

# *Precision Crop Load Management for Apples*

## *From Pruning to Fruitlet Thinning*

# Long He

2022 Mid-Atlantic Fruit and Vegetable Convention

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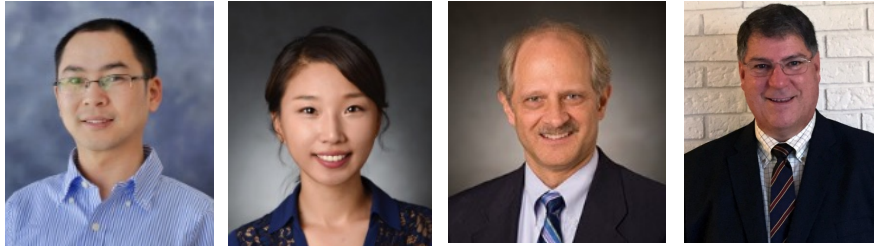
**PennState**  
College of Agricultural Sciences



**PennState Extension**

# Background Information

## Project Team



- Graduate students: Magni Hussain, Xinyang Mu, Rashmi Sahu, Omeed Mirbod
- Undergraduate students
- Grower collaborators

## Project Support

- ❑ **State Horticultural Association of Pennsylvania (SHAP)**
  - Apple detection and sizing
  - Targeted thinning for apples
- ❑ **Precision Crop Load Management for Apples (USDA-SCRI)**
  - Cornell-lead (Dr. Terence Robinson)
  - Machine vision and actuating system (PSU)
- ❑ **Robotic Green Fruit Thinning (USDA-AFRI)**
  - PSU team
  - Robotic system development

# Background Information



## □ **Imaging Acquisition System - MOOG**

- Four cameras + artificial lights
- Detect crop buds to fruits
- Deep learning models

# Crop Load Management Operations



- Branch pruning
- Branch reconstruction
- Buds counting



- Blossom thinning
- Artificial Pollination
- Flower detection



- Green fruit thinning
- Green Fruitlet detection



***Good Production  
Nice Fruits***

# Branch Pruning for Apple Trees



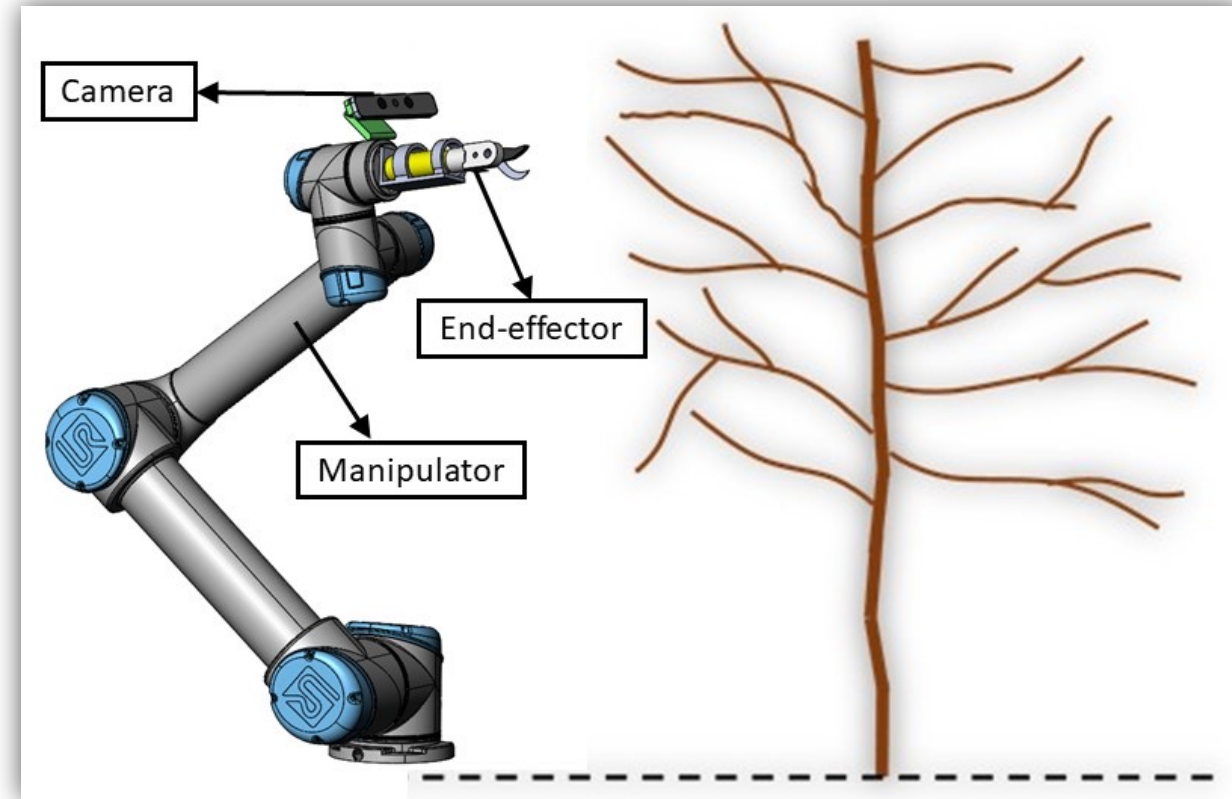
- Manual pruning
- Orchard platform to increase efficiency
- Skilled worker



- Mechanical pruning (Hedging)
- Increase working efficiency
- Non-selective

## □ Robotic Pruning (Selective Pruning)

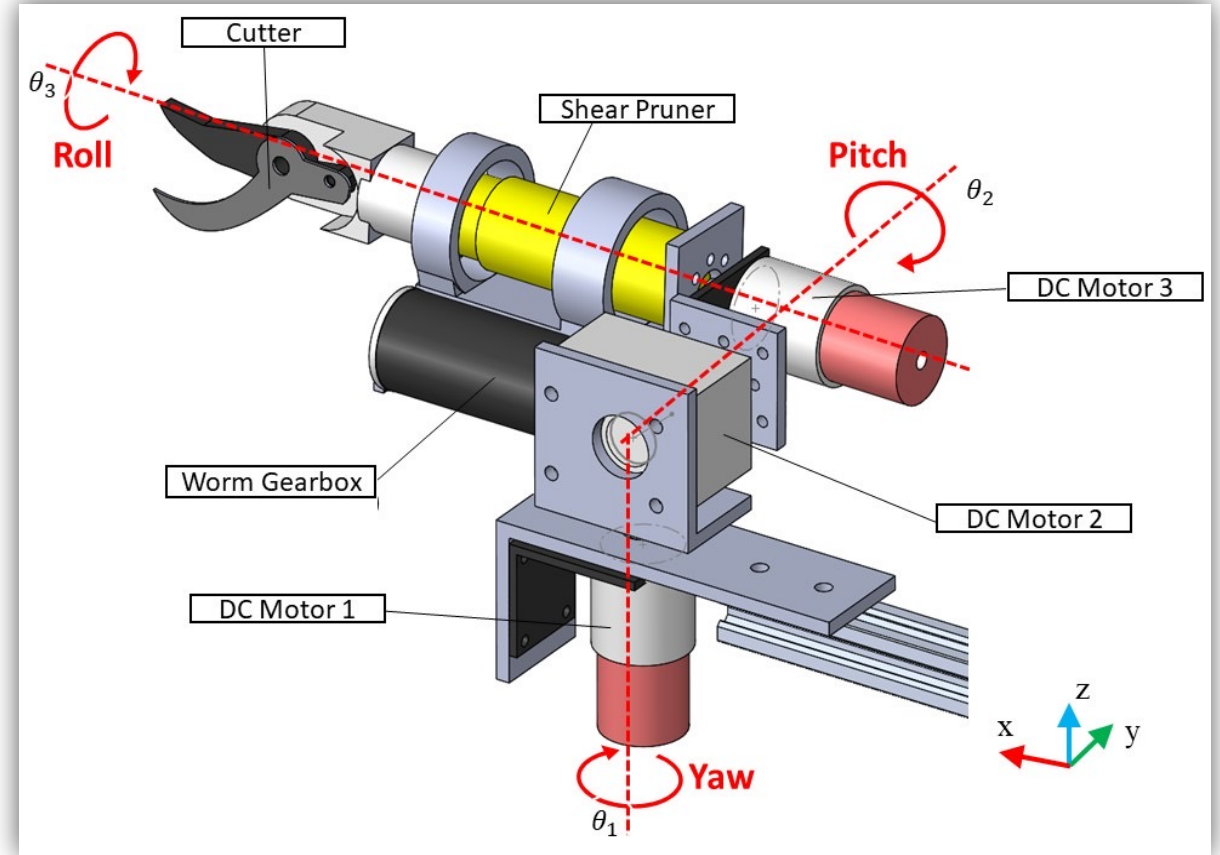
- Machine vision system → 3D tree reconstruction
- Manipulation system → Robotic arm and end-effector tool for pruning branches



# Branch Pruning for Apple Trees



Cutting force and orientation measurement



Cutting mechanism design

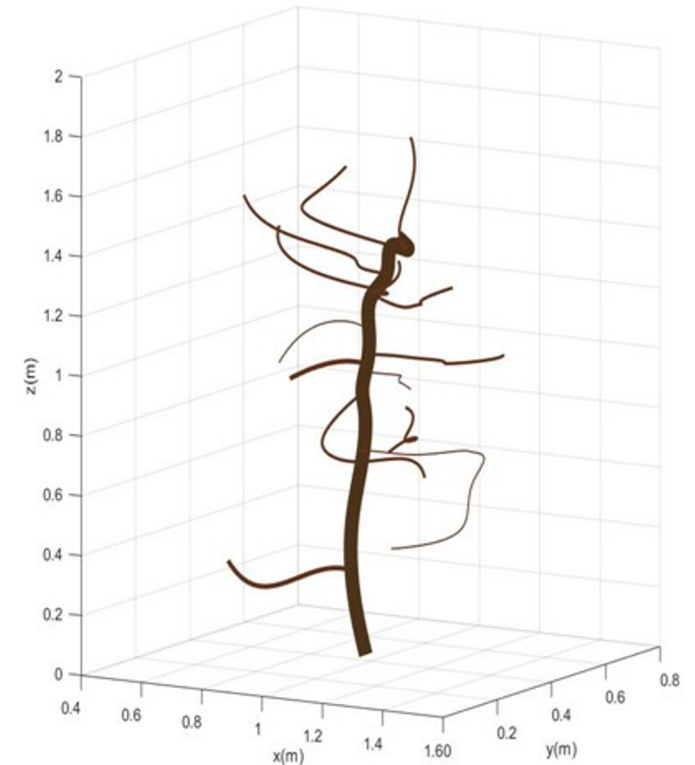
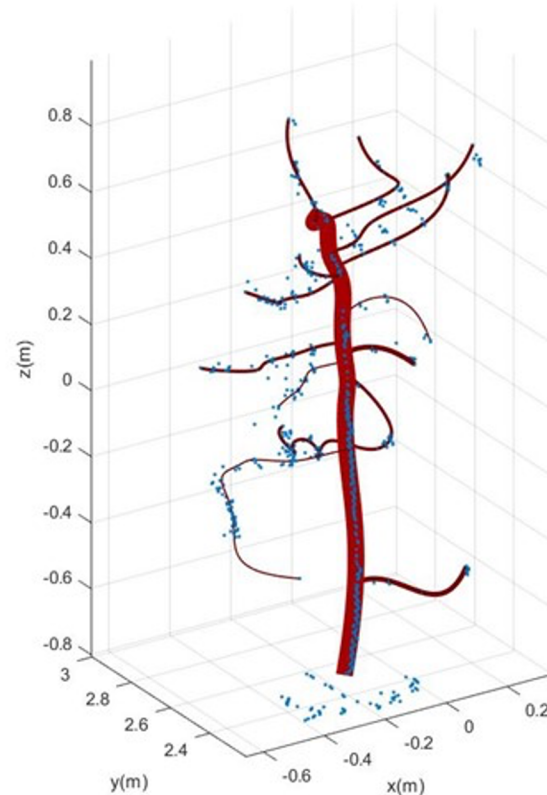
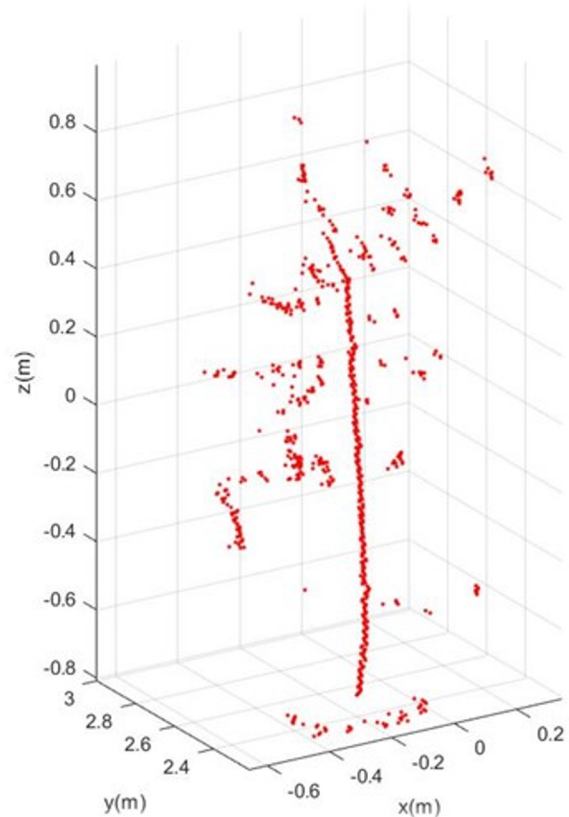
# Branch Pruning for Apple Trees

## ❑ Field Test of Two Prototypes





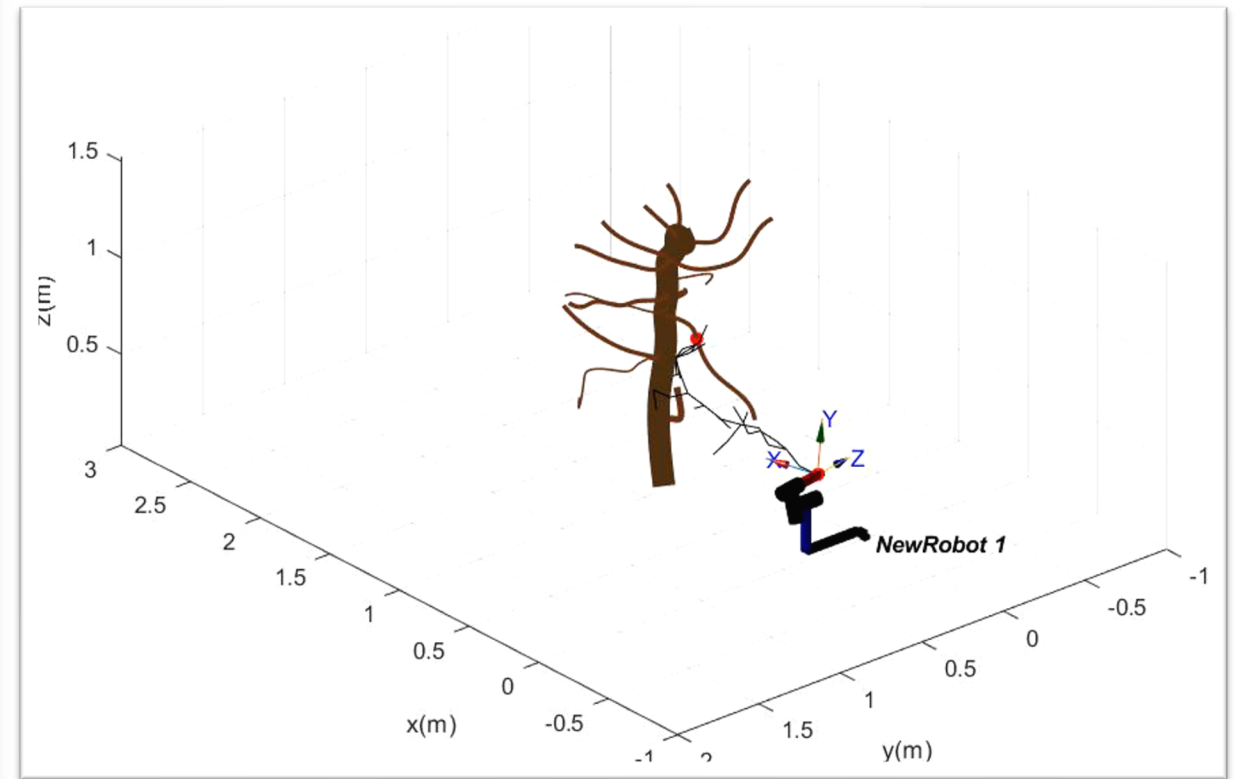
## □ Tree Model 3D Reconstruction



- Trunk and Branches were segmented → 12 primary branches
- LiDAR coordinates to path planning environment coordinates

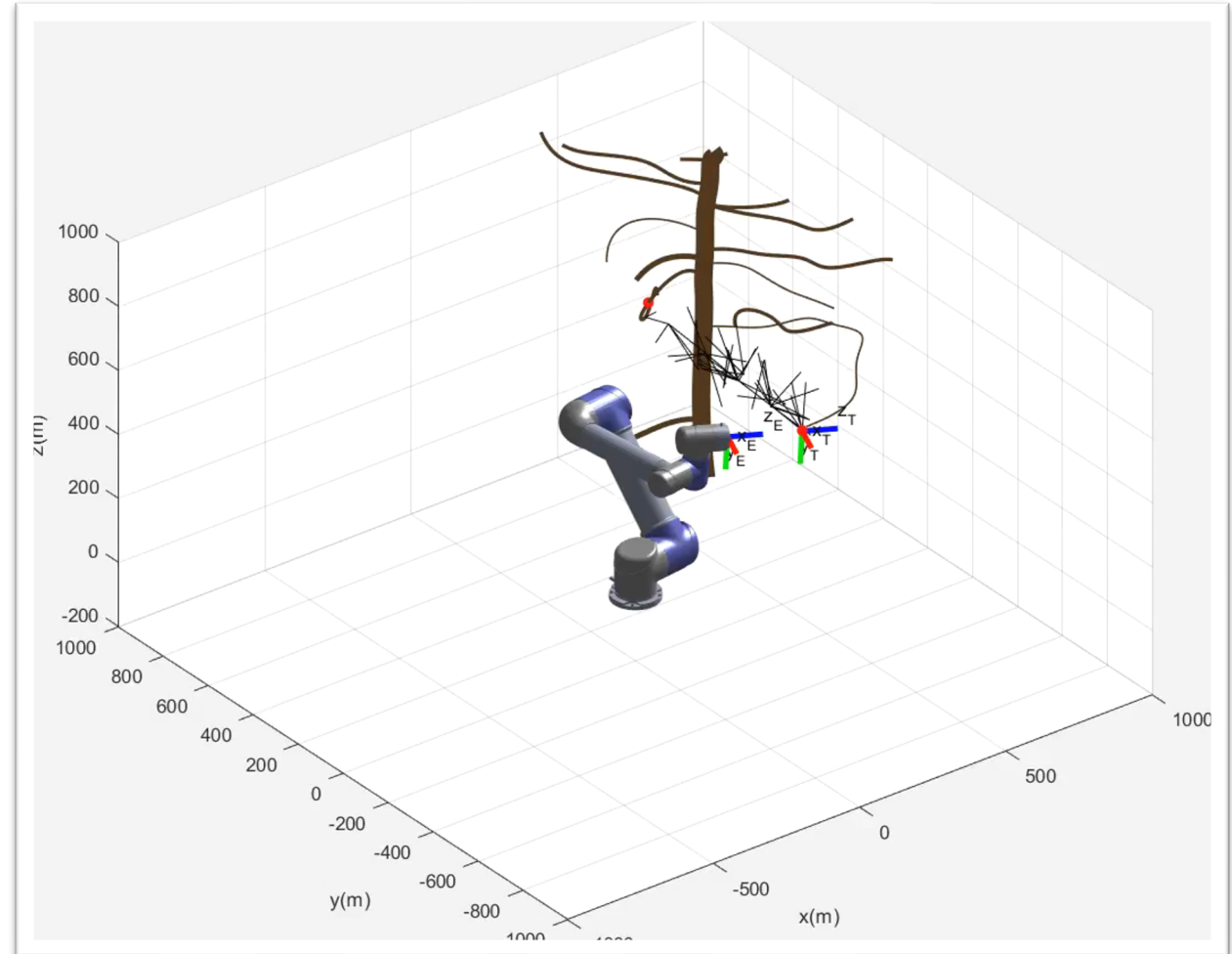
# Branch Pruning for Apple Trees

## □ Cartesian Robotic System



# Branch Pruning for Apple Trees

## ❑ Six-Degree Freedom Robotic System



## □ Precision Pollination

- Target king flowers
- Flower density maps

## □ Precision Blossom Thinning

- Identify flower clusters
- Flower development stages (percentage)
- Initial date of Pollen Tube Growth Model
- Targeted Spraying



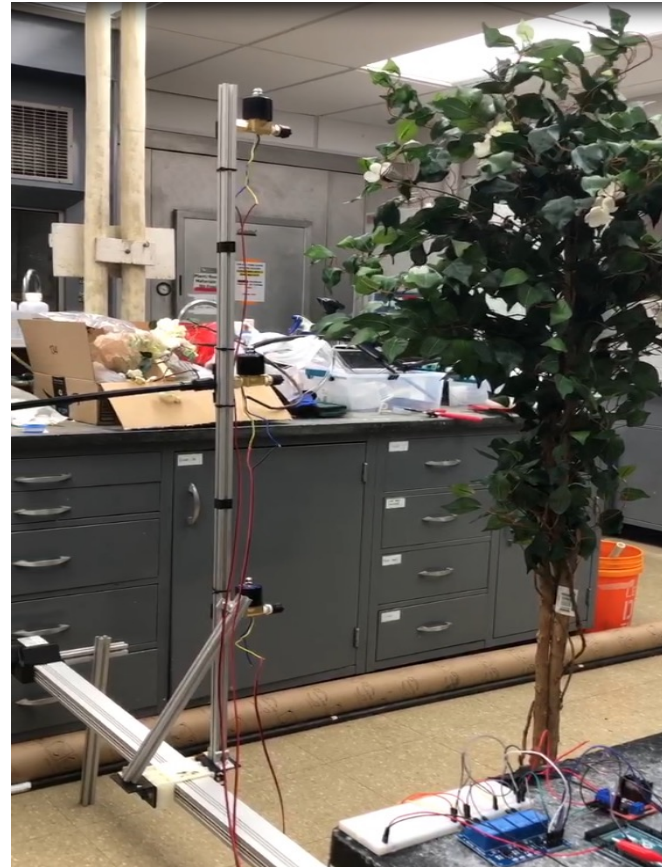
# CL Management at Flower Stage

## ❑ Flower Detection Using Deep Learning Models



# CL Management at Flower Stage

## □ Preliminary Study on Targeted Spraying



# Precision Green Fruit Thinning

## Investigation of Different Thinning Methods



Thinning Methods	Fuji (smaller canopy)		Golden Delicious	
	Ave. fruit weight/tree (lb)	Ave. fruit No./tree	Ave. fruit weight/tree (lb)	Ave. fruit No./tree
Airblast sprayer	26.7	37.2	22.7	50.2
Handheld sprayer	23.0	32.0	43.4	93.6
Hand thinning	36.1	51.4	101.4	254.8

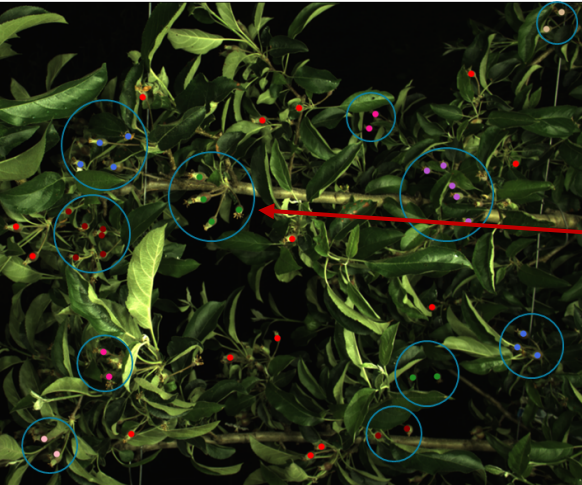
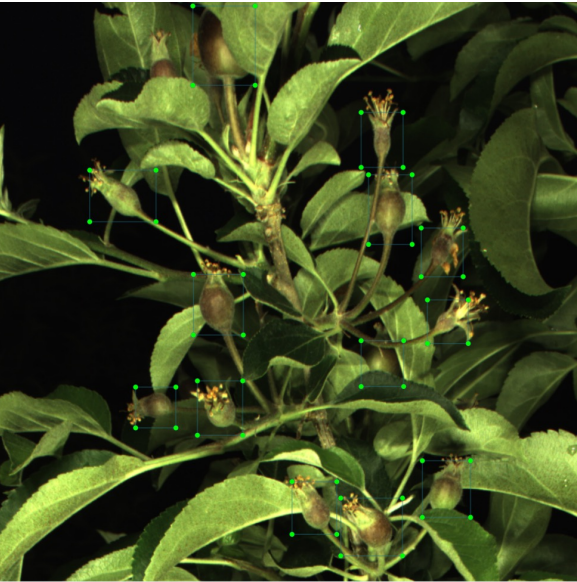
## □ Precision Green Fruit Thinning

- Machine vision system for green fruit detection
- Targeted chemical thinning
- Robotic green fruit thinning
  - Fruit removal method
  - End-effector design
  - Integration of machine vision system
  - Robotic system control (path planning)

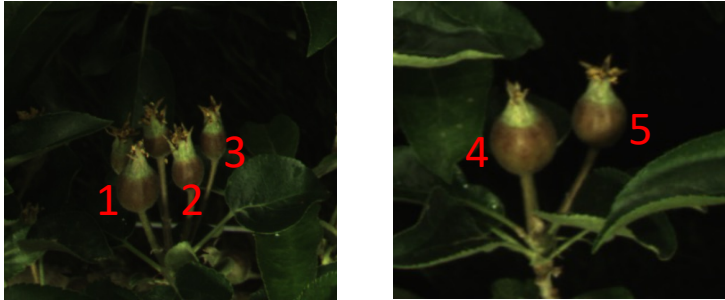




## Image Acquisition System – Tree Level (Dr. Dana Choi)

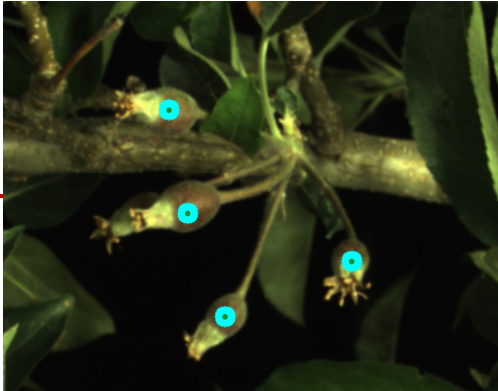


Green Fruit counting



Fruit Count	Precision	Recall	F1
206	0.98	0.8	0.88

Fruit cluster identification



# Precision Green Fruit Thinning

## Green Fruit Detection for Robotic Thinning

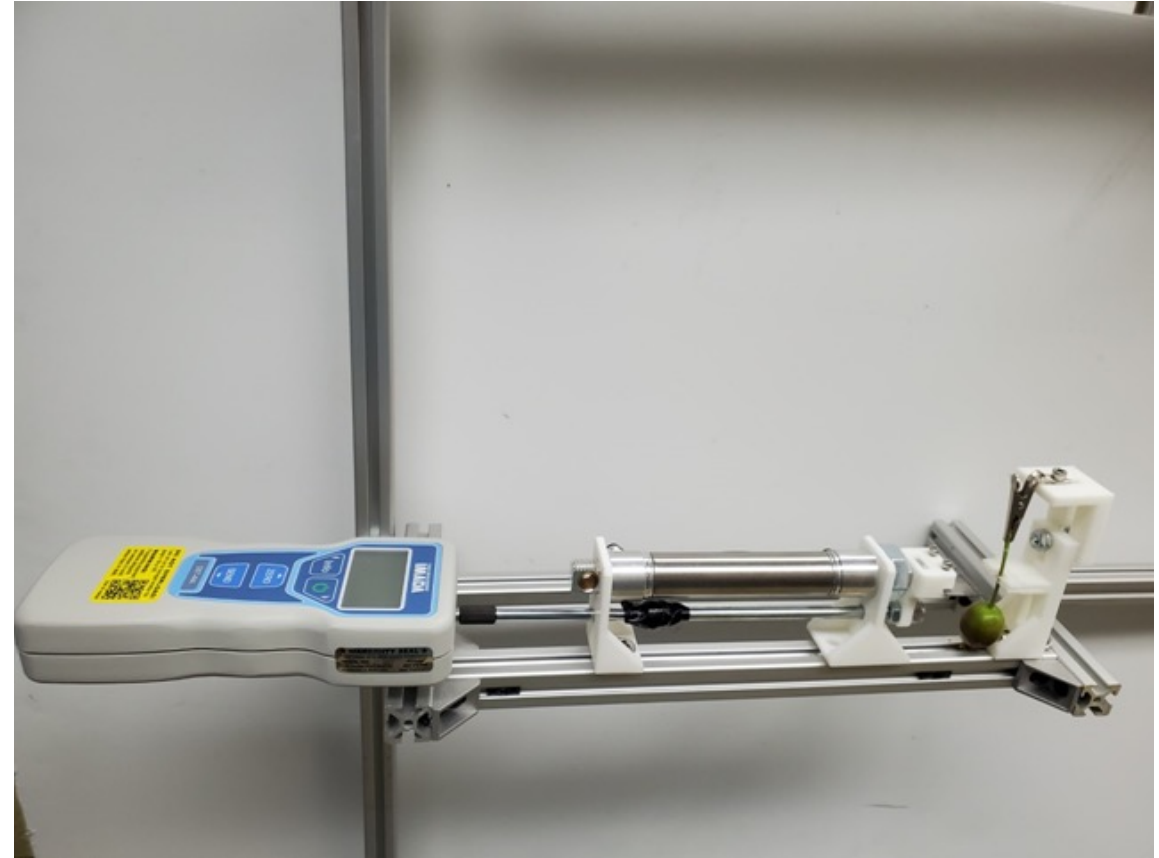


# Precision Green Fruit Thinning

## □ Green Fruit Removal Dynamics



Pulling



Stem cutting

# Precision Green Fruit Thinning

## □ Green Fruit Removal Force and Location

Cultivars	Stem Cutting Force (N)	Spur-End Pulling Force (N)	Fruit-End Pulling Force (N)	Pulling Detached Location (%)	
				Fruit-end	Spur-end
Fuji	36.3	20.5	26.6	28%	72%
Golden Delicious	37.1	19.5	23.7	50%	50%
GoldRush	27.5	19.1	23.5	60%	40%
Overall	<b>33.6</b>	<b>19.9</b>	<b>24.8</b>	<b>42%</b>	<b>58%</b>

## □ Green Fruit Detection for Robotic Thinning

### ■ Implementations

- Handheld
- Robotic manipulator

### ■ Fruit samples

- 50 Fuji
- 50 Golden Delicious
- 50 GoldRush
- 25 GoldRush for robotic manipulator test



# Precision Green Fruit Thinning

## Green Fruit Removal Results

Tests	Cultivars	Total No. Fruits	Removed Fruits	Success Rate
Handheld prototype	Fuji	50	47	94%
	Golden Delicious	50	48	96%
	GoldRush	50	45	90%
Robotic arm prototype	Golden Delicious	25	23	96%

## **Crop Load Management Operations**

- Branch pruning
- Blossom pollination/thinning
- Green fruit thinning

## **Sensing System for Precision Crop Load Management**

- Machine vision system for buds/flowers/fruits detection
- Deep learning algorithm development
- Decision support system

## **Robotic Crop Load Management**

- Robotic mechanism development – pruning and thinning
- Targeted spraying system for thinning

# Thank you!

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State Horticultural Association of Pennsylvania (SHAP)