

# Thermal imaging: WaterLink project

**Use of thermal imaging to sense plant water status  
and schedule irrigation in nursery plants.**

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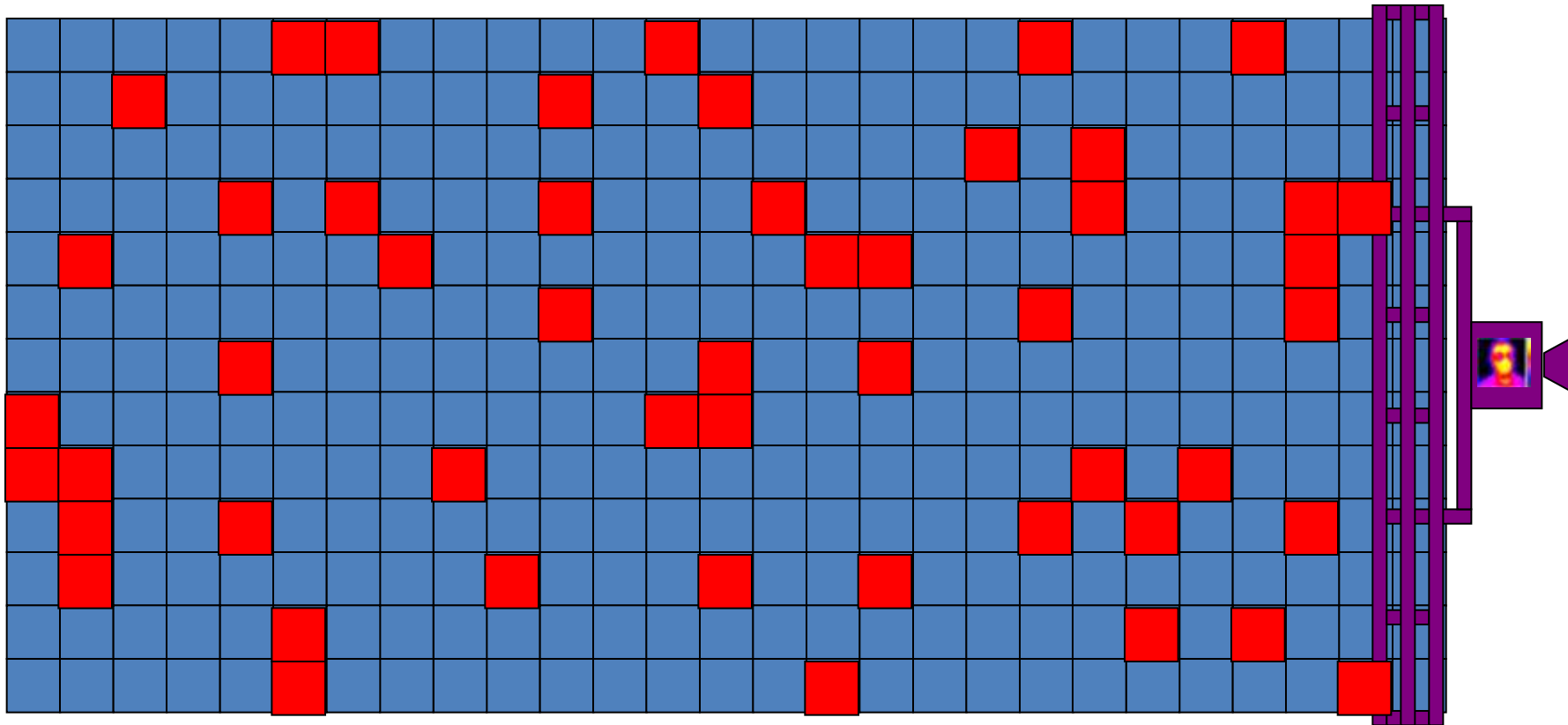
# Theoretical background

- Plant transpiration cools the leaves.
- Under drought, many plants can control the rate of water loss by closing their stomata;
- this automatically increases leaf temperature.
- Therefore, leaf temperature can be used as an indicator of water stress and the need for irrigation.

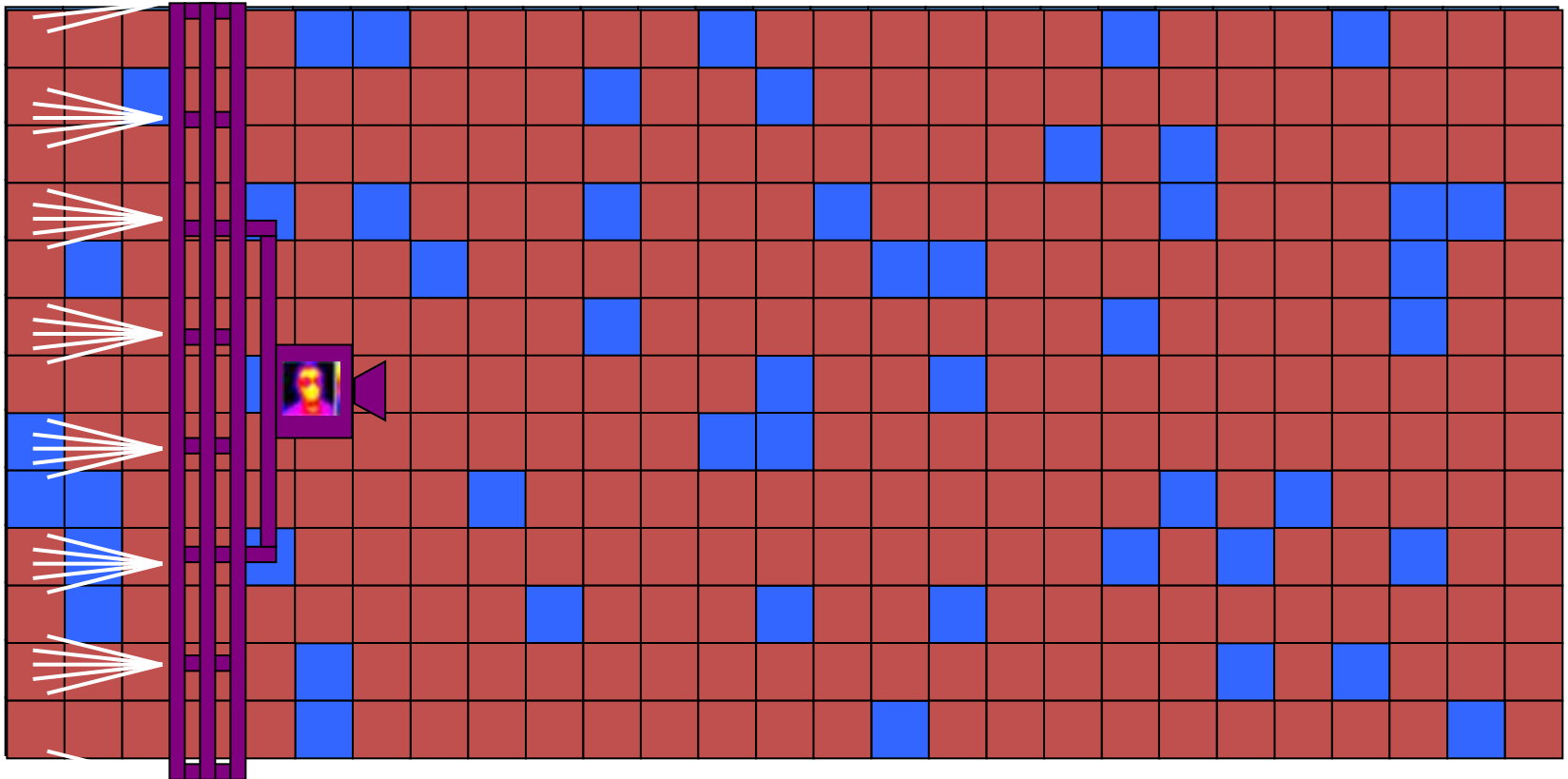
# Objective: automated irrigation control



# 1. Identify stressed plants - thermal imaging



## 2. Apply water where necessary



# Develop test rig for automated irrigation

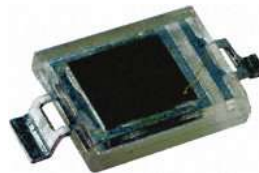
- Commercial partners (Pera Innovation Ltd, Denton Automation) to develop test rig and prototypes;
- University of Dundee to derive algorithms for estimation of canopy cover and plant temperature. Algorithms need to be robust for:
  - a wide range of plants;
  - a wide range of background materials;
  - different lighting conditions.

# Automated irrigation: steps involved

1. Take images and temperatures.
2. Identify plant from background.
3. Estimate plant temperature (removing effect from background).
4. Assess plant water stress level – environmental calibration required (stress index) .
5. Calculate amount of water needed / where.
6. Apply irrigation.

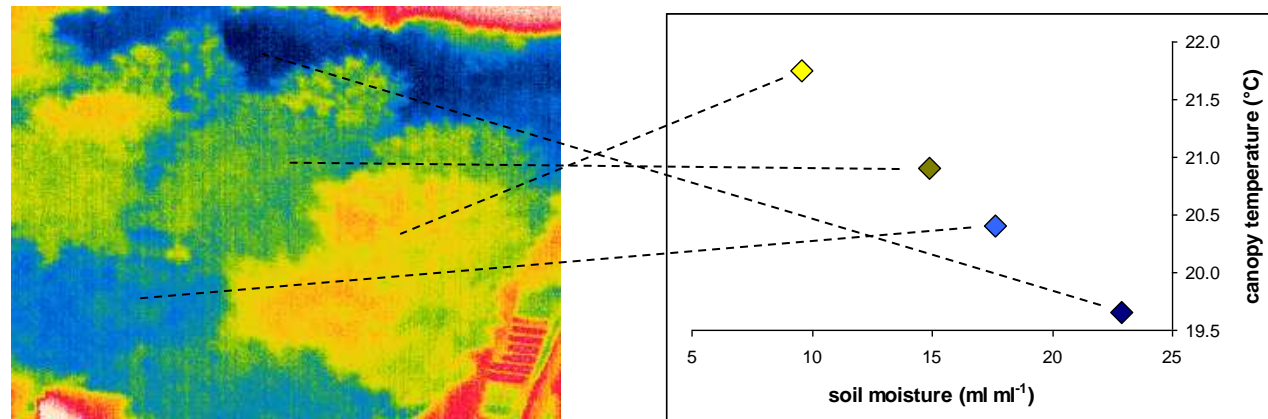
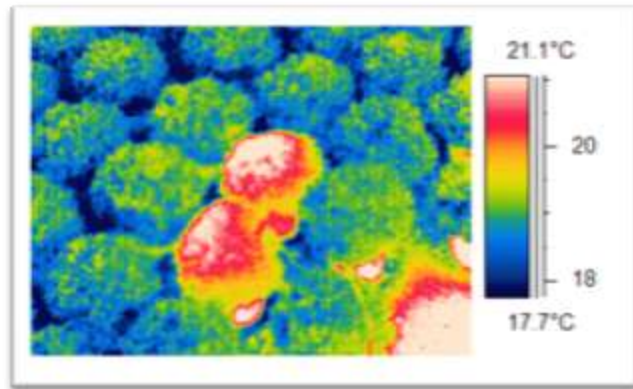
# 1. Take images and temperatures

- Easy!
- Visible and thermal cameras
- Infrared thermometers
- Thermal sensors



# Actual performance of thermal sensing

Is it good enough? Yes.



## 2. Identify plant from background

Need a way to distinguish between plant and background:

- to allow us to detect empty areas (stop irrigation);
- to estimate plant temperature if not all the area covered by the field of view of the sensor is plant.

Difficulty of recognising plant and background from thermal images – Use Vegetation Indices.

# Identifying plant: Vegetation Indices (VI)

VI methods work on ratios of Red (R) and near-Infrared (NIR) reflectances.

Based on the property of plant material to reflect NIR light more efficiently than most other materials.

$$\textit{Reflectance} = \frac{\textit{Reflected light}}{\textit{Incident light}}$$

# Identifying plants: high resolution

- Two-camera system to estimate canopy cover:
  - IR-blocking filter (>700nm) – measures visible (R)
  - Visible-blocking filter (<700nm) – measures NIR
- NDVI calculated at pixel level (high resolution)

$$NDVI = \frac{R_{NIR} - R_{RED}}{R_{NIR} + R_{RED}}$$

- Problem: too large and expensive to mount on a gantry

# Identifying plants: low resolution

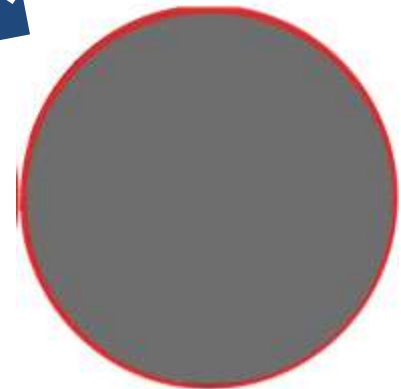
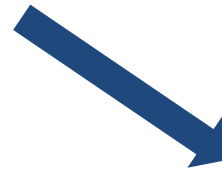
- Alternative: use cheaper and more robust point sensors (R and NIR)
- Problem: low resolution:



actual plant cover



NDVI-thresholded  
image (from camera)



average plant cover  
(as "seen" by sensor)

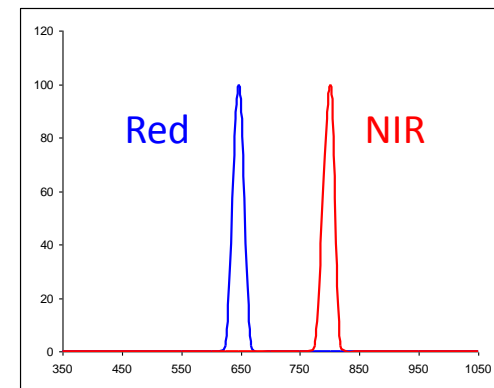
# From high to low resolution

Use the high-resolution camera system to calibrate the low-resolution sensor system.

- This is done using Vegetation Indices;
- and by testing against different backgrounds and light conditions.

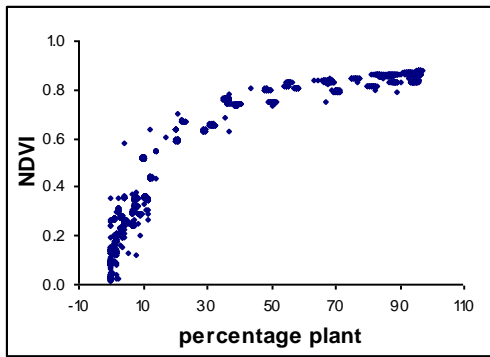
# R/NIR sensors for VI determination

- Two single-channel downward-pointing sensors (reflected light):
  - Red (650 nm) and NIR (800 nm) Skye sensors
- One upward-pointing sensor (incident light):
  - Two-channel (650 and 800 nm) Skye sensor



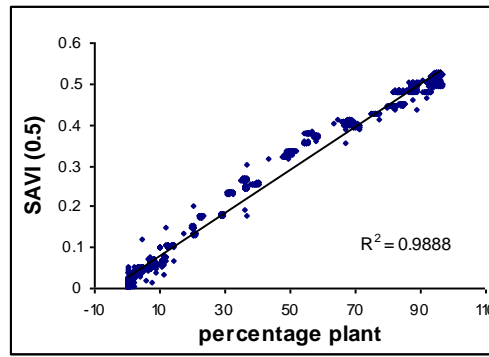
# Comparison of Vegetation Indices

## Relationship between different VIs and % plant



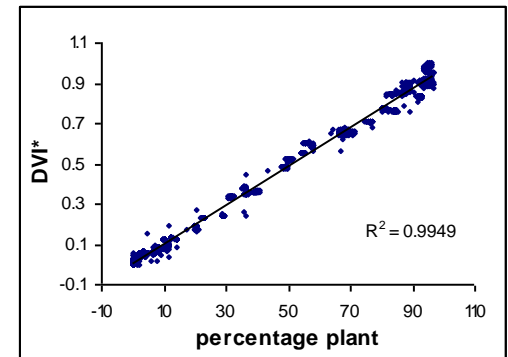
NDVI

$$NDVI = \frac{R_{NIR} - R_{RED}}{R_{NIR} + R_{RED}}$$



SAVI

$$SAVI = \frac{(1 + L) * (R_{NIR} - R_{RED})}{R_{NIR} + R_{RED} + L}$$

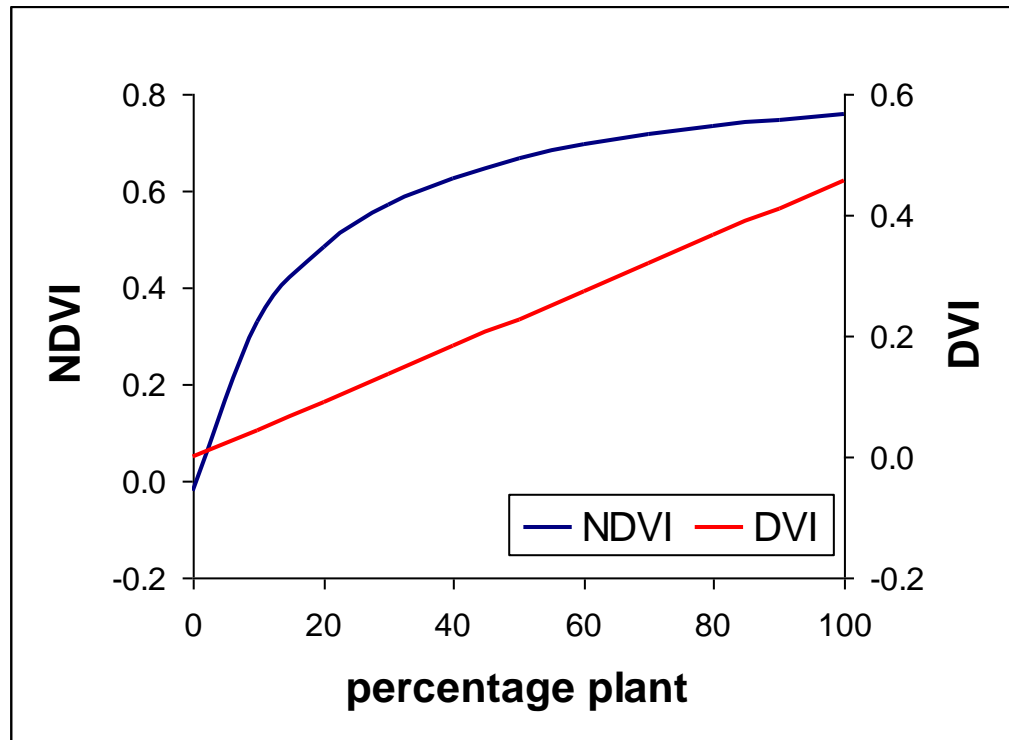


DVI\*

$$DVI^* = \frac{(R_{NIR} - R_{RED}) - (R_{NIR} - R_{RED})_{\min}}{(R_{NIR} + R_{RED})_{\max} - (R_{NIR} + R_{RED})_{\min}}$$

# Comparison of Vegetation Indices

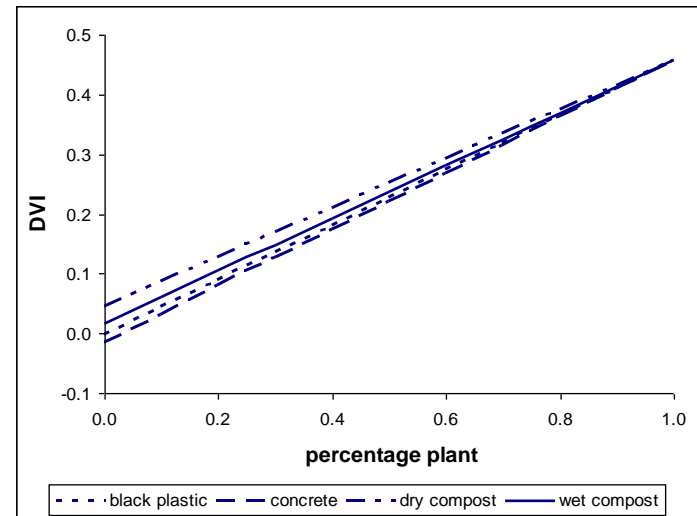
For simplicity we decided to use the DVI, which is a linear function of % plant:



# Calculation of % plant from DVI

DVI is normalised for the actual range of DVIs observed, from 0% to 100% plant cover.

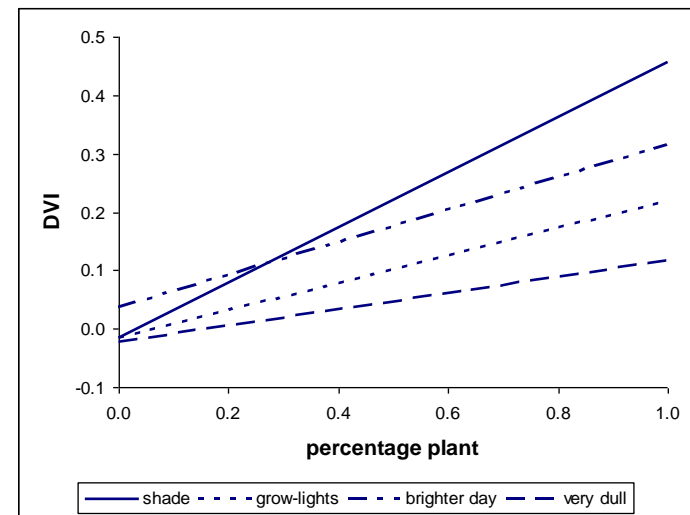
DVI at 0% plant (all background) will depend on the background material:



# Calculation of % plant from DVI

Reflectances in the different wavelengths also change with the quality and intensity of the incident light:

- So, need to calibrate for different greenhouse conditions.



### 3. Estimate plant temperature

If not all the area viewed by the sensor is plant, the temperature recorded by the sensor ( $T_s$ ) will be an average of plant temperature ( $T_p$ ) and background temperature ( $T_b$ ):

$$T_s = T_p * N_p + T_b * (1 - N_p)$$

where  $N_p$  is the proportion of plant

- So, need to know temperature of background.

## 4. Environmental calibration

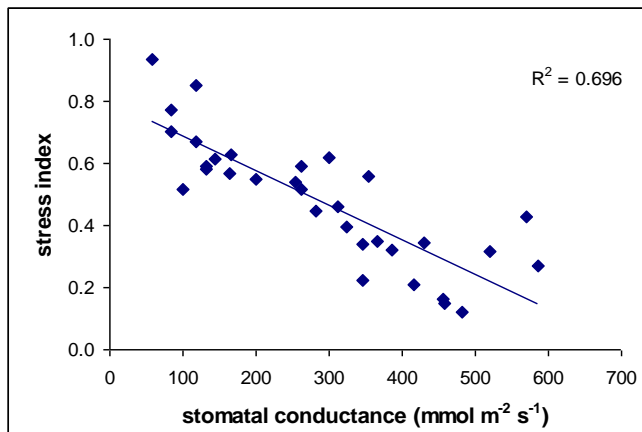
- Transpiration (and hence temperature) also affected by other environmental conditions (radiation, air temperature, RH, wind)
- Normalise using wet and dry temperatures, (from reference surfaces), to simulate non-transpiring and fully-transpiring plants
- Calculate a Crop Water Stress Index:

$$CWSI = \frac{(T_l - T_w)}{(T_d - T_w)} \quad T_i = \frac{(T_d - T_l)}{(T_l - T_w)}$$

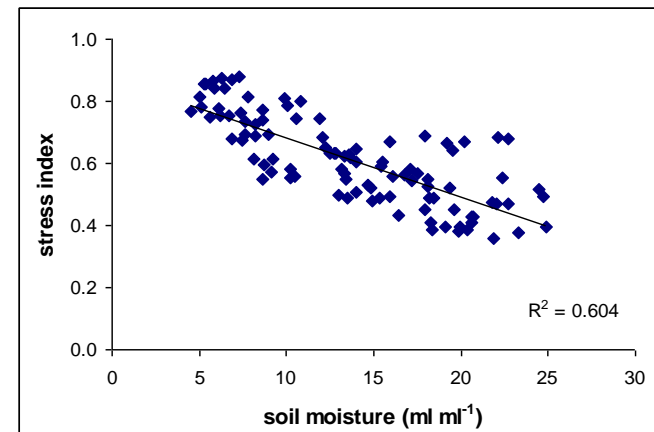
# Reference surfaces and stress indices

Wet and dry filter paper used to obtain the reference temperatures ( $T_{\text{dry}}$  and  $T_{\text{wet}}$ )

Stress index generally well related to stomatal conductance and soil moisture:



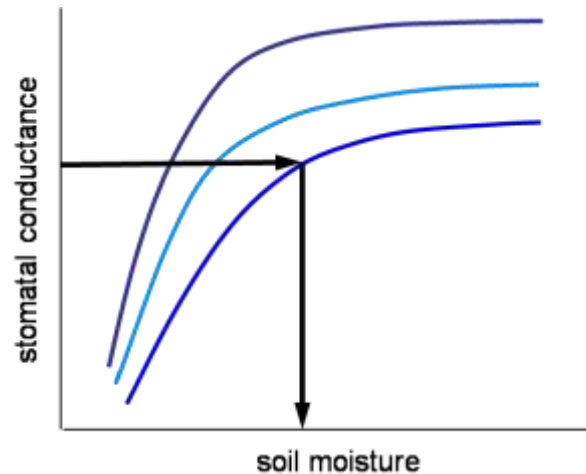
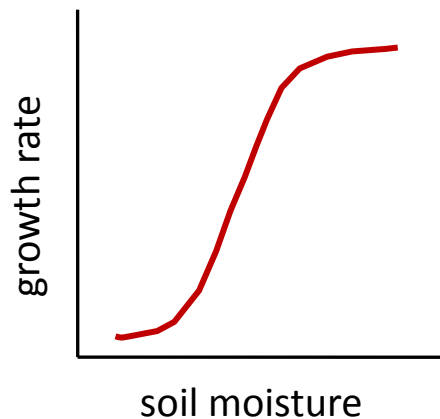
*Forsythia intermedia*



*Hebe ping "sutherlandii"*

## 5. Calculate amount of water required

Need to identify a soil moisture threshold for irrigation for each species.



Then relate temperature measurements to the stomatal conductance at the threshold level.

# Identify thresholds for different species

## Results:

- Qualitative differences between treatments are clear; however, relationship not so clear when studied quantitatively.
- Difficult to define threshold level, particularly in terms of 'plant performance' (estimation of growth by non-destructive methods).

## 6. Apply irrigation

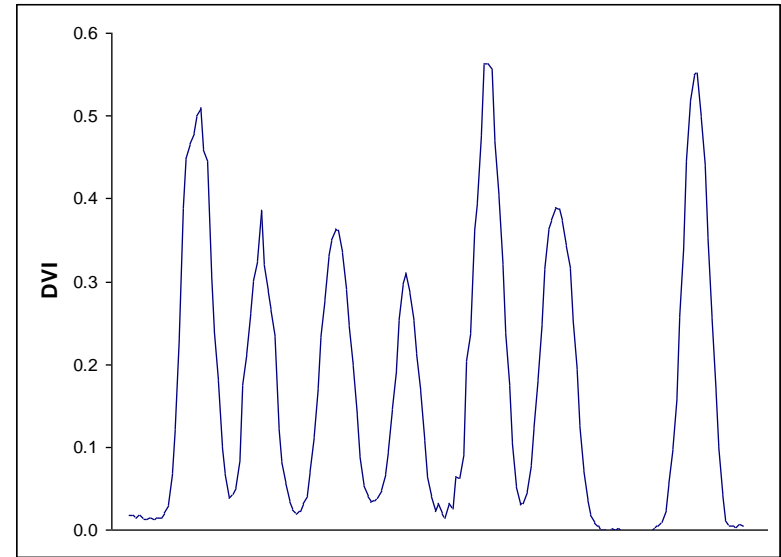
Irrigation gantry (Denton Automation) fitted with:

- thermal and light sensors on front arms;
- irrigation sprinklers on rear arms;
- algorithm to control watering (Dundee);
- wireless communication system (Pera).

# Sensor-controlled irrigation

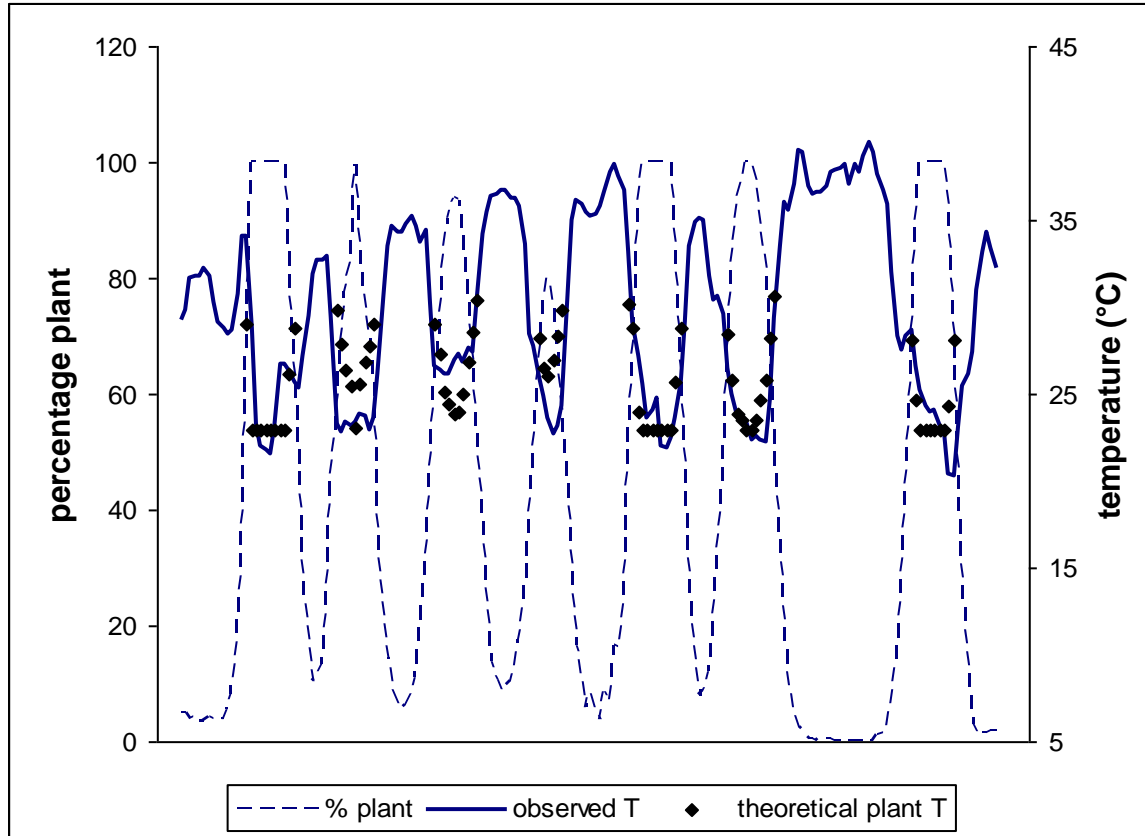


# Does it work? – identify plant



calculated DVI after running sensors over plants

# Does it work? – calculate temperature



# Limitations

- System developed and tested using high-quality Skye light sensors and Calex infrared thermal sensor – expensive!
- Cheaper light sensor alternatives used by the commercial partner were not accurate enough (unstable readings)

# Where are we? Further developments

- *Take images, temperatures and identify plant*  
Need to be able to repeat the work using cheap light sensors.
- *Estimate plant temperature*  
Test more thoroughly cheap temperature sensors.
- *Environmental calibration*  
Refine algorithm to estimate water stress.
- *Calculate amount of water required*  
Further study required to identify threshold levels.

# Acknowledgments

- Lyn Jones (inspiration)
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