On the Development of Predictive Models of Light Interaction with Organic and Inorganic Materials

Lecture Series

Gladimir V. G. Baranoski Natural Phenomena Simulation Group School of Computer Science University of Waterloo, Canada

National Institute of Informatics - Tokyo - 2012

# **Schedule of Lectures**

- Predictability: Benefits and Costs
- □ Data Collection: Finding the Pieces of Jigsaw Puzzles
- □ Model Design: Balancing Reality and Abstraction
- □ Evaluation: The Key for Assessing "Real" Contributions
- □ Interdisciplinary Applications: Technical and Political Barriers



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## Data Collection: Finding the Pieces of Jigsaw Puzzles

Lecture 2

Gladimir V. G. Baranoski Natural Phenomena Simulation Group School of Computer Science University of Waterloo, Canada

National Institute of Informatics - Tokyo - 2012

# Outline

## What data?

Biophysical Data Constraints

□ Characterization Data Constraints

Evaluation Data Constraints

Getting Our Own Data

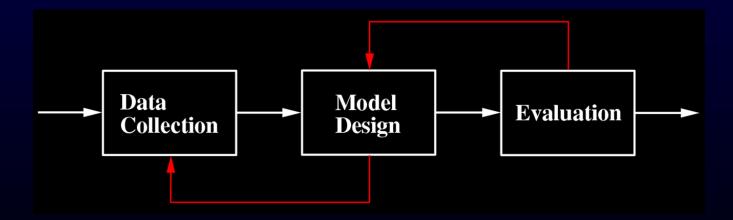


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# What data?

> What are the main steps leading to predictive models?

- The crossing of field boundaries
- The use of scientifically sound development frameworks





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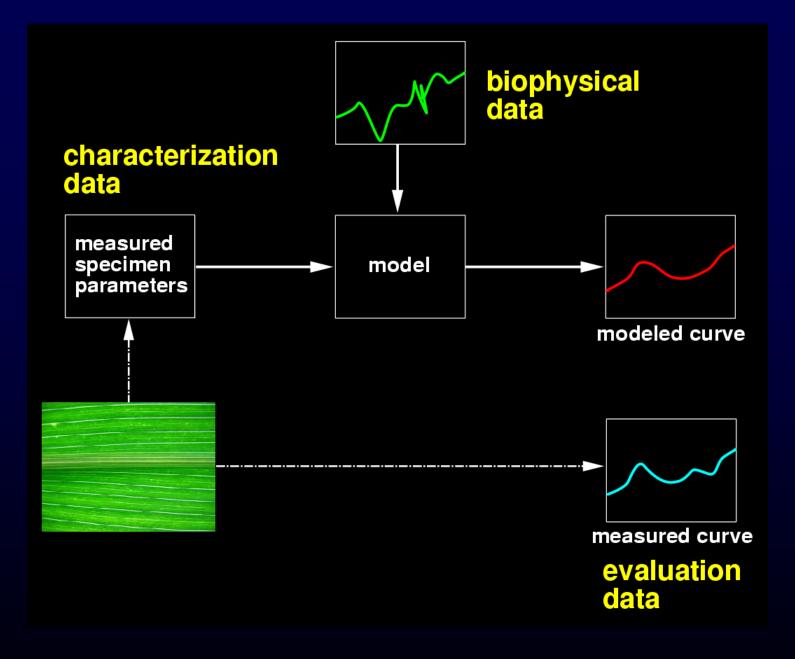
"Good science requires both theory and data – one is of little use without the other." G. Ward (1992)

In our case, what data?

- Biophysical data
  - Refractive indices, absorption coefficients, etc ....
- Characterization data
  - Thickness, concentration of pigments, etc ...
- Evaluation data
  - Reflectance, transmittance, etc ...

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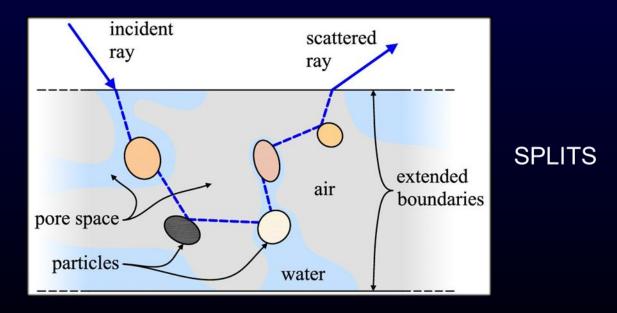


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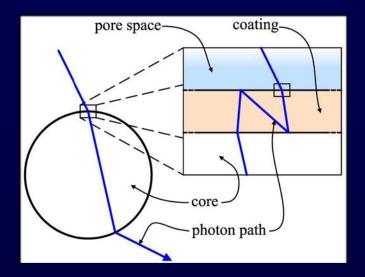
# **Biophysical Data Constraints**

## Scarcity

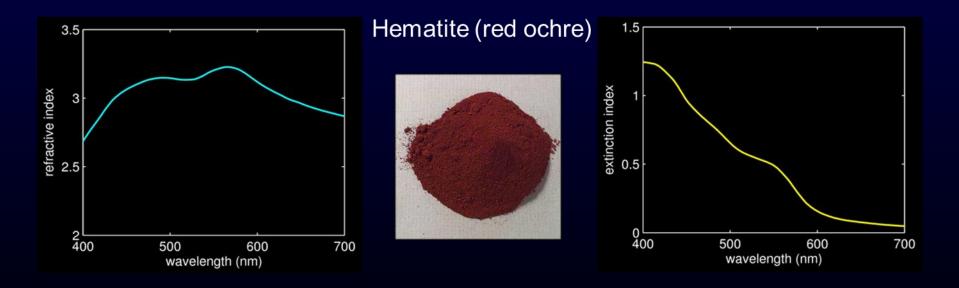
- Spectral refractive indices (real and complex)
  - Example: simulation of light interactions with sand



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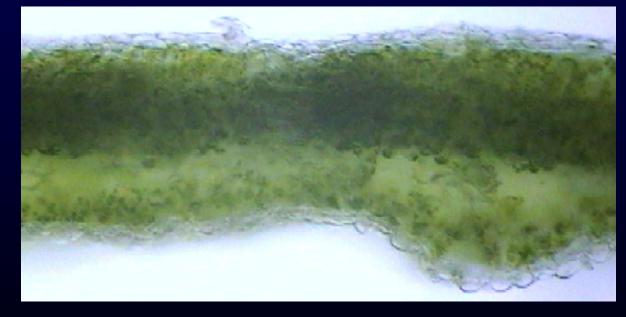


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Often, only average single values are available in the literature

#### ✤ for example, mesophyll of soy leaves = 1.42



#### Leaf Cross-Section





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 Although Gladstone and Dale law can be used to obtain spectral indices, it also suffers from data unavailability issues

$$\eta(\lambda) = c_s \eta_s(\lambda) + (1 - c_s) \eta_b(\lambda)$$

where:

- $c_s =$ volume fraction of scatterers,
- $\eta_s$  = refractive index of the scattering material,
- $\eta_b$  = refractive index of the base material.

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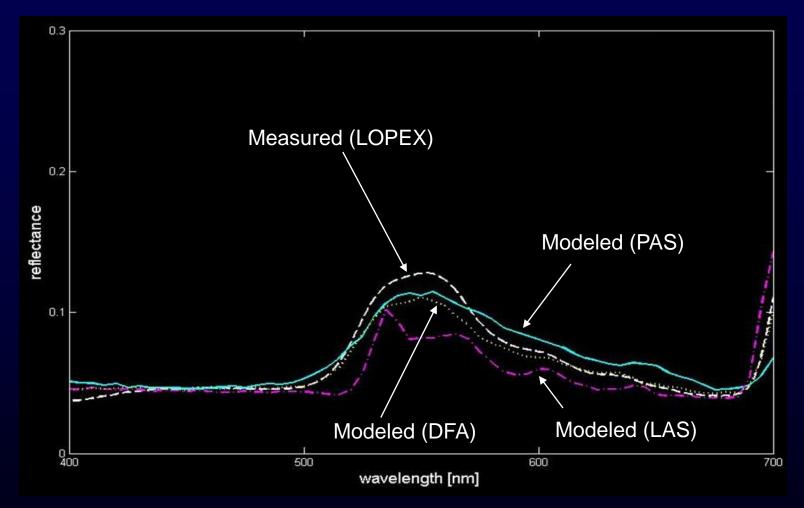
- Specific absorption coefficients
  - Example: "the chlorophyll case"





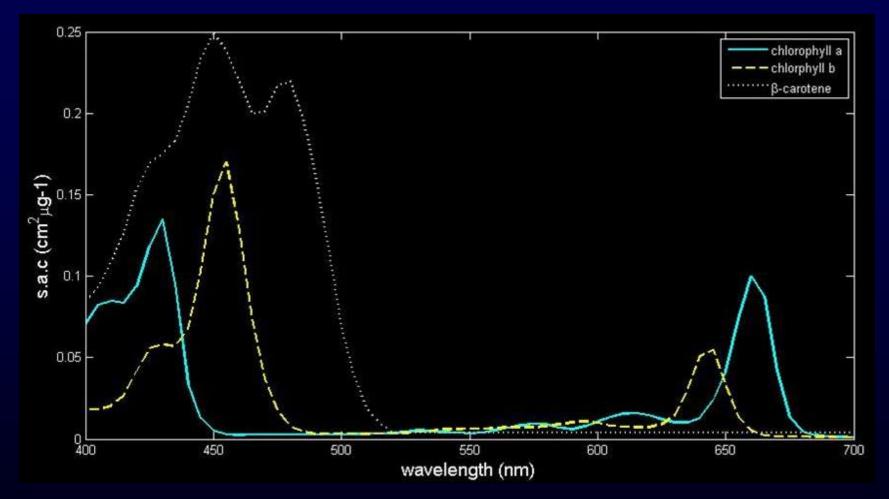
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### Measured and Modeled (ABM-B) Reflectance Curves of a Soy Leaf



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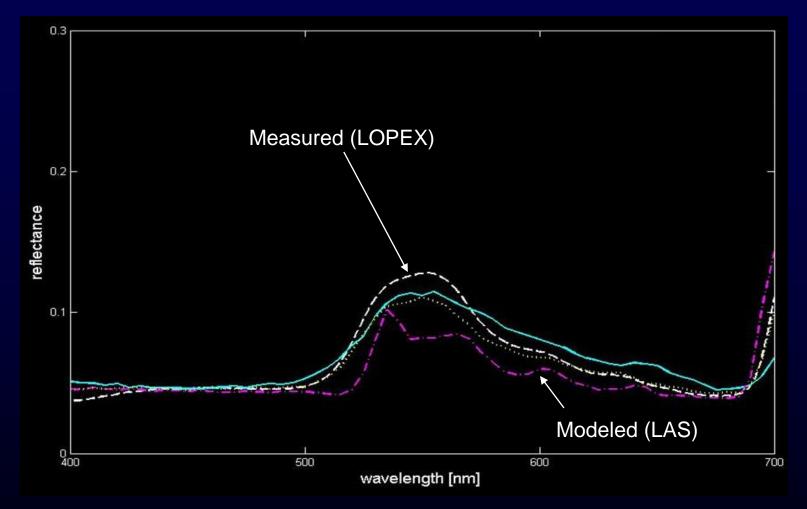
### Light Absorption Spectroscopy (LAS)



Light Absorption Spectra (Zscheile and Comar, Botanical Gazette 1941, Zscheile *et al.*, Plant Physiology 1942)

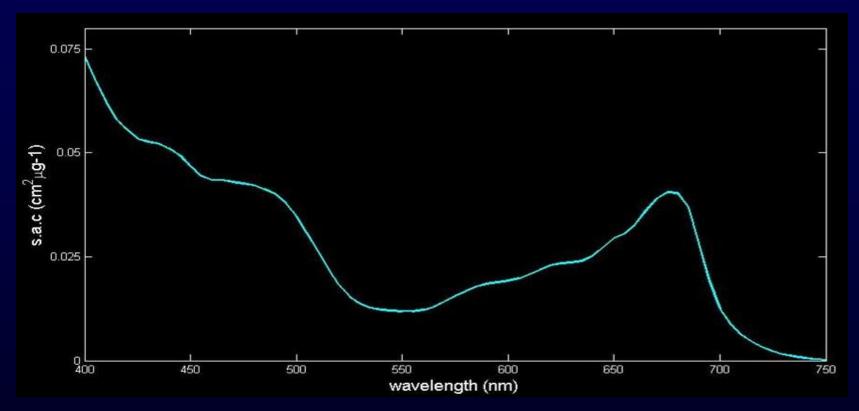
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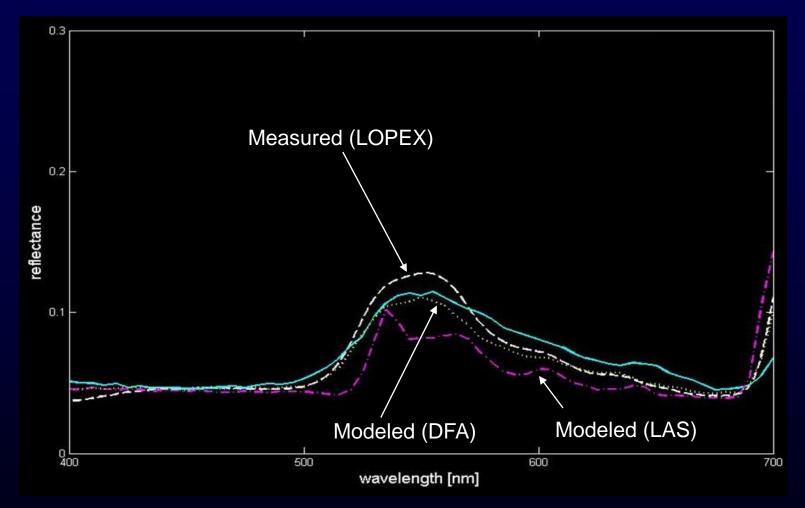
### Data Fitting Approach (DFA)



DFA Absorption Spectra for chlorophyll *a+b* (Jacquemoud *et al.*, Remote Sensing of Environment 1996)

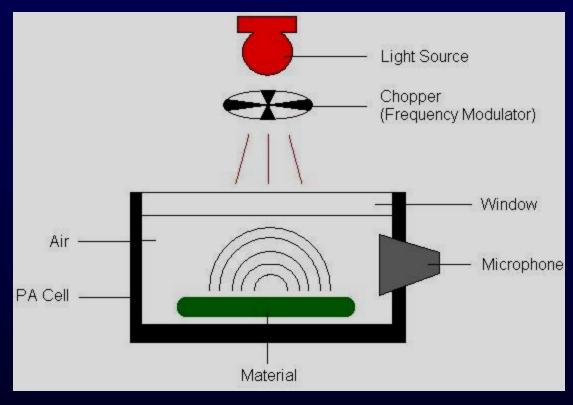
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### Measured and Modeled (ABM-B) Reflectance Curves of a Soy Leaf



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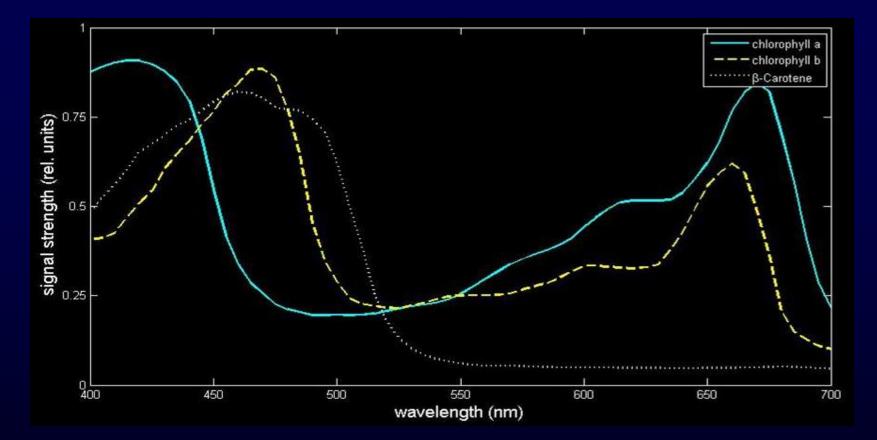
#### Photoacoustic Absorption Spectroscopy (PAS)



**Photoacoustic Spectrometer** 



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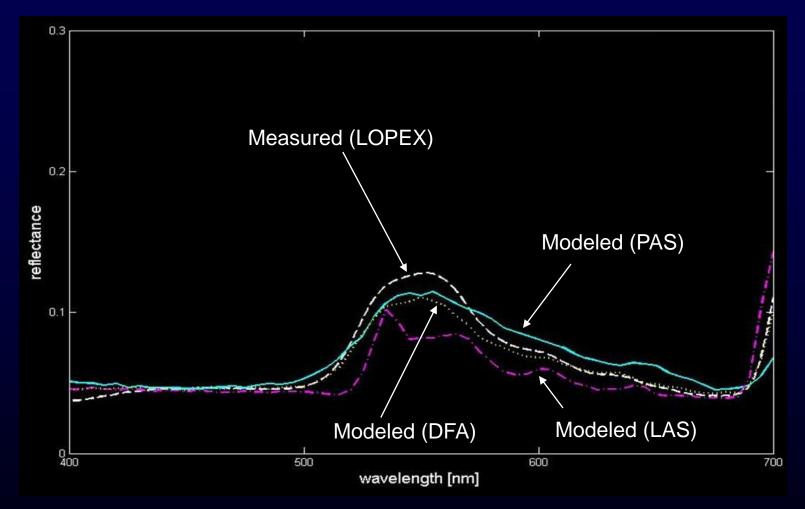


Photoacoustic Absorption Spectra (Nagel *et al.*, *Biological Role of Plant Lipids* 1989)



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#### Measured and Modeled (ABM-B) Reflectance Curves of a Soy Leaf



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### ✤ Remark: same issues apply to the carotenoids ...





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### ✤ ... and are worse for tannins and anthocyanins





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## > Reliability issues: in vivo vs. in vitro



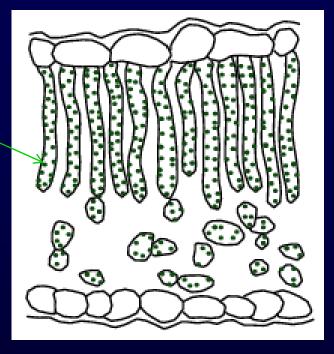
*In vivo* pigments

*In vitro* pigments

\$ \$

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#### Cross-Section of a Plant Leaf



#### **Chlorophyll Solution**



- Sieve and detour effects
- Spectral shifts

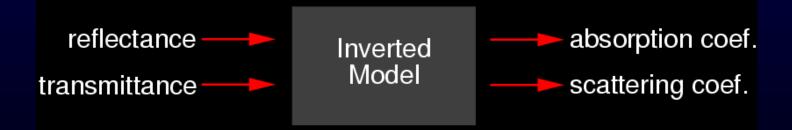


chloroplast

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- Biophysical data derived from inversion procedures
  - Inversion procedure: a way to derive biochemical and optical properties from *in situ* and non-invasive measurements

 "Inversion" implies a reversal of the usual process of calculating reflection and transmission



### Was the model fully evaluated?

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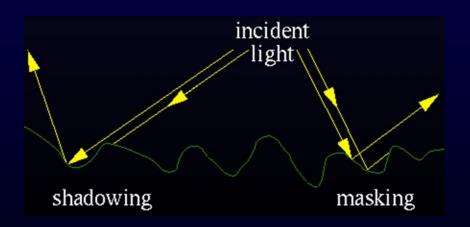
# **Characterization Data Constraints**

## Scarcity

Structural parameters affecting light and matter interactions

#### Skin Surface







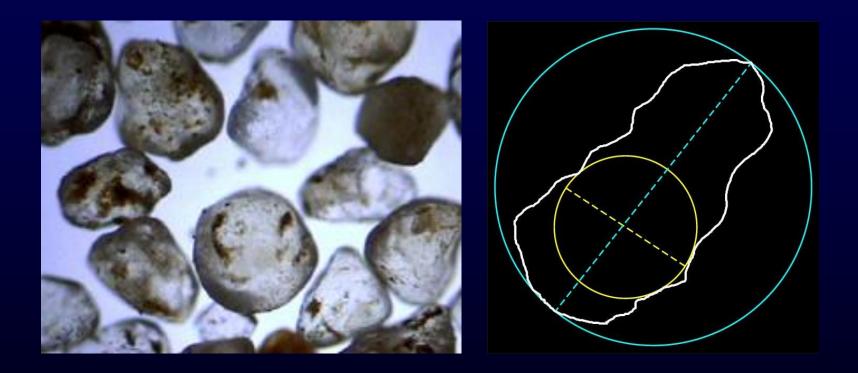
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### venation systems and hairs



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### sand grains (dimensions, shape and roundness)

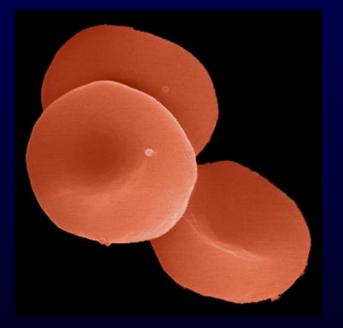




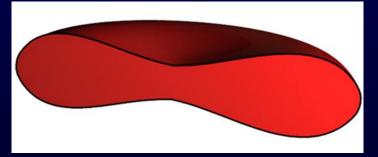
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red blood cells (volume and contour)

RBCs (SEM)



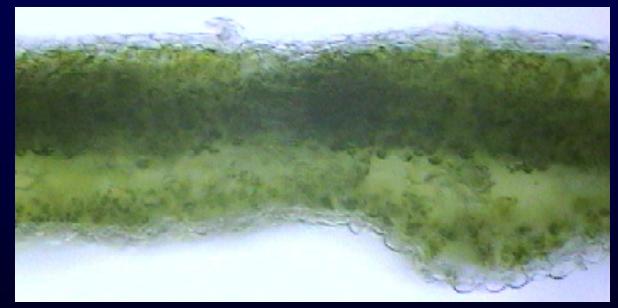
#### **RBC Cross-Section (sketch)**



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#### tissue thickness

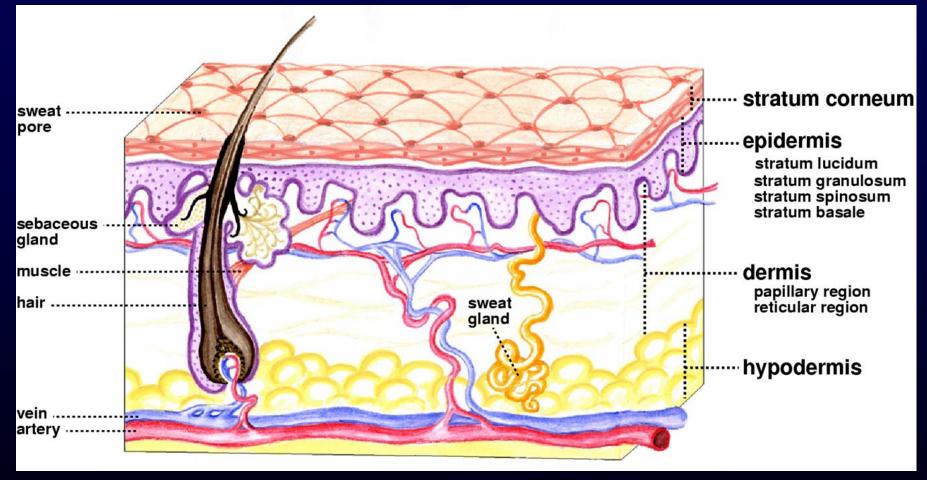
#### Leaf Cross-Section





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#### Human Skin Diagram



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- Pigment contents
  - Example: in human skin, light absorption comes mostly from a natural pigment, melanin, found in organelles (melanosomes) inside cells (melanocytes) located in the epidermis





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 Melanin is produced by the melanocytes through a photobiological process: melanogenesis

 The amount of melanin produced is determined by both genetic factors and exposure to sunlight (UV)

- Melanin absorption level depends on the number of melanosomes per unit volume
  - *e.g.*, 1.3% for lightly pigmented specimens



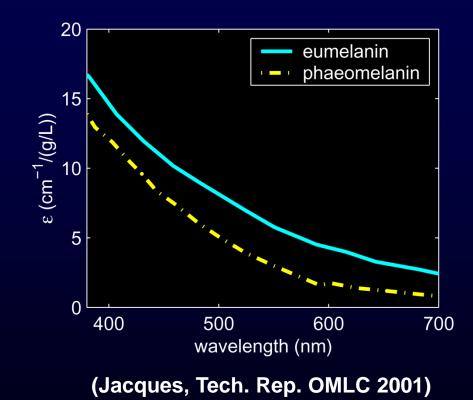
 e.g., 43% for darkly pigmented specimens



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### Types of melanin present in the epidermis

- red/yellow phaeomelanin
- brown/back eumelanin



β-carotene is also present in the epidermis

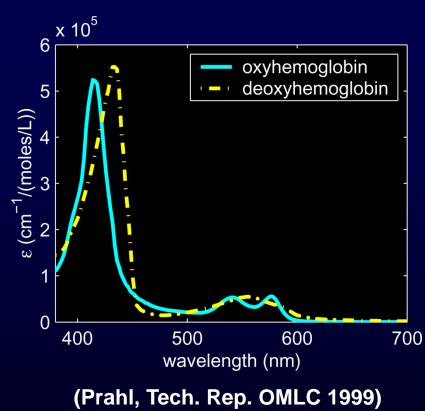
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- The dermis layer can be divided into two main layers:
  - the papillary dermis (smaller blood vessels)
  - the reticular dermis (larger blood vessels)

- Absorption comes from blood borne pigments:
  - $\clubsuit$  hemoglobin, bilirubin and β-carotene



 The two types of hemoglobin (oxygenated and deoxygenated) give blood its reddish color



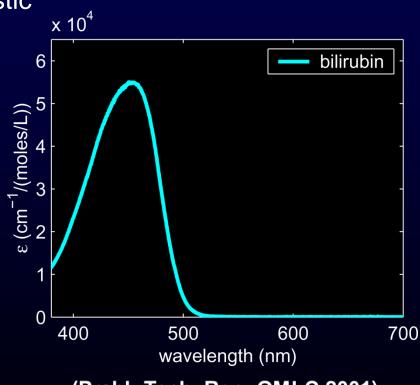


 Volume fraction of blood in the dermal tissues can vary roughly in the range 0.2-7% range

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- Bilirubin
  - An orange-yellow pigment derived from the degradation of hemoglobin during the normal and abnormal destruction of red blood cells
  - excessive amounts in the characteristic jaundice (yellowish) appearance

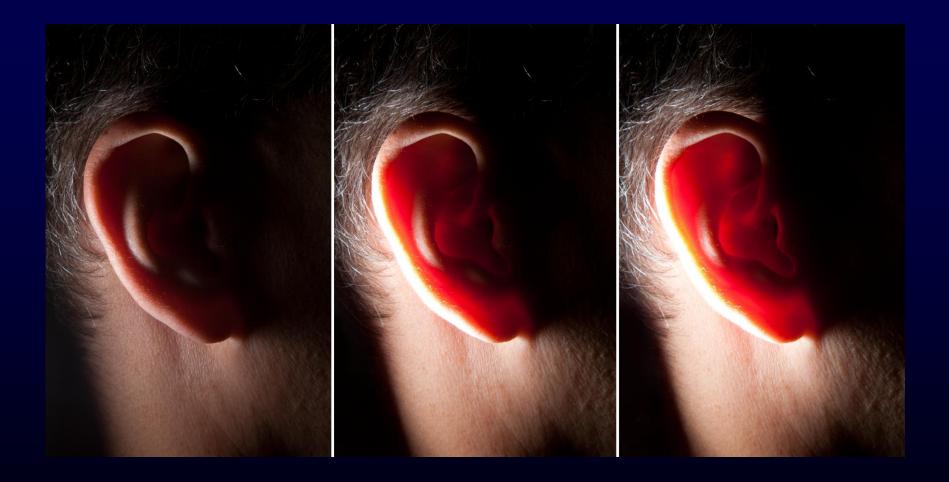




(Prahl, Tech. Rep. OMLC 2001)



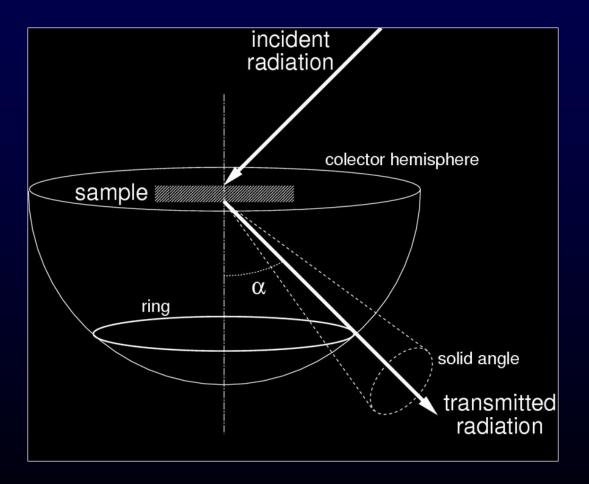
# • Subsurface scattering data





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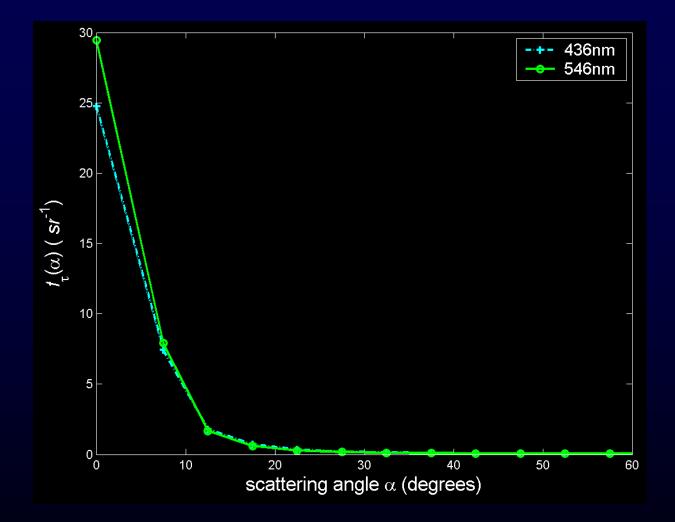
- Scattering data is usually limited to a few wavelengths
  - Example: skin subsurface measurements performed by Bruls and van der Leun (1984)



4 4 7

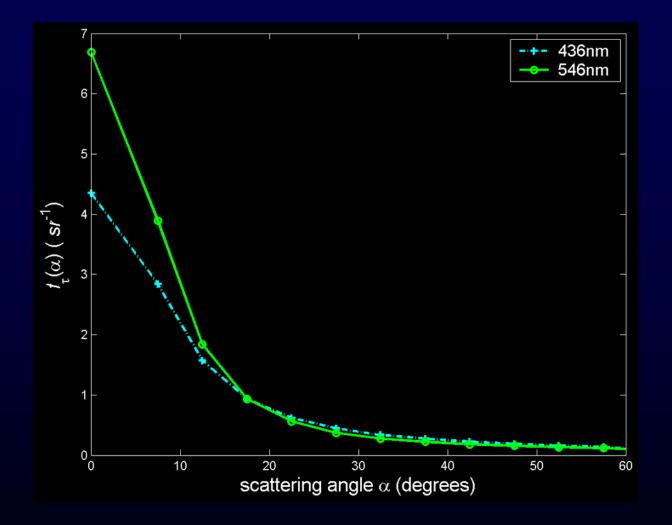
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#### Stratum corneum



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### ✤ Epidermis



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# Outline

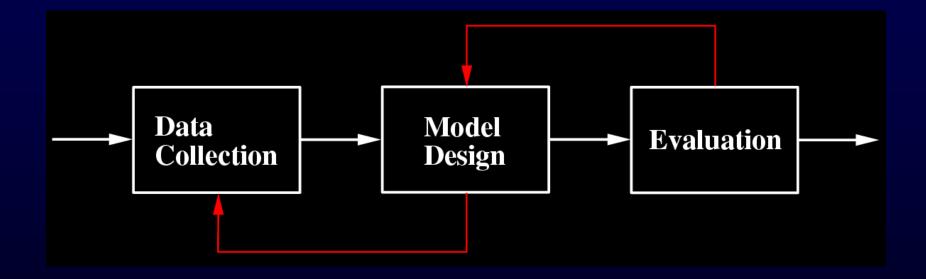
## ✓ What data?

- Biophysical Data Constraints
- Characterization Data Constraints
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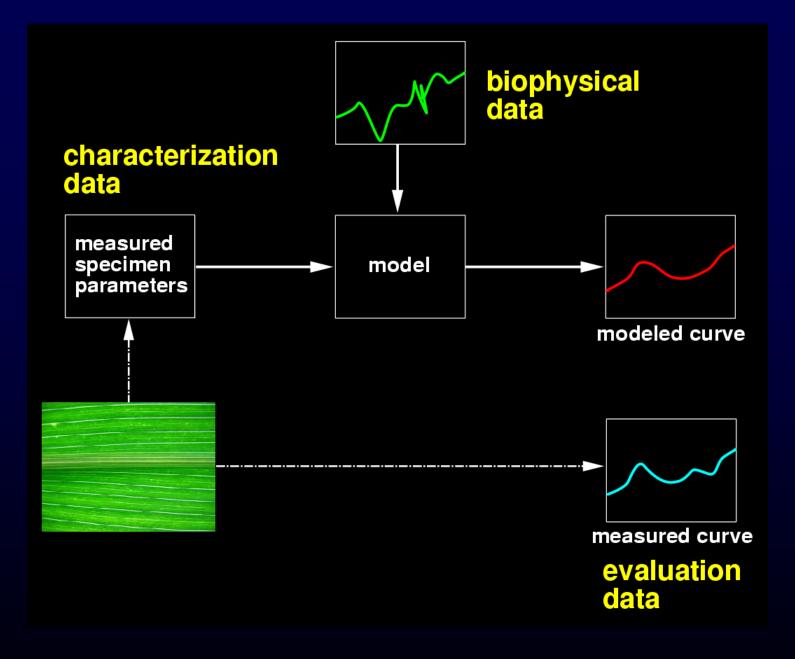
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# **Evaluation Data Constraints**





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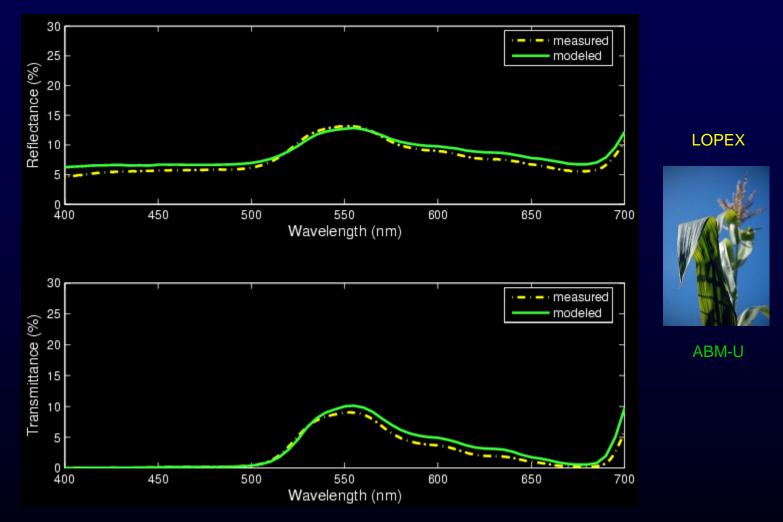




- Spectral databases rarely include the specimen's characterization data
  - Noteworthy example: Leaf Optical Experiments 1993 (LOPEX'93)
    - thickness
    - fresh and dry weights
    - concentration of absorbers (chlorophylls, carotenoids, cellulose, lignin and protein)



#### Reflectance Curves of a Corn Leaf



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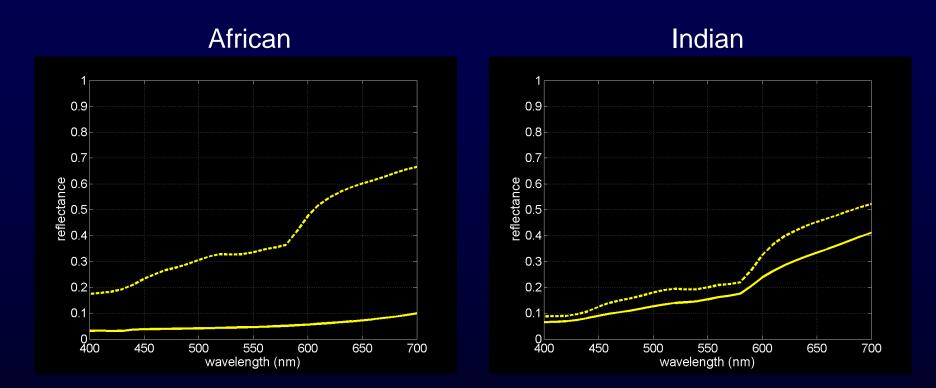
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# Qualitative descriptions

- How these descriptions really relate to material parameters?
  - Example: human subjects and pigmentation
    - ✤ African
    - Caucasian
    - Indian
    - Asian

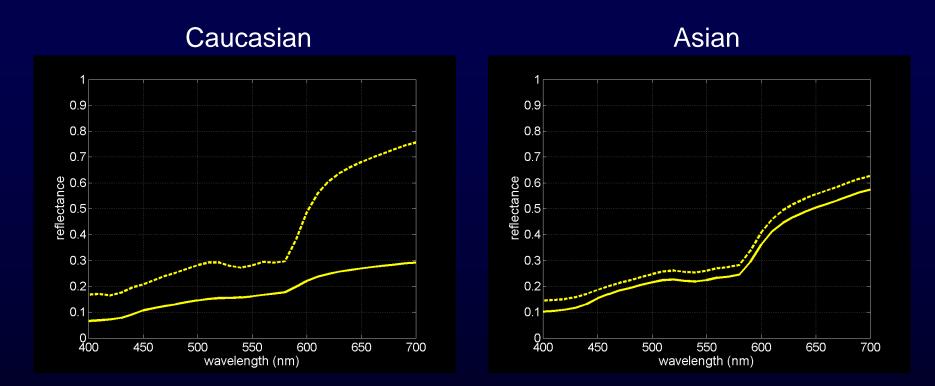


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#### (Vrhel et al., Color Res. Appl. 1994)

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#### (Vrhel et al., Color Res. Appl. 1994)

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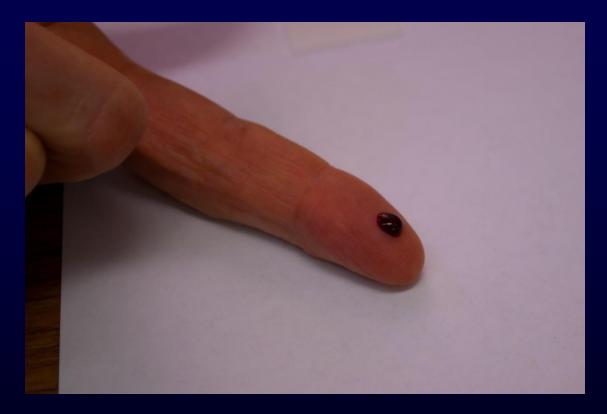
### How about tanned specimens?



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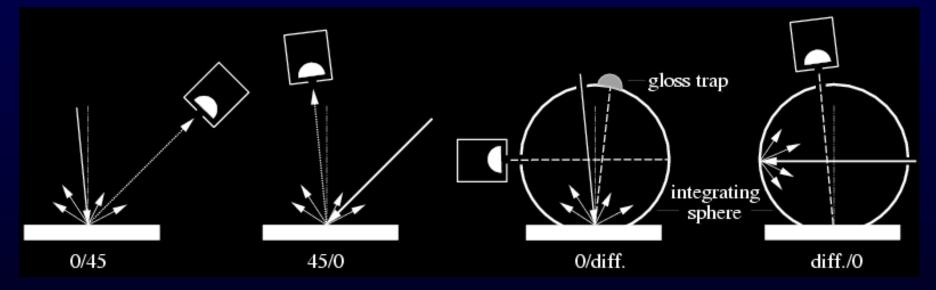
### How about blood flow conditions?



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# Measurements are usually limited to a few incidence and collection geometries

**Reflectance and Transmittance Measurement Geometries** 

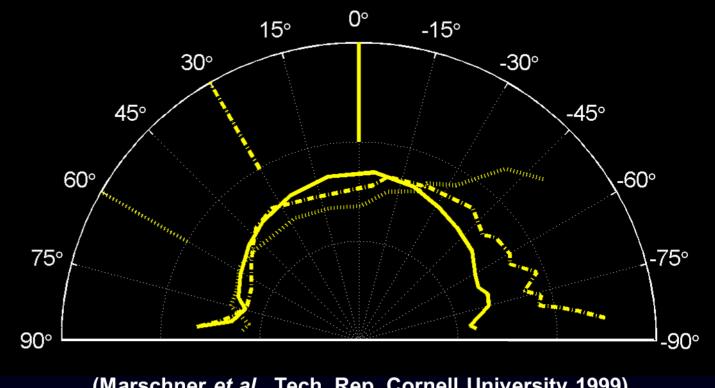




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### Scattering measurements are usually limited to a few representative cases

#### Skin BRDF Data



(Marschner et al., Tech. Rep. Cornell University 1999)

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Often, the following pieces of measurement related information are omitted from publications:

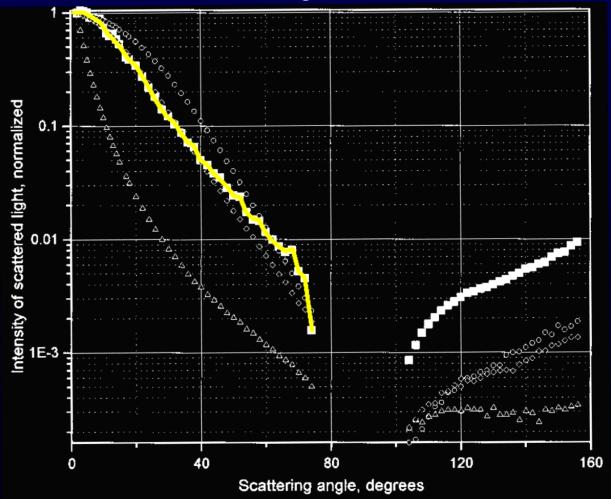
- angle of incidence
- collection geometry
- spectral resolution (for reflectance and transmittance)
- wavelength of interest (for scattering measurements)
- spectral characteristics of the light source



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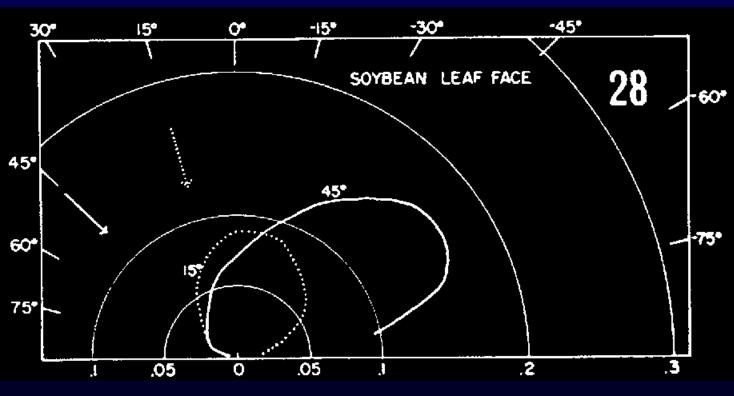
### Measured data is rarely available electronically

Blood Scattering Data at 613 nm



(Yaroslavsky et al., Journal of Biomedical Optics 1999)

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**BRDF** Data for a Soybean Leaf

(Woolley, Plant Physiology 1971)

### How can we extract this data?



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# Getting Our Own Data





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- Investments
  - Equipment
  - Space
  - Time

- Benefits
  - Control
  - Contributions







- Investments
  - Equipment
  - Space
  - Time

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  - Contributions

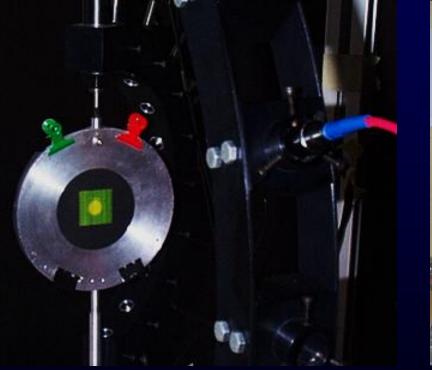


(Chen and Baranoski, Optics Express 2008)



 Investments and benefits may increase considerably when it comes to scattering measurements

#### **BTDF and BRDF Measurement Arrangements**







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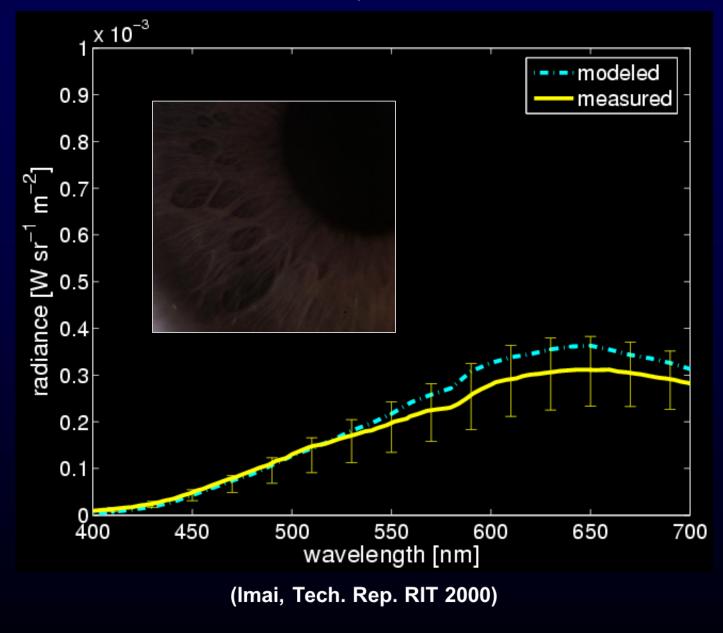
 Investments and benefits can increase even more when comes to human data





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#### **Iridal Spectral Data**



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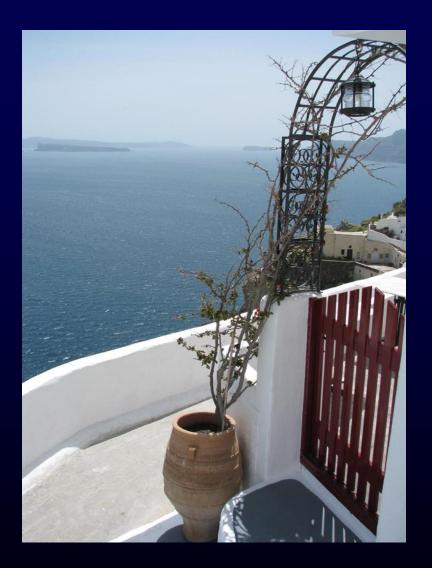


# Photorealistic Models for Pupil Light Reflex and Iridal Pattern Deformation

Vitor F. Pamplona Manuel M. Oliveira Gladimir V. G. Baranoski



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In our search for data, we cannot lose sight of something even more fundamental:

> "The essence of science is independent thinking and hard work, not equipment."

> > C.V. Raman



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# This concludes Lecture 2!

# Thanks!

# **Questions?**



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# **Credits: Images and Photos**

- J. Rokne
- D. Yim
- B. W. Kimmel
- A. Krishnaswamy
- T.F. Chen
- D. Eng
- L. Northam
- A. Baranoski
- S. Jacquemoud
- F. Imai
- C. Carvalho
- M. Oliveira
- V. Pamplona

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