Emerging technologies in precision weed management: Tools, techniques, and the future of agriculture

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DOI: https://doi.org/10.33545/26174693.2024.v8.i2Se.589

Abstract

In recent decades, the global population surge has created a demand for increased food production, placing greater stress on agricultural systems. Challenges such as climate change, water scarcity, and diminishing arable land further jeopardize the sustainability of farming. Weeds pose a significant threat to food production by competing for natural resources, thereby diminishing product quality and productivity in agricultural systems. To ensure effective and sustainable weed management, a balanced integration of various control methods (cultural, mechanical, and chemical) is essential, avoiding excessive mechanization and herbicide usage to prevent harm to the overall agrarian ecosystem. Conversely, advancements in weed control technologies offer opportunities for increased food production, reduced input requirements, and minimized environmental impact, ultimately moving us closer to more sustainable agricultural practices like precision farming. This chapter comprehensively examines the limitations of both traditional and innovative methods for weed control, as well as the development of tools and constraints associated with precision weed management, all analyzed through a sustainability lens.

Keywords: Emerging technologies, precision weed management, tools, techniques

Introduction

Precision agriculture (PA) is a farming management strategy employing information technology (IT) to guarantee that crops and soil receive precise requirements for optimal health and productivity. The primary objectives of PA encompass ensuring profitability, sustainability, and environmental protection. Also recognized as satellite agriculture, as-needed farming, and site-specific crop management (SSCM), precision agriculture leverages specialized equipment, software, and IT services. This methodology involves obtaining up-to-the-minute data on crop conditions, soil quality, ambient air, and additional pertinent information like hyper-local weather forecasts, labor expenses, and equipment availability. In the past twenty years, advancements in geospatial and information technologies, such as GNSS, sensors, electronics, agricultural machinery controllers, and high-resolution remote sensing, have expanded the possibilities for precise management of agricultural field operations. In addition to this involves executing the correct actions in the appropriate location, manner, and timing. It focuses on overseeing inputs like water, seed, fertilizer, etc., in crop production to enhance yield, quality, and profitability, reduce waste, and promote environmental sustainability. The objective of precision farming is to align agricultural inputs and methods with specific crop and agro-climatic conditions, aiming to enhance the precision of their application. Moreover to identify, analyze, and effectively manage spatial and temporal variability within fields. This approach aims to enhance productivity, maximize profitability, ensure sustainability, and protect land resources by minimizing production costs.

Constraints of traditional approaches to weed control

Weeds present a significant challenge to global food production within agricultural systems. Growing alongside crops, weeds diminish both productivity and the quality of harvested goods. This reduction stems from various factors, including competition for essential resources such as water, sunlight, nutrients, and space.
Among the threats faced in agriculture, weeds emerge as the most costly, accounting for more than 45% of yield losses in field crops, surpassing losses attributed to crop diseases (25%) or insect pests (20%). The degree of yield losses caused by weeds is influenced by factors such as the timing of weed emergence, weed density, and the types of both weeds and crops. Uncontrolled weed growth can result in complete yield losses of up to 100%. Furthermore, weeds act as hosts for insects and pathogens (fungi and bacteria), presenting an additional threat to crop plants. The impact of weeds extends beyond yield losses, affecting land value, especially in the case of perennial and parasitic weeds, and disrupting water management by increasing evaporation and reducing water flow in irrigation ditches. Serious weed issues arise when susceptible crops, a substantial weed seed bank in the soil (comprising both true weeds and vegetative propagules of perennial weeds), and favorable environmental conditions for weed growth coincide. While efforts to control weeds are essential to mitigate their adverse effects, complete eradication of both emerged plants and the potential seed bank is impractical. Despite their disadvantages, the presence of weeds in crop fields can offer agronomic and ecological benefits, particularly at low densities.\[1\]

Conventional methods of weed management typically involve established and traditional approaches to control and mitigate the impact of weeds in agricultural systems. Presently, weed management in agricultural systems diverges into two separate directions, encompassing diverse methods. One direction involves the extensive utilization of synthetic herbicides, while the other relies heavily on mechanical, biological, cultural, and physical approaches for weed control. Apart from the advantages of using herbicides for weed control, there are also disadvantages, mainly due to the use of chemical compounds designed to control or kill unwanted weeds. This method is been widely adopted for their efficiency in weed eradication but can have negative environmental consequences. It adds to the pollution of the environment. The presence of excessive herbicide residues in soils can have negative effects on the following crop. In addition Soil microbes may be adversely affected when herbicide doses exceed recommended levels. Herbicides can lead to drift effects, impacting neighboring fields. The calibration of herbicide application demands a certain level of technical expertise. Furthermore, certain herbicides are associated with a significant expense. Physical methods such as plowing, tilling, and mowing are used to physically remove or disrupt weed growth, effective but can be labor-intensive, and may contribute to soil erosion. In addition to these physical methods which utilize non-chemical means, such as flame weeding or using heat, to control weed growth. This offers an alternative to chemical methods but may have limitations in terms of precision and efficiency. Biological control involves natural enemies or predators of weeds to control their populations. E.g. use of insects, animals, or pathogens to suppress weed growth. Growing competitive crops that can outperform weeds for essential resources like sunlight, water, and nutrients is included in crop competition; it relies on selecting and cultivating crops with strong competitive abilities against weeds. Therefore, a comprehensive approach to weed management is essential, aiming to minimize the limitations associated with mechanical and chemical methods. There is a pressing need for a novel weed management paradigm in contemporary agriculture, grounded in ecological principles and unconventional weed control approaches.

Emergence of Precision weed management
Weeds have persistently posed a problem in agriculture since its inception. They impede crop growth by competing for water, nutrients, and sunlight, leading to substantial losses in crop production. Common weed control methods involve mechanical practices or the use of herbicides. However, extensive mechanization contributes to soil erosion, diminishing fertility, while herbicide use results in soil, water, food, and air contamination, causing health issues in humans and animals. This has led to herbicide resistance and disrupted ecosystems. Biodiversity, particularly agro biodiversity, plays a crucial role in providing ecosystem services in agricultural systems. Over the past century, there has been a rise in the diversity of weed species, despite the use of highly effective herbicides. This phenomenon is attributed to current crop/pest management systems that favor the presence of weed species well-adapted to specific cultural, chemical, and environmental conditions. For instance, heavy reliance on chemical methods for weed control can result in shifts in weed species composition and density over time. Additionally, the escalating costs of herbicides in the last decade have added to variable expenses in an agricultural landscape where profit margins are already narrow. Consequently, there is a renewed interest in adopting integrated weed management strategies (IWM) to both prevent the establishment of weed species highly adapted to specific management approaches and reduce control costs. Sustainable weed management includes integrated weed management (IWM), which employs a variety of strategies to optimize crop production and increase profitability. This involves preventive measures, scientific knowledge, management skills, monitoring procedures, and efficient control practices. The field of sustainable weed management has witnessed the development and implementation of various technologies, contributing to economic and environmental sustainability. The challenge for IWM lies in utilizing conceptual and technological tools to devise and execute integrated strategies that avoid the evolution of weed species specifically adapted to particular control methods. Precision farming stands out as a significant platform for designing and implementing IWM strategies that enhance overall system efficiency. The extensive elimination of weeds and wild plants, coupled with the toxicity of agrochemical inputs, poses a threat to agro biodiversity and associated services like pollination, soil structure improvement, and natural pest control. Weeds contribute significantly to soil quality and biodiversity support, sustaining agro ecosystem productivity in the long term. In light of these challenges, a transition to sustainable weed control is imperative for environmental, social, and economic reasons associated with sustainable agriculture. Precision weed management (PWM) stands out by reducing inputs without compromising weed control effectiveness. Utilizing grid technology aids in planning the usage of pesticides and insecticides, preventing excessive application that could compromise the quality and nutrient levels of the produce.\[2\]
Tools and equipments used in precision

Precision farming is the amalgamation of various technologies, each interconnected and contributing to advancements. These components are outlined below:

a) Global Positioning System (GPS) and GIS: Comprising 24 satellites in Earth's orbit, GPS transmits radio signals processed by a ground receiver to determine precise geographic positions on Earth. With a 95% probability of accuracy within 10-15 meters, GPS facilitates detailed mapping of farms. Coupled with suitable software, it provides farmers with information on crop status and identifies specific areas requiring inputs like water, fertilizers, or pesticides. Utilizing GIS analysis to assess the size and spatial distribution of invasive species infestations on a land base can aid in the formulation of suitable control strategies for that particular species. Mapping weed infestations within an annual crop has repercussions not only for targeted herbicide applications but also for strategizing future management approaches and gaining insights into weed dynamics. Analyzing the spatial distribution and size of infestations can support land managers in choosing the most effective strategy for controlling invasive species.

b) Grid Sampling: Grid sampling in weed management is part of precision agriculture, leveraging technology and data analysis to optimize resource use and enhance the overall effectiveness of weed control efforts. It provides a systematic and data-driven approach to address weed-related challenges in agricultural and land management contexts. It involves systematically collecting soil or vegetation samples at regular intervals across a grid pattern within a field after dividing into grids ranging from 0.5 to 5 hectares and samples are taken from specific points within each section. Multiple samples are taken from each grid, mixed, and sent to the laboratory for analysis. The collected samples are then analyzed to determine factors such as weed species composition, abundance, and distribution. This information helps farmers and land managers make informed decisions regarding weed control measures, such as the targeted application of herbicides, adjusting cultivation practices, or implementing other site-specific interventions.

c) Variable Rate Technology (VRT): In precision agriculture, the application of variable rate technology (VRT) can play a crucial role in achieving effective weed control. Specifically, it enables the optimal utilization of herbicides, minimizing environmental impact while maintaining crop yields and quality. In discussing herbicides, it is crucial to note that the herbicide levels may vary based on the field and the application of a variable-rate formula. This consideration should be kept in mind consistently. Even a slight deviation in the rate of application for herbicides, pesticides, or other chemicals can lead to insufficient pest control, potential damage to crops or the environment, and ultimately result in wasted time, energy, and financial resources. Integrating Electronic Control Units (ECU) and onboard GPS into existing field machinery enables meeting variable rate input requirements. Devices like spray booms and spinning disc applicators with ECU and GPS have proven effective for targeted spraying. When creating nutrient requirement maps for VRT, emphasis should be on the fertilizer rate that maximizes profit rather than simply maximizing yield. This approach ensures that weed management is both efficient and environmentally sustainable within the context of precision agriculture.

d) Remote Sensors: Remote sensing and related spatial technologies offer a significant opportunity to enhance weed management, providing a means to judiciously apply the most effective control methods for a specific site and improve environmental protection. Utilizing remote sensing can be invaluable for detecting invasions, assessing infestation levels, monitoring the spread rate, and evaluating the effectiveness of weed management efforts. When integrated with technologies like GPS and GIS, it enables the development of efficient sampling strategies to pinpoint the location of weed populations in both agricultural and wild land scenarios. Advances in spatial and spectral resolution, temporal frequency, image turnaround time, and the cost of image acquisition, coupled with a growing appreciation of the data's value, contribute to the increasing acceptance and utilization of remote sensing technologies. Some researchers propose employing remote or on-the-go sensing as information sources for generating weed maps. The accurate mapping of weed species and density is a crucial aspect in implementing precision weed management, directing efforts to locations with weed presence while safeguarding areas without weed occurrence.

e) Site-specific weed management (SSWM): The concept behind site-specific weed management (SSWM) involves identifying, analyzing, and addressing the specific spatial and/or temporal variations in weed populations to optimize economic returns, enhance cropping system sustainability, and protect the environment. Recent technological advancements, such as remote sensing, GIS, and GPS, have significantly increased the potential for SSWM. Site-specific weed control techniques have gained traction within the precision farming community in recent years, initially being recommended to enhance herbicide use in fields. However, a detailed understanding of when and where weeds emerge in a field can also enhance the efficiency of cultural techniques. The timing or application method of fertilizers, for example, could potentially be adjusted based on weed spatial data to reduce weed establishment and competition with the crop. Current research on the profitability of site-specific weed management has predominantly focused on reduced herbicide use, overlooking substantial information costs associated with scouting, creating treatment maps, and implementing patch herbicide application.
f) **AI based tools:** In contemporary agriculture, technology has surpassed the conventional realms of manual labor by introducing innovative solutions to tackle the persistent issue of weed infestations. A notable development in this field is the advent of weed detection robots, signifying a significant leap in precision agriculture. These robotic systems are equipped with cutting-edge sensors, advanced cameras, AI algorithms, and GPS technology, enabling them to meticulously map the terrain and pinpoint areas affected by weed infestations. Operating continuously, they traverse fields, scanning and differentiating unwanted vegetation from crops. This approach aligns with regenerative farming principles, emphasizing soil health, biodiversity, and contributing to a more sustainable farming ecosystem. A key advantage of weed detection robots lies in their capability to offer real-time monitoring and data collection. Robots like Blue River Technology's See & Spray, for instance, utilize AI algorithms to patrol fields continuously, capturing and analyzing data on weed.

**g) Unmanned aerial systems:** The incorporation of UAS technology into weed management presents a holistic and effective approach, providing advantages like early detection, precise application, and data-driven decision-making to improve overall weed control strategies. Recently, machine vision systems have emerged as an efficient solution for detecting weeds in vegetable crops, surpassing the accuracy and efficiency of traditional manual methods through the use of image filtering techniques. Unmanned Aerial Systems (UASs), equipped with various sensors and advanced local wireless data collection capabilities, now enable the acquisition of highly detailed information about plant canopies and soil production. UASs offer a unique opportunity to deploy crop and soil sensors, robotics, and advanced information systems at specific field locations in a more timely and efficient manner, ultimately enhancing agricultural production. The effectiveness of an aerial system relies on its ability to cover extensive cropland, hover or focus on specific areas within the crop field, and carry suitable sensor and data storage packages. While traditional remote sensing methods through satellites and low-flying manned aircraft often come with variable data quality and high costs, current trends indicate that fixed-wing UASs provide the longest range, with flight times measured in miles and hours. Advanced electro-optical (photonic) sensor technology is available, and the potential for UAS collaboration networks, where multiple UASs work together—potentially utilizing swarm technology—alongside various terrestrial-based robots, exists. This integrated, collaborative framework aims to achieve outcomes that surpass the capabilities of individual robotic systems. The UAS industry has identified precision agricultural applications, including weed control and management, as the most significant market opportunity through the year 2025[^5].

**Challenges in AI Weed Detection**

**A Challenge of Similarities:** The intricacies of visual similarities, particularly in color and texture, pose a complex challenge for AI algorithms. Navigating this visual maze is crucial for accurately identifying and classifying plants. Manual data labeling errors, pivotal for training supervised learning algorithms, further elevate the risk of misclassification, leading to potentially incorrect weed management actions.

**The Predicament of Precision:** Precision in weed detection is paramount. The objective extends beyond mere identification to precise localization of weeds, facilitating targeted interventions like selective herbicide application. This precision is essential for protecting crops and the environment from unintended damage. However, achieving this level of accuracy demands algorithms capable of adeptly handling the myriad challenges presented by the agricultural landscape[^6].
Traversing Image Processing: Image processing is a fundamental aspect of AI-driven weed detection but is inherently complex. Agricultural imagery encompasses soil, crops, and weeds, each introducing unique challenges. Meticulous image segmentation and extraction processes are required, involving steps such as soil background segmentation, crop elimination, and weed extraction. Each of these stages presents potential pitfalls, necessitating robust and error-resistant algorithms.\(^7\)

Detection of Weeds Based on Position and Edge Features: Although position and edge feature-based detection methods are groundbreaking, they come with their own set of challenges. Achieving accurate edge detection and conducting meticulous pixel histogram evaluations to determine crop row centerlines is crucial. Algorithms must proficiently manage these intricacies to ensure the precision of established centerlines, contributing to effective weed detection and control.\(^8\)

Challenges Related to Data and Costs: Building a substantial dataset that encompasses all essential infestation types across various stages is indispensable for achieving accurate and reliable results in automated weed detection. However, this poses a significant challenge. Additionally, the acquisition of drone imagery, crucial for high-resolution weed detection, is notably costly, potentially rendering it impractical in the near future. Conversely, open-access satellite imagery lacks the spatial resolution required for early-stage infestation detection, limiting its utility to later stages of weed growth.

Limitations for Implementing Precision Agriculture for Weed Control in India

The prevalence of high illiteracy among Indian farmers hinders their adoption of technology in agricultural practices. Despite multiple initiatives by both public and private sectors aimed at promoting the adoption of information and communication technology (ICT) in agriculture, the desired outcomes in terms of awareness and adoption have not been fully realized. However, these initiatives have proven beneficial in enhancing productivity, lowering costs, and increasing returns. Indian farmers commonly face challenges in comprehending the technical aspects of precision farming, including:

- Limited understanding of agronomic factors.
- Lack of comprehension of geo-statistics, essential for grasping the spatial variability of crops and soil when using mapping software.
- Limited capability to integrate information from various sources with varying resolutions and intensities.\(^9\)

Additional reasons include

1. Technology related challenges Low literacy rates among Indian farmers impede the adoption and experimentation with technology. Four variables within technology challenges have been examined

(a) Complexity of Technology Usage: The education level of farmers plays a crucial role in their ability to acquire, process, and utilize information relevant to the adoption of new technology. Increased education facilitates a better understanding of complex technological processes.

(b) Technology Adoption Preconditions: The adoption of technology is contingent upon the specific technology in question. In the case of precision farming, a certain level of proficiency in using software and hardware is necessary for successful implementation.

(c) Competence Required for Precision Farming Technology: Precision farming involves the use of technologies such as GPS, GIS, remote sensing, computers, and sensors. These technologies can pose challenges for adoption among a larger group of farmers with lower literacy levels, given the complexity involved.

(d) Lack of Installation and Training: The absence of local technical expertise and assistance serves as another obstacle for precision agriculture. The need for installation and training further complicates the adoption process, particularly in regions where such support is lacking.

2. Economy related challenges

Economic challenges can be categorized into the following three groups:

- Higher Initial Cost: Precision farming involves numerous costly machines and tools, making them financially unattainable for small and marginal farmers. The high cost and maintenance of sophisticated technologies often make them unavailable for adoption. The perceived initial cost serves as a barrier for farmers to embrace the technology. Small landholdings and a heavy reliance on farming limit the feasibility of investing in high-cost options like precision technology. Additionally, farmers, burdened by debt, often rely on government debt waivers.

- High Operational Cost: The operational costs associated with machines and tools in precision agriculture act as a deterrent to its adoption. The fear of these ongoing expenses hinders farmers from embracing precision farming practices.

- Limited awareness of government subsidies: Providing financial support to farmers can incentivize the adoption of agricultural technology. The Indian government's financial initiatives for the adoption of information and communication technology (ICT) are gradually gaining momentum. Various schemes and policies have been formulated to facilitate the adoption process.

3. Social and behavioral factors

Research study conducted by Far (2018) has revealed a robust positive correlation between farmers' perception, attitude, and the adoption of precision farming. It includes:- Lack of awareness: A significant hurdle in the adoption of precision farming is the lack of awareness and the absence of dedicated education about it among farming communities. In low-income countries, precision agriculture relies heavily on farmers' observations and experiences. Resistance to Change/Technology: The economic analysis of technology adoption aims to explain adoption behavior concerning personal characteristics and the endowment of imperfect information, risk, and uncertainty. In Indian farming, traditional practices have long dominated the landscape, with the same agricultural methods being passed down through generations. Resistance and inflexibility are two major obstacles in the adoption of precision farming.
Impact of Individuals: The social structure in rural areas is mirrored in small groups of farmers who exert significant influence on each other. These groups predominantly follow the lead of opinion leaders. The lack of knowledge and awareness within these groups serves as a barrier for potential adopters. [10]

Conclusion

With the global population expanding and the resulting imperative to augment agricultural production for food security, there is a pressing need for enhanced management of agricultural resources while minimizing adverse environmental impacts. Agronomically, weeds are recognized as a significant threat, leading to substantial yield losses and decreased agricultural efficiency. However, ecologically, weeds can serve as valuable biodiversity indicators within the agrarian ecosystem, contributing ecological services to the agro ecosystem. Weed management encompasses various methods, yet relying solely on a single control method often leads to increased resistance and proves insufficient for long-term weed management. Hence, there is a critical necessity to integrate diverse weed control methods within a holistic approach. The use of herbicides introduces imbalances to the ecosystem, fostering resistance in some species and causing serious environmental problems that pose threats to the well-being and health of both animals and humans. Consequently, the sustainable management of the agricultural system, particularly regarding weeds, emerges as a crucial concern for the current and future well-being of humanity. Beyond integrated management, the adoption of precision technologies specific to weed control can significantly contribute to enhanced sustainability and increased agricultural yields. Therefore, we propose a more effective collaboration between researchers and farmers, incorporating ecological and technological principles into weed management decision-making processes.

References