

Integration of LiDAR scanning data and 3D crop models for the development of computer-aided vineyard design and management tools

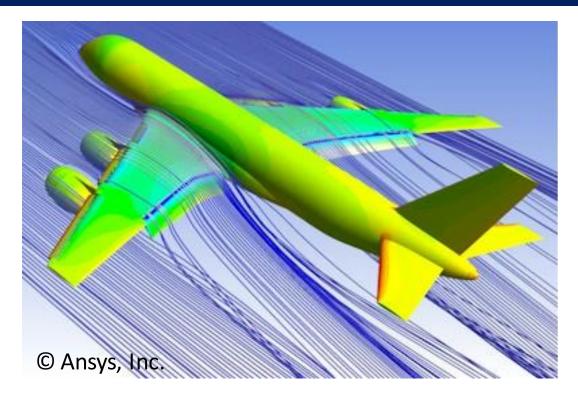
### Brian Bailey

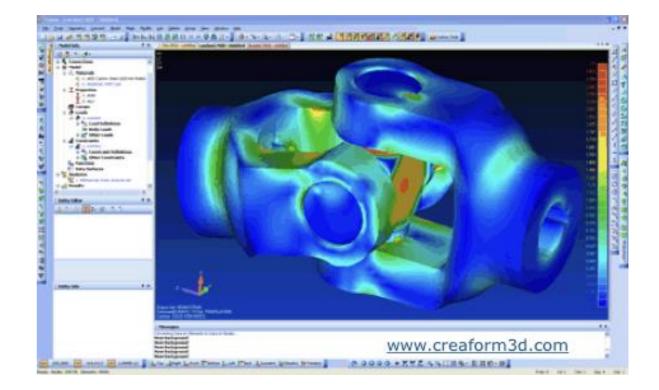
Assistant Professor Dept. Plant Sciences University of California, Davis





#### Engineering Computer-Aided Design (CAD)



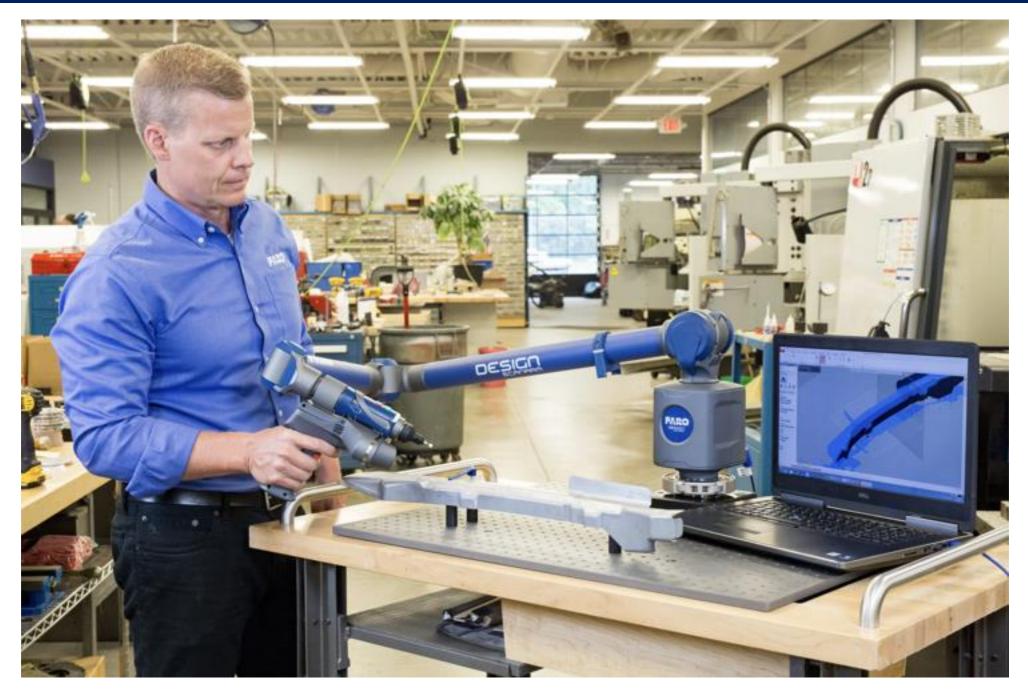


The "Third Industrial Revolution"





## Scan-To-CAD



Faro Design ScanArm



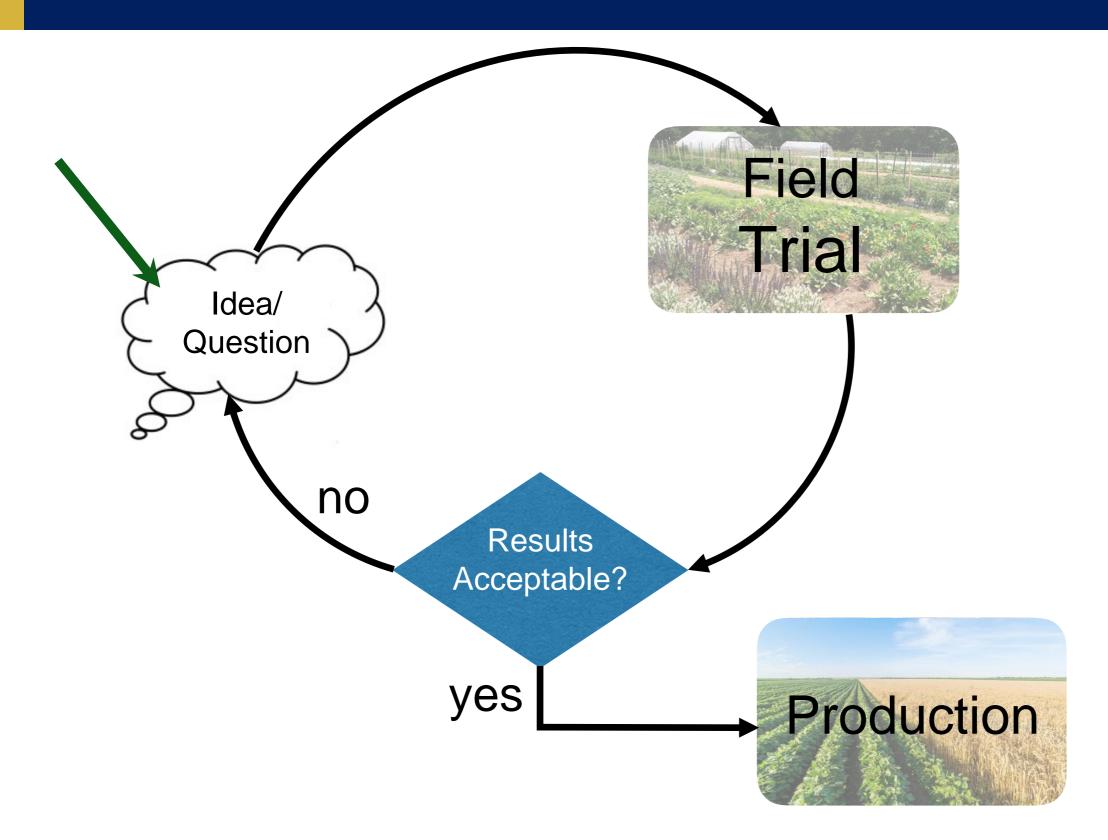
#### Computer-Aided Design (CAD) Computer-Aided Management (CAM)



0 250 500

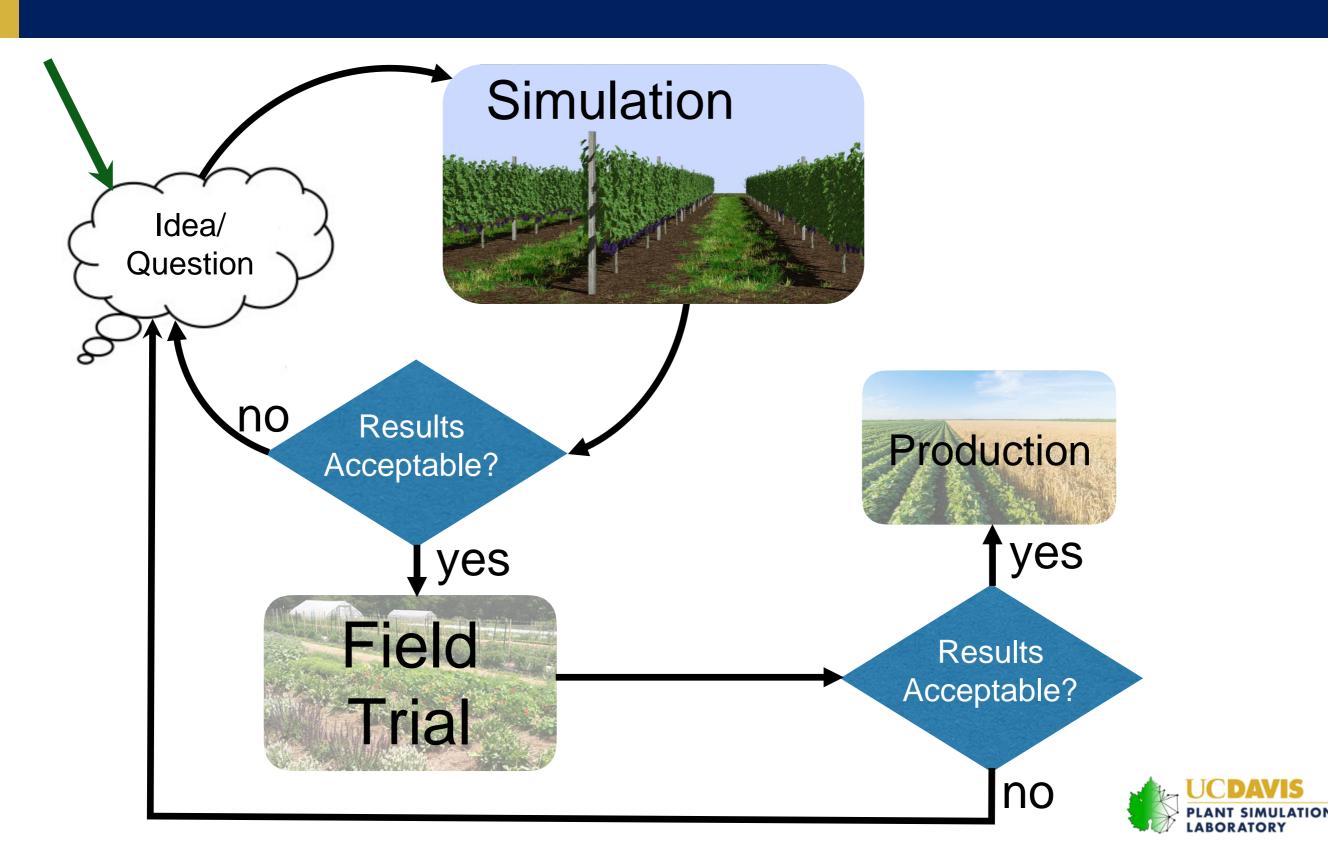
The overall goal is to be able to robustly simulate any possible crop design or management decision.

### **Traditional Innovation Cycle**





### Model-Based Innovation Cycle



## Continuum of Models

Need lots of data

Don't necessarily have to

understand what's going on

Fully Empirical

Fully Mechanistic

Need less data

processes and

mechanisms

Need to understand



### Helios 3D Modeling Framework

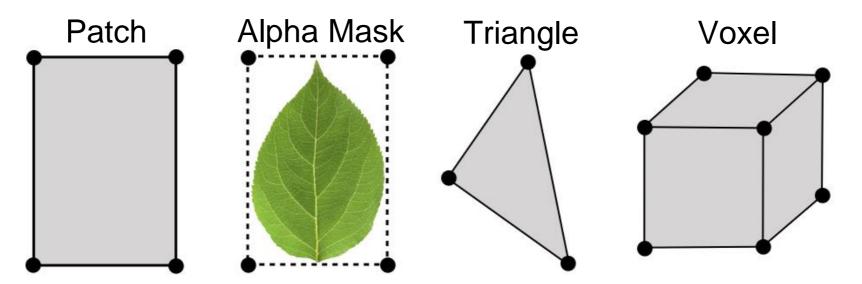
#### Available model plug-ins:

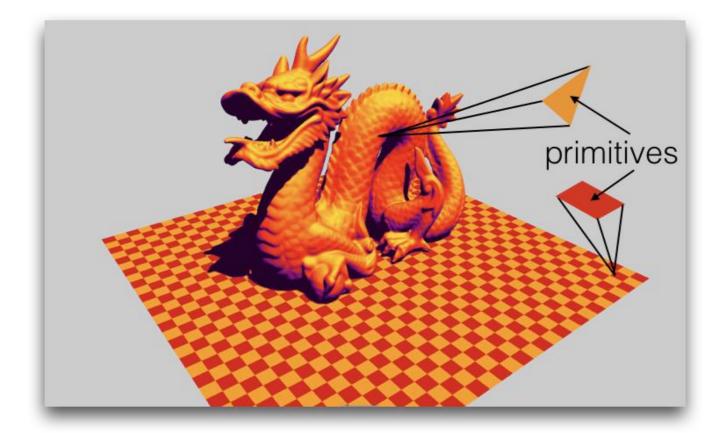
- LiDAR (structural models)
- Radiation
- Microclimate
- Evapotranspiration
- Photosynthesis
- Soil transport
- Others

HELIOS

### Helios 3D Modeling Framework

#### Representation of geometry: Primitive Elements





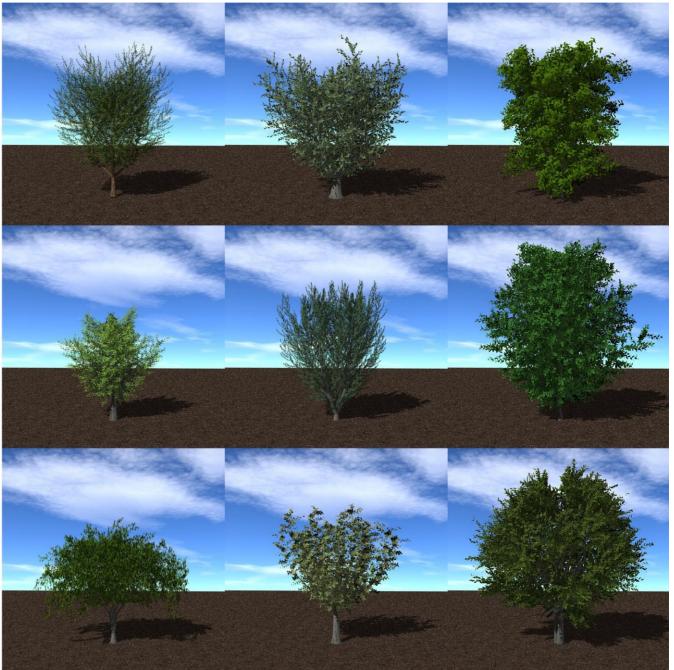


## 3D Inputs

#### **3D Structural Model**







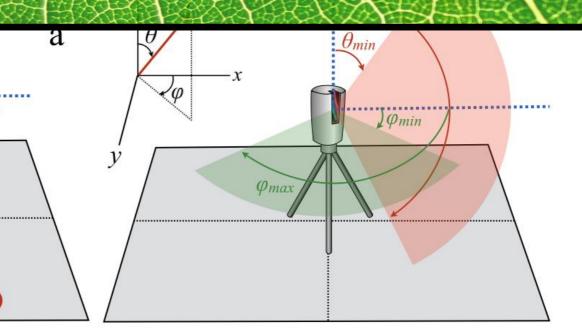


#### Rapid Measurement of Canopy Structure Terrestrial LiDAR Scanning

**O**hit

 $(x,y,z)_h$ 

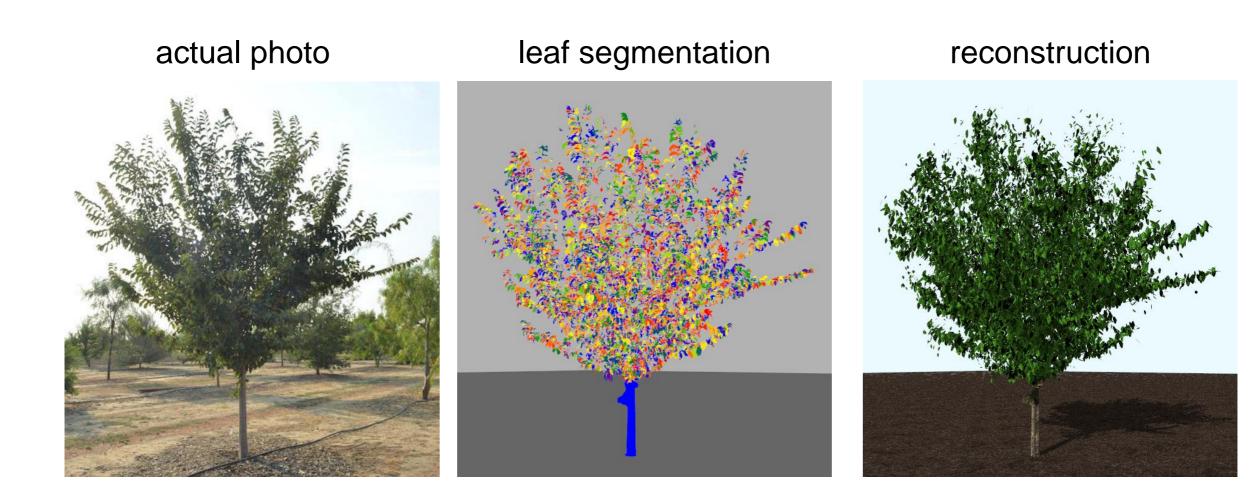
# The LiDAR gives points (not surfaces)





#### Canopy reconstruction at the leaf level

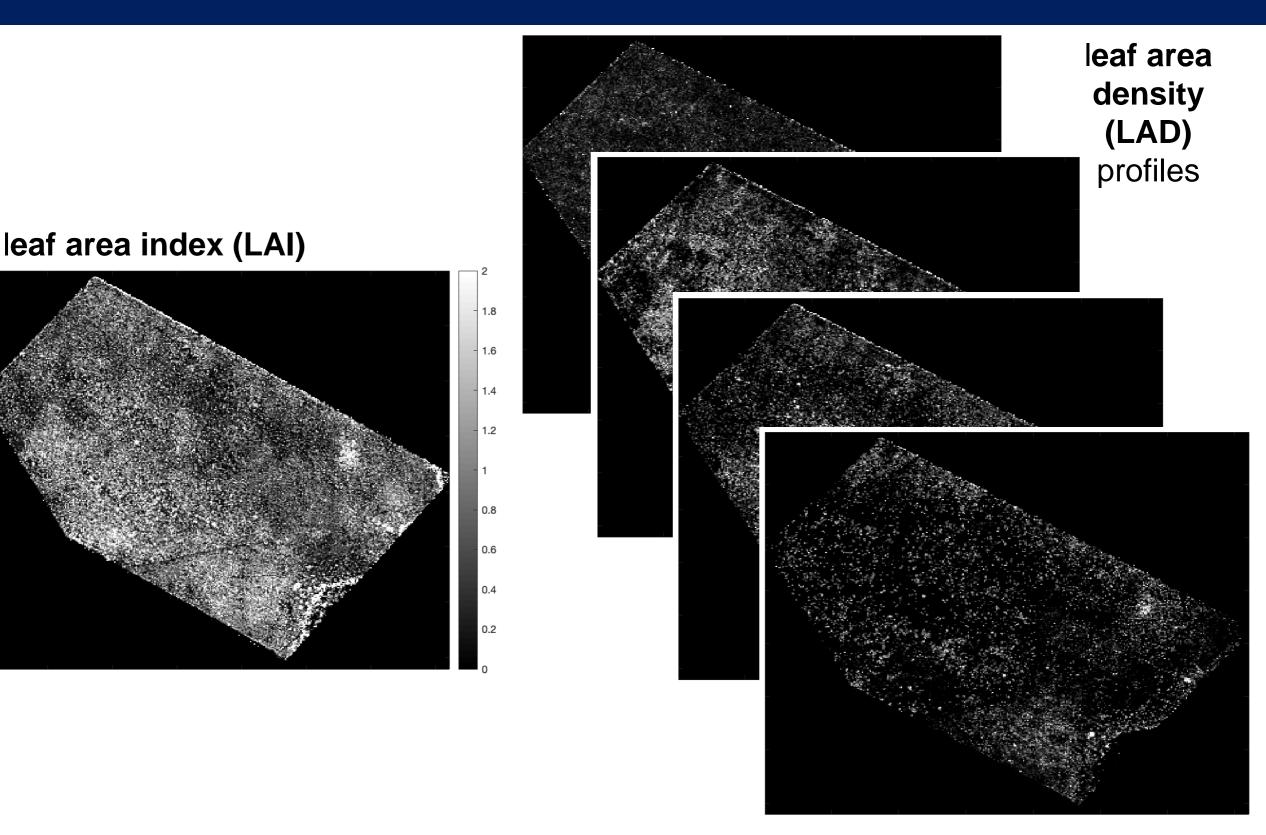
### Leaf-by-leaf reconstruction from LiDAR data to provide structural inputs for the 3D models.



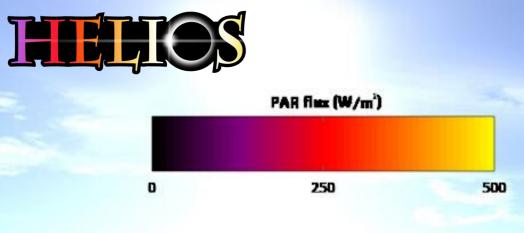


Bailey, B.N. and Ochoa, M. (2018). Semi-direct tree reconstruction using terrestrial LiDAR point cloud data. *Remote Sens. Env.* 208:133-144

## Airborne LiDAR scanning



## Light Model Plug-In



- 3D raytracing-based model of shortwave and longwave radiation transport
- New backward raytracing method allows for efficient and accurate modeling, particularly for longwave emission.

B. N. Bailey (2018). A reverse ray-tracing method for modelling the net radiative flux in leaf-resolving plant canopy simulations. *Ecol. Model.* **398** 233-245

## Computational Cost

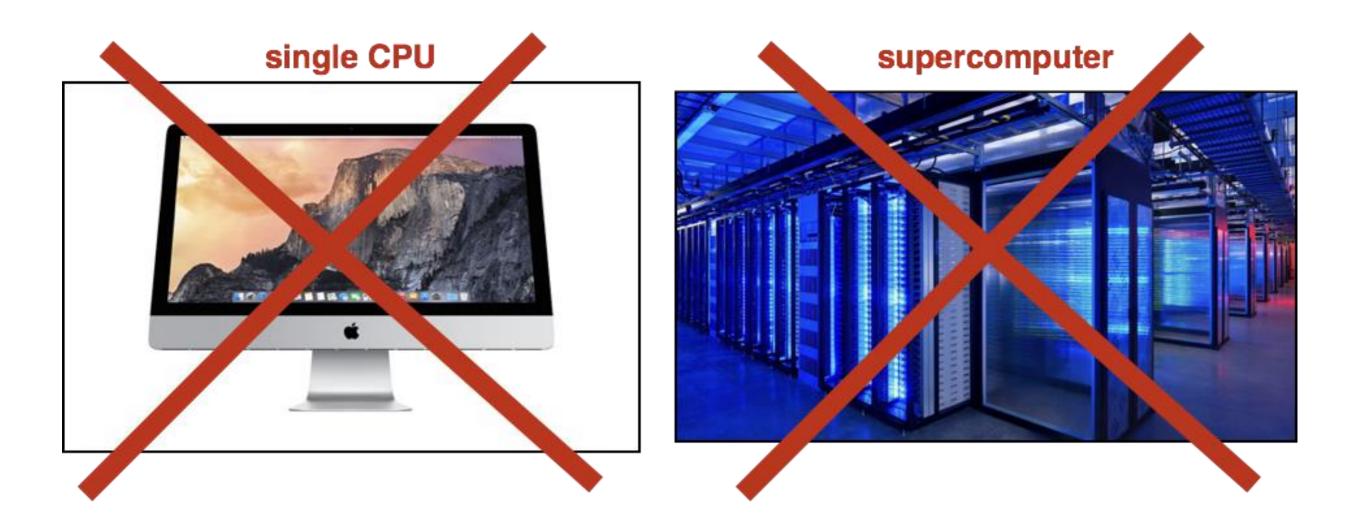






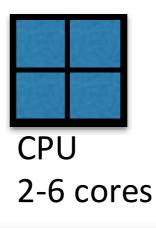
Image Credit: Activision, Sledgehammer Games

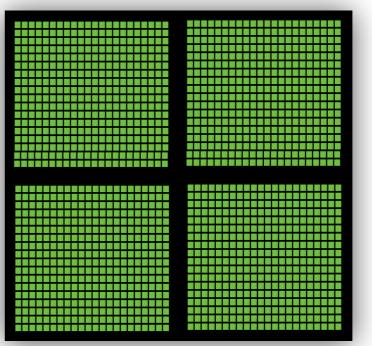
### Efficient Scaling from Leaf to Canopy

#### **GPU** Acceleration









#### GPU thousands of cores



### Efficient Scaling from Leaf to Canopy



Unparalleled combination of size and complexity.



#### Test Case: Orchard Evapotranspiration

- Riegl VZ-1000 waveform LiDAR scanner
- 27 scans total, each takes couple of minutes
- Each scan about 8M points







#### Test Case: Orchard Evapotranspiration

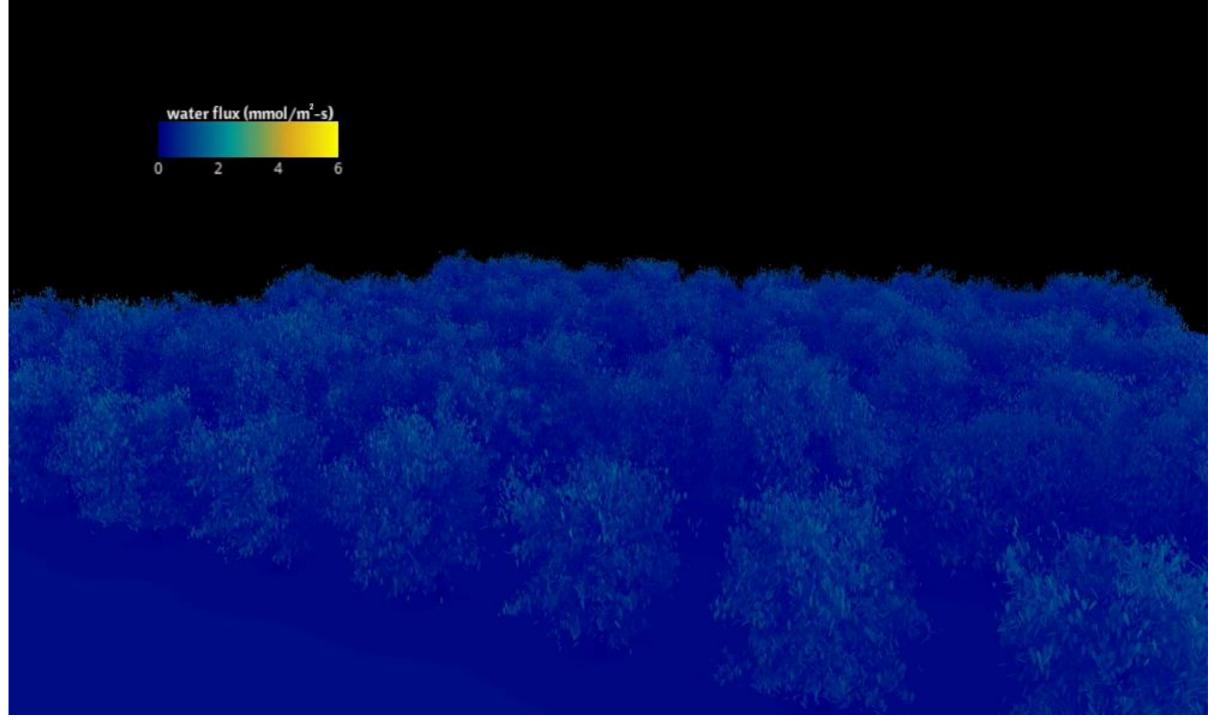
- LI-COR LI6800 portable photosynthesis system
- Measured full stomatal response to light, temperature (dark/saturated light), and humidity (dark/saturated light) for only a few leaves
- Used data to parameterize stomatal conductance model





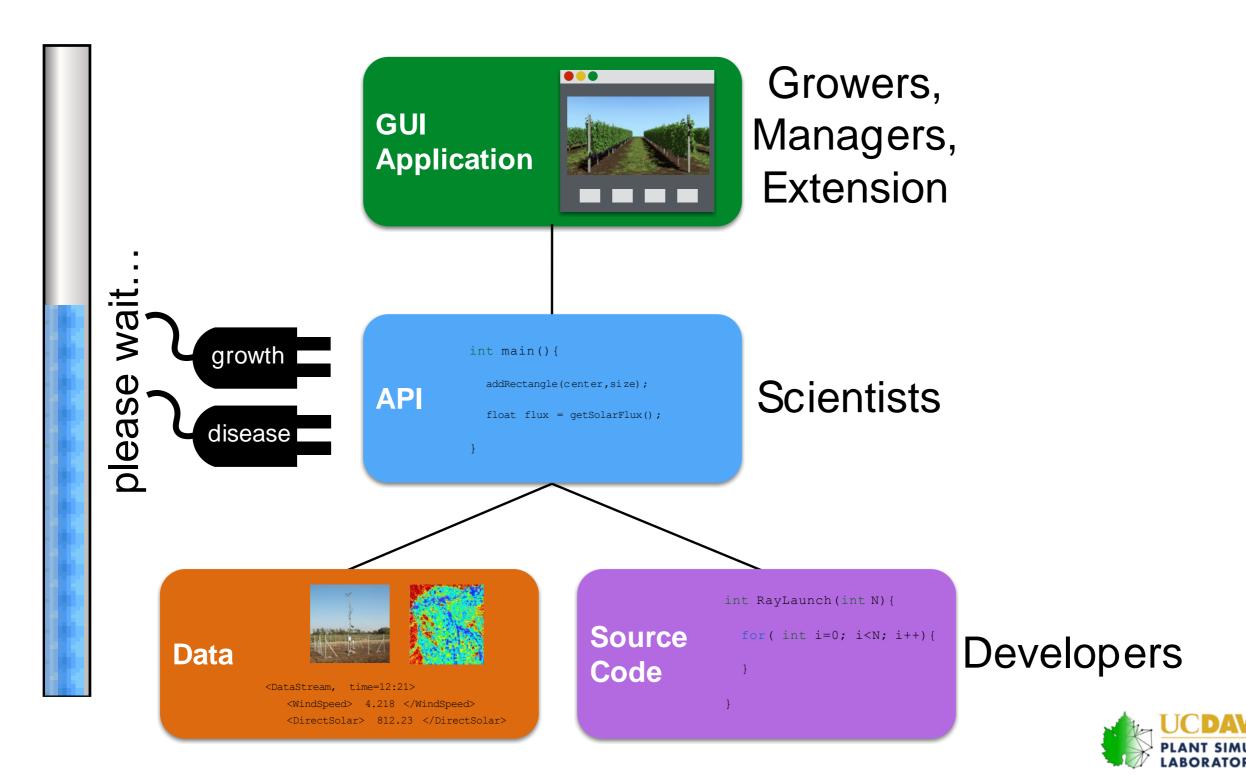


#### Test Case: Orchard Evapotranspiration





## Tech Transfer Pipeline



#### Modeling Powdery Mildew Spread

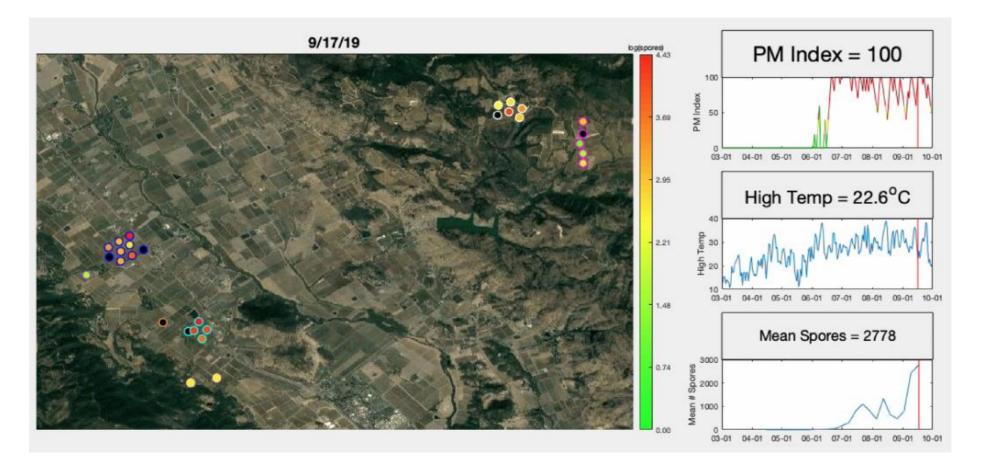
- Deposited Spore
- Infected Leaf



Collaborators: Walt Mahaffee, USDA-ARS; Monica Cooper, UCCE Napa



# Simple Models for Powdery Mildew Management



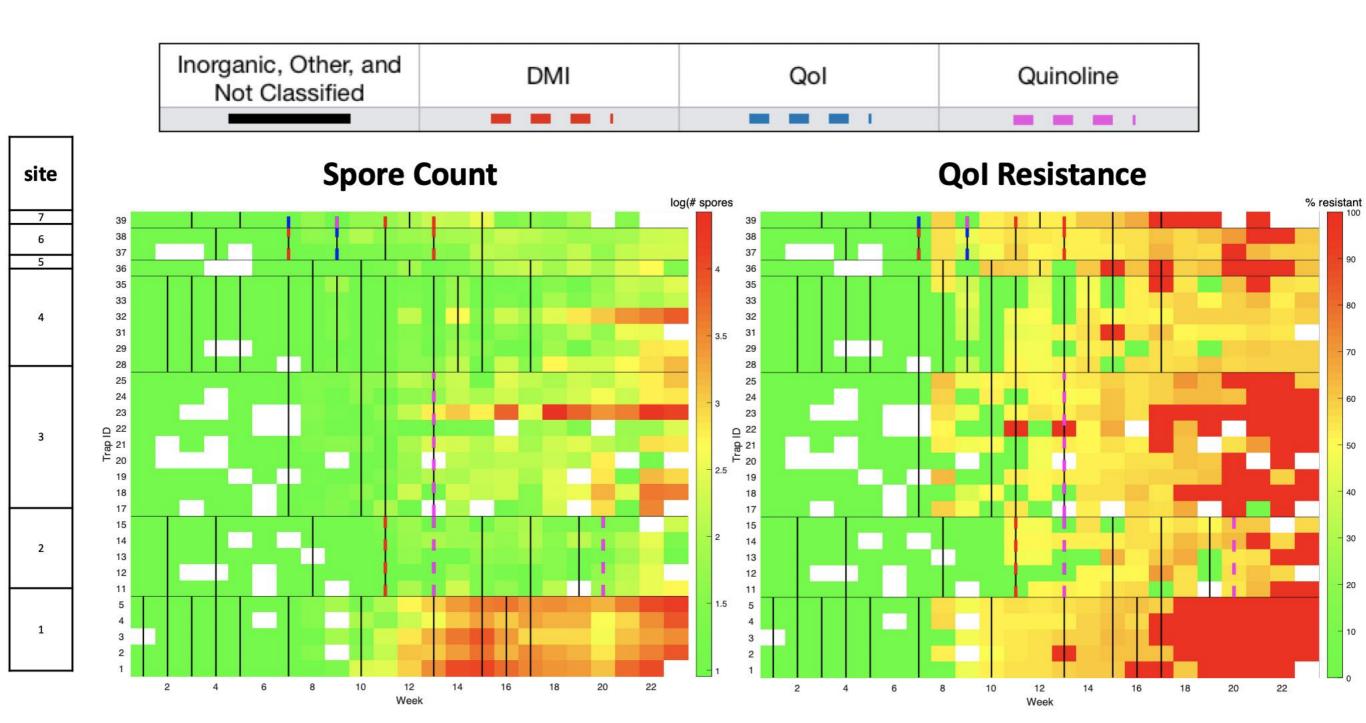
#### rotorod traps



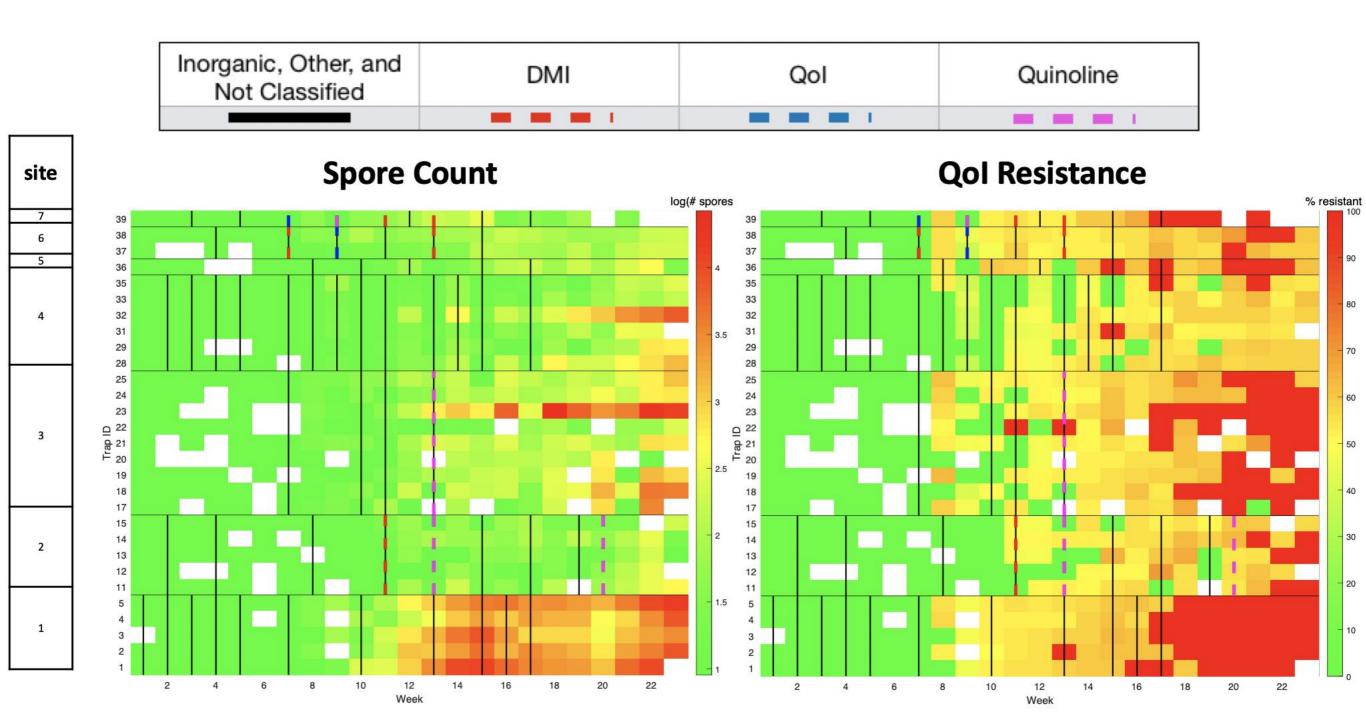


Collaborators: Walt Mahaffee, USDA-ARS; Monica Cooper, UCCE Napa

#### Spore Trap Data from 2018



#### Spore Trap Data from 2019



# Improved models of growth (both rates and structure)

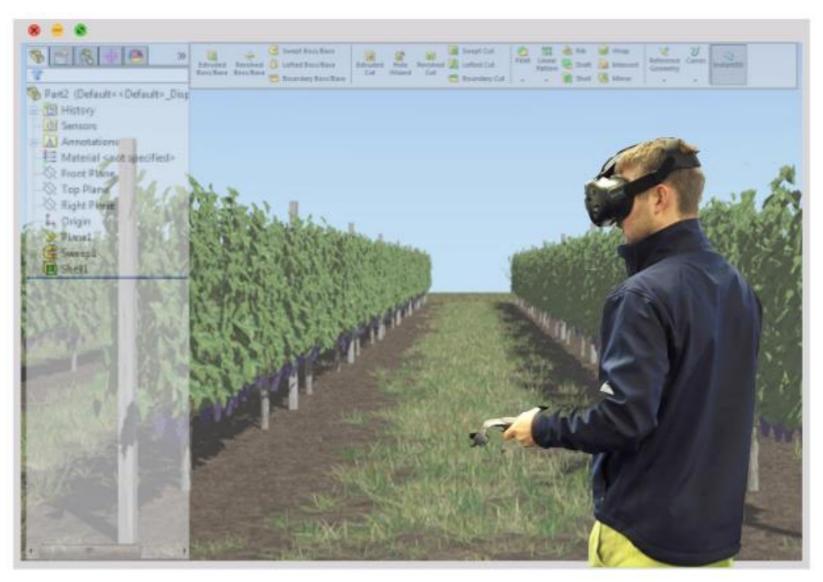
...and fruit development







<u>AgRISCS Project</u>: Management simulation tool to better understand how growers utilize data, models, and their perceptions of risk to make decisions.





### Thank You!

#### Contact:

email: <u>bnbailey@ucdavis.edu</u> web: <u>baileylab.ucdavis.edu</u>



www.github.com/PlantSimulationLab/Helios

#### Financial Support:



