

# Developments in Optics and Communication 2015

## Spectral reflectance estimation with an optical non contact device for skin assessment

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- 1 Introduction
  - Motivation
  - Scientific contribution
- 2 Background
  - spectral measurements
  - Multispectral measurement devices
  - spectral estimation
- 3 The Sklmager
  - Linearity of the channels
  - Spectral Power Distribution LEDs
- 4 Estimation
  - Training Data
  - Test Data
- 5 Estimation Results
  - Conclusions
  - furthermore

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- skin assessment important for early detection of diseases
- expensive, bulky multispectral devices allow objective assessment
- spectral estimation allows smaller, cheaper easy to use devices
- Sklmager is a proposed non contact optical skin assessment device



- realizing of a spectral estimation workflow for Sklmager
- comparison of spectral estimation approach to the state of the art Sklmager implementation
- basic measurments and classification of the Sklmager

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- measured spectrum of an object is result of 3 things
- Spectral Power distribution of the Illumination
- Spectral reflectance spectrum of the object
- Spectral responsivity of the sensor

# spectral measurements

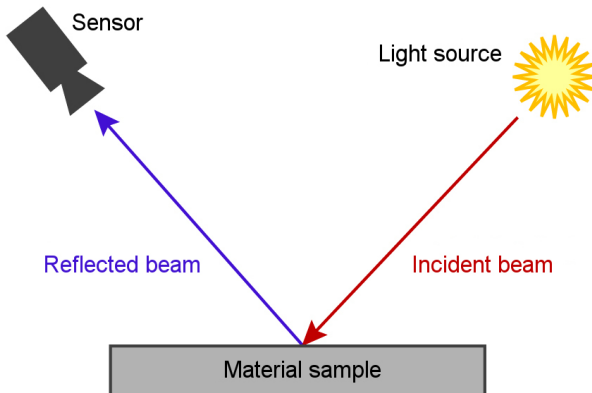


Figure: spectral measurement concept

# spectral measurements

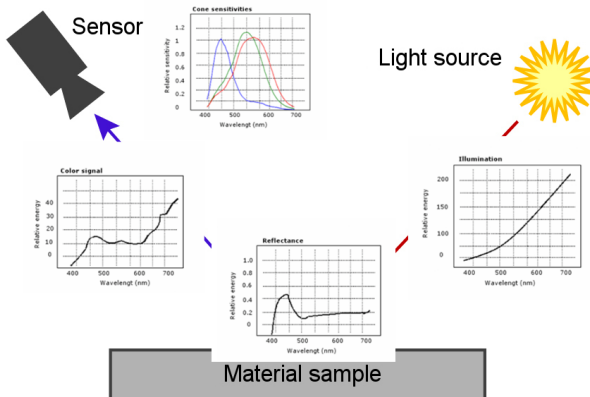


Figure: spectral measurement concept with spectra illustrated

# Multispectral measurement devices

- measures the spectral reflectance accurately
- good results reliable objective results for Skinassessment
- Bulky, expensive devices
- often slow measurement process

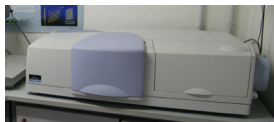
# multispectral measurement devices

spectroradiometer



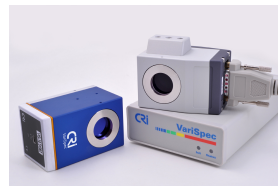
- relatively fast
- expensive
- big, bulky
- spot measurement

spectrophotometer



- slow
- very expensive
- big
- absorbance

LCTF camera



- slow
- affordable
- relatively small
- spatial

Table: examples of multispectral measurement devices

- approach to obtain (multi)spectral measurements with standard camera
- only an estimation
- allows use of inexpensive sensor
- requires selection of suitable sensor and illumination
- requires measurement of a reference data set (ground truth data)



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# The Sklmager



**Figure:** Sklmager earlier proposed skin assesment prototype, polarized illumination 5 LEDs, cross polarized CMOS Sensor

## Overview Implementation

- cheap sensor
- multi illumination (5LEDs)
- fast, easy to use,

# Linearity of the channels

# SPD of the LED's

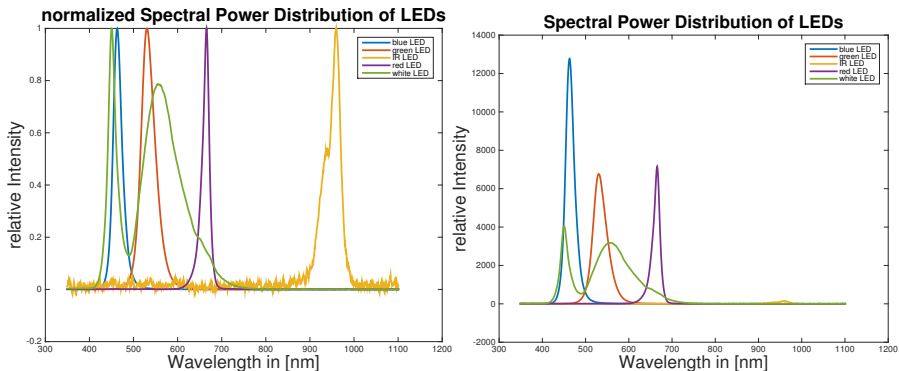


Figure: Spectral Power Distribution of the LED's in the Sklmager

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- spectral measurement of 24 color patches
- Sklmager measurements of 24 color patches
- building a matrix to transform 15 dimensional space into full spectra (up to 651 dimensions)

# Training Data

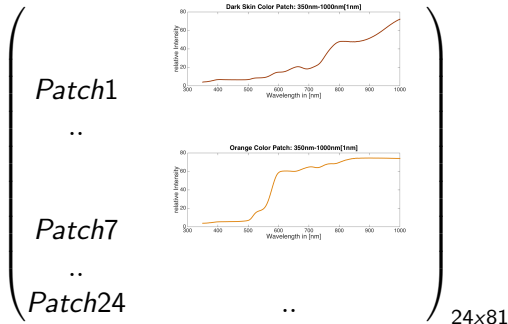


Table: building the groundtruth data reflectance Matrix



# Training Data



$$\begin{pmatrix} \text{Patch1} & R_{\text{redLED}} & G_{\text{redLED}} & \dots & B_{\text{IRLED}} \\ \text{Patch2} & R_{\text{redLED}} & G_{\text{redLED}} & \dots & B_{\text{IRLED}} \\ \dots & \dots & \dots & \dots & \dots \\ \text{Patch24} & R_{\text{redLED}} & G_{\text{redLED}} & \dots & B_{\text{IRLED}} \end{pmatrix}_{24 \times 15}$$

Table: building the ground truth data Sklmager Response Matrix

# estimation matrix

$$\begin{pmatrix}
 \begin{array}{c}
 \text{Dark Skin Color Patch: 380nm-700nm(1nm)} \\
 \text{..} \\
 \text{Orange Color Patch: 380nm-700nm(1nm)} \\
 \text{..}
 \end{array}
 \end{pmatrix}_{24 \times 81} = \begin{pmatrix}
 R_{redLED} & G_{redLED} & .. & B_{IRLED} \\
 R_{redLED} & G_{redLED} & .. & B_{IRLED} \\
 .. & .. & .. & .. \\
 R_{redLED} & G_{redLED} & .. & B_{IRLED}
 \end{pmatrix}_{24 \times 15} * A_{15 \times 81}$$

$$R_{reflectance\_24 \times 81} = E_{SkImager\_trainresp\_24 \times 15} * A_{15 \times 81}$$

$$A_{15 \times 81} = E_{SkImager\_trainresp\_24 \times 15}^{\dagger} * R_{reflectance\_24 \times 81}$$

$$Reflectance_{estimated} = E_{SkImager\_TESTresp\_Pixels \times 15} * A_{15 \times 81}$$

- first test for our estimation: recovering the color Checker reflectances (24 patches)
- ideal test set because close to the training data
- in noise free environment estimation should be perfect
- noise can be further accounted for with more sophisticated estimation methods

# Outline

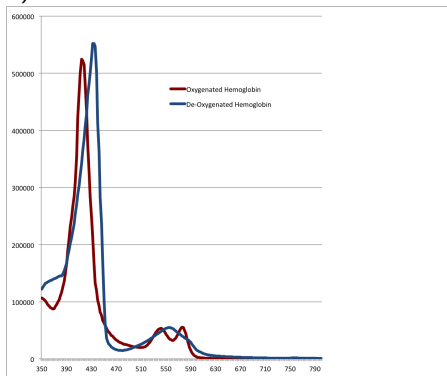
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# spectral estimation results

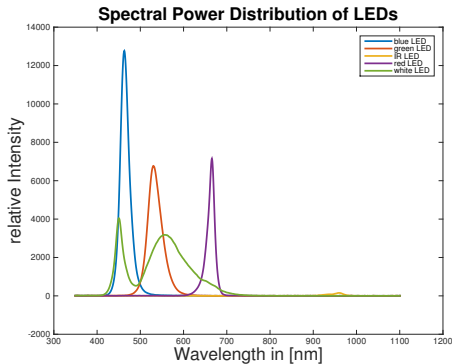
- second testing of the estimation
- patients arm was clamped pressure applied to the upper arm
- consecutive measurements over time
- well known measurment with known results
- estimation results for unique wavelength of oxygenated hemoglobin and deoxygenated Hemoglobin were used
- additionally comparing the estimation approach to the state of the art channel analysis

# Results

a)

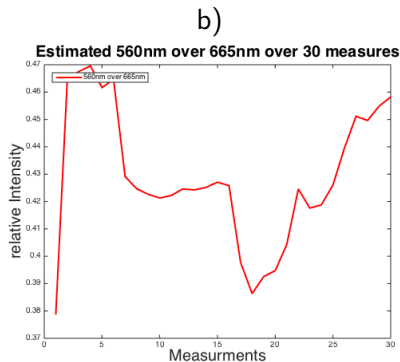
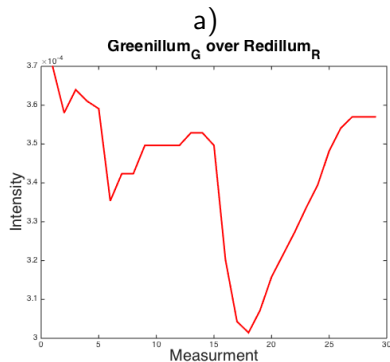


b)



**Table:** a) Oxygenated and deoxygenated Hemoglobin spectral curves and b) spectral power distribution of the LED's





**Table:** a)conventional approach optimized channels in ratio compared to b) the new spectral estimation approach were specific wavelengths are put in ratios to obtain information

# Conclusion

- spectral estimation workflow has been established
- the results are promising
- results are at least comparable to state of the art channel approach
- spectral estimation can be further optimized for these samples
- more unique wavelength in the hemoglobin curves can be used

- Better suited training data shall be aquired
- more sophisticated methods shall be explored
- spectral responsivity of the Sensor shall be measured and accounted for
- mathematical model for penetration depth of wavelength could be formulated

## Questions?

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