

# Intelligent See and Spray: Less chemical - Greater Yields

## NRI: INT: COLLAB: An autonomous insect Sense, Identify, and Manage PPlatform (SIMPL) to advance crop protection strategies

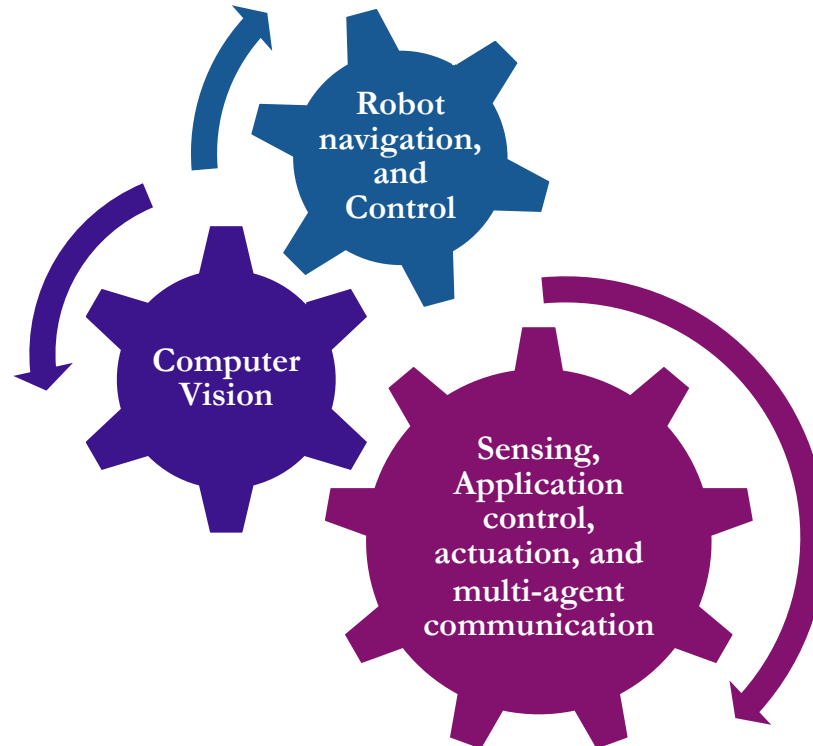
Award #2019-67021-28995 || Ajay Sharda, Daniel Flippo and Brain McCornack – Kansas State University, and Cuncong Zhong – University of Kansas

### Challenge

- U.S. farmers spend \$15.2 billion worth of pesticides
- Blanket application due lack of pest incidence knowledge

### Solution

- Sense, identify and targeted pest control under the canopy
- Computer vision, autonomous ag system and multi-agent communication



### Scientific Impact

- Scalable and modular sensing, control and communication sub-systems for ag and beyond

### Broader Impact

- Functional smart system for adoption
- Environmentally sustainable
- Scale independent Ag robotic
- Significant reduction (potentially 40%-60%) in chemical usage

# Building Image Library



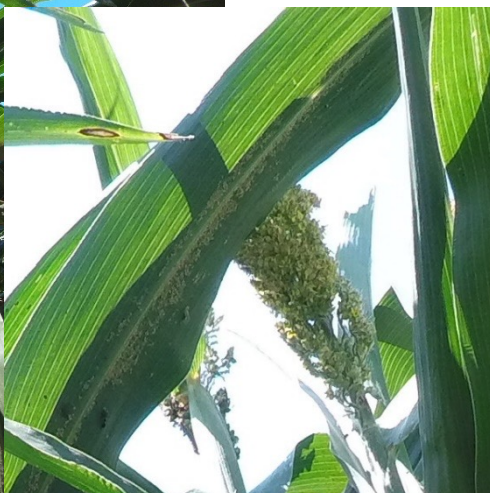
- 4 Sample dates (Sedgwick County, KS)
- 4 camera positions (1 top and 3 canopy view)
- GoPro Hero Session 5 sensor, 0.5 sec timer
- ~110K raw images in JPEG format (RGB)
- Images labeled
  - Sugarcane aphids at varied densities
  - Indirect evidence (sooty mold and honeydew)
- PhD Student (Ivan Grijalva)



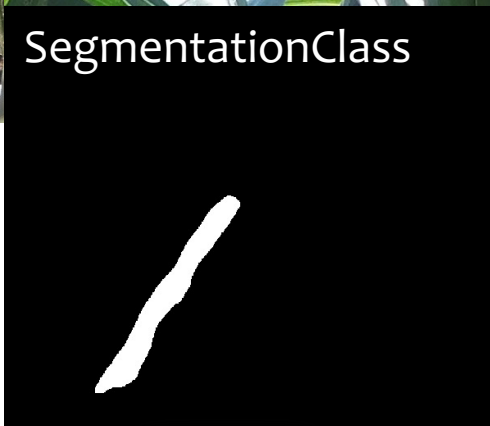
# Dataset



DetSegImages

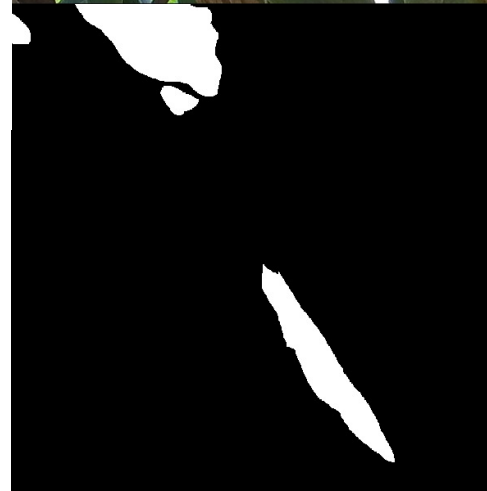
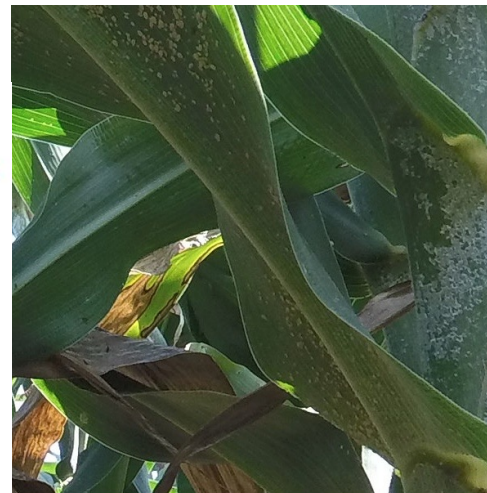


SegmentationClass



DetAnnotations

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# Sugarcane Aphids: Detection Results

AP	VFNet [1]	GFLV2 [2]	PAA [3]	ATSS [4]
Setting 1	46.7	45.9	45.4	46.3
Setting 2	60.3	60.3	60.3	60.6
Setting 3	62.5	62.1	62.5	63.0
Setting 4	57.6	57.2	57.4	58.0

Average precision of aphid detection of 4 state-of-the-art learning models

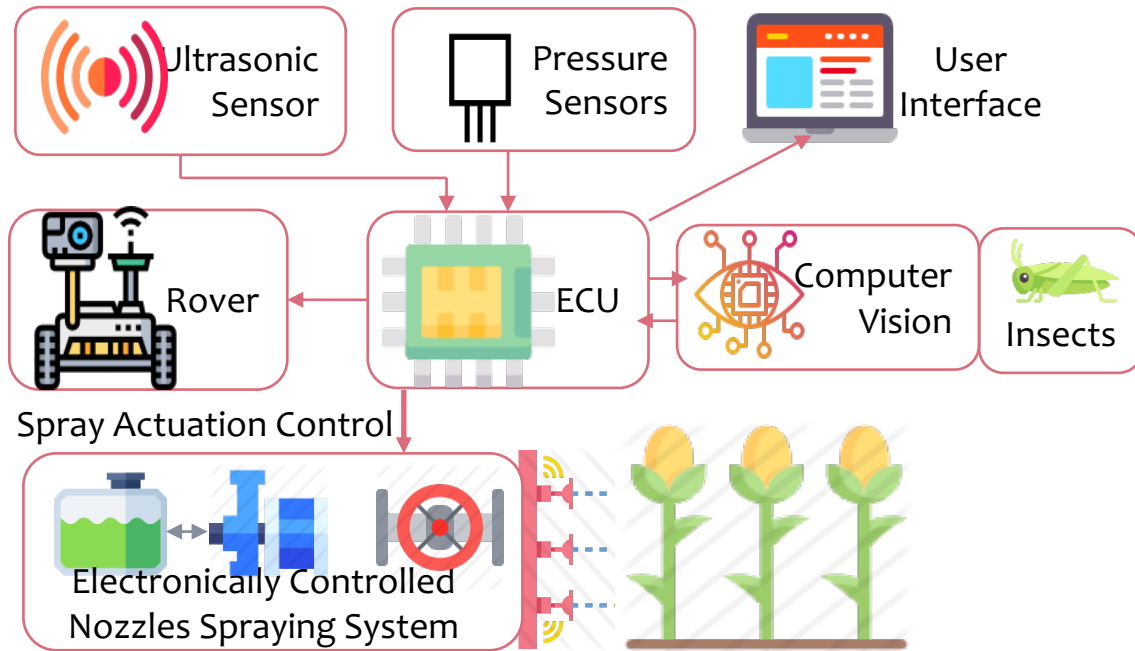
[1] Zhang, Haoyang, et al. "Varifocalnet: An iou-aware dense object detector." *Proceedings of the IEEE/CVF Conference on Computer Vision and Pattern Recognition*. 2021.

[2] Li, Xiang, et al. "Generalized focal loss v2: Learning reliable localization quality estimation for dense object detection." *Proceedings of the IEEE/CVF Conference on Computer Vision and Pattern Recognition*. 2021.

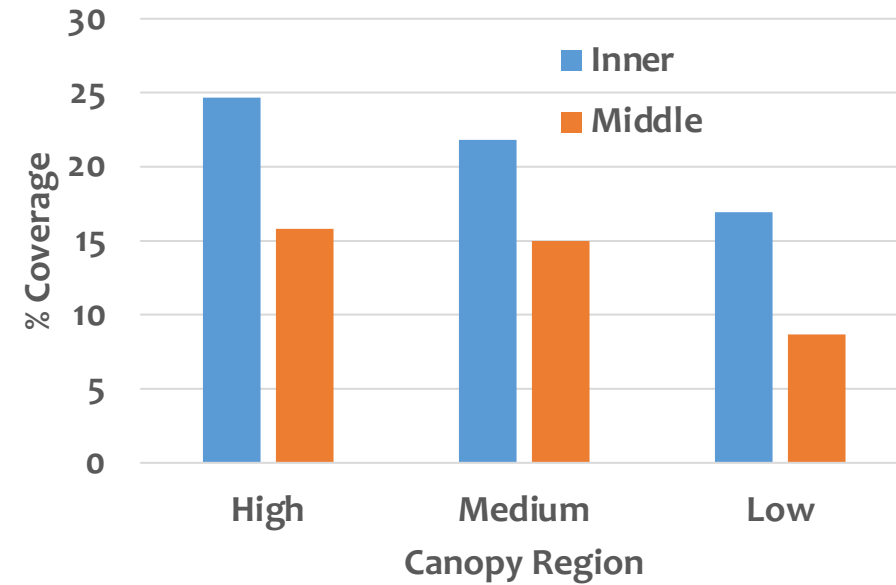
[3] Kim, Kang, and Hee Seok Lee. "Probabilistic anchor assignment with iou prediction for object detection." *European Conference on Computer Vision*. Springer, Cham, 2020.

[4] Zhang, Shifeng, et al. "Bridging the gap between anchor-based and anchor-free detection via adaptive training sample selection." *Proceedings of the IEEE/CVF conference on computer vision and pattern recognition*. 2020.

# Autonomous Liquid Application Coverage: Field Validation



# Autonomous Liquid Application Coverage: Field Validation



# Future Work

- Integration of Aphid detection with computer vision
- Integrating computer vision system with liquid application
- Lab and field scale validation for system performance
- Develop basic economics and potential of chemical savings