Unmanned Aerial Vehicles in Smart Agriculture: Applications, Requirements, and Challenges

Praveen Kumar Reddy Maddikunta, Saqib Hakak, Mamoun Alazab, Sweta Bhattacharya, Thippa Reddy Gadekallu, Wazir Zada Khan, and Quoc-Viet Pham

Abstract—In the next few years, smart farming will reach each and every nook of the world. The prospects of using unmanned aerial vehicles (UAV) for smart farming are immense. However, the cost and the ease in controlling UAVs for smart farming might play an important role for motivating farmers to use UAVs in farming. Mostly, UAVs are controlled by remote controllers using radio waves. There are several technologies such as Wi-Fi or ZigBee that are also used for controlling UAVs. However, Smart Bluetooth (also referred to as Bluetooth Low Energy) is a wireless technology used to transfer data over short distances. Smart Bluetooth is cheaper than other technologies and has the advantage of being available on every smart phone. Farmers can use any smart phone to operate their respective UAVs along with Bluetooth Smart enabled agricultural sensors in the future. However, certain requirements and challenges need to be addressed before UAVs can be operated for smart agriculture-related applications. Hence, in this article, an attempt has been made to explore the types of sensors suitable for smart farming, potential requirements and challenges for operating UAVs in smart agriculture. We have also identified the future applications of using UAVs in smart farming.



Index Terms—Unmanned Aerial Vehicles (UAVs), Smart Agriculture, Bluetooth Low Energy, Smart Farming, Smart Sensors, Agriculture Sensors, Precision Agriculture, Smart Fields and Crops Monitoring.

I. INTRODUCTION

To meet the huge demand for food for the growing population, agriculture has to be revolutionized by using Information and Communication Technologies (ICT). Smart agriculture is the buzzword nowadays which leverages the latest techniques of ICT to grow the food in a sustainable and clean manner [1]. ICT technologies like the Internet of Things (IoT), Remote Sensing and Unmanned Aerial Vehicles (UAV) [2] can effectively use sensors for smart agriculture. Using these technologies, the farmers can automate the irrigation process by remotely monitoring the crop field with the help of several sensors [3]. Smart agriculture not only helps in

Praveen Kumar Reddy Maddikunta, Sweta Bhattacharya and Thippa Reddy Gadekallu are with the School of Information Technology and Engineering, Vellore Institute of Technology, India (e-mail: {praveenkumarreddy, sweta.b, thippareddy.g}@vit.ac.in).

Saqib Hakak is with the Faculty of Computer Science, University of New Brunswick, Fredericton, Canada (e-mail: saqibhakak@gmail.com).

Mamoun Alazab (corresponding author) is with the College of Engineering, IT and Environment, Charles Darwin University, Casuarina, NT

0909, Australia (e-mail: alazab.m@ieee.org).

Wazir Zada Khan is with the Faculty of Computing & Captial
University of Science and Technology (CUST), Islamabad. (e-mail: wazirzadakhan@yahoo.com).

Quoc-Viet Pham is with the Research Institute of Computer, Information and Communication Pusan National University, Busan 46241, Korea (e-mail: vietpq@pusan.ac.kr).

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catering the food needs of the growing population, but also helps in recent trends in agriculture like organic farming (Food Shortage, Covid-19 self-sufficient farming). UAVs or drones are a kind of aircrafts that can fly autonomously which can be controlled remotely. ICT tools and techniques like embedded systems, Global Positioning Systems (GPS) and sensors are used to control UAVs. UAVs can be used to monitor situations/missions which are very dangerous and risky for humans. UAVs were originally invented for usage in military applications. Gradually UAVs were successfully employed in several civil applications like agriculture, policing, surveillance, recreational purposes, etc [4]. Recently ecommerce giants like Amazon started to deliver their products to their customers through UAVs. UAVs have also been successfully used for monitoring the civilian movements and social gatherings, make announcements in rural or remote areas about the rules of lockdown to combat the Covid-19 pandemic, thereby reducing the risk of police and health authorities being infected by the disease [5].

The main advantages of using UAVs for smart agricultural applications include mobility of UAVs in variable weather conditions, ability to capture high-resolution pictures from different ranges (average range 50 to 100 meters) [6]. It is also possible to use UAVs for determining and monitoring the quality of crops, monitoring attacks attempted by pests/weeds/animals. The farmers and other stakeholders can access the data gathered through UAVs from cloud-based platforms remotely through apps from their smart devices which

can help in predicting the yield of the crop, requirements like pesticides, fertilizers, seed sowing, etc.

There are a few survey articles on UAV and agriculture which are listed in Table I. In one of the recent studies [9], the authors have explored the role of IoT and agricultural UAV in smart agriculture. The main emphases have been laid upon fundamental aspects of IoT technologies including intelligent sensors, IoT sensor types, networks and protocols, and how IoT can be integrated with UAV for the purpose of smart farming. Similarly, in [12], the authors have explored the potential applications of using UAV in agriculture and discussed different categories of UAV platforms. The present work is not limited to a specific aspect of UAV application in agriculture. Rather, it explores various architectural frameworks, adaptation and usage of UAVs in smart agriculture. Some of the recent and state of the art implementations involving use of Bluetooth technology enabled sensors are discussed highlighting its superiority in terms of cost optimizations and accessibility. The paper also discusses the industry aspect, associated standards, hardware and software. Thus the paper provides a broader and widely extended review of the applications of UAV in smart agriculture which makes it different from the existing studies in this domain.

Compared to above-mentioned studies, the main contributions of this article are summarized as follows:

- Overview of Bluetooth Smart and types of UAVs and agricultural sensors in smart agriculture are explored.
- Types of Agricultural sensors are enumerated with applications and features highlighted
- Enabling Requirements for successful adaptation and usage of UAVs in smart agriculture are enlisted.
- Case studies involving Bluetooth Smart enabled agricultural sensors and UAVs in smart agriculture are explored.
- Potential Future Challenges along-with research directions are also presented.

The rest of the paper is organized as follows. Section II presents a detailed overview on the architecture of UAV, different types of agricultural sensors used in UAVs, state-of-the-art on recent applications of UAVs in several domains. Section III discusses potential applications of UAVs in smart agriculture and case studies on real-time implementation of UAVs for smart agriculture. A detailed analysis of the requirements for UAVs for smart agriculture is provided in Section IV. Challenges and Future research directions are discussed in Section V and Section VI concludes the paper.

II. BACKGROUND

UAVs are one type of aircraft that can fly autonomously in the air without the involvement of a pilot on board, and the aircraft's motion is controlled remotely by an operator. UAV consists of sensors [13], [14], cameras that record and relay images to the operator which is depicted in Fig. 1. UAVs were initially widely used in military applications and surveillance applications. Later, due to the rapid growth of technology in smart agriculture, UAVs have been commonly used in agriculture, helping farmers with crop monitoring, crop spraying, weed detection, disease detection, etc. Some of the

advanced features, such as low maintenance costs, fast set-up time, low acquisition costs, and live data capture, have made UAVs a better option for farmers in the agricultural sector. This section deals with the general architecture of UAVs in agriculture, agricultural applications using UAVs and UAV sensors.

A. Overview of Bluetooth Smart

Bluetooth Smart or Bluetooth Low Energy (BLE) is a wireless system used for technical advancement in the medical, environmental, safety, and energy sectors. Compared to classic Bluetooth technology, BLE requires low power and reduced costs, even if the communication range remains the same. BLE merged into the main Bluetooth standard in July 2010, when Bluetooth Core Specification 4.0 was adopted as Bluetooth Smart and included the classic Bluetooth protocol, Bluetooth High-Speed Protocol and BLE [16]. Bluetooth Smart is a dualmode device, typically a laptop or smartphone whose hardware is compatible with both classic and BLE devices. Bluetooth Smart is a low-energy device that normally has a batteryoperated sensor that requires a smart device to operate. BLE is a Bluetooth 4.0 subset with a new protocol stack, designed for very low-power applications that can run off a coin cell battery for months or even years.

Wireless technologies do not require wires to send signals and hence can be used for communication in remote areas. The major forms of wireless communications involve Satellites, infrared (IR), Wireless networking, Near Field Communications (NFC), Wi-Fi and Bluetooth LE (BLE). Thus wireless technologies have become an important part of communication devices regardless of its purpose of usage. The sudden increase in the use of IoT applications have made NFC and IR almost become non-existent. The present trend and viable option in cellular connectivity for IoT devices is the use of 5G network connections. The use of Bluetooth and Wi-Fi can be compared against various factors. Firstly considering privacy, in case of Wi-Fi connection, the device constantly searches for the Wi-Fi network which helps to track and monitor. On the contrary, in case of BLE, the Bluetooth facility needs to be switched on to allow location detection. BLE offers more privacy and freedom in terms of sharing the data in public. Secondly, in terms of speed, BLE is better for transmitting smaller amounts of data such as sensor readings of temperature, GPS coordinates, acceleration details which is ideal in case of agricultural spectrum. Thirdly, in case of location detection, BLE remains to be the ideal option for micro-locating in comparison to Wi-Fi which lag the capability to penetrate through solid objects. The proximity detention also is more accurate in case of BLE within the proximity of 30 meters which can extend up to 100 feet when connected with external antennas. Finally, the most important advantage of BLE is its lower power consumption and deployment cost in comparison to Wi-Fi [17]. The main features of different versions of BLE are presented in Table II.

B. Types of Unmanned Aerial Vehicles

Here different types of UAVs are discussed.

TABLE I SUMMARY ON EXISTING WORKS.

Ref.	UAV Review Area /	Explored Topics or Methodologies	Limitations
[7]	Application Area Precision Agriculture	- UAV applications relevant to Soil Mapping, Production Mapping, GPS, Geographical Information System (GIS) in precision agriculture - Characterization of different types of UAV based on technical	- A UAV based decision support system could be included.
[8]	Precision Agriculture	specifications and payload - Integration of UAVs and federated wireless sensor networks (WSN) for crop monitoring - Designing of UAV trajectories for efficient data collection - Implementation of consensus and symbolic aggregate approximation algorithm at network level for transmission of data	- Aspects of energy efficiency and computing efficiency are not considered
[9]	Smart Farming	 Role of UAV in smart agriculture emphasizing on irrigation, fertilization, pesticide usage, weed management, plant growth and disease monitoring, field level phenotyping Use of UAV in complex agricultural environment management 	- The integration of various other technologies with UAV in agriculture is not included
[10]	Smart imagery in Precision Agriculture	- Application of UAV thermal RS in plant water stress, plant disease management, estimation of crop yield and plant phenotyping	- Use cases relevant to Integration of thermal RS in UAV and integrating it with other tech- nologies for better decision making could be included
[11]	Precision Agriculture	 Presentation of a satellite imagery refinement framework using deep learning The algorithm analyses high Resolution image data collected by UAV 	Various other implementations of UAV image dataset in association with deep learning technique could be discussed The results could be compared with the traditional state of the art algorithms

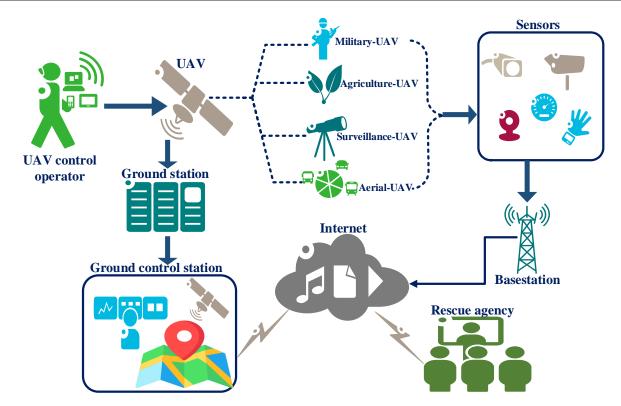


Fig. 1. UAV monitoring system.

TABLE II

OVERVIEW OF BLUETOOTH TECHNOLOGY [15].

Version	Range(Meters)	Power Consumption	Radio Frequency	Connection Time	Data Speed
Version 1.X	10 meters	100mW	2400-2483.5MHz	>100ms	1Mbps
Version 2.X	30 meters	10mW	2400-2483.5MHz	50-100ms	3Mbps
Version 3.0	30 meters	2.5mW	2400-2483.5MHz	50ms	24Mbps
Version 4.X	60 meters	1mW	2400-2483.5MHz	6ms	24Mbps
Version 5.X	240 meters	0.01-0.50mW	2400-2483.5MHz	3ms	48Mbps

Multi Rotor UAVs: These UAVs are mostly used for applications like aerial surveillance, photography etc. These are easy to manufacture and are the cheapest of all kinds of UAVs. Different categories of Multi Rotor UAVs are Tricopters which have 3 rotors, Quadcopter which have 4 rotors, hexacopter which have 6 copters and octocopter with 8 rotors [18]. Some of the limitations are limited flying time of 30 minutes, limited speed, so they are not suitable for projects such as long distance surveillance and aerial mapping.

Fixed wing UAVs: These UAVs are controlled autonomously without a human pilot on-board. They have average flying time of 2 hours and some of the recent Fixed Wing UAVs can fly upto 16 hours. They are ideal for long distance operations. Some of the limitations are high costs and highly skilled training to operate. They need runway for launching [19].

Single Rotor UAVs: These category of UAVs look very similar to the helicopters. These UAVs have only one huge rotor and a smaller one near the tail of the UAV. They can fly for higher amount of times compared to multi-rotor UAVs. Some of the limitations are more complex and prone to operational risks, higher costs.

Hybrid Vertical Take-off and Landing (VTOL): These UAVs are a hybrid of fixed wing UAVs and rotor based models. These UAVs are equipped with sensors and can be controlled remotely [20]. Table III exhibits commonly used agricultural UAVs.

If the objective is to have a small camera maneuvering in the air for a shorter period of time, multi-rotor is an ideal solution. Multi-rotors are the cheapest and easiest solutions which provide much better control and framing suitable for aerial photography. On the contrary, the disadvantages include limited durability and speed. Also multi-rotors are basically inefficient, requiring a lot of energy and power to fight against gravity. Fixed wing drones use wings like normal helicopters to help the drone lift up and move forward. These drones use energy only to move forward but not to hold up against the gravity. The disadvantages include its disability to hover in a single spot required for capturing aerial photography. Single rotors have one rotor and a tail rotor that controls its heading. These are much more efficient than multi rotors, powered by gas motors for longer endurance. The fixed wing hybrid is a device that holds the benefits of a fixed wing with the ability to hover [21].

C. Types of Agricultural Sensors

In this section, sensors suitable for smart farming are explored and discussed:

1) Location-based Sensors: Location sensors are used for locating different areas and spots in the agriculture fields [22], [23]. The farmers utilize various locations sensors that help them during the different stages of the life cycle of crops. Normally, GPS receivers are used for finding the longitude and latitude of a particular point on the earth's surface with the help of a GPS satellite network. These smart location sensors play an important role in precision agriculture by pointing out the location in fields of monitoring growing crops for watering, fertilization, and treatment of weeds.

- 2) Electrochemical Sensors: These sensors are used to extract a composition from a particular biological sample such as plants, soil etc. [24]. In smart agriculture, these sensors are generally used to detect pH levels and soil nutrient levels where sensor electrodes detect specific ions within a soil.
- 3) Temperature and Humidity Sensors: Temperature and humidity are among the most important weather factors which directly affect the health and growth of all types of crops. Correct measurement of these environmental factors is helping the farmer adjust the quantity of fertilizer and water [25], [26]. Various types of temperature, humidity sensors are available which helps the farmers to measure and monitor the levels of humidity and temperatures of their fields and greenhouses. These sensors are wireless-enabled and battery operated.
- 4) Optical Sensors: These sensors work on the principle of converting light rays into an electrical signal [27]. There are several optical sensors (such as RGB camera, converted near-infrared camera, six-band multispectral camera, high spectral resolution spectrometer etc) that have been used in UAVs for precision agriculture related applications [28]. A brief description of few sensors working on this principle are as described as the following.
- (a) Visible Light Sensors (RGB): Visible Light Sensors (RGB) are most popularly used by UAVs in precision agriculture and related smart agro applications. It is a recognized fact that human eye is sensitive to red, green and blue bands of light. The RGB sensor in UAV camera captures the image such that they reproduce the same effect as seen with a human eve. Also, the costs of the RGB sensor based cameras are relatively affordable, light weight and extremely good at creating orthomosaic maps that captures images and aerial videos of the entire field at a single instance. This enables to take quicker observations and after entering the geographical data into the GPS, one can immediately get into the root of the problem without affecting the entire field [29]. The RGB cameras thus help in detailed inspection of agricultural assets efficiently and effectively in varying weather conditions. The associated challenges of this sensor include its inadequacy to analyse large number of agro parameters requiring spectral information existing in non-visible spectrum.
- (b) Multi-spectral Sensors: Multi-spectral sensors are extremely appropriate for UAV based agricultural analytics. These sensors capture images with exceptional spatial resolution and also possess the capability to determine reflectance in near infrared [30]. Thus these sensors are very effective and essential for farmers, researchers and agronomists. The collection of multi-spectral data is an absolute necessity for performing analysis of crop health. The multiple bands of light enable researchers to conduct precision analytic and produce insights on plant vigor, canopy cover, leaf and various other parts of the plants. The absence of such multi-spectral data would make early detection of plant diseases, weeds, pests and calculation of vegetative biomass almost impossible.
- (c) Hyper-spectral Sensors: Hyper-spectral sensors are extremely capable of capturing detailed images in the spectral and spatial range. These sensors are equipped with area detectors that quantify the captured light resulting from the conversion of incident photons into electrons. The conver-

TABLE III

TYPES OF SMART AGRICULTURE UAV'S WITH SPECIFICATIONS.

Agriculture UAVs	UAV Type	Potential Application	Nominal Coverage	Type of Sensor	Specifications
eBee SQ	Fixed wing	RGB imagery, Spanning vast areas of every flight, Soil Temperature	500 acres	Quoia multi-spectral sensor	1.1 kg, 4900mAh
Sentera PHX	Fixed wing	Weed management, Pest management, Crop health monitoring	700 acres	Ultra-precise Real-time kinematic (RTK) GPS Double 4K sensor	1.8 kg, 5200mAh
Lancaster 5	Fixed wing	Plants counting and number, As- sessing plant quality, Creating pre- scription maps	300 acres	RGB, 3-Band multispectral, and Thermal sensors	3.55 kg, 5000mAh
HoneyComb	Fixed wing	Navigating, Surveillance, Soil H ₂ O levels, Air pressure	600 acres	Normalized difference vegetation index (NDVI), Visual stereoscopic, Near- infrared (NIR)	1.1 kg,8000mAh
AgEagle RX-60	Fixed wing	Aerial Imaging, Crop health monitoring, Maps prescription	400 acres	NIR sensors	3.17 kg, 5500mAh
Dji matrice 600 Pro	Multi rotor	Plants counting, Navigating, Aerial photography	50 to 100 acres	IR, NIR, Forward looking infrared (FLIR)	10 kg, 6000mAh
Dji matrice 210	Multi rotor	Firefighting, Pipeline inspection	50 to 100 acres	Light detection and ranging (LiDAR)	6.14 kg, 4920mAh
Sentera NDVI	Multi rotor	Crop health monitoring, Plants counting	50 acres	LIDAR, GPS	1.9 kg, 5000mAh
AgBot	Multi rotor	Plant height, Assessing plant quality	75 acres	NDVI, FLIR	4.26 kg, 7000 mAh

sion is achieved using two sensors – charge coupled device (CCD) sensors and complimentary metal-oxide-semiconductor (CMOS) sensors. The successful use of hyper-spectral sensors in UAV is possible through the availability of pre-built systems constituting of the sensor manufacturer, the UAV manufacturer and the party responsible for system integration at the pre and post flight level [31]. The combinations of all these three aspects ensures commercial success of the hyper-spectral sensors in measuring hundred bands, performing data processing and achieve decision making in agriculture and forestry.

(d) Thermal infrared sensors: Thermal infrared sensors help to capture the temperature of the objects, generates the images and displays the same based on the information collected. Infrared sensors and optical lenses are used in thermal cameras to capture thermal energy. Normally all objects with temperature greater than absolute zero discharge infrared radiation at particular wavelengths in proportionate to their specific temperatures. The thermal cameras detect the radiations relevant to their wavelengths and converts it to grayscale image generating heat in this process [32]. There exist thermal sensors capable of generating colored images in which warmer images are presented in yellow color and cooler ones in blue color. Thermal sensors are widely used for many agricultural related applications such as monitoring of various conditions of crops and soil. The applications of these thermal sensors mounted on UAVs are irrigation management/scheduling by calculating the soil and crop water stress, detection/prediction of various crops disease [33], [34] (e.g., pathogen), mapping soil texture, crops maturity monitoring for harvesting, localization's of tiles and crops yield mapping etc.

(e) The range in the spectrum used by optical sensors and crop response: The electromagnetic spectrum ranges from gamma-rays to radio waves. The optical sensors used to monitor crop fluorescence generally work in the visible light and in the infrared portion of the spectrum and combine at least two wavelengths to evaluate statistical parameters. From

a sustainable agricultural point of view, light energy is directly related to chlorophyll concentration, the capture of blue, red lights, and the projection of green light, which makes people realise that plant species are green. Infrared light that is not apparent to the naked eye, is reflected by mesophyll cells, which are seen in more quantities in a plant than chlorophyll, resulting in much greater brightness than effective shading. It is important to compare the colour and biomass yield of the crop using both wavelengths. In reality, brighter and high biomass plants are more likely to have higher productivity [32]. In sum, Table IV illustrates different types of agriculture sensors.

III. APPLICATIONS AND CASE STUDIES OF UAV IN AGRICULTURE

A. Potential applications of UAV in Smart agriculture

We presently belong to the era of modernization movement where new technologies are being embraced in every sphere of life with promises of better yields and efficiencies. Adaption of UAV in agriculture is an approach to reduce manual farming labour and thus allowing detailed observation of the cultivation field being unnoticed below the coverage of clouds [35]. The additional benefits includes accelerated deployment, capturing of high resolution images in minimal cost yet performing all the activities similar to a piloted high altitude craft ensuring high safety. The UAVs are equipped with sophisticated and specialized sensors that make immensely powerful in capturing images of high spatial and temporal resolution. These images help in achieving better insights on the farming resources and livestock thereby providing more accurate and consistent data for better decision making. UAV technological advances in the agricultural sector have become extremely important due to the high population growth rate and the resulting stress on crop production. A variety of agricultural UAV applications are available, such as soil and field analysis, planting, crop

TABLE IV
TYPES OF AGRICULTURAL SENSORS.

Sensor	Available agriculture sensors	Power consumption	Connection time	Data rate	Potential applications
Location-based	GNSS receivers, using	battery operated	NA	NA	Precision Agriculture Management,
Sensors	the GPS, GLONASS,				Localization
	Galileo, BeiDou				
Optical Sensors	Cameras, NIR, LiDAR	battery operated	1 min	5 Mbps	Precision agriculture, Soil properties measurement (e.g., moisture, clay), Detection/Prediction of various crop diseases, Crops maturity monitoring, Crops yield mapping
Temperature and humidity sensors	Wireless Temperature and Humidity sensors	battery operated	NA	NA	Agricultural fields and greenhouses temperature and humidity monitor- ing and measurement. Adjustment of fertilizer and water quantity

spraying, crop monitoring, health assessment, etc. The various UAV models and relevant sensors used in agriculture are presented in Table V. UAVs have huge scope of application in agriculture and some of the major implementation areas are discussed in the following section.

1) UAV as Sky-farmers: The use of UAVs allows farmers to monitor their fields from the sky level proving them a bird's eye view of the entire cultivation field. The observations achieved from the sky level provide critical insights on irrigation issues, soil variability and pest infestations. Considering the livestock aspect, UAVs help in counting the animals and also perform detailed study on the food patterns. The information collected from the sky levels helps the farmers to detect problems in priority in order to take the most suitable decisions to manage productivity and gain better profit margins. The crop fields are generally extremely large and hence difficult to monitor posing serious challenges to the farmers. The challenges are further aggravated with volatile weather conditions increasing the risk and labour costs of maintaining the fields. UAVs equipped with RGB or thermal imaging sensor based cameras help to eliminate these challenges. Fixed wing monocopter, Hexacopter and Quadcopters are generally used for crop monitoring embedded with multispectral or hyperspectral cameras. The UAV images are processed to generate mosaic images which are aligned for GIS integration to achieve conclusive decisions at the later stages. UAVs are also used to spray chemicals on large expansion of cultivation land in shorter time span. This type of crop spraying is efficient as it covers the plant and the soil and protects farmers from being exposed to harmful chemicals. In this case of infrared thermal imaging sensors play a significant role in the evaluation of droplet deposition to ensure uniformity in the field during spraying. Spot spraying is also done in the similar way targeting weeds. The high resolution hyperspectral, multispectral, near infrared or colour infrared sensor based cameras identify the weed positions and jet sprays the herbicide [36], [37].

2) UAVs in Precision Agriculture: UAV is quite popularly used in precision agriculture to monitor health of the crops using remote sensing technologies and image analytics. In the traditional process of applying remote sensing technique, the images are captured by satellites and manned aircrafts. The images captured are generally very expensive to be used by common farmers yet their resolutions lag quality. On the

contrary, small UAVs which are popularly known as drones, act as feasible solution providing superior quality images with the help of the hyperspectral and multispectral cameras. These images are used to derive the vegetation indices enabling farmers to monitor the crop variability and other exceptional conditions. NDVI helps to extract information on biomass levels which further helps in achieving useful insights on possibilities of crop diseases, pest infestation, nutrient deficiencies and various other aspects affecting productivity. Fixed wing UAV and rotary wing UAV are both used in precision agriculture embedded with Multipectral or thermal infrared imaging cameras [7].

3) UAV in Irrigation Monitoring: Irrigation is one of the most important aspects in agriculture and hence efficient irrigation management is extremely necessary for better productivity. One of the major issues in irrigation management is the lack of adequate and accurate data for the deployment of best practices in irrigation management. The use of UAVs helps in acquiring the important irrigation data at any point of time investing minimum costs. Instead of the conventional UAVs, micro – UAVs seem to be more appropriate in collecting high resolution image while flying in lower altitude. In irrigation monitoring, digital camera, RGB cameras, infrared cameras could be potentially used wherein the focus of the camera is set to infinite but the aperture sensitivity and shutter speed are calculated by conducting flight acquisition tests to achieve the best sharpness and light saturation of the image [38].

4) UAV in Aerial Mustering: The process of mustering involves use of aerial vehicle to locate and gather farming animals feeding across large span of land. It is basically an automation of the traditional job performed by sheep dogs or cowboys. The use of helicopters are quite common in case of extensively larger span of land, but maneuvering the craft yet maintaining the desired level of agility involves extensive training, certification, fuel costs and exposure to risk leading to casualty. UAVs have immensely helped to solve the purpose and have been succesfully used for mustering in Australia and New Zealand. These UAVs are equipped with sirens that herd the farming animals and also guide them towards milking, feeding and shelter areas. These are also commonly known as Air Shepherd drones which uses fixed wing UAV embedded with infrared cameras [36].

5) UAV is Artificial Pollination: The decrease in honeybee population has gained immense concern worldwide. Hence

TABLE V
UAV MODELS AND THEIR APPLICATIONS IN AGRICULTURE.

Application in Agriculture	UAV Model	Crop	Sensor	
Sky-Farming and Crop	Fixed-Wing, Hexacopter	Wheat, Soya, Barley, Oat and Coffee	Digital, Hyper-spectral and	
Monitoring	and Quadcopter		Multi-spectral camera	
Precision Agriculture	Fixed-Wing, Rotary-Wing	All types of crops but mainlyCorn, Soya,	RGB, Hyper-spectral, Multi-	
		Wheat, Vineyard Grapes, Potatoe, Sugar,	spectral and Thermal camera	
		Citrus Orchards, Rice, Pomegranate,		
Irrigation Management	Fixed-Wing and Quadcopter	Grapes, Mandarin, Peach, Orange, Vin-	Digital, Micro Hyper-spectral,	
		eryad, Barley, Almond	Multi-spectral	
Aerial Mustering	Fixed-Wing, Hexacopter,	Stock Mustering	Digital, Multi-spectral and	
	Quadcopter		Hyper-spectral	
Artificial Pollination	Helicopter, Hexacopter and	Rice, Apple, Almonds, Cherries, Pears,	Wind speed sensor, High-	
	Quadcopter	Tulipa	definition digital camera	

the advent of robotic pollinator has gained momentum. The National Institute of Advanced Industrial Science and Technology (AIST) have developed a mirco UAV that would help in artificial pollination using robots. These robots use an absolute innovative methodology of carrying pollen - animal hair coated with gel to transport the pollens. These UAV robots are equipped with with cameras, GPS and involves use of AI technologies. The wind power generated from the UAVs are also used to conduct artificial pollination. However, the force of the wind generated by UAV have been observed to asymmetrically disperse the pollen which acts as a challenge and future direction of research [39]–[41].

B. Case studies

1) Use Case 1: Renewable Energy based UAV for Agriculture: The first project is a potential Bluetooth embedded UAV having significant potential of application in agriculture. The case study emphasizes on importance of uniformly disseminating pesticides and fertilizers in cultivation fields using UAV. As presented in Fig. 2, the READ pesticide spraying hexacopter is used for spraying in the cultivation fields in this case reducing significant manual labour and work load ensuring optimum security for the farmers. The farmer basically can control the mirco - UAV or drone using an android application with the help of a Bluetooth module. The Bluetooth module helps the farmer get connected to the app that is interfaced in the drone. Drones or UAVs normally operate remotely wherein the operator focuses on the visual contact with the aircraft or maneuvers the craft through pre-programmed paths using GPS. The craft typically follows the route of the cultivation land using GPS. The Arduino board being an prototype open source electronics platform is embedded or interfaced with the Bluetooth module and the GPS. The other important aspects of being aerially stable, balanced and oriented are managed by the use of accelerometer, magnetometer and gyro. To achieve energy efficiency instead of using bio-fuel and hydrogen fuel cells, solar technology is a potential solution which would increase durability yet ensure the craft is light weight to maintain its agility. Hence installation of solar panels would provide additional power and increase flight time for the UAV. If the durability, flight time and power is enhanced the coverage of land area by the UAV would automatically get increased. Thus the above mentioned UAV framework would

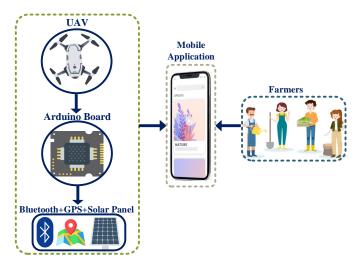


Fig. 2. Renewable energy based UAV in smart farming.

definitely act as a potential UAV solution with higher efficiency, reliability in reduced cost. This Bluetooth embedded UAV has potential applications in crop monitoring, precision agriculture, spraying, irrigation management and crop planting [42].

2) Use Case 2: Bluetooth Embedded UAV for Air traffic Control: With the increasing popularity of UAV adaption in agriculture and other domains, there will eventually arise a situation where UAVs will start competing for space and the emancipating experience of flying UAVs will perish. The result of such aerial congestion would be disastrous leading to unprecedented collisions and quadcopter damages with huge loss of infrastructural resources. To eliminate such issues, Intel has come up with a cutting edge Bluetooth technology which would enable UAVs to broadcast their specific aerial location so that other similar crafts or devices can maintain safe distancing in real time. As depicted in Fig. 3, the safety protocol installed in this framework ensures constant communication between the UAVs thereby transmitting static and dynamic frequencies at different frequency levels. The quadcopters are tagged with unique IDs to allow seamless tracking and the location data is transmitted to the connected application. The adaption of Bluetooth technology would ensure accurate detection of the aerial device to the range of almost 2,625 feet in low cost with efficient implementation [43]. However,

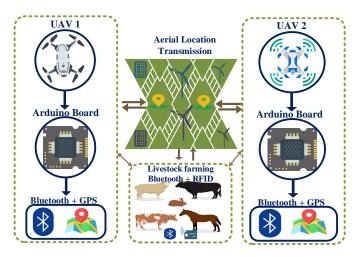


Fig. 3. Bluetooth enabled UAV for Livestock Monitoring.

a major challenge of such implementation in crowded locations would be difficult considering the receding strength of Bluetooth signal due to obstructions. The falcom like structured UAVs embedded with Bluetooth developed by Intel has the aforementioned Bluetooth empowered safety feature which enables wireless communication between quadcopters and also shares data pertinent to speed, altitude, direction, model between UAVs. This type of UAVs are predominantly used in live stock management. With the advancement in farming, The cattle are implanted with RFID tags embedded with Bluetooth technologies which are used for monitoring and tracking in case the cattle are lost or strayed. Similar RFID tags could be used for the monitoring of habits and movements of livestock using Bluetooth based safety features in UAVs. These UAVs when connected with android applications, iOS or OS could provide alert at the beginning of calving and also when there is an exceptional amount of delay in the calving process generating an alert to introduce timely interventions. Also in case of attacks by ferocious predators, the same alert system is equally beneficial preventing cattle mortality.

3) Use Case 3: Bluetooth Embedded UAV for Self Sustained Ecosystem: There has been various successful implementations of UAV in varied sectors of agriculture which supports the basis of human survival and sustenance. As an example UAV implementations have been predominant in Crop Irrigation, Agriculture Spraying, Aerial Mapping, Livestock Management and also in Pest Control. However the future lies in the integration of all these applications could build a self sustained ecosystem eliminating human interventions. The framework in Fig. 4. presents a UAV based framework involving the use of an UAV Agriculture control system that would perform all the aforementioned agriculture tasks. The control system would be incorporated with the UAV platform constituting of sensors, auto drivers, simulators, auto flight controls all which would communicate through wireless communication to perform individual tasks. The monitoring of the operational environment and control of the UAV would be conducted using drone controllers and wireless communication with the base stations. To perform all of these activities effectively and efficiently, the hardware to be used to operate the drone and the other devices would play an extremely important role. The framework would include use of various multi-spectral, RGB, optical, thermal infrared users that would help to capture information to instigate actions. The flight control and vision guidance software would be used to monitor and track the vehicular movement and action. The objective would be have a system wherein the drone would automatically perform irrigation as per the soil needs, perform agricultural spraying of seeds and fertilizers, spray pest control specifically on affected regions, conduct aerial mapping and also manage livestock automatically without farmers physical intervention. This would enhance the agroeconomic condition of the farmers and contribute towards improvement in agricultural production of the country.

IV. REQUIREMENTS

In this section, we have highlighted the key requirements of employing UAVs in smart agriculture.

A. Regulation of UAVs

Regulation of operating UAVs worldwide is one of the fundamental requirements for its successful integration with the smart agriculture. There are many countries where operating UAVs is not allowed due to several reasons. There are few organisations such as, Technical Centre for Agriculture and Rural Cooperation (CTA) which has published certain laws of using UAVs for agricultural purposes but as per [44], still around 73 percent of African, Caribbean and Pacific countries (ACP) countries does not have any regulation or law with remaining percent having few laws. Similarly, Electronic Communications Committee (ECC) within the European Conference of Postal and Telecommunications Administrations (CEPT) published the report on regulatory aspects of UAVs in Feb 2018 and is under study [45]. Hence, until the regulation of using this technology are not published world-wide, it would be quite difficult for the farmer communities to get benefit from the technology.

B. Network Availability

Availability of network is yet other one of the core requirements for using UAV in smart agriculture. Although sending data via Bluetooth Smart from UAV back to the smart phone does not require an internet connection but sending that data to some other platform such as cloud or any storage platform will require strong internet connection and bandwidth. A slight glitch to a strong network or a weak network for real-time application within smart agriculture scenario will have serious consequences for farmer communities. Wireless networking technologies such as 5G and software-defined networking can significantly improve the overall scenario in terms of routing and strong internet connection [46], [47].

C. Data Storage

There are numerous applications of utilising UAV in smart agriculture such as precision agriculture, irrigation monitoring

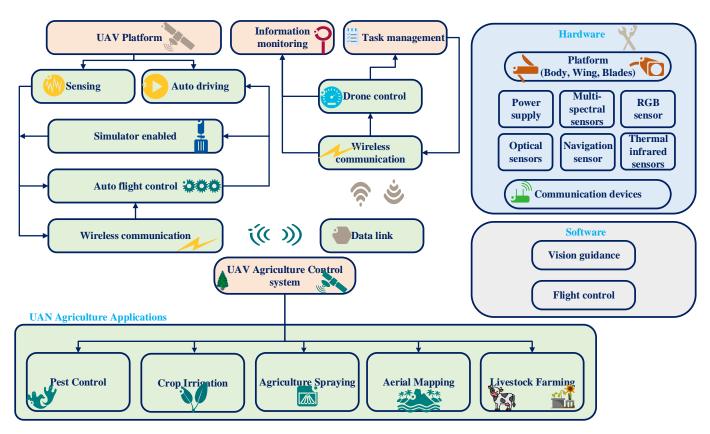


Fig. 4. UAV Agriculture Control System.

etc., as highlighted in section IV. All these applications involves numerous operations such as capturing high-definition images, extracting log-files, analysing data and so on. All these operations require immense amount of data storage especially if the storage is static where there is no internet connectivity and the data needs to be stored within UAV itself. Mostly, the UAVs are equipped with inbuilt storage capacity of 2 gigabytes to 4 gigabytes with a latest quadcopter i.e. DJ1 Mavic Air (comes with 8GB of storage) which might not suffice for storing data related to agricultural activities. Hence, cost-effective and secure data-storage is one of the core requirements for utilisation of UAVs in smart agriculture. Although, cloud-based solutions such as [48]–[50] might be the solution but that also requires strong internet connection which is not always available. Therefore, an alternate low-cost solution based on new technologies such as virtual storage, software-defined storage etc., might be the feasible solution.

D. Security and Privacy

The other foremost requirement is securing the data from cyberattacks and maintaining the privacy during the operation. There are number of cyberattacks possible while UAV is performing its required task. Attacks such as Wi-Fi-based including Eavesdropping, denial of service (DoS), information injection etc. can severely affect the whole operation. There are number of studies such as [51]–[53] where all types of such attacks are identified. With respect to privacy, there are concerns as well such as taking photographs secretly of properties surrounding the agriculture land, spy-related concerns etc.

Therefore, tedious efforts are needed to address these concerns. Blockchain-based solutions [54], [55] seems potential solution for addressing the security concern. For addressing privacy concerns, well-laid regulations seems viable option but other solutions also needs to be explored.

E. Efficient and Low Energy Consumption

A typical UAV can fly on a stretch for about 15-25 minutes on a single battery [56]. There are several heavy applications in smart agriculture such as livestock monitoring, sending data in a real-time for analysis, monitoring soil moisture, weed detection, humidity monitoring etc. which requires more complex operations. Such complex operations (e.g., long flight-duration, taking high resolution images using infrared, multispectral and hyperspectral sensors etc) will require more processing power and consume more battery-life of an UAV. Therefore, UAV with high energy-consuming feature will decrease the overall efficacy of applications within smart agriculture.

F. User Acceptance of UAV technology

Acceptability of UAV based technologies in agriculture is often an issue due to the absence of a standardized workflow affecting its popularity. Also, UAVs have shorter flight time ranging between minutes to an hour which does not suffice the requirement for acreage coverage expected by the farmers. The range of the flights are also limited to certain radius per flight time. Secondly, the agricultural UAVs use the same airspace

as any general manually operated aircraft which increases chances of inference. With the initial installation cost of UAV being high, if such exceptional incidents occur, the associated financial loss would be enormous. Hence traditional farmers think twice before accepting such technologies. Last but not the least, the images captured by UAVs require analysis by skilled professionals to achieve valuable information. An average farmer often feels intimidated to use such sophisticated technology and would find it difficult to adopt even after training is provided.

G. Operational Ethics

Ethical issues in the use of drones are primarily based on two factors - firstly the activities performed by the UAV and secondly the consequential actions performed by the person using the information collected by the UAV. Thus, the action of the UAV can be evaluated depending on the intention and actions performed by the individual controlling the UAV. The use of UAVs are always subject to evaluation unless it is completely automated with absolutely no human interventions. Agricultural sector has always been very open towards acceptance of autonomous operations as the perceived risk factor is quite low. But considerations of occupational health and safety have often been ignored. There is an dire need for regulatory bodies to monitor and control the results produced by technology. The use of data collected by the UAVs are mostly unregulated and are prone to be collected unethically, used by unauthorized corrupt individuals or hacks for the fulfilment of selfish personal gain. This could lead to facilitation of illegal activities providing information about wild life, cultivation and law enforcement efforts to immoral individuals. Naturally local population would tend to avoid or become hostile towards the use of such technology being deprived of its benefits [45], [57].

H. Accuracy of Results

Although farmers have been extremely keen in adopting UAVs in agriculture the accuracy of UAVs data collected in agriculture is often questionable. The use of drones and UAVs allow farmers to monitor the crops from the air effectively. The robotic tractors connected to the UAVs are used to irrigate and fertilize the identified cultivation lands in minimized time frame. This process involves the use of multi-spectral imaging sensors which measures energy reflected from the crops within the specific sections of electromagnetic spectrum. But often the results may not be as reliable as perceived due to the erroneous technique of collecting images from the drones using the multi-spectral sensors. The inconsistencies of the UAV altitude and the angle of sun have significant impact on the results generated, unless controlled by skilled professionals. These inconsistencies have high risks pertinent to generation of erroneous results in comparative analysis of reflections in tree canopies, mild variations of vegetation and predictions leading expensive consequences for the farmers.

V. CHALLENGES AND FUTURE RESEARCH DIRECTIONS

In this section several challenges faced by the proposed BLE enabled UAVs for agriculture are presented that will guide the future research on usage of UAVs in agriculture.

- 1) Short remote-range of BLE: One of the most interesting challenges is short range of BLE. As specified earlier, the maximum range of latest BLE version is 100 meters which is quite low for a large farm lands. To solve this challenge, a distributed sensing and actuation network of BLE-enabled UAVs can be formed [58] where master UAV will be controlled by a farmer directly and other UAVs will act as slaves located at an appropriate distance from each other. However, achieving synchronisation between master and slave UAVs, minimizing latency, achieving healthy data-transfer rate etc. are few of the challenges that requires tedious research efforts.
- 2) Achieving Higher-Data rates for Dynamic Storage of Data: There are different versions of BLE available with Version-5 having theoretical data-rate of 24 Mbps which is much better than its predecessors. In smart farming, there are several applications such as live-stock monitoring which requires much higher data-rate for data-transfer. As more advancements are coming in BLE versions, it is expected in future BLE-versions with much higher data-rates will be available. Therefore, before utilising BLE-controlled UAVs for smart agriculture, data-rate needs to be enhanced. With data-rate of merely 24 Mbps, dynamic storage of data into cloud or edge-based platforms seems impractical. A single image from high-definition camera using location-based sensors is more than 24 MB in size. Therefore, to store multiple images in a real-time scenario on a Cloud/Edge-based platforms is not possible unless and until higher data-rates are achieved.
- 3) Interference: BLE uses the frequency range of 2.4 GHz. This range is also used by Wi-Fi, Zigbee and regular Bluetooth technologies. Hence, there is a huge risk of interference and reduced latency when the number of devices operating on this frequency rises. Due to the interference, the devices might get disconnected abruptly or perform poorly. Although farm lands are remotely isolated in rural areas where the possibility of interference is low, this challenge needs to be addressed keeping the concept of future smart cities into consideration where farm lands will be incurred as well. One of the common way of mitigating interference include removing barriers such as metal, concrete, glass etc.
- 4) UAV Technology Acceptance: The success of any technology depends upon its user's acceptance. Adaptation and accurate usage of high tech and sophisticated technology like UAV's require skills and knowledge. The usage of UAVs by the farmers with limited or no skills is a challenging task. Moreover, successful acceptance of any technology also depends upon the willingness to use it by its consumers. High skill requirements for flying UAVs by the farmers with no or limited flying skills will also affect the willingness of use. Another factor that may affect the acceptance by UAVs is to ensure the privacy of others while using these UAVs. Ensuring the privacy of others and to avoid any legal implication faced due to privacy violation may also hinder the acceptance of these UAVs in agriculture. Therefore, it is very challenging to encourage and motivate the farmers to

accept the UAVs. So there is a need to design and develop effective user acceptance models which identify and provide solutions for ease of use, willingness to use and ensuring the privacy of others for successful adaptation and usage of UAVs in agriculture and to get full benefits from these high tech, sophisticated technologies.

5) UAV Industry Implementations: Agriculture happens to be one of the most important and crucial elements of human sustainability. The forecast says that the agricultural consumption is likely to increase by 69% from 2010 to 2050 due to the increase in human population. Hence meeting this ever increasing food demand remains a challenge and thus optimization of land spaces, maximization of productivity and ensuring sustainability is an absolute necessity. The concept of precision agriculture thus evolves where drones are used as an equipment for data collection. As an example, the ideaForge drones help in crop health monitoring, detection of crop diseases, performs soil analysis and could be used in different weather conditions which makes them the ideal choice for precision agriculture. The extensive use of drones in varied agricultural activities such as seeding, spraying and live-stock farming have caught the attention of venture capitalists who have shown enthusiastic interest in funding for UAV manufacturing. Companies such as Qualcomm Ventures (US), Draper Associates (US), Google Ventures (US) and Andreessen Horowitz (US) have funded UAV manufacturing projects. The Switzerland based company GAMAYA has developed a drone embedded with hyperspectral imaging camera. The company offers this system enabled with remote sensing, machine learning and crop science technologies wherein the camera is mounted on the light UAV. The hyperspectral camera helps to reflect light from the plants and also captures 40 bands of color within the infrared light spectrum. The camera reveals the fact that plants having different physiologies and characteristics reflect light in varied patterns which can be analysed. The application implements a machine learning algorithm to process the image data by comparing the captured images with the existing ones saved in the database, assigning them a specific color based on the conditions. As an example, red could indicate soil deficiencies, white as insects, black as a healthy crop which thereby helps to create maps of the condition of crops and soil [59], [60].

VI. CONCLUSION

In this article, the architecture, adaptation and usage of UAVs in smart agriculture have been explored and presented. It is evident from the contents of the paper that application of UAV and related technologies has immense contribution in the enhancement and optimization of various processes involved in agriculture. The use of UAVs impact on the cultivation process by performing efficient monitoring and spraying activities thereby optimizing the capabilities of pesticides and fertilizers. The strength of the paper lies in the presentation of Potential case studies involving Bluetooth Smart-enabled sensors and UAVs in smart agriculture which have been discussed explicitly. Bluetooth Smart technology can be replaced with any other technology for implementation purposes. The motivation

of using Bluetooth Smart in case-studies is the low-cost and ease of access via smart phones. The paper also explores the various types of agricultural sensors such as location-based sensors, optical sensors, temperature-based sensors, etc, and identifies several applications of UAVs in smart agriculture. Besides, the key enabling requirements of UAVs are identified in smart agriculture including acceptance of technology by farmers, accuracy of results, network availability, data storage, regulation of UAVs, and many others. Finally, key research challenges and future directions have been highlighted and discussed.

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