# Integration of GIS and Remote Sensing for Evaluating Forest Canopy Density Index in Thai Nguyen Province, Vietnam

Duong Thi Loi, Tien-Yin Chou, and Yao-Min Fang

Abstract—Forests are an indispensable part of the natural environment and play a critical role in sustainable development. However, natural forests are being destroyed every year by human activities. Hence, forest management plays a critical role in the sustainable development. Forest canopy density (FCD) is a useful model to evaluate the forest status and changes in a certain period. The advanced vegetation (AVI), bare soil (BI) and canopy shadow (SI) are selected as parameters to study FCD. These parameters are figured out from satellite images. Landsat 8 OLI image - 2015 is first normalized and then manipulated in ENVI and ArcGIS software to calculate the FCD. The overall accuracy of classification result in comparison with the land cover map is 85.3%. The final result shows the distribution of forest canopy density in the study area, consists of dense forest density, moderate forest density, low forest density and non-forest.

*Index Terms*—Forest canopy density, advanced vegetation, bare soil, remote sensing.

# I. INTRODUCTION

Forest canopy cover, also known as canopy coverage or crown cover, is defined as the proportion of the forest floor covered by the vertical projection of the tree crowns [1]. Mountains and hills, which occupy three-quarters of Vietnam's territory, are the main landscape in Vietnam. Hence, Vietnam has a diverse forest ecosystem. However, the forest has being decreased in both quantity and quality over the years. The forest management becomes an urgent task to maintain and protect the forest ecosystem. Monitoring of forest canopy cover is an essential tool for sustainable management of natural resources [2]. Forest canopy density (FCD) is one of the most useful indices to consider in the planning and implementation of the rehabilitation program [3], [4], and is a major factor in the evaluation of forest status and management interventions [5]. Forest canopy density mapping is one of the most useful parameter to consider in the planning and implementation of afforestation and reforestation programs [6].

Satellite Remote Sensing is used more and more in research. Using the multi-temporal satellite images help to generate the information about land use/land cover. Forest land cover information is often derived from remotely sensed

images using classification algorithms [7]. In this study, FCD model is synthesized by the three parameters, including advanced vegetation index (AVI), bare soil index (BSI) and canopy shadow index (SI) [8]. Landsat image is processed in ENVI and ArcGIS software to determine the distribution of FCD in the study area. The aim of this study is to explore the ability of satellite image in assessing the FCD to serve resource management.

#### II. STUDY AREA

Thai Nguyen is a province located in the Northeast region of Vietnam. The geographical coordinate stretches across from 20°20' to 22°25'North and 105°25' to 106°16' East. Thai Nguyen shares its border with six provinces including Bac Can, Vinh Phuc, Tuyen Quang, Lang Son, Bac Giang and Hanoi. Thai Nguyen has many mountain ranges running from the north to the south. The study area is covered in 3541.5 sq.km. Administratively, Thai Nguyen province includes two cities (Thai Nguyen and Song Cong), one town (Pho Yen) and six districts (Dai Tu, Dinh Hoa, Dong Hy, Phu Binh, Phu Luong and Vo Nhai) (Fig. 1). Thai Nguyen is considered as the gateway for socio-economic exchange between the Northeast Area and the Red River Delta.

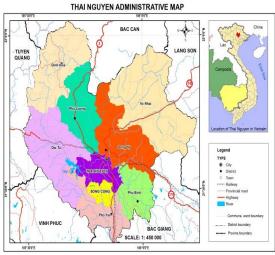


Fig. 1. Thai Nguyen administrative map.

# III. DATA USED

Satellite Image – Landsat 8 (OLI) taken in October 2016 provided by USGS was used in this study. Its size is 16-bit data and consists of nice spectral bands with a spatial resolution of 30 meters and one panchromatic band with a higher spatial resolution of 15 meters.

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#### IV. METHODOLOGY

The following steps are used to calculate FCD (Fig. 2)

## A. Conversion to TOA Radiance

Landsat 8 used in this study consists of quantized and calibrated scaled Digital Numbers (DN). It is 16-bit unsigned integer format with range value from 0 to  $2^8 = 65536$  [9]. It needs to convert into radiance value to calculate the vegetation indices. This process has been done by using equation (1).

$$L_{\lambda} = M_{L}Q_{cal} + A_{L} \tag{1}$$

where,  $L_{\lambda}$  = TOA spectral radiance (Watts/( m2 \* srad \*

μm)).

 $M_{L}=\mbox{Band-specific multiplicative rescaling factor from the metadata.}$ 

 $A_{\text{L}} = \text{Band-specific}$  additive rescaling factor from the metadata.

 $Q_{\text{cal}} = Q_{\text{uantized}}$  and calibrated standard product pixel values (DN).

# B. Calculation of Forest Canopy Density Index

Three parameters utilized to calculate the Forest Canopy Density Index (FDI) includes Advanced Vegetation Index (AVI), Bare Soil Index (BI) and Shadow Index (SI) or Scaled Shadow Index (SSI). Forest Canopy Density value was calculated in percentage of each pixel by range from 0 to 100.

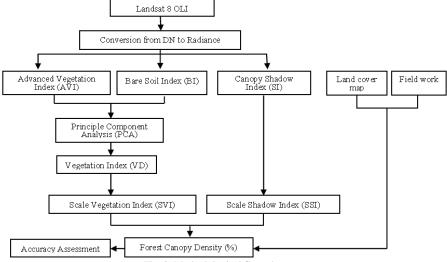


Fig. 2. Methodological flow chart.

# 1) Advanced vegetation index (AVI)

AVI is a one of the essential parameters to determine the healthy vegetation based on the red and near-infrared spectral band. It is similar to NDVI (Normalized Difference Vegetation Index) — the earliest and most widely used vegetation index in remote sensing [10]. However, NDVI is used popularly to classify the high and low vegetation area. It is not reasonable to highlight subtle differences in the canopy density. Therefore, AVI was selected in this study by using power degree of the infrared response. This index is calculated using equation (2). The result is shown in Fig. 3

$$AVI = \sqrt[3]{(B5+1)*(65536-B4)*(B5-B4)}$$
 (2)

where, B5 is near infrared band and B4 is red band.

## 2) Bare soil index (BI)

BI is combined from blue, red, near infrared and short wave infrared spectral bands to capture soil variations. The short ware infrared and the red band are used to quantify the soil mineral composition, while the blue and the near infrared spectral bands to enhance the presence of vegetation. This index is calculated using equation (3). The result is described in Fig. 4

BI = 
$$\frac{(B6+B4)-(B5+B2)}{(B6+B4)+(B5+B2)} * 100 + 100$$
 (3)

where, B2 is green band, B4 is red band, B5 is near infrared

band and B6 is shortwave infrared band.

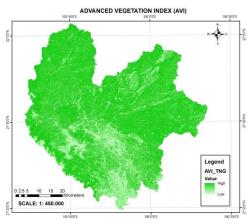


Fig. 3. Advanced vegetation index (AVI).

# 3) Vegetation density (VD)

VD is carried out by using principal component analysis based on two input parameters AVI and BI. The value of VD is ranged from 0 to 100 percent, and it is expressed in Fig. 5.

## 4) Scaled shadow index (SSI)

SSI is calculated from Canopy shadow index (SI) by using a linear transformation [11]. The value of SSI is also scaled from 0 to 100 percent. SSI by 100% responds with the highest possible shadow whereas 0% responds the opposite [12], [13]. SI is considered as the main application in forestry and crop

monitoring because the canopy shadow provides the important information about trees and plants arrangement. This index is often associated with AVI and BSI to understand to reflect the status of vegetation, and it is calculated using the visible bands of the spectrum as the equation (4). The result is shown in Fig. 6.

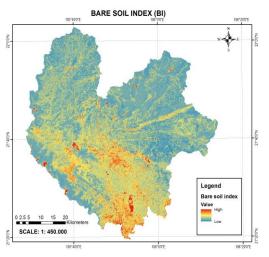


Fig. 4. Bare soil index (BI).

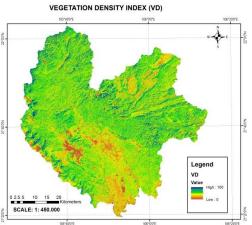


Fig. 5. Vegetation density index (VD).

$$SI = \sqrt[3]{((65536 - B2) \times (65536 - B3) \times (65536 - B4))}$$
 (4)

where, B2 is green band, B3 is blue band and B4 is red band.

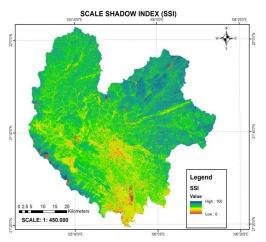


Fig. 6. Scale shadow index (SSI).

#### 5) Forest canopy density (FCD)

FCD is one of the indices to identify the forest quality. Integration of VD and SSI means transformation for forest canopy density value [14]. VD and SSI are combined to calculate FCD and carried out as equation (5). FCD with scale from 0 to 100 percent is described in Fig. 7.

FOREST CANOPY DENSITY INDEX (FCD) - SCALE 0-100

FOREST CANOPY DENSITY INDEX (FCD) - SCALE 0-100

$$0.25.5 ext{ 10} ext{ 15} ext{ 20} ext{ killometers}$$

SCALE: 1: 450.000

 $0.25.5 ext{ 10} ext{ 15} ext{ 20} ext{ killometers}$ 

Fig. 7. Forest canopy density (FCD), scale 0 - 100.

#### V. RESULT

Based on the percentage, the each cell was classified into four classes of forest canopy density: dense forest density, moderate forest density, low forest density and non-forest. Dense forest density responds with the area having the value from 85 to 100%. In the same manner, 50 - 85%, 15 - 50% and below 15% were given the moderate forest density, low forest density, and non-forest respectively (Fig. 8). The map described the distribution of forest resource in Thai Nguyen province through the FCD index. In which, the dense forest only occupied a small area along the west of study area. The majority of Thai Nguyen province is covered by moderate and low forest density. The fieldwork using land cover map was carried out to assess the accuracy of result study. The achieved result was Kappa Coefficient = 0.79, Overall Accuracy = 85.3% (Table I).

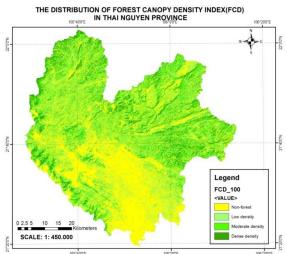


Fig. 8. Distribution of forest canopy density in Thai Nguyen province.

TABLE I: CLASS CONFUSION MATRIX

	Dense forest	Moderate forest	Low forest	Non-forest	Total	
Class 1	5251	302	15	33	5601	
Class 2	250	3246	190	3	3689	
Class 3	72	127	1000	806	2005	
Class 4	83	20	20	1663	1786	
Total	5656	3695	1225	2505	13081	

Kappa Coefficient = 0.79, Overall Accuracy = 85.3 %

#### VI. CONCLUSION

The management and protection of forest resources play an extremely important role for the study area. Using GIS and remote sensing data, the achieved results have high reliability. Based on the physical properties and spectral reflection of the objects on the surface, the remote sensing images can provide much useful information in research. Landsat 8 satellite data was used to estimate the dense forest variations in a large scale in this study. The forest canopy density map expressed the forest situation of Thai Nguyen province through the level of canopy density. However, this study can develop further by using many satellite images in the different period. This helps for assessing the changes of forest canopy density over time and space. This is one of the important criteria to evaluate the forest quality and contribute the information to forest management.

#### ACKNOWLEDGMENT

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