

# Cloud-based application for citrus precision agriculture using AI

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## UAVs in Agriculture



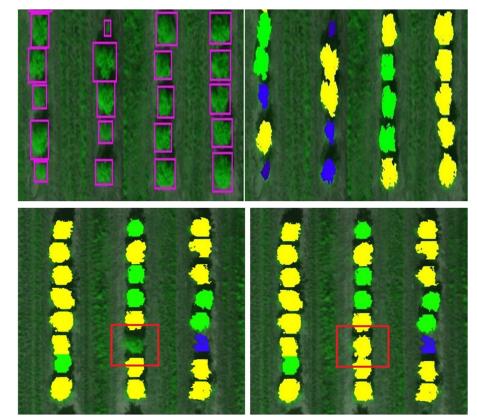






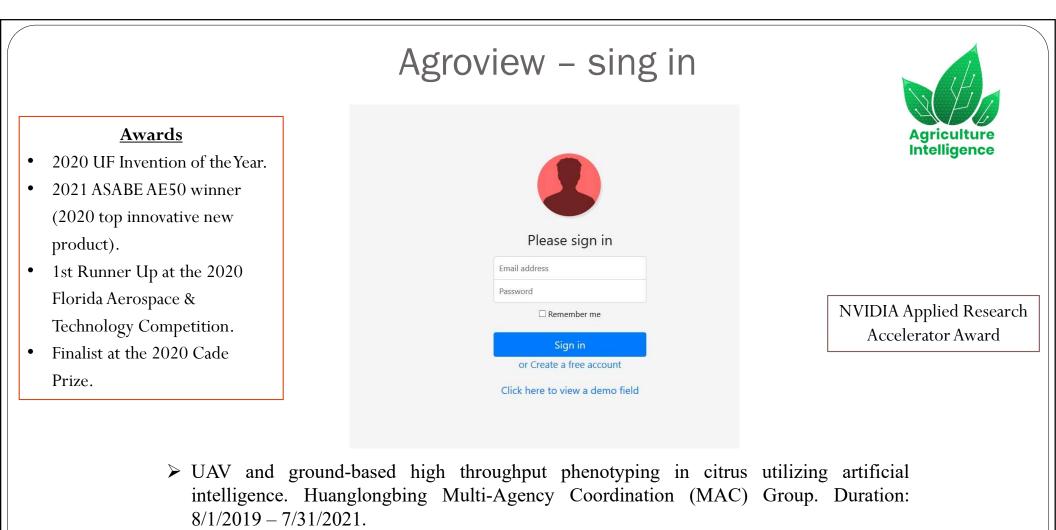
Image Source: PrecisionMapper





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.

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, <u>doi.org/10.1016/j.compag.2019.104900</u>.

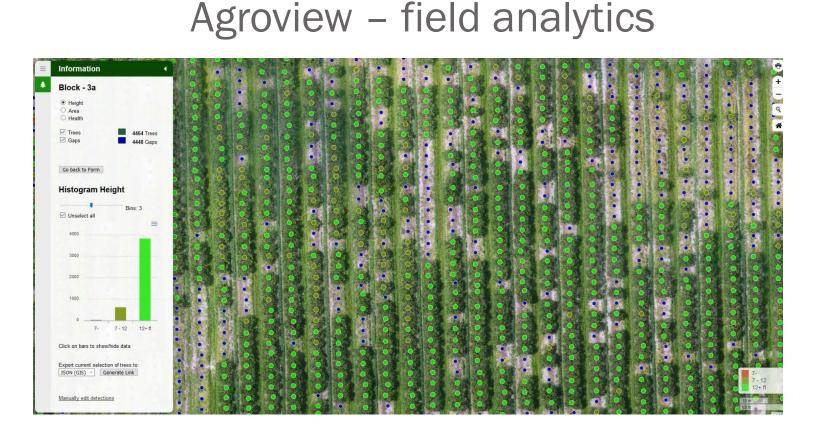


UAV-based high throughput phenotyping in specialty crops utilizing artificial intelligence. Florida Specialty Crop Block Grant Program - Farm Bill (SCBGP-FB). Duration: 1/1/2020 – 8/31/2022.

## Agroview – farm analytics



- Ampatzidis Y., Partel V., Costa L., 2020. Agroview: Cloud-based application to process, analyze and visualize UAV-collected data for precision agriculture applications utilizing artificial intelligence. *Computers and Electronics in Agriculture*, 174(July), 105157, doi.org/10.1016/j.compag.2020.105457.
- Costa L., Nunes L., Ampatzidis Y., 2020. A new visible band index (vNDVI) for estimating NDVI values on RGB images utilizing genetic algorithms. *Computers and Electronics in Agriculture*, 172 (May), 105334.



- ➢ 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.

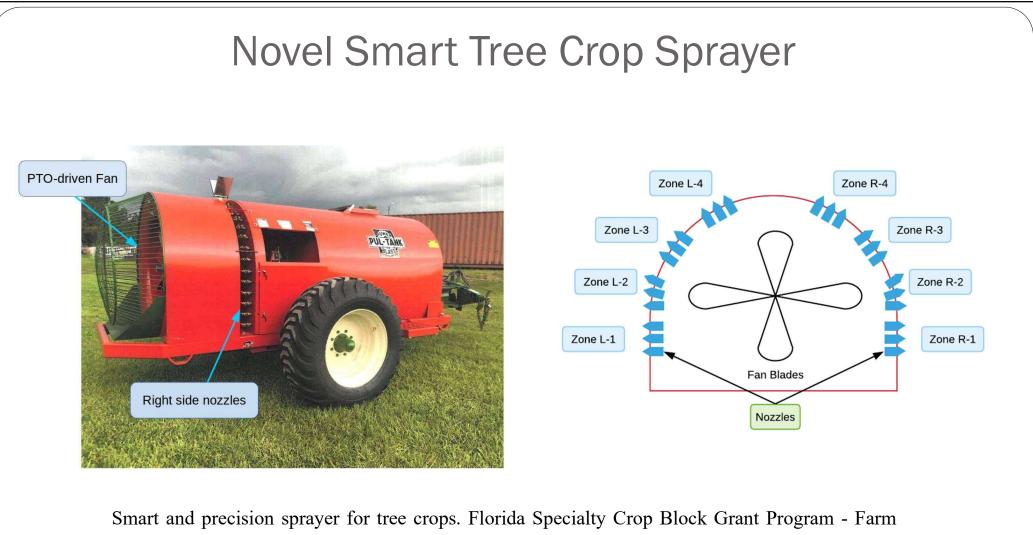
## Cloud-based application to process, analyze, and to visualize UAV collected data



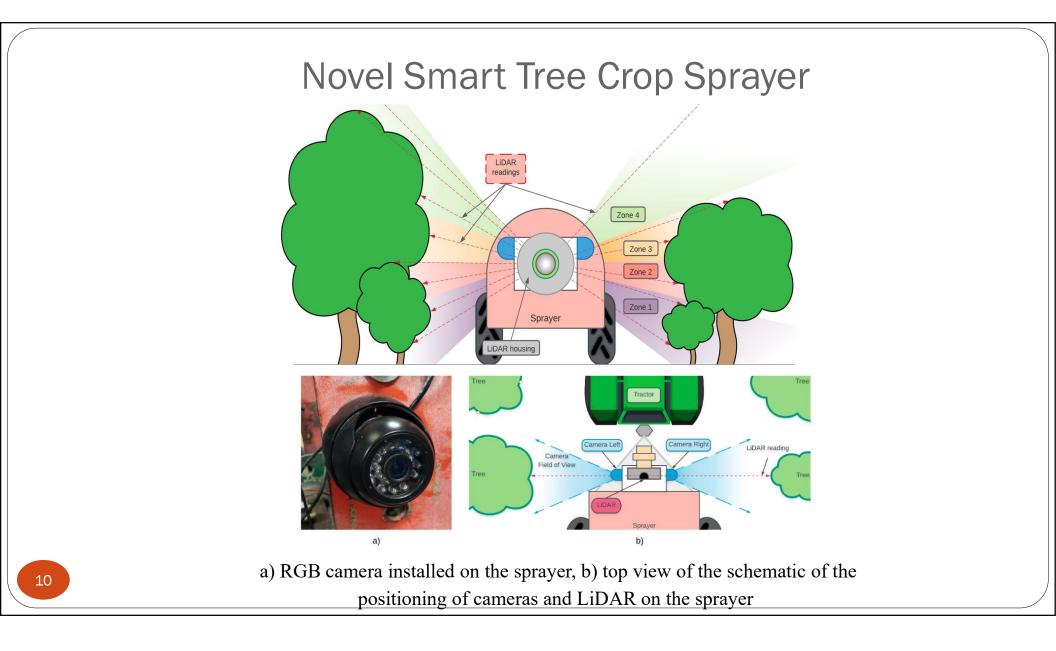
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#### Best Management Practices Agroview - Nutrient Management

Nut	rient Ai	nalysi	is	
LA	Griffir	11		
Nuti	ient Sele	ection:	⊠ Sh	ow/Hide
	litrogen (N) Phosphorus Potassium ( Aagnesium Calcium (Ca Sulfur (S)	(P) C (K) C (Mg) C	) Manga	n) nese (Mn) e)
	Zones Deficient	Trees	Gaps	Trees Ratio 60.8%
		174	23	60.8%
	Optimum		210	89.9%
		224	31	87.8%
F	Excess		0	0
Rang	e Values f		sium	
Zone		Min	Max	
Defic		0%	0.7%	
Low		0.7% 1.1%	1.1% 1.8%	
High		1.1%	1.8%	
Exce		2.4%		
Gen	erate Nut	rition R	leport	



Bill (SCBGP-FB). Duration: 1/1/2021 – 12/31/2022.



### Smart Tree Sprayer using Artificial Intelligence (AI)

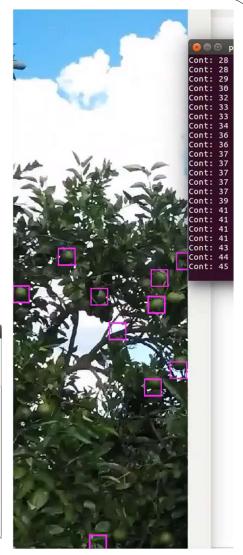
NVIDIA Applied Research Accelerator Award



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GPS: OFF 5.6 mph Enable Cameras: OFF Lidar: OFF Lat: 0.000000 Heading: 0 0/0 Lon: 0.000000 AUTO AUTO Zones AUTO AUTO Pause All AUTO AUTO Settings AUTO AUTO Flow Meter 0.0 L/min 0.0 L/min 0.0 L Volume 0.0 L About Reset meter 11

GPS: OFF 5.6 mph Enable Cameras: OFF Lidar: OFF Lat: 0.000000 Heading: 0 0/0 Lon: 0.000000 🛃 Look Ahead Manual Speed Resets are detected by Lowest sensor Zones - 4.0 mph + Distance between sensor and valves Apply to: Auto off when stopped - 40 Inches + All Trees Settings Spray Buffer Save current senttings as: Before: - 10 Inches + Save Page 1 After: - 10 Inches + Settings Templates About 2 4 1 3 5 б 7 8 9 10

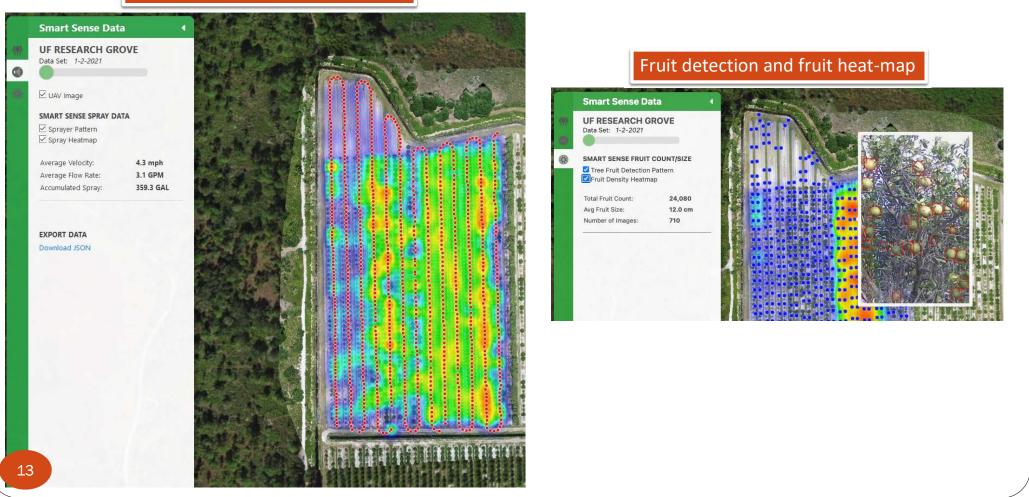
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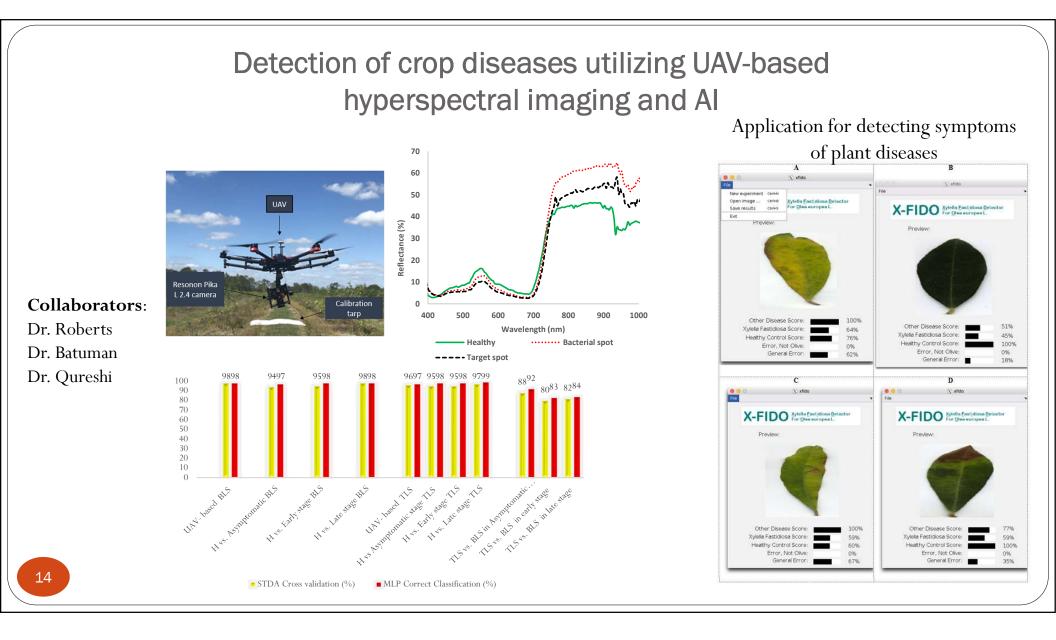
Smart Tree Sprayer using Artificial Intelligence (AI)



#### Smart Tree Sprayer using Artificial Intelligence (AI)

#### Spray path and spraying heat-map

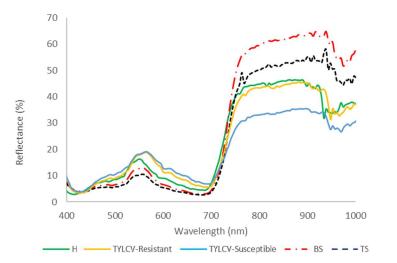




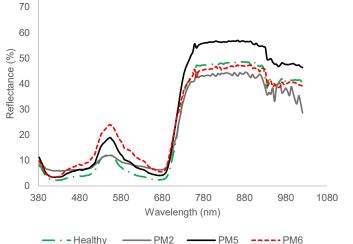


### UAV-based Disease Detection utilizing Hyperspectral Imaging and AI

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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).

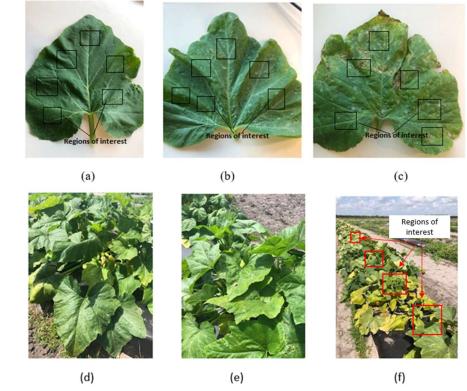
- Abdulridha J., Ampatzidis Y., Roberts P., Kakarla S.C., 2020. Detecting powdery mildew disease in squash at different stages using UAV-based hyperspectral imaging and artificial intelligence. *Biosystems Engineering*, 135-148; doi.org/10.1016/j.biosystemseng.2020.07.001.
- Abdulridha J., Ampatzidis Y., Kakarla S.C., Roberts P., 2019. Detection of target spot and bacterial spot diseases in tomato using UAV-based and benchtop-based hyperspectral imaging techniques. *Precision Agriculture*, (November) 1-24.

## UAV-based Disease Detection utilizing Hyperspectral Imaging and AI

Squash plants in different development stages of the powdery mildew disease.

The indoor pictures with regions of interest are: a) healthy leaf (prior to any disease detection in field), b) early symptoms (low disease severity), and c) late stage (high disease severity).

Outdoor data collection in different disease development stages are d) asymptomatic plants, e) initial symptomatic stage (low disease severity), and f) the late PM symptomatic stage (high disease severity).



Abdulridha J., Ampatzidis Y., Roberts P., Kakarla S.C., 2020. Detecting powdery mildew disease in squash at different stages using UAV-based hyperspectral imaging and artificial intelligence. *Biosystems Engineering*, 135-148; doi.org/10.1016/j.biosystemseng.2020.07.001.

## UAV-based Disease Detection utilizing Hyperspectral Imaging and AI

Laboratory spectral measurements of squash leaves using a benchtop hyperspectral imaging system.



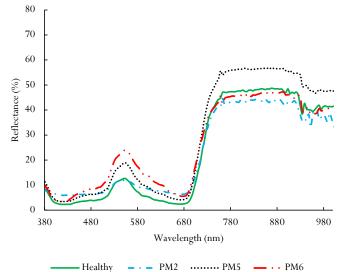


UAV-based imaging data collection with a hyperspectral Resonon camera

Abdulridha J., Ampatzidis Y., Roberts P., Kakarla S.C., 2020. Detecting powdery mildew disease in squash at different stages using UAV-based hyperspectral imaging and artificial intelligence. *Biosystems Engineering*, 135-148; doi.org/10.1016/j.biosystemseng.2020.07.001.

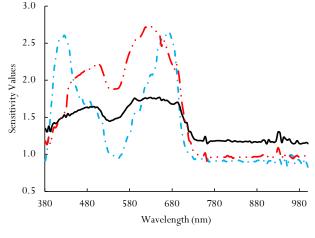


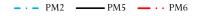
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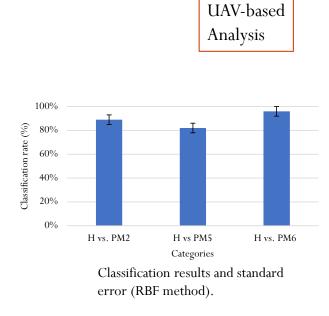


UAV-based spectral reflectance signatures of healthy squash plants and PM-infected plants in different disease development stages (asymptomatic, early and late stages).

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UAV-based analysis: sensitivity values of PM-infected squash plants.

Abdulridha J., Ampatzidis Y., Roberts P., Kakarla S.C., 2020. Detecting powdery mildew disease in squash at different stages using UAV-based hyperspectral imaging and artificial intelligence. *Biosystems Engineering*, 135-148; doi.org/10.1016/j.biosystemseng.2020.07.001.

## **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 AmpatzidisY., 2019. Post-Flight Data Processing Instructions on the Use of Unmanned AerialVehicles (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.

