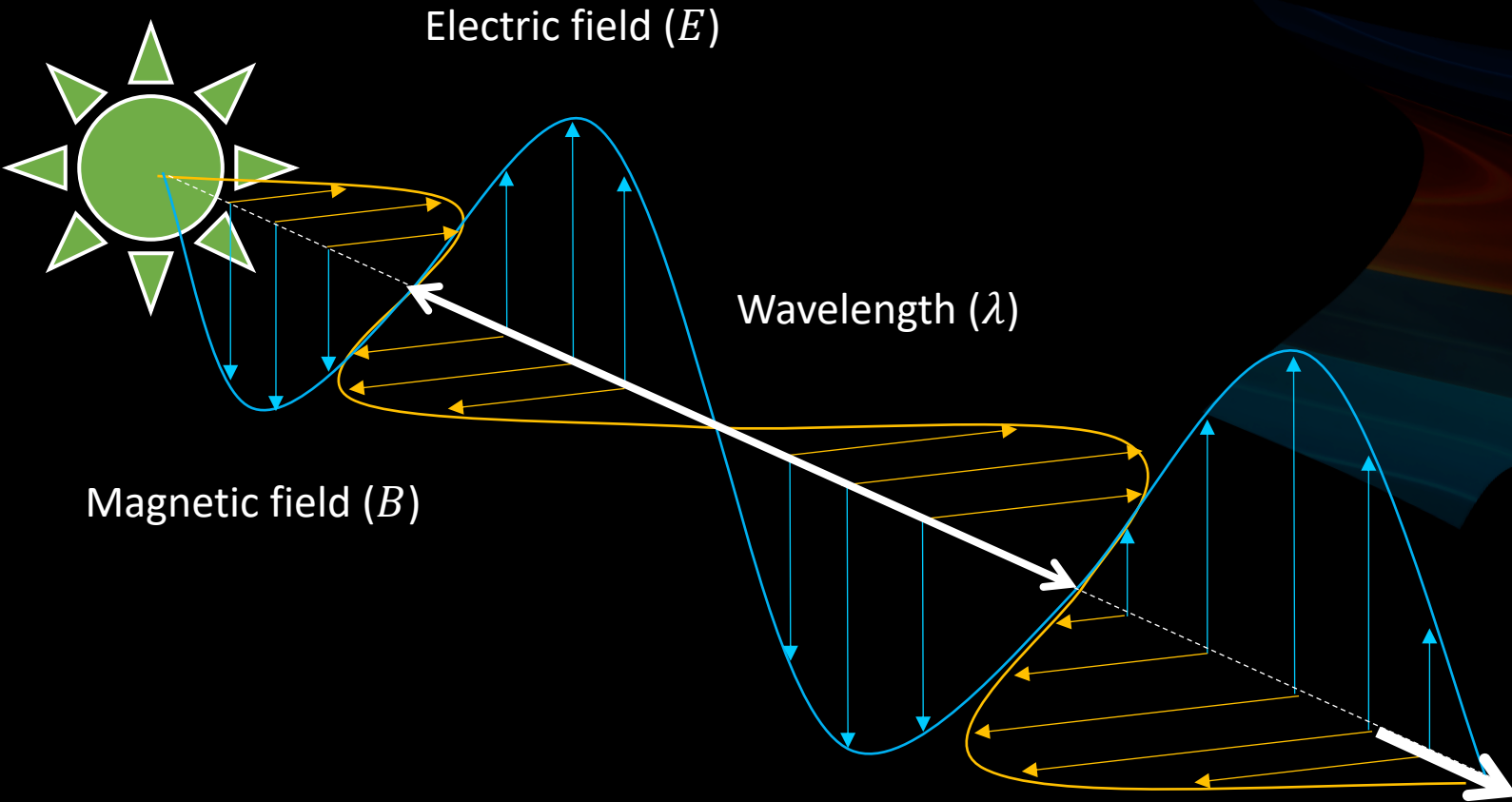


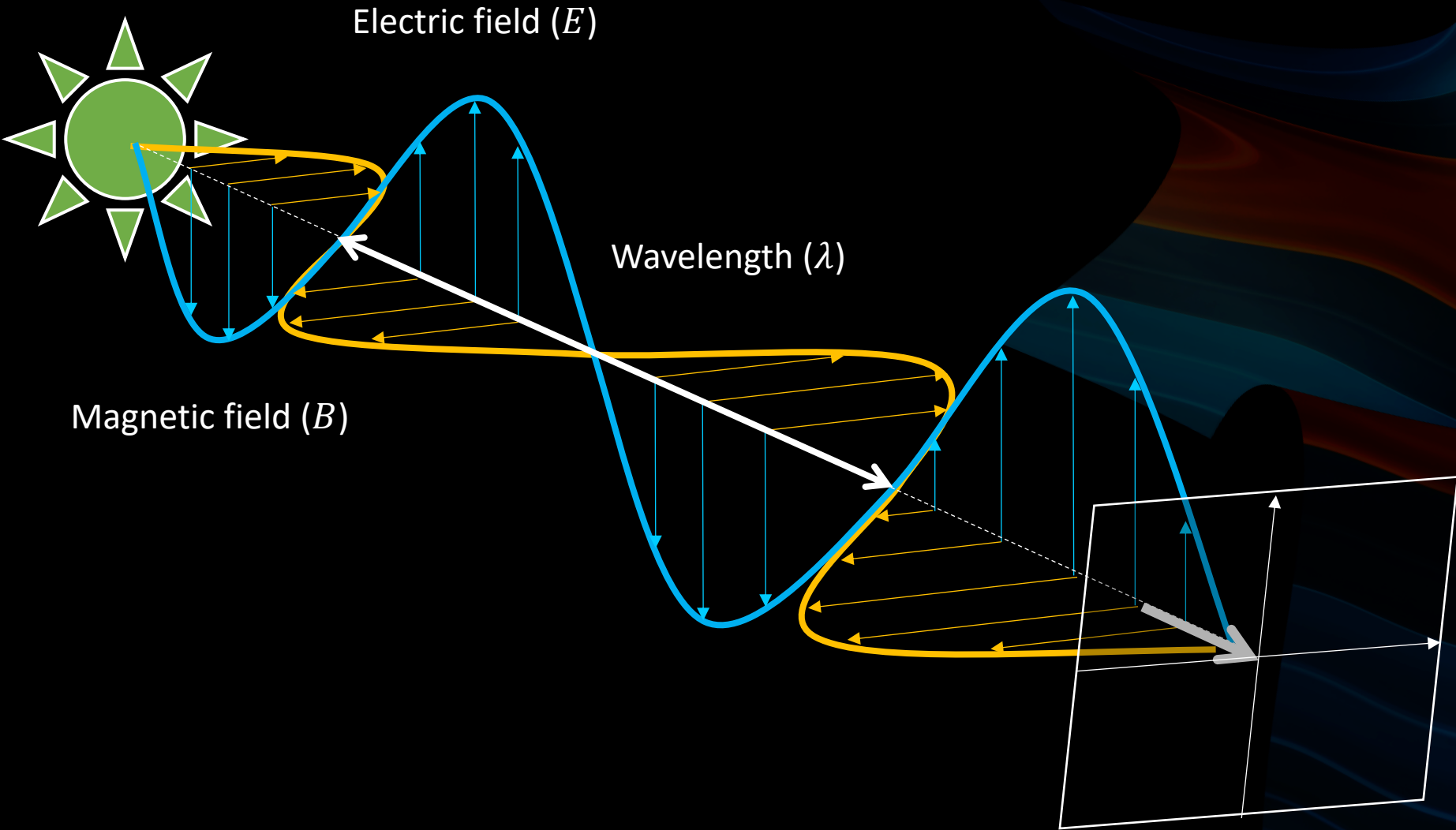
Polarimetric BSSRDF Acquisition of Dynamic Faces

Hyunho Ha Inseung Hwang Nestor Monzon Jaemin Cho Donggun Kim
Seung-Hwan Baek Adolfo Muñoz Diego Gutierrez Min H. Kim

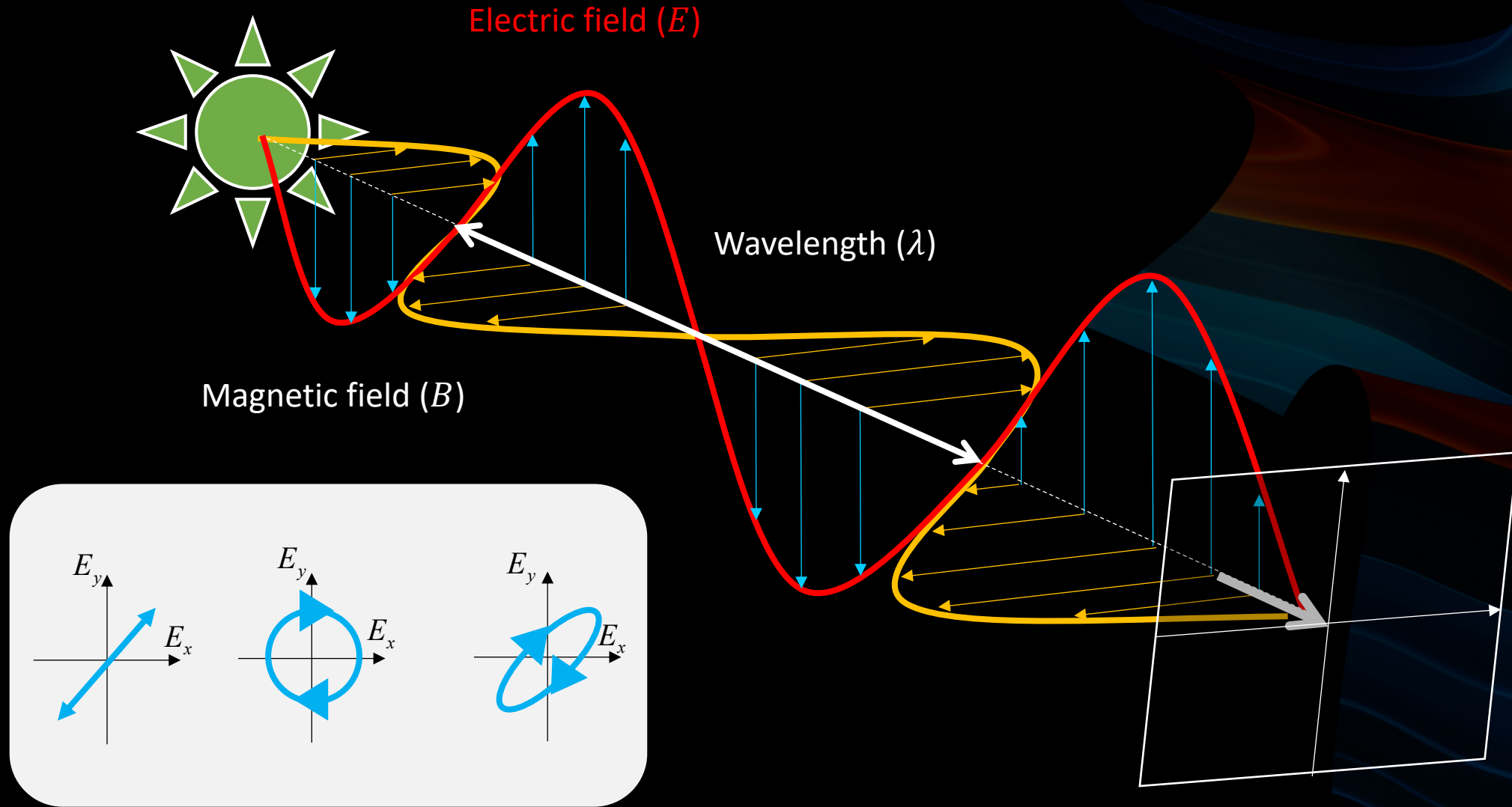
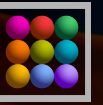
Polarization



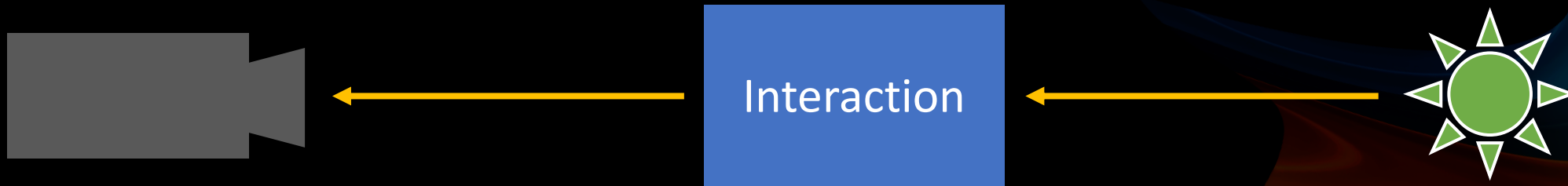
Polarization



Polarization



Stokes Vector and Mueller Matrix

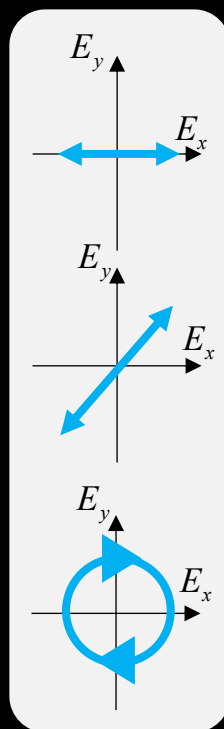


$$\mathbf{s}_o = \mathbf{M} \mathbf{s}_i$$

Stokes vector

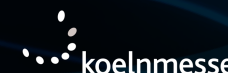
$$\mathbf{s} = \begin{bmatrix} s_0 \\ s_1 \\ s_2 \\ s_3 \end{bmatrix}$$

- s_0 Intensity
- s_1 Horizontal/vertical
- s_2 Diagonal/antidiagonal
- s_3 Circular



Mueller matrix

$$\mathbf{M} = \begin{bmatrix} M_{00} & M_{01} & M_{02} & M_{03} \\ M_{10} & M_{11} & M_{12} & M_{13} \\ M_{20} & M_{21} & M_{22} & M_{23} \\ M_{30} & M_{31} & M_{32} & M_{33} \end{bmatrix}$$



Face Model



- Oiliness
 - Main specular reflection
- Outer layer
 - Epidermis + upper part of the dermis

$C_{h,out}$

Fraction of hemoglobin

C_m

Fraction of melanin

β_m

Fraction of eumelanin
in melanin

- Inner layer
 - Lower part of the dermis

$C_{h,in}$

Fraction of hemoglobin in inner layer

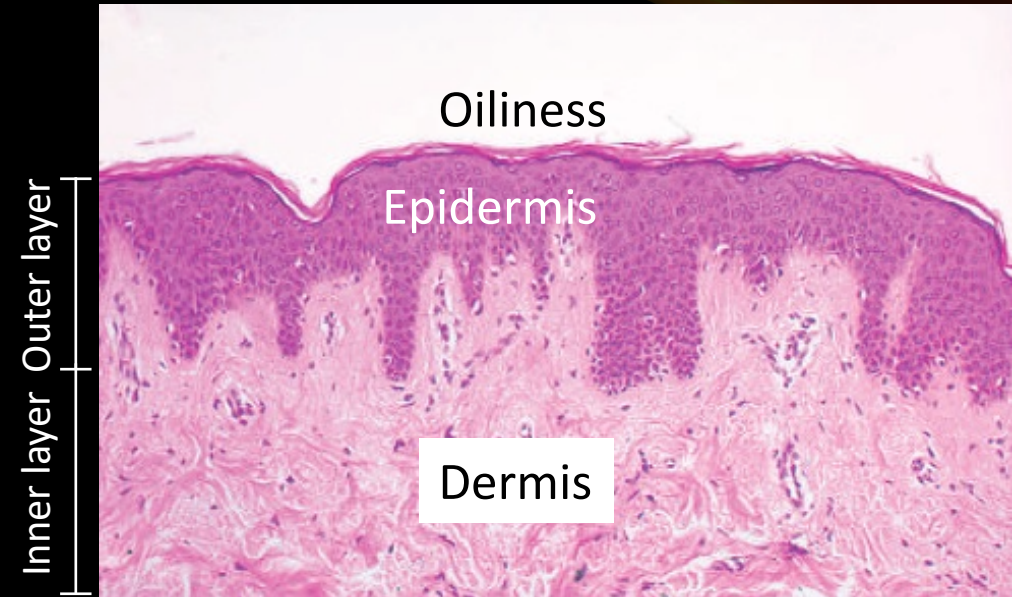
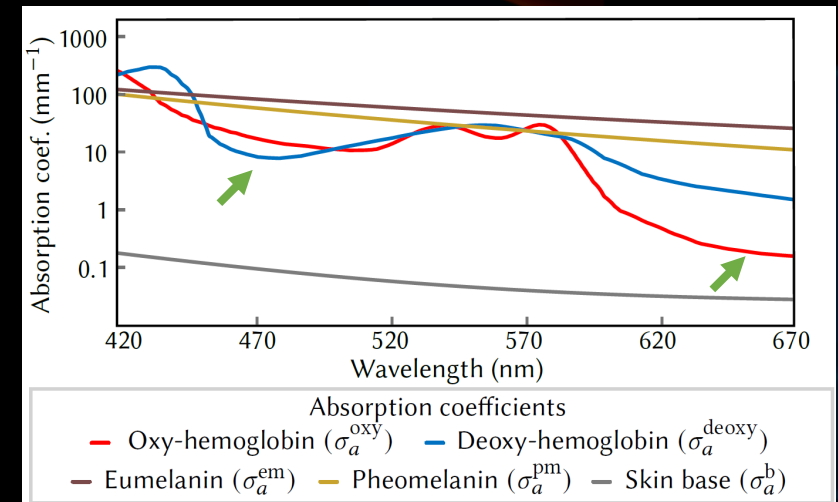


Figure from *Dermatology Lecture Notes*, Eleventh Edition.

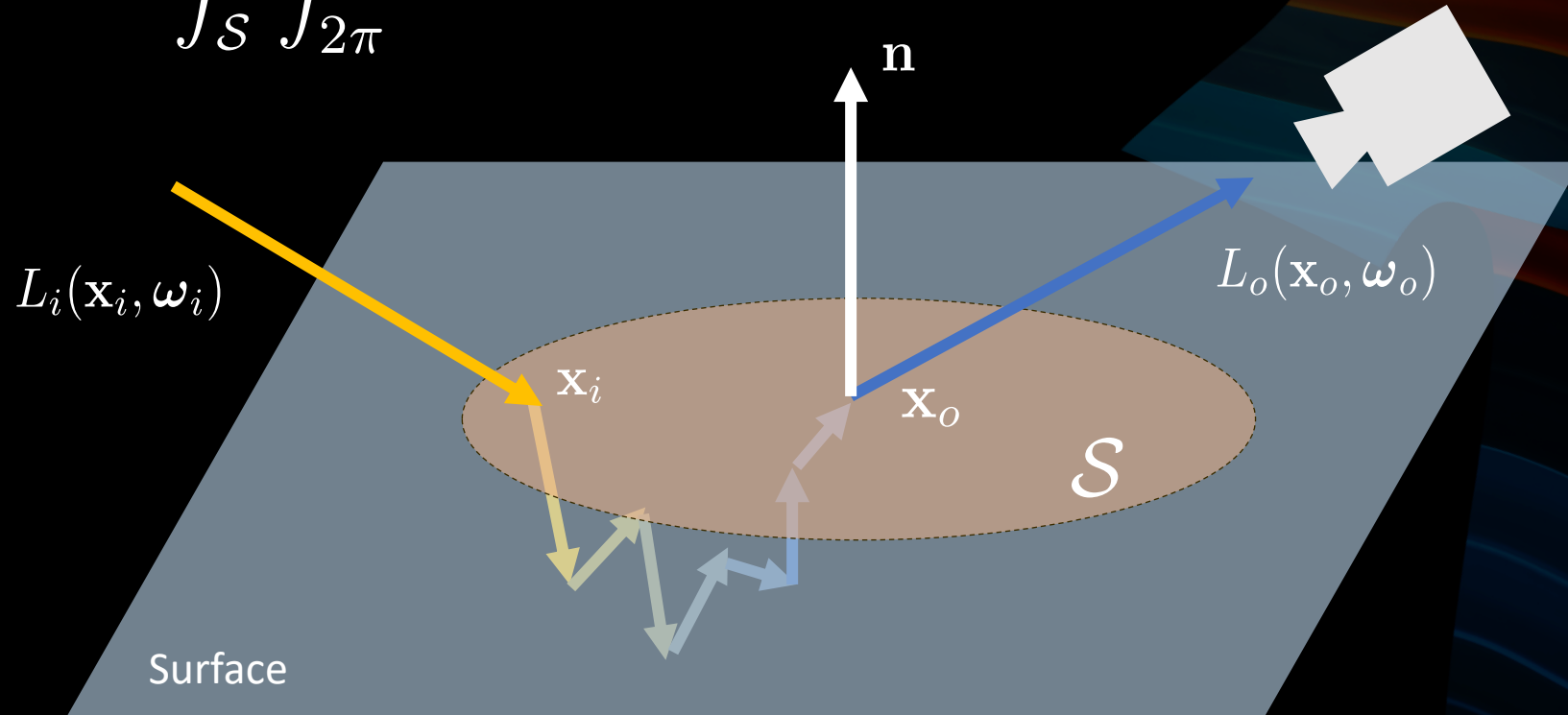


Human Skin: Subsurface Scattering

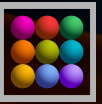


- Bidirectional Subsurface Scattering Reflectance Distribution Function Ψ

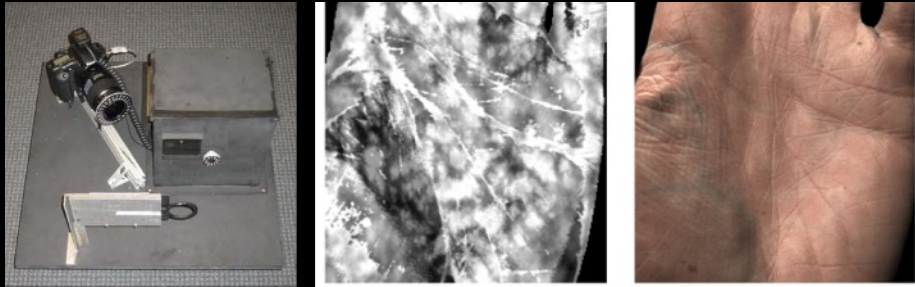
$$L_o(\mathbf{x}_o, \boldsymbol{\omega}_o) = \int_{\mathcal{S}} \int_{2\pi} \Psi(\mathbf{x}_i, \boldsymbol{\omega}_i; \mathbf{x}_o, \boldsymbol{\omega}_o) L_i(\mathbf{x}_i, \boldsymbol{\omega}_i) (\mathbf{n} \cdot \boldsymbol{\omega}_i) d\boldsymbol{\omega}_i d\mathcal{S}(\mathbf{x}_i)$$



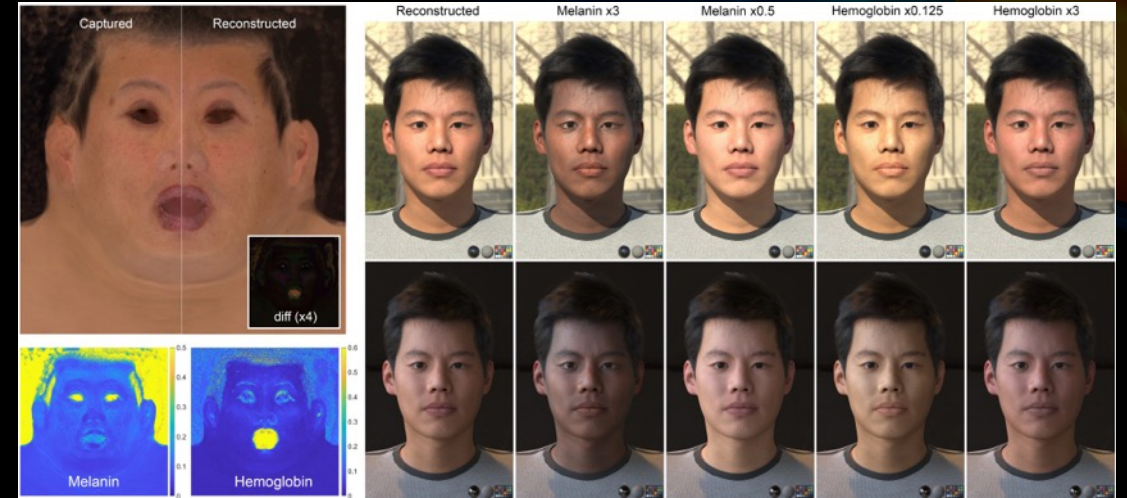
Related Work



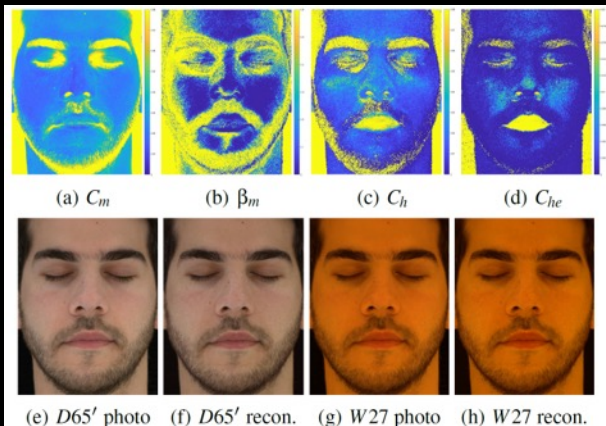
- Human face: beneath skin



Donner et al. 2008



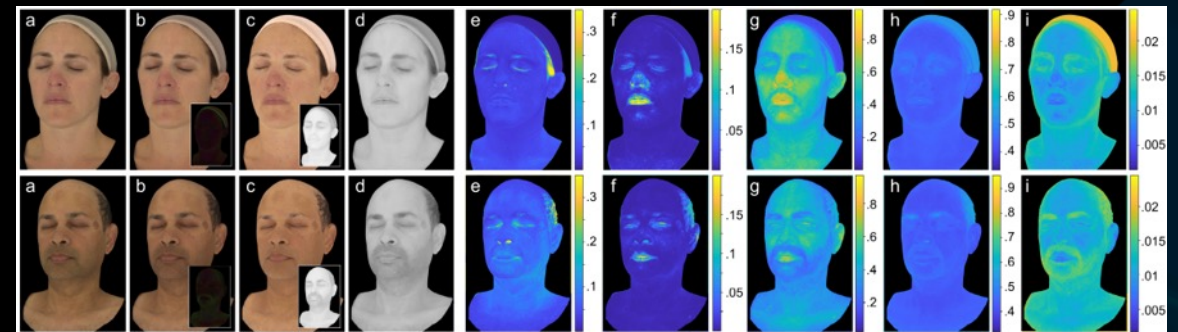
Aliaga et al. 2022



Gitlina et al. 2010



Jimenez et al. 2010



Aliaga et al. 2023

Related Work



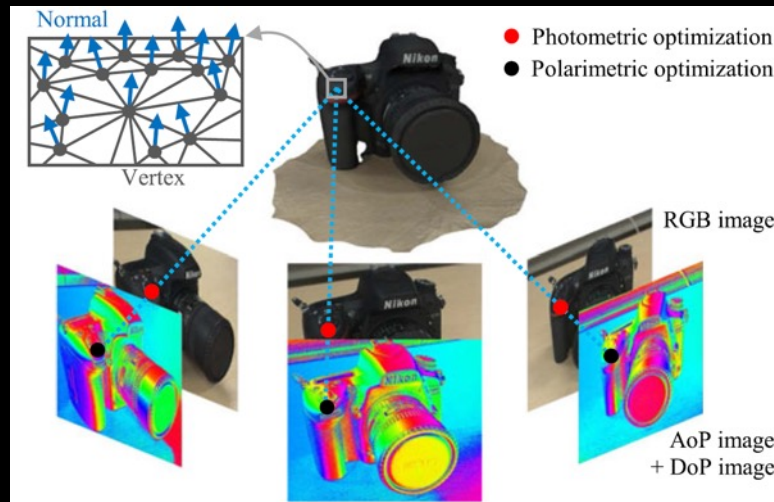
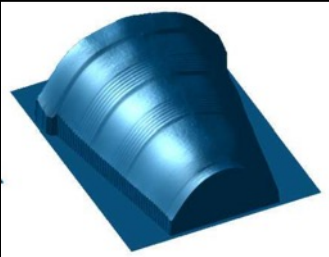
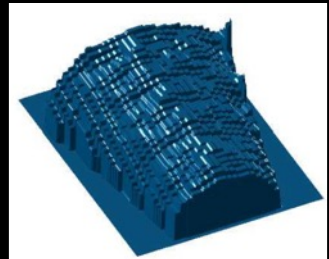
- Polarimetry



Ghosh et al. 2010

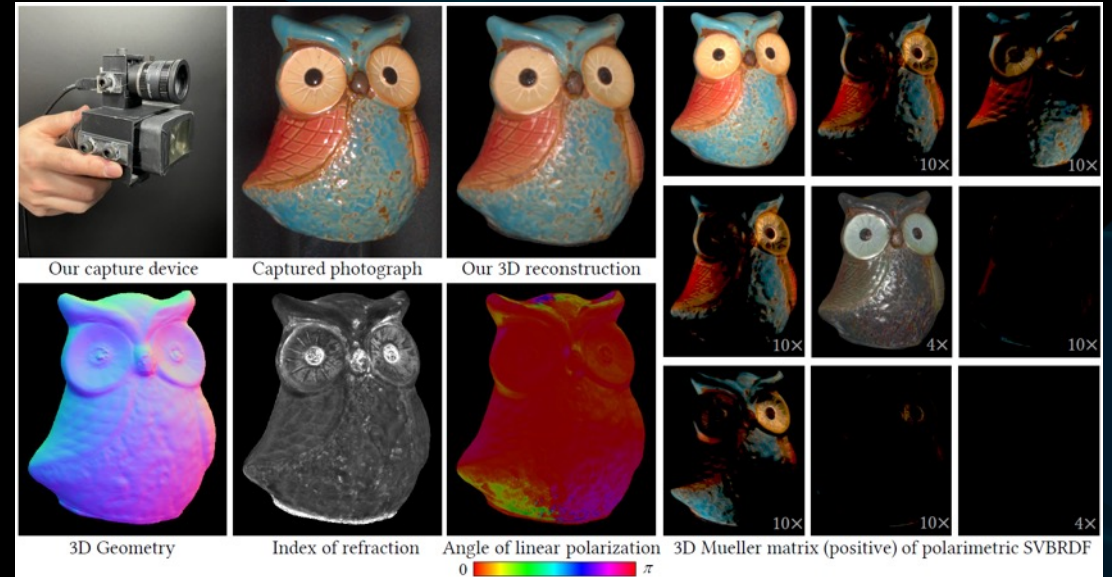


Baek et al. 2018



Kadambi et al. 2010

Zhao et al. 2020



Hwang et al. 2022



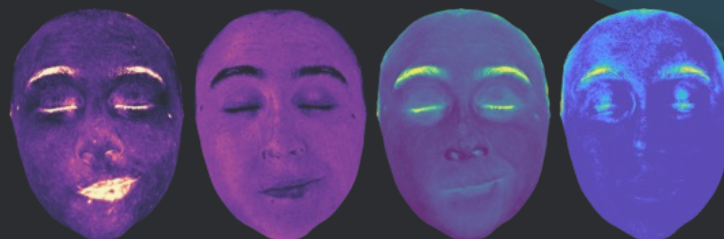
Specular
appearance



0° 90° 45° 135°

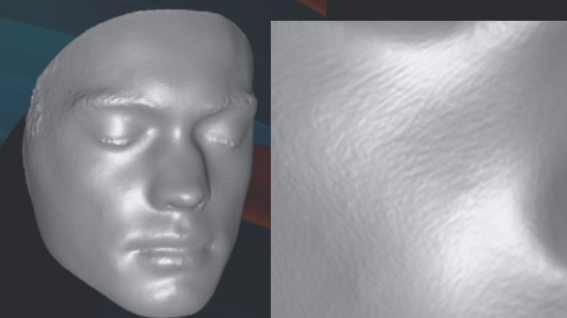
Polarimetric
reflectance

Multispectral
subsurface scattering

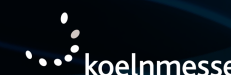


Biophysical
parameters

Geometry

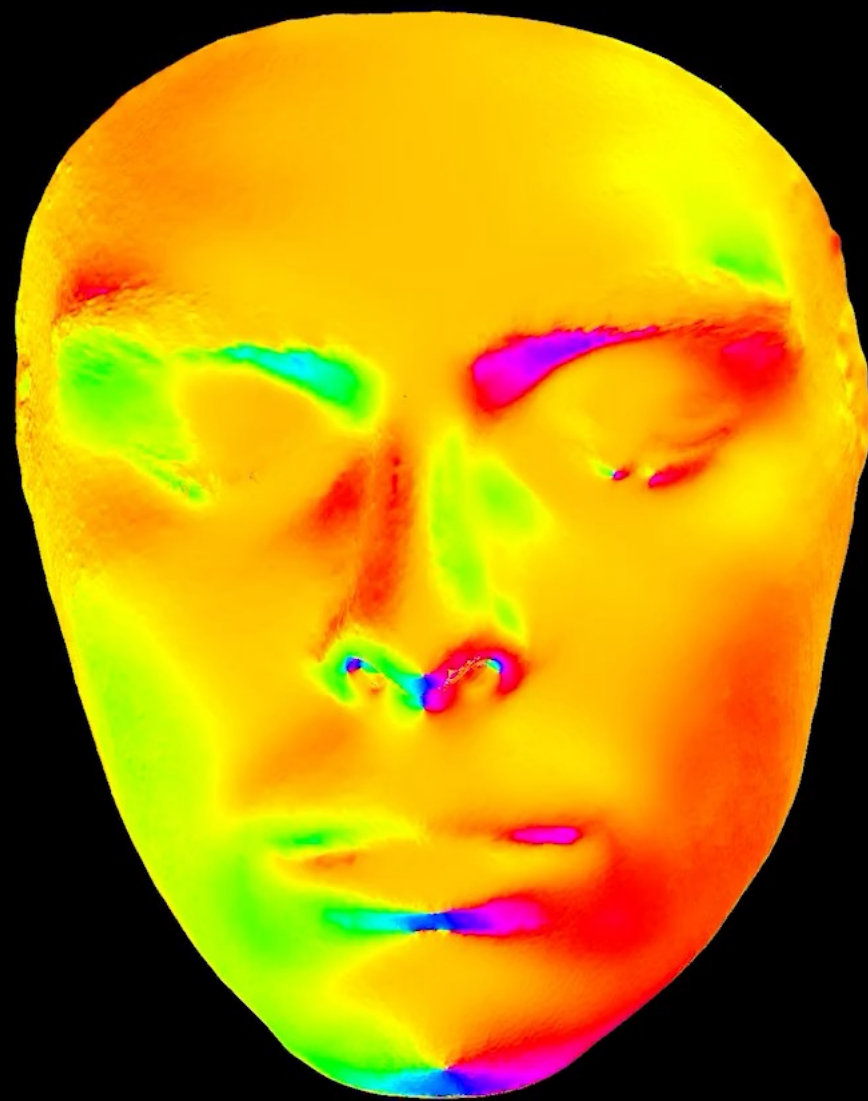


Inverse
rendering





Full rendering

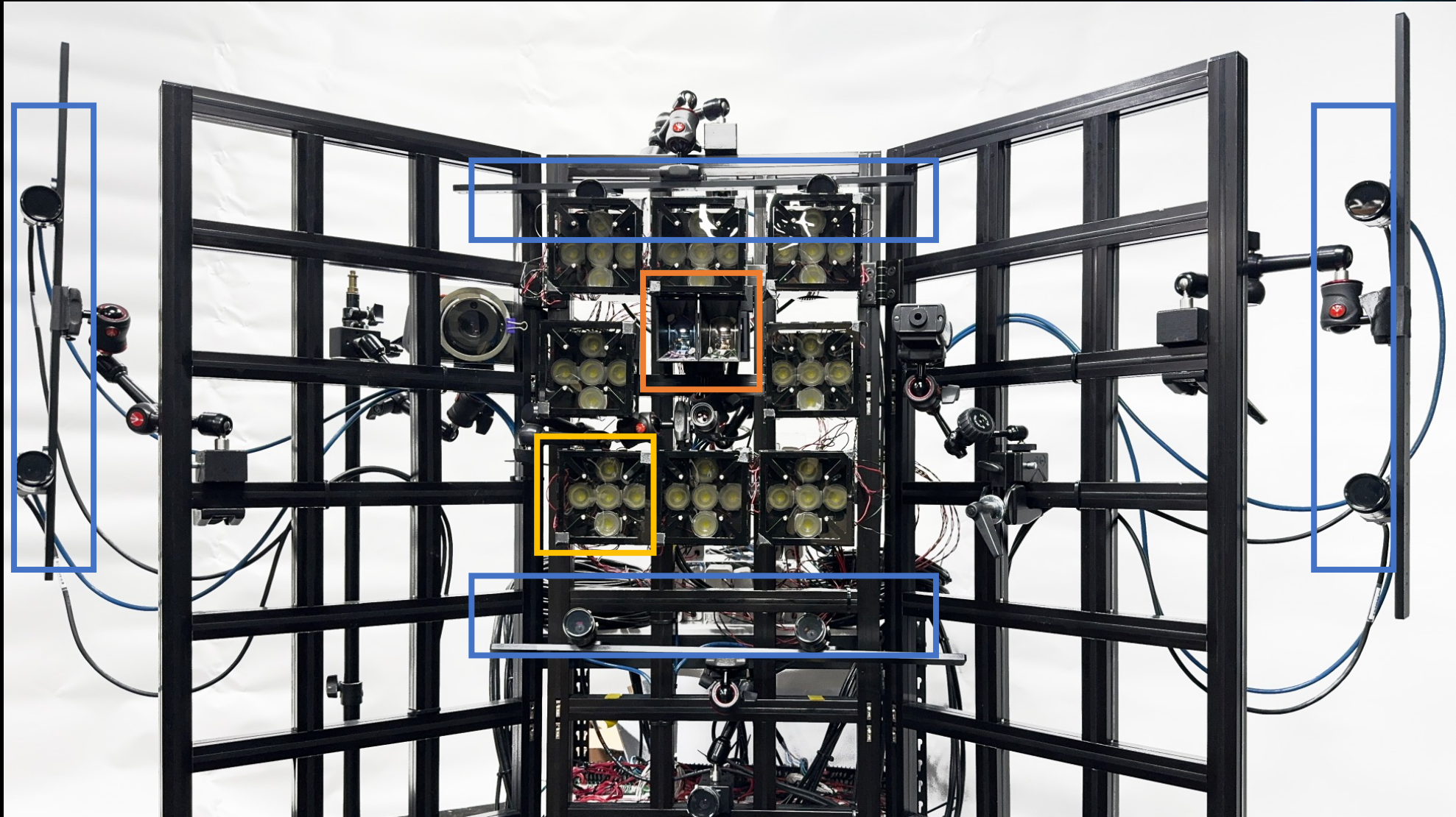


Angle of linear polarization

Hardware



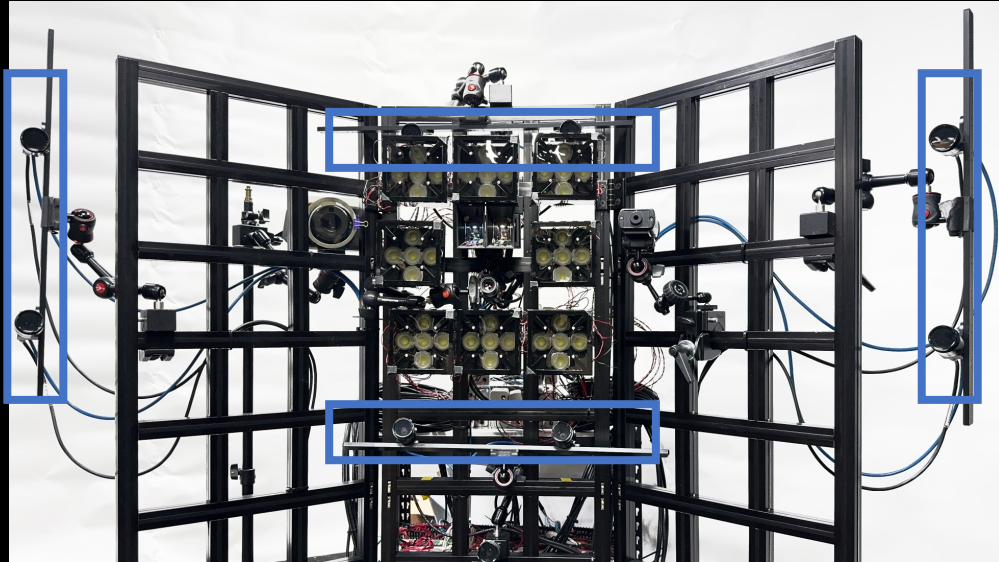
- Capture **multispectral polarimetric stereo** images



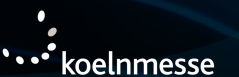
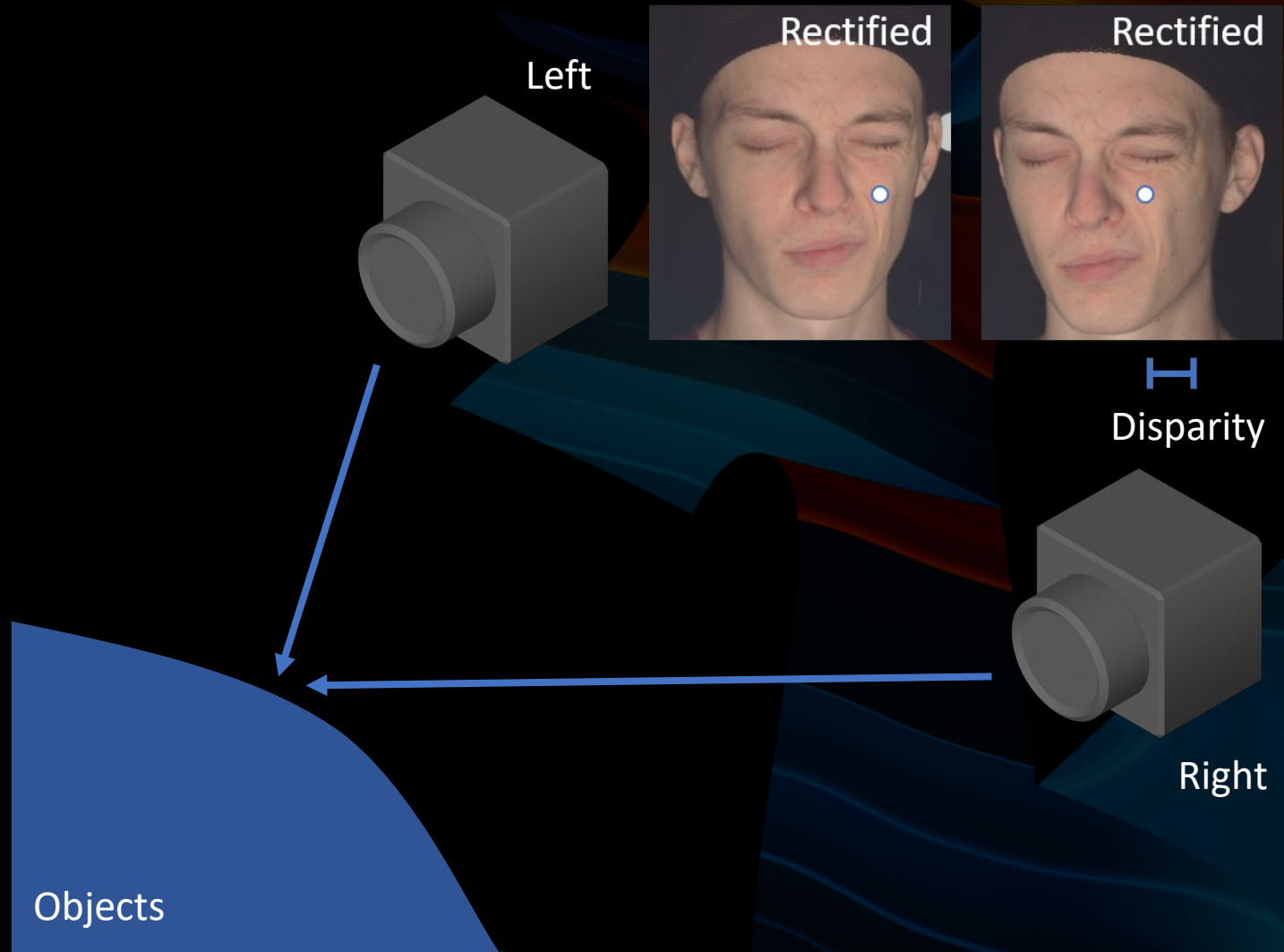
Hardware: Stereo Imaging



Geometric information



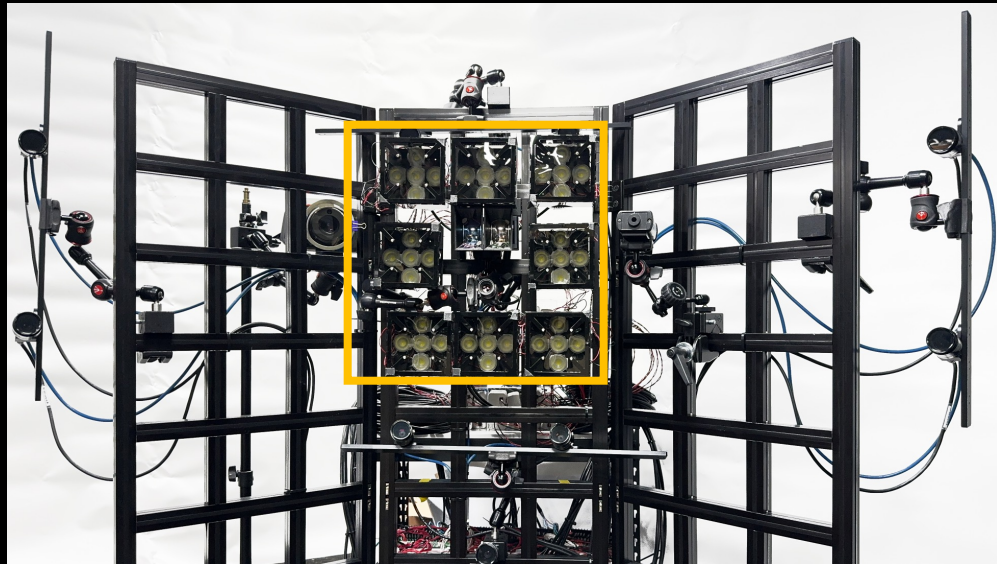
Two color machine vision cameras



Hardware: Polarimetric Imaging

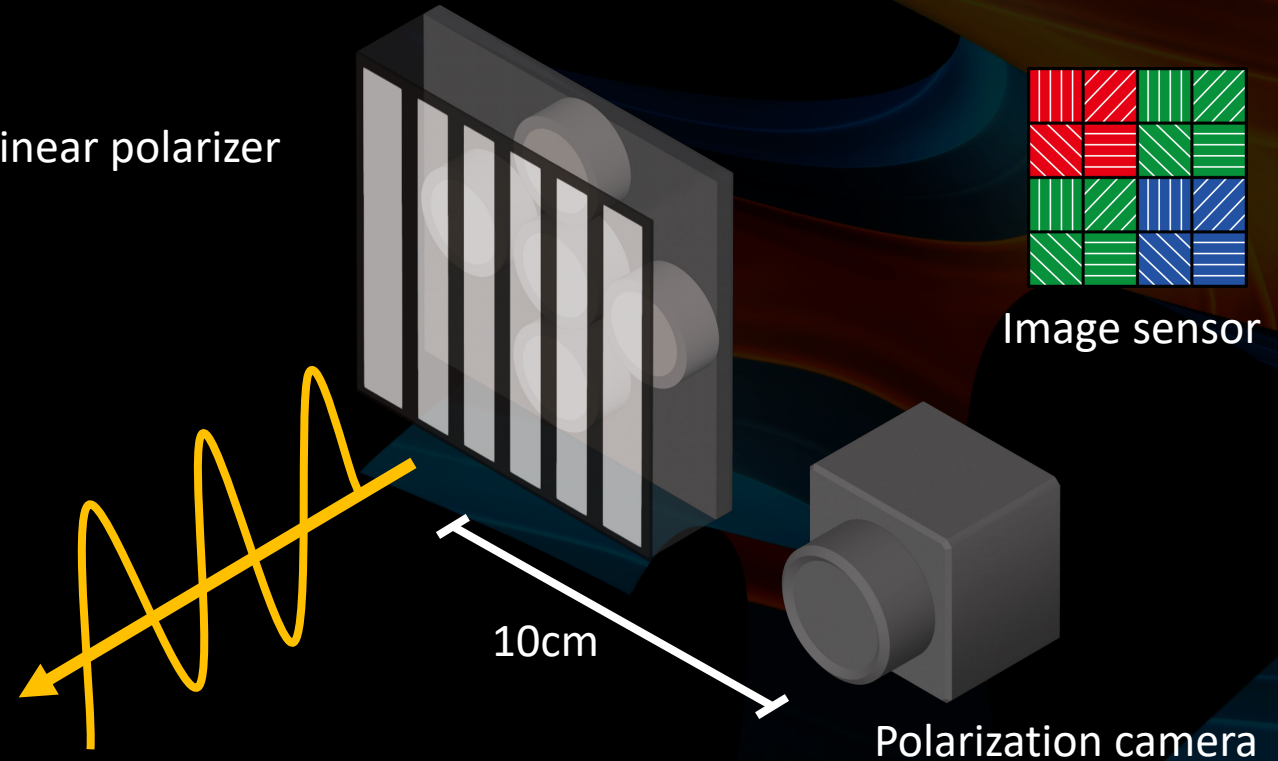


Polarimetric information



Polarization camera

Linear polarizer



0° images

90° images

45° images

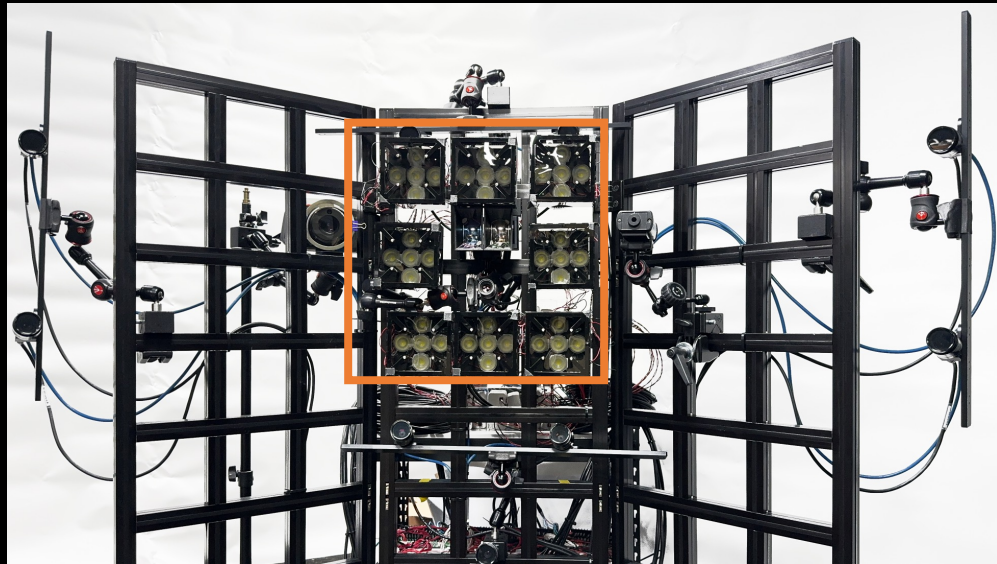
135° images



Hardware: Multispectral Imaging

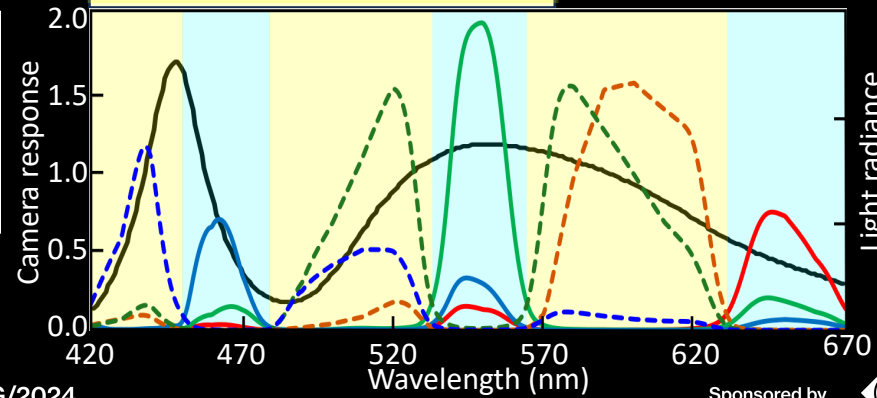
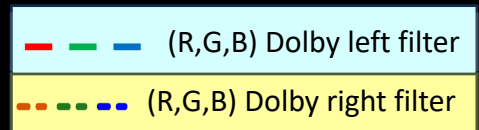
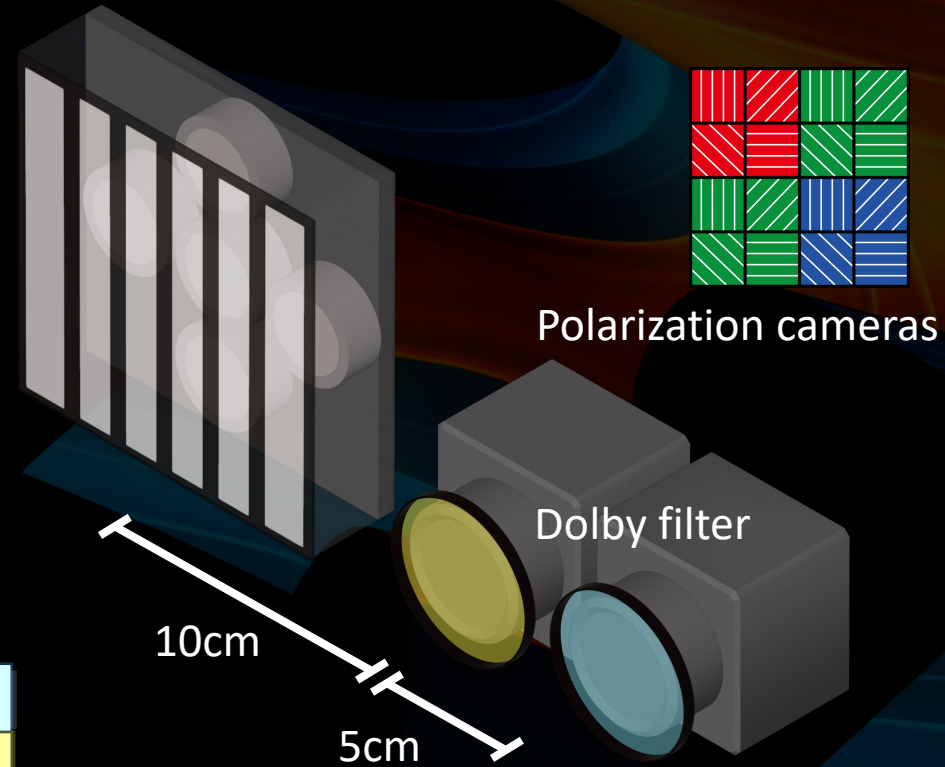


Spectral reflectance information



Dolby 3D glasses

Linear polarizer



Dolby left

Dolby right

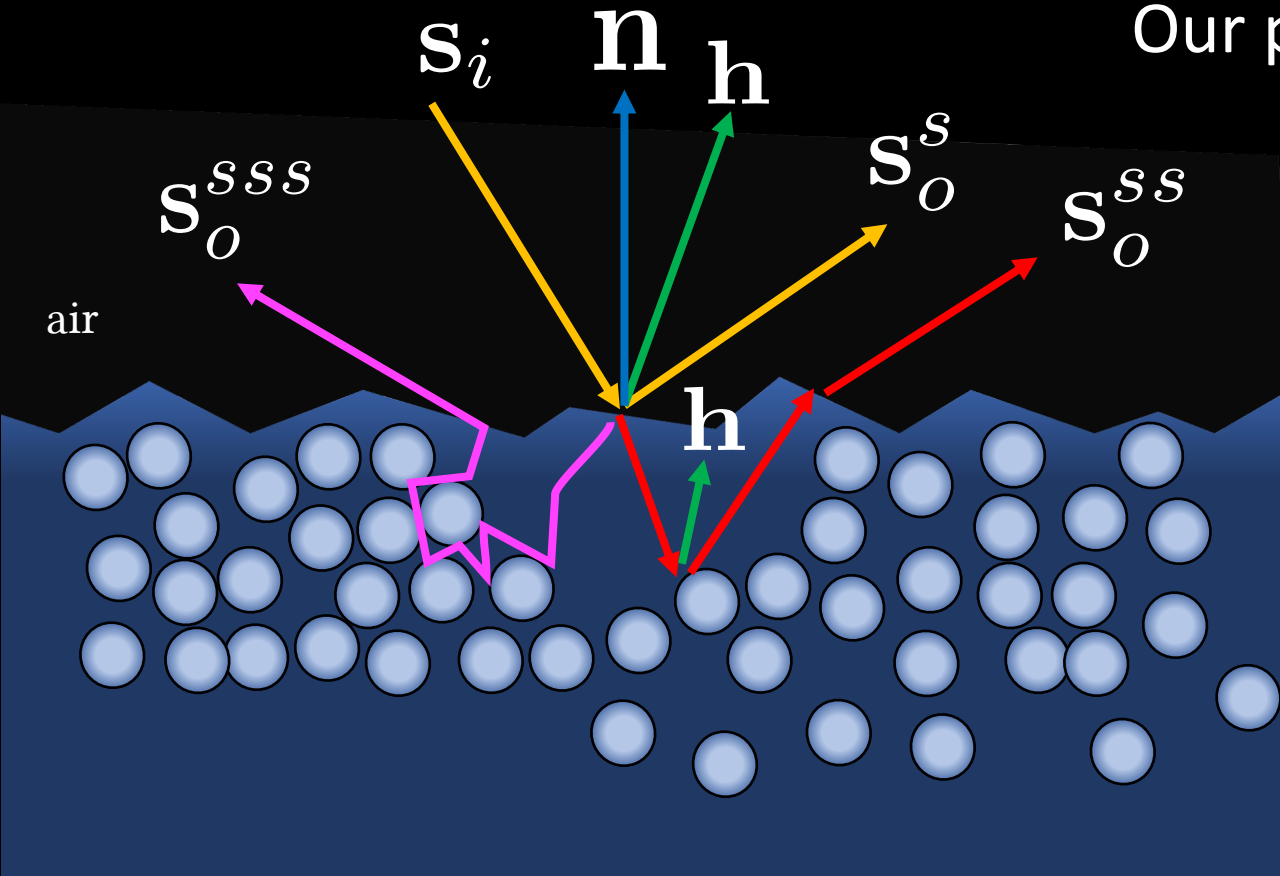
Polarimetric Reflectance Model



$$\text{pBSSRDF: } \mathbf{s}_o = \mathbf{P}(\omega_i, \omega_o) \mathbf{s}_i$$

Our pBSSRDF includes 3 types of reflection

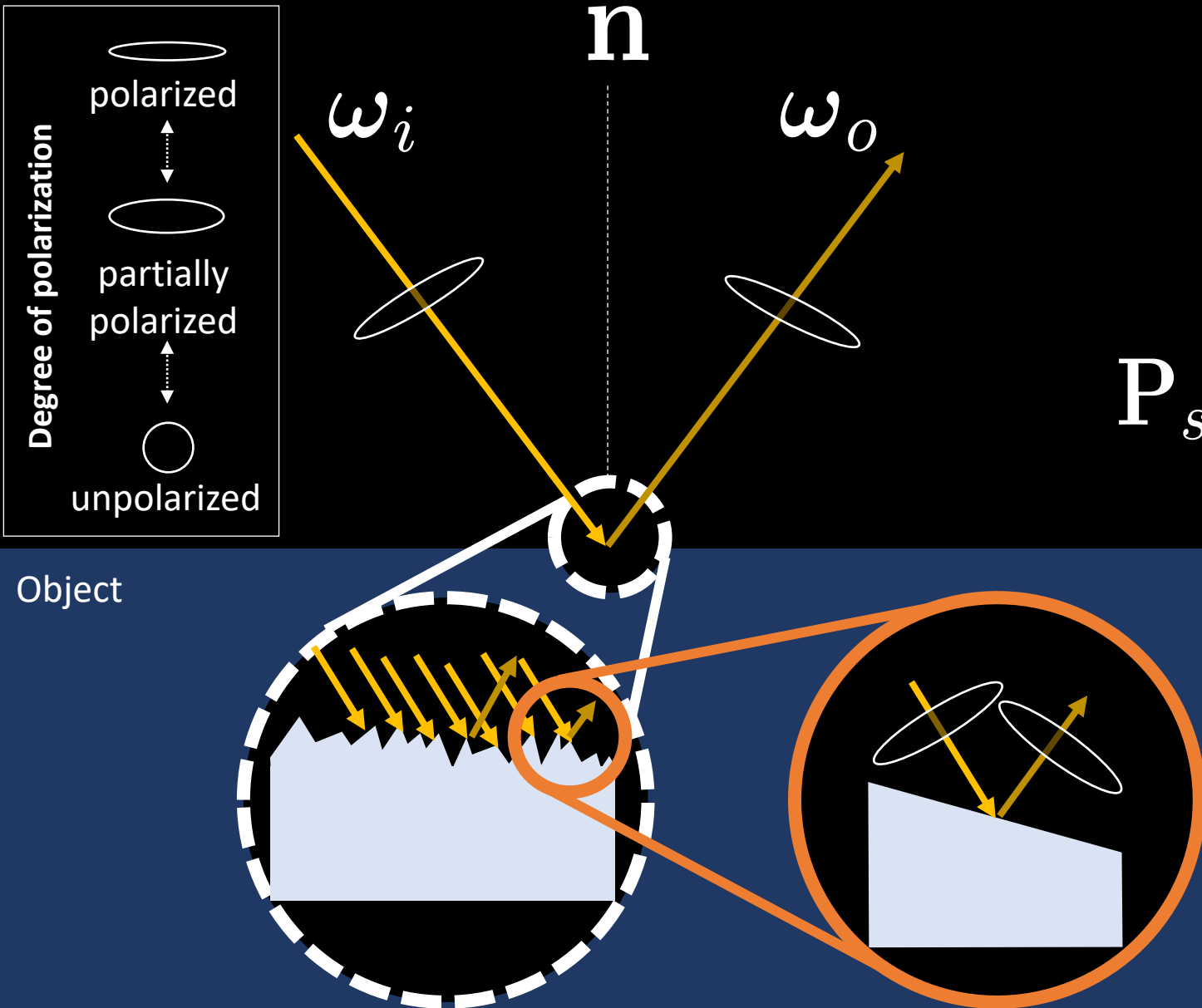
- Specular
- Single scattering
- Subsurface scattering



$$\mathbf{P} = \mathbf{P}_s + \mathbf{P}_{ss} + \mathbf{P}_{sss}$$



Polarimetric BSSRDF: Specular



$$\mathbf{s}_o = \mathbf{P}(\omega_i, \omega_o) \mathbf{s}_i$$

Baek et al. 2018.

Coordinate conversion Fresnel reflection Coordinate conversion

$$\mathbf{P}_s = \kappa_s \mathbf{C}_{h \rightarrow o} \mathbf{F}^R(\eta) \mathbf{C}_{i \rightarrow h}$$

Refractive index

Specular roughness

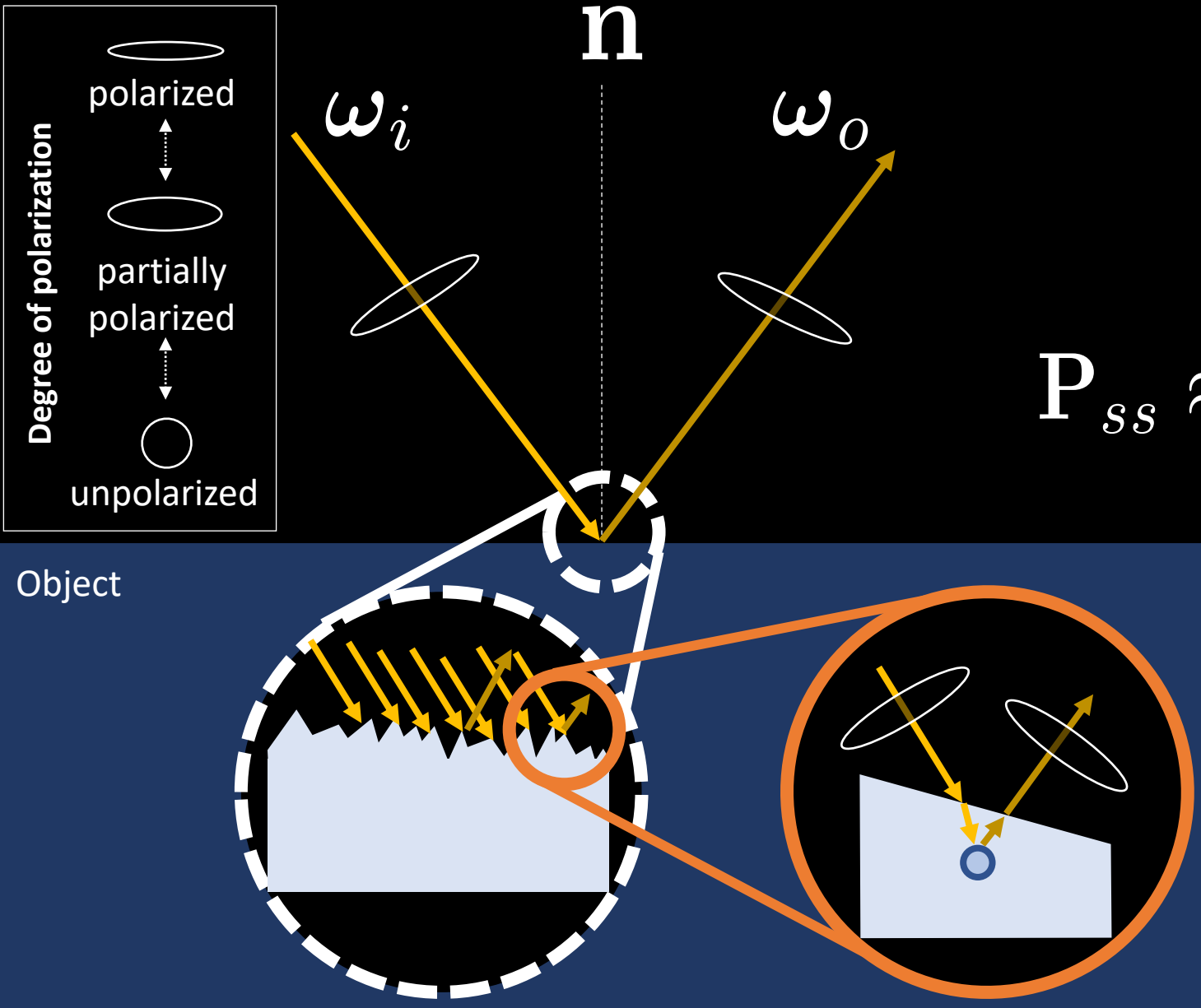
Normal distribution function ↑ Geometric shading

$$\kappa_s = \rho_s \frac{\mathcal{D}(\alpha_s) \mathcal{G}(\alpha_s)}{4(\mathbf{n} \cdot \omega_i)(\mathbf{n} \cdot \omega_o)}$$

Specular intensity

Normal

Polarimetric BSSRDF: Single Scattering



$$s_o = \mathbf{P}(\omega_i, \omega_o) s_i$$

Hwang et al. 2022.

Coordinate conversion Fresnel reflection Coordinate conversion

$$\mathbf{P}_{ss} \approx \kappa_{ss} \mathbf{C}_{h \rightarrow o} \mathbf{F}^{\mathcal{R}}(\eta) \mathbf{C}_{i \rightarrow h}$$

Refractive index

Single scat. roughness

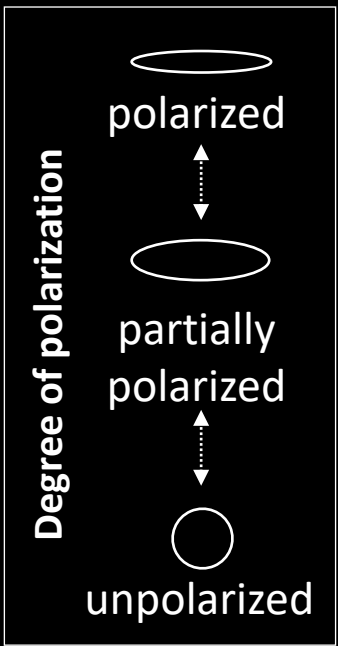
Normal distribution function ↑ Geometric shading

$$\kappa_{ss} = \rho_{ss} \frac{\mathcal{D}(a_{ss}) \mathcal{G}(a_{ss})}{4(\mathbf{n} \cdot \omega_i)(\mathbf{n} \cdot \omega_o)}$$

Single Scat. intensity

Normal

Polarimetric BSSRDF: Subsurface Scattering

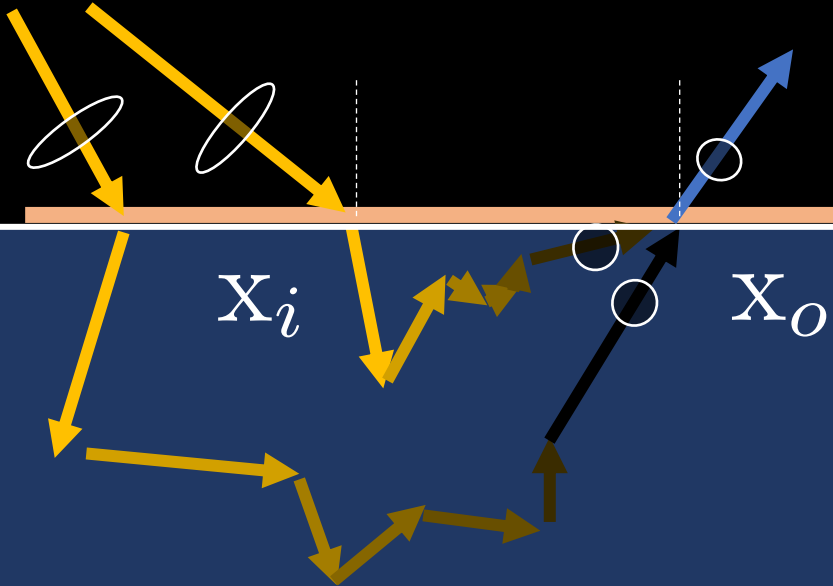


$$P_{SSS} = \sum_{\mathbf{x}_i \in \mathcal{S}} \mathbf{C}_{n \rightarrow 0} \mathbf{F}^T(\mathbf{x}_0) \mathbf{D}(\rho_{SSS}(\|\mathbf{x}_i - \mathbf{x}_0\|)) \cdot \mathbf{F}^T(\mathbf{x}_i) \mathbf{C}_{i \rightarrow n}$$

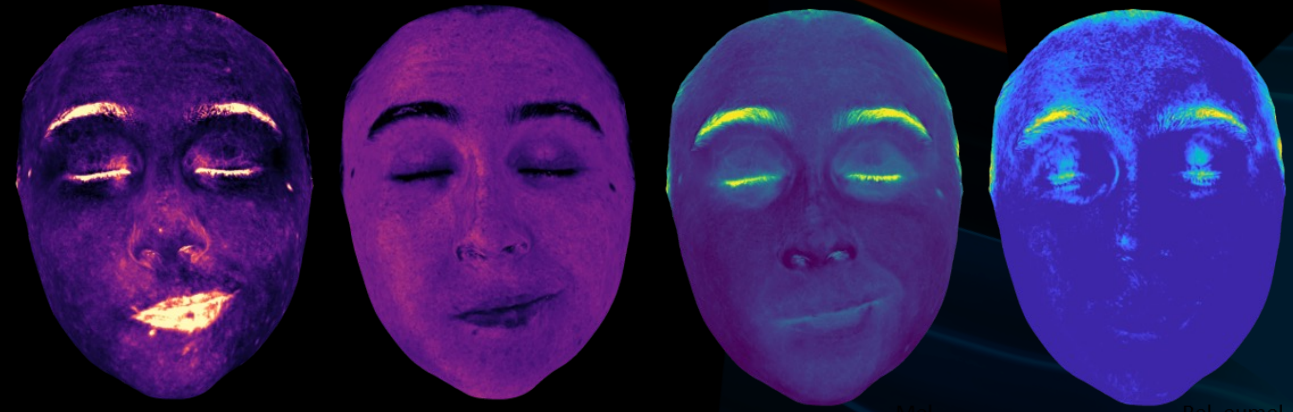
Depolarization
Fresnel transmittance

Subsurface scattering
Coordinate conversion

$$s_0 = \mathbf{P}(\omega_i, \omega_0) s_i$$



Biophysical Parameters



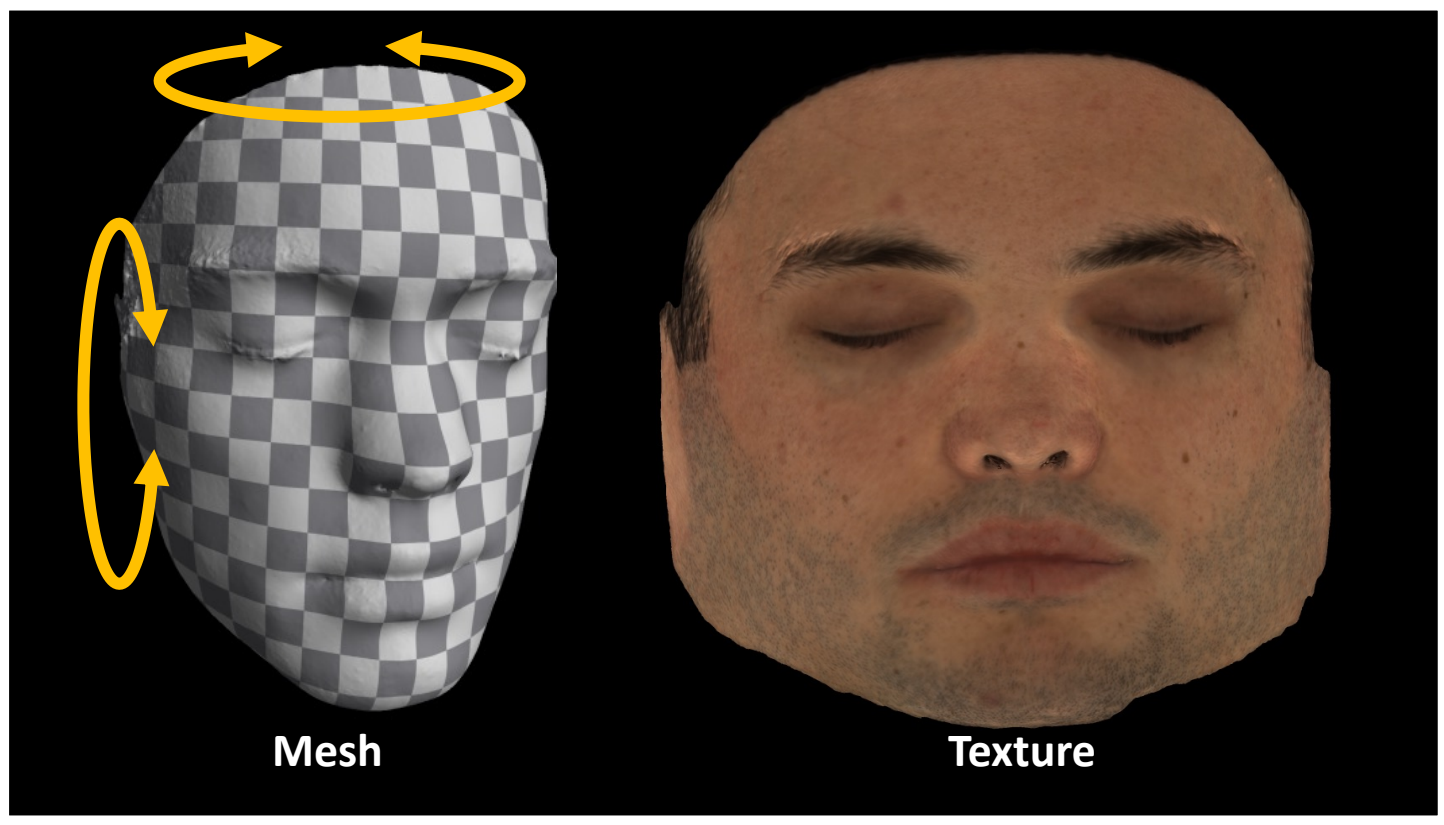
He. (outer) He. (inner) Melanin Rel. eumel.

Optimization Strategy



Static stage

Initial mesh and texture

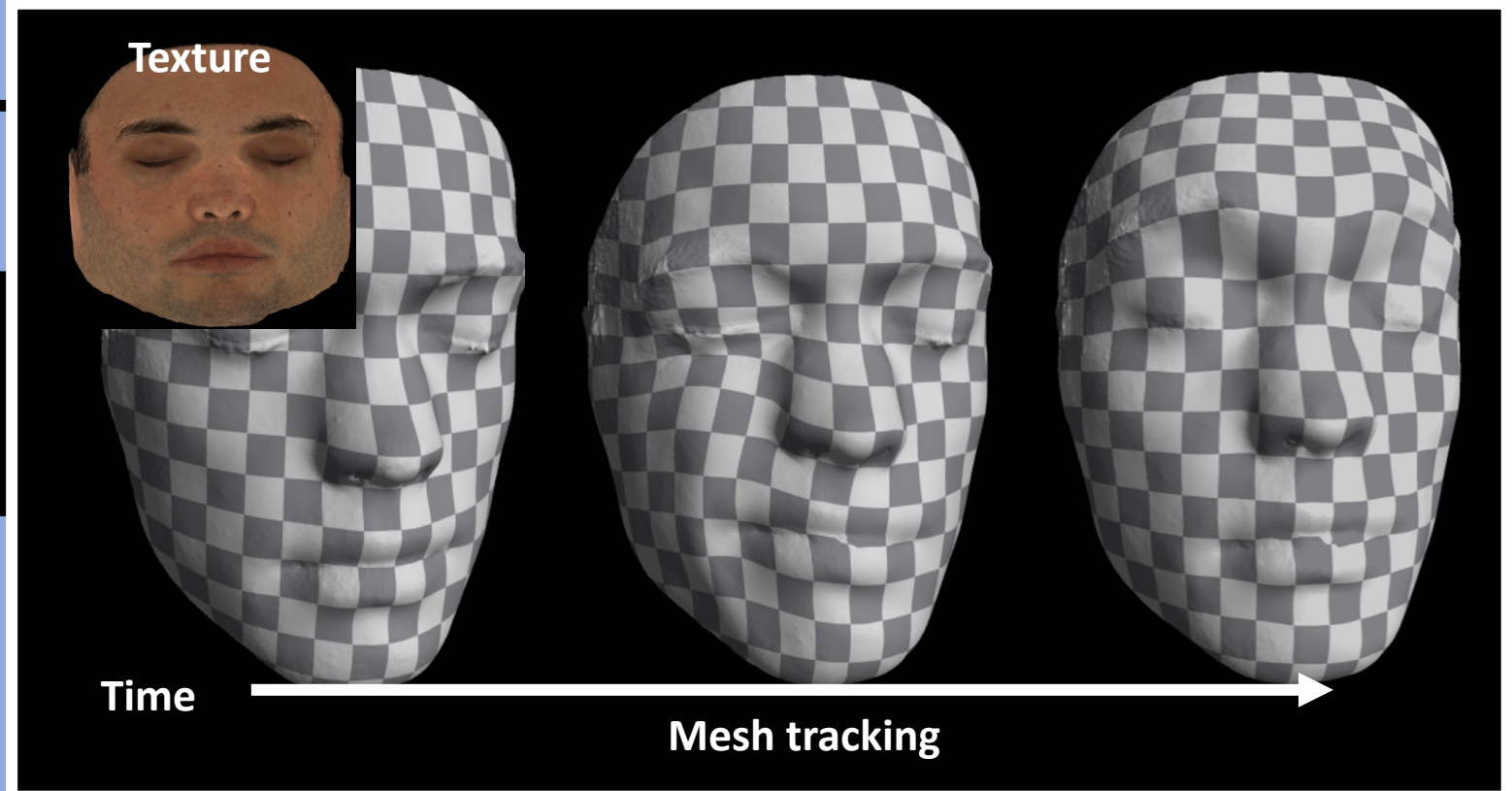


Optimization Strategy



Static stage

Initial mesh and texture

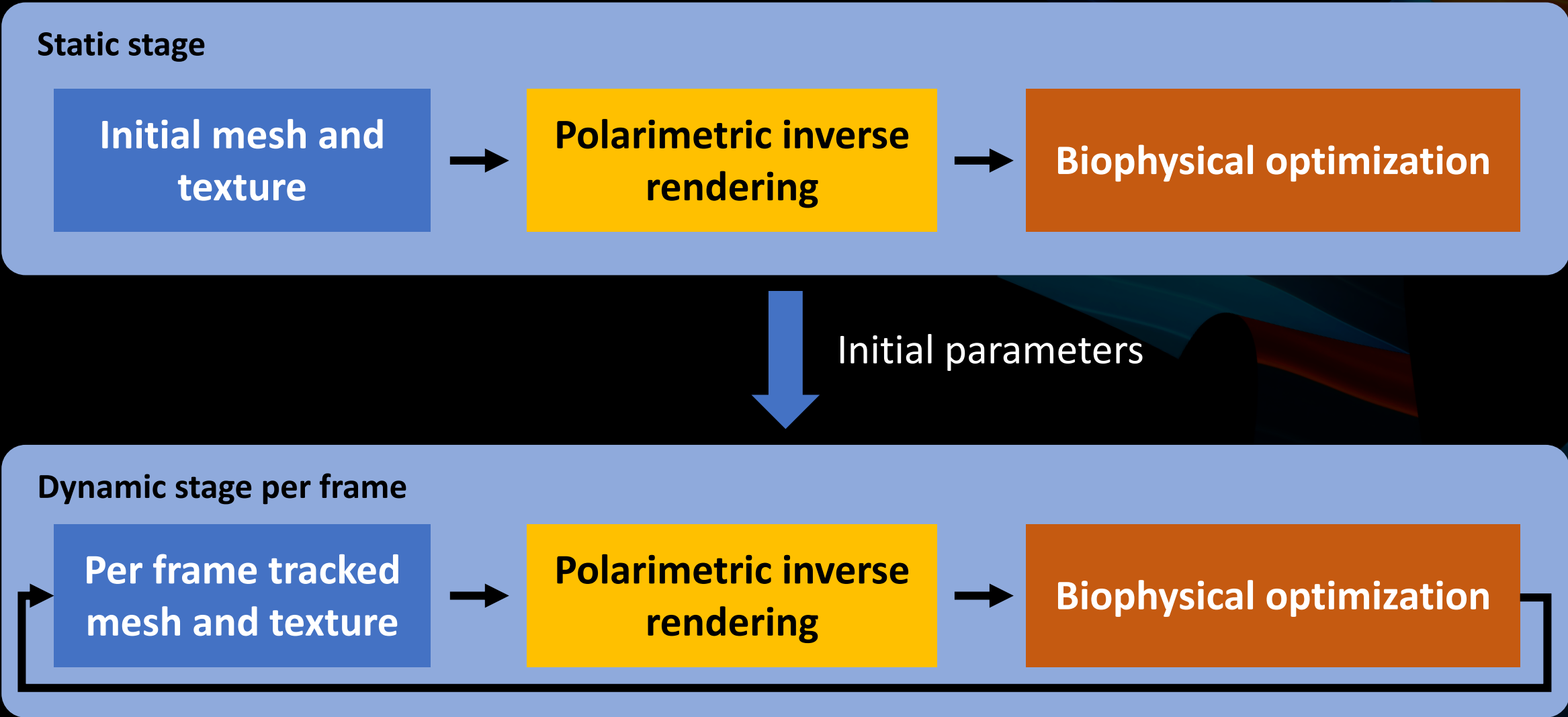


Dynamic stage per frame

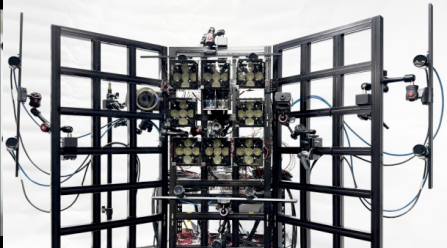
Per-frame tracked mesh and texture



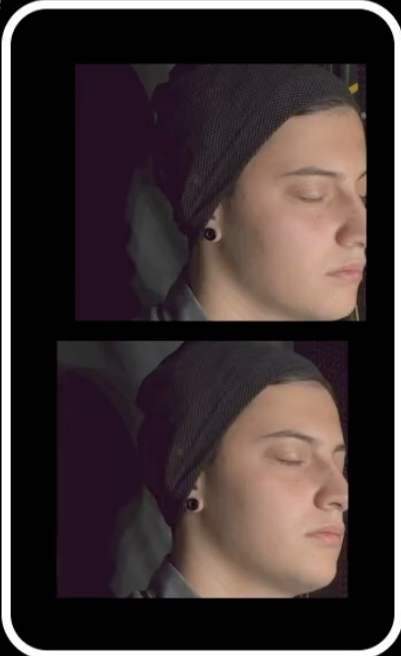
Optimization Strategy



Static Capture Stage



Hardware



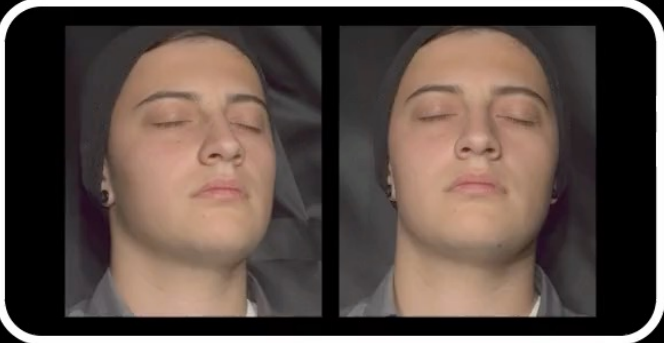
Stereo camera module

Stereo camera module



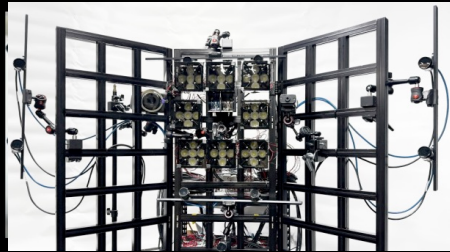
Dolby left polar. image Dolby right polar. image

Stereo camera module

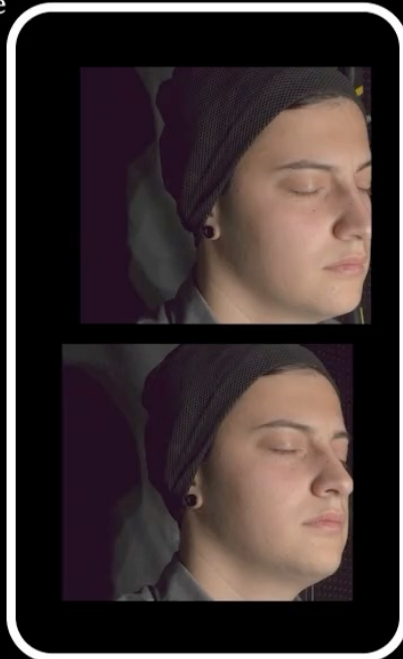


Stereo camera module

Dynamic Capture Stage



Hardware



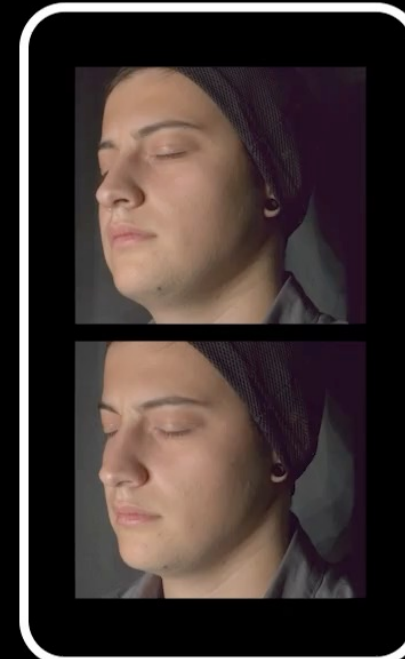
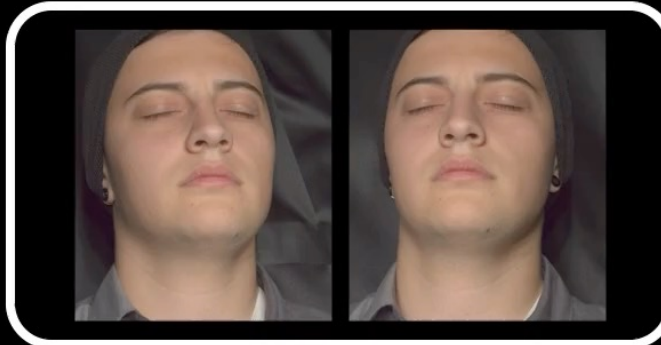
Stereo camera module

Stereo camera module



Dolby left polar. image Dolby right polar. image

Stereo camera module



Stereo camera module

Optimization of Polarimetric BSSRDF and Normal



$$\min_{\eta, \alpha_s, \alpha_{ss}, \rho_s, \rho_{ss}, \bar{\rho}_{sss}, H} \lambda_\psi \mathcal{L}_\psi + \lambda_{sss} \mathcal{L}_{sss} + \lambda_s \mathcal{L}_s + \lambda_\phi \mathcal{L}_\phi + \mathcal{L}_{\text{reg}}$$

\mathcal{L}_ψ : refractive index loss

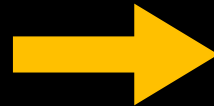
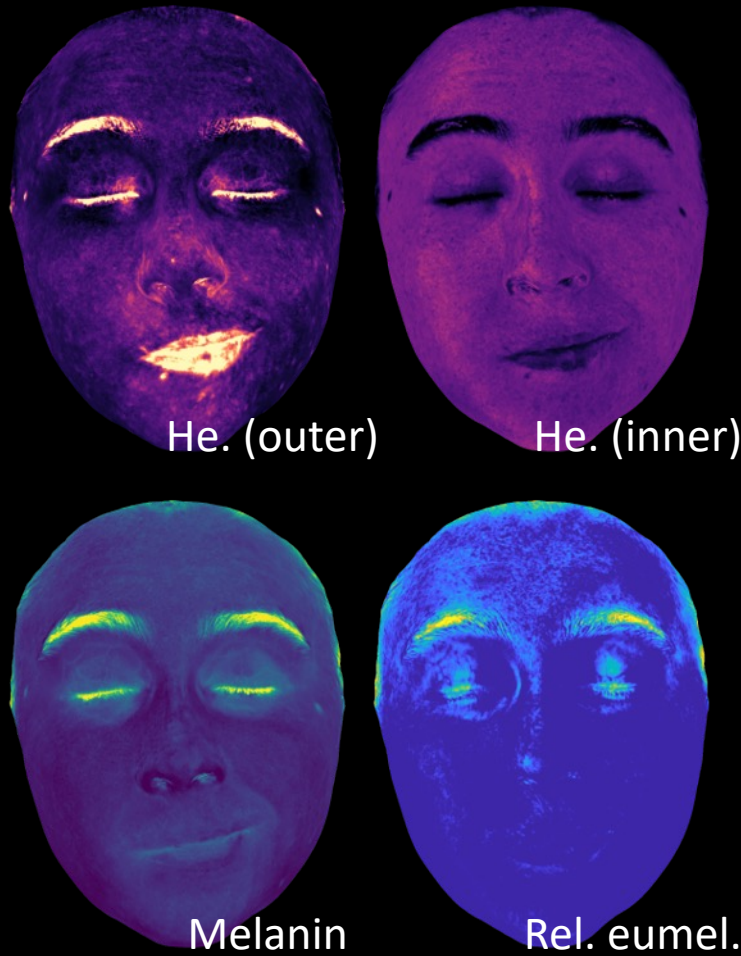
\mathcal{L}_s : specular and single scattering loss

\mathcal{L}_{sss} : subsurface scattering loss

\mathcal{L}_ϕ : normal loss

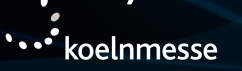


Optimization of Biophysical Parameters



Parameter map

Rendering each wavelength (420nm ~ 670nm)

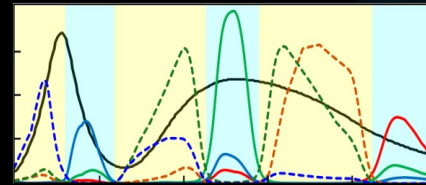


Optimization of Biophysical Parameters



Gradient descent

Camera response



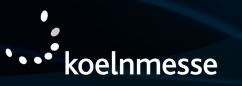
Dolby left



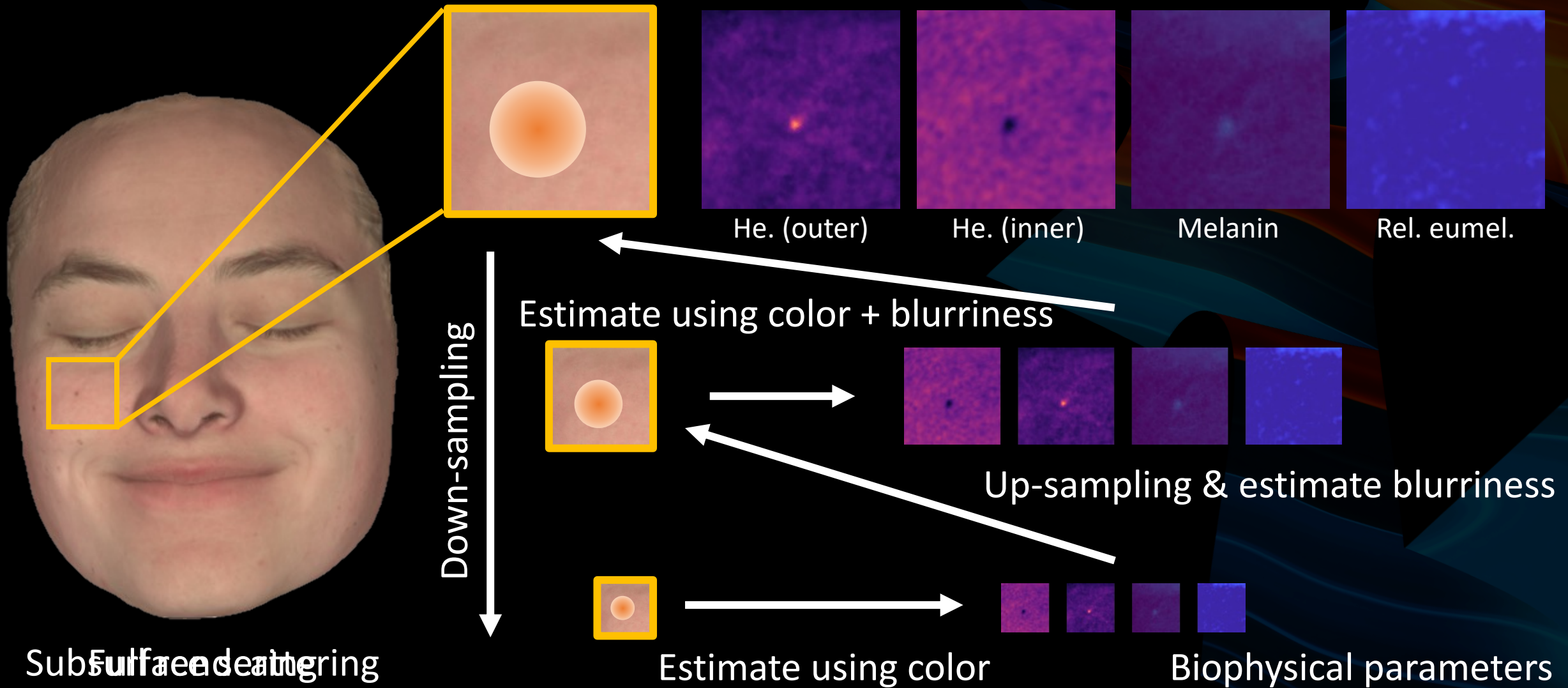
Dolby right

Rendering each wavelength (420nm ~ 670nm)

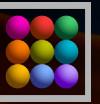
Target cameras



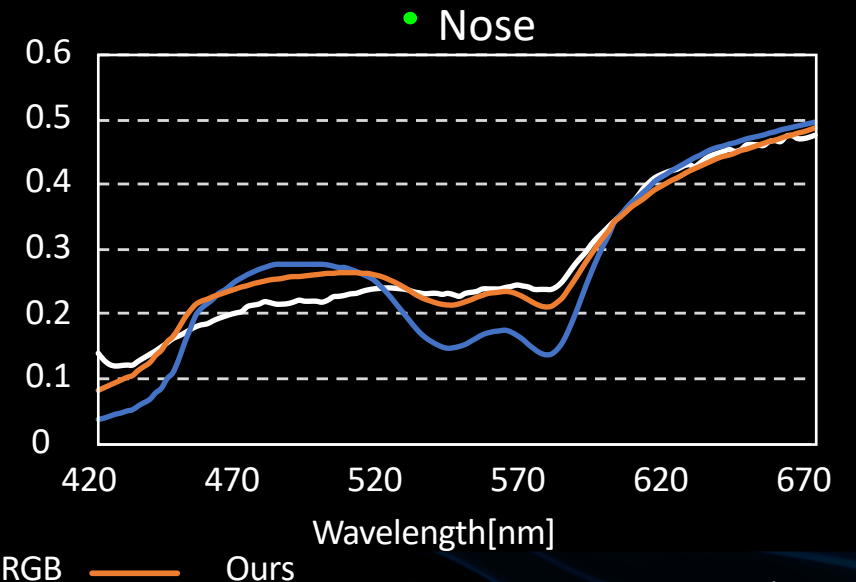
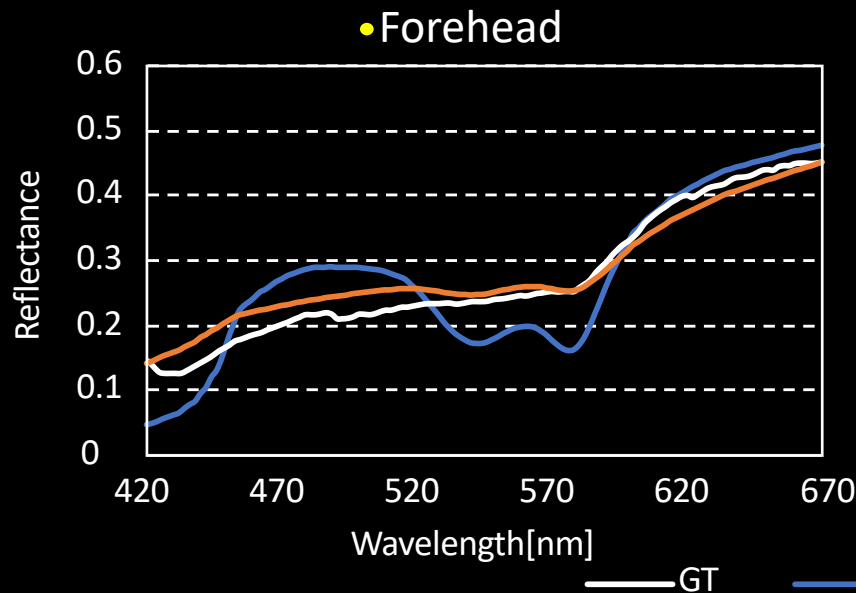
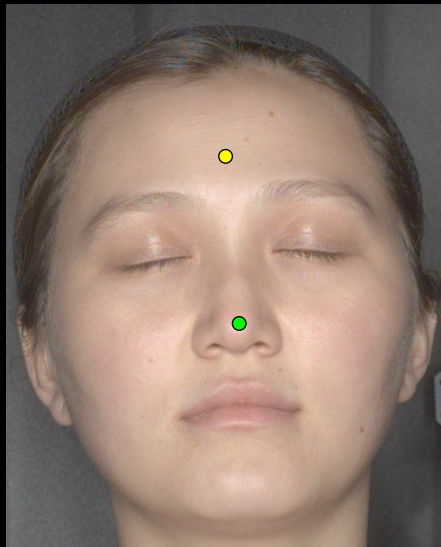
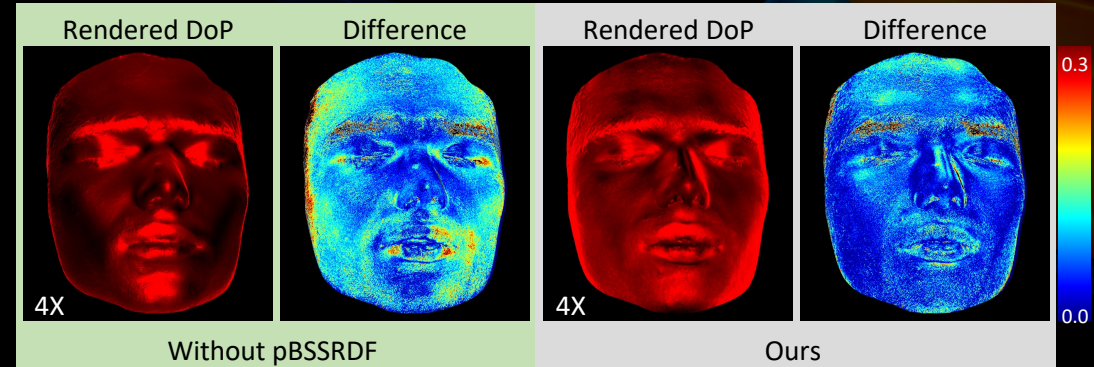
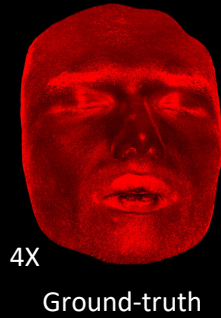
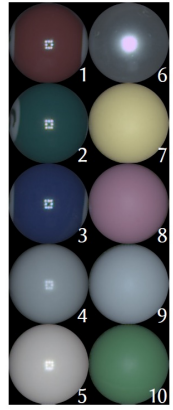
Hierarchical Optimization of Biophysical Parameters



Validation



Object	Material	η_{gt}	η_{ours}	Diff.
1	Red billiard	1.485	1.446	0.038
2	Green billiard	1.469	1.516	0.047
3	Blue billiard	1.504	1.503	0.001
4	White billiard	1.463	1.410	0.053
5	POM	1.462	1.447	0.015
6	Fake pearl	2.295	2.263	0.032
7	Yellow silicone	1.303	1.297	0.005
8	Pink silicone	1.177	1.211	0.034
9	White silicone	1.248	1.272	0.024
10	Light green silicone	1.343	1.311	0.032



↑↓
Cam. Light



Rotating a linear polarization filter on the camera

↑↓ ↔
Cam. Light

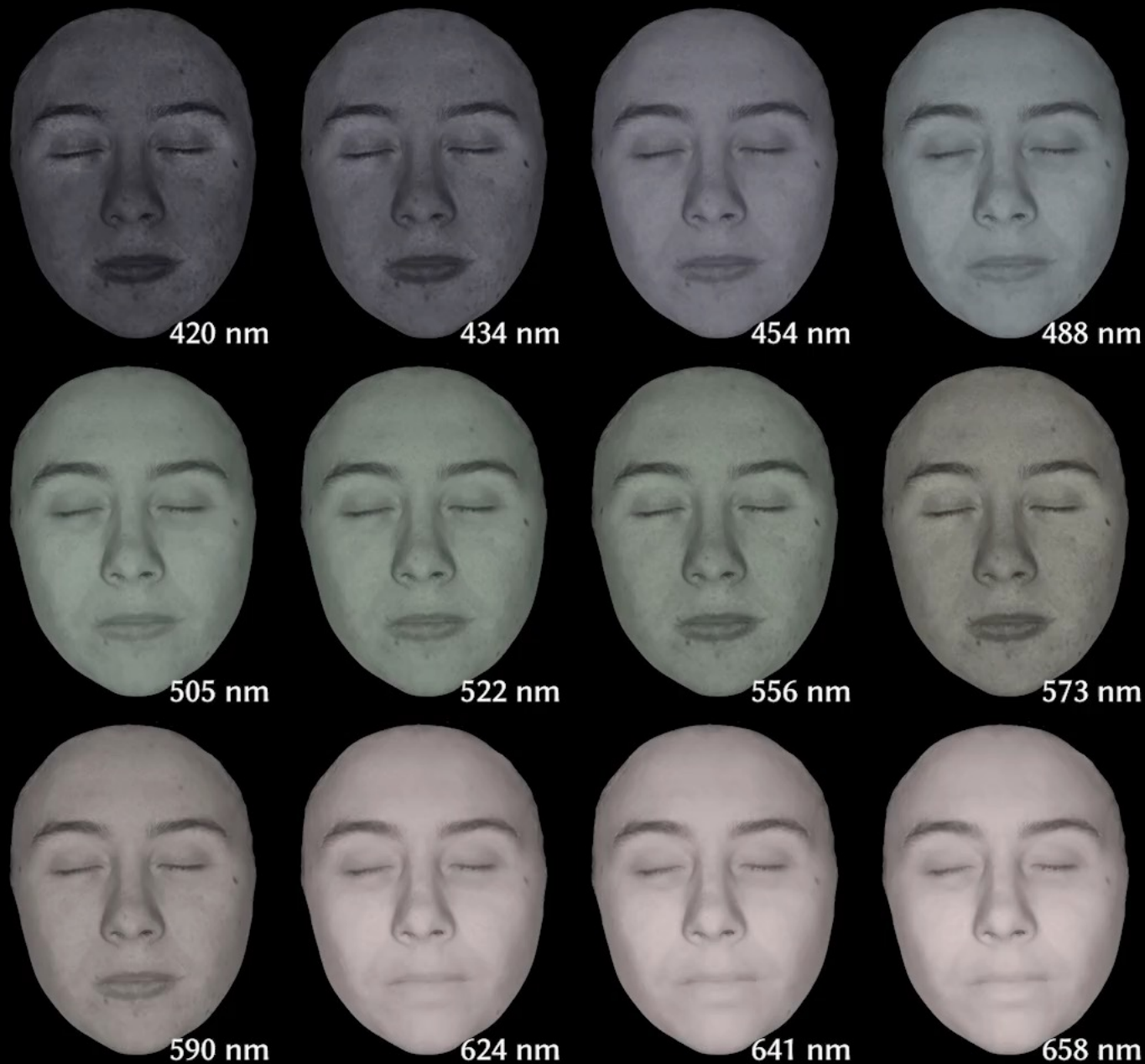


Rotating a linear polarization filter on the light

Polarization rendering



Full rendering



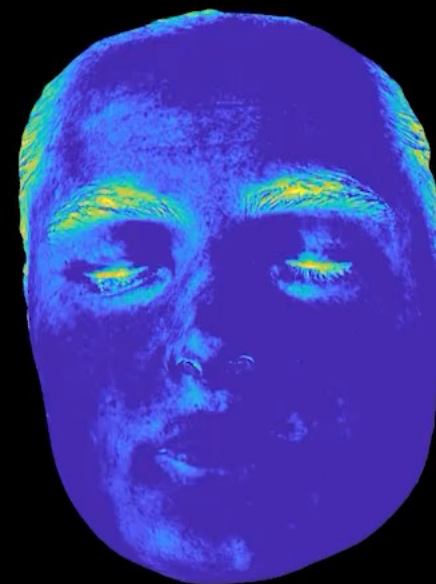
Multispectral two-layer subsurface scattering



Full rendering



Melanin



Relative eumelanin



Hemoglobin (outer)



Hemoglobin (inner)





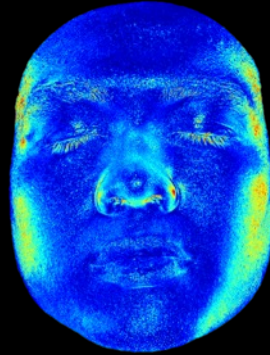
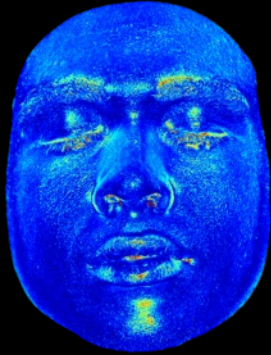
Pressing forehead

Comparison



Photograph

Difference



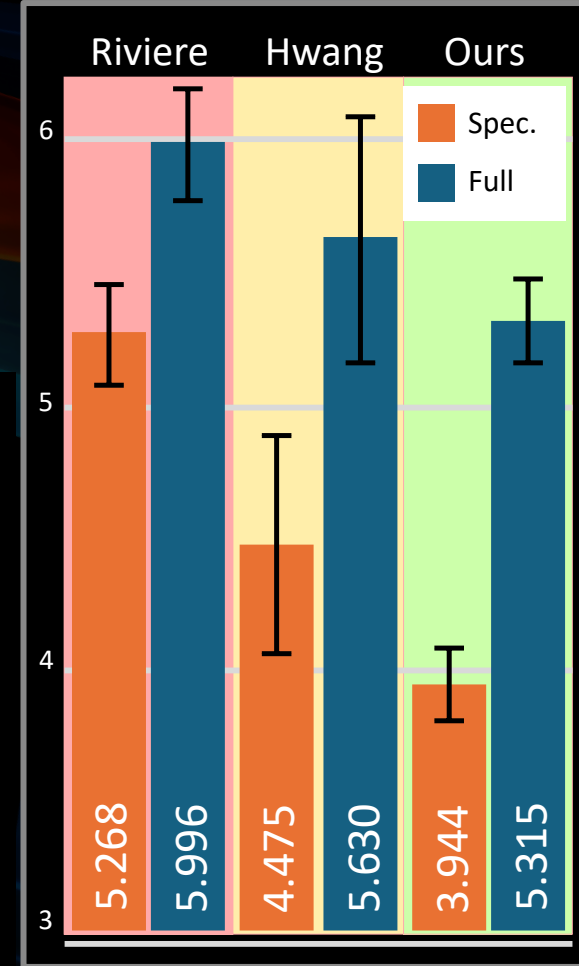
Full rendering (Riviere et al. [2020])



Full rendering (Hwang et al. [2022])



Full rendering (ours)

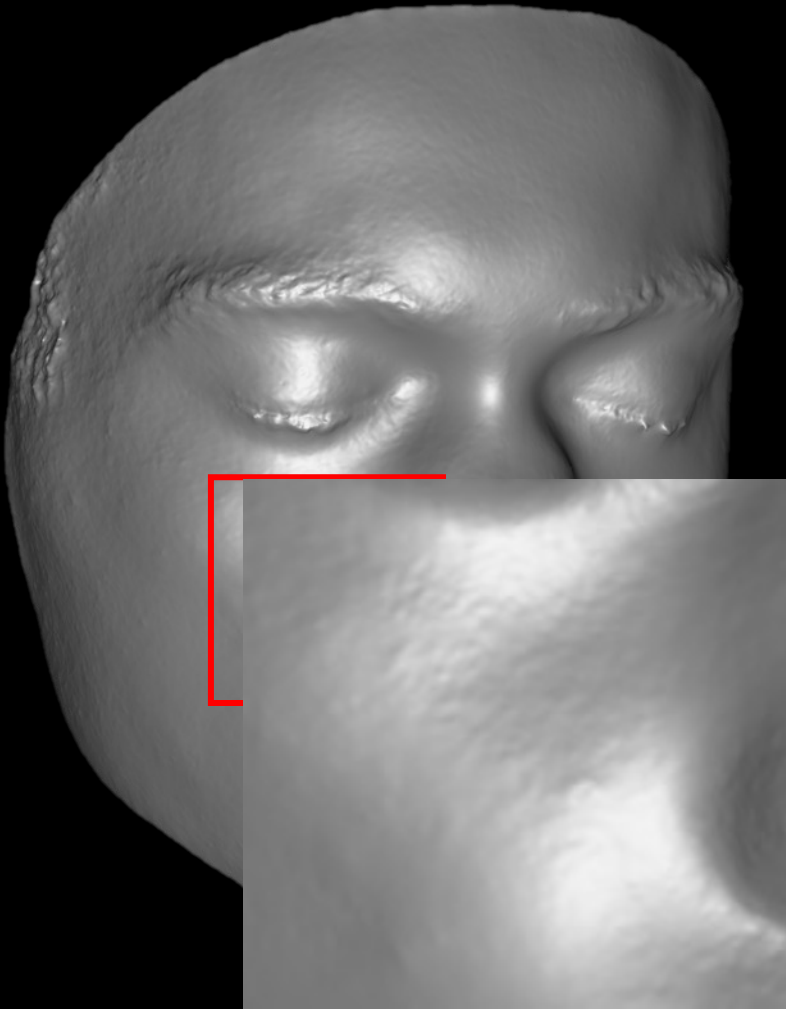


11 participants RMSE (X10⁻²)

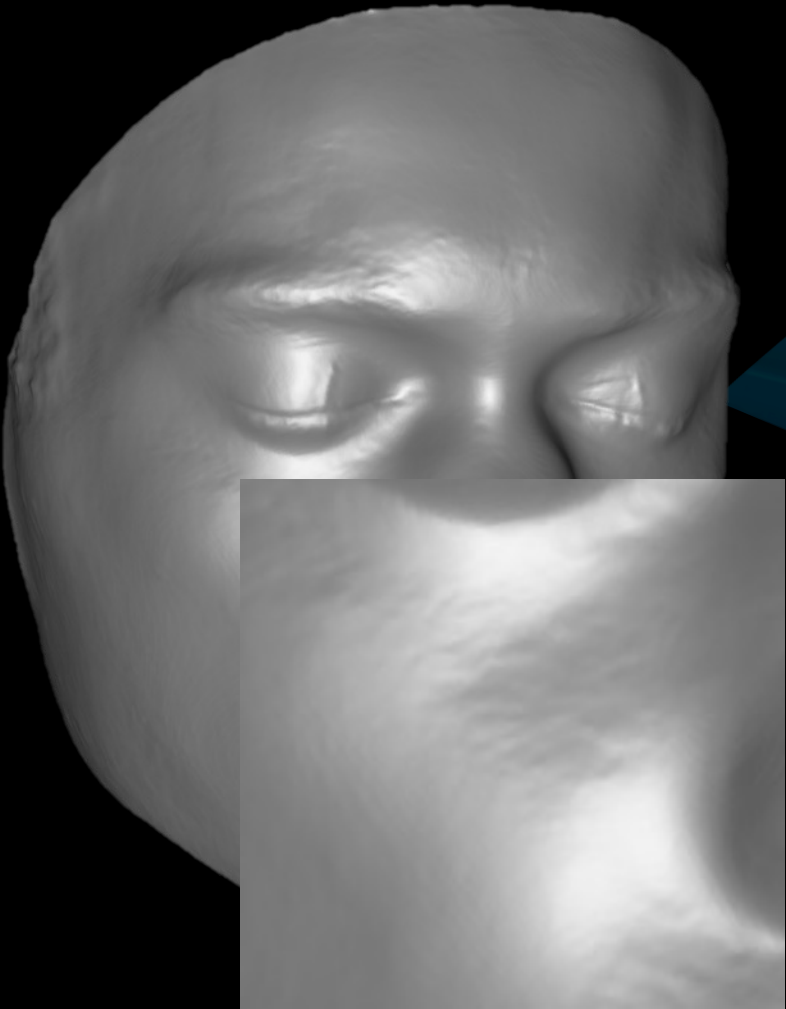


Organized by koelnmesse

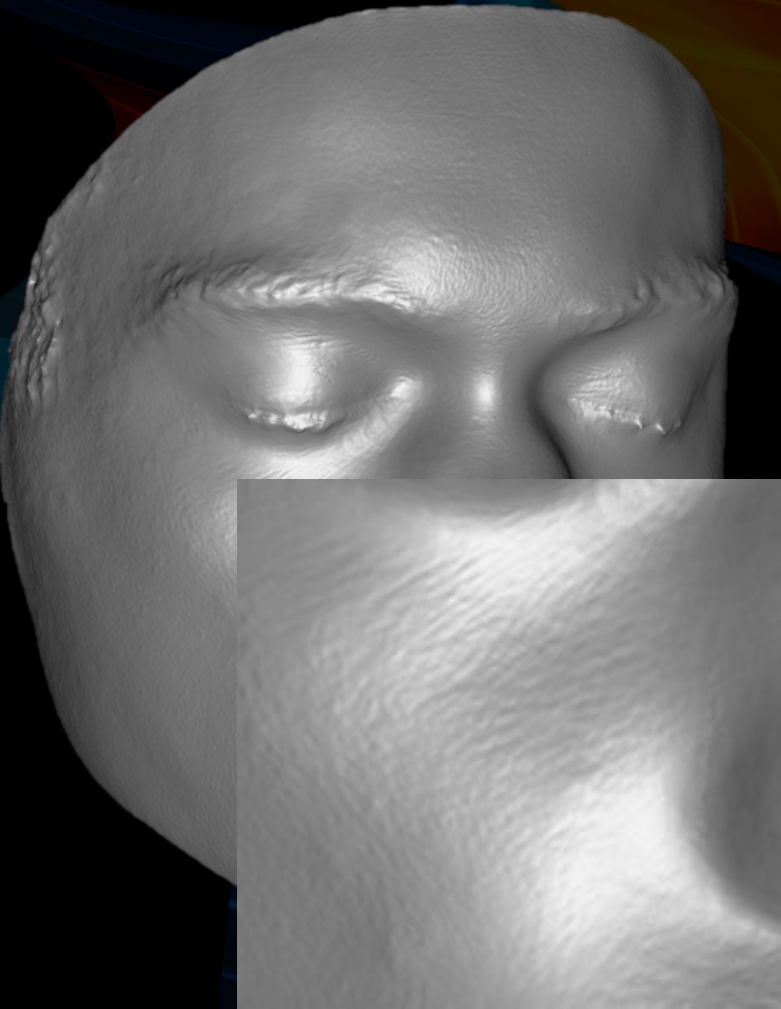
Geometry Comparison



Stereo matching (Beeler et al. 2010)

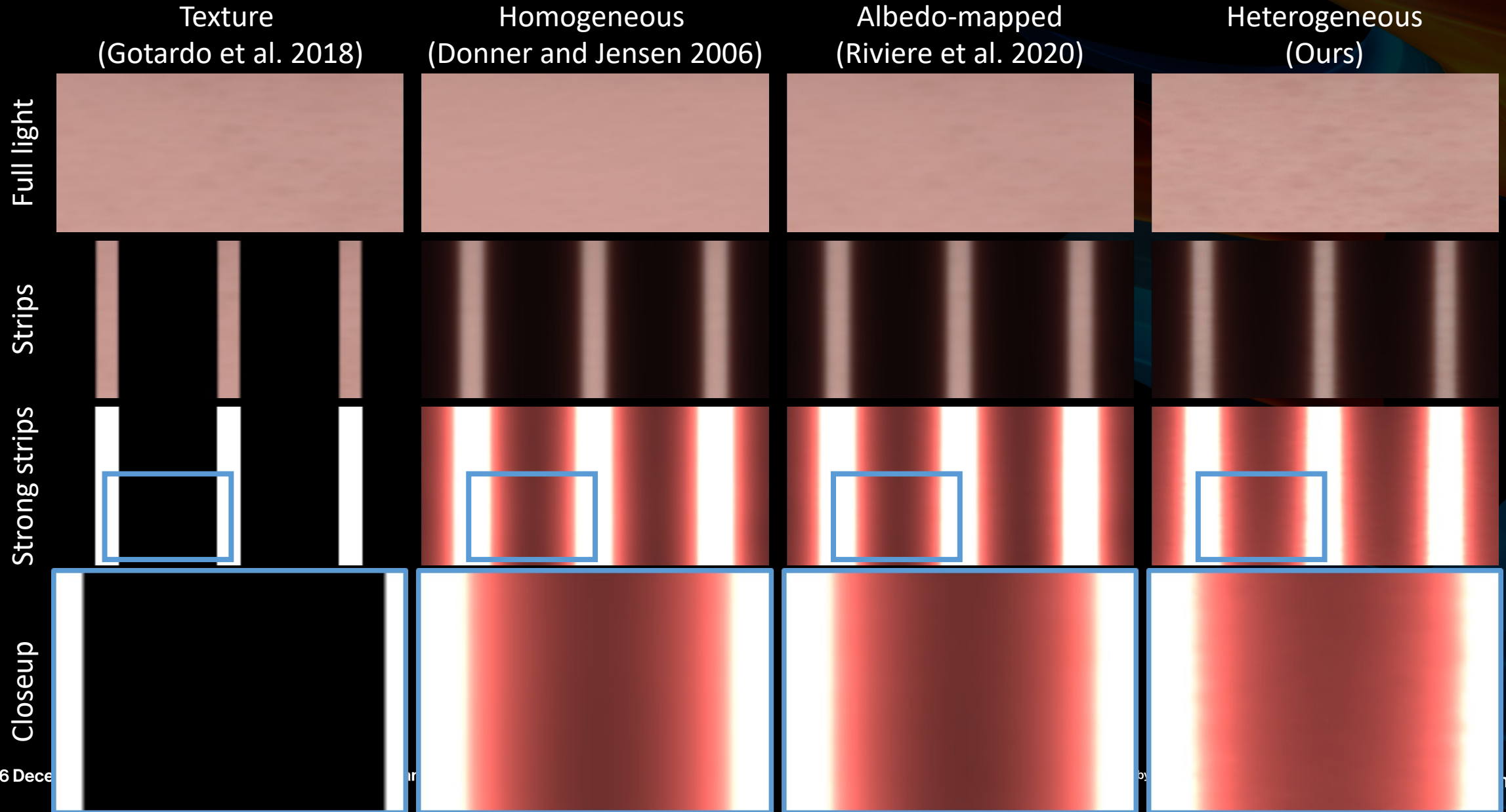


Hwang et al. 2022



Ours

Heterogeneous Multi-layered Translucent Materials



Editing Face Parameters



Photograph



Rendering



Increase outer hemoglobin



Increase melanin







Restrict by the two-layer skin model

- Future research could be on eyes and ears
- Darker skin cannot be estimated properly



Photo.



Render



He. (outer)



He. (inner)



Quality restricted by hardware

- Low resolution and SNR compared to RGB
- Near-coaxial setup of camera and light



Interactive discussion at **Table 8**

Project Website



<https://vclab.kaist.ac.kr/siggraphasia2024>

Thank you

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