

The 15th International Workshop on Nondestructive Quality Evaluation of
Agricultural, Livestock and Fishery Products

Spectral Sensing of Crop Growth Status in Greenhouses

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Background



- ❖ Population aging, low birth rate, migration from rural to urban  Labor Shortage
- ❖ Increasing demands of high quality and safe agricultural products
- ❖ AI and ICT technologies help to make changes  Smart Agriculture

Smart Agriculture



Artificial Intelligence (AI)

Information and Communication Technology (ICT)

Cloud and Big Data

Internet of Things (IoT)

Precision Agriculture

Intelligent Agricultural Machinery

Bio-Robotics



Fruits



NIR Detecting Device



Sugar Content
etc

Spectra
Location
Time



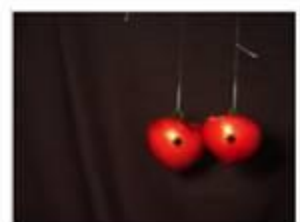
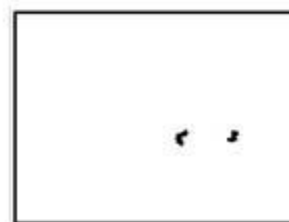
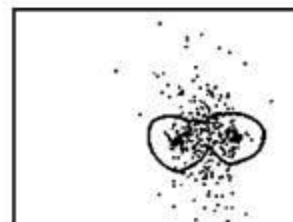
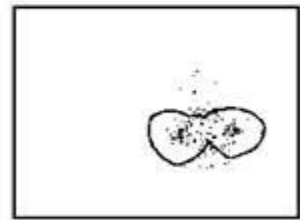
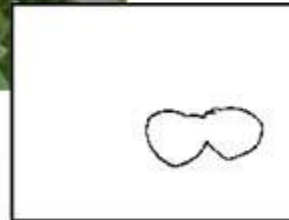
Mobile Device



APP

(Source : Chen *et al.*, 2016)

Tomato Picking Robot



(Source : Chen *et al.*, 2015)

➤ Precision Agriculture Approach

- Site-specific cultivation

- **Field Crops**

- Plant Sensing Data
 - Remote Sensing by satellites
- Position Information
 - Global Positioning System (GPS)

- **Greenhouses ?**



Source: <http://www.futuregov.asia>



Problem Statements

- More and more crops such as vegetables and ornamental plants are grown in greenhouses.
- Growth status monitoring of these greenhouse crops is equally important as that for field-grown crops.
- Consequently, **ground-based** multi-spectral remote imaging and plant-oriented remote-sensing algorithms based on monitoring of plant physiological status need to be developed for greenhouse production.



Case Study - Precision Agriculture in Greenhouse



Precision Agriculture in Greenhouse

➤ Precision Agriculture Approach

- Site-specific cultivation
- Field Crops
 - Plant Sensing Data
 - Remote Sensing by satellites
 - Position Information
 - Global Positioning System (GPS)



Source: <http://www.futuregov.asia>

- Greenhouses

- Plant Sensing Data
 - Ground-Based Sensing (no satellites)
 - Plant-Oriented Remote-Sensing Algorithms
- Position Information
 - Precision Local Positioning System (PLPS)



➤ Seedling Nursery

- In Taiwan, vegetable seedlings are cultivated in greenhouses.
- Cabbage seedlings are grown using plug trays in controlled environment.



RFID Management Information System

➤ Remote Sensing and Monitoring

- ✓ MSIS—Multi-Spectral Imaging System
- ✓ EFMS—Environmental Factors Measurement System
- ✓ WIMS—Web Image Monitoring System

➤ Greenhouse Operations

- ✓ VRSS—Variable Rate Spraying System
- ✓ RECS—Remote Environmental Control System

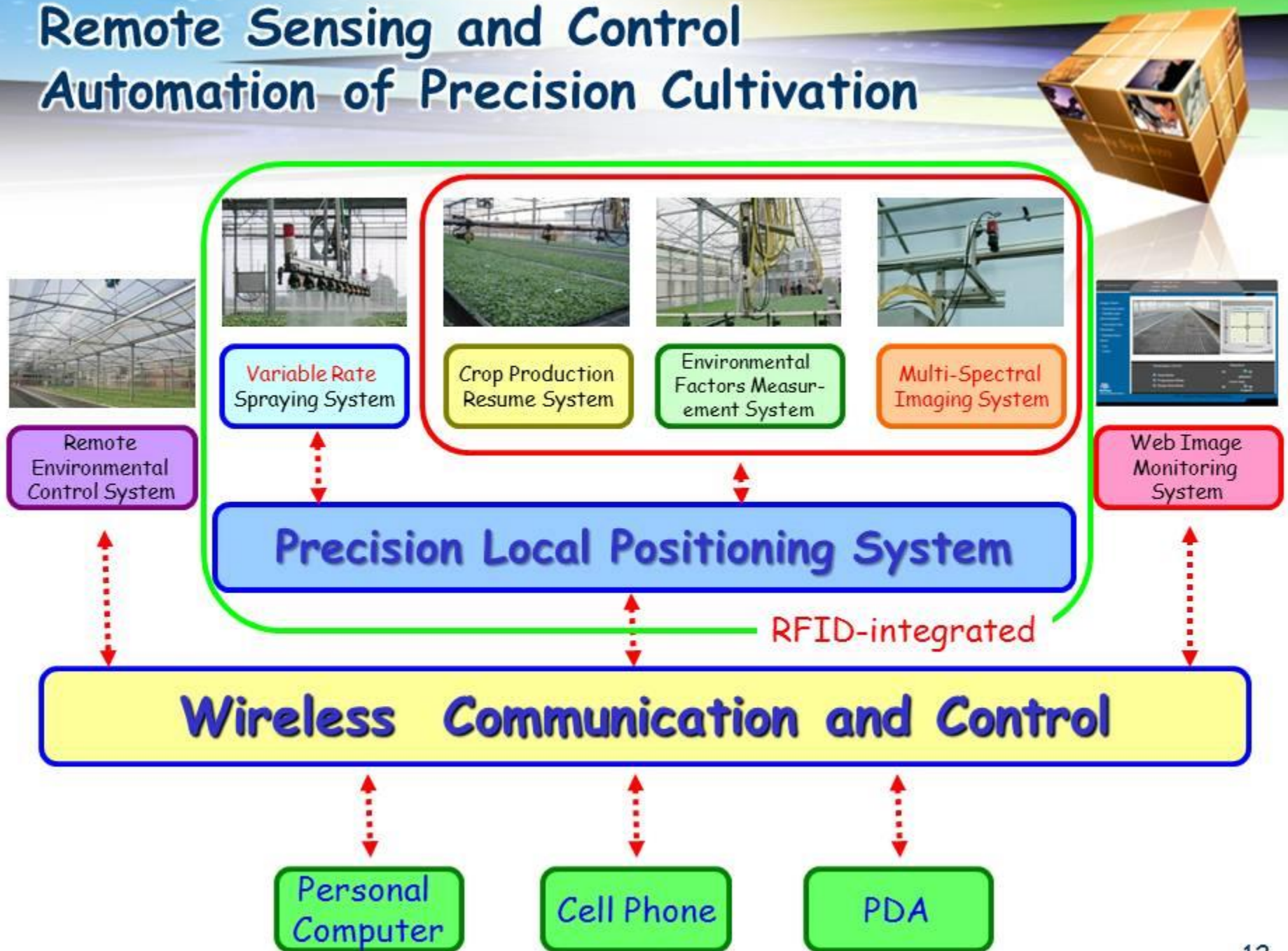
➤ Production Traceability

- ✓ CPRS—Crop Production Resume System
 - Environment Resume
 - Management Resume



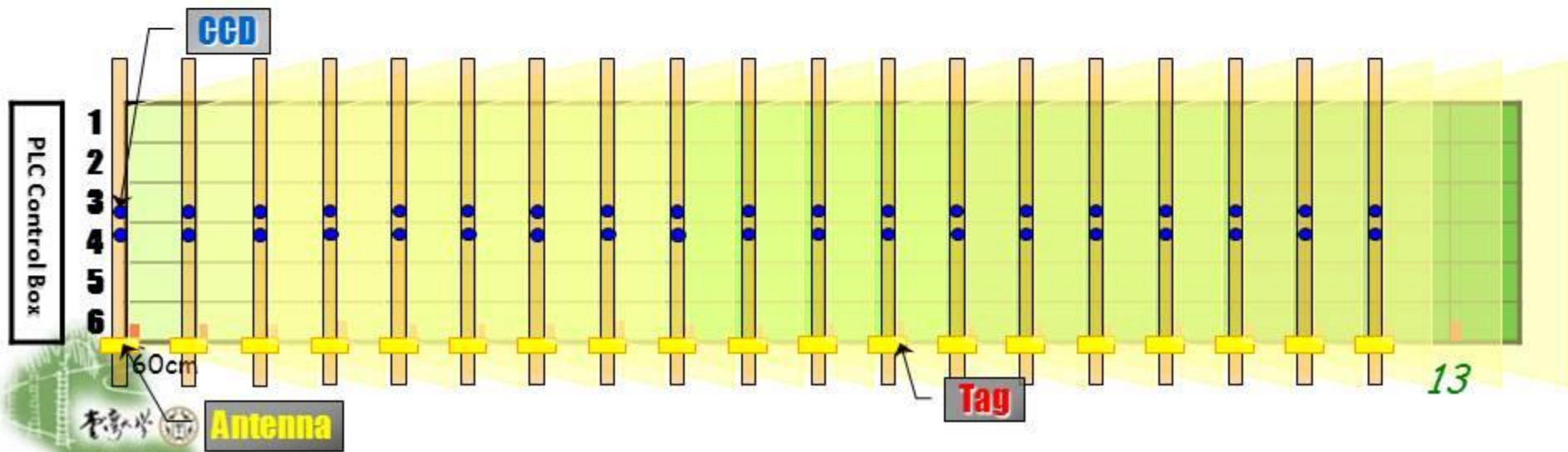
Remote Sensing and Control

Automation of Precision Cultivation



Variable Rate Spraying System

- RFID Tag Detection
- Multi-Spectral Images Grabbing
- Environmental Factor Measurement
- Image Processing and Analysis
- Water Management Decision
- Variable Rate Spraying



Variable Rate Spray System

-- Graphic Programming Control System

RFID Information

Card Number: 94 Plant Location: 94

Hour: 15 Min: 48 Sec: 52

Critical Temperature: 23

Critical Relative Humidity: 70

Critical Light Intensity: 90

Extra Score

Score 1: 0.2 Score 2: 0.2 Score 3: 0.2

Temperature (T): 0.5, Relative Humidity (RH): 0.3, Light Intensity (LI): 0.2

LAI & NDVI

LAI_Lower: 0 LAI_Middle: 0.612 LAI_Upper: 0 NDVI_Upper: 0.65

PLAI & NDVI

LAI: 0 0.612 0 NDVI: 0.095 0.705 0.362

Raw Truth Table: 0 4 0 NDVI (Central Area): 0.143 0.783 0.248

Modified Truth Table: 0 4 0 Truth Table Save

Multi-Spectral Imaging

Environment Factor

Environment Factor Remote Sensing System

T1: 19.48 T2: 19.29 T3: 19.35

RH(%) 1: 76.75 RH(%) 2: 76.75 RH(%) 3: 76.75

LI(umol/m2s) 1: 337.63 LI(umol/m2s) 2: 337.63 LI(umol/m2s) 3: 337.63



094	095	096	097	098	099	100	101	102	103	104	105	106	107	108
A	A	E	A	E	A	D	A	A	A	A	A	A	A	A
E	A	E	A	E	A	A	A	A	A	A	A	A	A	A
A	A	E	A	A	A	A	A	A	A	A	A	A	A	A

Final Watering Level



RFID-integrated Multi-Functional Remote Sensing System

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RFID Information System

Card Number Plant Location

101 101

Hour Min Sec

15 : 46 : 33

Critical Temperature 23

Critical Relative Humidity 70

Critical Light Intensity 90

Extra Score System

Score 1 Score 2 Score 3

0.2 0.2 0.2

Temperature (T) : 0.5; Relative Humidity (RH) : 0.3; Light Intensity (LI) : 0.2
 Score = T(H, Low) * 0.5 + RH(Low, H) * 0.3 + LI(H, Low) * 0.2 >= 0.6

Environment Factor Remote Sensing System

T1 19.52 T2 19.47 T3 19.61

RH(%) 1 76.01 RH(%) 2 76.01 RH % 3 76.01

LI(umol/m2s) 1 284.75 LI(umol/m2s) 2 284.75 LI(umol/m2s) 3 284.75

LAI & NDVI

LAI_Lower LAI_Middle LAI_Upper NDVI_Upper

0.1 0.4 0.6 0.65

0 1 2 3 4

A B C D E

LAI NDVI
 0 0 0 0.096 0.333 0.405

Raw Truth Table NDVI (Central Area)
 0 0 0 0.213 0.266 0.362

Modified Truth Table
 0 0 0 Truth Table Save

Multi-Spectral Imaging System



360x120 1/1 8-bit image 1 (0,0) NIR

360x120 1/1 RGB image 57,49,26 (200,108) RGB

360x120 1/1 8-bit image 70 (0,0) R

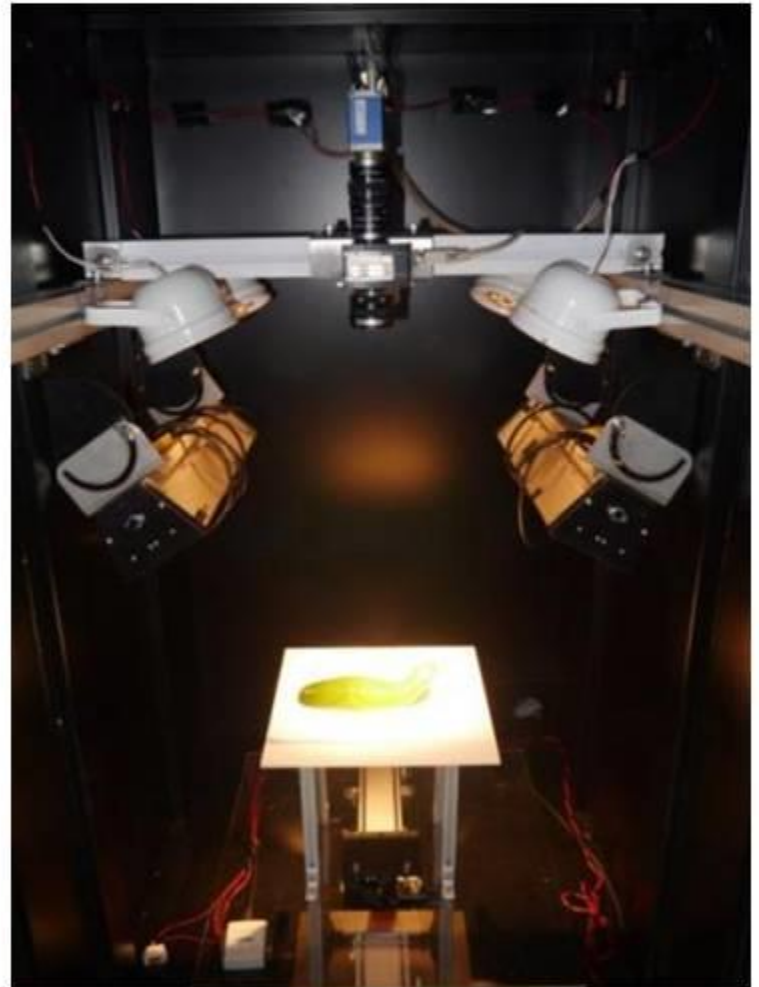
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A	A	A	A	A	A	A	A	A	A	A	A	A	B	A
A	A	A	A	A	A	A	A	A	A	A	B	A	A	A

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Case Study - **Spectral Imaging Approach to** **Detect Water Stress of Vegetable**

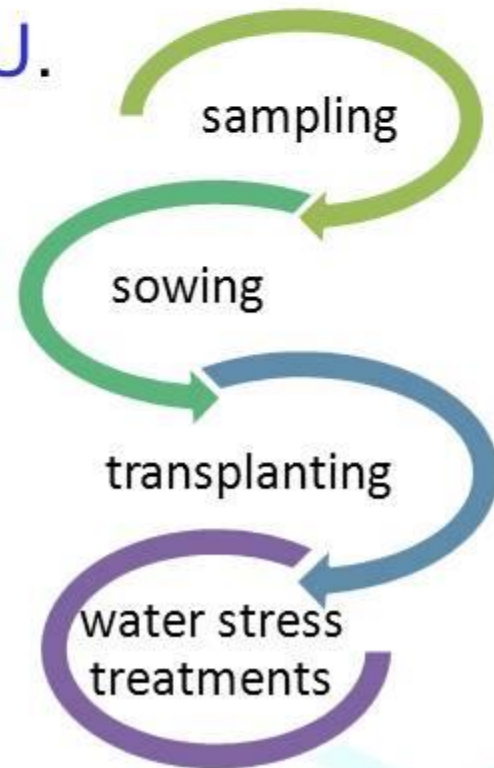
Hyperspectral Imaging System

- Hyperspectral imaging (HSI) system can not only detect the **spectrum**, but also obtain the information of the **image spatial space**.
- Hsu *et al.* (2018) developed a **HSI system** to evaluate *phalaenopsis* flowering quality.



Sample Preparations

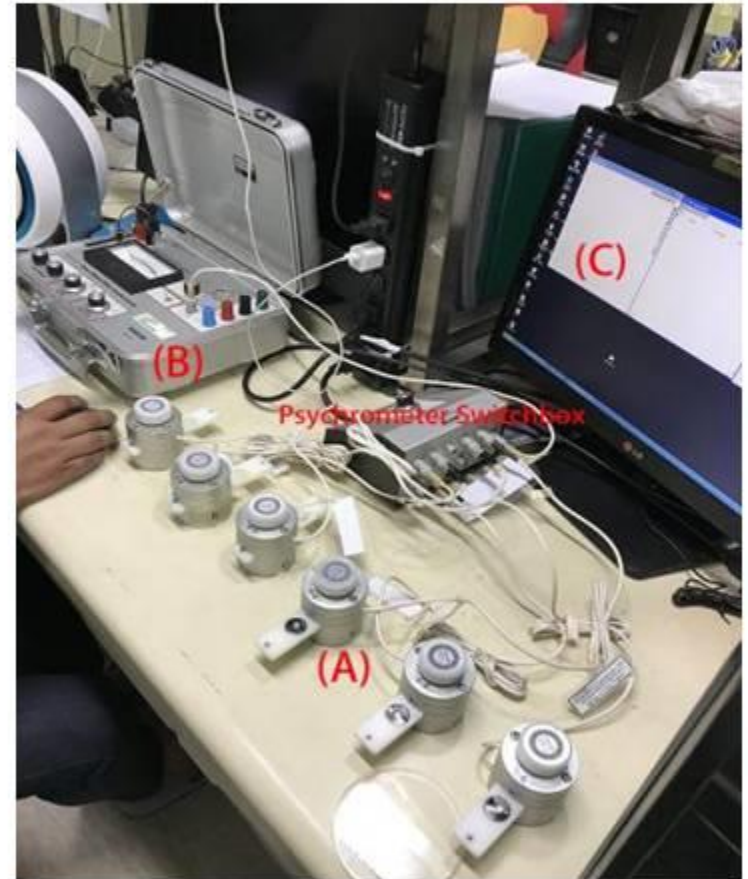
- The leafy vegetable samples used in the experiments were **Fengjing Pakchoi** (*Brassica rapa L. var. Chinensis* (Rupr.) Olsson).
- Cultivated in **phytotron** of NTU.



Measurement of Water Potential

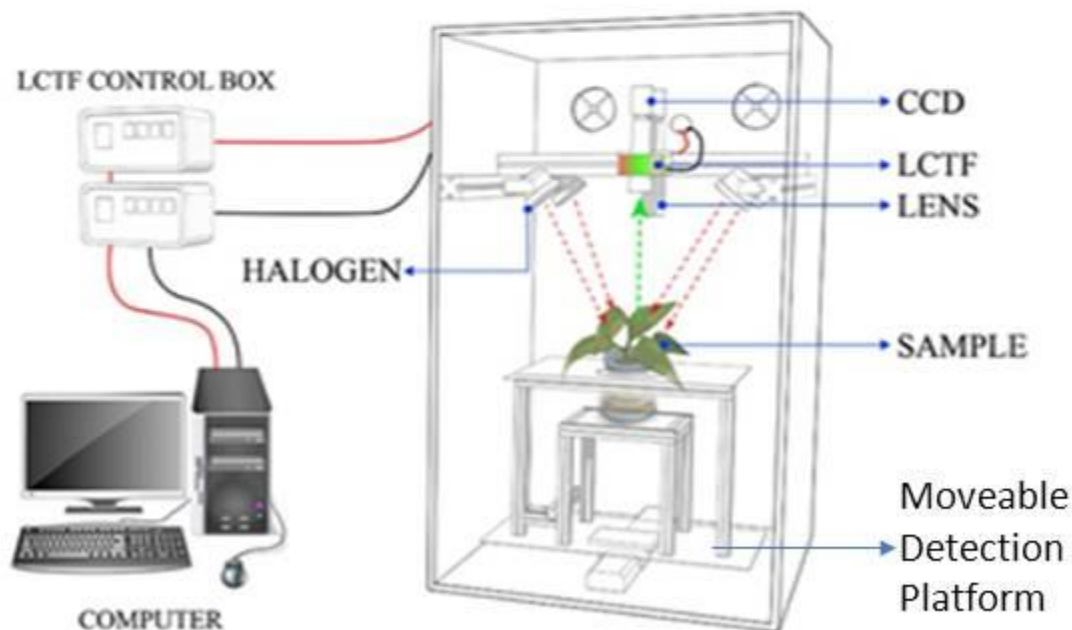
Water potential measurement system (**Wescor**) includes :

- (A) Sample chambers
+ Psychrometer switchbox
- (B) Dew point microvoltmeter
- (C) PicoLog acquisition software.



Measurement of Spectral Images

- A hyperspectral imaging (HSI) system (Hsu *et al.*, 2018) was adopted to capture the **spectral images** of vegetables.



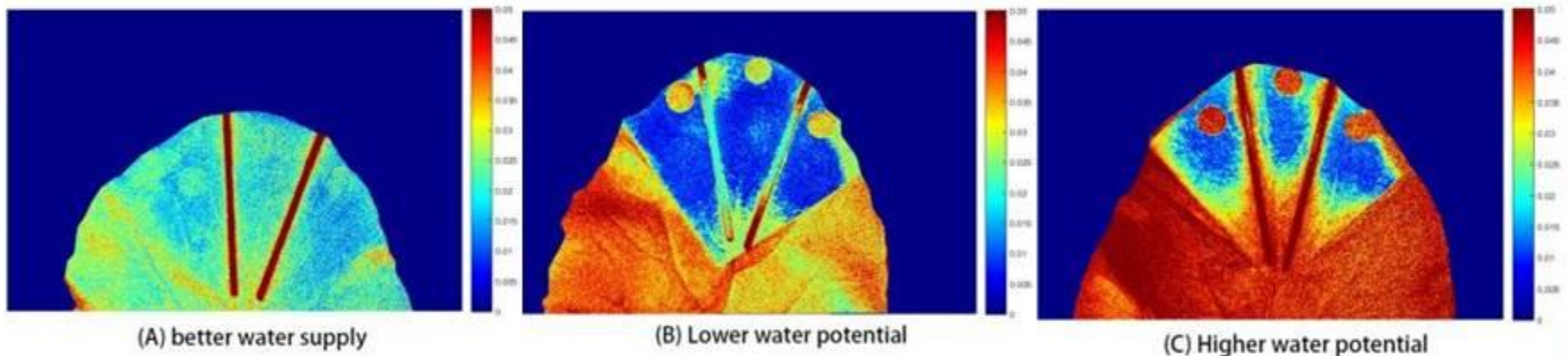
Spectral Analysis

- **MPLSR analysis** results of hyperspectral imaging in evaluating water potentials of leaves.

Math. Treatment	N	MEAN	SD	SEC	r
(0, 0, 4, 1)	48	2.055	0.533	0.341	0.768
(1, 4, 4, 1)	48	2.055	0.533	0.301	0.826
(2, 4, 4, 1)	48	2.055	0.533	0.305	0.820

Water Potential Distribution

- Pseudocolor Contour Plot to represent the **distribution of water potentials** on leaves.



- It was obvious that the distribution of **water potential** on vegetable **leaf** was **not uniform**.

Thanks for Your Attention

