

Non-destructive Sensing Technologies and Applications

Won Suk "Daniel" Lee
Professor
Agricultural and Biological Engineering
University of Florida

Table of Contents

- Non-destructive sensing technologies
 - Near-infrared spectroscopy (NIRS)
 - Time-resolved reflectance spectroscopy (TRS)
 - Machine vision
 - Multispectral / hyperspectral imaging
 - Magnetic resonance imaging (MRI)
 - Fluoroscopy with X-ray
- Applications
 - NIRS applications
 - Disease detection: citrus greening / citrus black spot
 - X-ray & MRI: fruit seed count

NEAR-INFRARED SPECTROSCOPY (NIRS)

How objects interact with EM energy

EM Spectrum & Spectral Signature

Spectrometry measures information related to the chemical composition of the materials with the wavelength

Average fruit spectral reflectance over a growing season from July to January (Kane & Lee, 2006)

Beer-Lambert Law

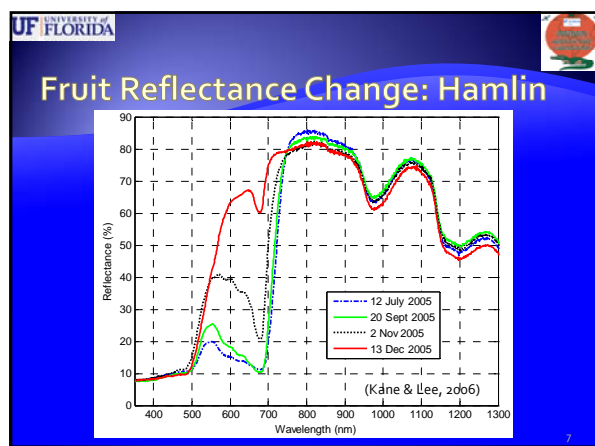
- The concentration of an absorber is directly proportional to the sample absorbance

Reflectance (%)

Wavelength (nm)

Legend for right graph:

- N1 (2.33%)
- N2 (2.63%)
- N3 (2.81%)
- N4 (2.97%)
- N5 (3.38%)



Spectral Data Analysis

- Stepwise multiple linear regression
- Principal component regression (PCR)
- Partial least squares (PLS) regression
- Hierarchical dimension reduction
- Kullback-Leibler divergence (KLD)
- ...

→ Develop prediction models (calibration)

VIS/NIR Spectroscopy

- A widely used tool for detecting soil and crop properties utilizing spectral signatures
- Advantages: non-destructive measurement and easy sample preparation
- Applications:
 - ✓ Crop properties (nutrients, water, disease)
 - ✓ Soil properties (organic carbon, moisture, mineral nitrogen, phosphates, pH, particle size)
 - ✓ Weed detection

NIRS APPLICATIONS

NIR Brix Sensing (Miller & Zude, 2002)

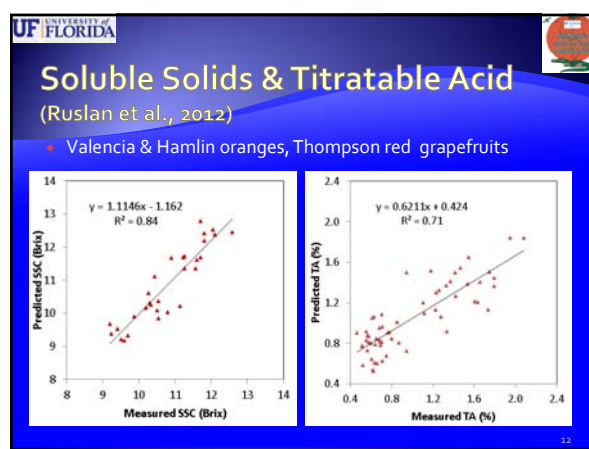
- White & red grapefruits from Florida, 'Honey' tangerines

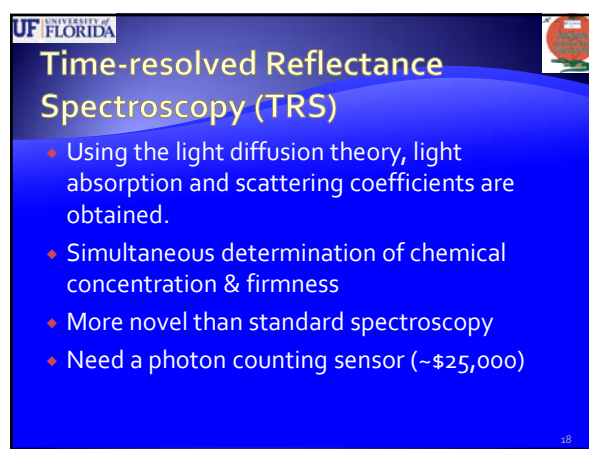
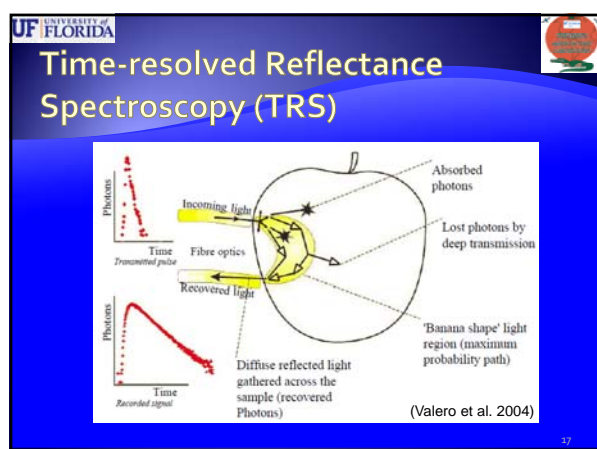
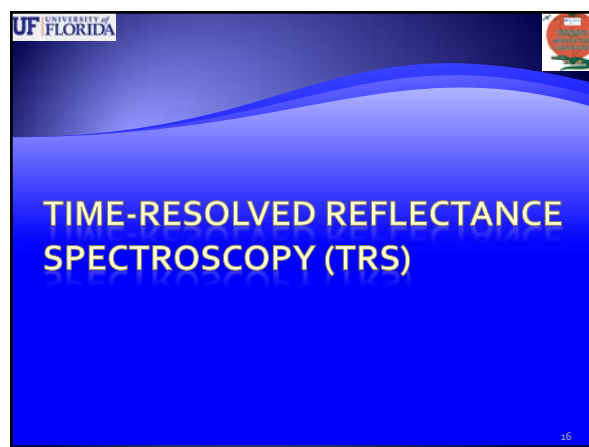
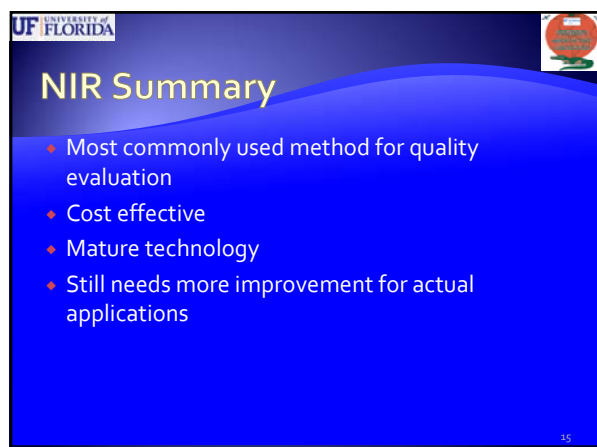
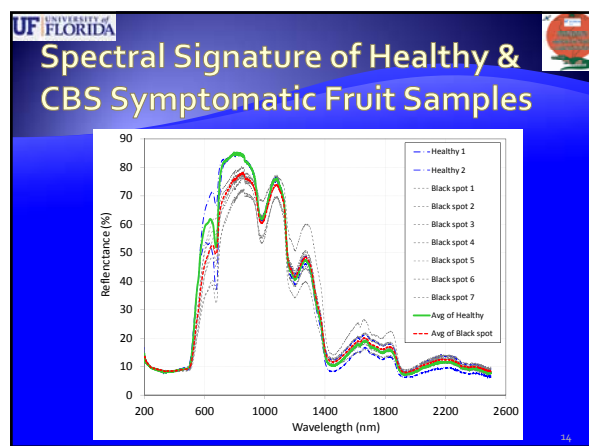
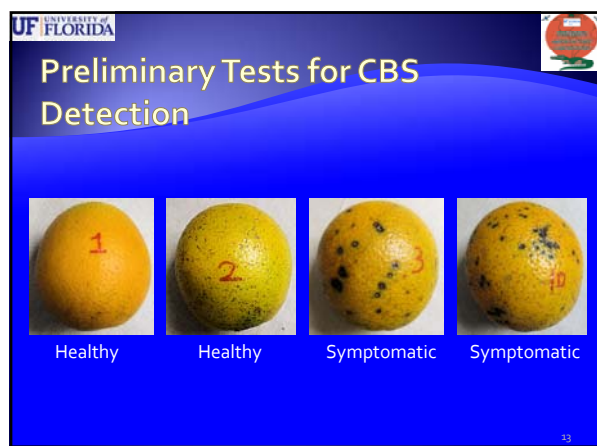
Table 1. Correct classification for grapefruit based on on-line NIR and laboratory Brix measurements

Test set	Breakpoint	% Correctly classified	% Accepted (true state = reject)	% Rejected (true state = acceptable)
#1 Interior white grapefruit, 5°C temp.	9 °Brix	62.1	17.2	20.7
#2 Interior white grapefruit, ambient temp.	9 °Brix	78.6	7.1	14.5
#3 Indian River grapefruit, size 40	10 °Brix	88.4	11.6	8.0
#4 Indian River grapefruit, size 32	10 °Brix	77.4	9.7	12.9
#5 4-NN	10 °Brix	88.3	6.9	4.8


Table 2. Correct classification for Honey tangerine based on hand-held NIR and laboratory Brix measurements. H-halogen light source, L-LED (4 white/2 red) LED light source.

Test set	Breakpoint	% Correctly classified		% Accepted (true state = reject)		% Rejected (true state = acceptable)	
		H	L	H	L	H	L
#1	14 °Brix	92	92	0	0	8	8
#2	14 °Brix	88	84	12	12	0	4
#1-NN	14 °Brix	100		0		0	
#2-NN	14 °Brix	92		8		0	





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Apple Quality Attributes

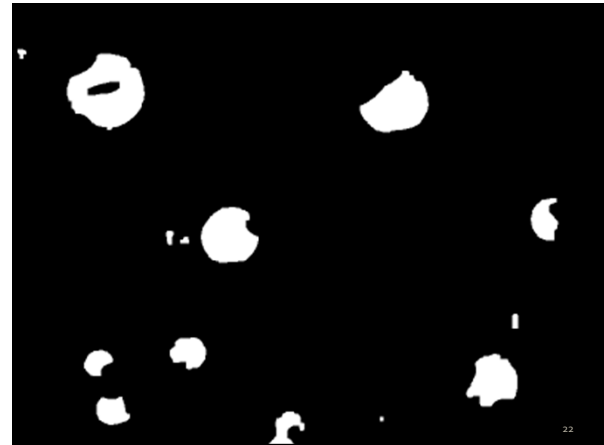
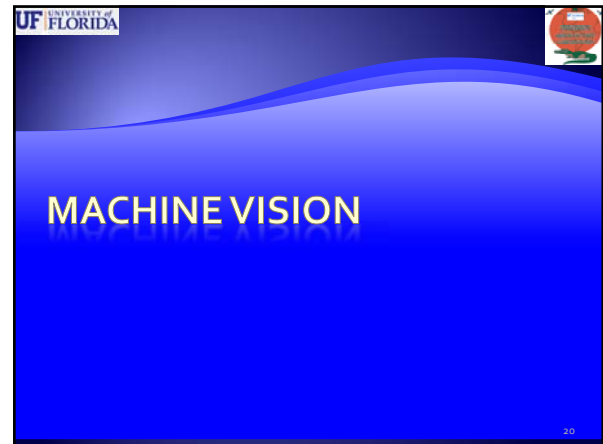
Table 6
Summary of three classification models according to fruit quality attributes for apple

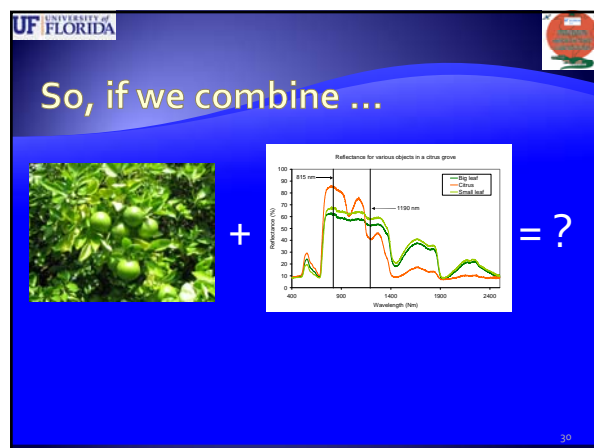
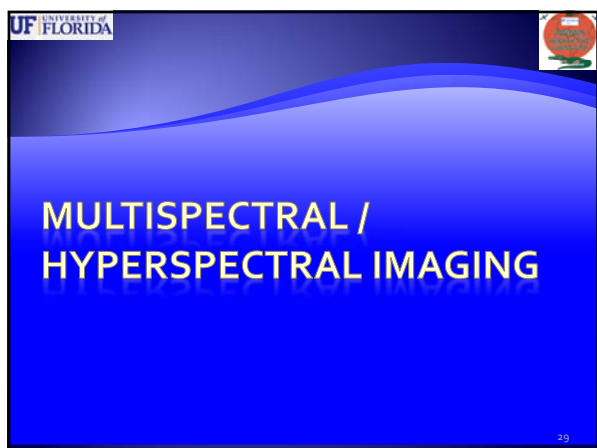
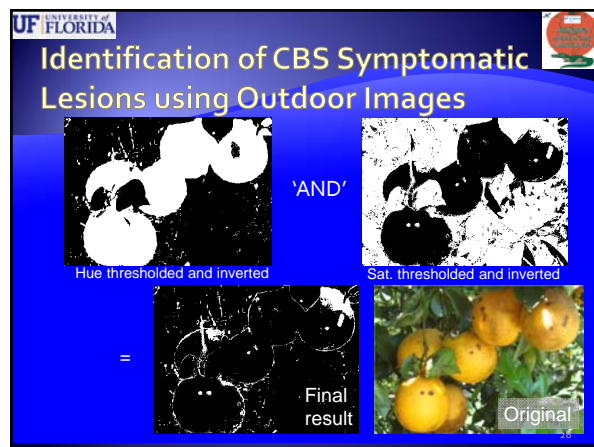
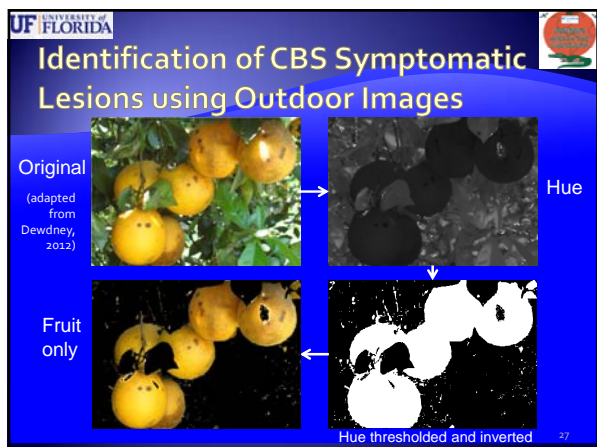
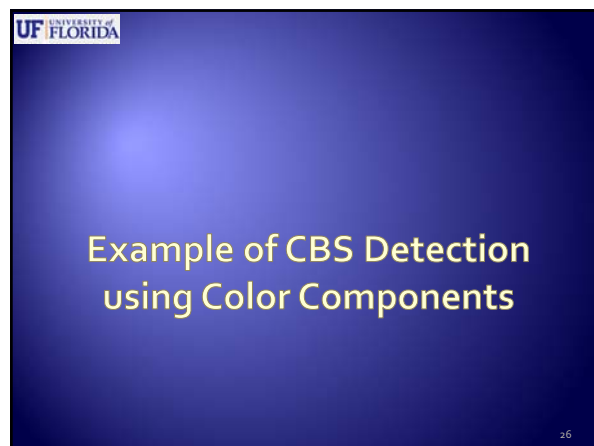
Fruit quality	Number of wavelengths in the model and spectrum	Cluster description (average \pm SD)			Performance, %		
		Cluster	Magness-Taylor force (F_{MT}), N	SSC (S), Brix	Total acidity (A), meq l^{-1}	Classification	Validation
Firmness	3 VIS	1	17.5 \pm 3.11			76	74
		2	29.1 \pm 3.65				
		3	41.2 \pm 4.46				
Sugar	5 NIR	1		11.5 \pm 1.0		77	71
		2		14.1 \pm 0.9			
		3		17.5 \pm 1.3			
Acidity	11 NIR	1			41.3 \pm 10.1	74	72
		2			70.3 \pm 10.2		
		3			114.3 \pm 14.8		

Each model estimates one attribute (firmness, as Magness-Taylor force; sugars as "Brix, or acids as meq l^{-1} ") independently, using absorption and scattering coefficients at several wavelengths; VIS, visible; NIR, near infrared; SSC, soluble sugar content; SD, standard deviation.

(Valero et al. 2004)


19





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Hypercube



(Source: <http://www.sciencedirect.com/science/article/pii/S0034425709000730>)

33

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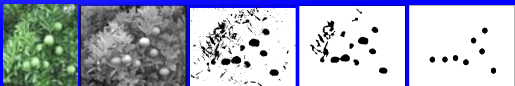
Applications

- Common applications – yield mapping, nutrient & disease detection, water stress, ...
- Immature green citrus fruit detection
- Citrus greening disease (HLB) detection
- Blueberry fruit detection

32

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Immature green citrus detection



RGB image Hyperspectral image Pixel segmented image Detected fruit Actual fruit locations

Okamoto, H., and W.S. Lee. 2009. Green citrus detection using hyperspectral imaging. *Computers and Electronics in Agriculture* 66(2): 201-208.

33

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Multispectral Imaging



(Source: R. Ehsani)

34

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Summary for Multi- & hyper-spectral Imaging

- Hyperspectral imaging combines images with spectral information.
- Multispectral imaging is more suitable for practical applications due to cost and processing time.

35

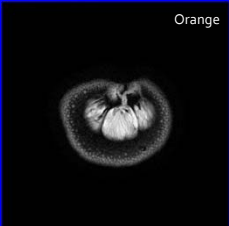
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MAGNETIC RESONANCE IMAGING (MRI)

36

Magnetic Resonance Imaging

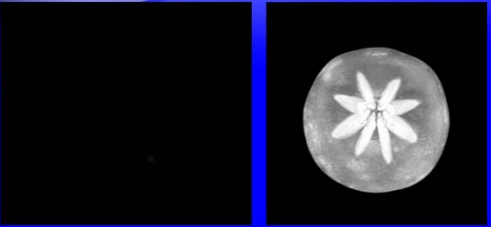
- How MRI works? (2.5 min.)
(<http://www.youtube.com/watch?v=pGzYvSG8ocY>)



Orange

(Source: <http://insideinsides.blogspot.com/2010/07/orange.html>)

Persimmon



(Source: <http://insideinsides.blogspot.com/2010/12/persimmon.html>)

More Facts on MRI

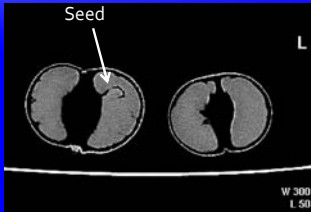
- Non-invasive & non-destructive method
- Not suitable for conveyor systems
- Takes long time for imaging
- Need much maintenance
- Safety
 - Strong magnetic field - avoid any metal objects!
 - Heating caused by radiowave absorption
- Cost
 - Conventional system: \$1 – 3 million
 - Portable unit (Prepolarized MRI): \$50,000 (<http://www.mri.stanford.edu/research.html#top>)

FLUOROSCOPY WITH X-RAY

Fluoroscopy

- X-ray imaging technique for acquiring real-time moving images
- Low energy is sufficient for agricultural crops
- Instrument: less than \$100,000

Mandarine Seed Detection using a Computed Tomography (CT) Image



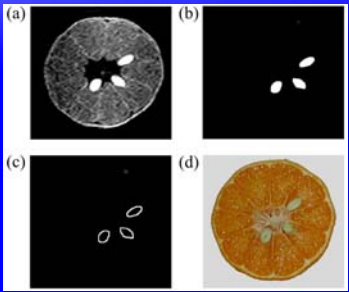
(Source: <http://spie.org/x84974.xml>, 2012)

W: 300
L: 50

"Not possible to discriminate between seeds and pulp consistently using CT or x-ray images because of their similar densities..."

Mandarine Seed Detection using MRI

- 0.2 T used
- Took 7 sec



(Source: <http://spie.org/x84974.xml>, 2012)

Overall Summary

- Many non-destructive sensing technologies are available
- Each has its own advantages and limitations
- NIRS, multispectral imaging, and X-ray have great potential and promising...

THANK YOU!