

Emerging Technologies for Precision Management in Vegetables

Precision Engineering Program

Dr. Yiannis Ampatzidis

Assistant Professor

Southwest Florida Research and Education Center
Agricultural and Biological Engineering Department,
University of Florida



4th Agricultural Revolution

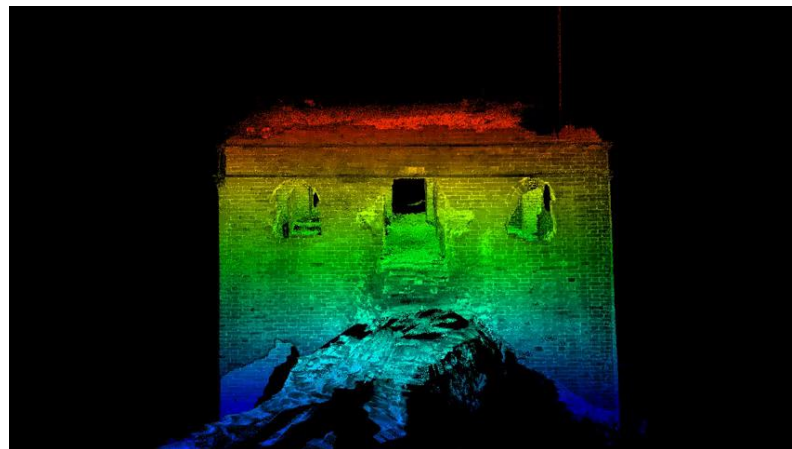
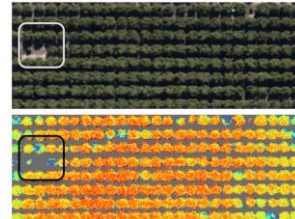
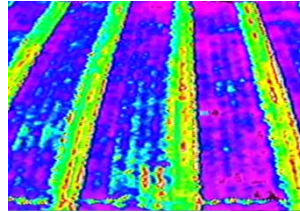
Digital Farming / Big Data / Internet of Things (IoT)

Smart Farming / Smart-Intelligence Machinery

Robotics / Artificial Intelligence (AI)
/ Automation

UAV Imaging

- Thermal
- Multi-Spectral
- Hyperspectral
- Visual – RGB
- LiDAR



UAV-based EDIS Documentation

- Kakarla S.C., and Ampatzidis Y., 2018. *Instructions on the Use of Unmanned Aerial Vehicles (UAVs) for Agricultural Applications*. EDIS, University of Florida, IFAS Extension.
- Kakarla S.C., De Morais L., and Ampatzidis Y., 2019. *Pre-Flight and Flight Instructions on the Use of Unmanned Aerial Vehicles (UAVs) for Agricultural Applications*. EDIS, University of Florida, IFAS Extension.
- Kakarla S.C., and Ampatzidis Y., 2019. *Post-Flight Data Processing Instructions on the Use of Unmanned Aerial Vehicles (UAVs) for Agricultural Applications*. EDIS, University of Florida, IFAS Extension.
- Ampatzidis Y., 2018. *Applications of Artificial Intelligence for Precision Agriculture*. EDIS, University of Florida, IFAS Extension.



Remote Pilot License Training

In order to obtain a Remote Pilot Certificate from FAA under the Small UAS (Part 107) rule, you must pass the initial aeronautical knowledge exam. This training will prepare you to pass this exam and obtain your certificate.

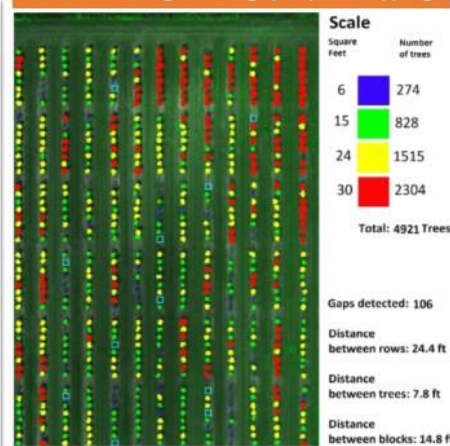
What you learn:

- Airspace and Aeronautical Symbols
- Aeronautical Charts
- FAA Part 107 Regulations
- Airspace Classification
- Aviation Weather
- Risk Management
- and much more

Tuesday, April 30th, 2019
9:00 a.m. - 3:45 p.m.

UF / IFAS Southwest Florida Research and Education Center
2685 SR - 29 / Immokalee, Florida 34142

UAV-based high throughput phenotyping



Agenda

- 9-9:15 am
- Opening remarks and introductions- Dr. Yiannis Ampatzidis and Jennifer Bearden -15 min
- 9:15-9:55 am
- Section 1 – Aircraft identification and registration – 30 min
- Break/questions – 10 minutes
- 9:55-11:15 am
- Section 2 – Airspace and Aeronautical Symbols – 50 min
- Sectional Chart Reading Activity – 20 min
- Break/questions – 10 minutes
- 11:15-12:15 pm
- Section 3 – Aviation weather and effects – 50 min
- Lunch Break
- 1-1:20 pm
- UF procedures- John Rouse – 20 min
- 1:20-2 pm
- Section 4 – Risk management – 30 min
- Break/questions – 10 min
- 2-2:45pm
- Section 5 – Aeronautical knowledge – 30 min
- 2:45-3:15 pm
- Applications in Agriculture-Yiannis Ampatzidis and Jennifer Bearden-30 mins
- Final questions – 20 min
- Planning Committee: Yiannis Ampatzidis, Jennifer Bearden, Jim Fletcher, Gene McAvoy

Register for your spot on the Eventbrite link (\$75 per person) below. There is no registration fee for extension agents, and UF faculty, students and staff (\$10 is requested for lunch). Still need to register here:

<https://www.eventbrite.com/e/remote-pilot-license-training-tickets-59955736221>

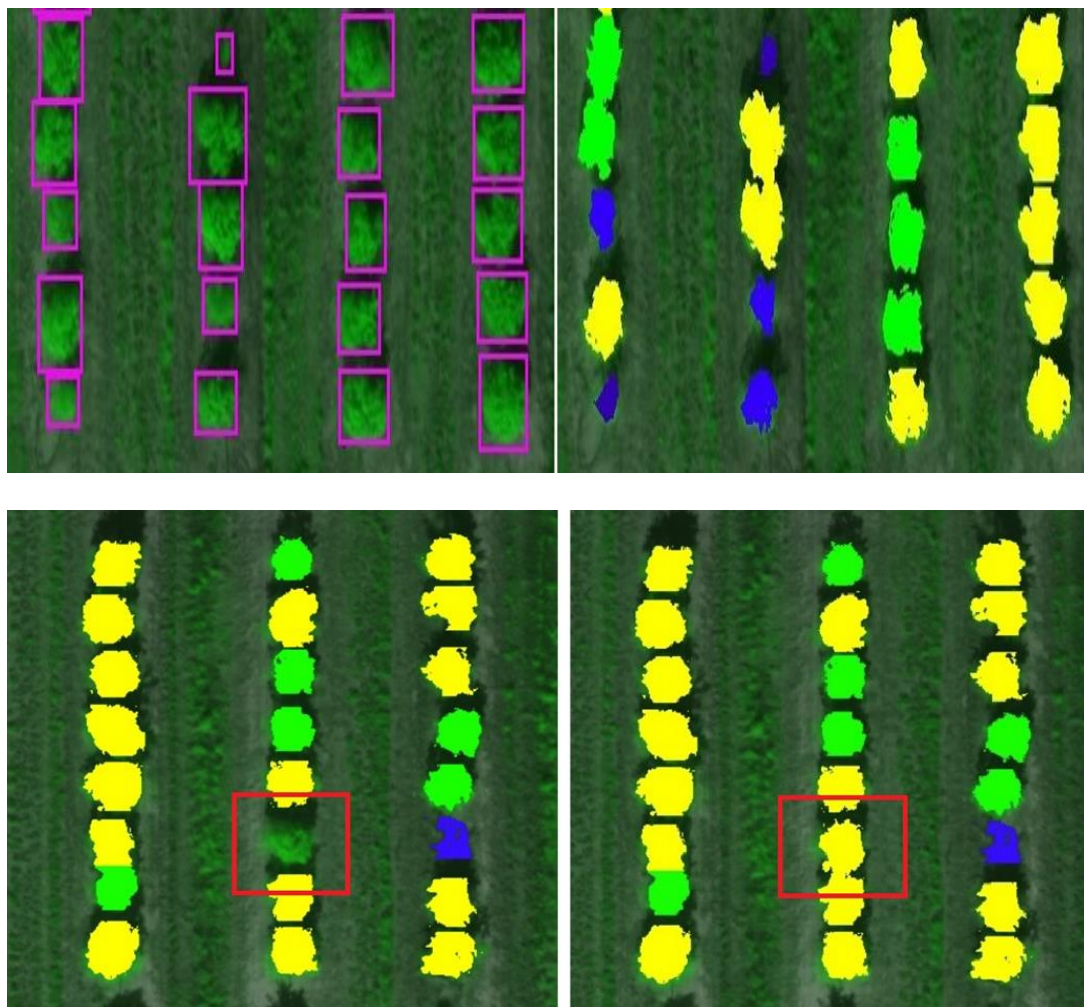
Lunch is provided.

For questions, call 239-658-3415 or email Jennifer Derleth at jderleth@ufl.edu.

KIWI UAV Spraying System

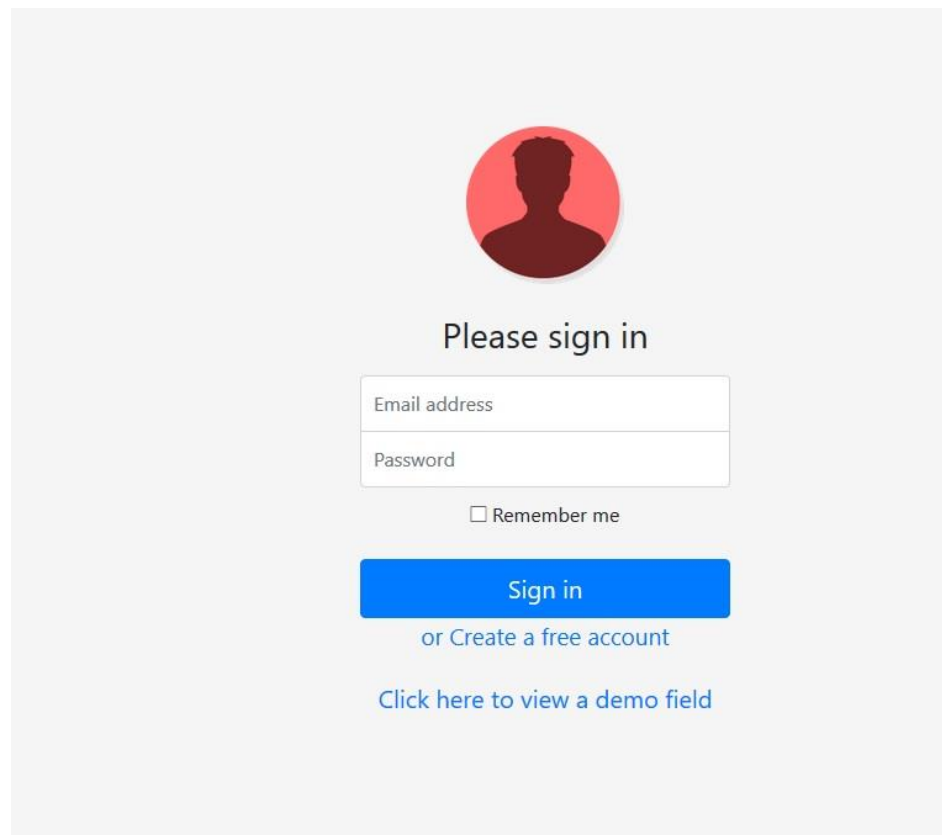


UAV-based Object Detection using Artificial Intelligence (AI)



Ampatzidis Y., and Partel V., 2019. UAV-based High Throughput Phenotyping in Citrus Utilizing Multispectral Imaging and Artificial Intelligence. *Remote Sensing*, 11(4), 410; doi: 10.3390/rs11040410.

Agroview.farm – sign in

The image shows a sign-in page for Agroview.farm. At the top center is a red circular icon containing a dark silhouette of a person's head and shoulders. Below the icon, the text "Please sign in" is centered. Underneath is a white form with two input fields: "Email address" and "Password". Below the form is a checkbox labeled "Remember me". A prominent blue button with the text "Sign in" is centered below the checkbox. Underneath the button, the text "or Create a free account" is displayed in a smaller font. At the bottom of the form area, there is a blue hyperlink that says "Click here to view a demo field".

Please sign in

Email address

Password

Remember me

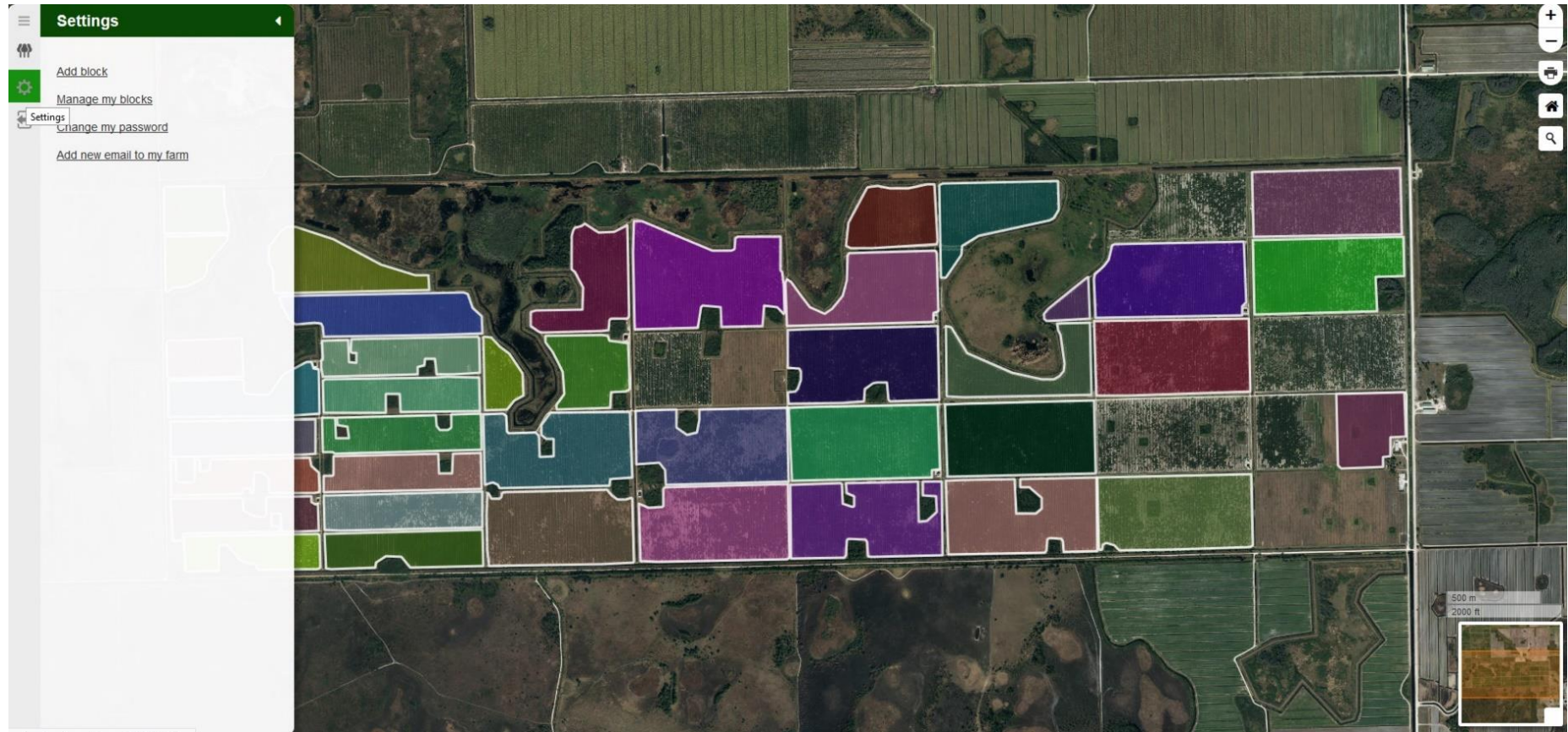
Sign in

or Create a free account

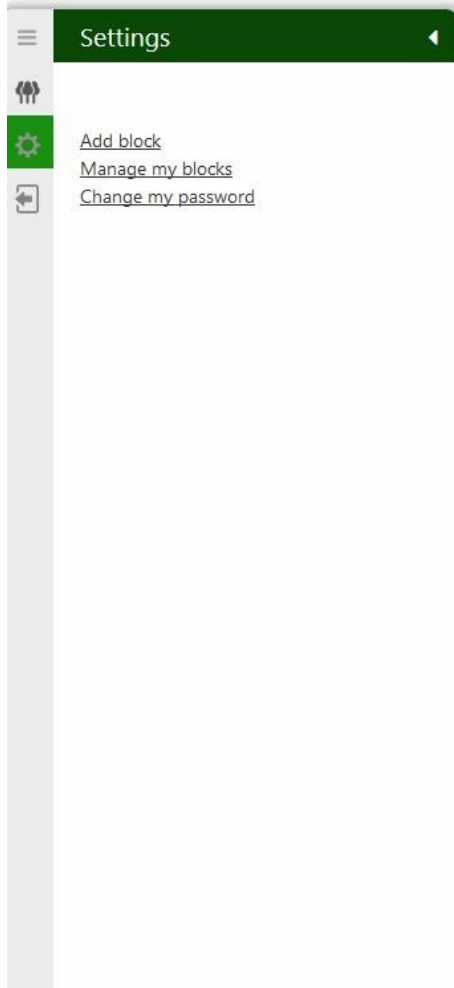
[Click here to view a demo field](#)

- UAV and ground-based high throughput phenotyping in citrus utilizing artificial intelligence. Huanglongbing Multi-Agency Coordination (MAC) Group. Duration: 8/1/2019 – 7/31/2021.
- UAV-based high throughput phenotyping in specialty crops utilizing artificial intelligence. Florida Specialty Crop Block Grant Program - Farm Bill (SCBGP-FB). Duration: 1/1/2020 – 8/31/2022.

Agroview – settings



Agroview – add block

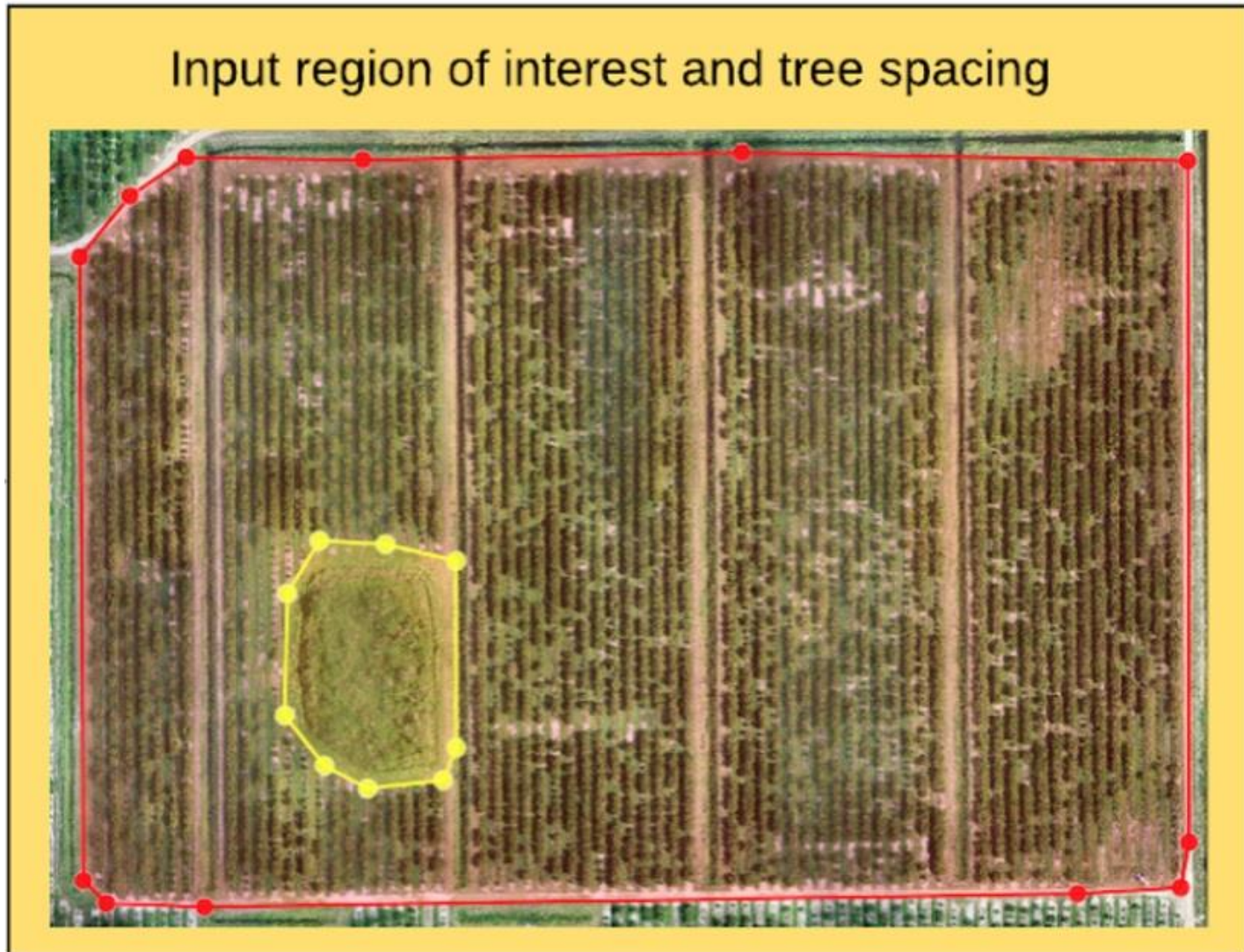


Select an upload option

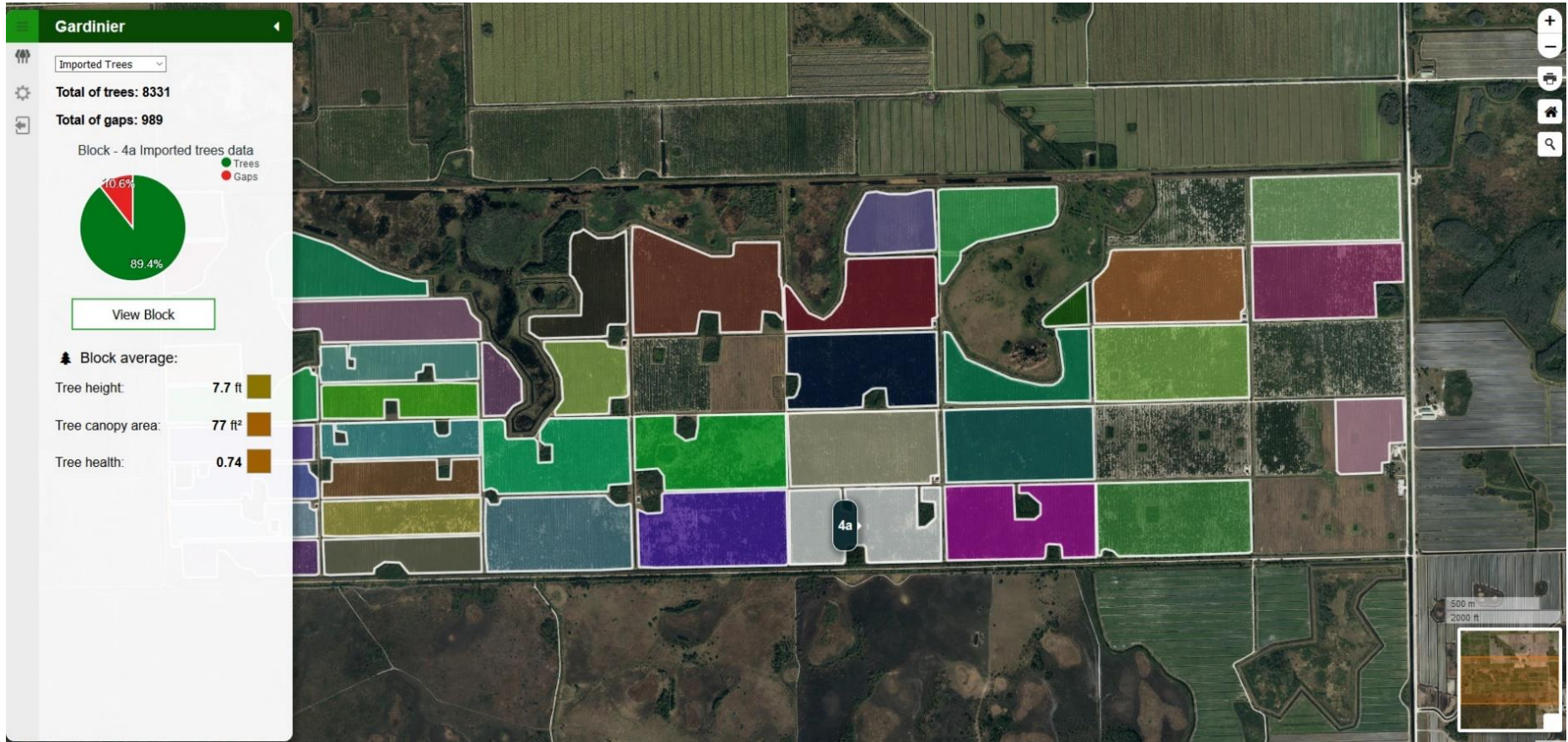
I have multiple UAV collected images to upload

I have a processed UAV orthomosaic map to upload

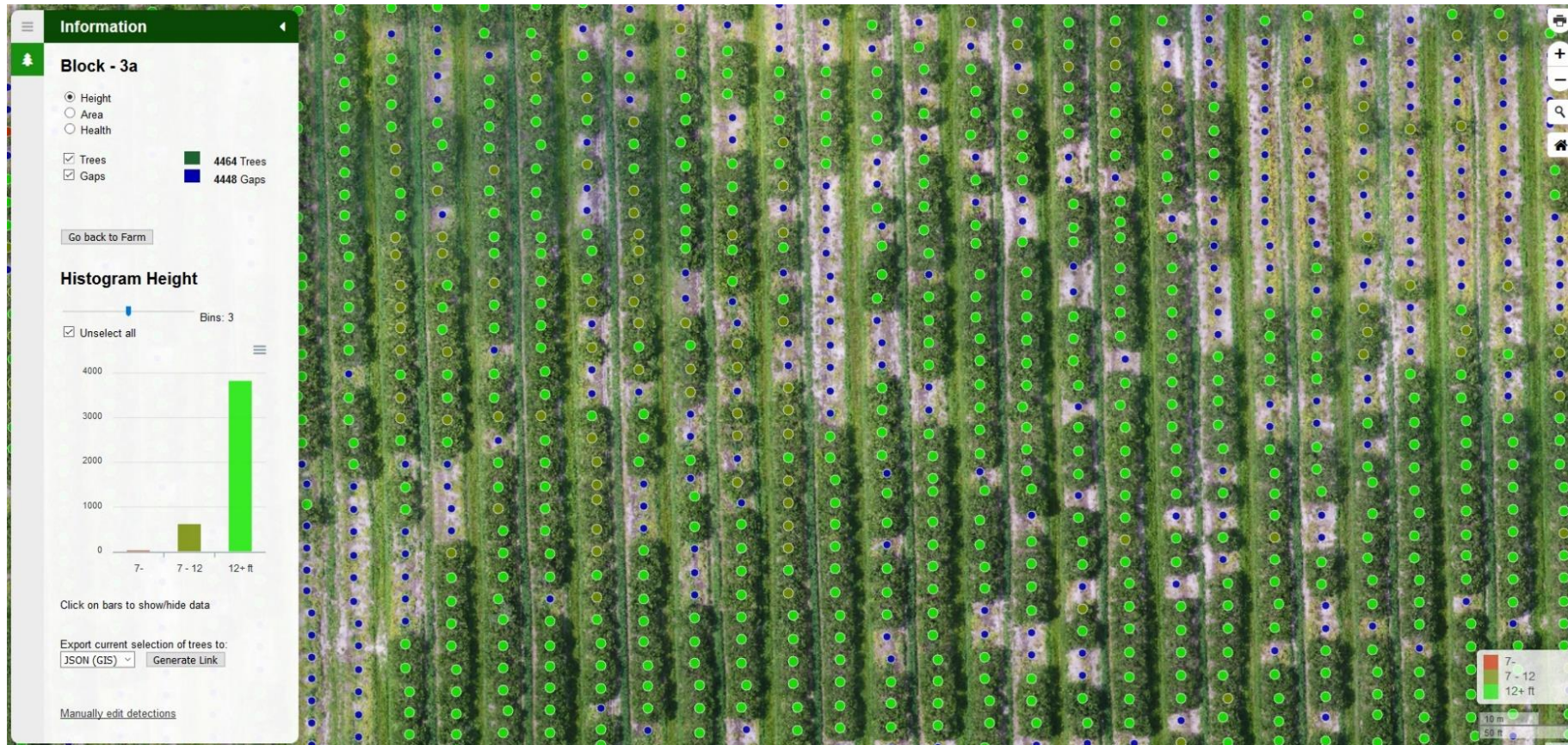
Agroview – create field boundaries



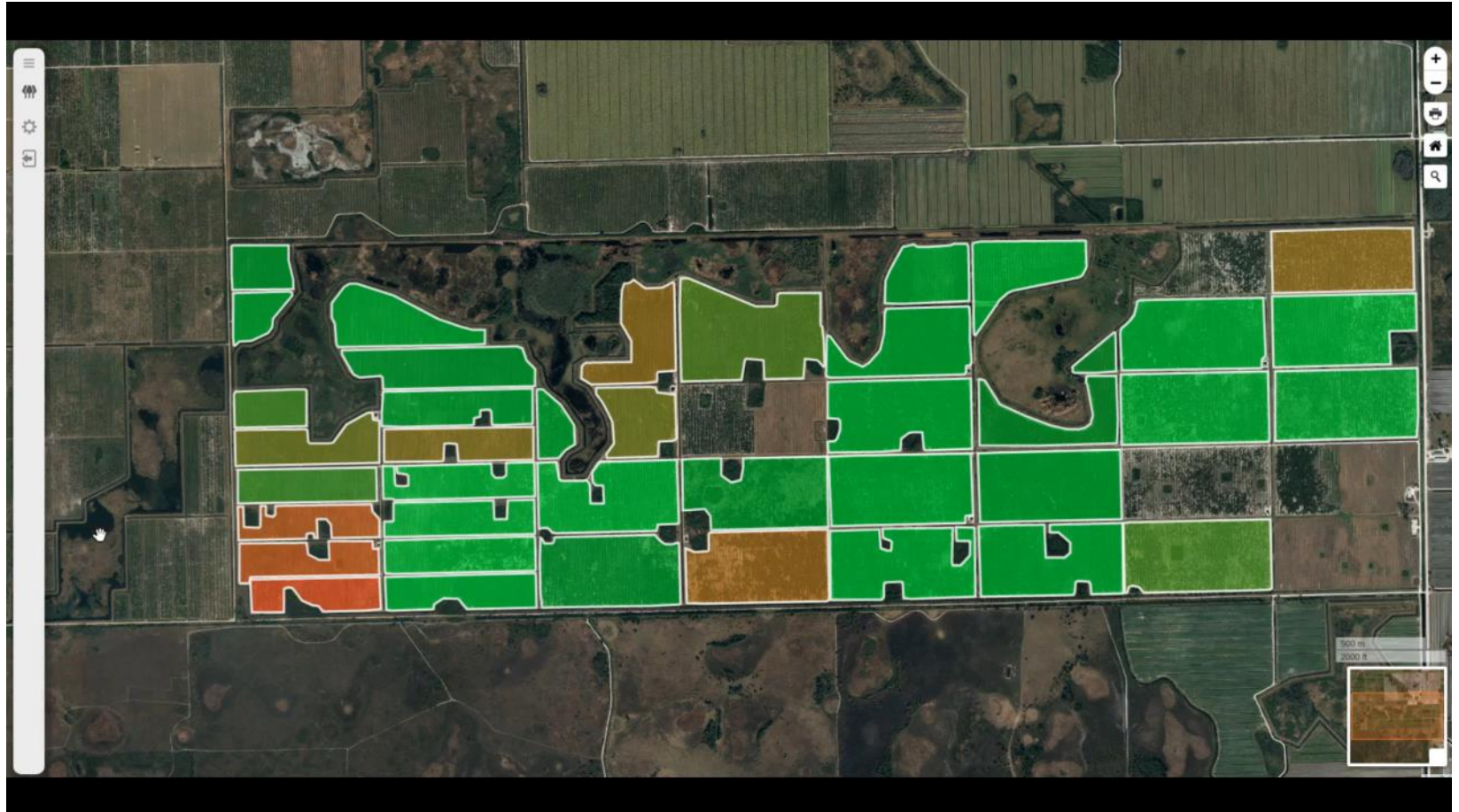
Agroview – farm analytics



Agroview – field analytics

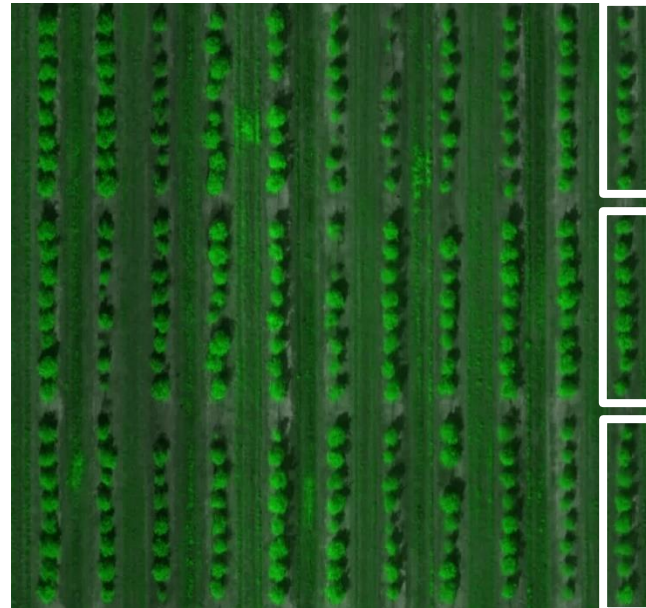
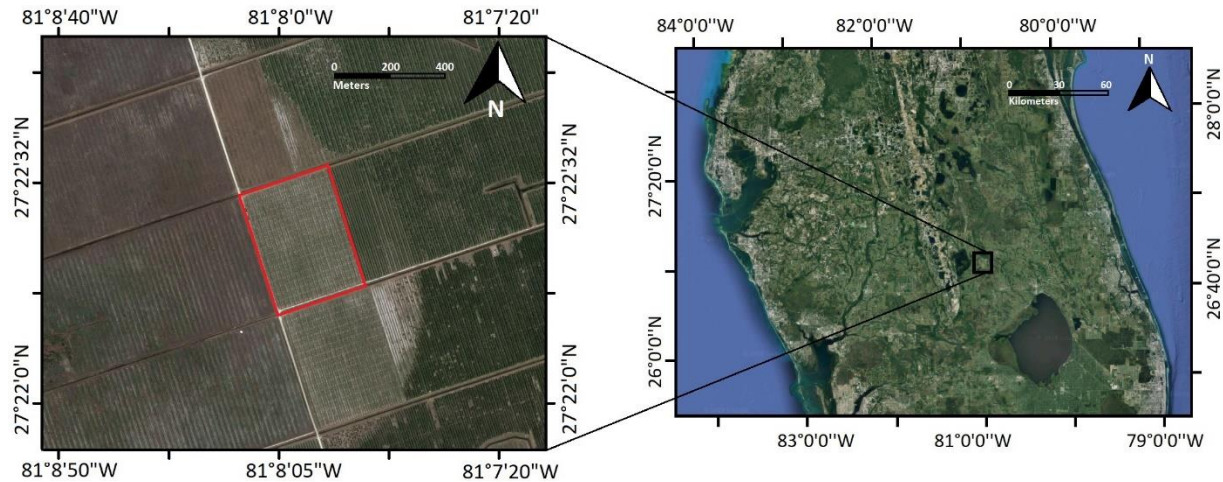


Cloud-based application to process, analyze, and to visualize UAV collected data



<https://twitter.com/i/status/1202671242647490560>

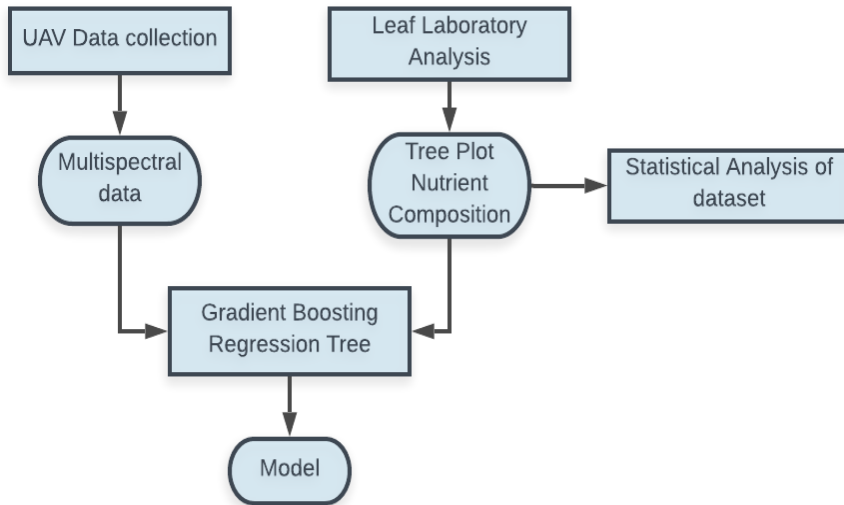
Citrus Rootstock Evaluation Utilizing UAV-based Remote Sensing and Artificial Intelligence



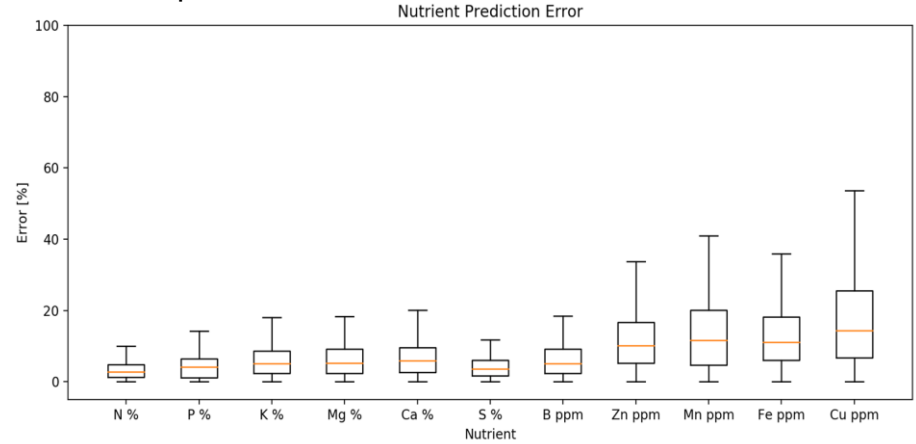
Ampatzidis Y., Partel V., Meyering B., and Albrecht U., 2019. Citrus Rootstock Evaluation Utilizing UAV-based Remote Sensing and Artificial Intelligence. *Computers and Electronics in Agriculture*, 164, 104900, doi.org/10.1016/j.compag.2019.104900.

Best Management Practices Machine Learning Prediction Model: Gradient Boosting Regression

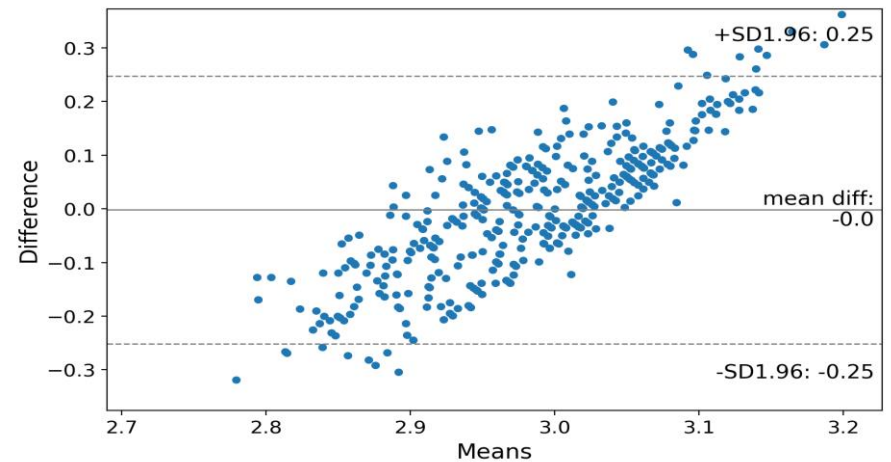
Workflow of the dataset collection, analysis and regression model



Whisker plot of the distribution of errors for each nutrient



Bland and Altman diagram for nitrogen measurements



Best Management Practices

UAV-based Nutrient Estimation and Precision Fertilizer Applications

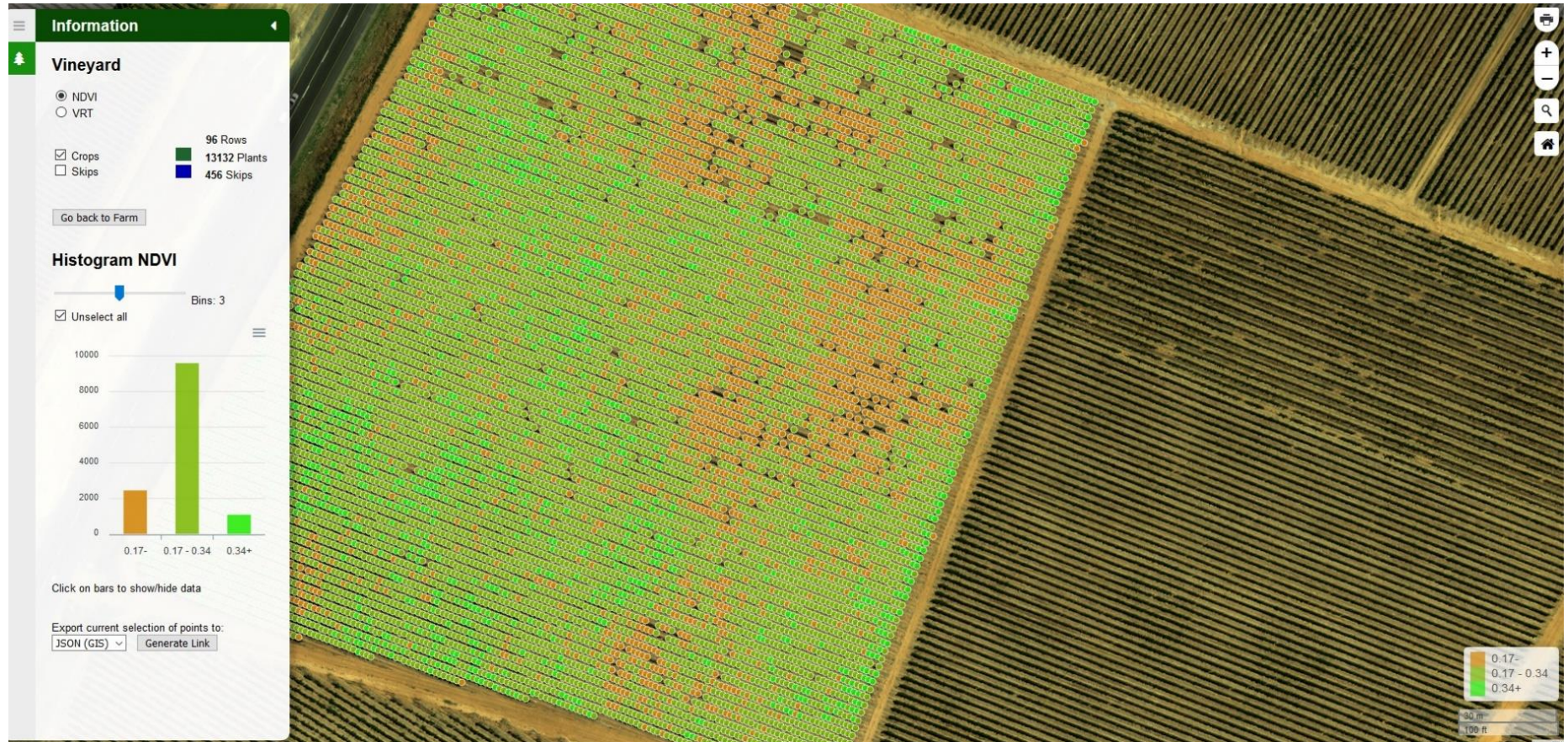
Manual Data Collection

- 800 trees (Hamlin and Valencia)
- 8 hours sample collection
- 4 people
- 2 weeks lab analysis
- Estimated cost: *\$10,500*

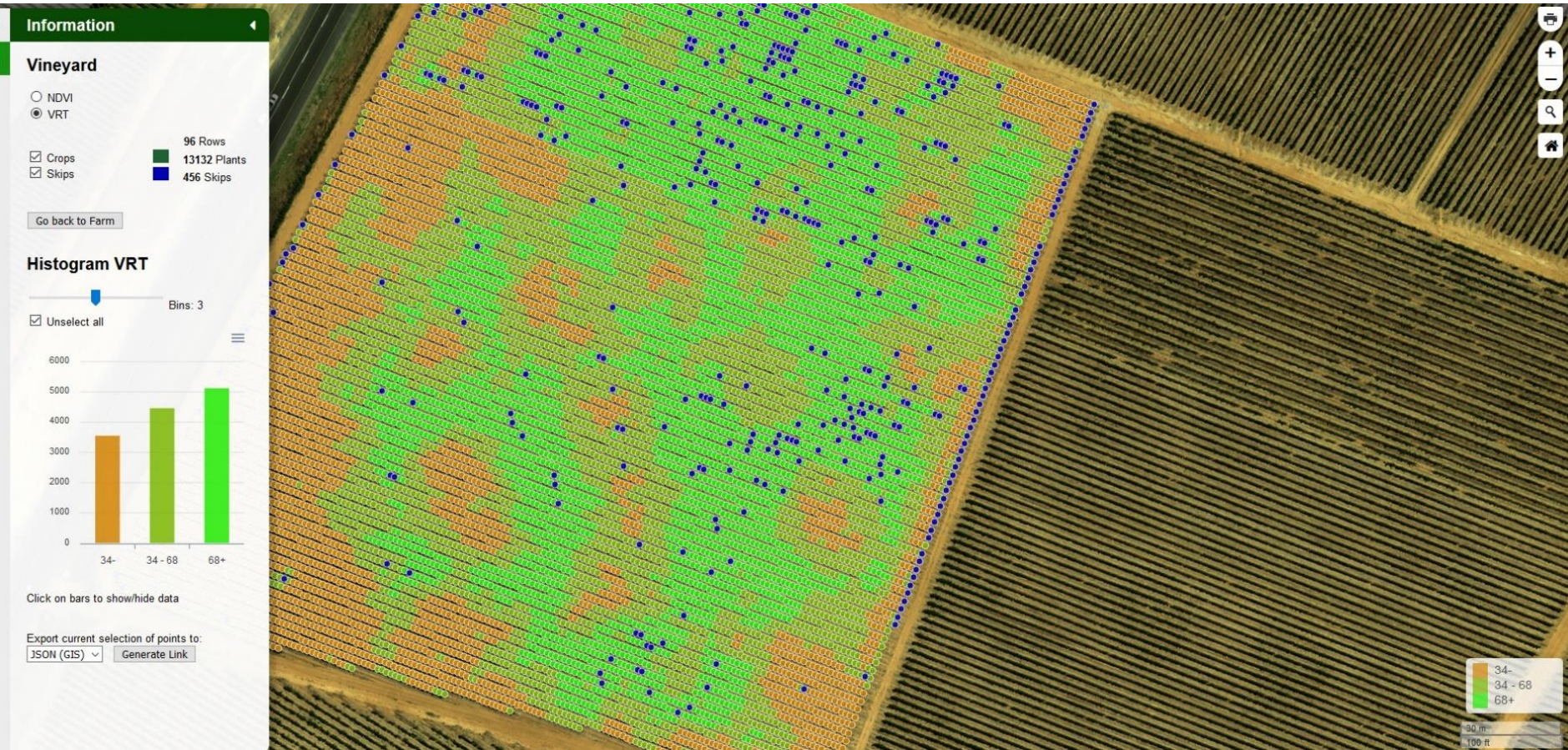
UAV-based with Agrovieview

- 5,000 trees
- 30 min flight
- 1 person
- 5 min analysis
- Estimated cost: *\$100*

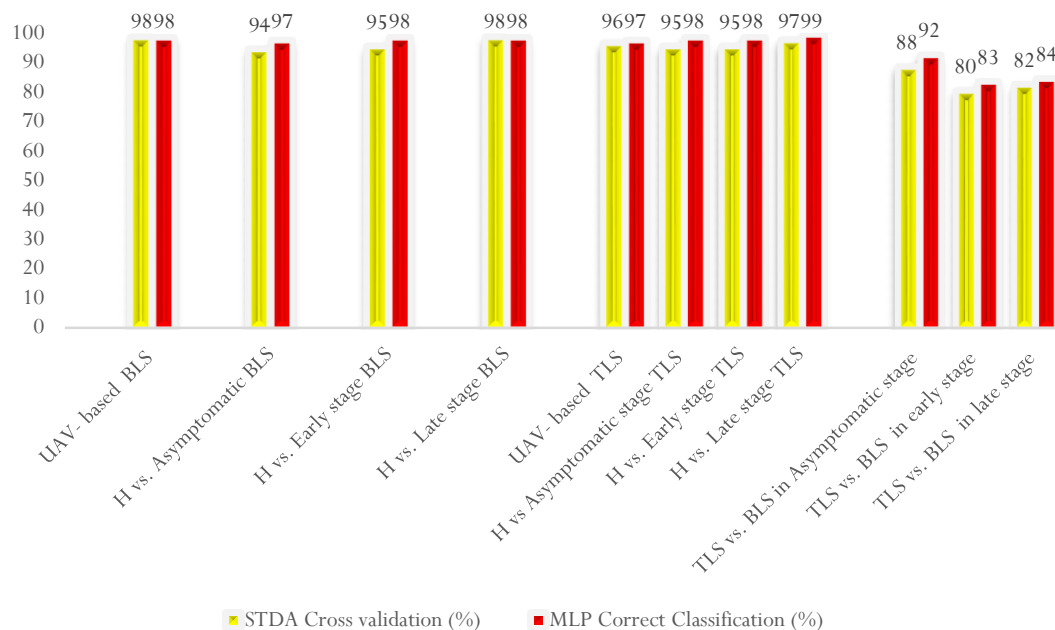
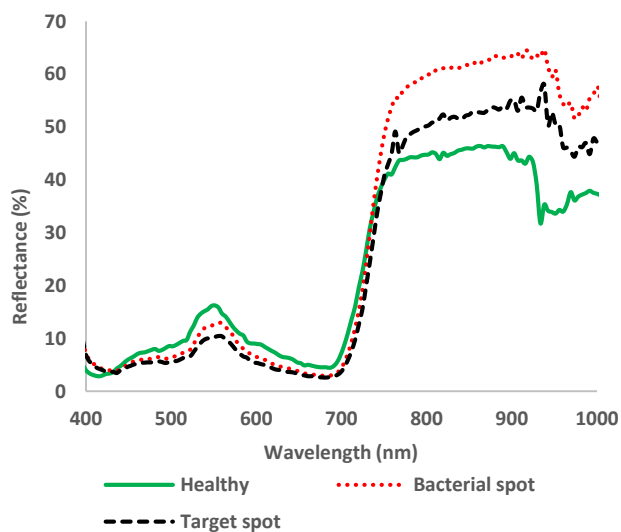
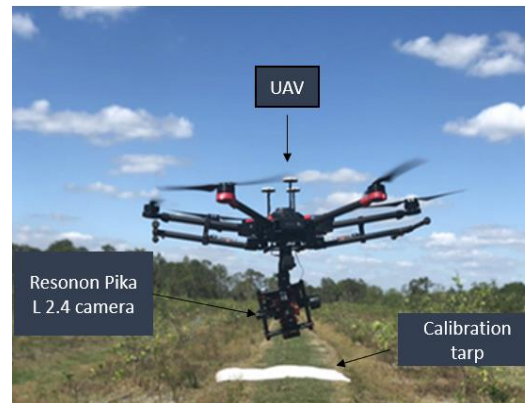
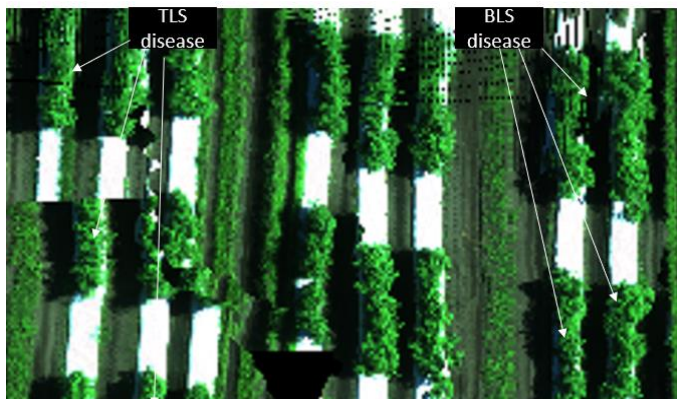
Vineyard Map - NDVI



Vineyard Map - VRT



Detection of target spot and bacterial spot diseases in tomato using UAV-based hyperspectral imaging

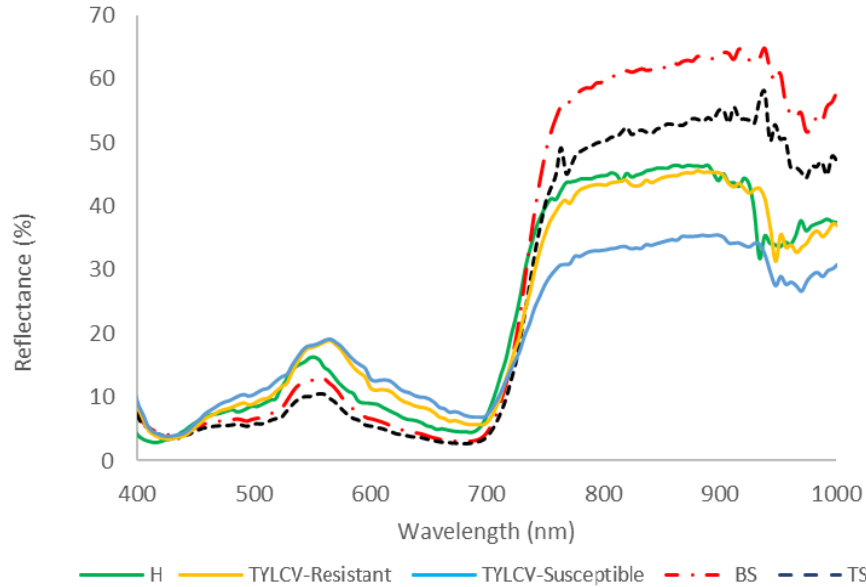


■ STDA Cross validation (%)

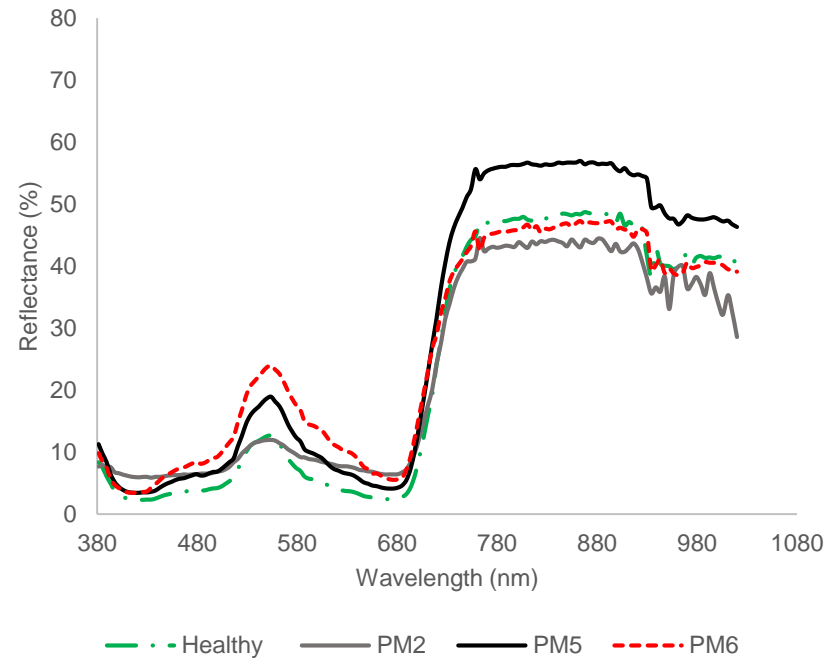
■ MLP Correct Classification (%)



UAV-based Disease Detection Hyperspectral Imaging

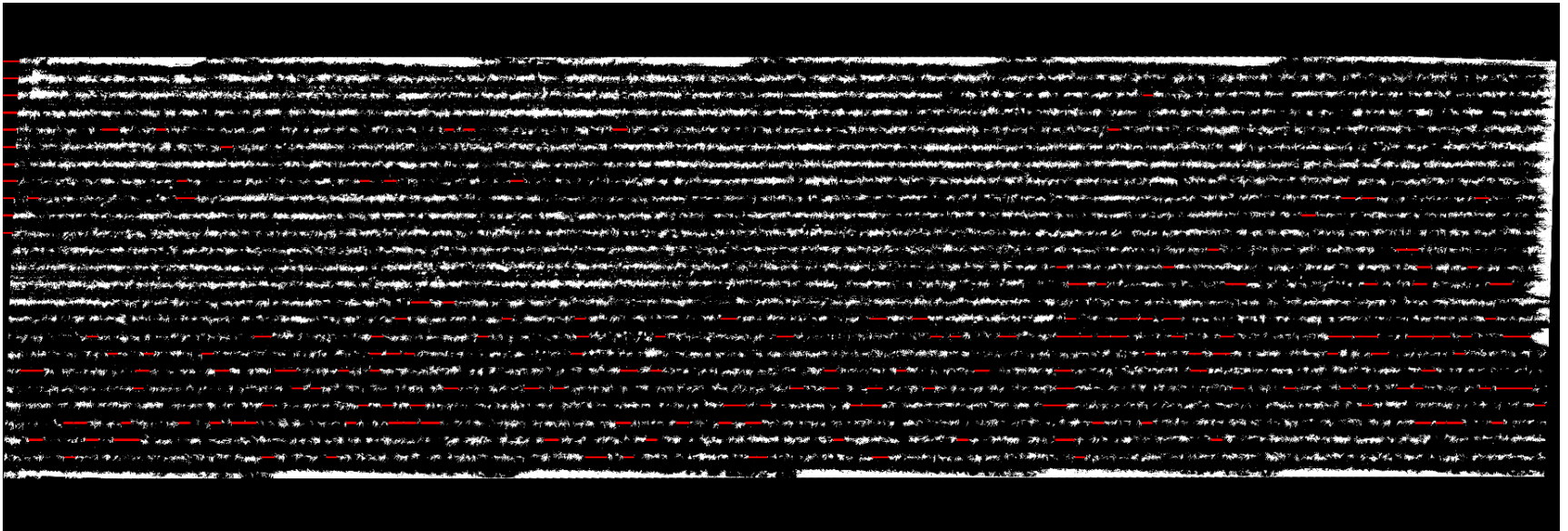


Spectral reflectance signatures of *Tomato yellow leaf curl virus* (TYLCV, on susceptible and resistant tomato varieties), Bacterial Spot (BS), and Target Spot (TS) infected tomato plants



Spectral reflectance signatures of healthy squash plants and Powdery Mildew (PM) infected plants in different disease development stages (asymptomatic, early and late stages).

Detecting Skips in Sugarcane Fields



Yield prediction in winter wheat under stress environmental conditions



- Panel A: 40 genotypes (250 plots) (2018-2019) for heat stress tolerance.
- Panel B: 260 genotypes (2017-2018) under irrigated and drought conditions.
- Plot size: 5.1 m² (3.3 x 1.52 m)
- UAV-based hyperspectral data (400–1000 nm) at 200 ft (last flight: 1 month before harvest).

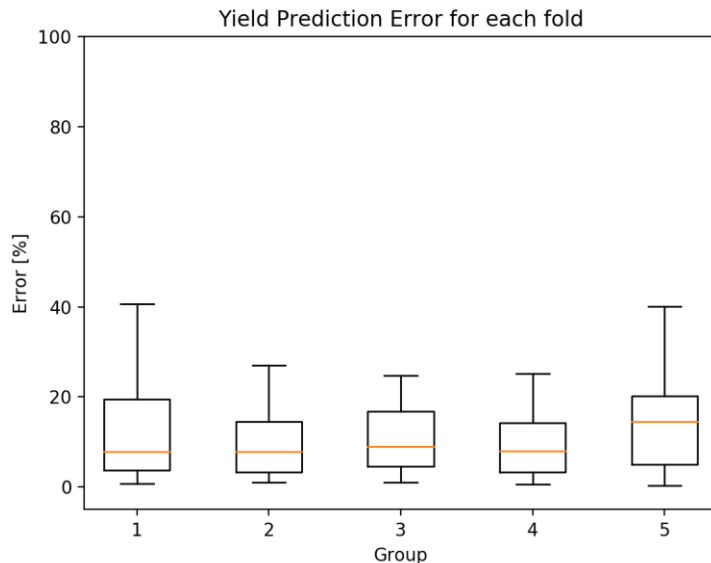


Yield prediction in winter wheat under stress environmental conditions

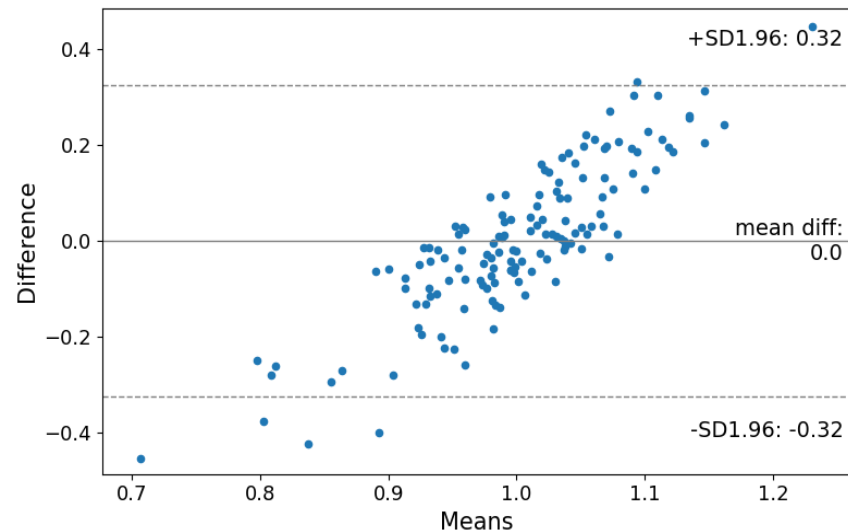
Mean Absolute Percentage Error (MAPE) for each group in the cross-validation of Panel A.

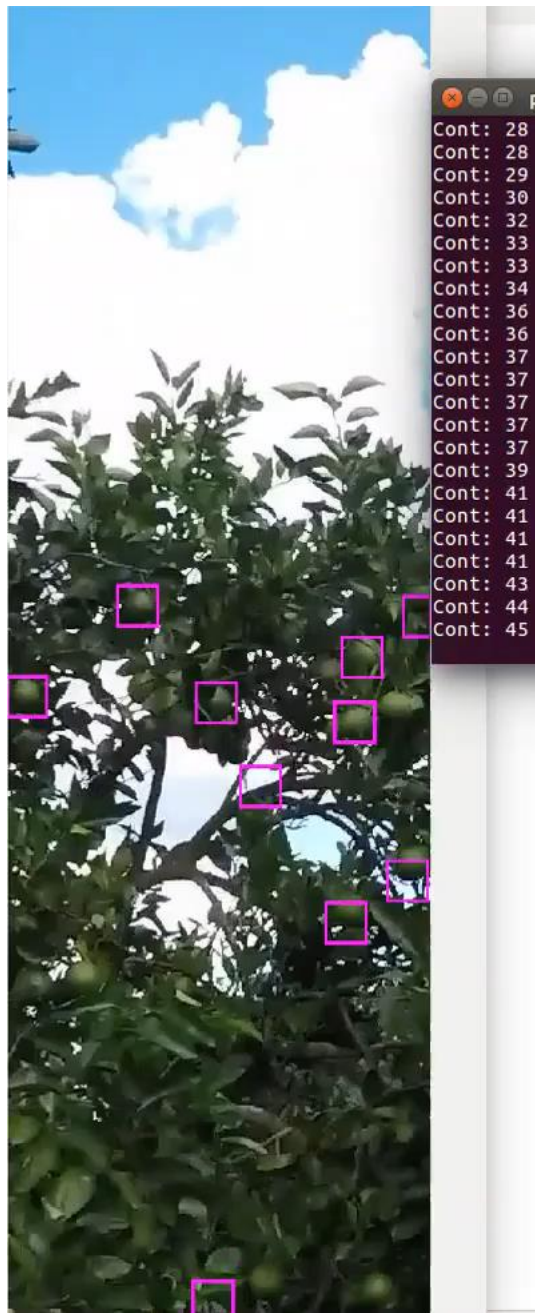
	Group 1	Group 2	Group 3	Group 4	Group 5	Mean
MAPE	15,6%	10,2%	12,2%	12,0%	17,1%	13.4%

Whisker graph for the error in yield prediction for Panel A.



Bland and Altman diagram in percentage for the Panel A dataset.





<https://twitter.com/i/status/1042058065481269248>

Smart Spray Technologies

Example: more than 90% of the cropland in the U.S. are being sprayed by more than 3 billion pounds of herbicides that costs around \$26 billion each year.

Overuse of these chemicals creates *herbicide-tolerant weeds* with around 250 known species of resistant weeds.

GreenSeeker by Trimble



“The Trimble® GreenSeeker® crop uses optical sensors to measure and quantify crop health—or vigor. It can precisely manage crop inputs on-the-go. With GreenSeeker, you can address field variability by applying the right amount of fertilizer, in the right place, at the right time.”

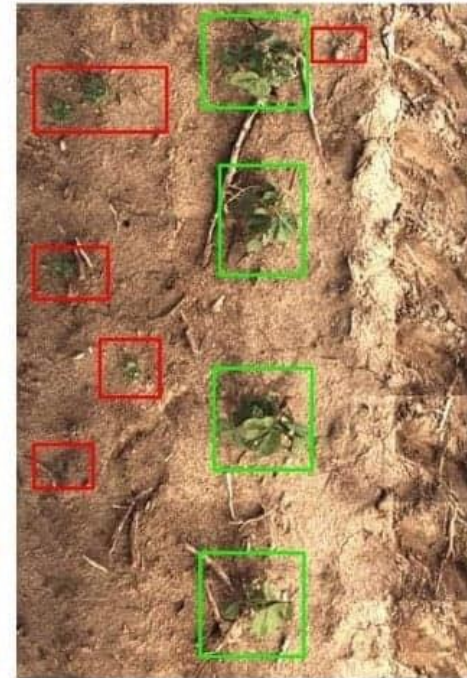
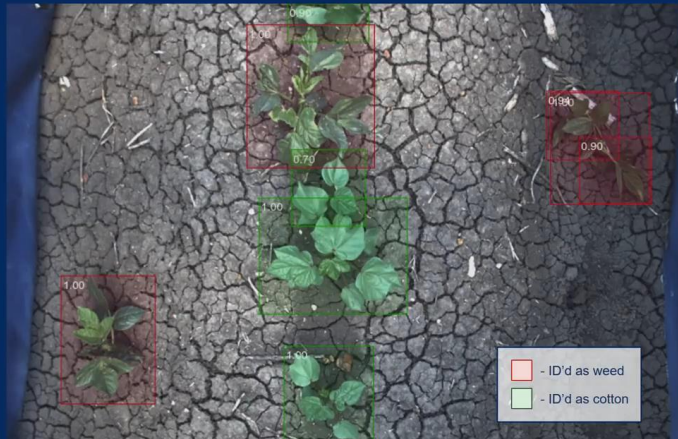
<https://agriculture.trimble.com/product/greenseeker-system/>

Artificial Intelligence for Precision Pest Management in Vegetables and Strawberry

Precision Weeding

Blue River Technology

See & Spray every weed



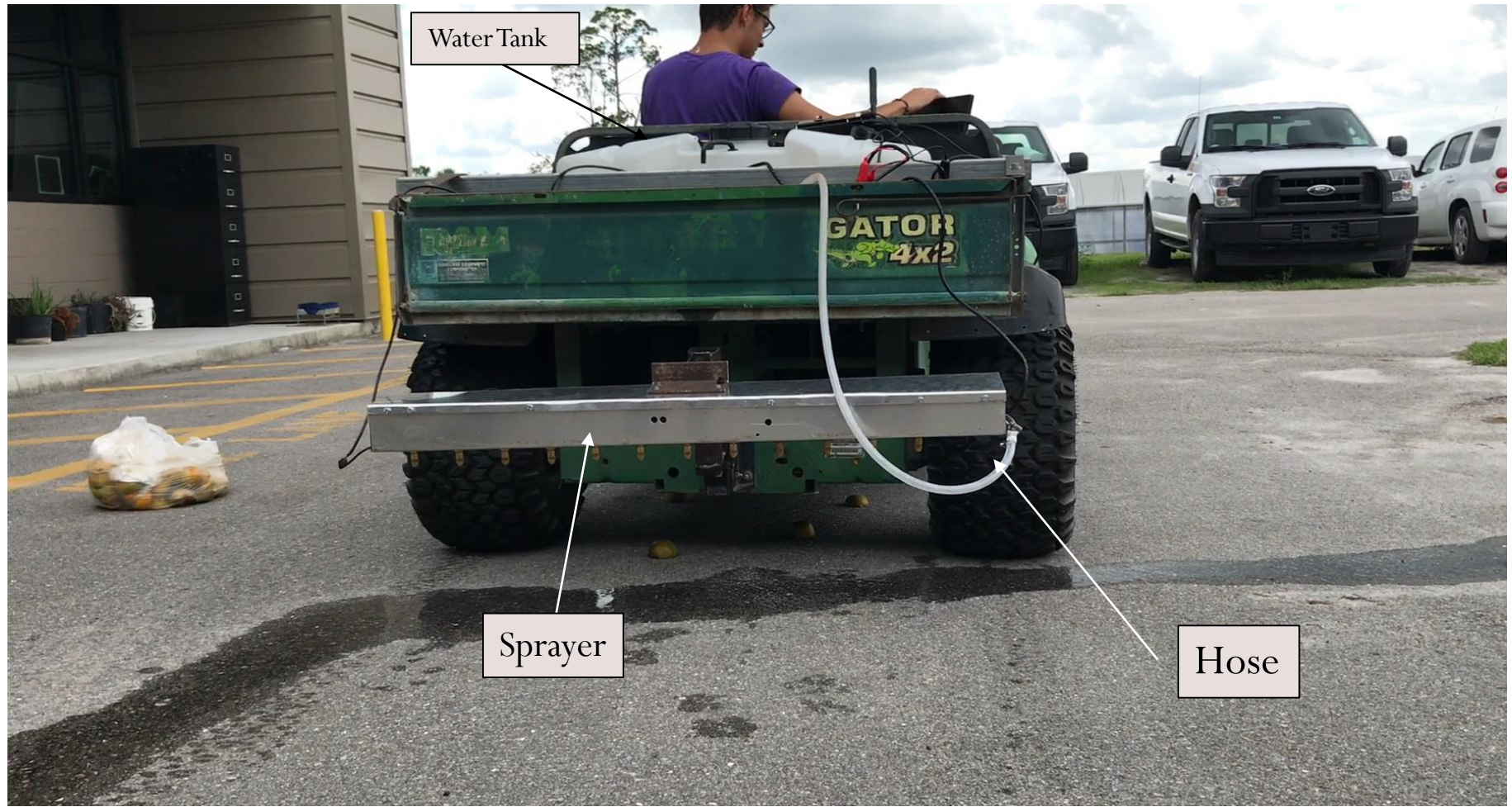
- 5,000 plants per minute
- 40 acres/day by one machine
- ¼ precision in inches at 4 mph

Smart Weed-Killing Robots



<https://www.cnbc.com/2018/06/04/weed-killing-ai-robot.html>

Precision Sprayer (PS) for Weed Management



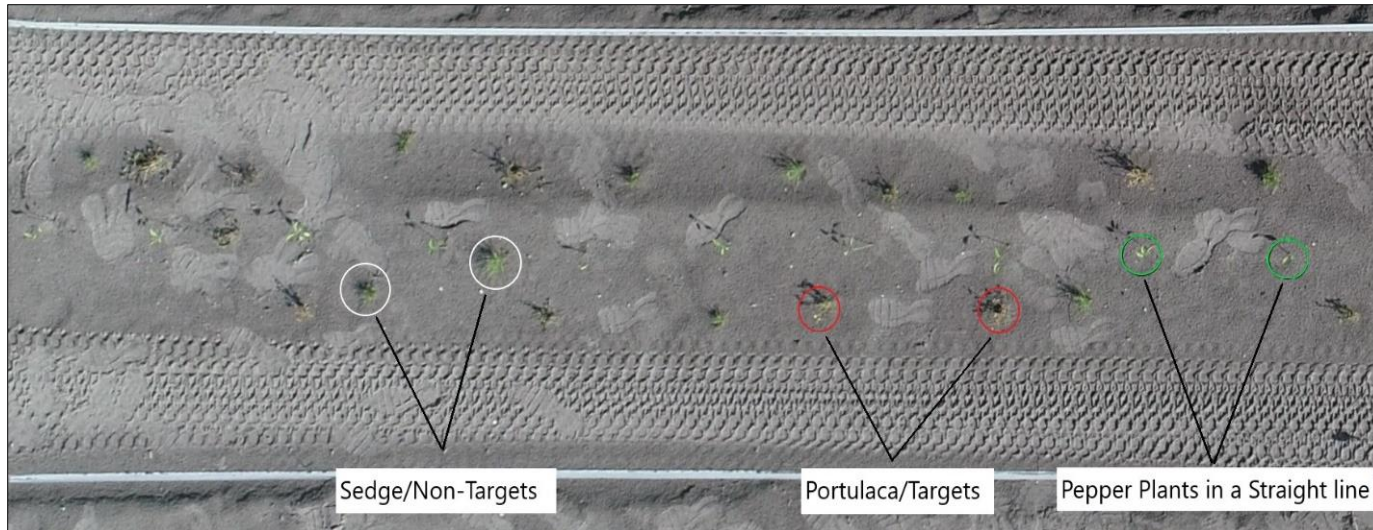
Before



After



Experimental Design



Portulaca (target weed)



Sedge (non-target weed)

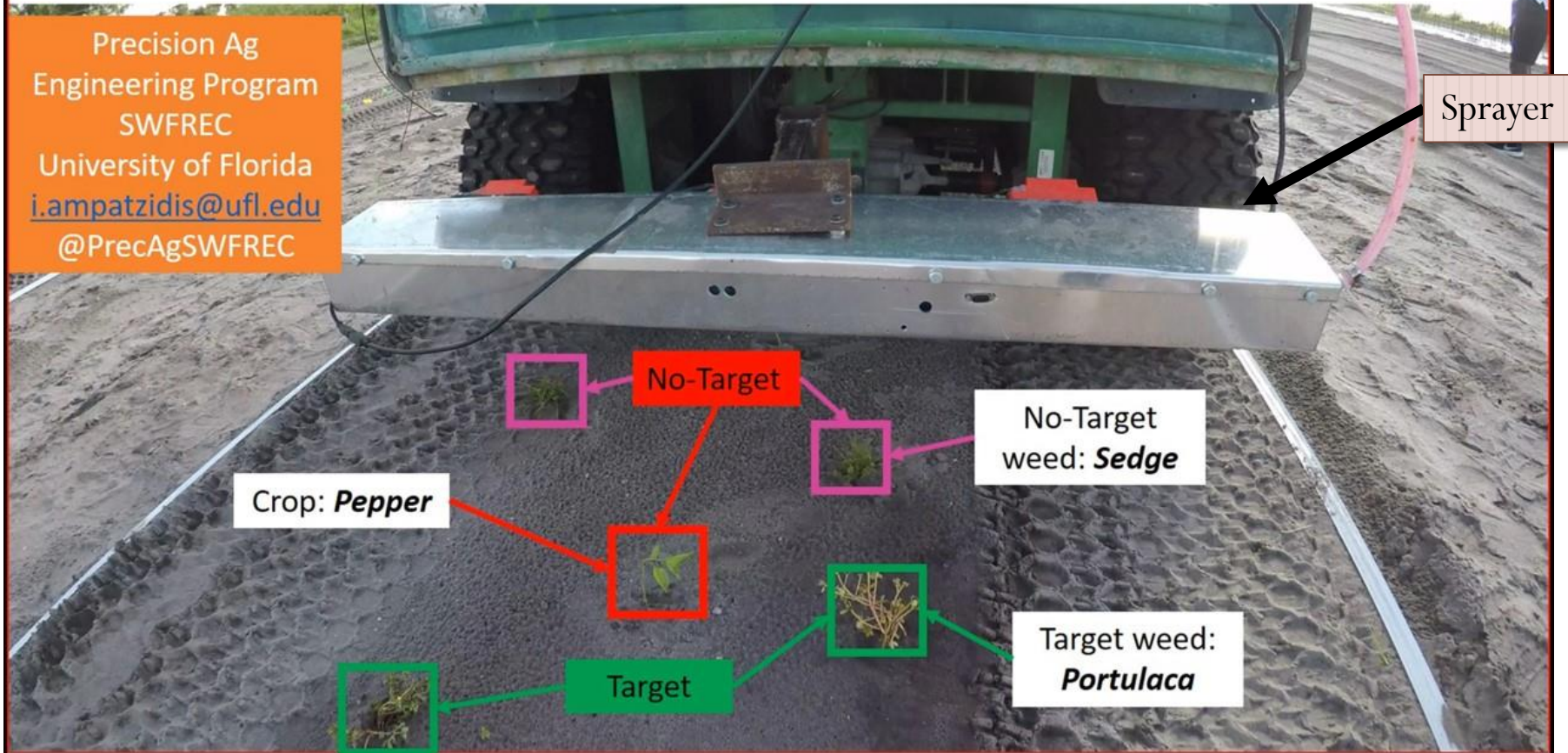


Pepper plant (non-target)

Precision Sprayer (PS) for Weed Management

Smart Technology for Weed Management

Precision Ag
Engineering Program
SWFREC
University of Florida
i.ampatzidis@ufl.edu
[@PrecAgSWFREC](https://twitter.com/PrecAgSWFREC)

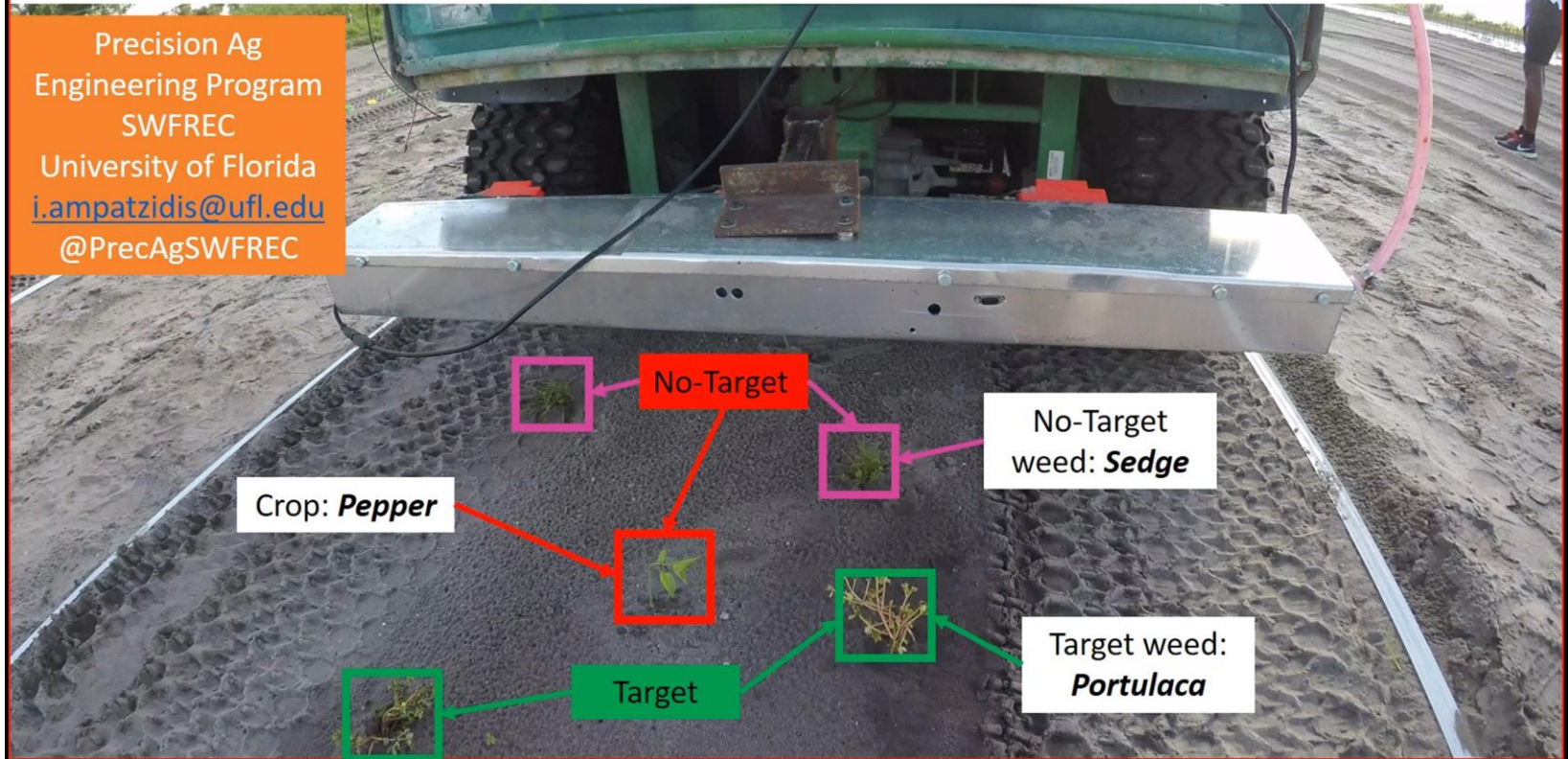


<https://twitter.com/i/status/1045013127593644032>

Precision Sprayer (PS) for Weed Management Demo/Video

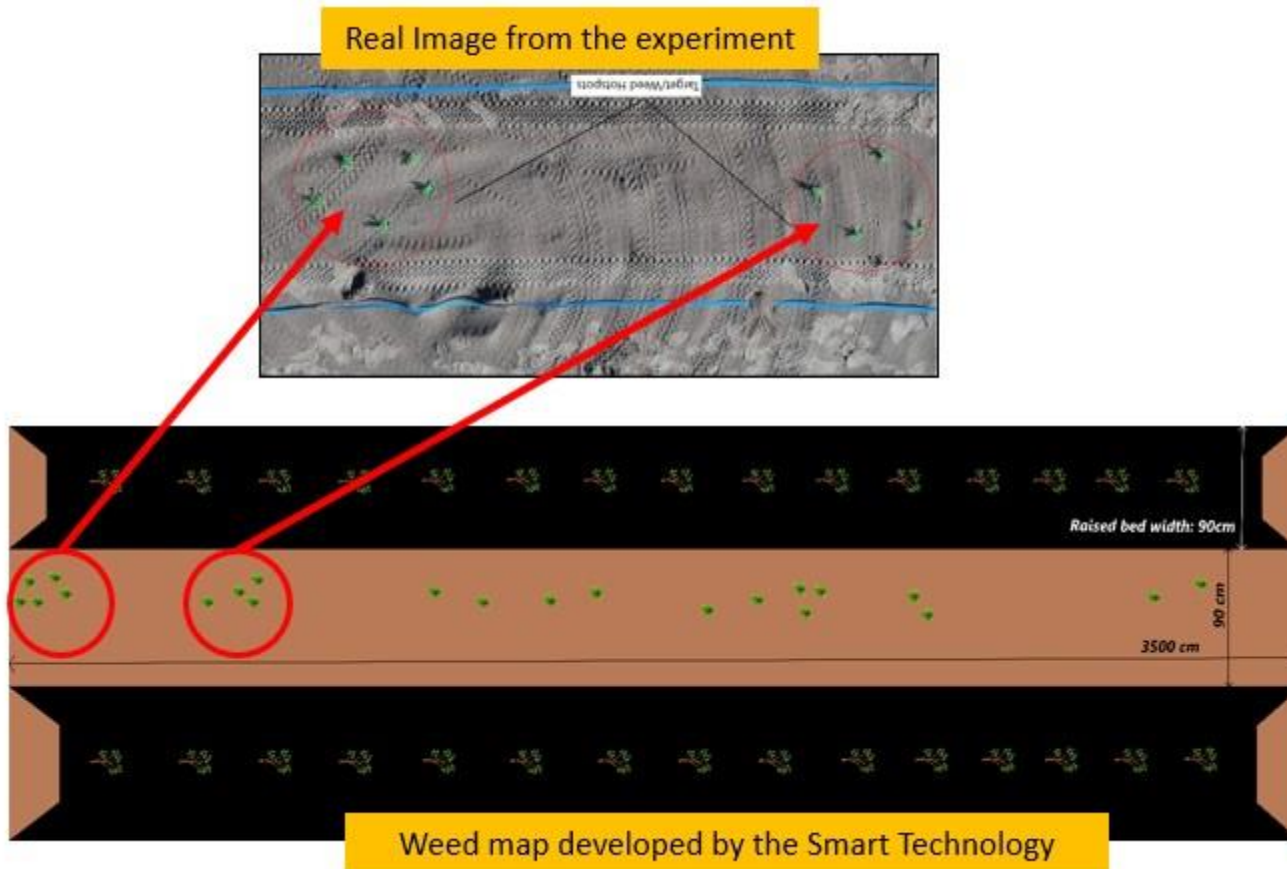
Smart Technology for Weed Management

Precision Ag
Engineering Program
SWFREC
University of Florida
i.ampatzidis@ufl.edu
[@PrecAgSWFREC](https://twitter.com/PrecAgSWFREC)



<https://twitter.com/i/status/1045013127593644032>

Precision Sprayer (PS) for Weed Management



Precision Sprayer (PS) for Weed Management

Target weed: Vegetable field day

Sensitivity: 19

Weeds Detected: 3

Detection status: Running...

FPS: 25

Start Pause Stop

GPS
X: -52790 Y: -2022 Speed: 0.68

UNIVERSITY of FLORIDA
IFAS
Agricultural and Biological Engineering

Graphical User Interface

Target weed selection

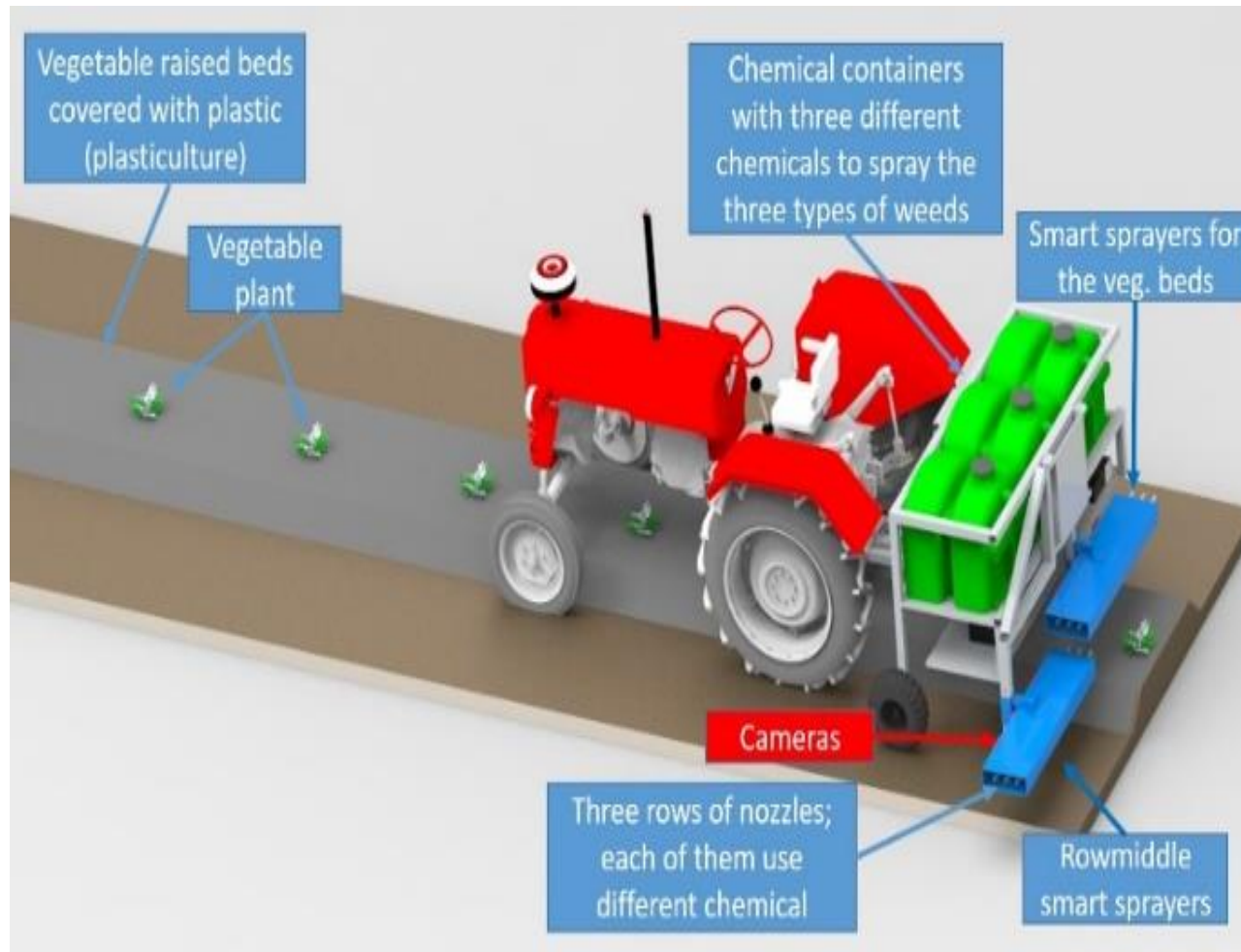
Real-time weed detection

Real-time weed detection & mapping

Real-time GPS location

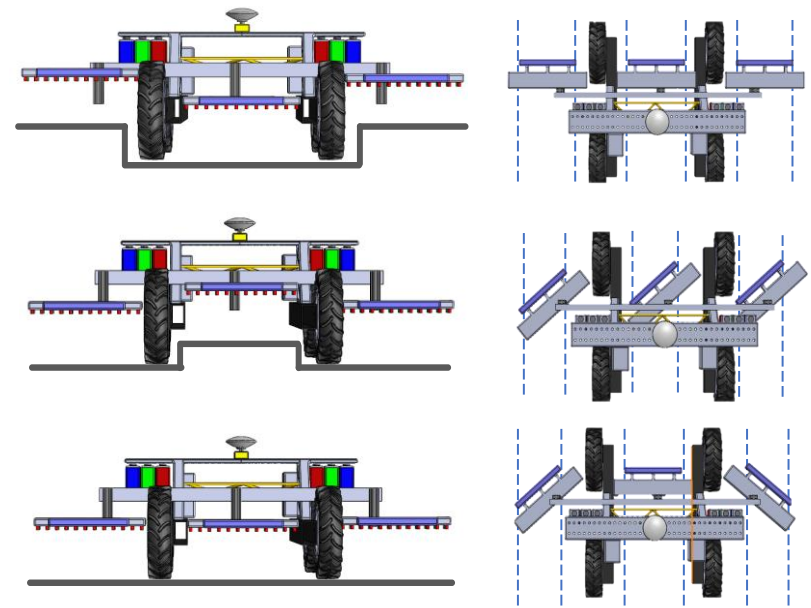
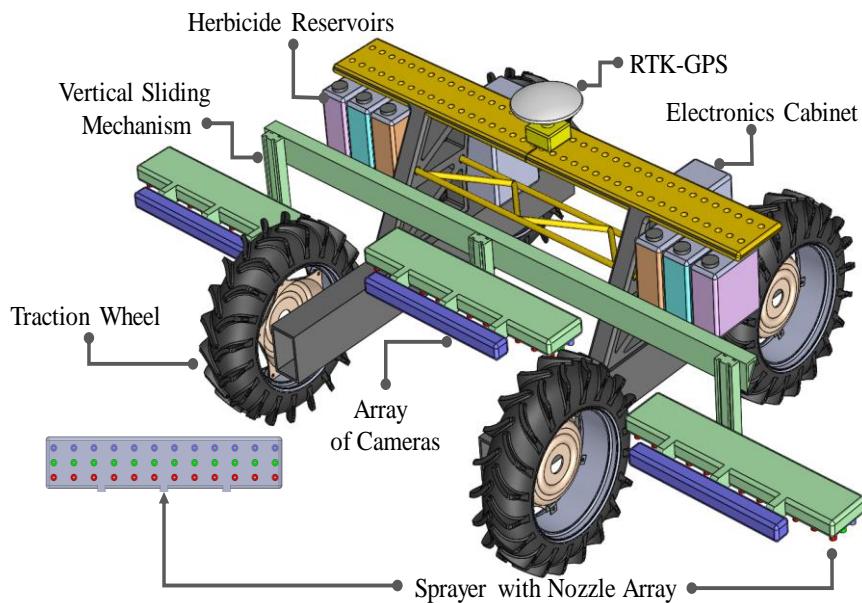
Frames per second to be analyzed

High Throughput Multi-Robot Weed Management for Specialty Crop



NRI: INT: COLLAB: *High Throughput Multi-Robot Weed Management for Specialty Crop*.
National Robotic Initiative (NRI), National Research Foundation (NSF).

High Throughput Multi-Robot Weed Management for Specialty Crop



NRI: INT: COLLAB: *High Throughput Multi-Robot Weed Management for Specialty Crop.*
National Robotic Initiative (NRI), National Research Foundation (NSF).

Potential to Mechanically Harvest Specialty Crops

Types of Machinery

- Harvest-aid systems
- Trunk shakers
- Canopy shakers
- Entire crop harvesters
- Fruit harvesters (robotic arms, vacuum systems etc.)
- Robots

Agrobot Strawberry Harvester



<https://www.youtube.com/watch?v=RKT351pQHfl>



<https://www.youtube.com/watch?v=RKT351pQHfl>

Tomato Robotic Harvester Four Growers



<https://www.youtube.com/watch?v=-qQfflHmlXk&feature=youtu.be>

Harvey the Robotic Capsicum (Red Pepper) Harvester



<https://www.youtube.com/watch?v=8rq4iSTsg68>

Strawberry Robot in Japan



<https://www.youtube.com/watch?v=9Su2XQyuavM>

Mechanization of Strawberry Harvesting for Long Term Sustainability



PI: Yiannis Ampatzidis. Mechanization of Strawberry Harvesting for Long Term Sustainability. Specialty Crop Research Initiative, USDA/NIFA. Budget: \$3,145,307.

Questions/Comments? Thanks for your attention!



--
Yiannis Ampatzidis
Assistant Professor
Agricultural and Biological Engineering Department
University of Florida
Southwest Florida Research and Education Center, Immokalee
Office: 239-658-3451



From Left to Right: Daniel Escobedo Summer Intern, Jorge Escobedo Summer Intern, Dr. Jaafar Abdulridha Post Doctoral Associate, Dr. Yiannis Ampatzidis Program Leader, Dr. Xiuhua Zhang Visiting Scholar from China, Dr. Thanos Balafoutis Visiting Scholar from Greece, Magda Derival Research Assistant, Shirin Ghatresamani PhD Student, Sri Charan Kakarla Engineer Not Pictured, Victor Partel Research Assistant

Follow us on

Twitter: <https://twitter.com/PrecAgSWFREC>