fake Codonopsis pilosula (Franch.) Nannf. Sulfur-Baitiao 73-87 Gansu Radix Stellariae Radix Stellariae Ningxia Neimenggu 88-102 (Inner Mongolia)

Table 1. Information on samples.



Fig. 1. Micro NIR 1700 spectrometer.

was diluted to 2.0 mL with distilled water. The 5% phenol solution (1 mL) and concentrated sulfuric acid (5 mL) were added to each tube. Then the tubes were closed, shaken well, and incubated for 15 min at 40°. All of the tubes were allowed to cool down to room temperature before reading their absorption at 490 nm in a Microplate Reader (Awareness, USA). Then, standard curve was drawn between absorption (A) and concentration (C) of anhydrous glucose by linear regression.

2.3.3. Sample solutions

No. 1–87 samples were used for quantitative analysis of polysaccharide content in *C. pilosula*. Firstly, sample powder (0.5 g) and 80% ethanol (25 mL)were added into 50 mL centrifuge tube. The ultrasonic method was used for extraction for about 25 min. The supernatant was collected after centrifugation. Secondly, water (28 mL) was added into the tube containing residue and ultrasonic extraction was then performed for 10 min. The supernatant was collected after centrifugation. Thirdly, these supernatants were merged together and then diluted to 100 mL.

2.3.4. Determining the polysaccharide concentration of sample solution

Liquid (0.2 mL) was taken out from each sample solution, and then absorption could be measured following the above phenol-sulfuric acid method. Each sample was recorded three times and then averaged for subsequent analysis. Finally, the

concentration of polysaccharide in sample solution was calculated according to the standard curve.

2.4. Discriminant model for authenticity

In 102 samples, 72 authentic samples and 30 fake C. *pilosula* were used to establish a discriminant model by DA method. Four kinds of spectral pretreatment methods, including standard normal variate (SNV) transformation, Savitzky–Golay (SG) smoothing, first derivative with SG 7 points filter (1 st +SG7) and SNV+SG 7, were compared to choose the optimal one according to model performance.

The model established with full spectra region (908–1676 nm) and optimal spectral pretreatment method were also further assessed by principle component analysis (PCA).

2.5. Classification model for geographical origins

Forty-five batches of *C. pilosula* (Franch.) Nannf. were collected to establish DA model from three areas including Gansu province (trade name: Baitiao, No. 1-15), Northeast of China (trade name: Dongdang, No. 16-30), and Shanxi province (trade name: Ludang, No. 31-45). The four pretreatment methods including SNV, SG 7, 1 st +SG 7, and SNV+1st +SG 7 were compared to choose the best one according to the performance of the model.

PCA was used to evaluate the DA model for discrimination of sample geographical origin with full spectral region and optimal spectral pretreatment method.

2.6. Quantitative analysis

At first, insignificant spectral region should be eliminated by analyzing the raw spectra. Then, the raw spectra were pretreated by multiplicative scatter correction (MSC), SNV, 1 st, and 1 st + SG 7 as well as no pretreatment, respectively. The calibration set was established and the optimal pretreatment method was chosen according to the model performance, which was based on the values of R_c , R_p , RMSECV, and RMSEP.

Additionally, three methods were investigated to select the optimal spectral region, including competitive adaptive reweighted sampling (CARS)-PLS, interval PLS (iPLS), and successive projections algorithm (SPA). A quantitative model of calibration set with optimal pretreatment method and spectral region was used to predict the polysaccharide concentration of validation set.

3. Results and Discussion

3.1. Raw spectra of samples

Figure 2 showed the raw spectra of samples. From Fig. 2 we can see that 102 samples of spectral absorption trend had serious overlapping. It was difficult to get information directly from the peak position and characteristic peak information. Only by using chemometric methods to deal with the spectra, the effective information could be highlighted out.

Figure 3 showed the spectra pretreated by 1 st + SG 7 of 102 samples. There were two sharp peaks that could be observed in regions of 1165 nm and 1425 nm from the raw and preprocessed spectra. The absorbance in the range of 1165 nm was attributed by the third overtone of C–H bands. Meanwhile, the waveband of 1425 nm was associated with the second overtone stretch and deformation vibration of O–H bands.



Fig. 2. Raw spectra of *C. pilosula* samples.



Fig. 3. Spectra of samples pretreated by 1 st +SG 7.

3.2. Division of sample sets

Figure 4 showed the scores of all the samples of seven classes with PCA. The red circle represented the sample in calibration set, whereas the blue plus sign represented the sample in the validation set. It showed that samples of both sets had uniform distribution, which means that two sample sets were divided reasonably and the calibration set could be used to construct quantitative model.

3.3. Results of discriminant model for authenticity

The results of different spectral pretreatment methods were shown in Table 2, which indicated the discriminant performances. The optimal spectral pretreatment method was SNV+SG 7 method. The model based on full spectral region combined with SNV+SG 7 had a better predictive ability with 100% accuracy, which could be useful for quickly detecting the authenticity of *C. pilosula*.

The performance of the discriminant model was also illustrated in the 3-D score plot of the first three principal components (Fig. 5). As shown in Fig. 5, there were clear differences between the two-class samples.

3.4. Classification model of geographical origins

Results of classification model of geographical origins were shown in Table 3. From Table 3, the optimal discrimination performance of calibration set was based on the SNV+1st+SG 7 method. The predictive accuracy was up to 100% based on the optimal model with full spectra region and SNV+SG 7 method. The optimal model could be used for rapidly detecting the geographical origins of *C. pilosula*.

To further assess the performance of the DA model for classifying samples according to geographical origins, PCA was also employed. From the 3-D score plot of PCA (Fig. 6), there were distinct gaps between the samples from three geographical origins.

3.5. Results of phenol-sulfuric acid method

3.5.1. Polysaccharide content of samples

The linear regression formulation was as follows: A = 25.08C + 0.0028 ($R^2 = 0.9998$). Standard curve



Fig. 4. The scores of all the seven samples with PCA. (a) Baitiao (Gansu); (b) Dongdang (Northeast); (c) Ludang (Shanxi); (d) Chuandang (Sichuan); (e) Wendang (Gansu); (f) Sulfur Baitiao (Gansu); and (g) Radix Stellariae (Ningxia).

Table 2.	Results of n	nodels based	on different	spectral	pretreatment	methods.

		Calibrati	on	Validation			
Pretreatment method	No.	False no.	Accuracy rate (%)	No.	False no.	Accuracy rate (%)	
No-pretreated	61	7	88.5	41	4	90.2	
SNV	61	0	100.0	41	1	97.6	
S-G 7	61	4	95.1	41	2	95.1	
1st+S-G 7	61	2	93.4	41	0	100.0	
SNV+S-G 7	61	0	100.0	41	0	100.0	

		Calibrati	ion	Validation			
Pretreatment method	No. False no.		Accuracy rate (%)	No.	False no.	Accuracy rate (%)	
No-pretreated	27	4	85.2	18	3	83.3	
SNV	27	2	92.6	18	0	100.0	
SG 7	27	3	88.9	18	2	88.9	
1st+SG 7	27	0	100.0	18	1	94.4	
SNV+1st+SG 7	27	0	100.0	18	0	100.0	

Table 3. Results of classification model of geographical origins based on different spectral pretreatment methods.

showed that it was a strong linear relationship between A (absorbance) and C (concentration), which met the requirement of analysis.

3.6. Quantitative model based on NIRS

3.6.1. Elimination of insignificant spectral region

As shown in Figs. 1 and 2, there were some noises in the spectral range of 908–1140 nm waveband, resulting in little useful absorption information in this range. Therefore, the waveband should be discarded before the calibration process. To confirm the effectiveness of the band selection, models were established with different wavebands. As shown in Table 4, the values of R_c , R_p , RMSEC, and RMSEP were 0.9428, 0.9275, 3.4168, and 3.8214 g/mL, respectively, and the quantitative model was constructed in the range of 1140–1676 nm waveband.

3.6.2. Selection of spectral pretreatment method

According to the aforementioned results (Table 4), 1140–1676 nm wavebands were used to select the optimal pretreatment method.^{25,26} As shown in Table 5, it is indicated that the MSC method had a better result compared with other methods. The values of RMSECV and RMSECP were minimal, ensuring the accuracy of the prediction results.

3.6.3. NIR waveband selection

With the optimal pretreatment method, the spectral region was further selected based on the performances of PLS models. Table 6 showed the results of PLS models with different variable selection methods. When iPLS and SPA were adopted to select wavebands, the results of model became better. Meanwhile, the number of variables also



Fig. 5. Plot of PCA scores (PC1 vs PC2 vs PC3) of samples (red dot represents the authentic sample, and blue dot represents the fake sample). Circular dot represents the calibration set sample, and crossed dot represents the validation set samples.



Fig. 6. Plots of PCA scores (PC1 vs PC2 vs PC3) of three geographical classes samples. Red represents the Baitiao samples (Gansu); blue represents the Ludang samples (Shanxi); and green represents the Dongdang samples (Northeast).

decreased. According to the results (Table 6), the iPLS method was superior to SPA. So the wavebands of 1465–1521 nm and 1620–1645 nm selected by the iPLS method were used as the optimal spectral region. The results of selected variable were shown in Fig. 7.

3.6.4. Prediction capability of PLS quantitative model

In conclusion, selecting MSC as the spectral pretreatment method, iPLS method was applied to choose the spectral region ranging from 1465 nm to 1521 nm and from 1620 nm to 1645 nm. The results

 Table 4.
 Results before and after elimination of insignificant waveband.

Wave band (nm)	PCs	R_c	R_p	RMSEC (g/mL)	RMSECV (g/mL)	RMSEP (g/mL)
Whole band 908–1140 1140–1676	7 7 6	$0.9267 \\ 0.8730 \\ 0.9428$	$0.894 \\ 0.477 \\ 0.928$	$3.832 \\ 5.534 \\ 3.417$	5.034 7.052 3.762	4.524 7.583 3.821

Table 5. Results of different spectral pretreatment methods for quantitative model.

Pretreatment	PCs	R_c	R_p	RMSEC (g/mL)	RMSECV (g/mL)	RMSEP (g/mL)
No pretreatment	6	0.9428	0.9275	3.417	3.762	3.821
MSC	7	0.9630	0.9515	2.532	2.887	3.138
SNV	7	0.9576	0.9485	2.608	2.954	3.261
$1 \mathrm{st}$	6	0.9369	0.8961	3.755	4.654	4.895
1st+SG 7	7	0.9444	0.9128	3.044	3.673	3.593

Table 6. Results of different spectral regions by various variable selection methods.

Methods	Variables no.	PCs	R_c	R_p	RMSEC (g/mL)	RMSECV (g/mL)	RMSEP (g/mL)
1140–1676 nm	87	7	0.9630	0.9515	2.532	2.887	3.138
iPLS	16	8	0.9775	0.9602	2.240	2.496	2.734
CARS-PLS	11	5	0.9572	0.9483	3.796	2.053	3.875
SPA	20	6	0.9715	0.9558	2.573	2.887	3.138
UVE	25	6	0.9603	0.9420	2.201	2.502	2.613

No.	True value (g/mL)	Predictive value (g/mL)	Absolute error (g/mL)	No.	True value (g/mL)	Predictive value (g/mL)	Absolute error (g/mL)
1	32.40	32.74	0.34	46	41.92	40.70	-1.22
6	34.45	36.17	1.72	47	46.33	44.60	-1.73
10	33.04	32.74	-0.30	50	37.79	36.66	-1.13
12	31.41	32.65	1.24	51	44.52	44.38	-0.14
13	33.54	33.95	0.41	56	33.95	35.75	1.80
14	30.51	33.47	2.96	59	41.01	38.28	-2.73
17	47.85	48.96	1.11	63	40.63	38.42	-2.21
18	29.26	30.44	1.18	65	36.52	37.88	1.36
25	48.41	48.40	-0.01	67	35.23	36.28	1.05
27	43.15	42.32	-0.83	70	37.94	40.38	2.44
28	38.86	40.28	1.42	71	42.22	46.84	4.62
29	40.10	42.51	2.41	74	36.06	35.32	-0.74
32	18.25	22.91	4.66	75	28.49	30.73	2.24
36	25.32	26.00	0.68	82	36.50	36.27	-0.23
38	40.43	40.58	0.15	84	38.87	39.77	0.90
39	32.04	33.17	1.13	85	33.38	31.76	-1.62
40	33.34	32.31	-1.03	86	29.99	31.59	1.60
44	38.32	40.80	2.48				

Table 7. Results of validation set predicted by optimal PLS quantitative model (%).



Fig. 7. The result of variable selection.



Fig. 8. Correlation diagram of polysaccharide content.

of quantitative model established with PLS regression showed that the values of R_p , RMSECV, and RMSEP were, respectively, 0.9602, 2.4963, and 2.7341 g/mL, which indicated that the established model had higher predication ability for predicting the concentration of polysaccharide content in C. *pilosula*. Detailed results were shown in Table 7 and Fig. 8.

4. Conclusion

In this study, qualitative model was established for geographical origin and authenticity discrimination of C. pilosula with Micro NIR 1700 spectrometer successfully. The optimal DA model had a predictive ability with 100% accuracy. In addition, an NIR method was also developed for the determination of polysaccharide content in C. pilosula. The calibration model was validated with satisfactory R_n , RMSECV, and RMSEP values, which were 0.9602, 2.4963, and 2.7341 g/mL, respectively. Dueto the rapid, accurate, and robust properties, the qualitative and quantitative models based on Micro NIR 1700 spectrometer could be successfully used for monitoring the quality of C. pilosula. The presented method provided a promising tool for the quality of raw TCM material evaluation and could be potential application for solving the similar issues. Compared with general NIR instruments, micro instrument such as Micro NIR 1700 spectrometer is much cheaper, convenient, and portable, which would promote the application of micro NIR spectrometer, especially in the quality control of TCM.

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