### Smart sensing: combining sensors and intelligence

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### Future trends in Horticulture

- Fossil free: Energy saving, sustainable energy sources
- Emission free: Water saving, no nutrient losses
- Pesticide free: No chemicals
- Vertical farming, plant factories
- Digital growing: Sensors, AI, phenotyping
- Robotics, automation, labour saving, "labour free"
- $\rightarrow$  full control in Advanced Production Systems

2020





### Goal of Greenhouse control

- Achieve maximum quality and optimum quantity of crop production with the most efficient and sustainable use of the available resources
- Maximize profit
- Stable production



### Autonomous greenhouses

- Autonomous decision support systems (climate, irrigation, crop management)
- Intelligent sensing of cultivation parameters (climate, crop, irrigation, fertigation, pest,
- diseases)
- Automated handling of activities with robotics (harvesting, spraying)





# Data collection in autonomous greenhouse control

### WHY?

### ✓ Input for control

 Maintain agreement between reality and model computations

✓ Detect non-optimal situations









# Data collection in autonomous greenhouse control

### WHAT?

✓ Climate data

- ✓ Equipment use
- ✓ Crop parameters









# Data collection in autonomous greenhouse control

HOW?

✓ SENSORS

- $\checkmark\,$  Direct measurement of desired parameter
- ✓ Soft sensors (use of algorithm to compute desired parameter)

### ✓ Manual Measurements









## What did we measure?



## What did we measure?

![](_page_8_Figure_1.jpeg)

## Crop/Gutter weighing system

#### Measures:

- Irrigation
- Drain
- Slab weight and saturation
- Crop weight
- Transpiration

 $W_{irrigation} = \Delta W_{slab} + \Delta W_{crop} + W_{drain} + W_{transpiration}$ 

![](_page_9_Picture_8.jpeg)

![](_page_9_Picture_9.jpeg)

![](_page_9_Picture_10.jpeg)

A virtual greenhouse system (with a crop) that reacts to environmental changes and climate control actions on the exact same way as the "physical" system. The crop reacts (growth and production) on the exact

The crop reacts (growth and production) on the exact same way as the physical too.

# **Digital Twin**

![](_page_10_Picture_3.jpeg)

![](_page_10_Picture_4.jpeg)

![](_page_11_Picture_0.jpeg)

# Real-time validation/calibration of Digital Twin with measured data

#### Accurate computations of:

- ✓ Indoor climate
- ✓ Transpiration
- ✓ Crop growth

#### Allow the use of the Digital Twin for

- ➢ Estimation of yield → compute cost and benefits of climate control actions
- ➢ Estimation of → Auto water requirements sche
- → Autonomous irrigations scheduling

![](_page_11_Picture_10.jpeg)

![](_page_11_Figure_11.jpeg)

![](_page_11_Picture_12.jpeg)

### Water Balances

Water Stress Test: Weighing gutters

![](_page_12_Picture_2.jpeg)

 Compasiron of exoectation and measurement or measurement and model output for stress or abnormalities detection

![](_page_12_Figure_4.jpeg)

• Reduced irrigation can clearly be seen in the reduced transpiration

![](_page_12_Picture_6.jpeg)

![](_page_12_Picture_7.jpeg)

## Sensing applications – LAI estimation

![](_page_13_Picture_1.jpeg)

![](_page_13_Picture_2.jpeg)

![](_page_13_Picture_3.jpeg)

## Sensing applications – LAI estimation

- Replacing labour intensive measurements
- Plant in the spotlight of decision making
- Accurate, continuous, automated

![](_page_14_Figure_4.jpeg)

![](_page_14_Picture_5.jpeg)

![](_page_14_Picture_6.jpeg)

### Sensing applications – Leaf initiation rate

- Computer vision for tracking leaf initiation rate
- Replacing labour intensive measurements
- Used for model validation/ calibration

![](_page_15_Figure_4.jpeg)

![](_page_15_Figure_5.jpeg)

![](_page_15_Picture_6.jpeg)

![](_page_15_Picture_7.jpeg)

## Computer vision for fruit growth

- One functional model
  - Detect and segment cucumbers
  - Determine length and width
  - Estimate weight over time
- Comparison with manual measurements

![](_page_16_Picture_6.jpeg)

![](_page_16_Figure_7.jpeg)

![](_page_16_Picture_8.jpeg)

![](_page_16_Picture_9.jpeg)

### Take home messages

- Sensing is essential in autonomous greenhouse control
- A minimum set of sensors is required for operation
- Additional sensors can replace manual tasks
- Sensors can be used to maintain high accuracy of simulation data
- Additional sensors can provide insight in crop functions and allow control optimisation

![](_page_17_Picture_6.jpeg)

![](_page_17_Picture_7.jpeg)

### Thank you for your attention!

![](_page_18_Picture_1.jpeg)

For more information: Contact: ilias.tsafaras@wur.nl

![](_page_18_Picture_3.jpeg)

![](_page_18_Picture_4.jpeg)

![](_page_18_Picture_5.jpeg)