RESEARCH PAPER

# On-orbit demonstration of a linear variable band-pass filter-based miniaturized hyperspectral camera for CubeSats

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ABSTRACT. Hyperspectral cameras are useful Earth observation sensors with many practical applications in agriculture and forest remote sensing for detecting and classifying the state of objects. Recently, CubeSats satellites were launched into low Earth orbits. These satellites have certain advantages, such as low cost and short-term development, and their practical applications are continuously increasing. The installation of a hyperspectral camera on CubeSats would significantly increase their observation frequency. However, to fit on a CubeSat, observation instruments must be compact and weigh only a few hundred grams. To address this challenge, we developed a 35-g miniaturized hyperspectral camera by combining a linear variable band-pass filter and an image sensor. This innovative camera was installed on two CubeSats and launched into orbit in 2023 and 2024. The on-orbit experiments conducted using these CubeSats were successful, and valuable hyperspectral data were obtained.

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Keywords: hyperspectral camera; miniaturization; CubeSat; on-orbit experiment

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### 1 Introduction

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Hyperspectral cameras are useful Earth observation devices with many practical applications, including agriculture, forest, and ocean remote sensing; they are able to detect and classify the condition of targets by simultaneously acquiring images and spectral information.<sup>[1](#page-15-0)–[4](#page-15-0)</sup> Although there are examples and development plans for hyperspectral cameras used on large satellites $5-9$  $5-9$  $5-9$ and the International Space Station, $10$  their cases are limited, and their effectiveness has not been fully verified. Desirable characteristics of hyperspectral remote sensing include full Earth coverage and increased observation frequency. This is the case in agricultural remote sensing, for which regular and frequent observations are essential for efficient crop management. However, when only a single satellite is utilized, the observation frequency is low (approximately once every 2 weeks). A way to acquire more frequent observations would be to develop a CubeSat constellation equipped with hyperspectral cameras.

Generally, spaceborne hyperspectral cameras require large telescopes to gather sufficient light for spectroscopic observations. Recently, image sensors have become more sensitive, enabling hyperspectral remote sensing even with smaller telescopes. In addition, plans are being developed to construct micro- and nanosatellites equipped with hyperspectral cameras.<sup>[11](#page-15-0)–[14](#page-15-0)</sup>

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1U-CubeSat is a standardized cube-shaped satellite with dimensions of  $10 \times 10 \times 11$  cm, typically weighing less than 1.33 kg.<sup>[15](#page-15-0)–[17](#page-15-0)</sup> As the mass production and practical applications of CubeSats rapidly advance, the number of organizations launching and operating them worldwide is also increasing. Furthermore, the development of multi-mission CubeSats, which can accommodate multiple mission payloads for various purposes within a single satellite, is on the rise. Multi-mission CubeSats can be shared by multiple users, thereby reducing the development costs per organization and increasing the launch frequency and mass production.<sup>[18](#page-15-0)–[20](#page-15-0)</sup> The installation of a hyperspectral camera on a CubeSat would potentially enhance the frequency of observations. However, installing multiple instruments on a CubeSat requires each instrument to be light and compact (weighing only a few hundred grams). Examples of small-sized hyperspectral cameras include  $HYPSO-1<sup>21</sup>$  $HYPSO-1<sup>21</sup>$  $HYPSO-1<sup>21</sup>$  from the Norwegian University of Science and Technology and HyperScout- $1^{22}$  $1^{22}$  $1^{22}$  from Cosine Remote Sensing B.V. However, both cameras weigh more than 1.5 kg, which makes them difficult to install on multi-mission CubeSats. Recently, a method to miniaturize hyperspectral cameras using a linear variable band-pass filter (LVBPF) has been proposed.[23](#page-15-0)–[26](#page-15-0) Although no on-orbit demonstrations of an LVBPF-based hyperspectral camera exist, their incorporation on CubeSats holds great potential.

The spectral resolution of an LVBPF-based hyperspectral camera is limited by the bandwidth of the filter, F-number of the lens, and distance between the filter and focal plane, and the effective spectral resolution is further limited by the effects of spectral cross-talk between neighboring pixels.<sup>[24](#page-15-0)</sup> Therefore, it is considered difficult to improve spectral resolution using existing LVBPF. However, this technology realizes that, for significant miniaturization to install on a small platform such as a CubeSat, it is possible to easily measure the spectral characteristics of the ground surface and expand the range of uses for hyperspectral cameras. For example, a CubeSat equipped with an LVBPF-based hyperspectral camera is used to measure the rough spectral characteristics of the ground surface, detect any anomaly or feature based on acquired hyperspectral data, and then take an image with another high-resolution multispectral satellite. Another possible use would be to roughly identify the characteristic spectral band and take an image with this band using a multispectral satellite equipped with a liquid crystal tunable filter that can select a specific wavelength.<sup>[13](#page-15-0)</sup>

In this study, an LVBPF-based spaceborne miniaturized hyperspectral camera was successfully developed. This hyperspectral camera was installed on two 3U-CubeSats (OPTIMAL-1 and TIRSAT) launched into orbit in 2023 and 2024 for an on-orbit demonstration. This study reports an overview of the LVBPF-based hyperspectral cameras, imaging methods, and on-orbit results for each of the above-mentioned CubeSats.

# 2 Development of a Hyperspectral Camera Equipped with a Linear Variable Band-Pass Filter

### 2.1 Imaging Method of the LVBPF-Based Hyperspectral Camera

A traditional hyperspectral camera primarily consists of a telescope and a spectrometer with a slit, as shown in Fig. 1. This device operates using a push-broom scanning mechanism.<sup>[27](#page-15-0)</sup> It acquires the spectrum at each pixel location by scanning the ground surface line-by-line using a push-broom scanning mechanism.<sup>[28,29](#page-15-0)</sup> Its spectrometer consists of a collimator, a dispersion



Fig. 1 Traditional hyperspectral observation method.



Fig. 2 LVBPF-based hyperspectral observation method.

element, and an objective lens. The dispersion element can typically be a prism or a grating. Due to the many optical components required, the traditional hyperspectral camera is difficult to miniaturize. A way to bypass this limitation is to use an LVBPF, which is a band-pass filter with a wavelength transmittance that changes linearly with position. This way, spatial and spectral information can be acquired using a single easy-to-miniaturize filter. The configuration of an LVBPF-based hyperspectral camera is shown in Fig. 2. Traditional hyperspectral cameras using a grating are characterized by high spectral resolution. However, because the incident light is divided into different orders of light, the amount of light that reaches the image sensor is reduced. By contrast, the sensitivity of LVBPF-based hyperspectral cameras mainly depends on the transmittance of the filter, so these cameras have high sensitivity. Nevertheless, as with the traditional type, push-broom observations are also required for LVBPF-based hyperspectral cameras. The spectral images acquired from the LVBPF have different transmission wavelengths in the alongtrack direction. Thus, it is necessary to capture spectral images at different positions using pushbroom observations to acquire an image of the same wavelength. These spectral images are then combined to generate the hyperspectral data.

### 2.2 Development of the LVBPF-Based Hyperspectral Camera and Ground **Demonstration**

#### 2.2.1 Design and characteristics of developed hyperspectral camera

Figure [3](#page-3-0) shows the development of the CubeSat LVBPF-based hyperspectral camera. The camera was small (∼3 cm in length including the lens and image sensor). Two types of cameras to be installed on the CubeSats were developed in this study (Table [1\)](#page-3-0). Both cameras had the same appearance but different filters and image sensors. However, because these cameras were intended to be installed as a sub-mission of a multi-mission CubeSat, they used a small lens with coarse resolution. Table [2](#page-3-0) shows the specifications of each filter. The type A LVBPF was an initial experiment; therefore, we used a readily available existing filter with a long and thin shape. By contrast, the type B LVBPF is a filter cut to a size that matches the image sensor. The type A hyperspectral camera has a smaller pixel size in the image sensor, resulting in finer spatial and spectral resolutions compared with the type B camera. However, the type B camera has an advantage in its wavelength range as it covers both the visible and near-infrared spectra, whereas the type A camera is limited to the visible range only. The structures and detailed views of each hyperspectral camera are shown in Fig. [4](#page-4-0). This figure shows the structure of the type B camera; the type A camera is the same except for the filter size. The filter is not deposited onto the image sensor but is fixed mechanically. However, in the case of mechanical fixation, the distance between the filter and image sensor becomes wider, which increases the effects of spectral cross-talk, causing light leakage of adjacent wavelengths and mixing of the wavelengths. Commercially available image sensors have a cover glass attached; therefore, the cover glass was removed, and the structure was designed for the filter to be as close as possible to the image sensor. Considering the spectral resolution in this configuration to be the width of the light beam passing through the filter, the spectral resolution is calculated as the product of the F-number,

<span id="page-3-0"></span>

Fig. 3 Overview of the developed hyperspectral camera.

Item	Type A	Type B
Size	$3.6 \times 3.6 \times 2.4$ cm	$3.6 \times 3.6 \times 2.4$ cm
Weight	35 <sub>q</sub>	35 <sub>g</sub>
Ground sampling distance (case of altitude 500 km)	138 m/pixel	450 m/pixel
Swath	66 km	460 km
Available wavelength range	435 to 655 nm	400 to 770 nm
Spectral sampling distance	$5 \text{ nm}$	$5 \text{ nm}$
Spectral resolution	$14.1 \text{ nm}$	18.5 nm
Number of band	45 band	75 band
Focal length of telescope lens	8 mm	8 mm
F-number of telescope lens	F/2.5	F/2.5
Valid pixel area	$2560 \times 480$ pixels	$1280 \times 1024$ pixels
Pixel size	2.2 $\mu$ m	5.3 $\mu$ m
Dynamic range	8 bit	8 bit
Satellite	<b>OPTIMAL-1</b>	TIRSAT

Table 1 Specifications of the developed hyperspectral cameras.

Table 2 Specifications of the LVBPF (condition: incident angle = 0 deg).

Item	Type A	Type B
Size	$8.9 \times 1.05$ mm	$10.1 \times 8$ mm
<b>Thickness</b>	$1.0 \text{ mm}$	$0.5$ mm
Valid wavelength range	380 to 750 nm	380 to 850 nm
Dispersion	$42.1 \text{ nm/mm}$	$67.7$ nm/mm
Peak transmission	60%	65%
Spectral blocking property	No information	$1\%$
Half bandwidth	No information	15 nm at 430 nm
		20.6 nm at 780 nm
Substrate	Fused silica	Optical glass

<span id="page-4-0"></span>

Fig. 4 Structure of hyperspectral type B camera.

dispersion, and distance of the filter and focal plane. The F-number of the telescope lens is  $F/2.5$ , and the distance of the filter and focal plane is 0.67 mm; these are the same for both cameras. In the case of the type A camera, the dispersion of LVBPF is 42.1 nm/mm; thus, the spectral resolution is ∼11.3 nm. In the case of type B, if the dispersion is 67.7 nm/mm, the spectral resolution is calculated as ∼18.1 nm. However, this is merely a simplified calculation in which the half-band width of the filter itself is ignored. The measurement results of the spectral resolution of both cameras are shown in Sec. 2.2.2.

The LVBPF-based hyperspectral camera offers flexibility as its spectral resolution and wavelength range can be easily modified by simply changing the filter, image sensor, and telescope lens. To avoid relying on the attitude control accuracy of the CubeSat for the demonstration experiment, the ground sampling distance was coarsened to provide a wide field of view, although the original ground sampling distance of both cameras was already coarser than 100 m.

#### 2.2.2 Pre-flight performances

The performance of the developed hyperspectral camera types A and B was evaluated as a ground test. The imaging performance of a hyperspectral camera is expected to depend on the wavelength, and the point-spread function (PSF) of each camera engineering model was measured with each wavelength. The PSF of each camera was measured using a collimator with a pinhole chart and band-pass filters of 400, 550, 600, 650, and 700 nm. Figures [5](#page-5-0) and [6](#page-5-0) show the PSFs of each camera with each wavelength. Based on the results obtained, each plot was approximated with a normal distribution function to derive the standard deviation ( $\sigma$ ). As a result, the PSFs of the type A camera had an  $(\sigma)$  of 1.8 pixels at 450 nm, 1.7 pixels at 550 nm, and 1.6 pixels at 650 nm, whereas the type B camera had a PSF with an  $(\sigma)$  of 1.8 pixels at 450 nm, 1.7 pixels at 550 nm, 1.7 pixels at 650 nm, and 2.1 pixels at 700 nm. The result shows that the imaging performance in the visible range has no wavelength dependency. By contrast, there is some wavelength dependency in the near-infrared range of the type B. However, the difference is only ∼0.4 pixels, which is sufficient for imaging performance across the entire wavelength range. The wavelength dependency of imaging performance is due to the optical design, and it is considered that there is no difference between the engineering model and the flight model; therefore, the PSFs of the flight model were measured only for green wavelengths (550 nm).

The PSFs of each camera flight model were measured with ground tests using a collimator with a pinhole chart and green light. Both cameras were subjected to environmental tests, including random vibration, thermal cycling, and thermal vacuum tests. Figure [7](#page-6-0) shows the PSF measured before and after the environment test. Thermal cycling and thermal vacuum tests were performed under  $-10^{\circ}$ C to  $+50^{\circ}$ C. A random vibration test was performed with the camera mounted on each satellite under the conditions of the referenced launching vehicle. Before environmental tests, the PSFs of the type A camera had a standard deviation ( $\sigma$ ) of 1.4 pixels, whereas the type B camera had a PSF with an  $(\sigma)$  of 1.4 pixels. By contrast, after the environmental tests,

<span id="page-5-0"></span>

Fig. 5 PSF of hyperspectral type A camera for each wavelength. (a) 450 nm, (b) 550 nm, and (c) 650 nm.



Fig. 6 PSF of hyperspectral type B camera for each wavelength. (a) 450 nm, (b) 550 nm, (c) 650 nm, and (d) 700 nm.

<span id="page-6-0"></span>

Fig. 7 PSF of hyperspectral type A and type B camera flight models.

the results show that the type A camera had a PSF with an  $(\sigma)$  of 1.7 pixels and the type B had a PSF of 1.6 pixels. The difference in PSF before and after the environmental tests was 0.1 to 0.2 pixels, with both cameras achieving sufficient imaging quality based on the results of the environmental tests.

Figure 8 shows the results of evaluating full width at half maximum (FWHM) as the spectral resolution of 400, 550, 600, 650, and 700 nm (type A did not have 700 nm).

The horizontal axis is the pixel position of the image sensor, which is converted to a unit of wavelength using the result of spectral calibration. The conversion factor is 0.09 [nm/pixel] for



Fig. 8 Spectral resolution of hyperspectral type A and type B camera flight models.

type A and 0.336 (nm/pixel) for type B. The evaluation test was conducted by attaching a bandpass filter with an FWHM of 10 nm to an integrating sphere and using a halogen lamp. In the type A camera, the spectral resolution was ∼10.4 nm at 450 nm, 12.1 nm at 500 nm, and 20.7 nm at 600 nm. In the case of the type B camera, the spectral resolution was ∼19.8 nm at 450 nm, 23.7 nm at 500 nm, 36.4 nm at 600 nm, and 47.5 nm at 700 nm. As shown in Table [1](#page-3-0), the design values of the spectral resolution are 14.1 nm for type A camera and 18.5 nm for the type B camera. At short wavelengths, the measured and calculated results are in agreement, but as the wavelength increases, the spectral resolution is reduced. This could be because the half-band width of the LVBPF has wavelength dependence as the filter specification shown in Table [2,](#page-3-0) and the half-width on the long wavelength side is wide. Table [2](#page-3-0) lists the half-band width of the Type B filter; it is assumed that the half-band width of the type A filter is similar. As the half-band width increases, the angle of incidence that can be transmitted increases. Furthermore, the PSF is rougher on the near-infrared wavelength side. These combined causes could make the spectral resolution on the long wavelength side of the image sensor become coarse. For these reasons, the influence of spectral cross-talk between neighboring pixels, especially on the long wavelength side, becomes large, and the spectral purity becomes dilute so that the effective number of bands becomes coarser.

To ensure the success of the CubeSat demonstration experiment in this research, the camera adopted an  $F/2.5$  fast lens to ensure that it captured the image of the Earth's surface. As a result, the width of the light beam that passes through the filter becomes larger, and the spectral resolution is coarser. The spectral resolution of LVBPF-based hyperspectral cameras was found to be strongly dependent on the F-number of the lens. This should be considered in future research to find an optimal design solution.

#### 2.2.3 Demonstration using a drone

To evaluate the developed type B LVBPF-based hyperspectral camera, an aerial photography experiment was performed using a drone. The drone model used in this experiment is the DJI Phantom 4. The purpose of this experiment was to confirm that images and spectral information can be effectively acquired using the LVBPF-based hyperspectral camera. The experiment was performed at a soybean farm, where spectral information on soy, weeds, and soil was acquired. The specifications of the type B camera are shown in Table [1.](#page-3-0) The drone was flown at an altitude of 15 m, and the images were taken with a ground sampling distance of ∼1 cm∕pixel. The ground surface is scanned in the direction of the drone's movement, and the overlapping parts of the images are synthesized to generate a spectral image, which then forms hyperspectral data. However, due to the vibrations that occur when taking photos with a drone, the method of combining images at equal time intervals did not produce a successful combination. Therefore, overlap coordinates are estimated using image feature point matching and homography transformation, and images are synthesized to generate hyperspectral data. In the CubeSat imaging experiments described in Sec. [3](#page-8-0), the satellite's attitude was not stable, so a similar synthesis method was used to generate hyperspectral data.

The results of the RGB composite color image and the spectral information extracted from the acquired hyperspectral data are shown in Fig. 9. The results of soy and weed classification



Fig. 9 Composite image consisting of 474, 564, and 614 nm and respective spectral information (2022-08-08 11:27:23 JST, captured by Drone).

<span id="page-8-0"></span>

Fig. 10 Classification results of the soybean farm. (a) Classification results for soy and weed, (b) comparison of the classification result of weed with a visual inspection, (c) manually annotated mask for the region of soy, (d) aerial photograph image of a high-resolution color camera.

from the acquired hyperspectral data using the Spectral Angle Mapper method are summarized in Fig.  $10^{30}$  $10^{30}$  $10^{30}$  As shown in Figs.  $10(a)$  and  $10(b)$ , the results confirm that weeds can be classified by comparing the classification outcomes obtained using hyperspectral data and visual inspection. Next, the classification accuracy was calculated. The weeds were scattered in small areas, and it was not possible to create an accurate annotated mask; only the classification accuracy of soybeans was calculated. The classification accuracy for soybeans was obtained at 76.8%. This classification accuracy is calculated by comparing the annotated mask shown in Fig.  $10(c)$  with the classification result in Fig.  $10(a)$  and dividing the number of classified correct pixels by the total number of pixels of the annotated mask. The annotated mask was created manually using the high-resolution aerial photograph image with a ground sampling distance of ∼0.2 cm∕pixel shown in Fig. 10(d). These results reveal that the developed LVBPF-based hyperspectral camera has sufficient performance to acquire spectral information for agricultural remote sensing applications.

# 3 On-orbit Result of 3U-CubeSat "OPTIMAL-1"

#### 3.1 Details of OPTIMAL-1 Satellite

OPTIMAL-1 is a 3U-CubeSat  $(100 \times 100 \times 340$  mm, weighting 3.9 kg) developed by ArkEdge Space Inc. in collaboration with the University of Fukui and uses the TRICOM-2 satellite platform.<sup>[31,](#page-15-0)[32](#page-16-0)</sup> The exterior view and specifications of OPTIMAL-1 are shown in Fig. [11](#page-9-0) and Table [3,](#page-9-0) respectively. This satellite is used for multiple purposes, including the demonstration of novel components, storing and forwarding collected data, and conducting Earth observations using color and hyperspectral cameras. OPTIMAL-1 was deployed from the International Space Station on January 6, 2023, and successfully entered the Earth's orbit at an altitude of ~400 km and an inclination of 51.6 deg.<sup>[33](#page-16-0)</sup> Two weeks after deployment, the basic functionality of the satellite bus was successfully confirmed, and mission operations began. The satellite completed its missions and reentered the atmosphere on August 22, 2023, at the end of its operations.

<span id="page-9-0"></span>

Hyperspectral camera

Fig. 11 Exterior view of OPTIMAL-1 and location of the hyperspectral camera.





### 3.2 On-orbit Observation Results

A type A LVBPF-based hyperspectral camera was installed on this satellite and tested in orbit. As previously mentioned, the hyperspectral camera scans the ground surface using push-broom observations. Unfortunately, owing to an attitude control failure, OPTIMAL-1's hyperspectral camera was not able to identify the nadir point and stably scan the ground surface. Nevertheless, we attempted to process the data acquired during the adjustment of the altitude control parameters and successfully acquired the partial hyperspectral data shown in Fig. [12.](#page-10-0) In Fig. [12,](#page-10-0) the black areas in each spectral range represent defective areas. The land area image that could be acquired was limited to a spectral image of 435 to 505 nm. Figure [13](#page-10-0) shows the composite images created using wavelengths of 465, 485, and 505 nm and the extracted spectral information. Although it was not possible to evaluate the performance at all wavelengths covered by this

<span id="page-10-0"></span>

435 nm to 505 nm	515 nm to 585 nm	595 nm to 655 nm

Fig. 12 Spectral resolution of type A and type B camera flight models (2023-01-27 05:17:37 UTC, captured by OPTIMAL-1).



Fig. 13 Composite image consisting of 465, 485, and 505 nm and respective spectral information of the A, B, and C locations (2023-01-27 05:17:37 UTC, captured by OPTIMAL-1).

hyperspectral camera, the minimum necessary functions of the hyperspectral camera, such as imaging and spectroscopy, using OPTIMAL-1 were determined.

# 4 On-orbit Results of 3U-CubeSat "TIRSAT"

# 4.1 TIRSAT Details

TIRSAT is a 3U-CubeSat developed mainly by SEIREN Co. Ltd. under the management of Japan Space Systems as a commissioned project by the Ministry of Economy, Trade and Industry of Japan. The size of the satellite was  $117 \times 117 \times 381$  mm, and its weight was 4.97 kg. TIRSAT was equipped with a bolometer-type camera with the main purpose of using thermal infrared to measure changes in heat on the Earth's surface, detecting heat sources such as factories, and estimating the operating status. The hyperspectral camera under test was installed as an extra payload. The exterior view and specifications of the TIRSAT are presented in Fig. [14](#page-11-0) and Table [4,](#page-11-0) respectively. This satellite was successfully launched into a sun-synchronous sub-

<span id="page-11-0"></span>

Hyperspectral camera

Fig. 14 Exterior view of TIRSAT and location of the hyperspectral camera.



Table 4 Specifications of TIRSAT.

recurrent orbit at an altitude of ~680 km on February 17, 2024, by Japan's H3 launch vehicle.<sup>[34](#page-16-0)</sup> After orbit injection, the basic function of the satellite bus was successfully confirmed, and mission operations began.

# 4.2 On-orbit Observation Results

The type B LVBPF hyperspectral camera was installed on TIRSAT and tested in orbit. TIRSAT successfully pointed at the nadir, scanned, and acquired the ground surface images using the



Fig. 15 Composite image consisting of 482.6, 502.6, and 522.6 nm and respective spectral information of the A, B, and C locations (2024-03-29 01:22:16 UTC, captured by TIRSAT).

hyperspectral camera. The experimental data described below were acquired near South Korea and the Goto Islands on March 29, 2024. Raw images were acquired every second for 200 s, successfully generating the hyperspectral data shown in Fig. 15. This figure shows a composite image consisting of 482.6, 502.6, and 522.6 nm and the extracted spectral information in each area. The hyperspectral camera was able to acquire spectral information from all ocean areas (e.g., locations B and C), whereas only visible wavelengths could be extracted from the land areas (e.g., location A) because of the large amount of cloud cover and limited land area. Overall, the initial on-orbit demonstration of the type B LVBPF hyperspectral camera installed in TIRSAT was considered successful.

TIRSAT continues regular observations after the initial operation. The hyperspectral camera was installed on TIRSAT as a sub-mission; therefore, although it does not make many observations, it has acquired observation data as shown in Figs. [16](#page-13-0) and [17.](#page-14-0) Figure [16](#page-13-0) shows data taken near Lake Gregory in Australia. From the graph, it can be seen that the spectral information of lakes (e.g., location A) and bare land (e.g., locations B and C) was obtained. Figure [17](#page-14-0) shows data taken in Japan. Location B is the ocean area, locations A and C are vegetated areas, and location D is the urban area. Various types of spectral information have successfully been acquired. Our future plans include further making adjustments to the imaging parameters, continuing the demonstration, performing radiometric calibrations, and obtaining spectral reflections.

<span id="page-13-0"></span>

Fig. 16 Composite image consisting of 482.6, 567.6, and 617.6 nm and respective spectral information of locations A, B, and C (2024-07-19 01:45:12 UTC, captured at Australia by TIRSAT).

# 5 Conclusions

This study described the results of an on-orbit demonstration of an LVBPF-based hyperspectral camera installed on 3U-CubeSats.

In this research, 3-cm cube miniaturized hyperspectral cameras were developed to be installed on two CubeSats. The developed cameras performed pre-flight tests, the imaging performance was evaluated before and after a space environment test, and the results showed that it could withstand the space environment. In addition, an aerial photography experiment was performed using a drone at a soybean farm to evaluate the developed camera. The results confirmed that soybeans and weeds can be classified using hyperspectral data, showcasing that the developed hyperspectral camera has sufficient performance to acquire spectral information.

The developed LVBPF-based hyperspectral cameras installed on two CubeSats, OPTIMAL-1 and TIRSAT, successfully acquired hyperspectral data while in orbit. The results demonstrated that this hyperspectral camera can be installed as a mission module on various types of CubeSats. Although tested on 3U-CubeSats, the hyperspectral camera developed in this study is sufficiently small to be installed on 2U- and 1U-CubeSats. In addition, the spectral characteristics of the LVBPF-based hyperspectral camera can easily be modified by replacing the filter, which has

<span id="page-14-0"></span>

Fig. 17 Composite image consisting of 457.6, 552.6, and 637.6 nm and respective spectral information of locations A, B, C, and D (2024-08-01 01:48:12 UTC, captured at Japan by TIRSAT).

a high optical transmittance and can improve spatial resolution. In the future, we plan to develop various types of hyperspectral cameras, including high-resolution cameras, by exploiting the advantages of these features.

### **Disclosures**

The author declares no conflicts of interest associated with this paper.

### Code and Data Availability

The data supporting the findings of this study are available from the corresponding author upon request. However, the satellite images will be made available after permission is granted by the satellite ownership organization.

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