# **Smartphone-based Spectrometer**

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### **Professional Career Summary**



#### **Physics (Prof. Young Cheol Kim)**

Pusan National University

B.S., M.S. (1993.3~1997.2)/ (1997.3~1999.2)



#### **Physics (Prof. Peter C Eklund)**

The Pennsylvania State University

Ph.D (2000.8~2006.5)



#### Frontier Research Lab. / Imaging Device Lab.

Samsung Advanced Institute of Technology

Principal Researcher (2006.2~2024.2)

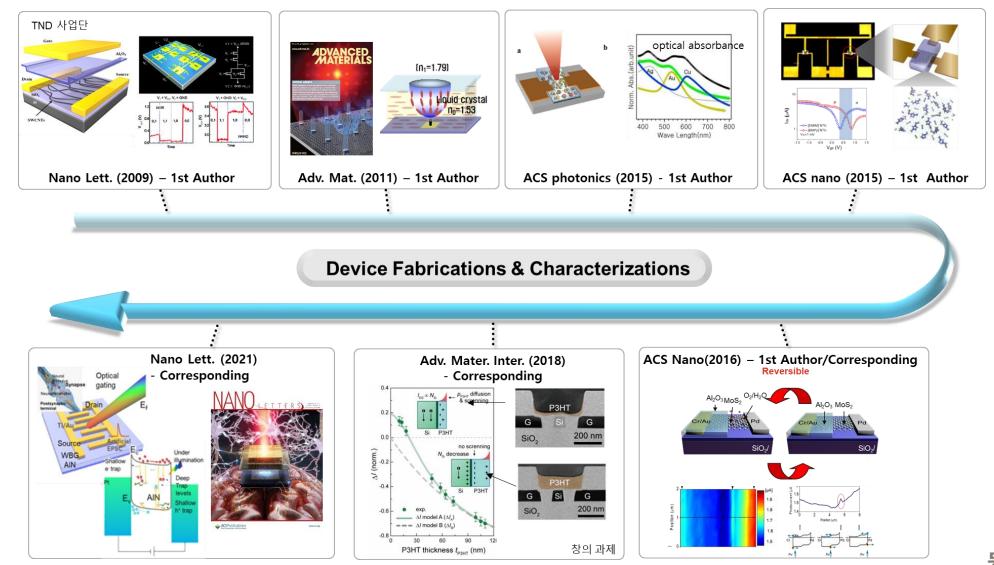


#### **Physics Department/ Assistant Professor**

Dongguk University

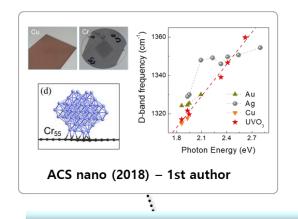
Assistant Professor (2024.4~)

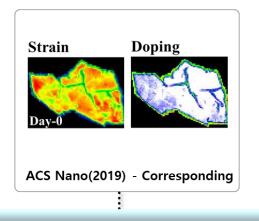
# Brief history of Research at SAIT (I)

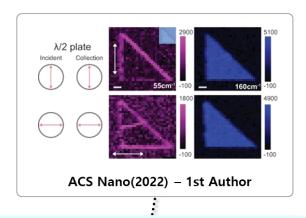




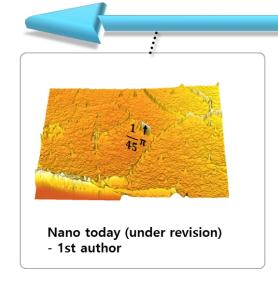
# Brief history of Research at SAIT(II)

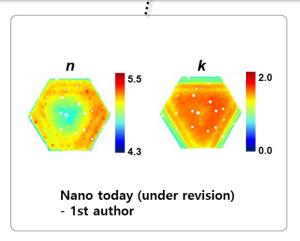


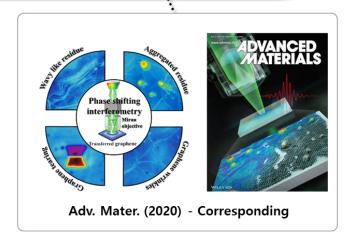




#### **Metrology & Inspection (MI)**









"Hyperspectral Phase Microscopy"

### **About SAIT**

Founded in 1987











' 2014 Moved to Suwon campus from Giheung campus







#### Global SAIT



#### HumanTech Paper Award



https://humantech.samsung.com/saitext/index.jsp



## **Contents**

- Introduction
  - History of Spectrometer
  - Spectroscopy
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- Smartphone Based Spectrometer
  - Motivation
  - Image sensor based spectrometer
  - Smartphone based Raman Spectrometer (Nature Comm. 2023)
  - (Nature Comm. 2023)
     Machine Vision with Hyperspectral Sensor for Food Inspection (to be submitted)
  - Polychromatic Vision for Smart Farming (to be submitted)
- Conclusion



# Introduction-Spectrum

Issac Newton: Founder of Spectroscopy



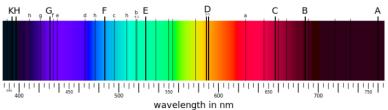
White light from the sun could be dispersed into a continuous series of colors using prism.



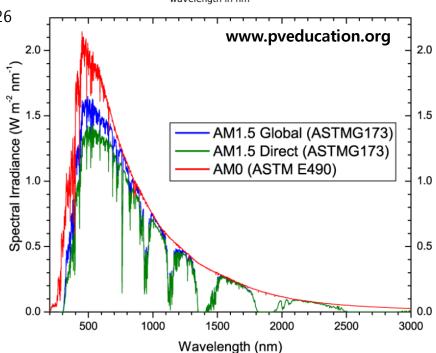
# **Spectrometer**



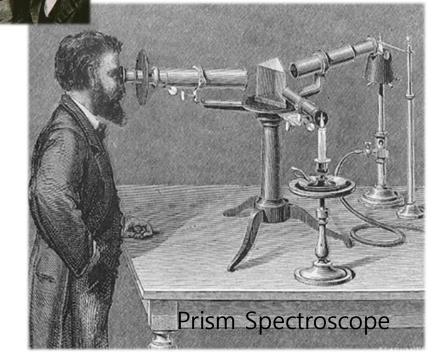
Solar spectrum: Fraunhofer line



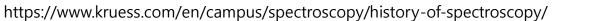
Fraunhofer: 1787-1826



Kirchhoff (1824-1887) and Bunsen (1811-1899)



Spectrometer has been a fundamental exploratory tool in chemistry, physics and astronomy.





# Introduction-Types of spectroscopy

#### based on many perspectives from Light-matter interaction

Acoustic resonance

Time-resolved

Photoemission

X-ray photoelectron

Circular Dichroism

Infrared spectroscopy

Raman spectroscopy

Absorption spectroscopy

Emission spectroscopy

Elastic scattering

Reflection spectroscopy

Impedance spectroscopy

Inelastic scattering

Coherent or resonance spectroscopy



# **Introduction-Optical spectrometer**

#### **Optical spectrometer**

shows the intensity of light as a function of wavelength or frequency

→ Basic tool to analyze remotely & non-destructively

#### **Goal of spectrometer**

: identifying materials, monitoring environment, calibration colors... etc..

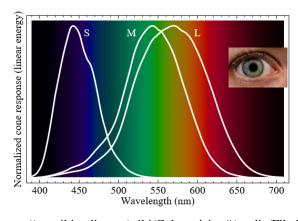




https://en.yna.co.kr/view/AEN20210311 010100315



https://www.innovationnewsnetwork.com/portable-measurement-device-food-quality/430/



https://en.wikipedia.org/wiki/Color\_vision#/media/File:Eyesensitivity.svg



# Introduction-Hyperspectral imaging

#### Image & spectrum can be measured simultaneously

Useful information beyond human sight, typical RGB imaging

: Food inspection, environment/health monitoring, and etc.

#### [Food Inspection]



#### [Skin Analysis/Diagnosis]



http://hyperstory.co.kr/

#### [Materials sorting]



https://www.novuslight.com/spectral-imaging-ready-for-on-field-and-industrial-applications\_N7527.html

# Introduction- Portable Spectrometer



handheld Raman spectrometer <a href="https://www.smithsdetection.com/products/ace-id/">https://www.smithsdetection.com/products/ace-id/</a>



VAYA – Agilent Handheld Raman Spectrometer https://overtech.com.sa/vaya-agilent/



Bruker handheld Raman Spectrometer <a href="https://www.bruker.com/">https://www.bruker.com/</a>



LinkSquare – Agilent Handheld Raman Spectrometer https://stratiotechnology.com/



89.1 mm x 63.3 mm x 34.4 mm

Miniature Leaf Spectrometer

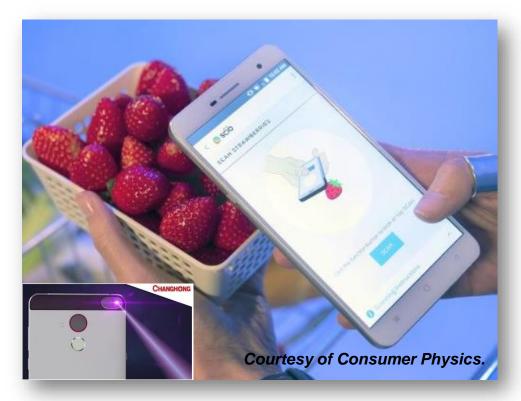
<a href="http://www.lightwindcorp.com/">http://www.lightwindcorp.com/</a>



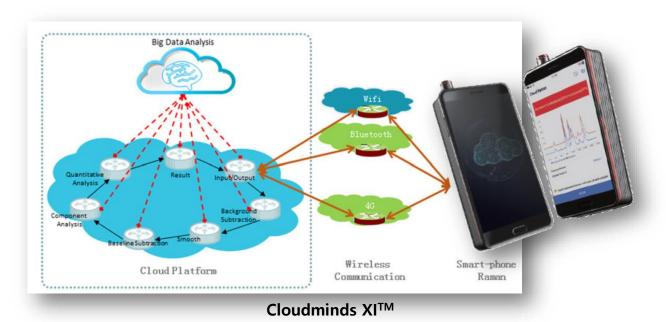
F-750 Produce Quality Meter http://www.lightwindcorp.com/



# **Smartphone Spectrometer**



'17 CES
Changhong, Analog Devices, and Consumer Physics



world's 1st cloud-based handheld Raman spectrometer

IEEE JOURNAL OF SELECTED TOPICS IN QUANTUM ELECTRONICS (2019)



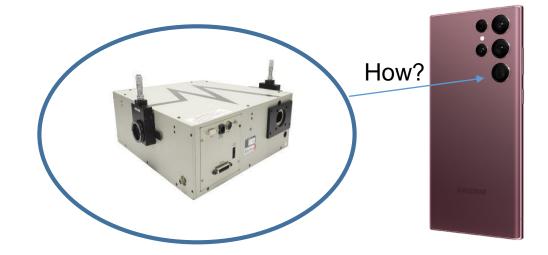
## **Motivation**

- Smartphone and CMOS Image Sensor : Samsung's Big Biz
- Smartphone user experiences require outstanding sensor platform
  - 1) Image Sensor is full array of photodetector
  - 2) Spectrometer is strong candidate to provide superior sensor platform for smartphone

Is there any way to utilize image sensors to spectrometer?







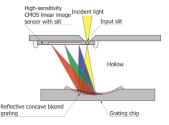


## **How Can We Make Spectrometer Compact?**

We should reduce its dimensions as small as possible → Miniaturization!

#### Diffraction of light from limited space

Diffraction by grating

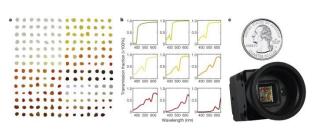


https://www.hamamatsu.com/jp/en/product/type/C12666MA/index.html

Still Large to embed smartphone

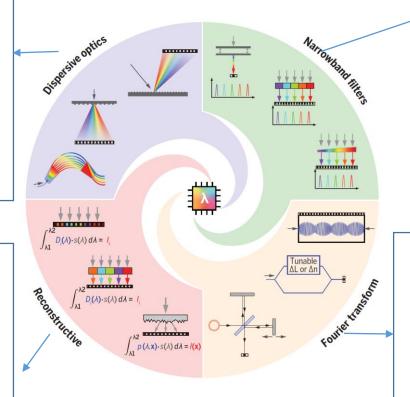
# Absorption to remove unwanted wavelengths of light

Absorption by QD



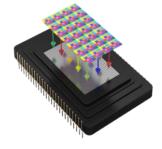
https://www.nature.com/articles/nature14576

Not CMOS-Compatible & heavy algorithm



J.Y, T A-O, W.C, T.H, Science, 371(6528), ebae0722 (2021)

### Our Approach



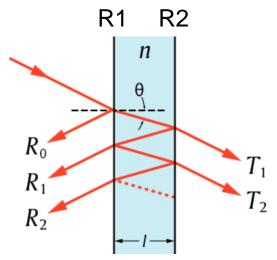
#### Variable light path- interference



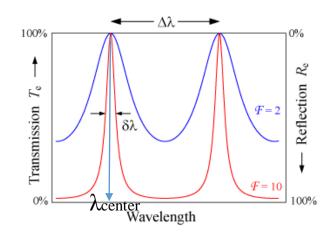
Moving, Varing component needed to control actively

## **Key Technology: Fabry-Perot Resonator**

- Interference of light : superposition of waves
  - controllability of light in a particular range of wavelengths
  - Constructive interference determines
- Fabry-Perot resonator (optical cavity with two parallel reflecting surfaces)
  - Optical bandpass filter with controlling  $Q(\delta\lambda)$  and  $\lambda$ center



https://en.wikipedia.org/wiki/Fabry%E2%80%93P%C3%A 9rot\_interferometer#/media/File:Fabry-Pérot\_etalon.svg



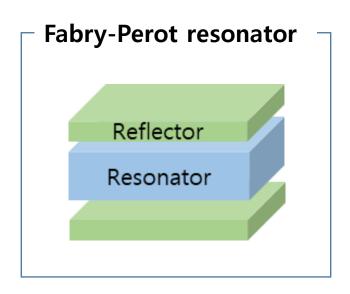
https://en.wikipedia.org/wiki/Fabry%E2%80%93P%C3%A9rot interferometer#/media/File:Etalon-2.png

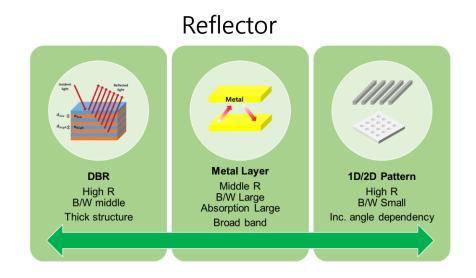
What determines  $\delta\lambda$  and  $\lambda$ ?

δλ	Reflectivity Cavity Loss	R1,R2
λ	Optical path length	n*L

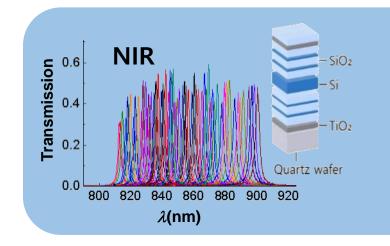


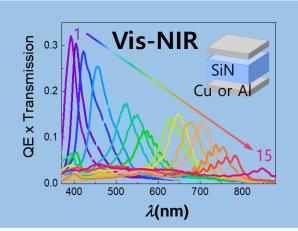
# **Device Design**

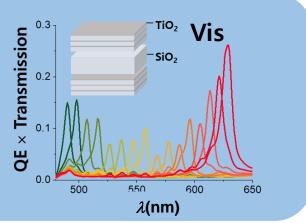




#### Resonator



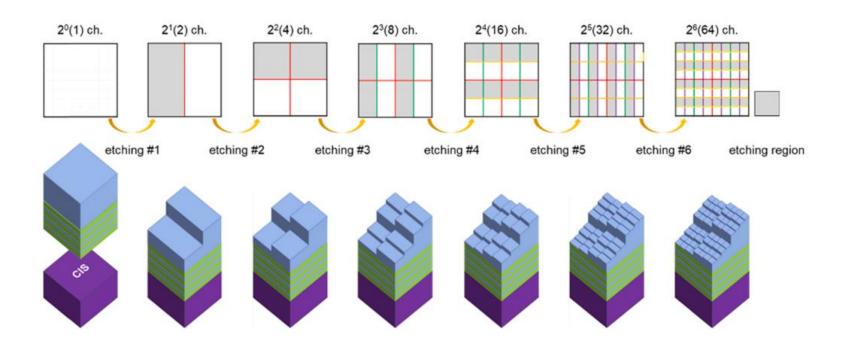






## **Device Fabrication**

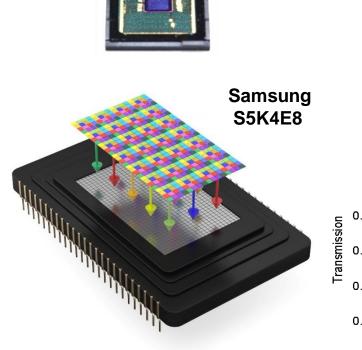
### Binary photo/Etching Repetition by 2<sup>N</sup>, N=integer





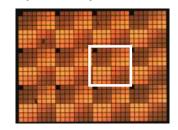
## From Device to Analysis

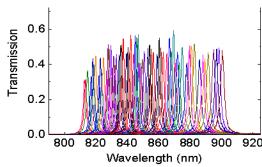
#### **Image Sensor + Nanophotonic Filter**



Low Spatial resolution
High Spectral resolution

40px X 40px : 64CH

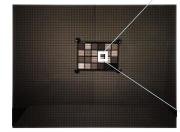


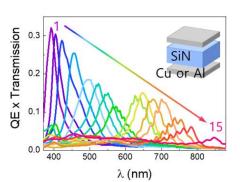


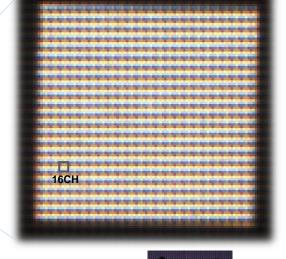
On-Chip spectrometer : Raman spectrometer

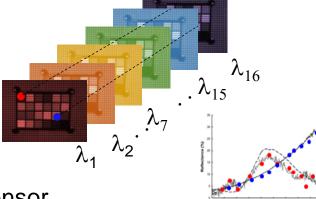
High Spatial resolution Low Spectral resolution

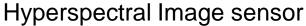
2px X 2px : 16CH













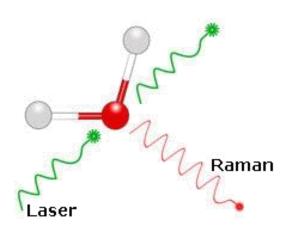
# **Smartphone based Raman Spectrometer**





# Raman Scattering and Fingerprint

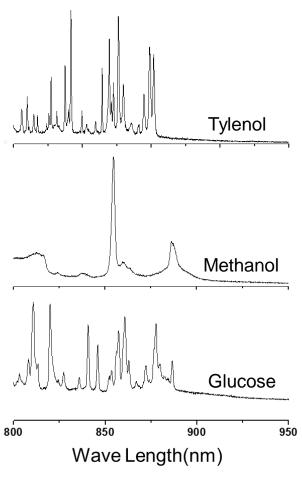




Sir Chandrasekhara Venkata Raman (1888–1970)

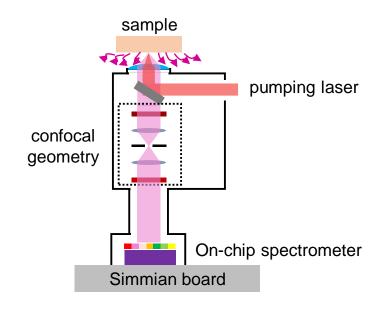
- Raman scattering
  - Discovered by C.V. Raman in 1928. (Nobel prize in 1930)
  - Inelastic scattering of photons by matter
    - Energy change of incident light,
    - ~ 10<sup>-5</sup> % of incident light
  - Involves with vibrational energy of molecules → Fingerprint of materials

#### **Raman Fingerprint**



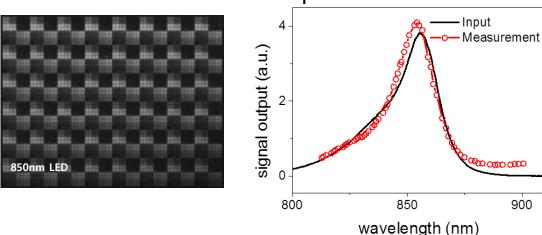


# Spectrum Measurement in Chip scale

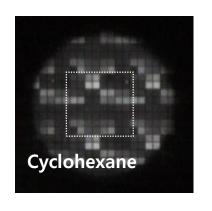


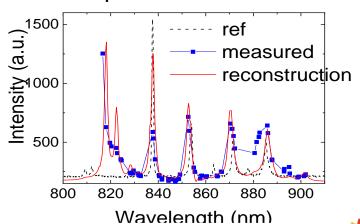


#### **Broad LED spectrum**



#### Narrow Raman Spectrum

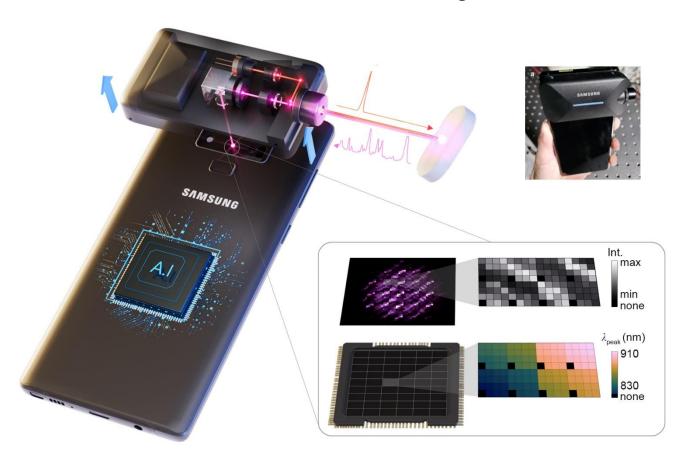


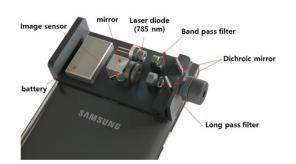


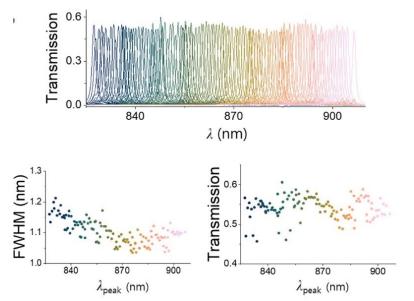
# Spectral information for Drug Classification

### Spectral information with deep learning

Raman and fluorescence signal detection with CMOS image sensor









# **Conventional Methods for Drug Identification**

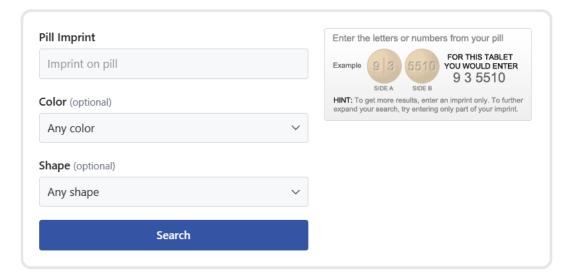
DrugID, ID My Pill, Pill Identifier, Pill Finder, and Drug Info

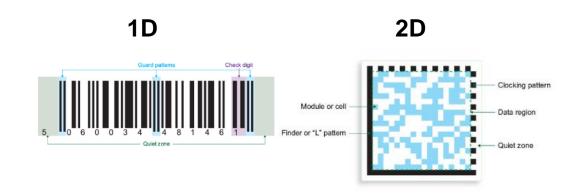
https://www.drugs.com/imprints.php

#### **Pill Identifier**

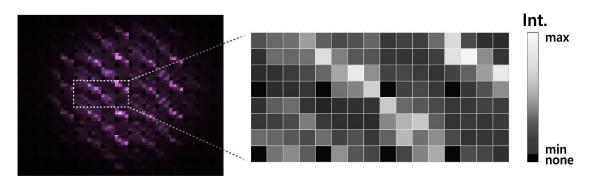
#### Search by imprint, shape or color

Use the pill finder to identify medications by visual appearance or medicine name. All fields are optional. **Tip:** Search for the **imprint first**, then refine by color and/or shape if you have too many results.





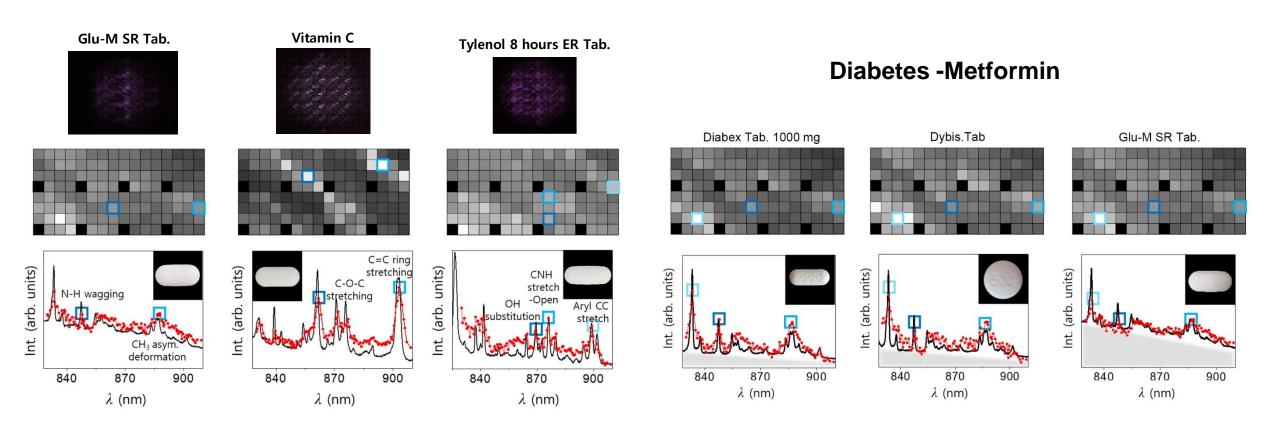
#### **This work: Spectral Barcode**





# Raman Fingerprint

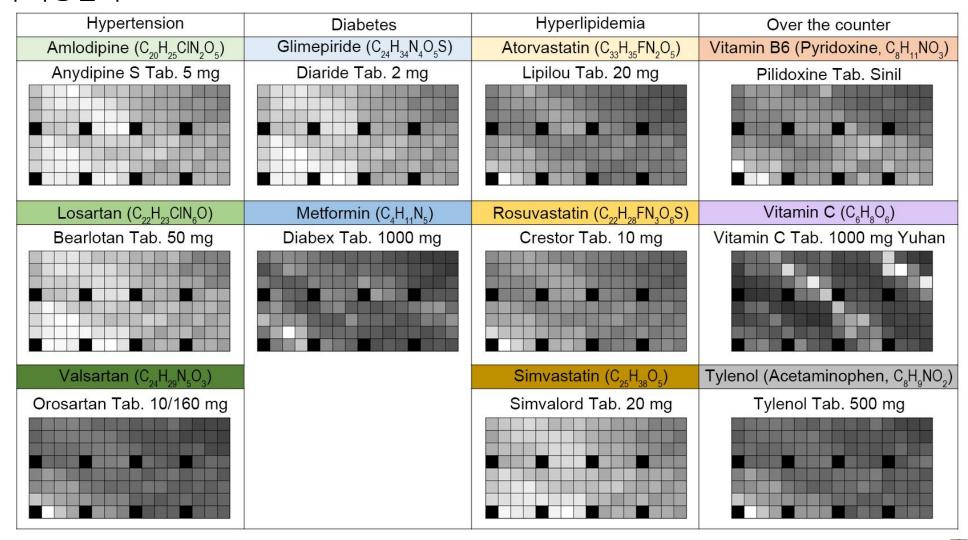






# **Spectral Barcode of Drugs**

눈으로 구분이 가능할까요?

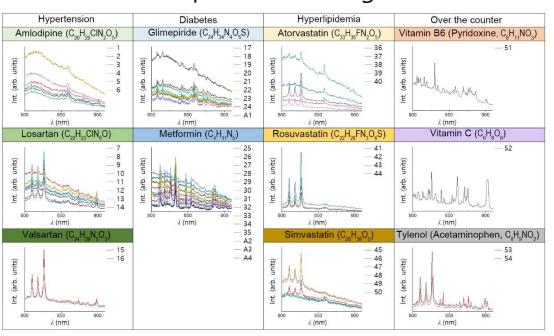


# **Major Component of Drugs**

3대 성인병: 고혈압, 당뇨, 고지혈증

		11 11 11	
Hypertension	Diabetes	Hyperlipidemia	Over the counter
Amlodipine (C <sub>20</sub> H <sub>25</sub> CIN <sub>2</sub> O <sub>5</sub> )	Glimepiride (C <sub>24</sub> H <sub>34</sub> N <sub>4</sub> O <sub>5</sub> S)	Atorvastatin (C <sub>33</sub> H <sub>35</sub> FN <sub>2</sub> O <sub>5</sub> )	Vitamin B6 (Pyridoxine, C <sub>8</sub> H <sub>11</sub> NO <sub>3</sub> )
O CI O NH2		OH OH OH	HO OH
Losartan (C <sub>22</sub> H <sub>23</sub> CIN <sub>6</sub> O)	Metformin (C <sub>4</sub> H <sub>11</sub> N <sub>5</sub> )	Rosuvastatin (C <sub>22</sub> H <sub>28</sub> FN <sub>3</sub> O <sub>6</sub> S)	Vitamin C (C <sub>6</sub> H <sub>8</sub> O <sub>6</sub> )
CI N HN-N	NH NH N	OH OH OH	HO HO OH
Valsartan (C <sub>24</sub> H <sub>29</sub> N <sub>5</sub> O <sub>3</sub> )		Simvastatin (C <sub>25</sub> H <sub>38</sub> O <sub>5</sub> )	Tylenol (Acetaminophen, C <sub>8</sub> H <sub>9</sub> NO <sub>2</sub> )
O OH HN-N		HO	HO

#### Raman Spectrum of Drugs



삼성 서울 병원 협업



## Data Base for Convolutional Neural Network

1		Anydipine S Tab. 5 mg <sup>1</sup>	36		Lipilou Tab. 20 mg <sup>1</sup>		
2		Lodien Tab. 5 mg <sup>2</sup>	37		Lipinon Tab. 20 mg <sup>5</sup>		
3	A colo distan	Myungmoon Amlodipine Tab. 5 mg <sup>3</sup>	38	Atorvastatin	Lipitor Tab. 10 mg <sup>4</sup>		
4	Amlodipine	Norvase Tab. 5mg <sup>4</sup>	39		Lipitor Tab. 40 mg <sup>4</sup>		
5		Orodipine Tab. <sup>5</sup>	40		Lipito-M SR Tab. 20/500 mg <sup>18</sup>		
6		Unasc Tab. 5 mg <sup>6</sup>	41		Crestor Tab. 10 mg <sup>19</sup>		
7		Bearlotan Plus Pro Tab. <sup>7</sup>	42	Rosuvastatin	Crestor Tab. 20 mg <sup>19</sup>		
8		Bearlotan Tab. 50 mg <sup>7</sup>	43	Kosuvastaun	Daewoong Rosuvastatin Tab. 20 mg <sup>20</sup>		
9		Corzartan Plus Pro Tab. <sup>5</sup>	44		Rosulord Tab. 20 mg <sup>1</sup>		
10	Losartan	Cozaar Plus Tab. <sup>8</sup>	45		Sinwalord Tab. 20 mg <sup>1</sup>		
11	Losaran	Cozaar Tab. 50 mg <sup>8</sup>	46		Simvast Tab. 20 mg <sup>10</sup>		
12		Cozartan Plus Tab. <sup>8</sup>	47	Simvastatin	Vytorin Tab. 10/10 <sup>8</sup>		
13		Rosaninplus Tab.3	48	SHIW distanti	Vytorin Tab. 10/40 <sup>8</sup>		
14		Sarlotan Tab. 50 mg <sup>1</sup>	49		Zocor Tab. 20 mg <sup>8</sup>		
15	Valsartan	Orosartan_10_160 mg <sup>5</sup>	50		Zocor Tab. 40 mg <sup>8</sup>		
16	T A STATE OF THE S	Varosartan Tab. 80 mg <sup>5</sup>	51	Vitamin B6	Plidoxine Tab. Sinil (Vitamin B6) <sup>21</sup>		
17		Diaride Tab. 2 mg <sup>9</sup>	52	Vitamin C	Vitamin C Tab. 1000 mg Yuhan <sup>22</sup>		
18		Diaride Tab. 4 mg <sup>9</sup>	53	Acetaminophen	Tylenol Tab. 500 mg <sup>23</sup>		
19		Glimel Tab. 1 mg <sup>5</sup>	54	, teetariikopikir	Tylenol 8 hours ER Tab.24		
20	Glimepiride	Glimel Tab. 2 mg <sup>5</sup>	A1	Glimepiride	Glimel Tab. 3 mg <sup>5</sup>		
21	Campanic	Glimepid Tab. 1 mg <sup>10</sup>	A2		Dymit XR Tab. <sup>25</sup>		
22		Glimepid Tab. 4 mg <sup>10</sup>	<b>A3</b>	Metformin	Glucophage Tab. 1000 mg <sup>14</sup>		
23		Neomaryl Tab. 1 mg <sup>1</sup>	A4		Metfol Tab, 500 mg <sup>26</sup>		
24		Neomaryl Tab. 2 mg <sup>1</sup>		<sup>1</sup> Chong Kun Dang Pharmaceutical Corp. <sup>21</sup> Sinil Ph <sup>2</sup> Han Lim Pharm. <sup>22</sup> Yuhan			
25		Diabex Tab. 1000 mg <sup>7</sup>	3 N	Myung Moon	<sup>23</sup> Johnson		
26		Diabex Tab. 250 mg <sup>7</sup>		4 Viatris Korea 24 Janssen 25 Donga ST 25 Kyung 6 Korea United Pharm. 26 II Dong 7 Daewoong Bio 8 Organon Korea Ltd. 8 Kwang-dong Pharm.			
27		Diabex XR Tab. <sup>7</sup>					
28		Dybis Tab. 11	8 0				
29		Galvusmet Tab 50/500 mg <sup>12</sup>	10	10 Hanmi Pharm.			
30	Metformin	Glucodown Tab. 13		Shin Poong Pha Novartis Korea	rm.		
31		Glucophage XR Tab. 1000 mg <sup>14</sup>		<ul> <li>Hanall Biophrma</li> <li>Merck Ltd.</li> <li>Samik Pharmaceutical</li> <li>Young Poong Pharmaceutical</li> <li>Dalim BioTech</li> <li>Jeil Pharm.</li> <li>AstraZeneca Korea Corporation</li> </ul>			
32		Gh⊦M SR Tab. 15	15				
33		Glumefomin Tab. 500 mg <sup>16</sup>	17				
34		Glupa-Combi Tab. 500/80 mg <sup>17</sup>					
		Metophage XR Tab. 500 mg <sup>5</sup>					

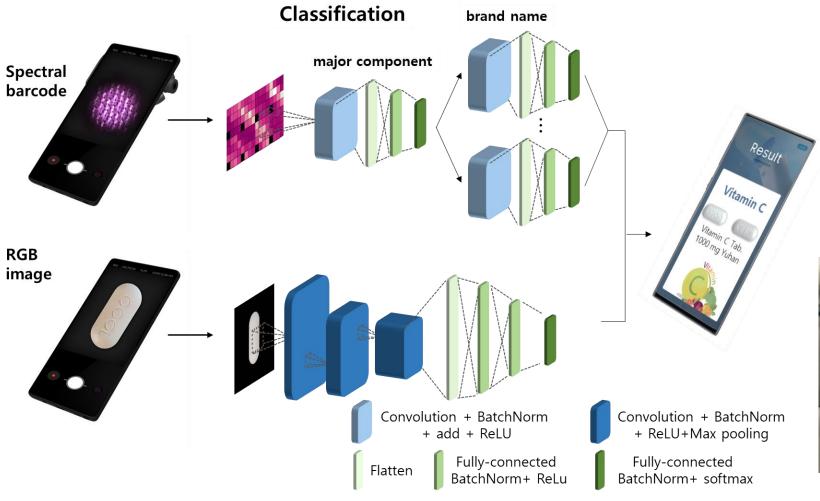
# Untrained drugs!! Not in the Database

A1	Glimepiride	Glimel Tab. 3 mg <sup>5</sup>	<b>60 60</b>
A2		Dymit XR Tab. <sup>25</sup>	
А3	Metformin	Glucophage Tab. 1000 mg <sup>14</sup>	
A4		Metfol Tab. 500 mg <sup>26</sup>	00



# **CNN** training for Drug Classification

### Classification with Convolutional Neural Network (CNN)

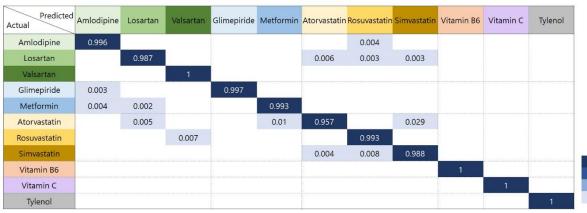






## **Confusion matrix**

#### by Major Component



~ 99% accuracy for the same component

#### **CNN for Spectral Barcode:**

Major component : ~99%

Unknown four drugs: 99.8%

(only one failure out of several hundreds trials.)

0.25

Brand name: 79.5%

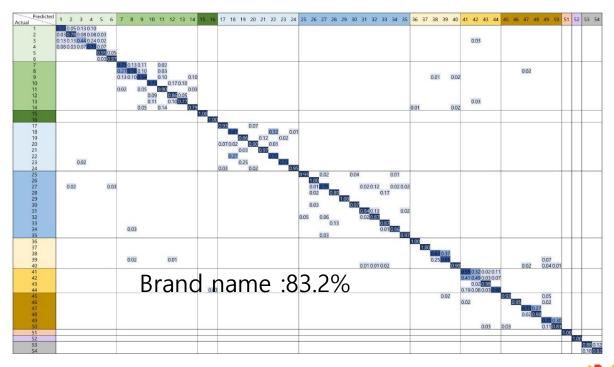
**CNN for RGB image:** 

Shape and Color: 95.7%

**Combination of two CNNs:** 

Brand name:83.2%

#### by Brand Name

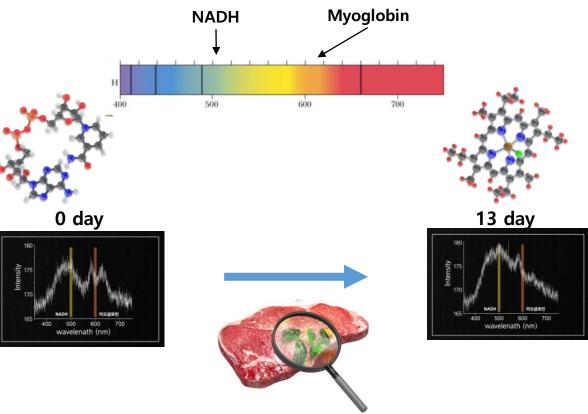




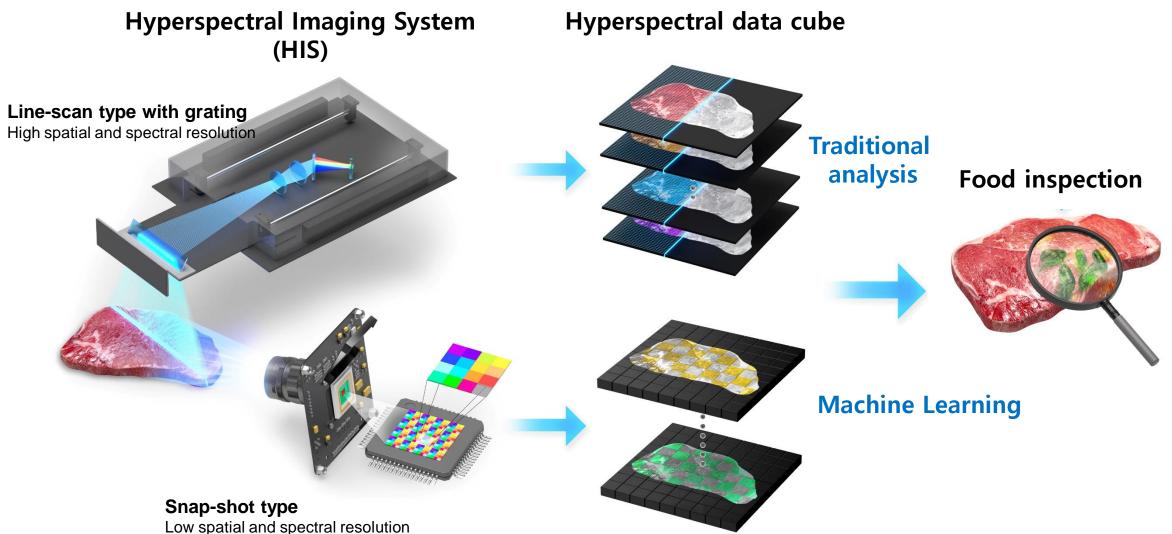
## Hyperspectral Image Sensor for Machine Vision



# Finger prints for Meat freshness in its fluorescence excited by 365nm LED







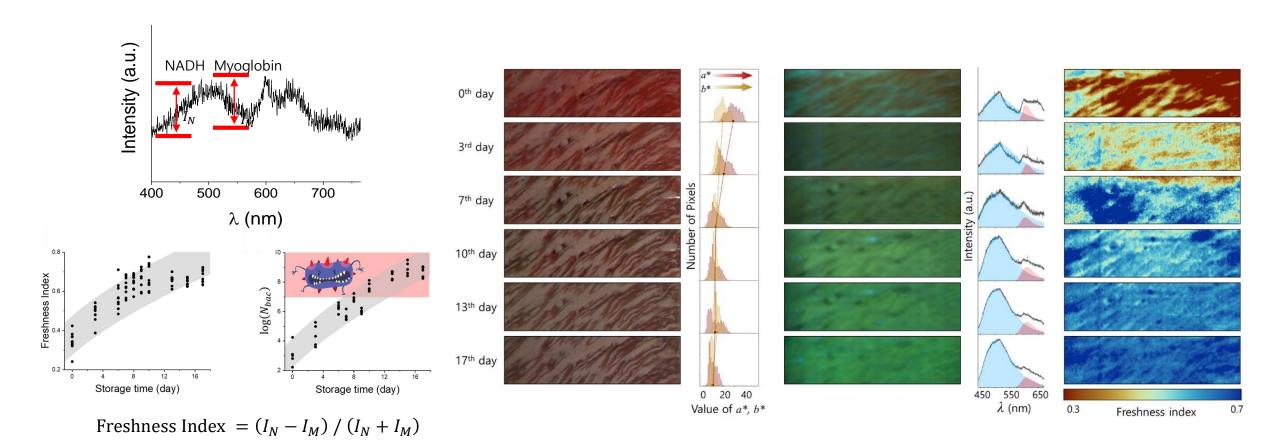
Low data size



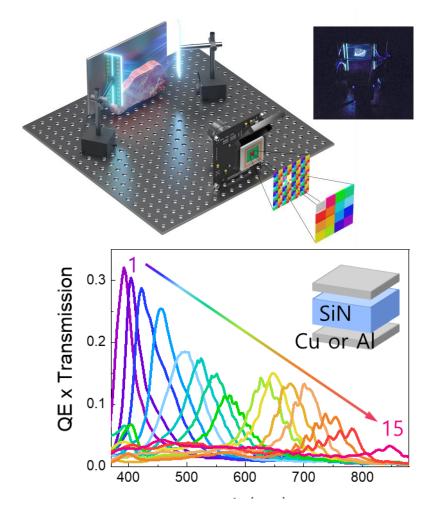
### line scan type HIS + traditional analysis

Freshness of beef: evaluated by data from spectral images

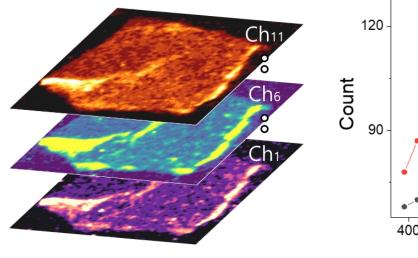
→ NADH and Myoglobin fluorescent peak determines freshness.

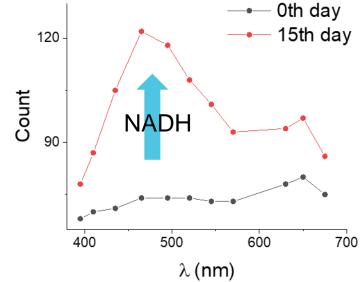


### **Snap shot type HIS with Machine learning**

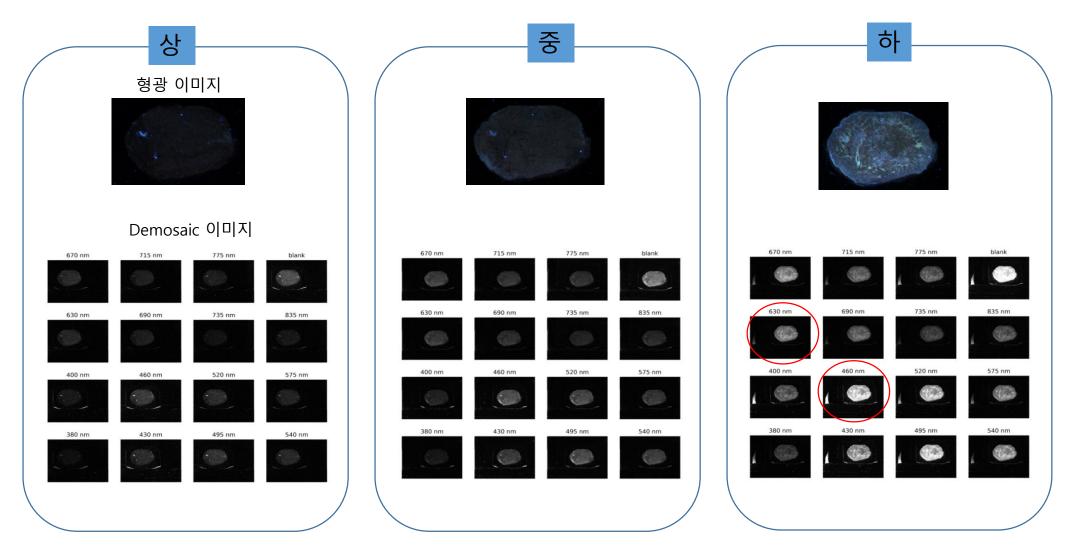


Filter arrays integrated on image sensor Samsung's 4E8 image sensor



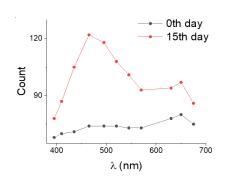


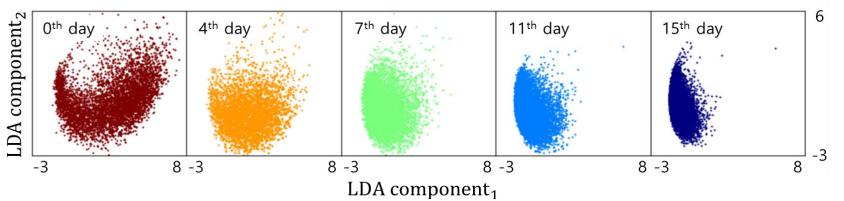




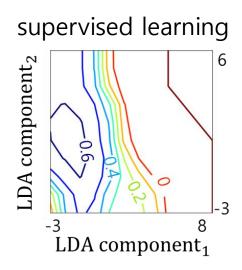


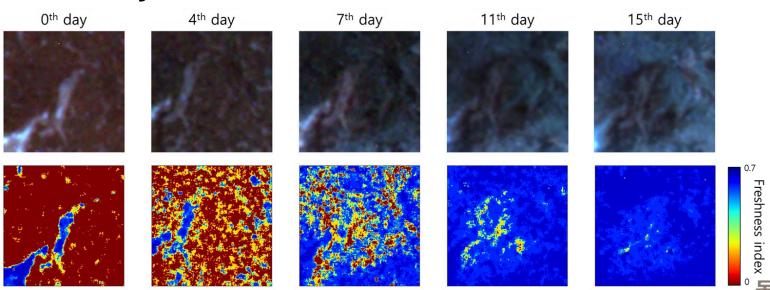
### **Dimensionality reduction**





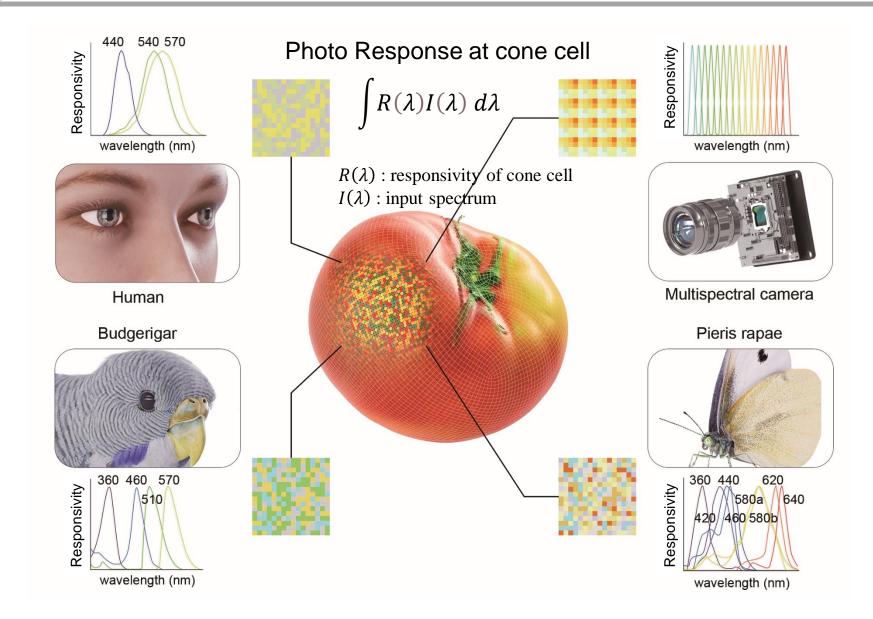
### **Generating decision boundary**





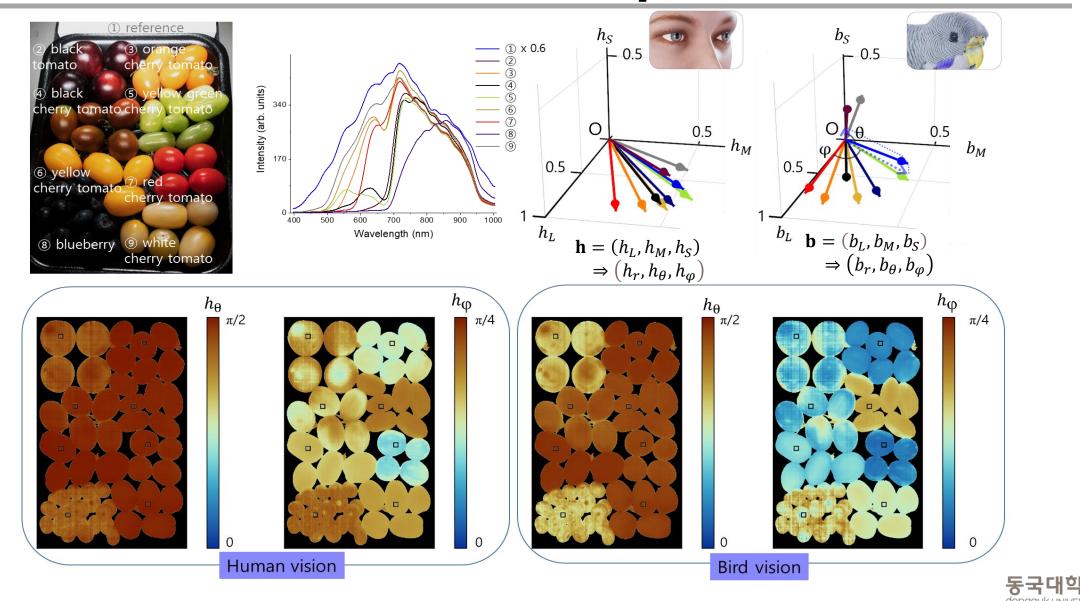


# Polychromatic Vision for Smart Farming

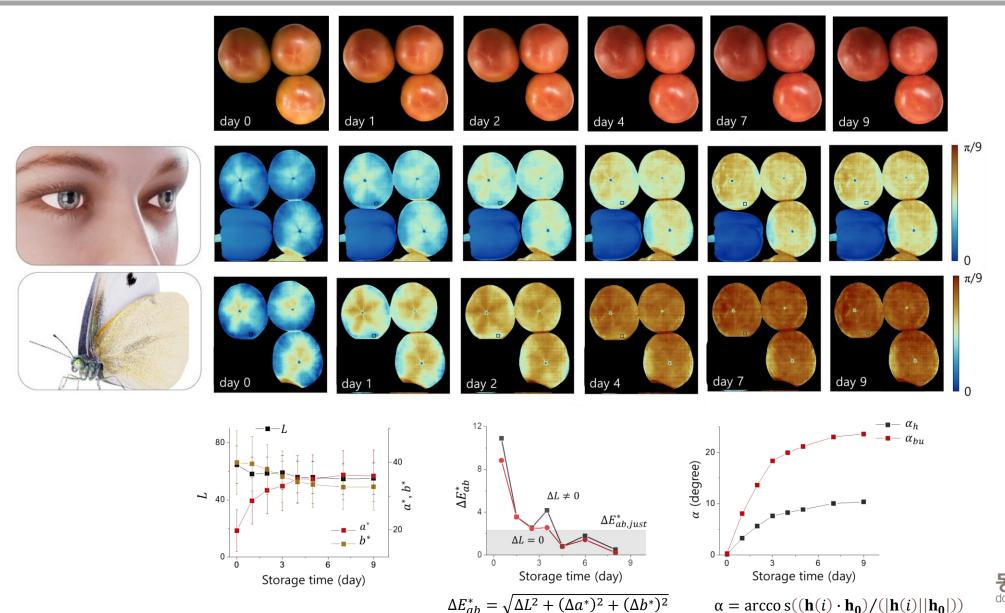




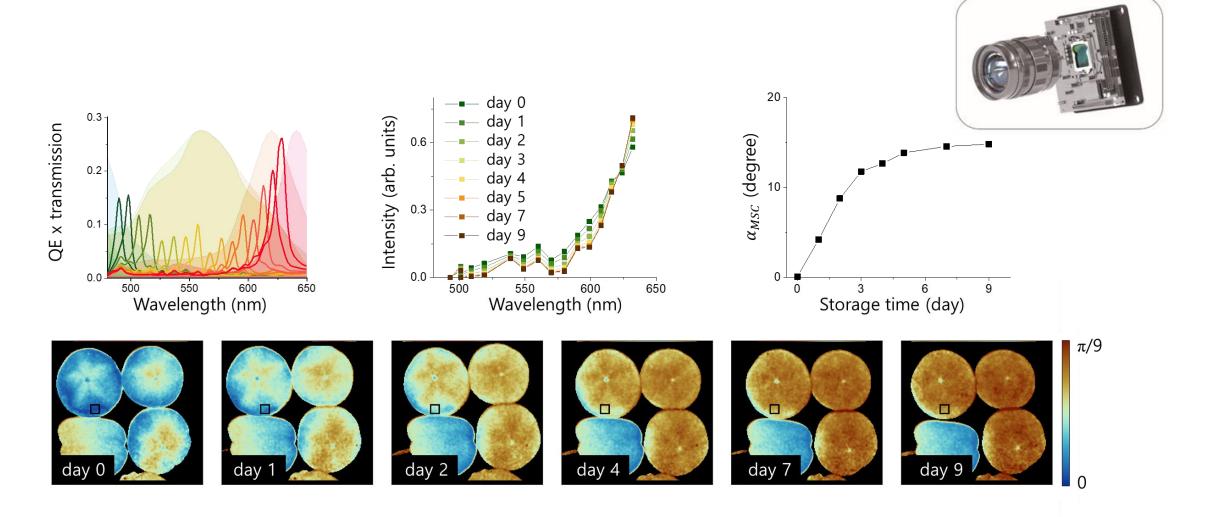
# **Color Discrimination Sharpness**



# Post-Maturity Detection by Butterfly Vision

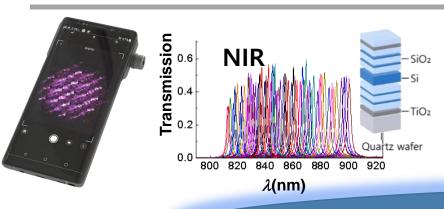


# Poly Chromatic Vision for Post-Maturity





## **Summaries**



#### **Drug Classification**

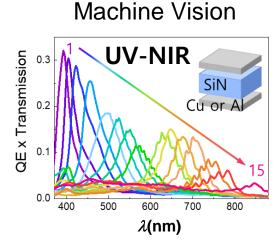
- NIR
- Low Spatial resolution
- High Spectral resolution

Raman spectrometer (785nm)

Raman Spectrometer

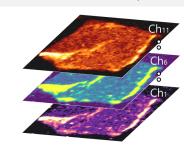
Fluorescence

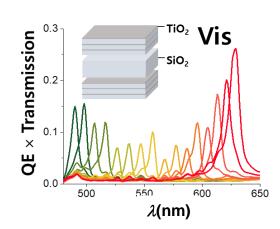
Reflectance



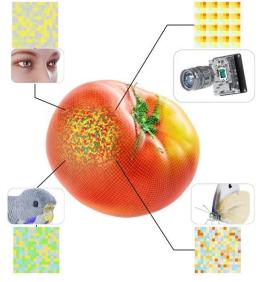
- · UV-NIR
- High Spatial resolution
- Low Spectral resolution

Hyperspectral image sensor : Fluorescence (365nm)





#### **Smart Farming**



- UV-NIR
- High Spatial resolution
- High Spectral resolution

Hyperspectral image sensor : Reflectance (ambient light)

