

#### Proceedings

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# Application of Tasseled Cap Transformation of Sentinel-2 -MSI Data for Forest Monitoring and Change Detection on territory of Natural Park "BLUE STONES" <sup>+</sup>

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Abstract: The goal of the present research is monitoring the forest vegetation's condition and detect 10 changes occurred in the territorial disturbance of the forest cover in the area of Natural Park "Blue 11 Stones", located in Bulgaria, by the use of combinative approach of Remote Sensing's methods. 12 Tasseled Cap Orthogonal Transformation is applied to the selected satellite images, resulting in 13 three segmented TCT components - "brightness", "greenness" and "wetness". On the basis of the 14 "greenness" component from different temporal points (satellite scenes), Normalized Differential 15 Greenness Index has been calculated which is giving an accurate and precise data on dynamics of 16 the forest vegetation for short-termed and long-termed time periods. 17

Keywords: forest monitoring; Sentinel-2; Tasseled Cap Transformation; greenness; NDGI;

## 1. Introduction

In the Balkans, in the Southeastern part of Bulgaria, above the town of Sliven, over 21 an area of 11380 ha is situated The Natural Park "Blue Stones" (Figure 1). The specific 22 climate and lay conditions of the park determines the great diversity of flora and fauna. 23 The territory of the park is covered with mono-dominant and mixed broadleaf forests 24 (9000 ha) and 600 ha are covered with conifers [1]. It was created in 1980 as a national 25 park to preserve and protect the forest formations of the species Fagus sylvatica ssp. 26 moesiaca and Fagus orientalis. Other forest formations in the park are presented by species 27 of: Qvercus sessiliflora, Carpinus betulus, Qvercus cerris, Qvercus conferta, Acer pseudoplata-28 nus, Carpinus orientalis, Tilia tomentosa [1]. 29

The **aim** of the following study is advantages of the proposed TCT model for segmenting Sentinel-2 imagery [2] to be used for needs of forest vegetation monitoring and the spatial disturbance's change detecting of forest cover. Short-termed and long-termed temporal periods when the forest vegetation's phenophase is most active (from April to August) were chosen as a different time frame suitable for application of NDGI and analyzing its quantitative values.

The Tasseled Cap Transformation (TCT) first developed by Kauth and Thomas was 36 initially applied as a data compression and visualization tool from the Landsat-1 Multi-37 spectral Scanner (MSS) to extract information about the features and characteristics of 38 agricultural lands [3]. Kauth and Thomas envisioned the creation of TCT by comparing 39 the phenological characteristics of vegetation from a given image with the overall struc-40 ture and shape of the reflectance data represented in multidimensional spectral space [3]. 41 The main advantage of TCT is its ability to visualize multi- and hyperspectral data from 42 satellite imagery in a condensed and meaningfully defined feature space [4]. TCT can 43

Citation: Lastname, F.; Lastname, F.; Lastname, F. Title. *Environ. Sci. Proc.* 2022, 4, x. https://doi.org/10.3390/ xxxxx

Academic Editor: Firstname Lastname

#### Published: date

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also be used as a vegetative index, which is an indicator for evaluating the "healthy" state 44 of vegetation and for evaluating changes that have occurred on the earth's surface [5, 6]. 45

#### 2. Materials and Methods



Figure 1. Study area map.

In the following research imagery data from mission Sentinel 2-MSI of the European Space Agency (ESA) is used [7]. Multi Spectral Instrument (MSI) register data in the optical bands with variable spatial and spectral resolution. For the MSI the 13 spectral bands span from the visible (VIS) and the near infra-red (NIR) electromagnetic spectrum regions to the short wave infra-red (SWIR) one (Table 1.).

Table 1. Satellite imagery used			
Satellite, sensor	Date of aquisition	Spectral band	GSD (m)
Sentinel 2-MSI	10.06.2017	All spectral chan- nels [7]	10x10 20x20
	24.08.2017		
	31.05.2018		
	19.08.2018		00x00
	25.04.2020		
	15.05.2020		
	28.08.2020		
	25.05.2021		
	08.08.2021		

The proposed Tasseled Cap Transformation model for orthogonalization of satellite 58 images from Sentinel-2 has been proven as a highly effective method for interpretation, 59 classification, and analysis of phenomena and processes related to the dynamic changes 60 of the main Earth Surface 's components: soil, vegetation and water [2,5]. The matrix of TCT 61 for Sentinel 2 was developed and created by Roumen Nedkov [2], and is extracting the 62 information contained in all 13 spectral channels of the MSI sensor resulting in three 63 clusters - "brightness", "greenness" and "wetness". 64

Normalized Differential Greenness Index (NDGI) (equation.1) is created on the basis 65 of greenness component derived through decomposing of optical satellite images by the 66 applied orthogonal TCT matrix [8]. "NDGI reflects the vegetation's dynamics change 67 depending on the temporal period. The index have ranging values from - 1 to + 1, which 68 are corresponding to vegetation's negative and positive changes that had been occurred 69 [8]. 70

$$NDGI = \frac{GR_n(t_2) - GR_n(t_1)}{|GR_n(t_2)| + |GR_n(t_1)|},$$
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where  $GR_n(t_1)$  and  $GR_n(t_2)$  represent the normalized values of the greenness compo-74 nent at time points t<sub>1</sub> and t<sub>2</sub>, and  $|GR_n(t_1)|$  and  $|GR_n(t_2)|$  represent the absolute values of 75 the same components [8]. 76

The most commonly used vegetation indices (e.g. NDVI) are not sufficiently sensi-77 tive to the minimal changes in the state of the vegetation that have occurred, which is 78most noticed in the studies on the restoration processes of forest ecosystems after a fire 79 [9]. The three differentiated classes obtained as a result of the applied orthogonalization 80 are highly sensitive to the minimal changes that occur in the requirements of the vegeta-81 tion. When NDGI values are less than 0, it indicates that negative changes in vegetation 82 condition have occurred. When they are above 0, there are positive changes, and the de-83 gree of changes corresponds to the obtained index values. Extreme values – NDGI = -184 reflect complete degradation of vegetation, while NDGI = +1 indicates intensive increase 85 in leaf biomass or growth of vegetation. This indicates that the positive and negative 86 values of the index represent a quantitative scale that can be used to assess the changes in 87 vegetation that have occurred [8]. 88

Based on the greenness component, of each selected time point, NDGI values were 89 generated for short-term periods: between the "spring" and "summer" images for each of 90 the years 2017, 2018, 2020 and 2021 including one super short-term period of 20 days 91 (25.04.20 -15.05.20) as a showcase "capturing" the leaf growth of forest vegetation in 92 areas around 600-700 m a.s.l., and for long-term periods: between the "spring" and be-93 tween the "summer" images for each of the years. 94

#### 3. Results and Discussion

On Figure 2. maps with the greenness component of spring and summer temporal 96 points, serving as input data for generating NDGI, are shown as a showcase for the years 97 2020 and 2021.



Figure 2. Maps of TCT - greenness component values from: (a) 25.04.2020; (b)15.05.2020; (c) 101 25.05.2021; (d) 08.08.2021.

On Figure 3. maps with the NDVI values of the same temporal points from Figure 2 are shown which served as a reference data for interpratation and as a base for comparative 104 analysis between the values of TCT-greenness component and those of NDVI. The 105 TCT-greenness values are showing a bit more detailed information about the territorial 106 distribution of vegetation compared to that of the NDVI values. 107





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#### 3.1. short-term temporal periods of NDGI

On Figure 4. Maps with the spatial distribution of the NDGI values for short-term tem-112 poral periods are shown. The values of NDGI represent the spectral reflectance charac-113 teristics (SRC) of the vegetation recorded by the sensor, indicating the maximum and 114 minimum changes that occurred. After a long comparative and visual analysis of the 115 histograms (including those in the visible spectrum) and using the borderline between 116 grassland and forests as a benchmark, an optimal threshold of 0.5 was set in order pixels 117 with values above it to correspond with the areas covered by forest vegetation. This was 118 also done for values of the TCT-greenness component. All pixels in green color (NDGI > 119 0.5) represent areas of the Earth's surface where positive changes in forest vegetation 120 status occurred during the period, the new vegetation that developed during the given 121 period (including vegetation on streams and river valleys, low bushes, etc.). Pixels in 122 yellow color (NDGI  $\ge 0 \le 0.5$ ) represent areas where minimal or no positive changes in 123 vegetation status occurred during the period. Pixels with red color (NDGI < 0) represent 124 areas of the earth's surface where negative changes in the state of vegetation have oc-125 curred (due to drought, logging, dried grass formations, etc.) or correspond to terrains 126 occupied by rock formations, where vegetation is absent. In the case of 20-days period 127 (Fig. 4c) saturation of the green color is due to the defoliation of the forests in the high al-128 titude areas occurred during the period. 129



 Figure 4. Maps with NDGI values for short-term periods: (a) 10.06.17 – 24.08.17; (b) 31.05.18 –
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 19.08.18; (c) 20-days period 25.04.20 – 15.05.20; (d) 15.05.20 – 28.08.20; (e) 25.05.21 – 08.08.21; (f) RGB
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 composite in band combination 8a/4/3 from 25.04.20.
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#### 3.2. long-term temporal periods of NDGI

The used approach for monitoring vegetation is more suitable for studies whose time 138 periods are short-term because it allows the tracking of vegetation dynamics in very 139 short time intervals. This approach can also be used to monitor the development of agricultural crops (with a shorter growing season), fires, droughts, soil moisture calculation, etc. [10, 11, 12]. However, the presented results on Figure 5 including one-year periods are showing what changes had been occurred in the current state of the vegetation 143 in comparison with that of the previous year. 144

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 Figure 5. Maps with NDGI values for long-term periods (a) 10.06.17 – 31.05.18; (b) 24.08.17–
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 19.08.18; (c) 15.05.20 – 25.05.21; (d) 28.08.20 – 08.08.21.
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On figure 6. Change detection map is shown the green pixels are showing the restoration 150 in the forest vegetation and in the forest road after a legal logging occurred in 2014 for 151 the period 2015-2021, and the denser red lines are new forest roads, the red spot below 152 the peak of Karaborun is a new logging site developed in 2020. 153



Figure 6. Map of change detection in forest vegetation for period of 2015-2021.

### 4. Conclusions

The applied methodology for forest monitoring can be used for accurately and precisely 157 determination of the spatial distribution and quantitative assessment of the forest cover 158 on the territory of the Natural Park "Blue Stones" for the selected temporal periods. The 159 use of matrix for Orthogonal transformation is another way of extracting and processing 160 the satellite imagery for the purpose of monitoring Earth surface's main components: 161 soil, vegetation and water. The setting of the threshold of the NDGI values for masking 162 out the forest vegetation and the interpretation and validation of the results are still in 163 experimenting level and in the future they will still undergo development. The proposed 164forest monitoring method can be integrated into forest management, forestry and forest 165 resource inventory. 166

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<b>Supplementary Materials:</b> The following supporting information can be downloaded at: www.mdpi.com/xxx/s1, Figure S1: title; Table S1: title; Video S1: title.	168 169		
Funding: This research received no external funding			
Institutional Review Board Statement: "Not applicable"			
Data Availability Statement: Not applicable	172		

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support, or donations in kind (e.g., materials used for experiments).

Conflicts of Interest: The author declare no conflict of interest

Acknowledgments: In this section, you can acknowledge any support given which is not covered

by the author contribution or funding sections. This may include administrative and technical

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