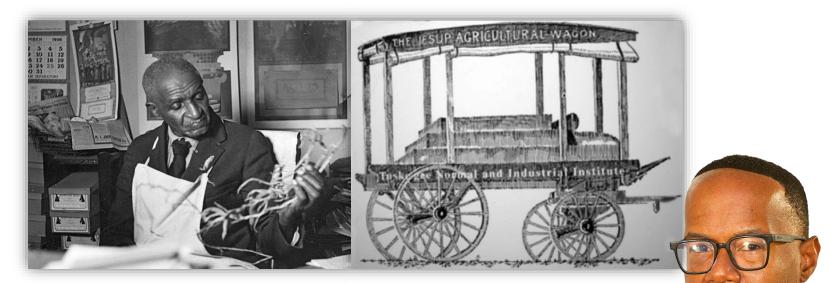
I-FARM University Learning Series

Bridging the Gap: Technology Adoption in Small Holder Farms



Dr. Gregory C. Bernard Tuskegee University





AIFARMS Artificial Intelligence for Future Agricultural Resilience, Management, and Sustainability



I-FARM: Farm of the Future



Center for Digital Agriculture

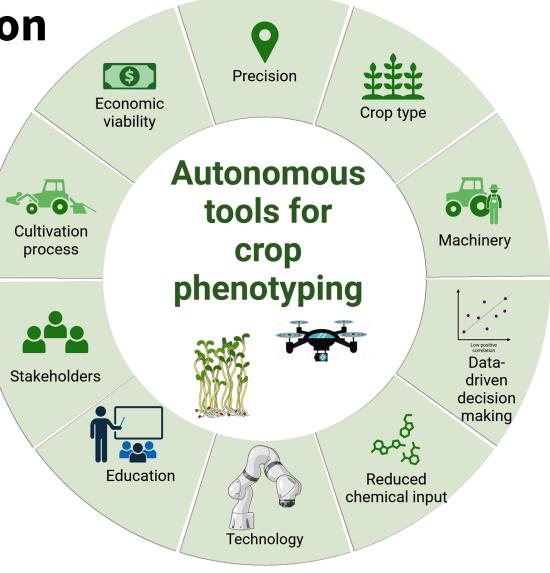


Increased Efficiency and Precision

Enables early detection of pests, diseases, and nutrient deficiencies, reducing crop loss.

Cost-Effective

Reduces labor costs while enhancing yield and quality, making technology accessible to small-scale farmers.

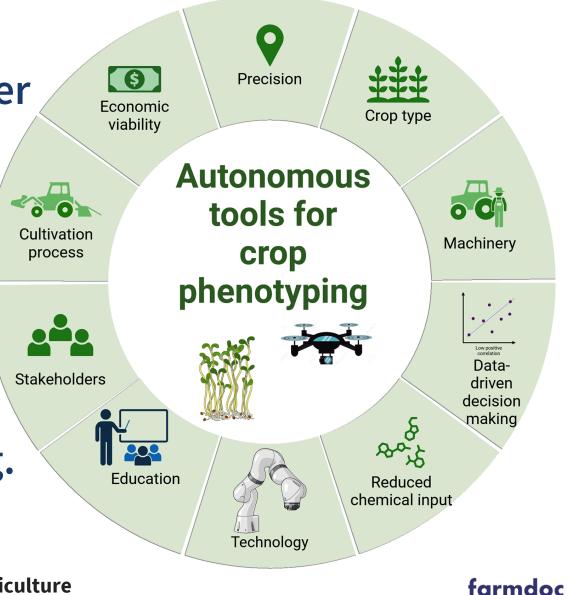


Data-Driven Decisions

Provides real-time insights for better management of irrigation, fertilization, and pest control.

Sustainability

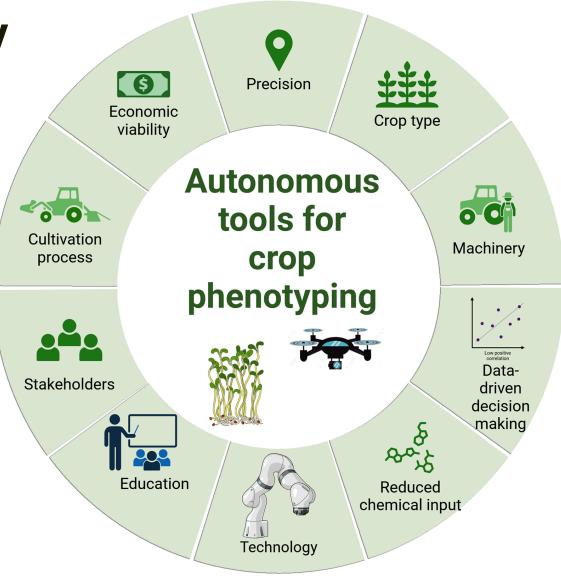
Optimizes resource use, minimizing environmental impact and promoting sustainable farming.



Access to Advanced Technology

Levels the playing field by providing small-scale farmers with cutting-edge tools.





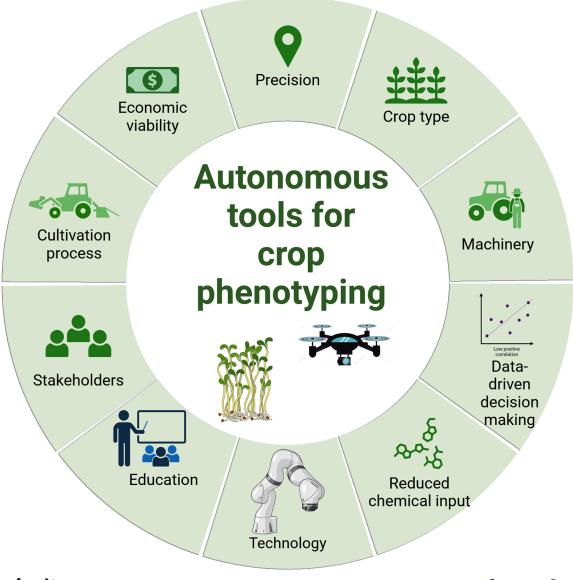
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Improved Productivity

Enhances crop performance and yield, contributing to food security.

Educational Benefits

Supports experiential learning for farmers and students, driving innovation in local communities.





AIFARMS

Al for Future Agricultural

Resilience, Management,

and Sustainability

Collaborative effort

Jessica Wedow AIFARMS Executive Director

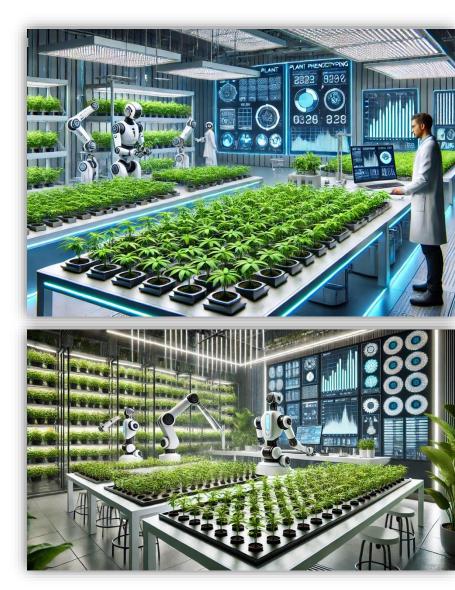


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Introduction to Plant Phenomics

- Plant phenomics involves the study of plant traits (phenotypes) using high-throughput technologies.
- Automation is essential to increase efficiency and accuracy in data collection.
- Applications include crop improvement, stress response analysis, and resource optimization.



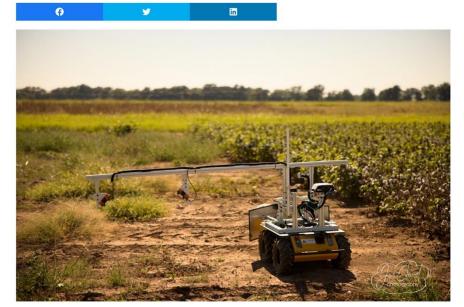
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Automation in Crop Phenotyping

- Overcomes limitations of manual phenotyping, such as labor intensity and time consumption.
- Enhances scalability & reproducibility.
- Enables real-time data collection and analysis.
- Provides insights for precision agriculture and breeding programs.

UNIVERSITY OF TEXAS AT ARLINGTON EMPLOYS HUSKY UGV FOR AUTOMATED PLANT PHENOTYPING

by Sophia Munir | Jun 12, 2023 | Blog, In the Field: Customer Spotlight |



Precision plant phenotyping is an essential practice for breeders to make informed decisions to meet the demands of modern agriculture and to contribute to resilient and sustainable crop production

Decades of extensive research has resulted in the establishment of genetic resources for upland cotton, a globally significant crop that holds tremendous economic importance. With a staggering \$123 billion impact in the United States annually, cotton production contributes significantly to global trade and the textile manufacturing industry. In this context, cotton phenotyping assumes a crucial role by equipping agronomists with high quality data and valuable insights which further advances research in the field.

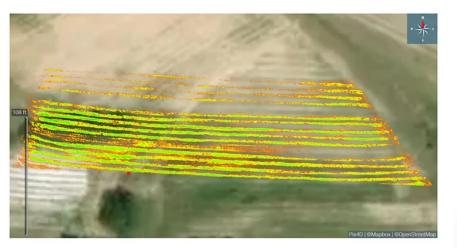
There is an urgent need for advanced technologies, such as robotics and computer vision, that can precisely capture plant phenotypes. With the advent of these technologies, wide scale genomic selection and cotton breeding can be undertaken. To achieve this goal, a team of researchers at the Robotic Vision Laboratory (RVL) at the University of Texas at Arlington is using Husky UGV for automated cotton phenotyping.

https://clearpathrobotics.com/blog/2023/06/ university-of-texas-at-arlington-employs-husky-ugv-for-automated-plant-phenotyping/

Outreach & Extension: Bridging the technology gap to small-scale and minority farmers

Soil Mask

PIX4D**fields**



Layer details

Acquisition	Information not available
Center	32.4144659, -85.8576801 (WGS84)
Area	~9,326.656 ft²
GSD	0.610 in/px
Bands	1 (Gray)

Histogram and Legend



Visualization settings

Histogram equalization: Off Selected minimum value: 0.400 Selected maximum value: 0.888 Values out of range: Transparent

Statistics

Layer area (ac):	9,326.656 ft ²		
Mean index:	0.658		
Index SD:	0.136		
Mean index (visible):	0.655		
Index SD (visible):	0.134		



Outreach & Extension: Bridging the technology gap to small-scale and minority farmers







Outreach & Extension: Bridging the technology gap to small-scale and minority farmers







Integration of technology On-Farm Small Holders

"Even before the onset of the COVID-19 pandemic, agricultural employers were struggling to secure a stable workforce" USDA Farm Service Agency

Farm Labor Stabilization and Protection Pilot Grant Program

The Use of Autonomous Robots to Address Labor Demands and Improve Efficacy in Agriculture. Bernard GC*, Bolden-Tiller O, Egnin M, Bonsi C, McKinstry A, et al. COJ Rob Artificial Intel. 1(5). COJRA. 000523. 2022. DOI: 10.31031/COJRA.2022.01.000523

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The Use of Autonomous Robots to Address Labor

Demands and Improve Efficacy in Agriculture

Bernard GC¹⁸, Bolden-Tiller O¹, Egnin M¹, Bonsi C¹, McKinstry A¹, Landon Z¹, Bob Chen YY², Inocent R¹, Archie T¹, Chowdhury S¹, Charleston C¹, Turner A¹, Brown A¹, Idehen O¹, Mitchell I¹, Boone J¹, Peterson C¹, Lockett A¹ and Mortley D¹

¹Department of Agriculture, College of Agriculture, Environment and Nutrition Sciences, Tuskegee University, Alabama, USA

²Institute for Genomic Biology, University of Illinois Urbana-Champaign, Illinois, USA

Abstract



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and Nutrition Sciences, Tuskegee University, Alabama, USA

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Artificial Intel. 1(5). COJRA. 000523. 2022.

Submission: Hanuary 03 2022

Published: H March 03, 2022

Volume 1 - Issue 5

Agricultural robots, or agribots designed for agricultural purposes, are becoming essential tools to improve efficiency by addressing critical constraints such as labor shortage, agricultural input and cost, and environmental monitoring. The incorporation of autonomous tools like crop propagation Farm BoTTM and Terra SentialTM field bot can improve agricultural production schemes by meeting specialized labor demands and providing field data analyses; thus, advancing numerous aspects of precision farming, potentially lowering production costs and reducing environmental impacts. These technologies are integrated with advanced detection and analytical methodologies to develop growth monitoring models to improve overall performance under precision farming protocols, supporting sustainability.

Farmer Demographics and Labor Constraints

Currently, small-scale farmers (less than \$350,000 in gross cash farm income) comprise 90 percent of all U.S. farms [1]. White farmers (including Hispanics) account for 95.4% of this group, while Hispanic or Latino farmers make up 3.3% of producers, followed by 1.7% identified as American Indian or Alaskan Native and 1.3% Black. One of the significant constraints faced by these farmers is labor costs, which can represent up to forty percent of the total variable costs for vegetable and fruit crop production [2]. A recent survey conducted by the California Farm Bureau Federation reported that 55% of responding farmers had experienced employee shortages, including 69% of farmers who hire due to seasonal needs [3]. Labor shortages are more impactful to farmers who require more exhaustive hand labor in production and harvesting, for example, for orchard and grape farmers. Improved labormanagement strategies, thus, have become critical for the long-term sustainability of farms, especially for small-scale farmers that face increasing resource constraints and prohibited use of alternative labor sources (e.g., foreign workers) [4].

Agribots are autonomous, decision-making, mechanized technologies that perform routine and specialized tasks in agricultural production schemes under human supervision without direct human labor [5-7]. Autonomous crop equipment (also known as crop robots) can potentially address labor constraints, global food security and reduce the environmental footprint of agriculture [5,8,9]. Additionally, in the U.S. and U.K, farm labor has decreased significantly due to the COVID-19 pandemic [10] and the restriction to address its transmission. Incorporating robots and autonomous farming into precision farming protocols for the modern farmer was envisioned long ago [7]. Autonomous robots, including "farm bots" and "field bots," are equipped with cameras, sensors, and mechanical arms (field bots) to help identify potential areas of concern in farming production, including disease monitoring, water management, and nutrient availability, as well as harvesting. The Farm Bot (Figure 1), developed by Rory Aronson et al., is an open-source precision agriculture tool equipped with a camera and several tool-mounts for planting, weeding, soil moisture sensing.

(3). Lator shortages are more impactult to interes with require intere in production and harvesting, for example, for orchard and grape farm management strategies, thus, have become critical for the long-term su especially for small-scale farmers that face increasing resource construse of alternative labor sources (e.g., foreign workers) [4]. Agricultural Robots Agribots are autonomous, decision-making, mechanized technor routine and specialized tasks in agricultural production schemes unde without direct human labor [5-7]. Autonomous crop equipment (a robots) can potentially address labor constraints, global food secu environmental footprint of agriculture [5,8,9]. Additionally, in the U.S. has decreased significantly due to the COVID-19 pandemic [10] and the



Home / Research Tools / Food Safety Research Projects Database

/ ROBOTICS INTEGRATED HIGH TUNNELS (ROBINHIGHTS): CREATING PROFITABLE FOOD OASES IN URBAN ECOSYSTEMS

ROBOTICS INTEGRATED HIGH TUNNELS (ROBINHIGHTS): CREATING PROFITABLE FOOD OASES IN URBAN ECOSYSTEMS

Objective

Urban farms can enable efficient and fresh local food production, minimize food miles, and open new avenues of income for minorities and small communities. However, urban farms face unique challenges associated with achieving profitability at small production scales, maintaining air and soil quality, irrigation, pest management and the climate required for efficient and economically viable produce. In this project, we emphasize High Tunnels (HTs), which are low cost, unheated, metal-tube structures covered with one or two layers of greenhouse plastic to create a protected environment for crops, as ideal solutions for urban farming. HTs are gaining in popularity as they prolong the production season especially in midwestern and northeastern climatic zones, increase yields and improve the quality of highvalue specialty crops such as fruits, vegetables and cut flowers. The primary goal of the projectis to investigate the feasibility of robot-aided autonomy to streamline labor intensive operations in the urban setting. Specifically, the goal of the Robot Integrated High Tunnels (RobInHighTs) platform is to integrate recent advances in robot hardware design, vision-based perception, autonomous navigation, and manipulation towards automating high tunnel operations such as harvesting, pruning and pest management thereby achieving sustainable increases in yield and

Investigators

Krishnan, G.

Institution

UNIVERSITY OF ILLINOIS

Start date

End date 2026

Funding Source Nat'l. Inst. of Food and Agriculture ☑

Project number ILLU-000-685

Accession number 1029772

https://portal.nifa.usda.gov/web/crisprojectpages/1029772.html





G. Krishnan N. Uppalapati G. Chowdhary S. Attallah K. Athey





G.C. Bernard O. Bolden-Tiller T. Gautam

Multifunctional crop robot



Center for Digital Agriculture





I-FARM: Illinois Farming and Regenerative Management Testbed

Overview: I-FARM (Illinois - Farming and Regenerative Management) testbed will accelerate creation, maturation, and adoption of new management technologies that are fundamentally more sustainable, profitable, affordable, and scale-neutral. I-FARM will provide comprehensive management practices for a farm-of-the-future and demonstrate their application on an 80-acre testbed. In the first three years, technologies matured will leverage existing strengths of our team, including improved precision farming with remote-sensing; new under-canopy autonomous robotic solutions for cover-crop planting, variable-rate input applications, and mechanical weeding; remote sensing technologies for animal health prediction; enabled by multimodal networking solutions for rural broadband connectivity and edge Al. The MyFarm app will provide farmers with an integrated dashboard that can be customized to the needs of their farm. Our focus on scale-neutral technologies can provide a solution to the worsening labor crisis for small farms and improve the sustainability of large and spatially heterogeneous farms. Technoeconomic simulations and farmer surveys will clarify barriers and incentives to adoption of sustainable technology to industry and farmers. Integrated extension activities will be conducted in a research space that is open to farmers, where farmers will be provided demonstrations and training, easing the adoption of new technologies and opening new markets for farmers. I-FARM team will engage with the Industry to help Industry create new data-driven products and services for farmers. An Industry Advisory Board and a Farmer Advisory Board will help optimize impact on farming practices. Together, these integrated suite of solutions will lead to sustainable ways of meeting growing demand for agricultural produce.

Principal Investigator: Dr. Girish Chowdhary



Center for Digital Agriculture

Girish Chowdhary, Kaiyu Guan, Madhu Khanna, Isabella Condotta, Deepak Vasisht, and Salah Fuad Issa





O. Bolden-Tiller G. C. Bernard

CAENS





Tuskegee University Farmers Conferences 2023 Dennis Bowman and Dr. Salah Fuad visit (UIUC)

I ILLINOIS

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9/2024 The Cochran Fellowship Program, named after the late U.S. Senator William Thad Cochran, provides short-term training opportunities to agricultural professionals from middle-income countries, emerging markets, and emerging democracies.





The Cochran Fellowship Program, named after the late U.S. Senator William Thad Cochran, provides short-term training opportunities to agricultural professionals from middle-income countries, emerging markets, and emerging democracies.

The goals are:

- to help eligible countries develop agricultural systems necessary to meet the food and fiber needs of their domestic populations; and
- to strengthen and enhance trade linkages between eligible countries and agricultural interests in the United States.

Contact

Global Programs borlaugfellowships@usda. gov

Automated Crop Phenotyping Technologies: TerraSentia, terrestrial phenotyping rover

TerraSentia is a compact field robot designed for plant phenotyping.

Features:

- Measures traits like plant height, biomass, and canopy coverage.
- Operates autonomously in field environments.

Advantages:

- Lightweight and portable.
- High accuracy for close proximity measurements.





Watch the full video at https://www.youtube.com/watch?v=GK5ncp82je4

Source: https://earthsense.co/

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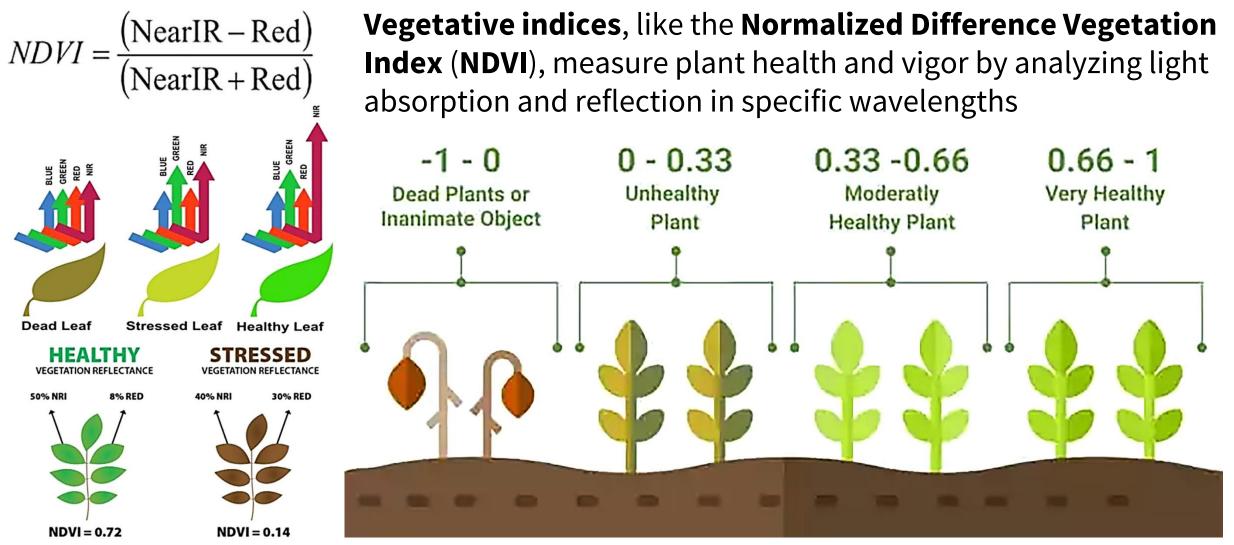
Aerial crop monitoring using UAVs

- Unmanned Aerial Vehicles equipped with multispectral and hyperspectral cameras.
- Applications:
 - Large-scale monitoring of crop health.
 - Stress detection
 - (e.g., water, nutrient deficiencies).
 - Mapping and yield estimation.
- Efficient means relative to "walking the back 40' (acres)

Source: https://phenomics.agron.iastate.ed ILLINOIS Center for Digital Agriculture



Leveraging Vegetative Indices for Advanced Plant Phenotyping: Insights into Crop Health and Stress Response



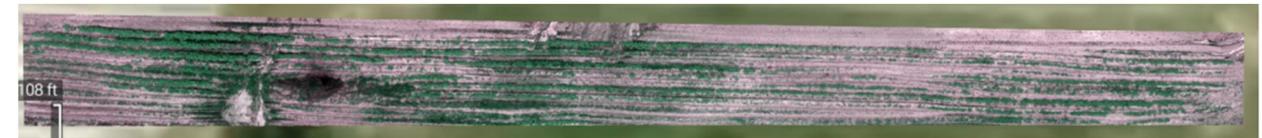
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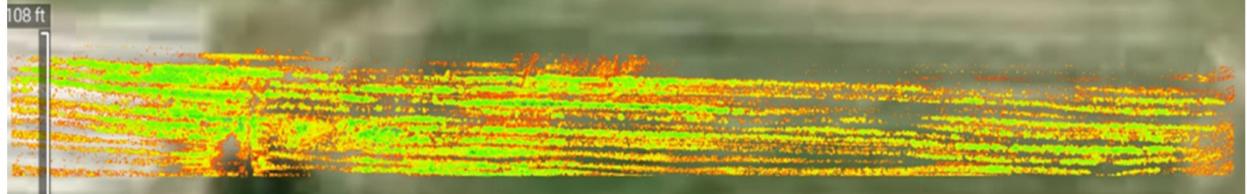
Case Study Crop Health Assessment Hooks Farm, Shorter, AL



Orthomosaic of the Hooks Collards Field



Soil Masked NDVI

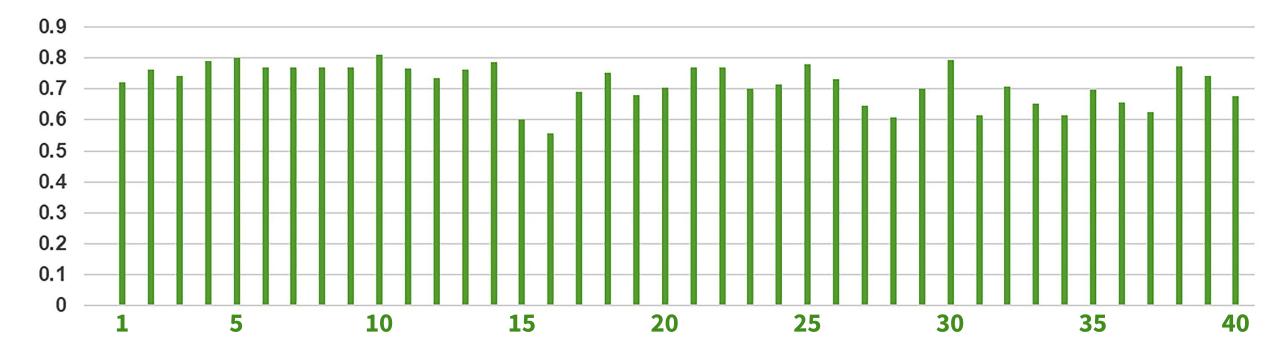


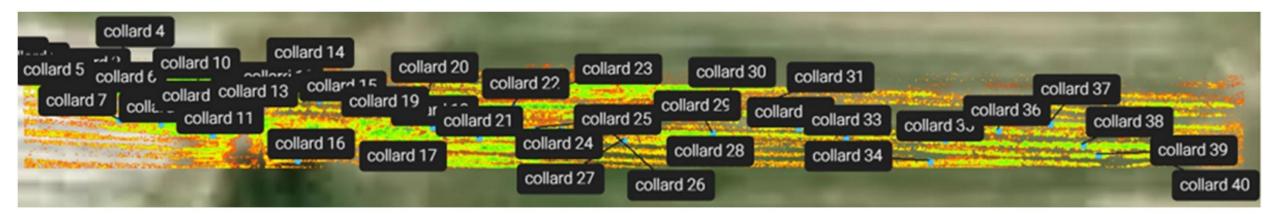
Annotation



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Soil Masked NDVI Values for Collards





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Goals-Empowering Smallholder and Minority Farmers



COOPERATIVE EXTENSION

Expanding Crop Health Assessments and Innovative Phenotyping Technologies for Sustainable Agriculture.



Goals-Empowering Smallholder and Minority Farmers



COOPERATIVE EXTENSION

Student recruitment and training in crop health analyses





Amiga by farm-ng https://farm-ng.com/



Watch full video on farm-ng YouTube channel at https://www.youtube.com/@farm-ng



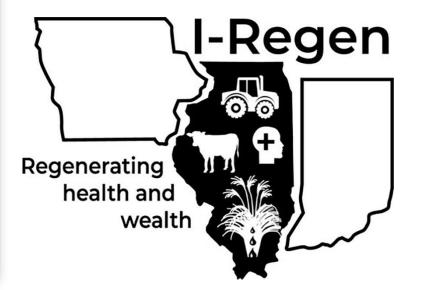


Empowering the next generation of agriculture





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RESULTS:

Metric	Value
Precision	0.998
Recall	0.996
F1	0.996

Table 3. The offline novelty detection module identified novel species, with close to perfect precision and recall. Recognition of the existence of novel species in images is a prerequisite for the subsequent object localization task.

Method	mAP		AP50			AR			
	All	Pigs	Cows	All	Pigs	Cows	All	Pigs	Cows
Teacher	12.5	25.1	-	18.6	37.2	-	34.4	68.7	-
Student	23.3	33.4	13.2	47.9	53.2	42.6	52.5	67.3	37.6

Table 4. Student model improves performance over the teacher model for both seen and novel species. The model detects instances of novel species without any labeling information.

SUMMARY:

- > An offline novelty detection module was used to identify the presence of new semantic categories in the unlabeled data.
- Species₂ was localized using a foundation model with prompts generated by the teacher model.
- Experiments showed that the student model was able to identify species, and species, effectively with a few hundred labeled samples of species,

> Future work will explore more challenging streaming learning scenarios that include new species of animals, including rare animals, for which labeled samples are hard to obtain.

ACKNOWLEDGEMENT:

We thank all the members of the AIFARMS Livestock Thrust for the use of the "Multi-camera pig tracking dataset" (Shirke et al., 2021)

2023 AIFARMS CONFERENCE

Abstract

Understanding Behaviors in Housed Does by usin **Computer-Based Detection** Christian Peterson,¹ Angela Green-Miller,² and Olga Bolden-Tiller¹

Department of Agricultural and Environmental Sciences, Tuskegee University University of Illinois at Urbana-Champaign

Objectives

Detecting estrus in livestock can be a challenging aspect of reproductive management. Incorporating remotely sensed and computer-based tracking technology into housing areas could help detect livestock reproductive behaviors more accurately. The aim of this project is to integrate tracking technology at the Tuskegee University Caprine Research and Education Unit as a means of creating an ethogram that can be used to assist in the creation a computer-based tracking system that can differentiate between estrus and non-estrus goat behaviors. A preliminary study was conducted in accordance with an educational artificial insemination course at Tuskegee University. Ten Kiko goat does were individually housed in the Tuskegee goat barn. Five GoPro hero 8 cameras were placed on individual pens to record behaviors. Each doe underwent a seven-day estrus synchronization protocol. Cameras were used to record at 8 am daily, where they would record one doe each for approximately one hour. Footage from the preliminary study was utilized to create an ethogram and resulting data set for individually housed Kiko does. The images from the data set, depicting tail position, were analyzed by using Teachable Machine software to create a learning model that can be used to differentiate between estrus and non-estrus behaviors. The Teachable Machine software was able to correctly identify tail position (75%), indicating that to correctly identify tail position (75%), indicating that the images captured in the data set can be successfully evaluated by using an algorithm. While further study is needed, the current findings suggest that the integration of a computer-based detection system into a goat operation has the potential to optimize labor and lower costs associated with reproductive management.

Introduction

- Behavioral patterns can be an important indicator of animal health
- It can be difficult to examine animal behaviors due to time involvement and human influence.
- An automated tracking system could allow for an animal's behavior to be monitored continuously
- System has the potential to identify behaviors associated with estrus, ailments, and even parturition An ethogram along with training data set were created from preliminary study

Use Teachable Machine and training data set to train learning model for automatic detection of tail position in does

Materials & Methods

Selected one posture (erect tail) from ethogram while viewing preliminary video recordings



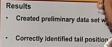
Recordings (8-10 min) were evaluated by a human observer and frames depicting tail position (erect tail; n=40 or down tail; n=40) were selected



Selected images (erect tail or down tail) were analyzed by using Teachable Machine







data set



IFARMS

¹University of Illinois at Urbana-Champaign, ²USDA **Problem Definition** Personalized Federated Learning Federated Parameter Propagation (FEDORA) Input: (1) K private clients each containing a set of training data points; (2) a machine learning algorithm ((-Output: Learn a personalized model $f(\theta_{i}^{*})$ for each client hare only mode



#

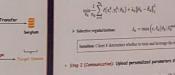
f(0.)

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 $f(\theta_i)$

A Transfer Learning Perspective

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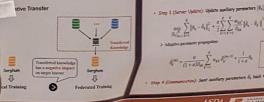
Personalized Federated Learni

Jun Wu¹, Wenxuan Bao¹, Eli

Proposed Algorithm: F

 $-\sum I(x_1^k, y_1^k; \theta_k) + \sum \|\theta_k - \theta_k\|^2 +$

1 Input-Output Relationship: Each client updates its



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- Hands-On Learning: Experience using autonomous robots and innovative agricultural technology
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For more Information contact Dr. Gregory C. Bernard gbernard@tuskegee.edu (334)-727-8401

i-farm.illinois.edu



Welcome to the USDA's only Farm of the Future!

About us

I-FARM stands for "Illinois Farming and Regenerative Management." This University of Illinoisled study — funded for three years and \$3.9M by the U.S. Department of Agriculture's National Institute of Food and Agriculture (NIFA) — is developing an 80-acre agricultural testbed, where commodity crops, cover crops, and livestock are farmed using synergistic, sustainable practices.

The I-FARM testbed features improved precision farming with remote sensing; new autonomous solutions for cover-crop planting, variable-rate input applications, and mechanical weeding; and artificial intelligence-enabled remote sensing for animal health prediction, nutrient quantification, and soil health.

Videos from the field



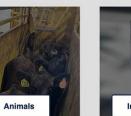
A full I-FARM video playlist may be found on YouTube >>>

I-FARM University: Passing on the knowledge!

I-FARM will demonstrate new technologies, data-driven products, and services for farmers and industry, easing adoption and opening new markets.









Internet of Things

go.illinois.edu/ifarmupdates

Subscribing to: I-FARM Updates

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Join our mailing list to receive the latest updates on the I-FARM project. This includes research, events and extension programming.

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