



## 1 Research Motivation

Apple Crop in Washington State:

- No.1 agricultural product
- >63% of the US annual production
- ~3.4 billion kg production in 2019
- Harvested manually worldwide



Virginia (1939)



Washington (2019)

<https://www.nal.usda.gov/exhibits/specco/ll/exhibits/show/2016-calendar/item/8760>

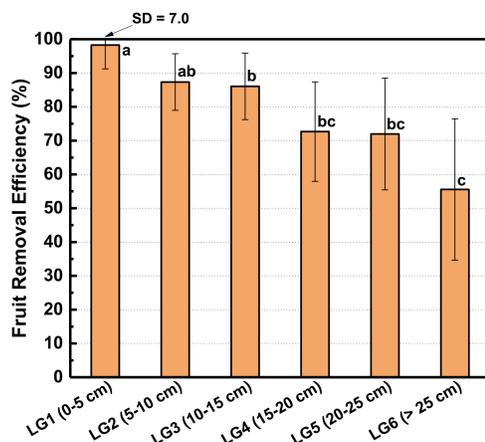
Significant Challenges:

- Uncertain labor availability
- Rapidly increasing costs

## 2 Key Canopy Parameters and Pruning Strategies for Improving Efficiency

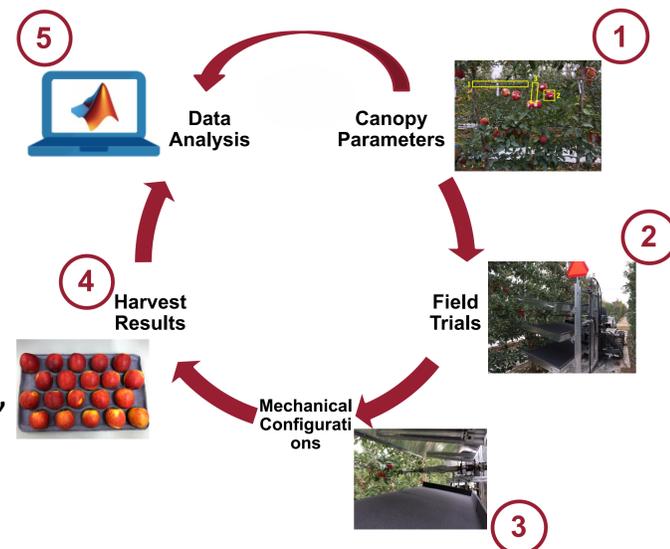
Obj #1: To identify the most relevant canopy parameters affecting the harvest efficiency

- Supervised machine learning algorithm weighted  $k$ -Nearest Neighbors
- Principal components analysis
- Key parameters: fruit load/density, branch basal/end diameter, and shoot length/diameter

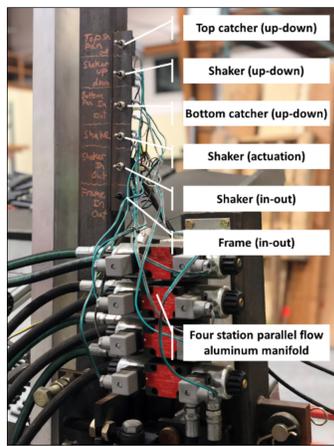


Obj #2: To study the influence of a precision canopy management on the harvest efficiency

- With increased shoot length, fruit removal efficiency (FRE) dropped from 98% to 56%
- FRE  $\geq 85\%$ , when shoot length  $\leq 15$  cm, or shoot index (shoot index = shoot diameter/length)  $\geq 0.03$
- No noticeable pattern for fruit quality



## 3 Field Evaluation of Harvesting Technologies



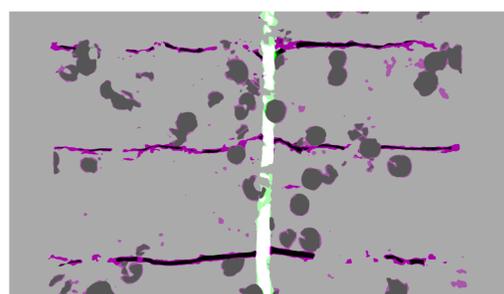
Obj #3: To perform a comprehensive evaluation of different harvest systems

- 3 vibratory shaking methods: continuous non-linear/linear, and intermittent linear
- 3 shake-and-catch harvesting system: hand-held (84% of FRE), hydraulic (87%), and semi-automated (90%)

## 4 Computer Vision for Mechanical Harvesting

Obj #4: To develop a machine vision system for identifying shaking locations on tree branches

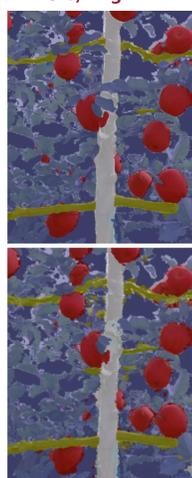
- Kinect V2
- 785 RGB-D images



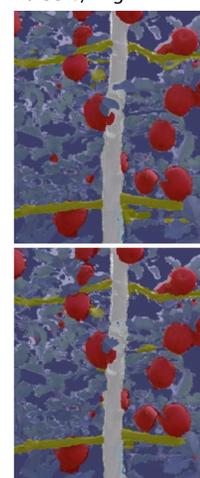
- Tree trunk/branch identification
- Semantic segmentation
- Convolutional neural networks: Deeplab v3+ ResNet-18, VGG-16/19

ResNet-18  
(1,080x1,920)  
IoU = 0.69  
BFScore = 0.89  
1.29 s/img

ResNet-18  
(540x960)  
IoU = 0.64  
BFScore = 0.86  
0.35 s/img



VGG-16  
(540x960)  
IoU = 0.61  
BFScore = 0.81  
0.44 s/img



VGG-19  
(540x960)  
IoU = 0.62  
BFScore = 0.84  
0.47 s/img

## 5 Final Remarks

This research aimed at creating a benchmarked knowledgebase for maximizing the efficiency of a vibratory shake-and-catch harvesting system for the mass harvest of fresh market apples. It was focused on gaining an understanding on canopy-machine interactions for supporting:

- The creation of machine-operation-friendly canopy management strategies, and
- The optimization and automation of shake-and-catch harvest systems design to achieve a highest possible overall harvest efficiency