Development of Self-generated and LPWA-based Crop Growth Environment Monitoring and Bigdata Analysis System

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Abstract—Smart farms are a technology that greatly helps improve the productivity and quality of crops and is being actively introduced into indoor environments such as greenhouses. Various sensors are installed in greenhouses to collect data, which AI analyzes to find the optimal crop growth environment. Various studies have been conducted to control this environment automatically. However, it has not yet been distributed to field-grown crops. The main reason is that, unlike indoor environments, it is tough to collect sensor data to monitor the growth environment of crops in open fields where weather conditions change significantly and the power supply is complex. Additionally, because various sensors are used, the data formats of the devices are different, making it difficult to process. This paper presents a field crop growth environment monitoring and big data analysis system. The proposed system first solves power supply and data communication problems using solar power generation and LPWA technology. Additionally, based on the oneM2M architecture, data from various sensors is transmitted to the server using standardized technology. The transmitted data is stored and managed on the server as big data and can be used to predict the production and quality of field-grown crops and take appropriate measures. The proposed system is expected to create an environment optimized for the growth of field crops and help prevent and manage diseases.

Keywords—Smart farm; field crop growth environment monitoring; bigdata analysis; low power wide area; one machine to machine.

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I. INTRODUCTION

Smart farm is a system that utilizes information and communication technology in the agricultural field to improve productivity and stably manage the quality and quantity of crops, and is being actively introduced to indoor environments such as greenhouses [1], [2], [3], [4]. In the greenhouse, sensor data such as temperature, humidity, CO2, soil moisture, and pH can be easily collected through wired or short-distance wireless communication to monitor crop growth [5], [6]. However, it is challenging to collect sensor data using these communication methods in large open areas where weather conditions change significantly and power supply is limited. In addition, there are many limitations in controlling the growth environment of crops because it is difficult to operate irrigation and nutrient solution sup-ply devices. Due to these problems, smart farms for field crops require self-power supply and LPWA(Low-Power Wide-Area) wireless communication technology. LPWA communication technology is a network technology designed for low-power, long-distance communication. It is mainly used to transmit small amounts of data, such as sensor data and monitoring

information at low power [7], [8], [9], [10]. LPWA communication encompasses several protocols and technologies. For example, there are Narrowband Internet of Things (NB-IoT), Long Term Evolution for Machines (LTE-M), and Long Range Wide Area Network (LoRa WAN), and each technology is selected according to specific uses and requirements. Combining a self-generating system with LPWA communication technology can provide an efficient and economical solution for collecting and transmitting data outdoors. This can be used in various application fields, such as sensor data collection in remote areas, energy monitoring, and environmental monitoring.

Also, a standardized platform such as oneM2M is essential to respond to various sensors for monitoring the outdoor cultivation environment. oneM2M is a standardized platform Internet-based for M2M (Machine-to-Machine) communication. It can provide various services by efficiently collecting, storing, and analyzing data from various devices and networks. Additionally, oneM2M provides interconnectivity between IoT devices and enables automated control and monitoring through communication between devices. Sensor data collected through these technologies can

be built into big data. These can utilize AI technologies to predict the optimal growth environment and yield of crops[11], [12], [13], [14].

This paper presents a field crop growth environment monitoring and big data analysis system. The proposed system first solves power supply and data communication problems using solar power generation and LPWA technology. Additionally, based on the oneM2M architecture, data from various sensors is transmitted to the server using standardized technology. The transmitted data is stored and managed on the server as big data and can be used to predict the production and quality of field-grown crops and take appropriate measures. The proposed system is expected to contribute to producing low-cost, high-quality field crops through the convergence of renewable energy and smart farms. It can be applied to other industrial fields that monitor the growth environment of crops and utilize the oneM2M architecture.

The structure of this paper is as follows: Section 2 describes LPWA communication technology and the oneM2M platform; Section 3 describes the proposed LPWA-based field crop growth monitoring and big data analysis system; Section 4 presents the implementation results of the proposed system; and Section 5 provides a conclusion and research implications.

II. MATERIALS AND METHOD

A. LPWA

LPWA is a low-power, wide-range communication technology for Low Power Wide Area. LPWA is mainly used to communicate with IoT devices and has low power consumption, comprehensive coverage, and low cost [15], [16]. LPWA primarily communicates with small-scale IoT devices such as sensors, monitoring devices, smart meters, etc[17]. These devices have low power consumption and slow data transfer rates but require the ability to connect large numbers of devices at once. LPWA is a technology developed to meet these requirements. LPWA services include NB-IoT(Narrowband IoT), LoRa WAN provided by the LoRa alliance, and LTE-M (Long Term Evolution for Machines). The following table shows the LPWA technologies of NB-IoT, LTE-M, and LoRa WAN [15], [18], [19], [20], [21], [22], [23].

TABLE I Comparison of I PWA technologies

Technology	NB-IoT	LTE-M	LoRa WAN	
Frequency	Licensed bands	Licensed bands	Unlicensed	
band			bands	
Transfer speed	250kbps	1Mbps	0.3~50kbps	
Coverage	Good	Good	Very excellent	
Power Consumption	Very low	Very low	Very low	
Cost	Relatively high	Relatively high	Relatively low	
Compatibility	Compatible with existing mobile communication networks	Compatible with existing mobile communication networks	Not compatible with existing mobile networks	

NB-IoT uses licensed bands, and although the transmission speed is relatively slow, it has good coverage and power consumption. LTE-M uses licensed bands with fast transmission speeds but relatively high power consumption. LoRa WAN uses unlicensed radio frequency bands with low transmission rates but perfect coverage and power consumption [24]. In terms of cost, LoRa WAN can be implemented at a relatively low cost. Considering these characteristics, the system presented in this paper constructed a communication network using LoRa WAN.

B. oneM2M

oneM2M is a standard jointly developed by international standardization organizations such as ITU, ETSI, TTA, and ARIB, and provides a standardized interface by integrating various network technologies and protocols [25]. oneM2M allows multiple IoT devices to interconnect and exchange data in a standardized way. In addition, oneM2M provides security, privacy protection, and device management functions to ensure the stability and reliability of the Internet of Things system. Due to these advantages, it is used in various industrial fields of the Internet of Things, especially playing an essential role in fields such as smart cities, smart homes, smart grids, and smart farms [26], [27], [28].

While existing IoT services comprise separate platforms, oneM2M supports various services by integrating them into one service platform. Fig. 1 shows the difference between the existing platform and the oneM2M platform.



Fig. 1 Difference between the existing IoT service and the oneM2M based IoT service

oneM2M consists of NSE(Network Services Entity), CSE(Common Service Entity), and AE(Application Entity). The platform's functions are defined as CSF(Common Service Function). Each entity communicates through a reference point. The primary purpose of OneM2M Release 2 is to interoperate with various industrial IoT platforms and networks, and it provides interconnection specifications with AllJoyn and OCF (Open Connectivity Foundation) LWM2M (Lightweight M2M) technology for the purpose of interoperating with the IoT. Additionally, for network interoperability, a traffic pattern configuration function for interoperability with 3GPP Rel-13 network is defined [29]. oneM2M Release 3 derives requirements to support domains such as smart factories and autonomous vehicles and provides standard functions for these [30]. In particular, support for mobile IoT devices has been strengthened.

oneM2M Release 4 is a standard that supports various vertical industries such as Smart-X(city, health, transportation, factory) and disaster safety, and consists of 24 detailed specifications and 4 technical reports [31]. It also includes 5G network interconnection and the latest edge computing technology. By providing SDT(Smart Device Template) 4.0, which guarantees interconnection and compatibility with various smart devices, it makes it possible to provide an IoT digital convergence platform in various vertical industries.

TABLE II
ENTITIES IN ONEM2M

Entity	NSE	CSE	AE
Role	Provides	Provides	Communicate
	oneM2M	oneM2M's	with oneM2M
	network service	core services	application
Function	Network	Resource	Interface with
	connection	management	applications
	management	Data storage	Resource
	Authentication	and retrieval	creation and
	and Security	Service control	management
	Data transfer and	Management of	Send and receive
	routing	event and alarm	data
	Network status		Receive events
	monitoring		and notifications
Example	MQTT broker	Database	Control
	CoAP server	Web server	application

III. RESULT AND DISCUSSION

A. Crop Growth Environment Sensor Node

To collect field crop growth environment data, we designed a sensor node that generates self-power using solar energy. Sensing items consist of meteorological data of temperature, humidity, wind direction, wind speed, solar radiation, and rainfall, and soil environmental data of soil temperature, soil humidity, and EC(Electrical Conductivity). Fig. 2 shows the manufactured sensor node hardware board and the specifications of the sensors are listed in Table 3.



Fig. 2 The sensor node hardware board

Since the cultivation environment is outdoors rather than indoors, a long-distance, low-power communication module that supports dust and moisture prevention was designed. As a wireless communication technology, LoRa WAN was selected among LPWA technologies considering frequency band, cost, coverage, and power consumption. The sensor node was designed to enable low-power, long-distance communication by connecting the SX1276 chip that supports LoRa wireless communication and the STM32 MCU. The hardware block diagram of the sensor node is shown in Fig. 3 below. In addition, it is equipped with a small solar panel, battery, and charge/discharge control module to enable its own power supply.

TABLE III	
ENVIRONMENT SENSOR SPECIFICATION	

		Specifications	
Environment	Sensor type	Measure range	Precision
Air environment	Wind speed	1~54 m/s	1 m/s or 5%
	Wind direction	$0\sim 360^\circ$	7°
	Temperature	$-40 \sim 65 \ ^\circ C$	0.5 °C
	Humidity	$0 \sim 100\%$	3% RH
	Rainfall volume	$0 \sim 9999 mm$	4%
	Radiation	$0 \sim 1800 W/m^2$	5%
	Humidity	$0\sim99.9\%$	1%
Soil environment	Soil temperature	$0 \sim 66 \ ^\circ C$	0.5%
	EC	$0 \sim 6.0 dS/m$	0.1dS/M



Fig. 3 The hardware block diagram of sensor node

B. Gateway

Air and soil environmental data collected by sensor nodes are transmitted to the gateway through the LPWA communication module. The gateway processes the received data and transmits it to the server. At this time, the oneM2M platform is utilized to transmit data in various formats. The hardware block diagram of the gateway equipped with the oneM2M platform are shown in Fig. 4.

The hardware structure of the gateway uses two basebands to communicate with multiple end devices. The master part performs transmission/reception with the upper server, gateway control function, reception for eight reception channels, and transmission/reception functions, and the slave part is designed only to be responsible for reception for eight reception channels. Fig. 5 shows the function configuration diagram of the gateway.



Fig. 4 The hardware block diagram of gateway



Fig. 5 The function configuration diagram of gateway

The gateway master consists of a Socket Module for TCP/Modbus communication with the upper server, a GW Control Module for setting and controlling the gateway environment, and a LoRa TRX Manager for transmitting and receiving using LoRa WAN with the end device. The gateway slave part consists of a slave part control module and MAC & HAL module. First, the sleeve control module manages the interface and settings with the master unit. The MAC & HAL module consists of a LoRa TRX Manager to process LoRa packets received from sensor nodes, a LoRa PHY control manager, and an SPI interface manager to control the LoRa chip.

C. Bigdata Analysis System

We designed a bigdata analysis system that can reliably process various types of sensing data transmitted from a oneM2M-based gateway. The configuration diagram of the designed data analysis system is shown in Fig. 6. It receives data transmitted from the gateway through the environmental information collection standard interface, parses the data obtained through the external weather data adapter and the ground/soil environmental information adapter, and checks whether the data is correct. The data through the adapter is built as big data in the storage, and the user's query is processed through the environmental information query processor to provide analyzed information.



Fig. 6 The structure diagram of bigdata analysis system

D. Implementation Results

To evaluate the performance of the proposed LPWA-based plantation growth environment data collection system, a native Actinidia plantation site was selected, and a sensing network was constructed to collect LoRa-based micrometeorological and soil environment data. To collect various micro-meteorological and soil environment data on native Actinidia cultivation areas, we selected sunny areas with much sunlight, areas with moderate amounts of sunlight, and shaded areas, reflecting the characteristics of the cultivation areas and compared the correlation between environmental factors and quality within the orchard. The data collection device was installed, as shown in Fig. 6.



Fig. 7 Sensor node

The installed data collection device collects temperature, humidity, wind direction/speed, rainfall, solar radiation, ground temperature, humidity, and EC data. Sensor nodes collect air and soil environment data and transmit them to the oneM2M-based gateway. The gateway installed in the plantation supports dust and waterproofing and is implemented as shown in Fig. 8.



Fig. 8 Gateway implementation results

The LoS test results in the LoRa-based sensing network showed good data transmission reliability and speed up to 2km. Although the data transmission speed slowed down at a distance of 3km, it was possible to collect a small amount of data from IoT-based sensor devices. Using stored data, a harvest and quality prediction system for forest products was implemented. The plantation area where the system was installed was an Actinidia plant, and Actinidia yield and sugar content were predicted using the data collected. Figures 9 and 10 show the predicted results of analyzed Actinidia yield and sugar content.



Fig. 9 Kiwi sweetness prediction result



Fig. 10 Result of predicting the production of Actinidia

Random forest was used to predict crop production and sugar content. This technique improves prediction performance by combining multiple decision trees ensemble. It has the advantage of processing non-linear data relationships and relatively high prediction accuracy. First, we preprocessed the environmental sensor data constructed with big data to remove outliers and normalize and standardize the data. Afterward, the data was divided into training and testing datasets, and then a random forest model was trained. In the model learning process, random samples were extracted from the training data to generate several bootstrap samples, and an independent decision tree was learned using each sample. Each decision tree selected the optimal characteristics from a set of random data characteristics at a specific node, divided the data, and repeated this process to complete the tree. Using the random forest model learned in this way, predictions were made on the test data to calculate the predicted production of *actinide* and the predicted sweetness of kiwi.

IV. CONCLUSION

This paper proposed a field crop growth environment monitoring and extensive data analysis system. The proposed system comprises a self-generating environmental data collection node, an LPWA-based communication module, and a big data analysis server. We designed and developed a sensor node with wind speed, wind direction, temperature, humidity, rainfall, and solar radiation sensors to collect the atmospheric environment and ground temperature, humidity, and EC sensors to collect the soil environment. Because there is no constant power supply, a LoRa-based LPWA sensing network using a self-generating system was established and installed at the field crop field, and data was transmitted to the server through a gateway. Combining a self-generating system and LPWA communication technology was shown to be a very efficient and economical solution for collecting and transmitting data in an outdoor environment. These solutions can be used in various application fields, including sensor data collection in the open field, energy monitoring, and environmental monitoring.

Additionally, based on the oneM2M architecture, it is designed to process data from various sensors in a standardized way, allowing the system to be expanded more flexibly when new types of sensors are added. The transmitted data is stored and managed on the server as big data and can be used to predict the production and quality of field-grown crops and take appropriate measures. We implemented a system that predicts the yield and quality of forest products by analyzing big data stored on the server. Environmental information was collected from Actinidia cultivation areas, and the results of predicting Actinidia yield and sugar content were presented. The proposed system is expected to improve the productivity of forest products and can be applied to the industrial field to monitor the growth environment of other crops.

References

- H. O. Choe and M.-H. Lee, "Artificial Intelligence-Based Fault Diagnosis and Prediction for Smart Farm Information and Communication Technology Equipment," *Agriculture*, vol. 13, no. 11, p. 2124, Nov. 2023, doi: 10.3390/agriculture13112124.
- [2] K. Joo, H. M. Kim, and J. Hwang, "Consequences of Psychological Benefits in the Context of Eco-Friendly Indoor Smart Farm Restaurants: The Moderating Role of Curiosity," *Sustainability*, vol. 15, no. 21, p. 15496, Oct. 2023, doi: 10.3390/su152115496.
- [3] N. Sirimorok, R. M. Paweroi, A. A. Arsyad, and M. Köppen, "Smart Farm Security by Combining IoT Sensor Network and Virtualized Mycelium Network," *Sensors*, vol. 23, no. 21, p. 8689, Oct. 2023, doi:10.3390/s23218689.

- [4] R. Dhillon and Q. Moncur, "Small-Scale Farming: A Review of Challenges and Potential Opportunities Offered by Technological Advancements," *Sustainability*, vol. 15, no. 21, p. 15478, Oct. 2023, doi: 10.3390/su152115478.
- [5] N. Bafdal and I. Ardiansah, "Application of Internet of Things in Smart Greenhouse Microclimate Management for Tomato Growth," *International Journal on Advanced Science, Engineering and Information Technology*, vol. 11, no. 2, pp. 427–432, Apr. 2021, doi:10.18517/ijaseit.11.2.13638.
- [6] R. E. Putri, N. U. Lestari, Ifmalinda, F. Arlius, I. Putri, and A. Hasan, "Monitoring and Controlling System of Smart Mini Greenhouse Based on Internet of Things (IoT) for Spinach Plant (Amaranthus sp.)," *International Journal on Advanced Science, Engineering and Information Technology*, vol. 14, no. 1, pp. 131–136, Feb. 2024, doi:10.18517/ijaseit.14.1.18408.
- [7] M. O. Ojo, I. Viola, M. Baratta, and S. Giordano, "Practical Experiences of a Smart Livestock Location Monitoring System Leveraging GNSS, LoRaWAN and Cloud Services," *Sensors*, vol. 22, no. 1, p. 273, Dec. 2021, doi: 10.3390/s22010273.
- [8] W. Choi, Y.-S. Chang, Y. Jung, and J. Song, "Low-Power LoRa Signal-Based Outdoor Positioning Using Fingerprint Algorithm," *ISPRS International Journal of Geo-Information*, vol. 7, no. 11, p. 440, Nov. 2018, doi: 10.3390/ijgi7110440.
- [9] K. A. Ogudo, D. Muwawa Jean Nestor, O. Ibrahim Khalaf, and H. Daei Kasmaei, "A Device Performance and Data Analytics Concept for Smartphones' *IoT Services and Machine-Type Communication in Cellular Networks*," Symmetry, vol. 11, no. 4, p. 593, Apr. 2019, doi:10.3390/sym11040593.
- [10] R. Choi, S. Lee, and S. Lee, "Reliability Improvement of LoRa with ARQ and Relay Node," *Symmetry*, vol. 12, no. 4, p. 552, Apr. 2020, doi: 10.3390/sym12040552.
- [11] C.-H. Huang, B.-W. Chen, Y.-J. Lin, and J.-X. Zheng, "Smart Crop Growth Monitoring Based on System Adaptivity and Edge AI," *IEEE Access*, vol. 10, pp. 64114–64125, 2022, doi:10.1109/access.2022.3183277.
- [12] S. Qazi, B. A. Khawaja, and Q. U. Farooq, "IoT-Equipped and AI-Enabled Next Generation Smart Agriculture: A Critical Review, Current Challenges and Future Trends," *IEEE Access*, vol. 10, pp. 21219–21235, 2022, doi: 10.1109/access.2022.3152544.
- [13] D. Pal and S. Joshi, "AI, IoT and Robotics in Smart Farming: Current Applications and Future Potentials," 2023 International Conference on Sustainable Computing and Data Communication Systems (ICSCDS), pp. 1096–1101, Mar. 2023, doi:10.1109/icscds56580.2023.10105101.
- [14] K. Sathya Priya, J. Ancy Jenifer, S. P. Janani, M. Shilpa Aarthi, and T. Kavitha, "Crop Recommendation And Disease Prediction Using IOT And AI," 2024 10th International Conference on Communication and Signal Processing (ICCSP), pp. 807–812, Apr. 2024, doi:10.1109/iccsp60870.2024.10543366.
- [15] L. Wang et al., "A Design for a Lithium-Ion Battery Pack Monitoring System Based on NB-IoT-ZigBee," *Electronics*, vol. 12, no. 17, p. 3561, Aug. 2023, doi: 10.3390/electronics12173561.
- [16] H. Soy, "Coverage Analysis of LoRa and NB-IoT Technologies on LPWAN-based Agricultural Vehicle Tracking Application," *Sensors*, vol. 23, pp. 8859, 2023, doi: 10.20944/preprints202308.2037.v1.
- [17] H. Nguyen, N. T. Le, N. C. Hoan, and Y. M. Jang, "Real-Time Mitigation of the Mobility Effect for IEEE 802.15.4g SUN MR-OFDM," *Applied Sciences*, vol. 9, no. 16, p. 3289, Aug. 2019, doi: 10.3390/app9163289.
- [18] Semtech. "LoRa and LoRaWAN: A Technical Overview," Online. 2019. [Online]. Available: https://loradevelopers.semtech.com/uploads/documents/files/LoRa_and_LoRa WAN-A Tech Overview-Downloadable.pdf.
- [19] X. Yang, E. Karampatzakis, C. Doerr, and F. Kuipers, "Security Vulnerabilities in LoRaWAN," 2018 IEEE/ACM Third International Conference on Internet-of-Things Design and Implementation (IoTDI), pp. 129–140, Apr. 2018, doi: 10.1109/iotdi.2018.00022.
- [20] R. Burczyk, A. Czapiewska, M. Gajewska, and S. Gajewski, "LTE and NB-IoT Performance Estimation Based on Indicators Measured by the Radio Module," *Electronics*, vol. 11, no. 18, p. 2892, Sep. 2022, doi:10.3390/electronics11182892.
- [21] H. Fu, X. Wang, X. Zhang, A. Saleem, and G. Zheng, "Analysis of LTE-M Adjacent Channel Interference in Rail Transit," *Sensors*, vol. 22, no. 10, p. 3876, May 2022, doi: 10.3390/s22103876.
- [22] A. Benouakta, T. M. Nguyen, F. Ferrero, L. Lizzi, and R. Staraj, "Design of a Multi-Standard UWB-LoRa Antenna Structure and Transceiver Board for High-Accuracy and Long-Range Localization

Applications," Electronics, vol. 12, no. 21, p. 4487, Oct. 2023, doi: 10.3390/electronics12214487.

- M. Al mojamed, "LTM-LoRaWAN: A Multi-Hop Communication System for LoRaWAN," *Electronics*, vol. 12, no. 20, p. 4225, Oct. [23] 2023, doi: 10.3390/electronics12204225.
- [24] S. Ugwuanyi, G. Paul, and J. Irvine, "Survey of IoT for Developing Countries: Performance Analysis of LoRaWAN and Cellular NB-IoT Networks," Electronics, vol. 10, no. 18, p. 2224, Sep. 2021, doi: 10.3390/electronics10182224.
- oneM2M, "Published Specifications," [25] [Online]. Available: https://www.etsi.org/committee/1419-onem2m. Accessed on: Nov. 8, 2023.
- [26] M. Taştan and H. Gökozan, "Real-Time Monitoring of Indoor Air Quality with Internet of Things-Based E-Nose," Applied Sciences, vol. 9, no. 16, p. 3435, Aug. 2019, doi: 10.3390/app9163435.
- [27] Y. M. Yusoff, R. Rosli, M. U. Karnaluddin, and M. Samad, "Towards smart street lighting system in Malaysia," 2013 IEEE Symposium on Wireless Technology & amp; Applications (ISWTA), pp. 301–305, Sep. 2013, doi: 10.1109/iswta.2013.6688792.
- E. Kadusic, N. Zivic, C. Ruland, and N. Hadzajlic, "A Smart Parking [28] Solution by Integrating NB-IoT Radio Communication Technology into the Core IoT Platform," Future Internet, vol. 14, no. 8, p. 219, Jul. 2022, doi: 10.3390/fi14080219.
- M. Pappalardo, A. Virdis, and E. Mingozzi, "An Edge-Based [29] LWM2M Proxy for Device Management to Efficiently Support QoS-Aware IoT Services," IoT, vol. 3, no. 1, pp. 169-190, Feb. 2022, doi: 10.3390/iot3010011.
- [30] oneM2M. "Published Specifications," Release 3, [Online]. Available: https://www.onem2m.org/technical/published-specifications/release-3. oneM2M. "Published Specifications," Release 4, [Online]. Available:
- [31] https://www.onem2m.org/technical/published-specifications/release-4.