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# Extracting winter wheat planting area based on cropping system with remote sensing

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**Abstract:** Winter wheat is one kind of important crop in China. It's planting area is one key element to explain yield change. To obtain winter wheat planting area as soon as possible can provide scientific reference for our country's making related policy. Basing on the cropping system in Shandong province, winter wheat is divided into two kinds "winter wheat sowed by machine-maize" and "people broadcast winter wheat-rice". Using MODIS data, NDVI characters of winter wheat, garlic, greenhouse vegetable, from sowing till overwintering stage were analyzed. Together with NDVI characters of former stubble crops in middle September, extracting requirements were set up for winter wheat planting area which was sowed by machine this year. In view of the spectrum similarity between rice wheat and greenhouse vegetable from sowing stage till overwintering stage, rice wheat planting area of former year was extracted relying on the character of biomass rapid growth at jointing stage. Because of the "people broadcast winter wheat-rice" cropping system is very fixed in Shandong province, then the rice wheat planting area of former year can take the place of the rice wheat planting area this year. Two kinds of winter wheat area were merged, and tested by 284 groups of located spots data, the accuracy reached 94.01%. The result showed that it is feasible to extract winter wheat area before overwintering stage, and the time is 4 months earlier than using jointing stage NDVI.

**Key words:** Shandong province; winter wheat; rice wheat; area; remote sensing

## 1 Introduction

Shandong Province located in the Huang-Huai Plain is the major winter wheat producing area in China. It is important to grasp winter wheat area timely and accurately for the country's food security. In the past, winter wheat area mainly relied on primary agricultural production sectors' artificial survey and then statistics level by level. Limited resources and subjectivity led to poor data, which brought some impact to government's decision on agriculture production. With the development of science and technology, In 1980s, remote sensing had

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become one tool of agriculture resource investigating and crop growth monitoring with characters of obtaining data objectively, accurately and timely [1]. The key to extract winter wheat area is the data resource and the choice of phase. In 1990s, using NOAA satellite data, Maoxin Wang set up regression equation of winter wheat area and the pixel number whose NDVI (Normal Differential Vegetation Index) difference between November and October was greater than zero [2]. A large population but less land area, complex cropping system and NOAA satellite data's lower spatial resolution resulted that the extracting accuracy of winter wheat was not high. In the 21st century, with the food strategy advancement, some regions extracted winter wheat area with TM and spot data [3, 4] which holds higher spatial resolution than NOAA data. Extracting methods included visual interpretation [5], supervised classification [6], unsupervised classification [7, 8] and pure pixel identification based on spectral library [9]. Although resolution being enhanced and data processing technology being improved have made the accuracy reach over 90%, While TM data has lower time resolution and easily influenced by weather, what's more the cost is high, then TM data can only be used to invest winter wheat areas of small regions but not large areas.

Compared with NOAA data and TM data, MODIS data has higher time and middle spatial resolution. The data sharing service has made MODIS data be used to remote sensing monitoring winter wheat more and more [10-13]. Yigang Jing set models and extracted winter wheat area with accuracy of over 91% using the NDVI changes of March, May and June [14]. Jinqiu Zou extracted area using the EVI (Enhanced Vegetation Index) difference between May and October, and the error rate was -0.04% [15]. Wenpeng Lin used NIR, RED, BLUE and ESWIR 4 bands MODIS data of October and December to class 6 kinds of surface features with the method of fuzzy ARTMAP, and the accuracy reached 80.3% [16]. The main method of comparing spectral changes in the key growth periods after sowing for extracting winter wheat area was used frequently using MODIS data [17]. Over time, the amount of information increased, and the accuracy enhanced [18-20]. The paper studied one method with high accuracy to extract winter wheat area at early periods, combining with the former stubble crops based on cropping system in Shandong province.

## **2 Data acquisition**

Winter wheat is sowed in middle to late October in Shandong province, and tillers in early to middle December. In middle to late October, most vegetables in greenhouse are transplanted, and grow fast after rejuvenation in December, and the change of NDVI is similar with that of winter wheat, which influences the extracting accuracy of winter wheat area [16]. Shandong province is also the major producing area of garlic. It is sowed in late September to early October, the growing condition is very similar to winter wheat in winter, and thus it is another important obstacle.

In order to exclude the interferences of greenhouse and garlic, discussion group located 284 spots of six kinds of surface features which included winter wheat, greenhouse vegetable, garlic, village, uncovered cotton field, tree, in Shandong province, in late October, 2008. Downloaded MOD09Q1 data of the 284 spots of middle January, middle April, middle September, middle October and middle December, from MODIS data sharing platform-<ftp://e4ftl01u.ecs.nasa.gov/>.

### 3 Data analysis

#### 3.1 This part analyzed surface features' NDVI sequence, and set up identification conditions to extract winter wheat area preliminarily.

We calculated the located spots' NDVI and the average of middle September, middle October and middle December for six kinds of surface features separately, and then drew line chart (fig. 1). The NDVI of cotton filed dropped as the season went on, and it was similar to village and tree. Among the three periods, the NDVI in September was the highest for winter wheat, greenhouse vegetable and garlic, at that time, winter wheat filed and garlic filed are all planted maize, and greenhouse is still planted vegetable. The gain period of garlic is in late May, which is earlier than winter wheat. After garlic the filed is planted with early mature maize, and the maize is gained in middle to late September. While winter wheat is gained in middle June, then the filed is planted with maize. Winter wheat field's maize is at filling period, so the NDVI average 0.71 in middle September is higher than that of garlic filed. Till middle October, maize is gained, and winter wheat is sowed. Garlic is sowed in late September to early October, and the time of emergence is earlier than winter wheat. Greenhouse vegetable is transplanted, and grows faster than winter wheat and garlic with good conditions. Thus greenhouse vegetable's NDVI is higher than garlic field's, and garlic field's NDVI is higher than winter wheat field's. In middle December, winter wheat steps into tillering stage, and reaches growing peak before winter. Garlic's biomass and greenhouse vegetable's biomass all continues to increase. So in middle December, the three kinds surface features' NDVI are all higher than that in middle October, but lower than in middle September. According to the analysis above all, preliminary identification conditions were set up to extract winter wheat area:  $NDVI_{\text{middle September}} > NDVI_{\text{middle December}} > NDVI_{\text{middle October}}$ , and  $NDVI_{\text{middle September}} > 0.5$ .

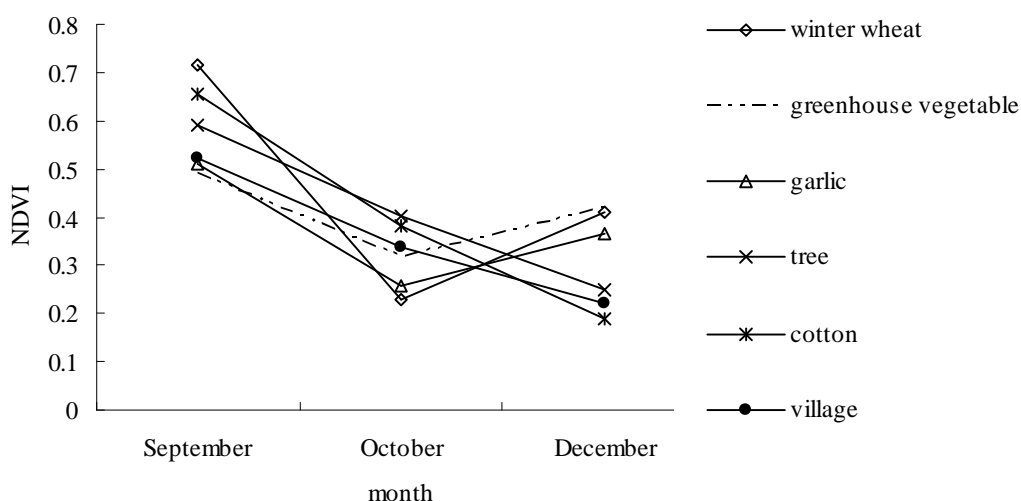


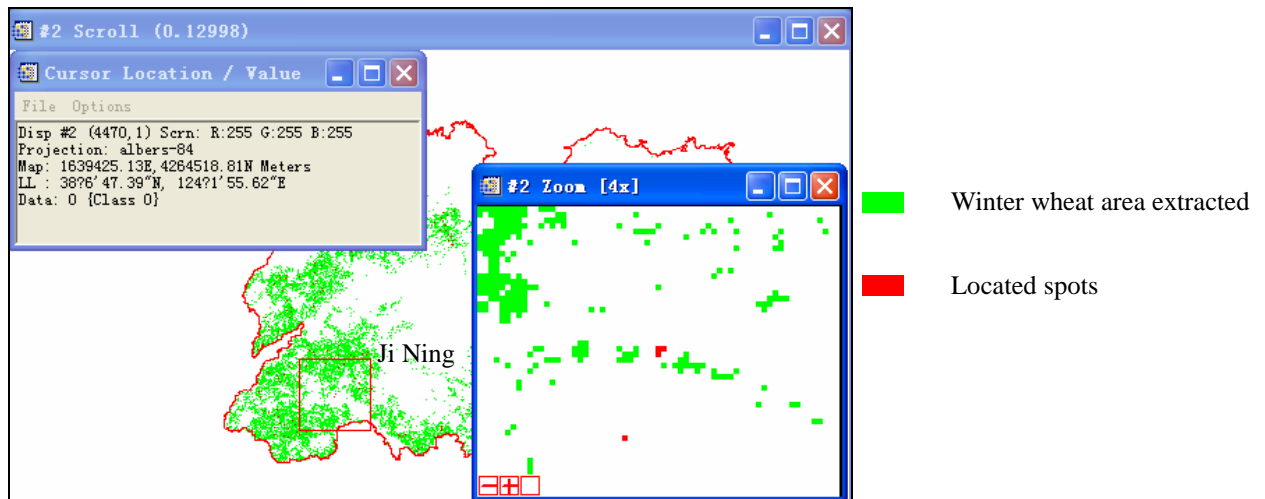
Fig. 1 NDVI line chart of 6 kinds of surface features in the three periods

#### 3.2 Test on identification result

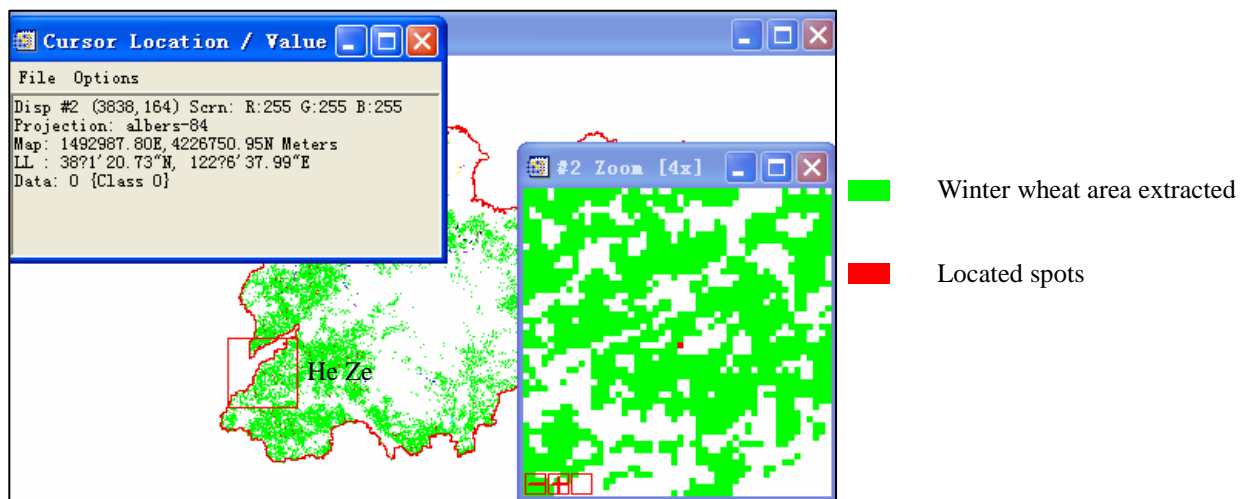
Used the identification conditions to extract winter wheat area, and tested the result with 284 groups of located spots' data (table 1).

**Table 1.** The test results checklist

Surface features	The number of spots to be tested	The number of spots tested to be Winter Wheat	The number of spots tested to be others	Wrong test reasons
winter wheat	161	138	23	7 mixed pixels 16 rice wheat
cotton	24	0	24	—
greenhouse	31	3	28	mixed pixels
vegetable	11	3	8	mixed pixels
garlic	26	1	25	mixed pixel
village	31	3	28	mixed pixels



**Fig. 2** Spots of rice wheat tested to be others



**Fig. 3** Mixed pixel of winter wheat tested to be others

The result was listed in table 1. Among 284 located spots, 23 winter wheat spots were identified to be other surface features. 10 other surface features spots were identified to be winter wheat, which included 3 greenhouse vegetable spots, 3 garlic spots, 1 tree spot and 3 village spots. Imported the 284 groups of located spots into ENVI, and inspected one by one, then discovered that the wrong identifications can be divided into two kinds of situations: one was located spots were mixed pixels of winter wheat with greenhouse vegetable, garlic, tree or village (fig. 2); the other was rice wheat spots were identified to be other surface features (fig. 3). A large population but less land area and complex cropping system in Shandong province make the phenomenon of mixed pixels inevitable. Rice wheat was not identified, showed the identification conditions didn't contain rice wheat information. Only extracted "winter wheat sowed by machine-maize" area, so the main task remained was to extract "people broadcast winter wheat-rice" area.

### 3.3 The extraction of rice wheat area

Calculated 16 rice wheat spots' average NDVI of the 3 periods, compared with common winter wheat. As fig.4, fig5 showed, in September, rice is growing in rice wheat field, and maize is growing in winter wheat field, and the NDVI of rice is lower than that of maize. In middle October rice is gained, and rice wheat is at trefoil stage which was broadcasted not long ago, whose NDVI is higher than normal wheat. What's more rice wheat field has adequate water supply, so rice wheat growing condition is better than normal winter wheat till middle December. During the analyzing progress, narrowing NDVI threshold of the 3 periods was tried to extract rice wheat area, but failed for the NDVI similarity between rice wheat and greenhouse vegetable.

Winter wheat goes into overwintering stage In January, and jointing stage in April, growing condition is influenced by air temperature; rice wheat and normal winter wheat are similar to each other. So it is possible to extract all winter wheat area depending on NDVI fast increasing over the period from middle January to middle April, that is to say, from overwintering stage to jointing stag. This method is popular now.

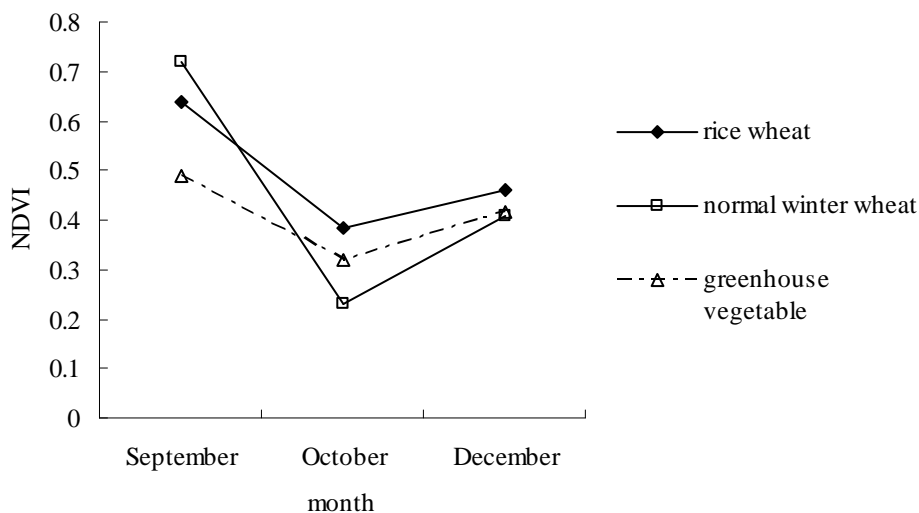
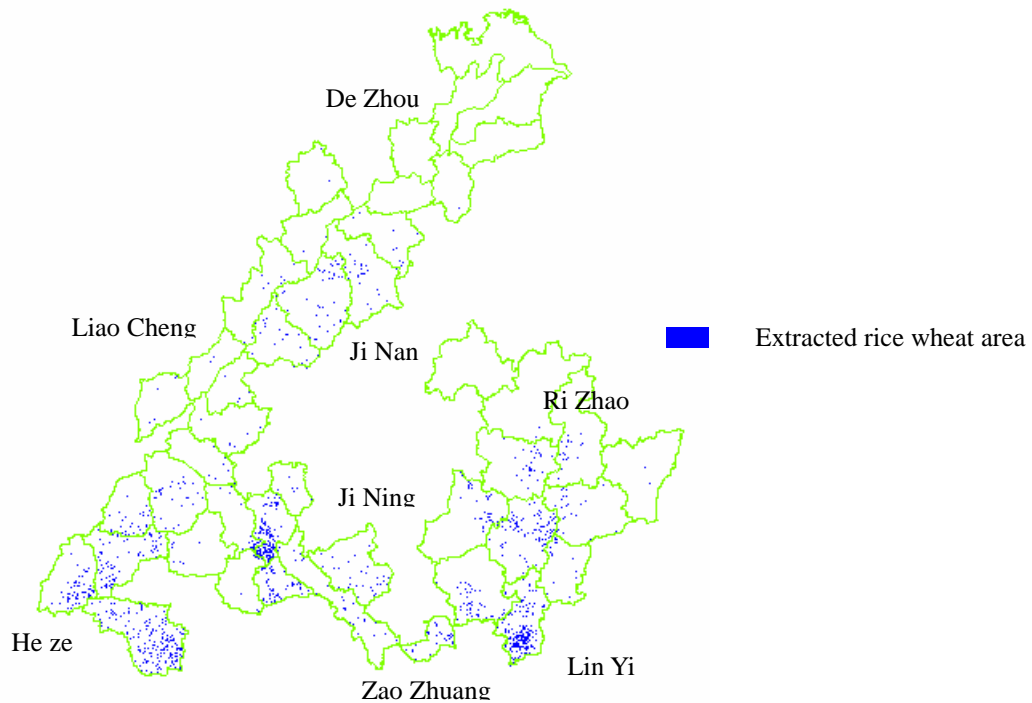


Fig. 4 NDVI line chart of rice wheat, normal winter wheat, greenhouse vegetable in the three periods



**Fig. 5** Winter wheat sowed by machine and people broadcast winter rice wheat in middle to late October

Affected by geographical environment and climate, “people broadcast winter wheat-rice” is one common cropping system in Yellow River Basin and the Southern Four Lakes rim, so the rice wheat field is relatively fixed. According to Statistical Yearbook, vector graph of rice planting region was set up in Shandong province with the help of ARCVIEW. The normal winter wheat area which has been extracted with data of middle September, middle October, middle December was named S1. The rice wheat area extracting conditions were set up,  $(NDVI \text{ middle April} - NDVI \text{ middle January}) > 0.19$ ,  $NDVI \text{ middle January} > 0.3$ , and  $NDVI \text{ middle September} > 0.5$ , using the data of 2008. In ENVI, S1 was masked, and among rice wheat field vector region, rice wheat area was extracted of 2007-2008, which were named S2 (fig. 6). The 16 rice wheat located spots were all extracted successfully.



**Fig. 6** The extracted area of rice wheat of 2007-2008

### 3.4 The extraction of all winter wheat

The two parts S1 and S2 of winter wheat were merged, which contained the normal winter wheat area extracted with the data of September, October, and December, 2008, and the rice wheat area extracted with the data of January, April, and September, 2008. The total winter wheat area of 2008-2009 was 4480666.67 hm<sup>2</sup>, tested by the located spots' data the accuracy was 94.01% (fig. 7).

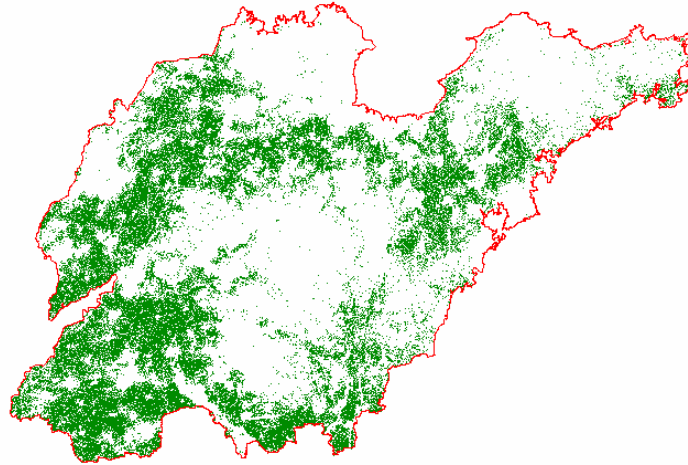


Fig. 7 The extracted area of winter wheat of Shandong province of 2008-2009

## 4 Result and discussion

Winter wheat in Shandong province can be divided into two kinds from a cropping system point of view, “mechanical sowing winter wheat-maize” and “people broadcast winter wheat-rice”. The paper studied NDVI characters of winter wheat, garlic and greenhouse vegetable from seeding time October to overwintering stage December. The study showed that 3 kinds of surface features' NDVI changing tendencies are similar to each other, and it is difficult to extract winter wheat area. Together with the difference of the previous crop's NDVI, the normal winter wheat of “mechanical sowing winter wheat-maize” was extracted. But the rice wheat NDVI of “people broadcast winter wheat-rice” is similar to greenhouse vegetable NDVI, so it is impossible to extract rice wheat area just depending on the change of NDVI. Based on the special growing environment of rice wheat, rice plant region vector in Shandong province was set up. Among this region, rice wheat area of the previous year was extracted using the fast NDVI increase at jointing stage than overwintering stage. The two parts winter wheat area were added up, and got the total area in late December.

This study used middle spatial resolution and high time resolution MODIS data to settle the interference of garlic and greenhouse vegetable to winter wheat area extracting in Shandong province. The extracting time was 4 months in advance than using jointing stage NDVI character [21,22], and the accuracy reached 94.01%, so the method can meet the demand of large area.

Natural environment decides cropping system, while the improvement of agricultural production technology, and many other economical factors' all influence the reform of cropping system. So using the previous year rice wheat area to take the place of the current year will affect the accuracy of total winter wheat area. In future research, rice field's spectrum should be studied, and assisted with NDVI change character of rice wheat from



seeding to overwintering stage to extract rice wheat area, in order to enhance the total winter wheat area extraction accuracy.

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