### Study of Capsicum Frutescens L. by Fourier Transform Infrared Spectroscopy

Li Weixing Zhao Xingxiang Liu Gang Wang Xiaohua Wang Xiaolong

(School of Physics and Electronic Information, Yunnan Normal University, Kunming, Yunnan 650500, China)

Abstract Fourier transform infrared spectroscopy (FTIR) combined with principal component analysis (PCA) and hierarchical cluster analysis (HCA) is used to study different kinds of capsicum frutescens L.. FTIR spectra of 50 samples are obtained from five species of capsicum frutescens L.. The results show that the infrared spectra of capsicum frutescens L. are similar, but tiny differences in wave-numbers and absorption intensities of peaks are observed in the range of  $1800 \sim 800~\text{cm}^{-1}$ . PCA and HCA are performed on the second derivative infrared spectra in this range. FTIR spectroscopy is found to be efficient in classification of capsicum frutescens L.. 50 samples are well divided into five groups and about 100% classification accuracy for HCA, about 98% accuracy for PCA are yielded. It is proved that FTIR combined with statistical analysis can be used to discriminate capsicum frutescens L..

**Key words** spectroscopy; Fourier transform infrared spectroscopy; principal component analysis; hierarchical cluster analysis; capsicum frutescens L.

OCIS codes 140.3070; 300.6300; 300.6340; 300.6360

## 辣椒的傅里叶变换红外光谱研究

李伟星 赵兴祥 刘 刚 汪小华 王小龙

(云南师范大学物理与电子信息学院,云南 昆明 650500)

摘要 利用傅里叶变换红外(FTIR)光谱结合主成份分析(PCA)和系统聚类分析(HCA)技术对不同品种辣椒进行鉴别研究。测试了 5 种辣椒共 50 个样品的红外光谱,结果表明,5 个不同品种辣椒的红外光谱相似,但在 1800~800 cm<sup>-1</sup>范围内红外光谱的峰位、峰形及吸收强度有一些微小差异。对原始光谱作二阶导数处理,发现在该范围内 5 种辣椒的二阶导数光谱差异明显,利用该范围二阶导数光谱数据对 5 个品种 50 个样品进行聚类和主成分分析。聚类分析正确率为 100%,主成分分析正确率达 98%,能把 5 个品种的辣椒分开。研究结果表明:傅里叶变换红外光谱技术结合统计分析的方法可以把不同品种的辣椒区分开。

关键词 光谱学;傅里叶变换红外光谱;主成分分析;聚类分析;辣椒

中**图**分类号 O657.3

文献标识码 A

doi: 10.3788/CJL201441.s115001

#### 1 Introduction

Capsicum frutescens L. include chili and pepper, also called chilly, hot pepper, which is a kind of plants belonging to the genus solanaceae chili. Capsicum frutescens L. came from Mexico, and the Ming dynasty introduced into China. Capsicum frutescens L. is one year or perennial herbaceous plants. The fruits are usually oblong, green when immature, mature into bright red and yellow, but red being the most common. Capsicum frutescens L. is piquancy because the fruit

peel containing capsaicinoid. Vitamin C content in chili ranks first in the vegetables. The main bio-active components of capsicum frutescens L., range from protein, fat, carbohydrate, calcium, phosphorus, iron, carotene, vitamin C, thiamine, riboflavin, nicotinic acid, malic acid, citric acid and capsicum red pigment, etc. Capsicum frutescens L. has strong bioactivity such as antitumor, modulating immunity, protecting liver and so forth<sup>[1-2]</sup>. Capsicum frutescens L. is highly regarded in medicinal value, it is believed to promote

收稿日期: 2013-10-20; 收到修改稿日期: 2013-11-03

基金项目: 国家自然科学基金(30960179)

作者简介: 李伟星(1987一),男,硕士研究生,主要从事红外光谱方面的研究。E-mail: weixl87@126.com

导师简介: 刘 刚(1966一),男,博士,教授,主要从事生物光谱学和生物医学光子学等方面的研究。

E-mail: gliu66@163.com (通信联系人)

health and reduce the risk of cancer and heart disease. Presently, many extract of capsicum frutescens L. products are widely used, such as paprika and capsaicinoid. Paprika is one of the most widely used food colourants for culinary and industrial purposes. Because of its high colouring capacity, and in some cases its peculiar pungency, paprika is used to modify the colour and flavour of soups, stews, sausage, cheese, snacks, salad dressing, sauces, pizza and confectionary products. Capsaicinoids have strong physiologicaland pharmacological properties, which may be used in treating sensory nerve fibre disorders, including arthritis, cystitis, and human immunodeficiency virus among others. It is widely used in medicine, light industry and food. Therefore, the identification and classification of capsicum frutescens L. are the basis of the development and utilization of hot pepper resources.

There are many different kinds of Capsicum frutescens L.. It is difficult to distinguish them because they have little differences in appearance obviously. Conventional chemical analysis method include high performance liquid chromatography (HPTLC), gas chromatography mass spectrometry (GC-MS), microsatellite marker, supercritical CO<sub>2</sub> extraction method, etc. But it always takes long time, high investment, cause some damages and also need specialist to do it. Infrared (IR) spectroscopy techniques, such as mid-infrared quick spectroscopy, offer a analysis, nondestructive and low cost method for analysis<sup>[3]</sup>. Such as identification of goat's milk<sup>[4]</sup>, edible oil<sup>[5]</sup>, ganoderma lucidum<sup>[6]</sup>, etc. There are less studies reported in the literature using infrared spectroscopy to analysis capsicum frutescens L.. In this paper, Fourier transform infrared spectroscopy (FTIR) combined with hierarchical cluster analysis (HCA) and principal component analysis (PCA) is used to study the capsicum frutescens L., which provides a quick and accurate vibration spectrum identification method for different varieties of capsicum frutescens L..

### 2 Materials and Methods

### 2.1 Equipment

The IR spectra are detected on a FTIR spectrometer (PerkinElmer, UK), equipped with a DTGS detector in the region of  $400\sim4000~\text{cm}^{-1}$  at a resolution of 4 cm<sup>-1</sup>. Each spectrum is acquired by adding 16 scans together.

# 2.2 Samples preparation and spectral data preprocessing

Five different varieties of capsicum frutescens L.

(capsicum frutescens var., capsicum annuum L. var. longum Sendt, line pepper, goat horn pepper, screw pepper) are collected from Hunan Academy of Agricultural Science and dried for measuring spectra. The dried samples are mixed with KBr powder and pressed into discs, and then examined by FTIR. The FTIR spetra of 50 samples are collected. Reference spectra are acquired by collecting a spectrum of pure KBr disc. These spectra are subtracted from reference spectrum of KBr. Spectral processing software (OMNIC 8.0) is used for preprocessing, which has been used for baseline correction, normalization and smoothing infrared spectrum preprocessing. To increase the resolution of obtained spectra, second derivatives (Savitzky-Golay algorithm, 7-point smoothing) are calculated. The statistical software (SPSS19.0) is used for HCA and PCA.

### 3 Results and Analysis

## 3.1 Spectral characteristics of capsicum frutescens L.

Fig. 1 shows the infrared spectra of capsicum frutescens var., capsicum annuum L. var. longum Sendt, line pepper, goat horn pepper and screw pepper. It can be seen that the main spectral peak of five different capsicum frutescens L. are similar. The strongest broad peak at about 3400 cm<sup>-1</sup> is attributed to O-H stretching and contribution of N-H stretching; vibration 2925 cm<sup>-1</sup> is mainly assigned to CH<sub>2</sub> antisymmetric stretching vibration<sup>[4,7]</sup>; 2857 cm<sup>-1</sup> is mainly assigned to  $CH_2$ symmetric stretching vibration<sup>[7]</sup>; near 1735 cm<sup>-1</sup> come mainly from lipid absorption peak of C = O stretching vibration<sup>[8]</sup>; around  $1635 \text{ cm}^{-1}$  is C = C bond stretching vibration in capsaicinoid.

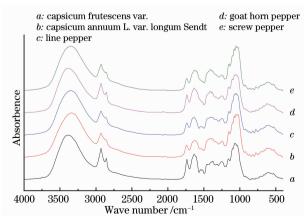


Fig. 1 FTIR spectra of different capsicum frutescens L.  $1655~{\rm cm}^{-1}$  is assigned to amide band I and  $1541~{\rm cm}^{-1}$  is assigned to amide band II  $^{[8]}$ . The bands at  $1610~{\rm cm}^{-1}$  and  $1516~{\rm cm}^{-1}$  are benzene ring skeleton stretching

vibrations<sup>[10]</sup>. The range of  $1440 \sim 1330~\text{cm}^{-1}$  mainly comes from  $CH_3$  and  $CH_2$  symmetric bending vibration absorption in protein, cellulose and lignin affected by oxygen, nitrogen atom<sup>[7,11]</sup>. Around 1386 cm<sup>-1</sup> are methyl, methylene and methyl symmetric bending vibrations in protein and cellulose<sup>[12]</sup>. The range of  $1156 \sim 950~\text{cm}^{-1}$  are C-O and C-C stretching vibrations of carbohydrate<sup>[7,13]</sup>. The range of  $900 \sim 750~\text{cm}^{-1}$  is carbohydrate isomers absorption area, around  $895~\text{cm}^{-1}$  C-H is the fiber ring vibration deformation peak<sup>[14]</sup>.

### 3.2 Analysis of second derivative spectroscopy

The spectra of the samples are similar, only with minor differences in absorption intensity of several peaks. Second derivative spectra of FTIR can obviously enhance the spectral resolution and amplify small differences. The second derivative spectra of the samples are shown in Fig. 2. The band at 1635 cm<sup>-1</sup> in the capsicum frutescens var., capsicum annuum L. var. longum Sendt and goat horn pepper is visible but weak in other spectra. The band at 1034 cm<sup>-1</sup> is very obvious in the capsicum frutescens var., capsicum annuum L. var. longum Sendt and screw pepper but does not appear in line pepper and almost can't be seen in goat horn pepper.

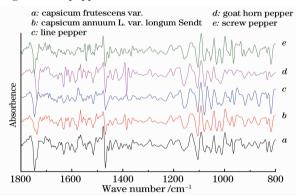


Fig. 2 Second derivative FTIR spectra (1800 $\sim$ 800 cm $^{-1}$ ) of different capsicum frutescens L.

### 3.3 Hierarchical cluster analysis

Clustering analysis is based on the study of characteristics of object according to certain standards, an analysis method of classifying the research objects, it makes the data objects in the group with the highest similarity, which has great differences between groups. Clustering analysis is performed using Pearson's product moment correlation coefficient as a measure of similarity between the spectra, and Ward's algorithm to draw the dendrogram. The squared Euclidean distance calculation method is used for clustering analysis on second derivative spectrum in the range of  $1800 \sim 800 \ cm^{-1}$ .

The HCA diagram of the samples are shown in Fig. 3.

Each of the capsicum frutescens L. genera examined in the study formes a separate group. The shortest distances between spectra of capsicum frutescens L. of a given genus are recorded within capsicum pepper and screw pepper, which indicate their highest similarity. All the samples are separated, and the clustering accuracy rate of 50 samples reach  $100\,\%$ .

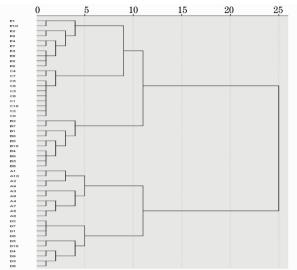


Fig. 3 HCA diagram with second derivative infrared spectra of five species of capsicum frutescens L.  $(1800 \sim 800~\text{cm}^{-1},~A;~\text{capsicum frutescens var.},~B;~\text{capsicum annuum L. var. longum Sendt,} C;~\text{line pepper},~D;~\text{goat horn pepper},~E;~\text{screw pepper})$ 

### 3.4 Principal component analysis

PCA is an unsupervised pattern recognition and it is often the first step of exploratory data analysis to detect groups in the measured data. PCA models the directions of maximum variations in a data set by projecting as a swarm of points in a space defined by principal components (PCs). PCs describe, in decreasing order, the higher variations among the objects, and because they are calculated to be orthogonal to another one, each PC can be interpreted independently.

The second derivative spectrum in the range of  $1800 \sim 700~\rm cm^{-1}$  are selected for principal component analysis. The contribution rate of the frist principal component (PC1) is 84.67%, while that of PC2 is 6.34% and PC3 is 3.45%, the totally contribution rate of these three principal component reaches 96.46%. Therefore, these three principal components could be selected for identification on samples, and the results are shown in Fig. 4.50 capsicum frutescens L. samples are divided into five areas, only one sample is error classified. However, all the samples can be divided into five groups using PC1, PC2 and PC3 with the accuracy of 98%. It demonstrates that the first three principal components have a good clustering effect to five kinds of capsicum



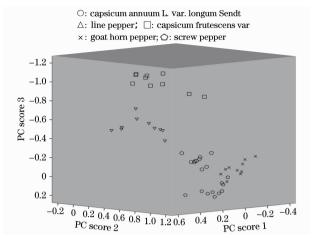


Fig. 4 PCA score plots of five capsicum frutescens L. on the second derivative spectra in the range of 1800~800 cm<sup>-1</sup>

### 4 Conclusion

FTIR combined with HCA and PCA is used to study five species of capsicum frutescens L. PCA and HCA are performed on the second derivative infrared spectra in the range of  $1800\!\sim\!800~\text{cm}^{-1}$ . The clustering accuracy rate of samples is  $100\,\%$  and the principal component analysis accuracy rate of samples is  $98\,\%$ . The results show that FTIR may be used to identify capsicum frutescens L. as it is rapid, nondestructive, convenient and accurate.

### References

- 1 Hua Jingqing, Cai Jian. The medicinal value of pepper[J]. Food and Nutrition in China, 2004, (12): 52-53.
  - 华景清,蔡 健. 辣椒的药用价值[J]. 中国食物与营养, 2004, (12): 52-53.
- 2 Jiang Mudong, Wang Siming. Pepper spread and influence in China[J]. Agricultural History of China, 2005, 24(2): 17-27. 蒋慕东,王思明. 辣椒在中国的传播及其影响[J]. 中国农史, 2005, 24(2): 17-27.
- 3 Wu Y, Zheng Y, Li Q, et al.. Study on difference between epidermis, phloem and xylem of radix Ginseng with near-infrared and infrared spectroscopy coupled with principal component analysis[J]. Vib Spectrosc, 2011, 50(2): 201 206.

- 4 Yang H, Irudayaraj J, Paradkar M M. Discrimininant analysis of edible oils and fats by FTIR, FT-NIR and FT-Raman spectroscopy [J]. Food Chem, 2005, 93(1); 25 32.
- 5 Karoui R, Hammami M, Rouissi H, *et al.*. Mid infrared and fluorescence spectroscopies coupled with factorial discriminant analysis technique to identify sheep milk from different feeding systems[J]. Food Chem, 2011, 127(2): 743 748.
- 6 Choong Y W, Sun S Q, Zhou Q, et al.. Determination od storage stability of the crude extracts of Ganoderma lucidum using FTIR and 2D-IR spectroscopy[J]. Vib Spectrosc, 2011, 57(1): 87 96
- 7 Popescu C M, Popescu M C, Singurel G, *et al.*. Spectral characterization of eucalyptus wood [J]. Applied Spectroscopy, 2007, 67(11):1168-1177.
- 8 Burattini E, Cavagna M, Monti F, *et al.*. A FTIR microspectroscopy study of autolysis in cells of the wine yeast Saccharomyces cerevisiae[J]. Vib Spectrosc, 2008, 47(2): 139 147.
- 9 Lu X, Webb M A H, Talbott M J, et al.. A study of biochemical parameters associated with ovarian atresia and quality of caviar in farmed white sturgeon by Fourier transform infrared (FTIR) spectroscopy [J]. Aquaculture, 2011, 315(3): 298 305.
- 10 Zhang Weiwei, Liu Lingling, Sun Sunqin, et al.. Rapid determination of sudan dyes adulterated in natural paprika red by FTIR[J]. Spectroscopy and Spectral Analysis, 2012, 32(4): 958-961. 张玮玮,刘玲玲,孙素琴,等. 食用天然辣椒红色素中掺杂苏丹
  - 张玮玮, 刈玲玲, 孙系夸, 等。 食用大然辣椒红巴素甲掺杂办丹红的红外光谱快速识别[J]. 光谱学与光谱分析,2012,32(4):958-961.
- 11 Li Zhiyong, Liu Gang, Li Lun, *et al.*. FTIR spectroscopic study of broad bean diseased leaves [J]. Spectroscopy and Spectral Analysis, 2012, 32(5); 1217 1220.
  李志永,刘 刚,李 伦,等. 蚕豆病害叶的 FTIR 研究[J]. 光
- 谱学与光谱分析, 2012, 32(5): 1217-1220. 12 Gorgulu S T, Dogan M, Severcan F. The characterization and
- differentiation of higher plants bu Fourier transform infrared spectroscopy[J]. Applied Spectroscopy, 2007, 61(3): 300 308.
- 13 Kang Yuqiu, Guo Qingmei, Zhao Qitao, et al.. Analysis of different parts of salvia miltiorrhiza bge by Fourier transform infrared spectroscopy[J]. The J Light Scattering, 2011, 23(4): 387-395.
  - 康玉秋,郭庆梅,赵启韬,等. 红外光谱法对贮藏白花丹参各部位的分析与评价[J].光散射学报,2011,23(4):387-395.
- 14 Dighton J, Mascarenhas M, Arbuckle-keil G A. Changing resources: assessment of leaf litter carbohydrate resource at a microbial scale of resolution [J]. Soil Biol Biochem, 2001, 33(10): 1429-1432.

栏目编辑: 史 敏