
Light Transport Analysis

Introduction to Computational Photography

EECS 395/495

Northwestern University

Today

- Light Transport: Overview
- Image Relighting & Dual Photography
- Direct & Global Illumination Analysis

What is Light Transport?



object

What is Light Transport?

- 4D incident light field



$$R_i(u_i, v_i, \theta_i, \phi_i)$$

incident light field

What is Light Transport?

- 4D exitant light field



$$R_r(u_r, v_r, \theta_r, \phi_r)$$

exitant light field

What is Light Transport?

- 8D reflectant field



$$R(u_i, v_i, \theta_i, \phi_i ; u_r, v_r, \theta_r, \phi_r)$$

Since it is linear, we can represent as a matrix

Reflectance Field Storage Requirements

$$R (u_i, v_i, \theta_i, \phi_i ; u_r, v_r, \theta_r, \phi_r)$$

- 360 x 180 x 180 x 180 x 360 x 180 x 180 x 180
- = 4.4e18 measurements
- x 6 bytes/pixel (in RGB 16-bit)
- = 26 exabytes (billion GB)
- = 82 million 300GB hard drives
- (41 million if we exploit Helmholtz Reciprocity)



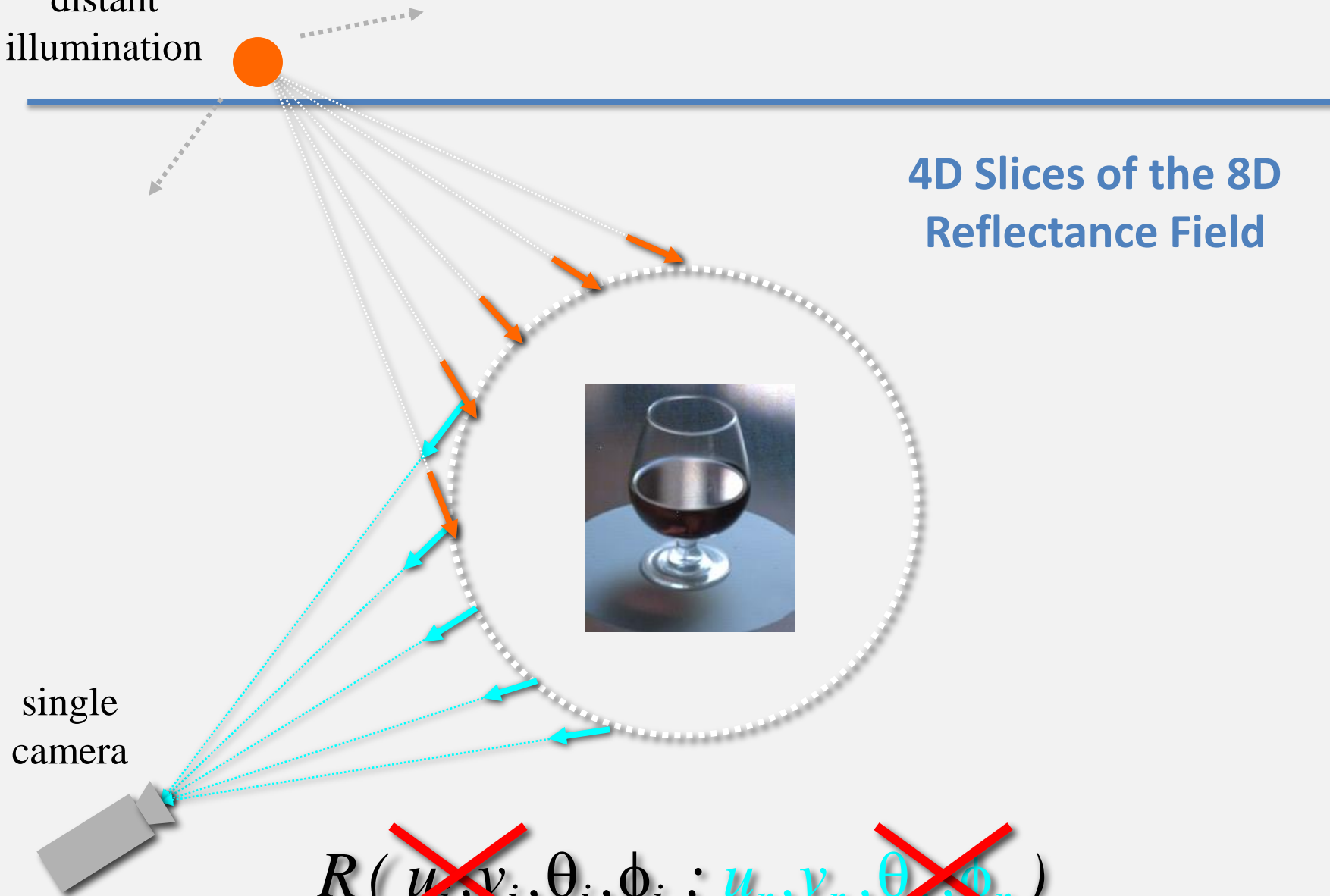
What is Light Transport

- Light transport matrix is very sparse
- Usually focus on subsets of the 8-D light transport
 - image relighting (4D)
 - dual photography (4D)

Today

- Light Transport: Overview
- Image Relighting & Dual Photography
- Direct & Global Illumination Analysis

distant
illumination



single
camera

$$R(\cancel{u_i}, \cancel{v_i}, \cancel{\theta_i}, \cancel{\phi_i}; u_r, v_r, \cancel{\theta_r}, \cancel{\phi_r})$$

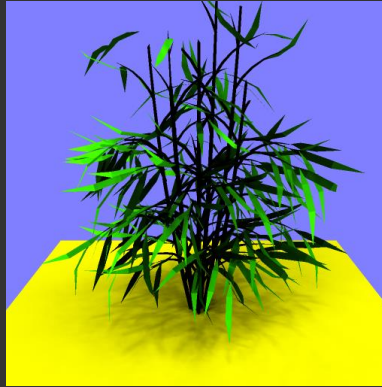
4D reflectance field

Relighting – Linear Combination

Nimeroff et al 94

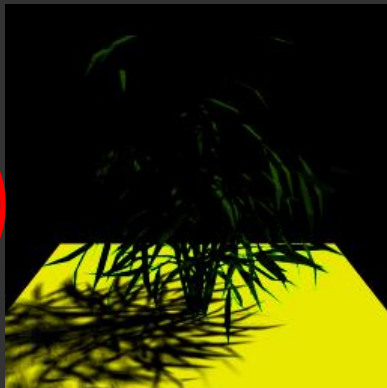
Hallinan 94

Dorsey 95



||

Lighting Intensities



+

l_2



+

.....

+

l_N



Images lit by directional light sources

Relighting – Matrix Vector Multiply

$$\begin{bmatrix} b_1 \\ b_2 \\ \vdots \\ b_M \end{bmatrix} = \begin{bmatrix} T_1 & T_2 & \dots & T_N \end{bmatrix} \begin{bmatrix} L_1 \\ L_2 \\ \vdots \\ L_M \end{bmatrix}$$

Output Image
Vector

T_1 T_2 \dots T_N
Transport Matrix

L_1 L_2 \dots L_M
Input Lighting
(Unfolded Cubemap)

l_1

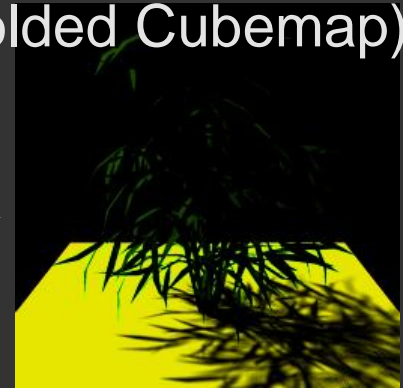


$+ l_2$



$+ \dots\dots\dots +$

l_N

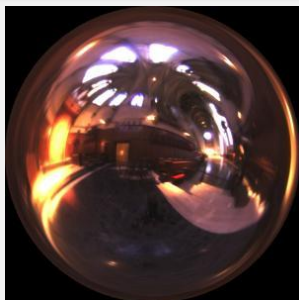


Light Stage 1

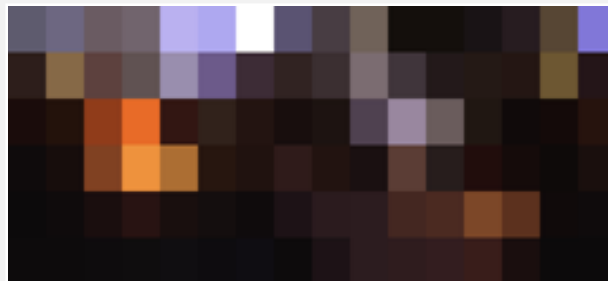
Debevec, Hawkins,
Tchou, Duiker, Sarokin,
and Sagar. *Acquiring
the Reflectance Field
of a Human Face.*
SIGGRAPH 2000.

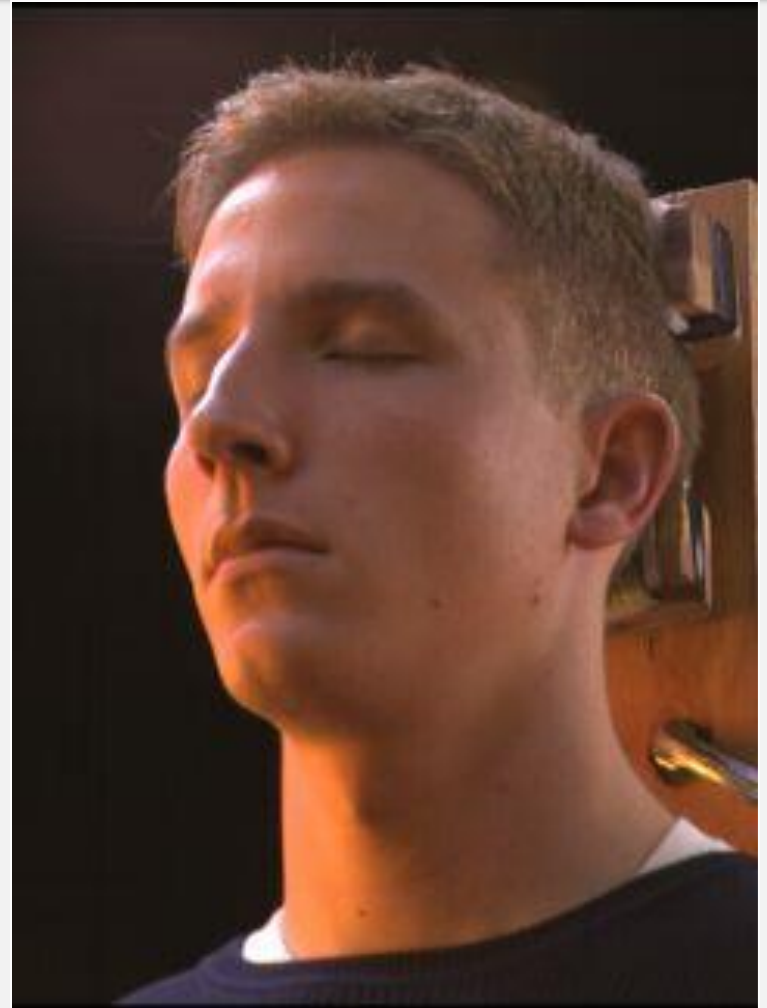
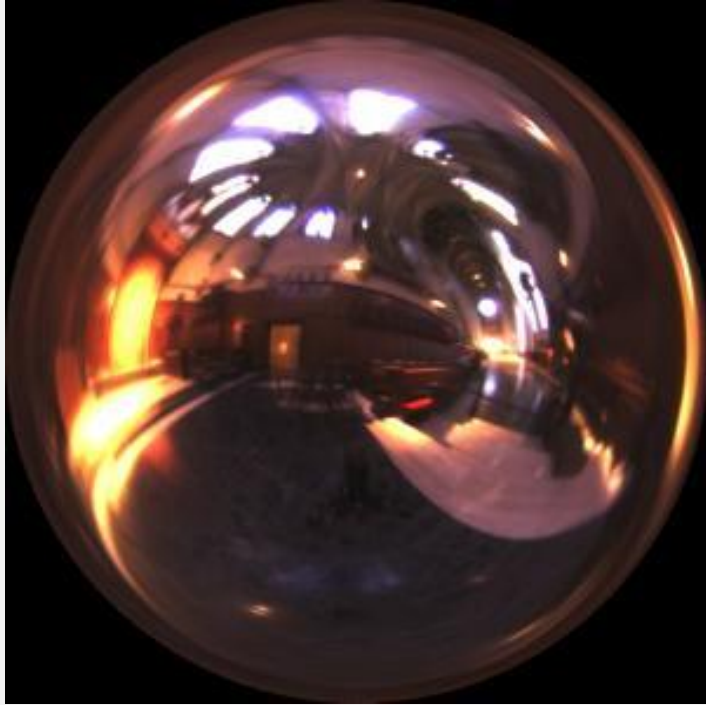


Light Stage 4D Reflectance Field

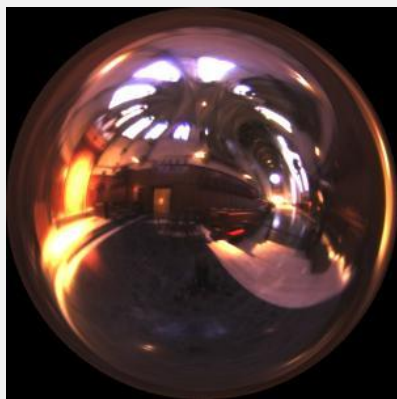
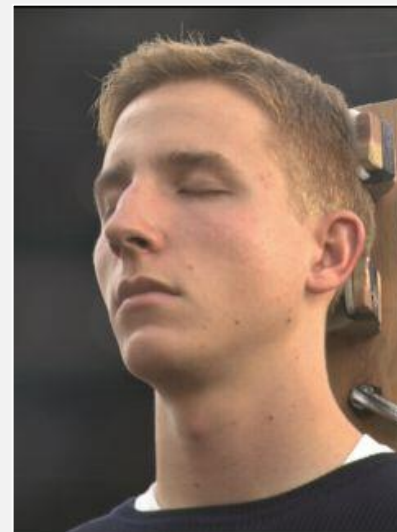
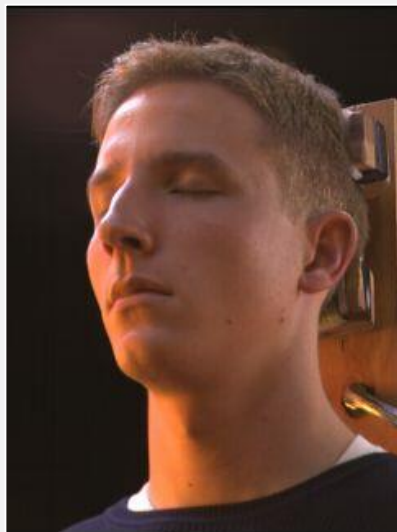


Light Stage 4D Reflectance Field





Relighting Results

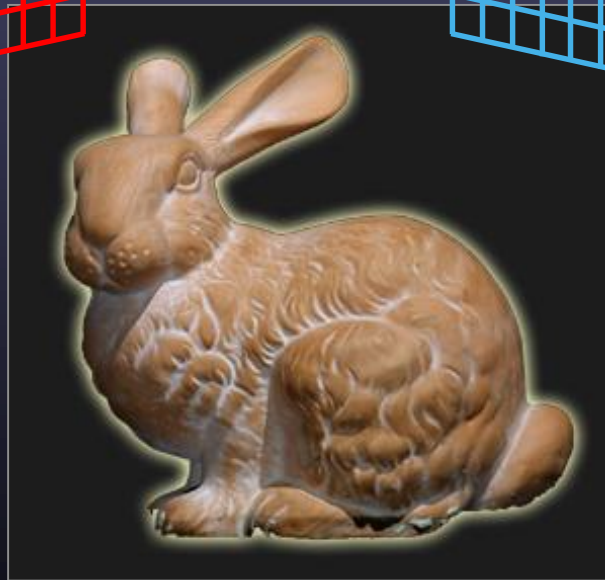
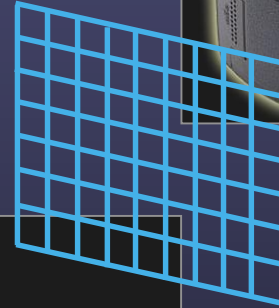
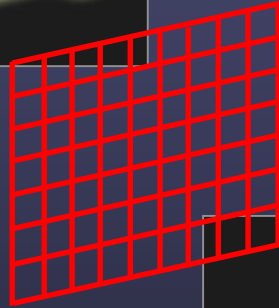


Dual Photography: The 4D transport matrix

projector



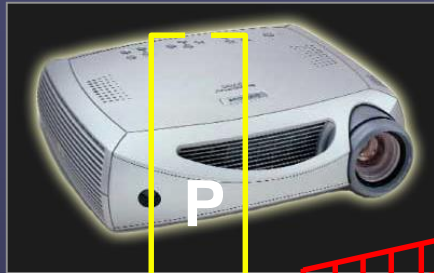
photocall



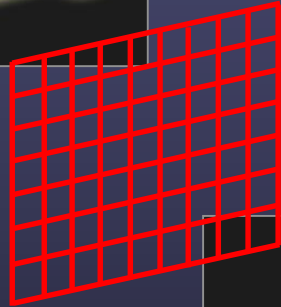
scene

The 4D transport matrix

projector



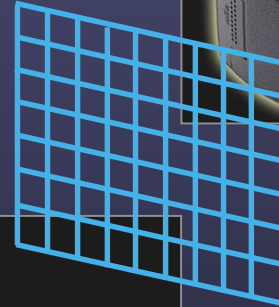
$pq \times 1$



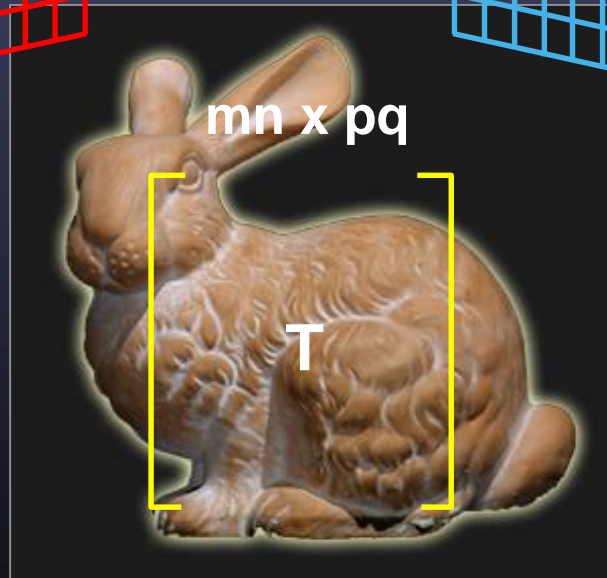
camera



$mn \times 1$



$mn \times pq$



scene

The 4D transport matrix

$$\begin{array}{c} \left[\begin{array}{c} \text{C} \end{array} \right] \\ \text{mn} \times 1 \end{array} = \begin{array}{c} \text{mn} \times \text{pq} \\ \left[\begin{array}{c} \text{T} \end{array} \right] \end{array} \begin{array}{c} \left[\begin{array}{c} \text{P} \end{array} \right] \\ \text{pq} \times 1 \end{array}$$

The 4D transport matrix

$$\begin{array}{c} \left[\begin{array}{c} C \end{array} \right] \\ mn \times 1 \end{array} = \begin{array}{c} mn \times pq \\ \left[\begin{array}{c} \text{orange bar} \end{array} \right] \end{array} T \begin{array}{c} \left[\begin{array}{c} 1 \\ 0 \\ 0 \\ 0 \\ 0 \end{array} \right] \\ pq \times 1 \end{array}$$

The 4D transport matrix

$$\begin{array}{c} \left[\begin{array}{c} C \end{array} \right] \\ mn \times 1 \end{array} = \begin{array}{c} mn \times pq \\ \left[\begin{array}{c} \text{brown bar} \quad \text{orange bar} \end{array} \right] T \end{array} \begin{array}{c} \left[\begin{array}{c} 0 \\ 1 \\ 0 \\ 0 \\ 0 \end{array} \right] \\ pq \times 1 \end{array}$$

The 4D transport matrix

$$\begin{array}{c} \left[\begin{array}{c} C \end{array} \right] \\ mn \times 1 \end{array} = \begin{array}{c} mn \times pq \\ \left[\begin{array}{c} \text{3 vertical bars: 2 brown, 1 orange} \end{array} \right] T \end{array} \begin{array}{c} \left[\begin{array}{c} 0 \\ 0 \\ 1 \\ 0 \\ 0 \end{array} \right] \\ pq \times 1 \end{array}$$

The 4D transport matrix

$$\begin{array}{c} \left[\begin{array}{c} \text{C} \end{array} \right] \\ \text{mn} \times 1 \end{array} = \begin{array}{c} \text{mn} \times \text{pq} \\ \left[\begin{array}{c} \text{T} \end{array} \right] \end{array} \begin{array}{c} \left[\begin{array}{c} \text{P} \end{array} \right] \\ \text{pq} \times 1 \end{array}$$

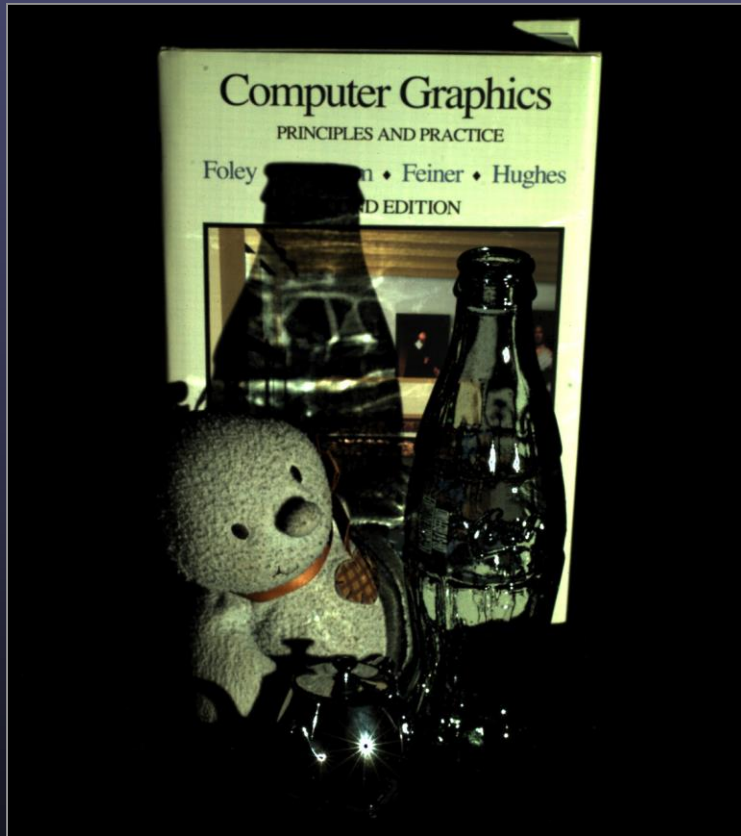
The 4D transport matrix

$$\begin{array}{c} \text{mn x pq} \\ \left[\begin{array}{c} \mathbf{C} \end{array} \right] = \left[\begin{array}{c} \mathbf{T} \end{array} \right] \left[\begin{array}{c} \mathbf{P} \end{array} \right] \\ \text{mn x 1} \qquad \qquad \text{pq x 1} \end{array}$$

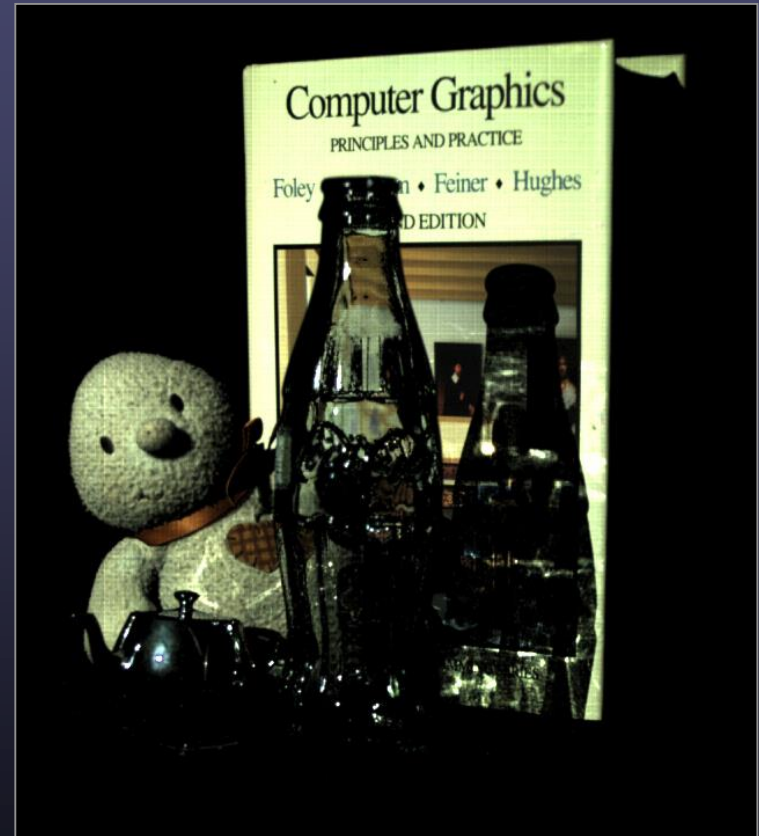
applying Helmholtz reciprocity...

$$\begin{array}{c} \text{pq x mn} \\ \left[\begin{array}{c} \mathbf{C}' \end{array} \right] = \left[\begin{array}{c} \mathbf{T}^T \end{array} \right] \left[\begin{array}{c} \mathbf{P}' \end{array} \right] \\ \text{pq x 1} \qquad \qquad \text{mn x 1} \end{array}$$

Example



conventional photograph
with light coming from right



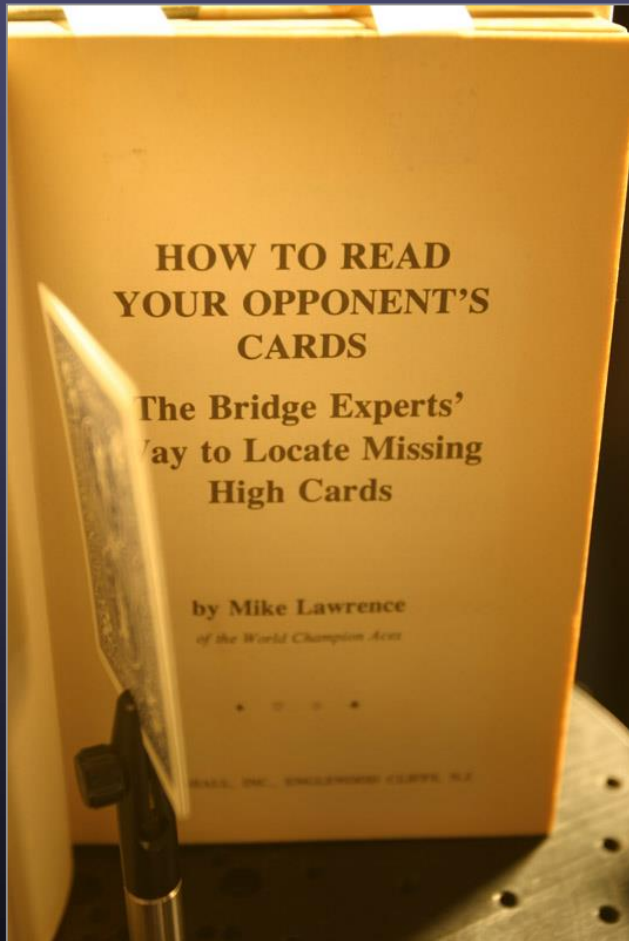
dual photograph
as seen from projector's position

Properties of the transport matrix

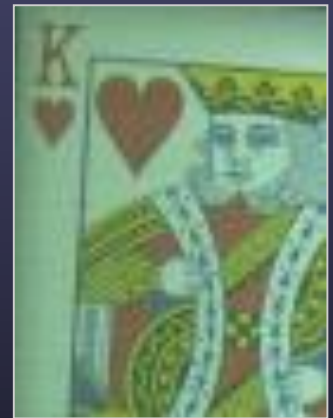
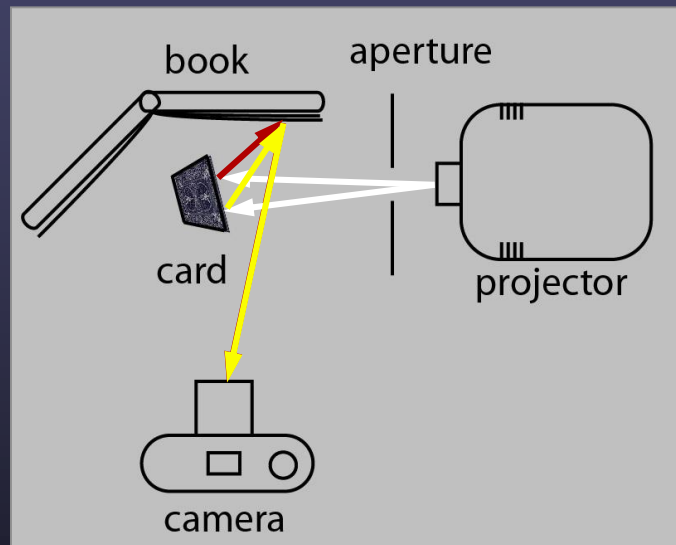
- little interreflection \rightarrow sparse matrix
- many interreflections \rightarrow dense matrix
- convex object \rightarrow diagonal matrix
- concave object \rightarrow full matrix

Can we create a dual photograph entirely from diffuse reflections?

Dual photography from diffuse reflections



the camera's view

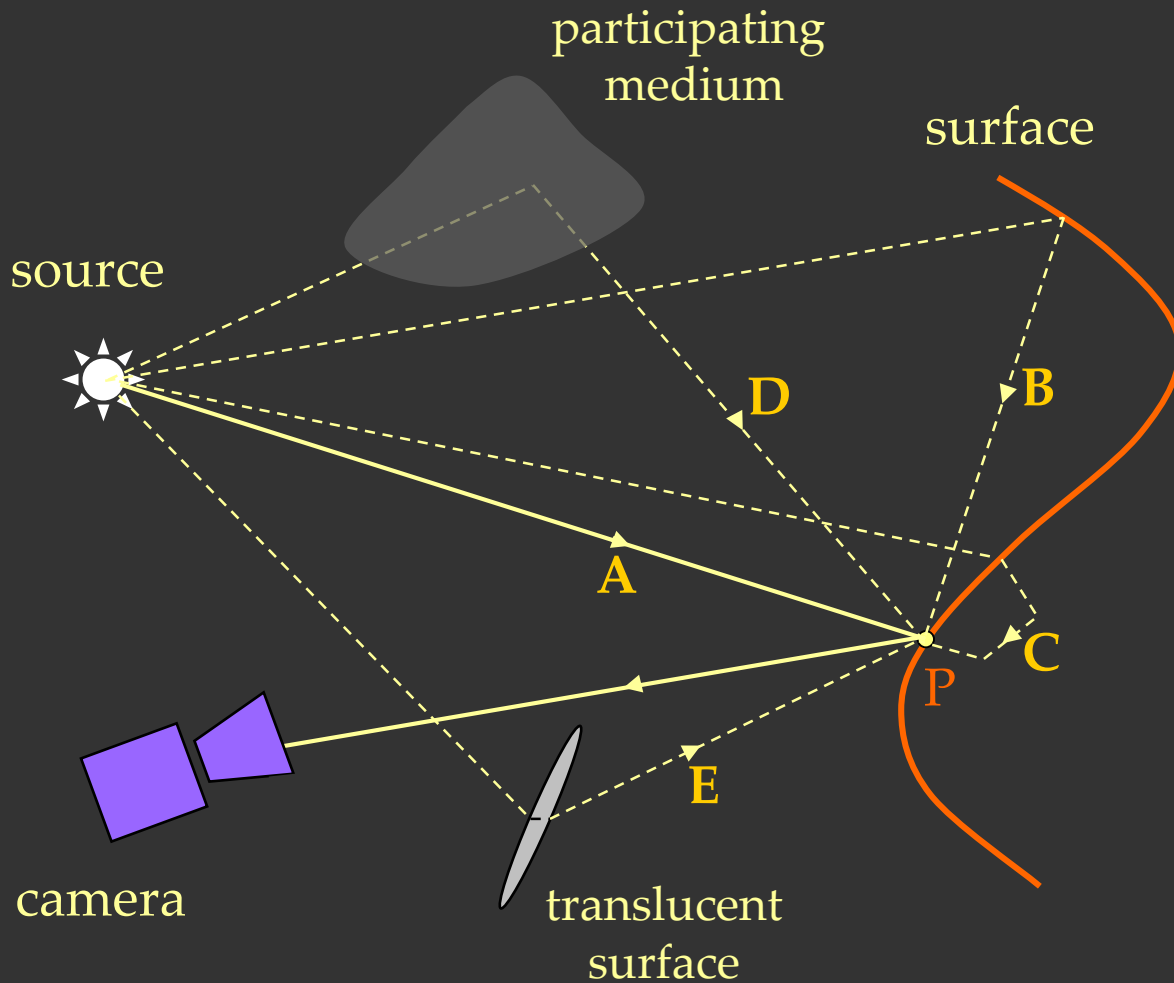


VIDEO

Today

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- Direct & Global Illumination Analysis

Direct and Global Illumination



A : Direct

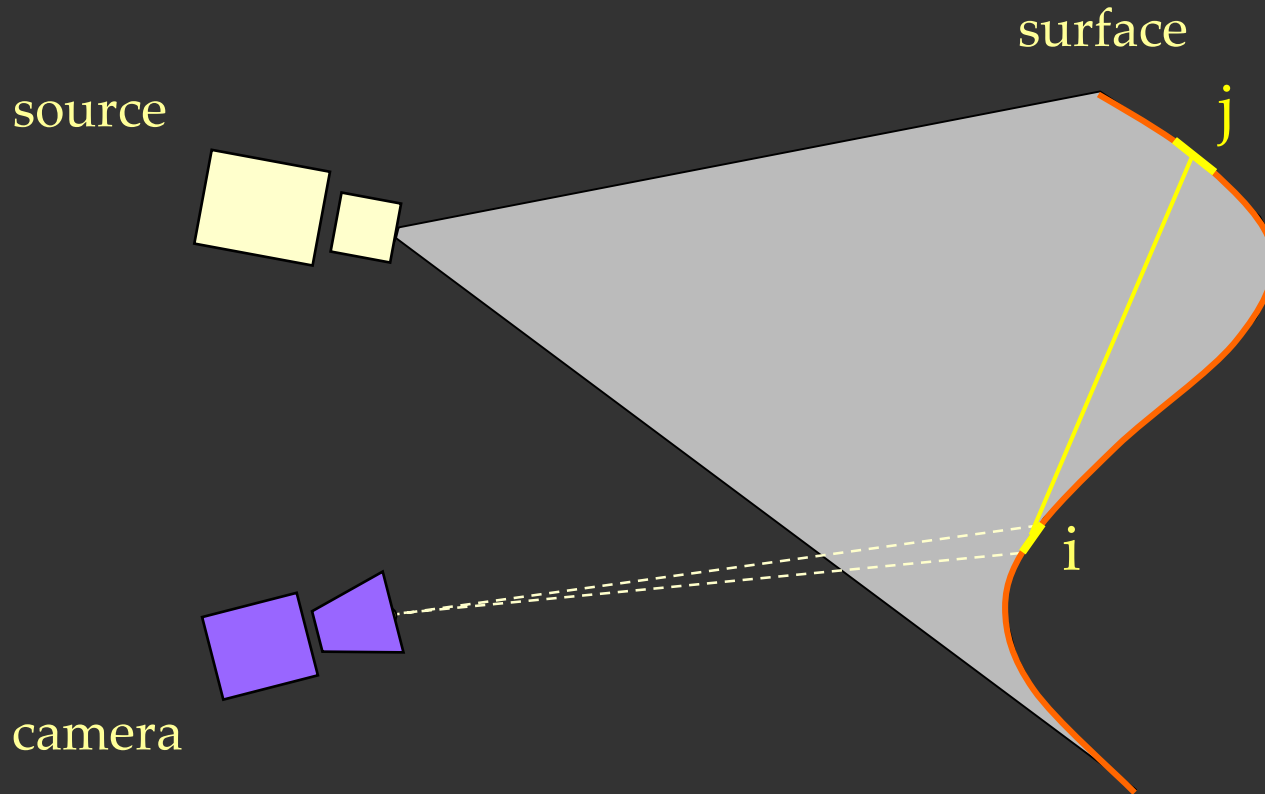
B : Interreflection

C : Subsurface

D : Volumetric

E : Diffusion

Direct and Global Components: Interreflections



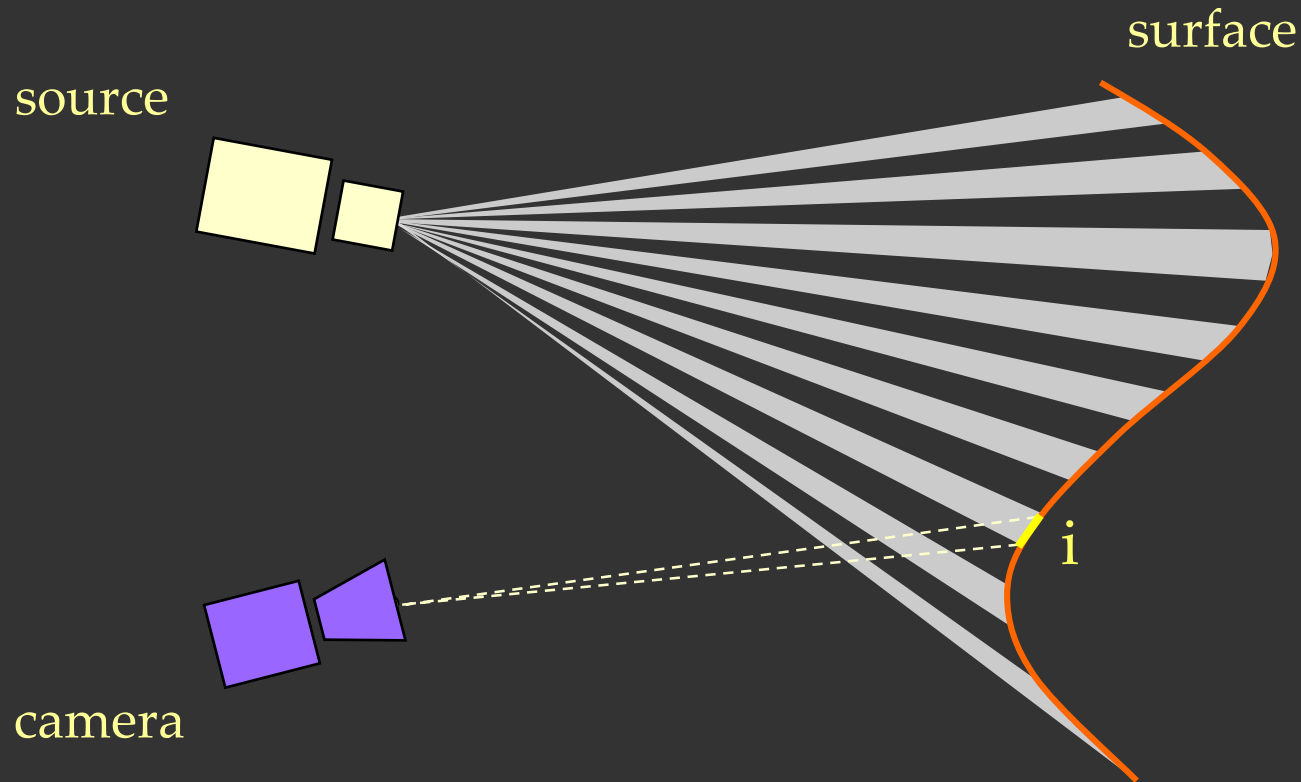
$$L[c,i] = L_d[c,i] + L_g[c,i]$$

radiance direct global

$$L_g[c,i] = \sum_P A[i,j] L[i,j]$$

BRDF and geometry

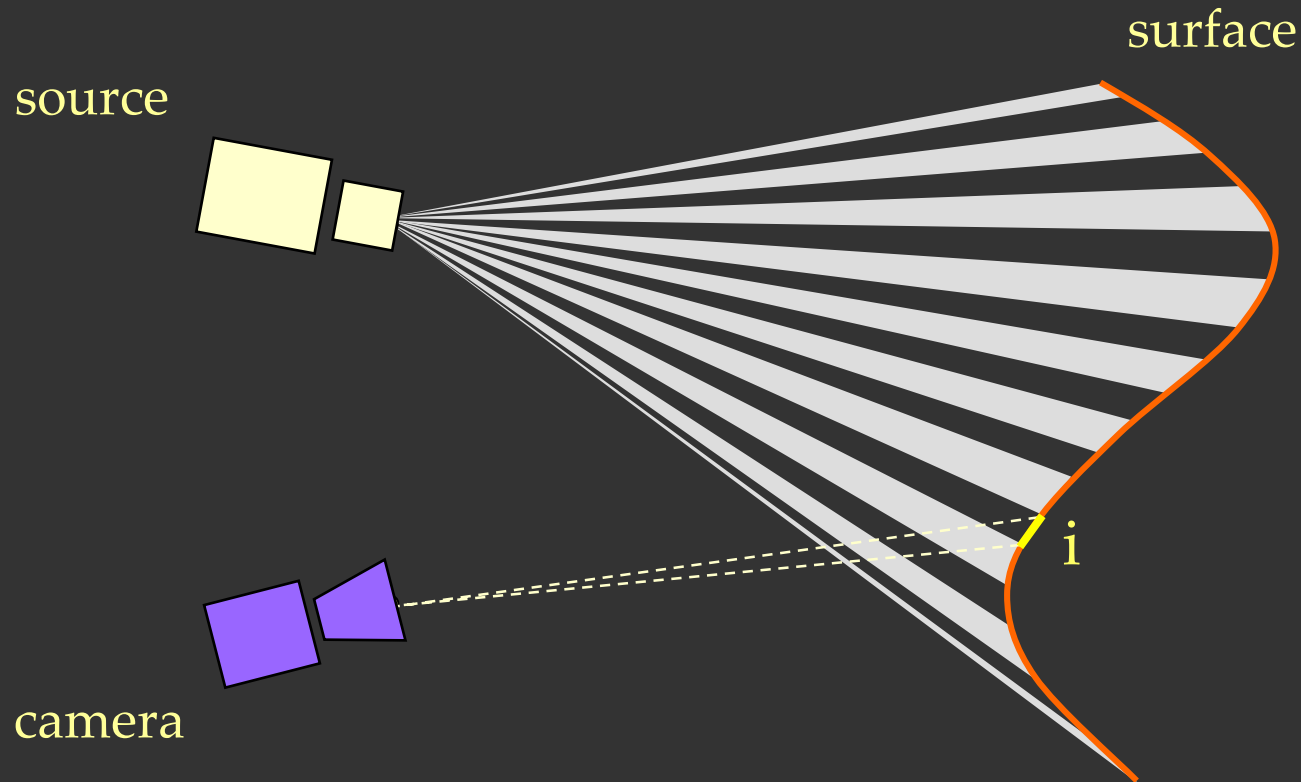
High Frequency Illumination Pattern



$$L^+[c,i] = L_d[c,i] + \alpha L_g[c,i]$$

fraction of activated source elements

High Frequency Illumination Pattern



$$L^+[c,i] = L_d[c,i] + \alpha L_g[c,i]$$

$$L^-[c,i] = (1 - \alpha) L_g[c,i]$$

fraction of activated source elements

Separation from Two Images

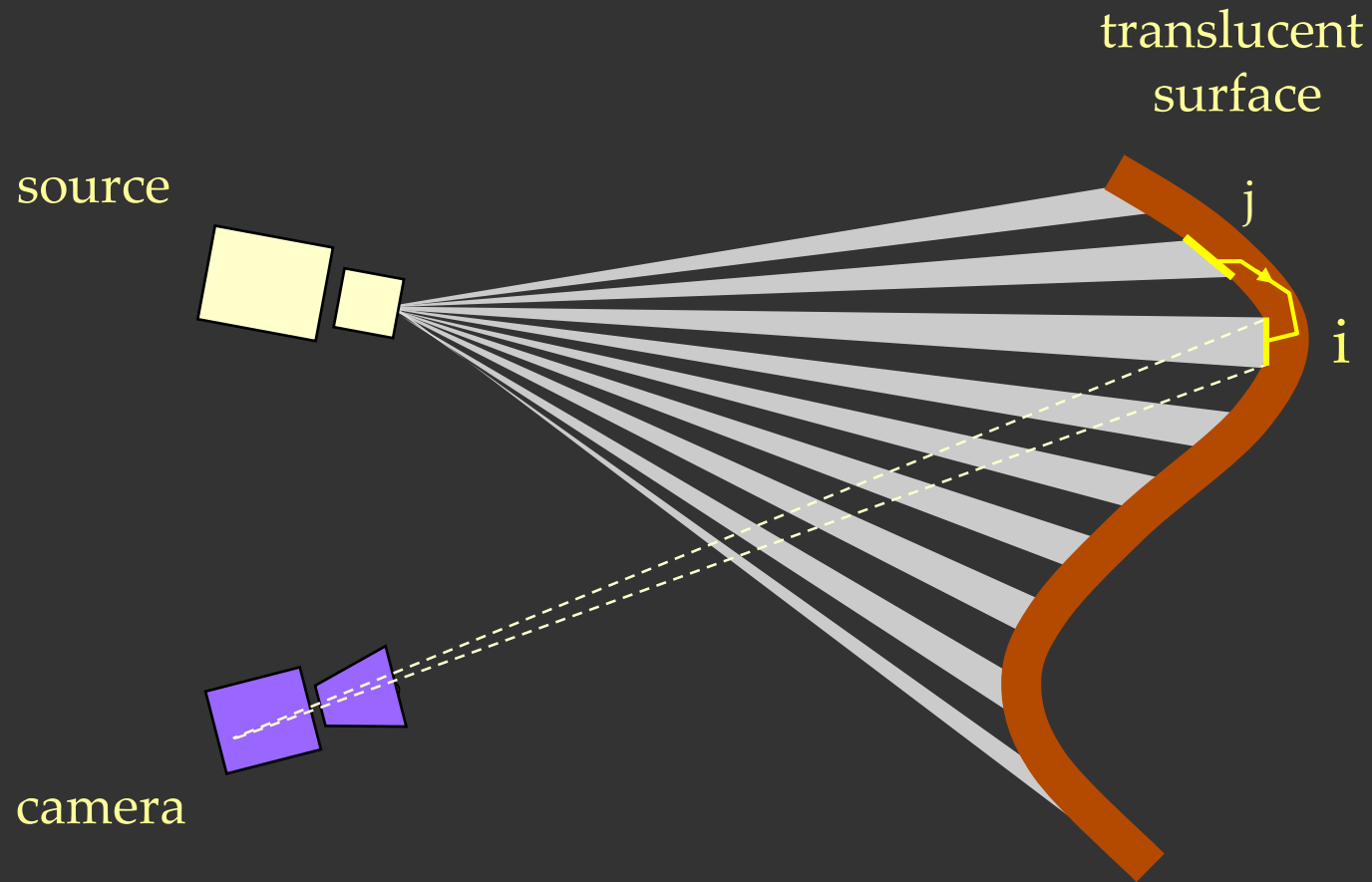
$$\alpha = \frac{1}{2}:$$

$$L_d = L_{\max} - L_{\min}, \quad L_g = 2L_{\min}$$

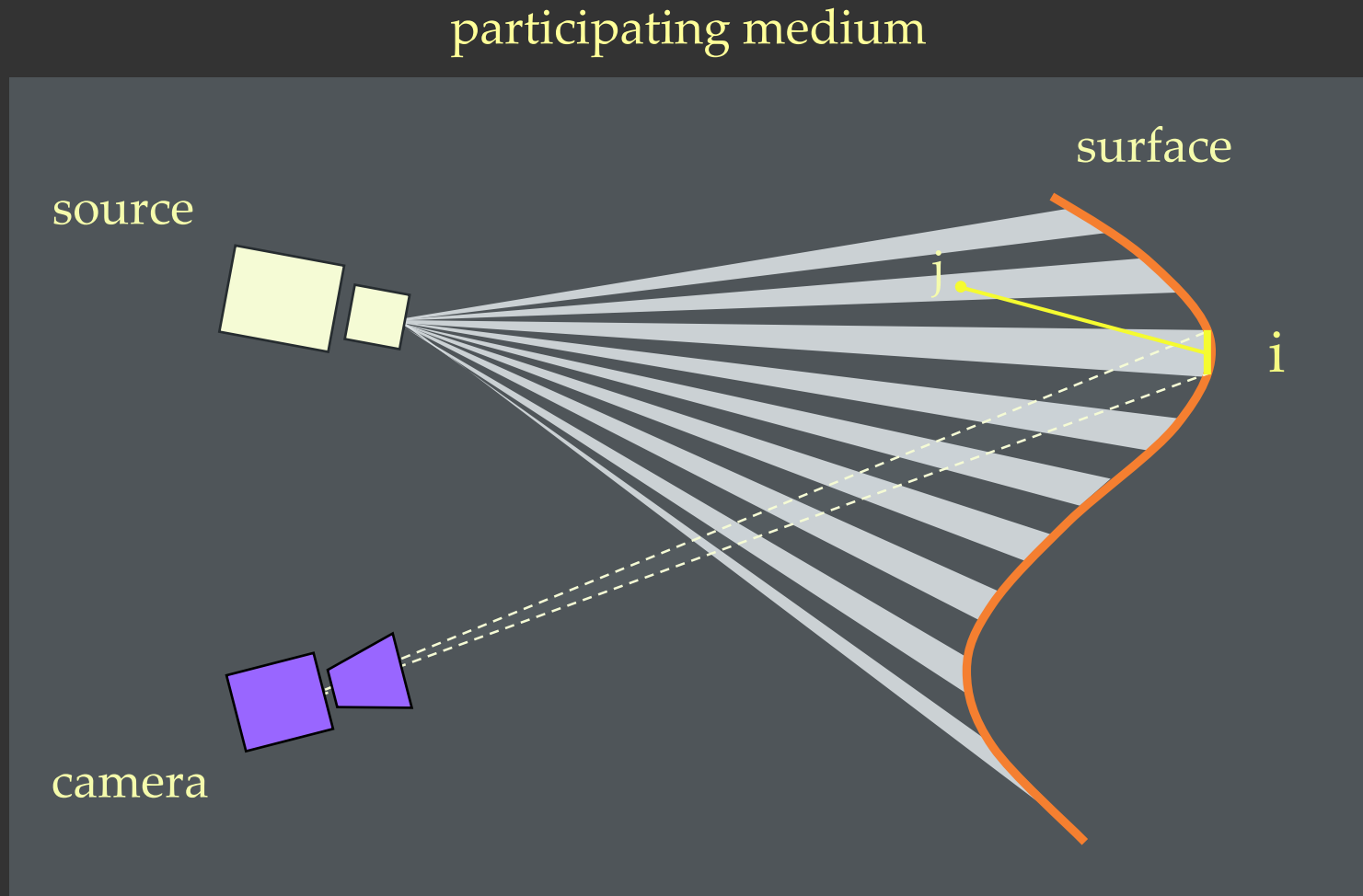
direct

global

Other Global Effects: Subsurface Scattering



Other Global Effects: Volumetric Scattering



Diffuse
Interreflections

Specular
Interreflections

Diffusion

Volumetric
Scattering

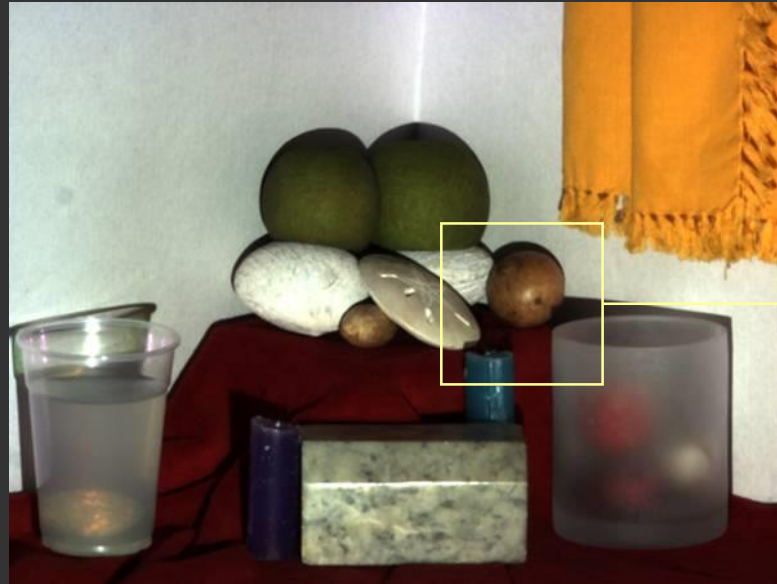
Subsurface
Scattering



Scene



Scene



Direct



Global

Eggs: Diffuse Interreflections

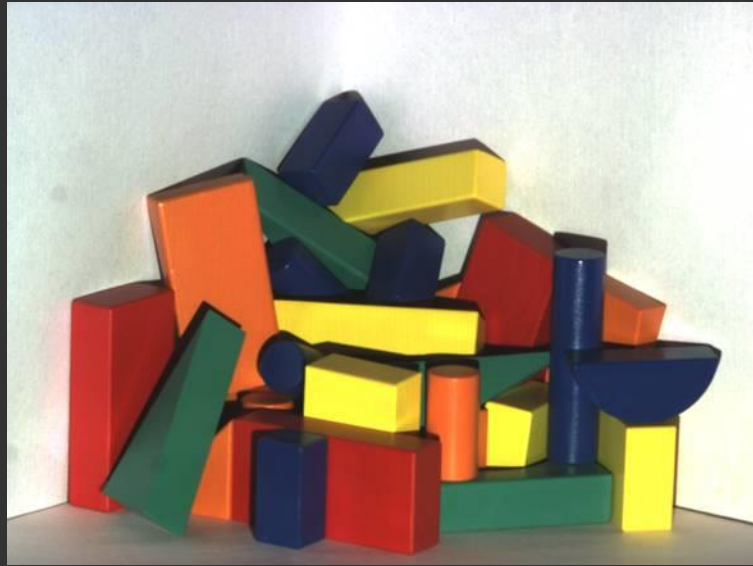


Direct



Global

Wooden Blocks: Specular Interreflections

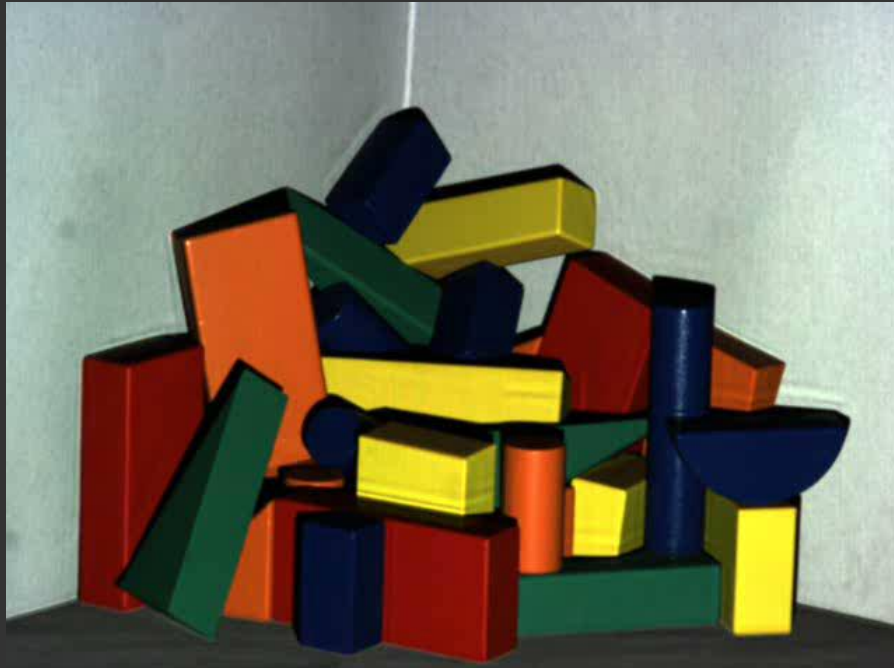


Direct

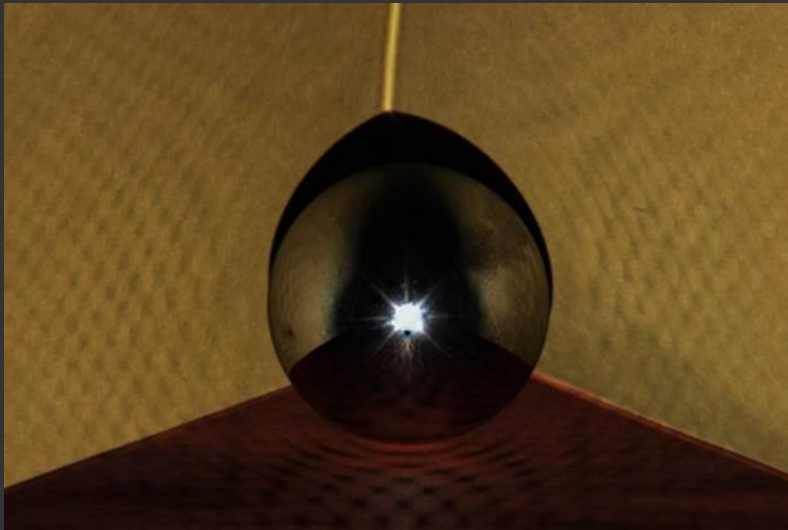
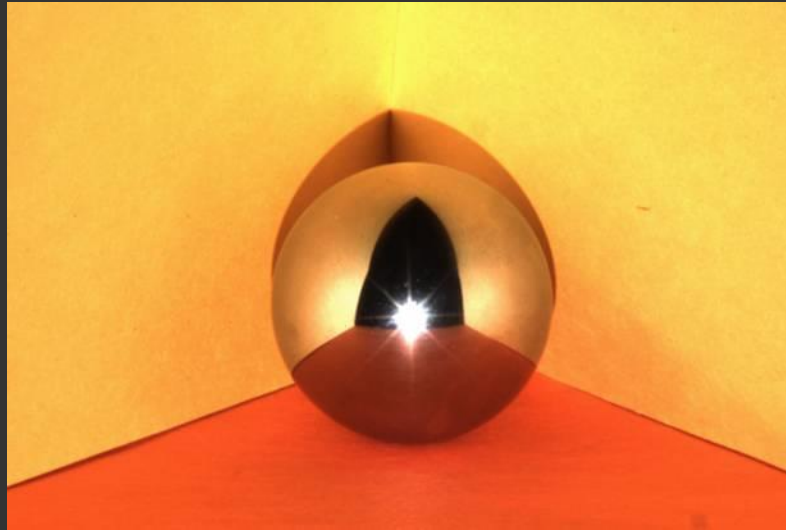


Global

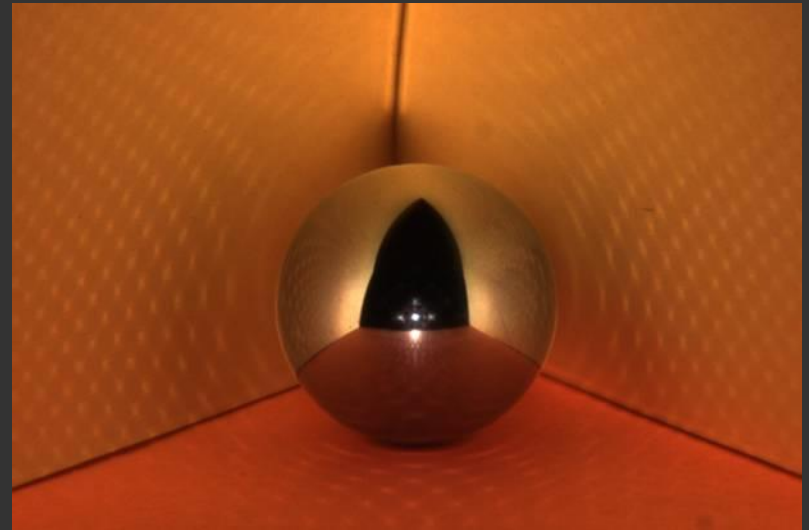
Novel Images



Mirror Ball: Failure Case



Direct



Global

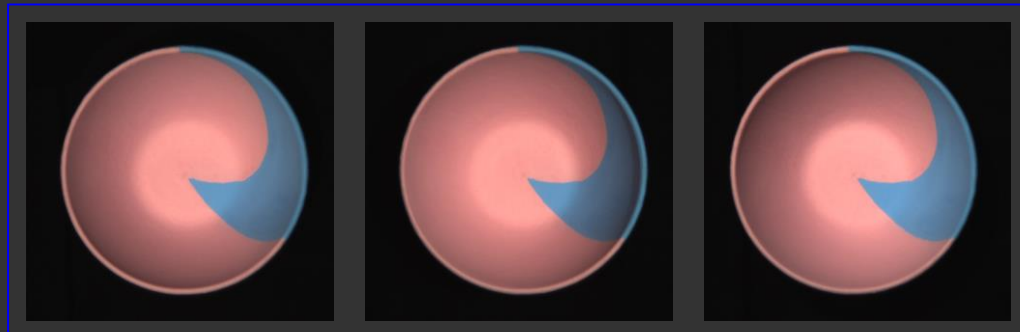
Photometric Stereo using Direct Images

Source 1

Source 2

Source 3

Bowl



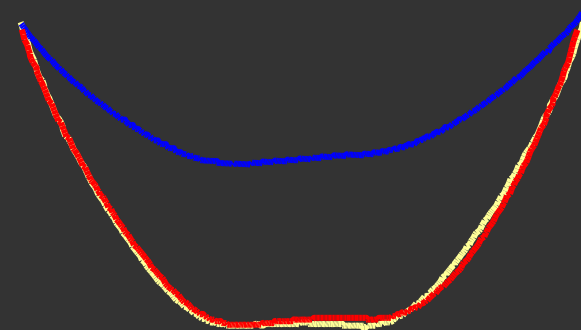
Global



Direct



Shape



Kitchen Sink: Volumetric Scattering



Volumetric Scattering:
Chandrasekar 50, Ishimaru 78

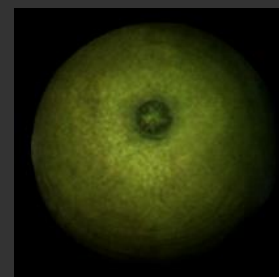


Direct



Global

Novel Image



Peppers: Subsurface Scattering



Direct



Global

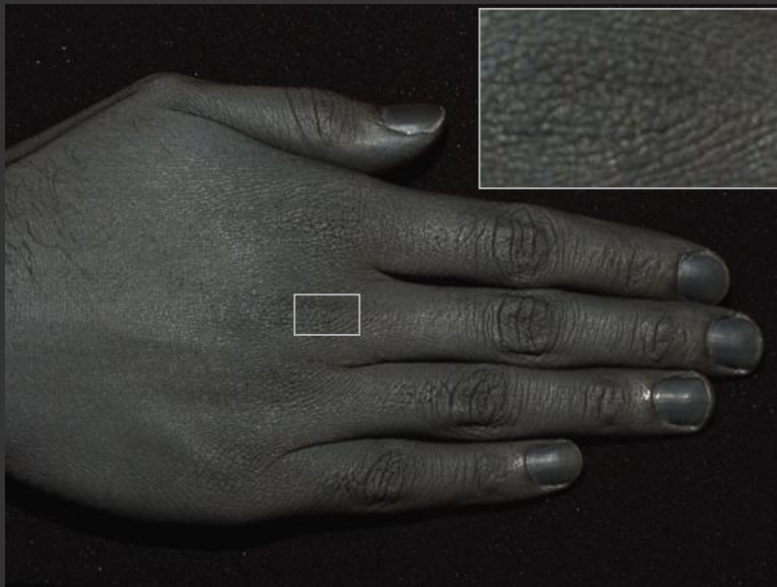
Novel Images



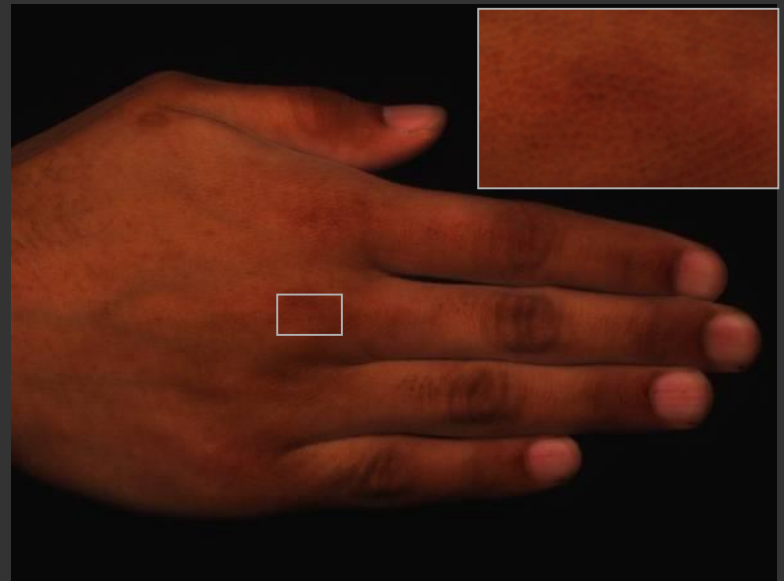
Hand



Skin: Hanrahan and Krueger 93,
Uchida 96, Haro 01, Jensen et al. 01,
Cula and Dana 02, Igarashi et al.
05, Weyrich et al. 05



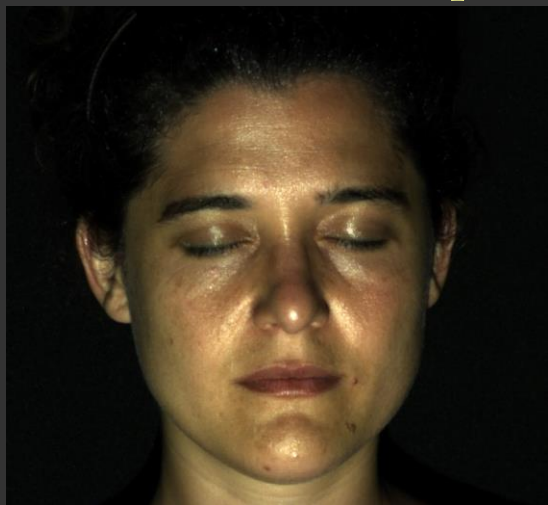
Direct



Global

Face: Without and With Makeup

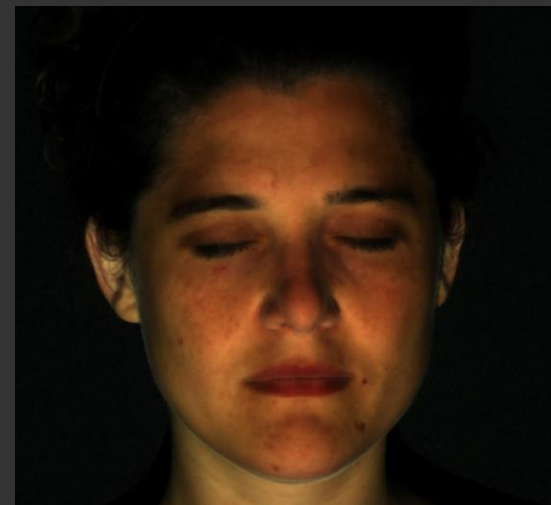
Without Makeup



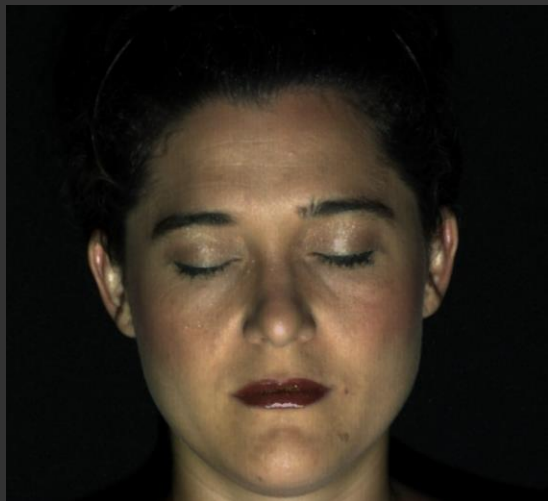
Direct



Global



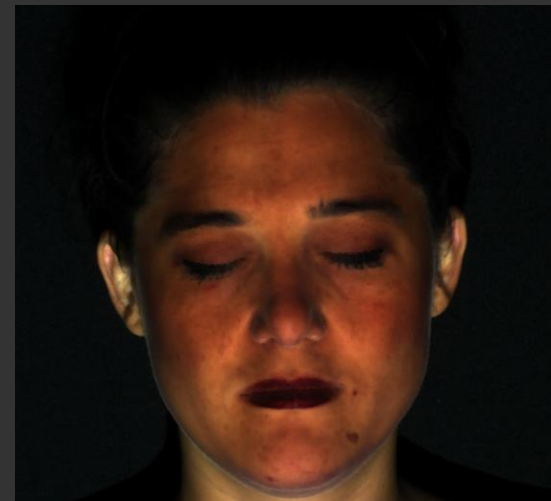
With Makeup



Direct



Global



Blonde Hair



Hair Scattering: Stamm et al. 77,
Bustard and Smith 91, Lu et al. 00
Marschner et al. 03



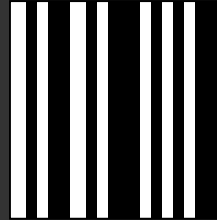
Direct



Global

Variants of Separation Method

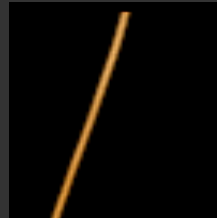
- Coded Structured Light



- Shifted Sinusoids



- Shadow of Line Occluder



- Shadow of Mesh Occluders



Building Corner



Stick



Shadow

3D from Shadows:
Bouguet and Perona 99

$$L_d = L_{\max} - L_{\min}, \quad L_g = L_{\min}$$

direct

global

Building Corner



Direct



Global

Shower Curtain: Diffuser



Mesh



Shadow

$$L_d = L_{\max} - \beta L_{\min}, \quad L_g = \beta L_{\min}$$

direct

global

Shower Curtain: Diffuser



Direct



Global

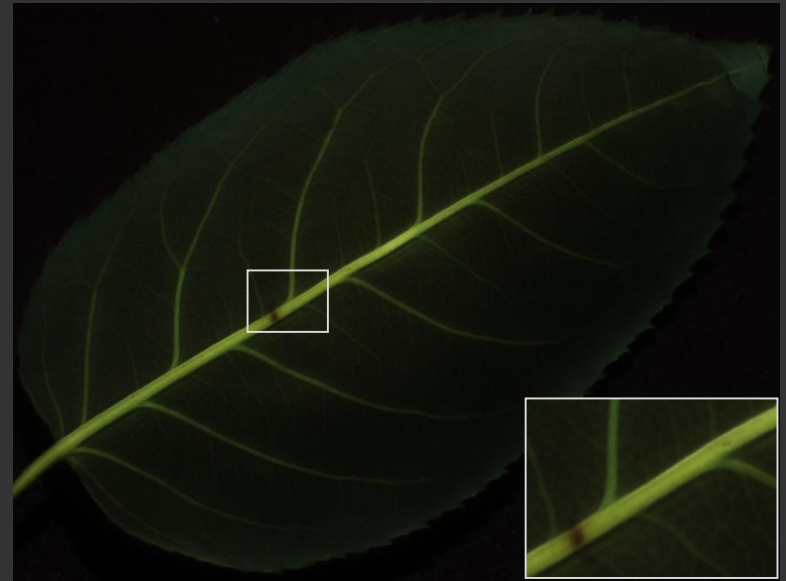
Tea Rose Leaf



Leaf Anatomy: Purves et al. 03



Direct

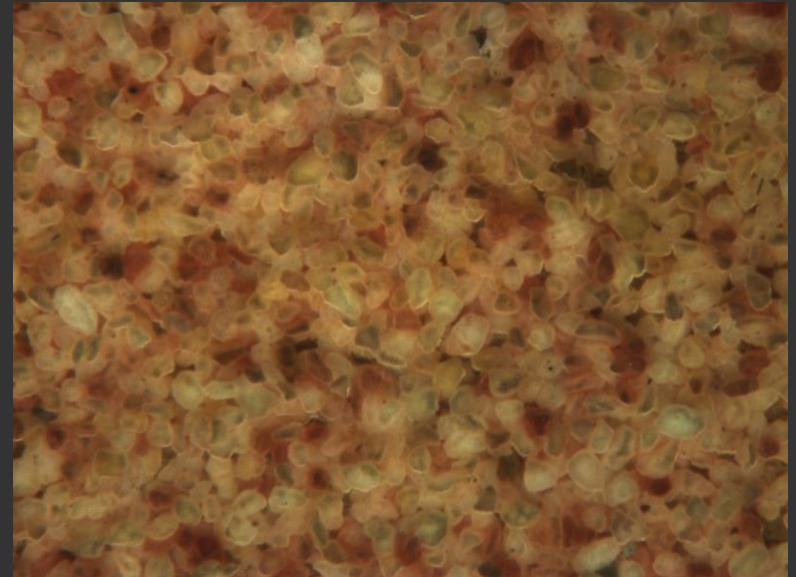


Global

Pebbles: 3D Texture



Direct



Global

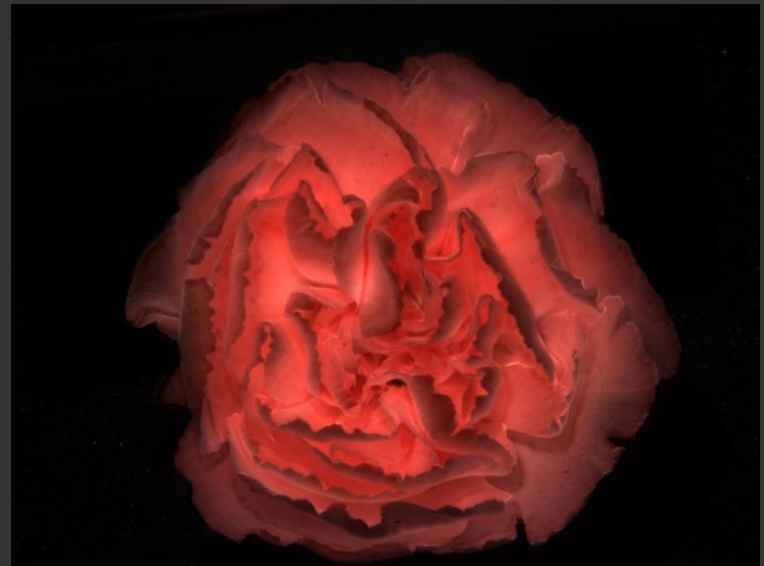
Pink Carnation



Spectral Bleeding: Funt et al. 91



Direct



Global

Summary

- Fast and Simple Separation Method
- No Prior Knowledge of Material Properties
- Wide Variety of Global Effects
- Implications:
 - Generation of Novel Images
 - Enhance Computer Vision Methods
 - Insights into Properties of Materials

References

- [Debevec, 2000] Debevec, Hawkins, Tchou, Duiker, Sarokin, and Sagar. Acquiring the Reflectance Field of a Human Face. *SIGGRAPH* 2000
- [Sen, 2005] Sen, P.; Chen, B.; Garg, G.; Marschner, S. R.; Horowitz, M.; Levoy, M. & Lensch, H. P. A. Dual Photography. *ACM Transactions on Graphics (SIGGRAPH)*, 2005, 24, 745-755
- [Seitz, 2005] Seitz, S. M.; Matsushita, Y. & Kutulakos, K. N. A Theory of Inverse Light Transport. *Proceedings of IEEE International Conference on Computer Vision (ICCV)*, 2005
- [Nayar, 2006] Nayar, S. K.; Krishnan, G.; Grossberg, M. D. & Raskar, R. Fast Separation of Direct and Global Components of a Scene using High Frequency Illumination. *ACM Transactions on Graphics (SIGGRAPH)*, 2006, 25, 935-944