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RECEIVED 30 August 2023 ACCEPTED 24 September 2024 PUBLISHED 07 October 2024

CITATION

Gryech I, Vinogradov E, Saboor A, Bithas PS, Mathiopoulos PT and Pollin S (2024) A systematic literature review on the role of UAVenabled communications in advancing the UN's sustainable development goals. *Front. Comms. Net* 5:1286073. doi: 10.3389/frcmn.2024.1286073

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A systematic literature review on the role of UAV-enabled communications in advancing the UN's sustainable development goals

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Unmanned Aerial Vehicles (UAVs), commonly known as drones, show great potential in advancing the United Nations (UN) Sustainable Development Goals (SDGs), a collection of 17 worldwide targets outlined by the United Nations (UN) to tackle diverse social, economic, and environmental issues and foster sustainable development by 2030. As per the Federal Aviation Administration (FAA), UAVs can significantly improve areas of sustainability like wildlife and wildfire monitoring, precision agriculture, as well as healthcare. Furthermore, drones with communication capabilities are seen as key elements of non-terrestrial networks, and as enabling technologies for future 6G communication networks. This systematic literature review focuses on the role of UAV-enabled communications to achieve the SDGs. Our study is based on a thorough selection and analysis of scientific articles. Initially, we performed a broad search across three major databases: IEEE Xplore, Web of Science, and Scopus, yielding a set of 10,499 papers. Following a strict selection methodology (Preferred Reporting Items for Systematic Review and Meta-Analysis - PRISMA), we narrowed this set down to 28 key journal articles. Our analysis highlights six global targets that greatly benefit from UAV-enabled aerial communication. In order of impact, these are: "Sustainable Cities and Communities," where UAVs improve security and disaster management; "Life on Land," where drones help with wildlife monitoring and reforestation; "Industry, Innovation, and Infrastructure," where UAVs (Unmanned Aerial Vehicles) aid in infrastructure inspection; "No Hunger," where drones improve agricultural practices; "Good Health and Wellbeing," where UAVs assist with disease prediction and monitoring; and "Clean water and sanitation," where drones play a crucial role in efficiently monitoring water quality and distribution. In summary, this paper offers a detailed look at the applications of UAVs in achieving the SDGs through aerial communications. By identifying areas of major impact and spotting gaps and weaknesses in current research, this review article aims to guide future research and policy-making in sustainable drone applications.

KEYWORDS

aerial communication, drones, industry, innovation and infrastructure, sustainable cities, sustainable development goals, unmanned aerial vehicles

1 Introduction

Keeping economic growth without compromising the environment's wellbeing is the essence of long-term sustainability Policy and Staff (1990). Yet, sustainability encompasses more than preserving nature; it implies fostering a harmonious coexistence between businesses, government entities, and society. Sustainable Development Goals (SDGs), refer to a set of 17 global objectives established by the United Nations (UN) in September 2015. Part of the 2030 Agenda for Sustainable Development, these goals tackle social, economic, and environmental challenges worldwide. The objectives aim to promote prosperity, protect the planet, and ensure universal wellbeing, designed inclusively for both developed and developing countries. Adopted by all 193 UN member states, the SDGs form a comprehensive framework for global sustainable development (United Nations Development Programme, 2023). These SDGs are built upon five core pillars: people, planet, prosperity, peace, and partnership. Each pillar embodies multiple goals, reflecting distinct sectors. A summary of the 17 SDGs is provided in Table 1.

In this global journey, Goal 9 plays a pivotal role, with around 70% of the world's SDGs targets potentially achieved through advancements aligned with this Goal (World Economic Forum, 2020). One of the cornerstones of innovative infrastructures is the telecommunications sector, underlining its significance in propelling sustainable development (European Commission Decision C, 2023). However, achieving the many targets set by the SDGs requires not just established technologies but also innovative solutions for communication, infrastructure, and inclusion.

Within this context, the emergence of non-terrestrial networks (Geraci et al., 2022; Azari et al., 2022) becomes notably significant. These networks, relying on aerial communication technologies, are proving to be catalysts in shaping the future of telecommunications (Javaid et al., 2023; Akyildiz et al., 2020; Tataria et al., 2021). Moving beyond conventional limitations, these networks offer ingenious solutions to some of the most pressing global sustainability challenges. By extending the network coverage, and by interconnecting devices seamlessly and flexibly (Vinogradov et al., 2018; Akhtar and Saeed, 2023; Giordani and Zorzi, 2021), they have the potential to not only transform industries and economies but also contribute significantly to the realization of sustainable development goals. Hence, this study embarks on a systematic literature review to unveil how aerial communication technology and non-terrestrial networks contribute to achieving sustainable development.

There have been some earlier studies in the general area of this topic. For instance, (Wu et al., 2018), outlined the important initiatives and research activities while introducing the history of sustainable development. Additionally, the authors looked into how Information and Communications Technologies (ICTs) can help achieve the SDGs. Following thorough reviews of the literature on SDG-related research initiatives and activities, they have concluded that the vast majority of contributions to SDGs have mainly focused on the technical aspects, lacking comprehensive social good perspectives. Furthermore, the same paper only took into account

SDG Goal	Brief Overview
Goal 1- No Poverty	End poverty in all its forms all over the world.
Goal 2- No Hunger	End hunger, achieve food security, and promote sustainable agriculture.
Goal 3- Good Health	Promote well-being for all, at all ages.
Goal 4- Quality Education	Ensure inclusive and equitable quality education for all.
Goal 5- Gender Equality	Achieve gender equality and ensure women and girls inclusion and empowerment all over the world.
Goal 6- Clean Water and Sanitation	Secure availability, sanitation, and sustainable management of water to all.
Goal 7- Renewable Energy	Ensure access to affordable, reliable, sustainable, and modern energy for all.
Goal 8- Good Jobs and Economic Growth	Promote sustained and inclusive economic growth, full and productive employment, and decent work for all.
Goal 9- Innovation and Infrastructure	Build resilient infrastructure, promote inclusive and sustainable industrialization, and foster innovation.
Goal 10- Reduced Inequalities	Reduce inequalities within and among countries.
Goal 11- Sustainable Cities and Communities	Make cities and human settlements inclusive, safe, resilient, and sustainable.
Goal 12- Responsible Consumption	Ensure sustainable consumption and production patterns.
Goal 13- Climate Action	Take urgent action to combat climate change and its impacts.
Goal 14- Life Below Water	Conserve and sustainably use the oceans, seas, and marine resources for sustainable development.
Goal 15- Life On Land	Protect, restore, and promote sustainable use of natural resources, sustainably manage forests, combat desertification, and halt and reverse land degradation and halt biodiversity loss.
Goal 16- Peace and Justice	Foster inclusive and peaceful societies, ensure justice for all, and establish effective, accountable institutions at all levels for sustainable development.
Goal 17- Partnerships for the Goals	Enhance implementation mechanisms and rejuvenate the Global Partnership for Sustainable Development.

TABLE 1 A brief overview of the 17 SDGs (Nations, 2018).

research acknowledged by the IEEE and ACM communities during 2015 and 2016, which cannot represent all studies available. The promise of Internet of Things (IoT) with integrated sensing and communication capabilities for effective, sustainable, and knowledgeable resource management in urban and rural areas was demonstrated in a study by Abdul Salam (Abdul, 2020). This study explored the fundamental ideas of sustainable community development with a focus on communication technologies and SDGs. Nevertheless, the work was limited to the linkages between IoT and sustainability. Moreover, both previously mentioned studies do not fall under the category of a systematic literature review, nor do they conform to any known reporting guidelines, and have not examined the advantages offered by UAV-assisted communications.

On the other hand, (Saini and Jain, 2023), employed a bibliometric method to explore the widespread impact of unmanned aerial vehicles on various aspects of social life, particularly focusing on their role in sustainable development, revealing 278 relevant articles from 2014 to 2023 through the Scopus database and identifying current trends, key contributors, and emerging subjects in the field. Both systematic literature reviews and bibliometric analysis are well-known and pertinent research techniques, yet they accomplish different goals and involve different procedures. The quantitative examination of bibliographic data, publication patterns, citation counts, and authorship trends are the main focus of bibliometric analysis. Evaluating the field's impact, influence, and trends is frequently the aim. SLRs, on the other hand, are a qualitative research technique that seeks to thoroughly assess, summarize, and evaluate the body of existing literature. The purpose is to provide an overview of the current state of knowledge, identify gaps, and make evidence-based conclusion.

Our systematic literature review aims to fill these gaps by analyzing recent studies on the applications of aerial communication technologies to help build resilient infrastructure, promote inclusive and sustainable industrialization, and foster innovation. Different types of UAV-enabled communication scenarios, that have been applied in different countries and to different fields are covered in this paper. This systematic review is distinguished from other traditional or normal reviews in several key ways:

- Methodological Approach: This systematic review is conducted using a structured, transparent and replicable methodology. This study aims to improve the regor and reproducibility of the review process by using a PRISMA (Preferred Reporting Items for Systematic Review and Meta-Analysis) methodology covering indexed research from Scopus, Web of Science, and IEEE Xplore over the past 10 years (2013–2023). This will facilitate the validation of the results by other researchers and make it easier for them to follow the same methodology.
- Inclusion Criteria: This Systematic reviews have clear inclusion and exclusion criteria for the selection of studies. This minimises the possibility of cherry-picking or ignoring crucial evidence by guaranteeing that all pertinent research that satisfy the specified criteria are taken into account.
- Objective and Unbiased: This work aims to minimize bias by adhering to the SLR's determined protocol, ensuring that the



review process is conducted in an impartial and systematic manner.

- Existing Knowledge Summary: One of this work's primary contribution is providing a comprehensive summary of existing research and knowledge on the role of UAV-Enabled communications in advancing the United Nation's Sustainable Development Goals. This will help researchers and practitioners understand the current state of the field, including key theories, concepts and findings.
- Research Gaps identification: Another main goal of this study is its identification of gaps in the body of current literature. We identify topics that require more research after methodically evaluating and synthesising all of the selected papers. We also help to direct future investigations, by offering a few concepts that can be covered in upcoming research-related works.

The remainder of the paper is structured as follows. Materials and methods including research questions, data sources, and inclusion criteria are presented in Section 2. A summary of the findings of the review, as well as a detailed comparison of the methods deployed in the included literature, are synthesized in Section 3. Identified gaps and future trends are presented in Section 4, and conclusions are drawn in Section 5.

2 Materials and methods

This study consists of a Systematic Literature Review (SLR), conducted in accordance with PRISMA's preferred reporting items statement (Prisma Checklist).



The SLR process (Figure 1) is comprised of three main phases: 1) Identification, 2) Screening, and 3) Eligibility. Upon the formulation of research questions, the identification phase defines the search strategy, including the choice of data sources and extraction methods to be used for the collection of relevant papers. Inclusion and exclusion criteria aligned with the specific requirements and scope of the review are outlined in the screening and eligibility phases where papers are filtered based on titles and abstracts (screening) and full-text (eligibility). Figure 2 details the results of each phase of the PRISMA process. The answers to the research questions are then synthesized, while the challenges, opportunities, and limitations are highlighted. These steps are defined in the subsequent sections below.

2.1 Research questions

Progress made through the various aerial communication technologies shapes all sectors and has made a profound impact on all facets of society today. The development of such technologies can revolutionize the industry, result in new products and services, and contribute to a more sustainable society. Therefore, these technologies must be embraced and studied for their future impact on a sustainable future.

This systematic review identified essential research questions and, through a methodological study, tried to find relevant answers.

Database	Number of papers
IEEE Xplore	5449
Web of Science	4259
Scopus	791

Therefore, the research questions devised for this systematic review are:

- RQ1: What are the latest advancements and applications in sustainable and efficient aerial communication technologies?
- RQ2: What are the key enablers and tools of sustainable and efficient aerial communication technologies?

These key questions have been used to achieve the main contribution of our paper, namely, to conduct a systematic review of recent studies on the applications of aerial communication technologies in order to support the further development of resilient infrastructure, promote inclusive and sustainable industrialization, and foster innovation. Moreover, this paper seeks to present a thorough summary of the many forms of aerial communication technologies, the domains to which they contribute, as well as the sustainable development objectives addressed by each publication. Additionally, this paper discusses the current state of research in this field as well as its primary obstacles and opportunities.

2.2 Search strategy

To address the research questions, the authors have used three databases: IEEE Xplore, Web of Science, and Scopus. The search for relevant publications was initiated on the 28^{th} of February 2023. Updates for any additional papers were finalized on the 30^{th} of March 2023.

Using the research questions, keywords and queries were formulated according to the requirements of each scientific database used in the search. A combination of the keywords "aerial communication," "sustainable," "sustainability," "UAV," and "applied" was employed. All searches used the parameters "full-text," "all metadata," and "Document type: Journal article" when such specifications were supported by the search database. After completing the first draft of the search strings, we examined the results of each search string against each database to check the effectiveness of the search strings. The search time frame covered publications spanning the February 2013 - March 2023 period.

The initial search (Table 2) has identified 10,499 papers, 5449 of which were listed in the IEEE Xplore library, 4259 in Web of Science, and 791 in Scopus. Figure 2 illustrates the progression of studies through the screening phases. The abstract screening process resulted in 312 studies identified for a detailed review of full-text articles. After this review, we further excluded studies that did not meet the inclusion criteria, or that did not answer the research questions. We identified a total of 28 studies that met our eligibility criteria and addressed the research questions.

TABLE 3 Inclusion and exclusion criteria for paper selection.

Inclusion criteria	Exclusion criteria
Within the scope of research questions	 Does not relate to sustainable uses of space and aerial communication technologies Focuses solely on energy performance and consumption minimization Focuses on trajectory design and optimization Focuses solely on resource allocation
Within the time frame of publication	_
February 2013- February 2023	
Includes tangible application	Presents a theoretical framework
Is a journal	Paper book, conference, poster, tutorial, e-book, letter to editor, magazine, abstracts, case reports, comments, reviews, SLRs
Written in English	Other languages

2.3 Study selection and data extraction

The collected papers from the initial search were screened according to the preset inclusion and exclusion criteria (Table 3). The paper selection process consisted of 2 phases. First, based on the inclusion and exclusion criteria, the papers were independently screened by two researchers through title and abstract screening. The publications selected during this phase were then independently assessed by four authors of our paper through full-text screening. The authors cross-checked the selection results and resolved any disagreement on the selection decisions. All disagreements in either the first or the second phase were resolved by consensus, and a third (identical to the first phase) or fifth (identical to the second phase) researcher was consulted to finalize the decision.

The authors formulated the inclusion and exclusion criteria to effectively select relevant papers. The documents were analyzed to assess the latest advancements and different applications of aerial communication for sustainable development. Journal papers written in English and within the scope of the research questions were included. Commercial papers, conferences, letters to the editor, e-books, books, and Ph.D. dissertations were excluded. Papers were excluded if they were review papers or only presented a theoretical framework without a tangible application. Papers not related to sustainable uses of aerial communications were removed, papers focusing only on energy performance, and energy consumption minimization were excluded, and papers presenting only trajectory design and optimization as well as resource allocation were also excluded. The authors deemed that the aim of the review was to identify applications focusing on building resilient infrastructure, promoting inclusive and sustainable industrialization, and fostering innovation. Relevant data were extracted from the selected publications for further analysis. In order to conduct this systematic literature review, the following data was retrieved: Authors list, Titles and abstracts, Year of publication, Technical characteristics, Type and network of aerial communication used, Methods and tools applied, Country where



the study was conducted, Field of contribution covered, Sustainable development goal tackled.

2.4 Risk of bias and quality assessment

This systematic literature review followed the PRISMA guidelines to screen and select the relevant literature. The selection of keywords to use in the initial query search can be influenced by bias. Additionally, the eligibility criteria defined by the authors are prone to subjectivity and thus increase the risk of bias. However, based on the PRISMA guidelines, the authors followed the best possible criteria to complete this systematic literature review. Independent selection processes and disagreement resolution techniques were utilized to ensure that the selection of publications is both transparent and relatively objective. A quality assessment system based on consensus between authors was used to ensure that publications of high quality and substantial contributions were included. This system was based on a checklist of the following criteria:

- Are the methods used clearly defined and applied?
- Are the methods applied successfully and correctly?
- Are accuracy values and efficiency/confidence levels reported?
- Do the contributions outweigh the limitations of the study?

The search process represented by the flowchart in Figure 2 resulted in a total of 10,499 articles from all databases used. After the removal of duplicates, 10,129 papers remained. Out of which, 9817 studies were excluded after the title and abstract screening, as they did not fulfill the inclusion criteria. Out of the 312 studies that were full-text screened, 284 did not meet the inclusion criteria. Thus, finally, only 28 studies have been selected for inclusion in the current review and will be summarized in the following sections. The selection process took about 4 months to be completed and covered the 2013–2023 period span.

Nevertheless, papers using UAVs for sustainable development have been published from 2019 and onwards, as can be seen in Figure 3. The highest number of papers was published in 2022, while so far there has been a relatively large number of related publications for 2023. This number will significantly increase by the end of 2023 and it is very likely that it will surpass the year 2022.

3 Results

In order to answer the formulated research questions posed by the literature review, a goal-based classification of the applications of aerial communication technologies was conducted. Thereafter, we evaluated the tools and methods used for the selected publications.

3.1 Applications of UAV communications in achieving the SDGs

This section maps the selected papers to the SDGs, beginning with the one that garnered the least attention and progressing to the one that drew the most attention. Table 4 displays the number of publications on each SDG.

3.1.1 SDG 6: clean water and sanitation

Goal 6 strives for universal access to clean water and sanitation, alongside sustainable water resource management. It targets challenges such as water scarcity, pollution, inadequate sanitation, and unsustainable water practices globally. Achieving Goal 6 leads to improved health, economic growth, ecosystem protection, and enhanced wellbeing within communities. Among the surveyed literature, only one paper tackled this goal, introducing an energy-efficient communication design in UAVs for water distribution.

In (Radhakrishnan and Wu, 2022), the authors introduced a UAV-enabled wireless-powered communication network, capable of beamforming radio signals to a target location and using it for both communication and sensors' battery charging. The UAV energy consumption was minimized by integrating optimization and dome packing methods, which can find an optimal position and trajectory where the UAV will be hovering to direct wireless power transfer signals, as well as collect real-time data of water quality monitoring from ground sensors. This technology improves energy efficiency and security, minimizes communication costs, and reduces human interventions for battery replacements.

TABLE 4 Distribution of included papers by the sustainable develop	ment
goals covered.	

SDG	Number of included papers
SDG 6: Clean Water and Sanitation	1
SDG 2: No Hunger	3
SDG 3: Good Health	3
SDG 9: Innovation and Infrastructure	3
SDG 15: Life on Land	7
SDG 11: Sustainable Cities and Communities	11

3.1.2 SDG 2: no hunger

SDG 2 aspires to eradicate all types of malnutrition, including reaching the goals of stunting and wasting in children under the age of five, achieving food security, and promoting sustainable agriculture. This goal also aims to take care of the nutritional requirements of adolescent girls, pregnant and lactating mothers, as well as older people.

Few works covered the No Hunger sustainable development goal, they were all devoted to agriculture for different purposes. Singh and Sharma (2022), discussed the challenges climate change poses on agriculture and emphasized adapting to changing climatic conditions to increase food productivity. For that, it explored the potential of Wireless Sensor Networks (WSN) and UAVs in remote sensing to provide information about soil, water requirements, crop health, and the atmosphere. The authors suggested a four-layer architecture where the first layer is a set of small WSN clusters comprised of temperature, humidity, soil moisture, and water level sensors for data acquisition. Each cluster consists of a Cluster Head (CH) that communicates and transfers sensing data to the second layer comprising UAV. The second layer was also responsible for trajectory planning to minimize energy and time consumption. The third and fourth layers processed the data and provided analytical results to improve crop quality. Closely, an IoT and UAV-based crop health monitoring system for Saudi Arabian agriculture was presented in (Ammad Uddin et al., 2019). The suggested solution focused on resource optimization and clustering heterogeneous IoT devices for effective data collection. Several factors, including UAV trajectories, communication costs, weather, sensor heterogeneity, and variations, were taken into account when forming each cluster. The authors also introduced a virtual antenna array and dynamic clustering for data collection. The proposed system demonstrated its ability to collect data under challenging conditions and to be deployed in remote, rural locations. (Pamuklu et al., 2023). focus on enhancing smart farms through advanced task scheduling targeting processing of data collected by IoT devices (e.g., pest detection cameras) with limited energy and computing resources. To ensure timely task execution, the processing was distributed between Aerial Base Stations (ABS), acting as both task executors and data relays, and Multi-access Edge Computing (MEC) devices. Their findings highlight the reinforcement learning (RL) approach's potential to improve smart farm operations by optimizing ABS usage for guaranteed IoT task processing, thereby increasing ABS hovering time and contributing to more sustainable agricultural practices.

3.1.3 SDG 3: good health

SDG 3 aims to ensure everyone's health and wellbeing, by providing universal healthcare and giving everyone access to medications and vaccinations that are both safe and effective. This SDG also shows a strong commitment to eradicating communicable diseases and epidemics of Acquired Immune Deficiency Syndrome (AIDS), tuberculosis, malaria, and others by the year 2030.

A total of three papers dealt with the goal of good health, with two of them addressing the COVID pandemic. In the first paper (Gupta et al., 2022), 6G-enabled services were deployed in a multi-UAV ecosystem together with 3 Fold Functions (3FFs), namely: social distancing, proper sanitization, and monitoring of affected

areas, to tackle the COVID-19 pandemic and set the stage for any future cases. To that end, the authors proposed a layered and connected architecture. Initially, the governance layer sets FFs monitoring using UAVs, and guidelines for the communication layer allows real-time monitoring and information transfer using 6G, while the third layer tracks violations of 3FFs and allows remote monitoring and thermal inspections. Sanitization is accomplished by a swarm of hexacopter drones. An evaluation of 6G-based UAV channels was carried out versus traditional 5G-based UAV channels, where the 6G-based UAV channels were proven to be more effective. Similarly, Almalki and Alotaibi, 2022 in (Almalki et al., 2022a) included AI in a multi-functional drone to provide wireless services to combat the COVID pandemic. The proposed UAV system utilized thermal imaging cameras and a Modified Artificial Neural Network (MANN) for detecting face masks worn by individuals in public. Furthermore, their proposed system was able to perform basic diagnostic functions such as identifying elevated body temperatures to reduce the risk of infection transmission through close contact. Moreover, GPS transceivers were deployed for tracking people with elevated body temperatures to ensure they did not violate curfews. Lastly, the AI framework optimized the drone's elevation angle altitude to enhance wireless connectivity with a ground station, resulting in improved throughput and reduced power consumption. The research in (Yang et al., 2019) proposed a three-layer design for deploying UAVs to assist medical patients. Base stations with limited bandwidth were covered by the first layer. The second layer was made up of UAVs that act as relay nodes and transmit data to other relay nodes, while the third layer is made up of non-relay UAVs that collaborate with the relay UAVs to transmit data to neighboring base stations. The authors created a multi-hop cooperative data routing mechanism inside the same framework to address the latency and energy efficiency problems associated with data transmission from UAVs to distant data centers while maintaining a high level of service. This was based on a genetic algorithm and a mixed-integer nonlinear programming paradigm.

3.1.4 SDG 9: industry, innovation, and infrastructure

Here, we demonstrate how SDG 9 can serve as both a goal and a tool. SDG 9 has a goal of building innovative environments, advancing sustainable industrialization, and creating resilient infrastructure. Three articles on the use of UAVs in business, innovation, and infrastructure covered a wide range of topics, including drone mobility, transportation, and tracking in coal mines. In (Aftab et al., 2019), the authors suggested an interface architecture between industrial Wireless Sensor Networks (WSN) and the Internet of Drones (IoD) used for WSN data transfer. IoD nodes togology and clustering are defined based on the bio-inspired dragonfly algorithm where drone and insect behavior features were mapped to each other (e.g., drones gathering sensor data while avoiding collisions with ech other imitate a swarm of dragonflies looking for food). Additionally, the topology was optimized for effective communication by choosing the optimum cluster head based on the location of the drone, its connectivity to the base station, and its remaining battery.

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The work in (Nikooghadam et al., 2021) focused on creating UAV trajectories that carry out many jobs simultaneously while offering consistent coverage over a targeted area, including delivery and transportation. This was accomplished by applying algorithms for last-mile delivery and uniform coverage applications, which have been proved through simulations to be effective while costing a minor increase in energy consumption. These methods were also proven to cover both circular and arbitrarily shaped regions. An Inertial Measurement Unit (IMU) and Ultra Wideband (UWB) were used in (Zhang et al., 2022) to provide accurate tracking of UAVs in coal mines. The suggested solution offered a trade-off between energy and accuracy in UAV placement through the use of an adaptive UWB signal transmission adjustment mechanism. Additionally, in order to guarantee data transmission to the ground server for remote tracking, the authors designed an ondemand trigger algorithm.

3.1.5 SDG 15: life on land

Life on Land (SDG 15) is one of the most important sustainable development goals, as it seeks to protect, restore and encourage the sustainable use of terrestrial ecosystems, manage forests sustainably, fight desertification, and halt and reserve land deterioration. Floods, wildlife monitoring, and wildfires have been investigated in numerous works related to the Life on Land goal.

Floods are one of the unforeseen natural catastrophes that are challenging to predict and monitor due to the possibility that sensor nodes may be washed up and get damaged. To solve this problem and provide continuous connectivity even during crucial flood times, the authors of (Goudarzi et al., 2022) presented a UAVs and WSN-based platform for real-time data collection and prediction. In the event of a flood, the architecture's multi-hop WSN enables the deployment of UAVs as routers to close the network connection gap generated by idle nodes. This makes flood monitoring possible at all times. Additionally, a softwaredefined network (SDN) was used to control network connectivity and reliably detect and find abnormal events.

Regarding wildlife monitoring, it was suggested in (Chaudhry and Phillips, 2021) to use a UAV that gathers data and transmits it to and from a base station as an alternative to creating a routing protocol on a mobile *ad hoc* network. As a result, both when the UAV interacted directly with sensor nodes and when it passively collected data from waypoints, data was accessed more quickly and the percentage of nodes encountered rose. The Levy walk model of foraging by wild animals was imitated by the many mobile sensor nodes in a communication architecture where the UAV moved regularly around the field to collect data from them.

In terms of wildfire monitoring and detection, (Arafat and Moh, 2021), introduced Bio-Inspired Localization (BIL) and Bio-Inspired Clustering (BIC) algorithms in UAVs for monitoring and detecting wildfires. The authors used a Hybrid Gray Wolf Optimization (HGWO) technique to reduce localization errors and obtain high accuracy. By selecting the appropriate CH based on the UAV's fitness rating, BIC based on the HGWO contributes to extending the network lifetime. The authors also proposed a Compressive Sensing (CS-GWO) method based on GWO for efficient data transmission from the CH to the base station, resulting in reduced routing delay and transmissions. In order to quickly identify bushfires, (Zadeh et al., 2022), built a multiagent Mission Coordinating Architecture (MCA) on UAVs that provides continuous Situational Awareness (SA). A UAV-based fire spread probability map that is based on the amount of vegetation cover was employed by the MCA. The authors used the Fuzzy C-means method to define a distinct operation zone for each UAV, which helped to save battery life by preventing UAVs from colliding and collecting redundant data. A framework for synchronized communication that enables UAVs to work together adaptively to maximize total flight time was also incorporated into the MCA. Finally, the study used GA for mission planning and monitoring in order to pinpoint fire areas. (Zhang et al., 2021). examined the monitoring of forest fires using a fixed-wing UAV. Various WSNs were deployed across sensitive locations in the proposed strategy, and a UAV flew to each node to gather environmental data from each node. The research suggested a Bi-Level Hybridization-based Metaheuristic Algorithm (BLHMA) to make sure that the UAV and nodes in the mountain forest areas could effectively communicate with one another. In order to reduce the number of blind searches in the mixed-variable space and improve convergence, the method also employed a constructive heuristic based on Self-Organized Multi-Agent Competition (SOMAC). The positions and headings were then refined using a local search based on a multistage approximate gradient, which enhances the BLHMA's convergence. In (Burhanuddin et al., 2022), to enhance the Quality of Experience (QoE) of UAV-users by optimizing the positions for all UAVs, the authors of this work devised a reinforcement mobile UAV-to-UAV learning strategy for (U2U)communication to aid rescue teams in fighting wildfires. In order to stream videos from other flying UAV users, a UAV at a high altitude served as a mobile base station (UAV-BS). Deep Q-Network and Actor-Criric were then used to optimize QoE video transmission to base station ones, define their ideal positions, and learn the dynamic fire areas and communication environment. The QoE, latency, and video smoothness of the suggested method were found to be superior to those of the Greedy algorithm. Lastly, the authors of (Panahi et al., 2022) wanted to put an end to forest fires rather than just detecting and warning people about them. Thus, they presented a system that, in contrast to others, combines two different UAV types: a group of ground-based fire-fighting UAVs (FUAV) that fly while carrying fire distinguishers and an Energy Harvesting Aided Surveillance UAV (EH-SUAV) with mounted cameras. If a fire was found when the SUAV was continuously scanning the target area for them, the SUAV would immediately send a fire alarm to the ground-based FUAVs, which would react fast to put it out and extinguish it.

3.1.6 SDG 11: sustainable cities and communities

More than half of the world's population already lives in cities, and by the year 2050, it's expected that 7 out of 10 people will live in metropolitan regions (The World Bank, 2022). Making cities and human settlements inclusive, resilient, and sustainable is the focus of Goal 11. This will be accomplished by ensuring access for all to safe and affordable housing with basic services and protecting urban areas from natural disasters.

In terms of interest and articles, UAV applications for sustainable cities and communities have drawn the most attention. In the first publication, the security component was of the utmost significance. Nikooghadam et al. (2021) developed a secure authentication system based on the elliptic curve for drones to secure safe and intelligent living for residents of smart cities. The strategy takes into account users, drones, and a control server, allowing users and drones to sign up for the control server and get the required credentials without compromising security. This system was demonstrated to be secure and impervious to known assaults in the random oracle paradigm while incurring low computation and communication costs.

In (Alam and Moh, 2022), a UAV swarm was used to efficiently monitor crowds. The authors suggested a two-phase architecture and routing control to achieve this goal by balancing the mission and communication performance. They proposed a Joint Trajectory Character Recognition (JTCR) that outperformed existing routing protocols in terms of tracking coverage rate, connectivity rate, the number of re-transmissions, packet delivery ratio, end-to-end delay, and energy consumption. The realistic mobility control of the UAV swarm at a reasonable cost to control overhead is principally responsible for making this achievable. The major aim of (Oubbati et al., 2019) is to exploit UAVs' ability to see from above to enhance emergency response in metropolitan environments. The authors recommended UAVs to track down accidents on the road and concurrently give rescue crews precise position data. The suggested study calculates the shortest path for emergency vehicles while taking into account traffic conditions. Additionally, in light of their high mobility, it made use of a reliable routing system to reduce UAV energy consumption and guarantee stable communication amongst UAVs. With various obstructing impediments including underground garages, shopping centers, and high-rise buildings, the urban tracking problem in (Deng et al., 2021) is made slightly more difficult. In order to increase the accuracy of target tracking, this study introduced edge computing, UAV, and a network of security cameras. The tracking was then accomplished by suggesting an airground surveillance sensor network, which enhances reliability and responsiveness while minimizing the delay and the shortest path problem.

The post-disaster and catastrophe scenarios were handled by different works. In (Faraci et al., 2023), the authors combined edge intelligence and UAVs to support post-disaster rescue operations with disrupted ground communication infrastructure in emergency scenarios. In the proposed method, the UAVs autonomously provided edge computing services as a Flying Ad-Hoc network (FANET). At the same time, renewable-energy generators charged the batteries of UAVs. The authors used model-based reinforcement learning to determine the optimal number of UAVs that should take off based on current edge-computing service requests to conserve power and resources. Furthermore, the study used optimal management policy to ensure sufficient edge computing while minimizing satellite channel usage during periods of low green energy generation and high service requests. In (Minhas et al., 2021), the effectiveness of multihop routing in a man-made catastrophe scenario was assessed in relation to several clustering techniques and the presence of a UAV. The authors provided a reinforcement learning strategy to construct the routing topology and so enhance the energy efficiency while minimizing the immediate energy expenses because in such cases the energy dynamics are what's most influenced and it becomes difficult to reach end-to-end connectivity.

The study presented in (Almalki F. A. et al., 2022) proved that real-time reporting is essential in the case of natural or man-made disasters, to reiterate. Since Aerial journalism is crucial in those urgent situations, Almalki emphasizes that investigative reporting and the rapid creation and dissemination of media content on a big scale are made possible by the incorporation of drones with integrated AI. For that reason, an improved propagation model that combined drones and AI was developed to support smart journalism and make the process more environmentally friendly and sustainable. In order to improve accuracy, connectivity, and media coverage, the authors assessed a number of optimal propagation models that integrate drones with their payloads, the ground control unit that supports their operation, as well as an AI framework that makes use of a Neural Network-Radial Base Function Network (NN-RBFN).

In (Varghese et al., 2022), the authors' aim was to address the issue of broken communication in a disaster-affected area, whether it be man-made or natural. They introduced a terrain-ware algorithm and re-established a communication network, in the whole catastrophe area affected. The algorithm determined the smallest number of drones required to completely cover the affected area while maximizing the system's average energy, allowing the drones to operate for longer periods of time. Similarly, (Hydher et al., 2020), addressed the problem of ongoing network connectivity in serious emergency situations. However, they took a different approach, suggesting the best location for the UAVs to serve as aerial base stations rather than recommending a framework based on WSN and UAVs for real-time data gathering and prediction. With this method, users' equipment

is allocated to each aerial base station in an effort to increase the wireless network's overall spectral efficiency in disaster-affected areas. With the use of renewable energy sources including wind and solar energy, the work under (Donevski et al., 2022) intends to deliver UAV swarm-based communication in off-grid circumstances with restricted access to power grids. Therefore, to evaluate the effect of wind on UAV energy consumption, the authors included a realistic model. They also included energy generation modules for photovoltaic (PV) and wind turbines (WT). The ultimate objective was to assess the viability of self-sustaining energy systems for long-term, uninterrupted operation of UAV swarms in infrastructure-less, that is, disaster situations. To identify the best configuration based on covered area, WTs, PV panels, ground battery cells, and UAV swarm, they, therefore, offer a computationally efficient technique based on greedy sampling and binary search.

Last but not least, a sustainable city must ensure the safety of transmission lines to ensure human safety because manual inspection requires personnel to climb towers and measure physically with tools, which is exceedingly unsafe. The research in (Deng et al., 2022) provided a novel method for developing a mobile edge computing system and an improved lightweight object detection algorithm for an insulator online defect detection system. Insulate failure detection may be carried out in real time by utilizing a deep neural network partition method based on binary particle swarm optimisation. This intelligent recognition method can recognize insulator self-explosion at the terminal level and detect problems with an accuracy of 94.5%.

A summary of all the SDGs that greatly benefit from UAVenabled aerial communication, geographical sources, year of publication, the type of UAV network, and the field of contribution used in the included literature is illustrated in Table 5.

3.2 Methods used for UAV-enabled communications

A wide spectrum of methods is used to provide solutions for the various problems identified when UAVs are used for communication purposes. From the relevant research works



UAV-based communication methods used in the included publications. (A) Distribution of included papers by category of methods. (B) Evolution of the methods used per year.

TABLE 5 Summary of the SDG-based literature included.

Country	Year	UAV network	Type of UAV	Field of contribution	Reference
			SDG 6: Clean water and sanitation		
United Kingdom	2022	Single	Wireless Communication Interfaces	Telecommunications	Radhakrishnan and Wu (2022)
			SDG 2: No hunger		
India	2022	Single	Wireless Communication Interfaces	Robotics (agent path planning)	Singh and Sharma (2022)
Saudi Arabia	2019	Single	Wireless Communication Interfaces	Telecommunications	Ammad Uddin et al. (2019)
Canada, USA	2023	Multiple	Wireless Communication Interfaces	Telecommunications	Pamuklu et al. (2023)
			SDG 3: Good health		
India, Saudi Arabia, Romania	2022	Multiple	Thermal, camera	Telecommunications	Gupta et al. (2022)
Saudi Arabia, United Kingdom	2022	Single	Thermal camera, wireless communication interfaces	Image Processing	Almalki et. (2022b)
China, Canada	2019	Multiple	Wireless Communication Interfaces	Telecommunications	Yang et al. (2019)
			SDG 9: Innovation and infrustructure		
China	2019	Multiple	Wireless Communication Interfaces	Telecommunications	Aftab et al. (2019)
USA	2021	Multiple	Delivery, Wireless Communication Interfaces	Transportations, Telecommunications	Nikooghadam et al. (2021)
China	2022	Single	UWB Sensors, Wireless Communication Interfaces	Telecommunications	Zhang et al. (2022)
			SDG 15: Life on land		
United Kingdom	2021	Single	Wireless Communication Interfaces	Telecommunications	Chaudhry and Phillips (2021)
Malaysia, Iran, United Kingdom, Australia	2022	Single	Wireless Communication Interfaces	Environmental Science	Goudarzi et al. (2022)
Korea	2021	Multiple	Wireless Communication Interfaces	Telecommunications	Arafat and Moh (2021)
Australia	2023	Multiple	Wireless Communication Interfaces	Telecommunications	Zadeh et al. (2022)
China	2021	Single	Wireless Communication Interfaces	Telecommunications	Zhang et al. (2021)
Malaysia, United Kingdom, Sweden	2022	Multiple	Camera, Wireless Communication Interfaces	Telecommunications	Burhanuddin et al. (2022)
Iran, Japan	2022	Multiple	Camera, Wireless Communication Interfaces	Robotics (agent path planning)	Panahi et al. (2022)
		S	DG 11: Sustainable cities and communities		
Iran, India	2020	Single	Wireless Communication Interfaces	Security	Nikooghadam et al. (2021)
South Korea	2022	Multiple	LiDAR, thermal and normal Cameras, GPS, and Wireless Communication Interfaces	Telecommunications	Alam and Moh (2022)
Algeria, UAE, France, USA, Australia	2019	Multiple	Wireless Communication Interfaces	Telecommunications	Oubbati et al. (2019)
China, USA	2020	Multiple	Camera	Security	Deng et al. (2021)
Italy	2023	Multiple	Wireless Communication Interfaces	Telecommunications	Faraci et al. (2023)
Pakistan, Estonia	2021	Single	Wireless Communication Interfaces	Telecommunications	Minhas et al. (2021)
Saudi Arabia, Tunisia	2022	Single	Wireless Communication Interfaces	Telecommunications	Almalki et al. (2022a)
India	2022	Multiple	Wireless Communication Interfaces	Telecommunications	Varghese et al. (2022)

(Continued on following page)

Country	Year	UAV network	Type of UAV	Field of contribution	Reference
Sri Lanka, Russia	2020	Multiple	Wireless Communication Interfaces	Telecommunications	Hydher et al. (2020)
Denmark, Greece, United Kingdom	2023	Multiple	Wireless Communication Interfaces	Telecommunications	Donevski et al. (2022)
China	2022	Single	Camera, Wireless Communication Interfaces	Telecommunications	Deng et al. (2022)

selected, three major categories were distinguished, namely, Heuristic, AI/ML (Artificial Intelligence/Machine Learning), and Optimization, whose distribution is shown in Figure 4A. These techniques are utilized to improve numerous design and functional elements of UAV-based communications, such as channel modeling, resource management, positioning, and security. A per-paper summary of the utilized methods and techniques is presented in Table 6. In the following, we put the techniques in the context of investigated research problems.

The heuristic solutions rely on various Bio-inspired designs which are used to effectively address optimization issues in a wide range of application domains by drawing on physical principles, and specific behaviors of living things (Darwish, 2018). The Genetic Algorithm (GA), based on biologically inspired operators like mutation, crossover, and selection (Beasley et al., 1993), is often used for optimization and search tasks. In Aftab et al. (2019), the authors used a Bio-inspired clustering scheme using the Dragonfly algorithm, a method based on the swarming behavior of dragonflies in nature (Mirjalili, 2016), to manage communication among drones in an industrial wireless sensor network. The research in Arafat and Moh (2021), also used bio-inspired localization, bioinspired clustering as well as compressive gray wolf optimization; an algorithm that simulates grey wolf leadership hierarchy and hunting mechanism to detect and monitor wildlife. In Zadeh et al. (2022), the Genetic Algorithm was also merged with Fuzzy C-Mean, a data clustering technique that provides solutions for search and optimization problems in machine learning. This combination of methods enabled the authors to improve bushfire detection and response efficiency in bushfire-prone areas.

Optimization methods have been consistently used through the years and have been applied in various studies. These methods were mostly used to optimize UAV's hovering positions for efficient communication with ground users Radhakrishnan and Wu (2022); Pamuklu et al. (2023); Deng et al. (2021); improve energy and cost efficiency Alam and Moh (2022); Yang et al. (2019); Zhang et al. (2022); Donevski et al. (2022); optimize and ensure a good network coverage, and a minimum QoS for users Hydher et al. (2020); Varghese et al. (2022); Khosravi et al. (2021), and predict future events using data acquired through WSN and UAVs Goudarzi et al. (2022). Particle Swarm Optimisation (PSO), was the technique that was most frequently utilized. This method models the social behavior of birds or fish, where particles (solutions) move around a solution space, modifying their placements based on their own best-known solution and the swarm's collective knowledge. The shortest pathways were found using Dijkstra's algorithm and the Travelling Salesman Problem (TSP). Dijkstra uses a weighted graph to find the shortest path between nodes, as opposed to TSP, which determines the shortest path between a set of points and locations that must be visited Dahiya and Sangwan (2018); Javaid (2013). Other algorithms, such as the Terrain-Aware Algorithm and Topology Aware Q-routing (TAQR), were utilized for the same goal.

Furthermore, the selected publications shed light on how the integration of AI techniques can be leveraged for various purposes in UAV-based communications. As shown in Figure 4B, beginning with one paper in 2021, then six in 2022, and three in the first 3 months of 2023, the inclusion of AI has been gaining a lot of traction in recent years.

The AI-based solutions mainly relied on machine learning techniques, such as Deep Neural Networks (DNN), which mimics how the brain processes information, and Reinforcement Learning, which is a training method based on rewarding desired behaviors and punishing undesired ones. These techniques enable the model to perceive and interpret its environment, take action, and learn through trial and error. Moreover, different iterations of YOLO were used, an algorithm that aims to predict an object's class and the bounding box that defines the object location on the input image Han (2017); Jiang et al. (2022).

In Almalki et al. (2022a), the use of Aerial smart journalism was supported by a technology that combines drones with a Neural Network-Radial Base Function Network (NN-RBFN) to provide an accurate channel propagation model. This promotes sustainable and eco-efficient media and journalism services with high data rates and broad coverage footprints, whether in normal or hazardous situations. In the case of dangerous conditions indeed, Panahi et al. (2022) and Deng et al. (2022) respectively used reinforcement learning and deep neural networks to identify and put out forest fires and self-explosion defects in insulators in the presence of hazardous situations. AI-based systems were also used in pandemic scenarios, specifically COVID, where Faster Region-based Convolutional Neural Networks (F-RCNN), Modified Artificial Neural Networks (MANN), and Convolutional Neural Networks (CNN) were used in Gupta et al. (2022) and Almalki F. A. et al. (2022) to monitor social distancing and help reduce the risk of infection spread. In Minhas et al. (2021), Faraci et al. (2023) and Burhanuddin et al. (2022), Reinforcement Learning and Deep Reinforcement Learning based on Actor-Critic (AC) and Deep Q Network (DQN) were used for optimized multipath routing to ensure public safety and provide edge computing services in emergencies. In addition, Pamuklu et al. (2023) used Multi-agent Reinforcement Learning techniques to schedule tasks in smart agriculture using air base stations with limited energy capacities.

Few publications, namely, Nikooghadam et al. (2021); Chaudhry and Phillips (2021); Oubbati et al. (2019); Minhas et al. (2021), did not use any of the previously listed categories. These papers focused mainly on secure authentification schemes and routing protocols.

TABLE 6 Summary of the method-based literature included.

Objective	Technique	Reference
	Heuristic	
Detection and monitoring of wildfires	Bio-inspired Localization (BIL), Bio-inspired Clustering (BIC), Compressive Sensing Gray Wolf Optimization (CS-GWO)	Arafat and Moh (2021)
Communication management among drones	Dragonfly Algorithm	Aftab et al. (2019)
	Heuristic and Al	
Bushfire detection	Fuzzy C-means, Genetic Algorithm (GA)	Zadeh et al. (2022)
	AI	
Communication for strong connectivity, and wide media coverage	Neural Network-Radial base function network (NN-RBFN)	Almalki et al. (2022b)
Monitoring social distancing in COVID scenarios	Faster region-based convolutional neural network (F-RCNN), You Look Only Once version 3 (YOLOv3)	Gupta et al. (2022)
UAV-aided multipath routing optimization for Public Safety Networks	Reinforcement Learning (RL)	Minhas et al. (2021)
Maximization of edge-computing services provided in post- disaster environments	Model-Based Reinforcement Learning	Faraci et al. (2023)
Detection of self-explosion faults in insulators	Improved YOLOv4, Deep Neural Network Partition Algorithm based on PSO	Deng et al. (2022)
Detection and warning of forest fires	Reinforcement Learning	Panahi et al. (2022)
Maximization of the data rate of video transmission	Deep Reinforcement Learning based on Actor-Critic (AC) and the Deep Q Network (DQN)	Burhanuddin et al. (2022)
Face mask detection during COVID.	Modified Artificial Neural Network (MANN), CNN	Almalki et. (2022a)
Tasks scheduling in smart agriculture	Multi-Agent RL	Pamuklu et al. (2023)
	Optimization	
Energy-efficient tracking of UAVs in coal mines	On-Demand Precise Tracking (OPT)	Zhang et al. (2022)
Maximizes the cost efficiency of coverage in off-grid scenarios	Algorithm based on Greedy Sampling and Binary Search	Donevski et al. (2022)
Ensuring good network coverage in overloaded or emergency scenarios	Particle Swarm Optimisation (PSO)	Pamuklu et al. (2023)
Communication establishment in disaster-affected areas	Terrain-Aware Algorithm	Varghese et al. (2022)
Target tracking in areas with obstructing obstacles	Air-Ground Surveillance Sensor Network (AGSSN), AIRT	Deng et al. (2021)
Optimization of UAV hovering positions for efficient communication with ground users	Travelling Salesman Problem (TSP), a Dome Packing Method	Radhakrishnan and Wa (2022)
Optimization of the UAV's performance for uniform coverage and efficient transport	Algorithm 1 & Algorithm 2 (Developed by the authors of the paper)	Khosravi et al. (2021)
Crop monitoring, mapping, and spraying tasks	Consensus Algorithm	Singh and Sharma (2022)
Aerial surveillance using UAV swarms for smart-city monitoring	Virtual force-based mobility control (VFMC), Topology aware Q-routing (TAQR), Energy-efficient mobility-aware fuzzy clustering (EMFC)	Alam and Moh (2022
Energy-efficient data routing for medical assistance in disaster management	A polynomial time algorithm based on a Genetic Algorithm	Yang et al. (2019)
Prediction of forthcoming floods	Method Data Handling (GMDH), Particle Swarm Optimisation (PSO)	Goudarzi et al. (2022)
	Optimization and heuristic	
Route planning and fire detection	Bi-Level Hybridization-Based Metaheuristic Algorithm (BLHMA), differential evolution (DE), (self-organized multi-agent, competition (SOMAC) - heuristic)	Zhang et al. (2021)

4 Discussion and future trends

4.1 Findings and identified gaps

This systematic literature review formulated two research questions in order to identify the latest advancements and applications in sustainable and efficient aerial communication technologies and the key enablers and tools to achieve that. First, an SDG-based analysis was undertaken based on the review's findings to distinguish between the applications employed in various studies. This distinction was observed to be related to the areas that each research has focused on, its fields of contribution, and its interests.

There are 17 goals and several targets in the SDGs of the United Nations. Yet, our findings demonstrate the narrow emphasis on just six of those, namely, SDGs 6, 2, 3, 9, 15, and 11.

- Goal 6, with just one article, showed special interest in addressing water management.
- Goal 2 focused on agriculture, crop health management, and intelligent farming with 3 publications.
- Goal 3 prioritized the COVID pandemic, and assisting medical patients, with 3 publications.
- Goal 9, with also 3 publications, emphasized tracking and transportation in coal mines.
- Goal 15 tackled floods, wildfires, and wildlife monitoring, it recorded 7 publications.
- Goal 11 registered the highest contributions with 11 articles. It placed a strong emphasis on the security aspect in smart cities, crowd monitoring, accident tracking, communication in the aftermath of disasters and other calamities, and human safety.

In the second phase, findings were analyzed based on a methodological approach. An examination of the major categories of methods was conducted, namely, heuristics, optimizations, and AI/ML. The findings indicated that optimization methods had the highest frequency of publications (46,2%), followed by a recent emergence of AI/ML methods (38,5%) in solving UAV-based communications. This recent trend has only started emerging in 2021. It was shown that while UAVs were originally designed to be handled manually, the introduction of AI has enabled them to be controlled by machines, letting them perform a variety of duties more sustainably and efficiently. The least used category identified in the selected articles was heuristic approaches; however, they appear to be frequently included as early comparators to other methods or employed for simple tasks alongside optimization and AI methods.

Geographically, the United Kingdom, Saudi Arabia, China, and the USA registered the largest number of publications (six). While Romania, Pakistan, Estonia, Tunisia, Sri Lanka, Russia, Japan, Sweden, Algeria, and France all were part of one publication only (see Figure 5). It is noteworthy that the majority of works had contributions from different countries.

In fact, the highest contributions covering SDGs were found to be more used in developed and rich countries than in developing countries. We realized that contributions from South America were completely absent, and only two works from Africa; Algeria (Oubbati et al., 2019) and Tunisia (Almalki et al., 2022a) were registered collaboratively with UAE, France, USA, Australia, and Saudi Arabia. This can be explained by either a lack of understanding of the global sustainable development goals, a lack of resources and infrastructure to work on this issue, or a dearth of peer-reviewed journal publications. It is worth mentioning that multiple studies using UAV technologies for transportation in emergency situations were found in developing countries, but these publications were not included in the full-text screening because there was no communication involved.

Despite the screening process not focusing on papers that had novel ideas in communication. The majority of contributions were made in the telecommunications line, with a percentage of 76.7%, followed by contributions on Security and robotics, with a percentage of 6.7% on each, and only one contribution on each of the following lines: Transportation, Image Processing, and Environmental Sciences. (See Figure 6).

4.2 Future trends

Although the findings allowed for a detailed synthesis of applications of sustainable aerial communication technologies, a few limitations and gaps were found, revealing topics for additional research and chances for practical applications. UAV-enabled communications, a critical element in non-terrestrial networks, have the potential to significantly advance SDGs which were not mentioned in the articles included in this SLR. Therefore, we offer a few concepts that can be covered in upcoming research-related activities.

- UAV as sensor data sink or sensor carrier: Due to UAV's ability to interconnect numerous devices, sensors, and systems, they can notably enhance data collection and analysis. For instance, in the realm of SDG 13 (Climate Action), UAVs equipped with sensors can travel to inaccessible regions to monitor climate conditions and changes, such as atmospheric gas concentrations, temperature, and humidity. This information can be crucial for climate change research and mitigation efforts. Furthermore, sensor data collected via UAV-enabled IoT can be leveraged for pollution monitoring, which aligns with SDG 3 (Good Health and Wellbeing) by aiding in identifying potential health risks and implementing necessary health interventions.
- Mobile Edge Computing (MEC) for UAVs: MEC offers the advantage of rational data processing and decision-making for resource-constrained UAVs. Specifically, MEC-assisted UAVs can support SDG 13 (Climate Action) by enabling real-time environmental monitoring and local processing of visual data captured by UAV cameras. This capability allows for the prompt identification of changes in climate patterns, facilitating timely mitigation responses. Additionally, in the context of SDG 5 (Gender Equality), and SDG 16 (Peace and Justice), UAVs can provide a safe and discrete means to detect and report gender-based violence, as well as children and women trafficking, the collected data can be transmitted immediately to the relevant authorities, aiding in timely intervention and possibly saving lives.







• Infrastructure-less coverage offered by UAVs extends the reach of communication services: In the context of SDG 4 (Quality Education), UAVs can swiftly establish communication networks in remote areas, ensuring the continuity of education through distance learning. While direct research papers on drones for SDG 4 in education may be scarce, there are several "educational UAVs" currently available in the market, designed to facilitate STEM (Science, Technology, Engineering, and Matjematicss) education (news, 2023). Many universities have also adopted training programs

to facilitate their integration into educational curricula, introducing practical applications and fostering hands-on learning experiences (Alkaabi and Abuelgasim, 2017). Notable examples include the DJI Tello EDU (DJI 2021), which supports in programming languages an AI functionalities. The CoDrone EDU by Robolink (CoDrone, 2020), which comes with curriculum support and lesson plans tailored for classroom use. It is built specifically for educators and includes features for ease of use and programmable flight tasks. Further, this extended coverage can be instrumental in promoting SDG 8 (Good Jobs and Economic Growth) and SDG 1 (No Poverty) by connecting remote areas to economic opportunities, thereby supporting local businesses and creating job prospects. It also enhances SDG 3 (Good Health and Wellbeing), and SDG 10 (Reduced Inequalities) by providing the necessary on-demand connectivity for telemedicine services in remote and disadvantaged areas. Lastly, this broad coverage promotes SDG 17 (Partnerships for the Goals) by fostering global partnerships, enabling connectivity in remote and underprivileged areas, and allowing these communities to participate in the global exchange of ideas and collaborative problem-solving.

- Sensor drones for monitoring: The employment of robotics and vision for agriculture, can also be applied in aquaculture. The UAV's ability to report numerous accurate measurements that are out of human reach, such as echo-sounders that allow fish tracking and understanding of underwater echo systems, can allow for better monitoring of life underwater, which supports SDG 14 (Life Below Water). Furthermore, fish monitoring will help better understand fish movements and environmental conditions, which will save waste, boost growth, and reduce disease outbreaks and mortality. This is going in light with SDG 6 (Clean Water) and SDG 12 (Responsible Consumption).
- Harmonized UAV Regulations to Promote Sustainable innovation: The deployment of Unmanned Aerial Vehicles (UAVs), faces differing regulatory challenges across the globe. The U.S., under the Federal Aviation Administration (FAA), follows a clear set of rules, while the European Union enforces a more harmonized regulatory framework through the European Union Aviation Safety Agency (EASA) (Laws, 2024). Meanwhile, regions like Africa and parts of Asia have more flexible regulations, giving drone operators greater autonomy. Companies like Zipline have achieved success in Africa, providing essential medical deliveries, but their operations are more restricted in regions like the U.S. and Japan (next, 2020). Wing, operating in countries such as the U.S., Australia, Finland, and Ireland, also encounters resistance in the Global North due to privacy, security and noise concerns, leading to lower public acceptance (Straight, 2022). Thus regulators should work to strike a balance between fostering economic growth and addressing these public concerns. This challenge aligns with SDG 9 (Industry, Innovation, and Infrastructure), as UAVs support innovative last-mile delivery and urban mobility. Expanding drone usage in healthcare, especially in underserved regions, also contributes to SDG 3 (Good Health and Wellbeing) by improving access to medical supplies in remote areas.

5 Conclusion

Since 2015, member states of the United Nations have vowed to make the world a better and safer environment for everyone,

everywhere by 2030. To that end, they created a roadmap and issued an urgent call to action for both rich and developing nations to work together in a global partnership. At its core are the 17 Sustainable Development Goals, which are intended to balance the economic, social, and environmental aspects of sustainable development.

This systematic review incorporates the latest scientific evidence and methods that focus on the importance of aerial communication in achieving these SDGs. Our study is based on a thorough selection and analysis of 28 scientific articles. This helped us identify six SDGs that gained the most from the published research on aerial communication facilitated by UAVs. In order of impact, these were: "Sustainable Cities and Communities," where UAVs improve security and disaster management; "Life on Land," where drones help with wildlife monitoring and reforestation; "Industry, Innovation, and Infrastructure," where UAVs aid in infrastructure inspection; "No Hunger," where drones improve agricultural practices; "Good Health and Wellbeing," where UAVs assist with disease prediction and monitoring; and "Clean water and sanitation," where drones ensure water distribution efficiently. The key tools and methodology used to achieve the goals targeted in each study were heuristic methods, optimization tactics, and more novel artificial intelligence techniques. It was also demonstrated that in many of the selected papers, a rise in the popularity of AI across several fields of application on UAV-based communications has been noticed.

This review also sheds light on the major gaps in the literature and proposes directions for future research as well as sustainable drone application in every area that is underrepresented, including "Gender Equality," "Clean Water and Sanitation," "Quality Education," "Peace and Justice," and others.

Author contributions

IG: Conceptualization, Data curation, Formal Analysis, Investigation, Methodology, Validation, Writing-original draft, Writing-review and editing. EV: Data curation, Methodology, Validation, Writing-original draft. AS: Data curation, Methodology, Writing-original draft. PB: Data curation, Methodology, Writing-review and editing. PM: Data curation, Methodology, Writing-review and editing. SP: Conceptualization, Supervision, Writing-review and editing.

Funding

The author(s) declare that no financial support was received for the research, authorship, and/or publication of this article.

Acknowledgments

We thank our Wavecore group colleagues for the insightful suggestions that helped us generate fresh concepts for the discussion section.

Conflict of interest

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

The author(s) declared that they were an editorial board member of Frontiers, at the time of submission. This had no impact on the peer review process and the final decision.

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