

# BRDF's and Relighting

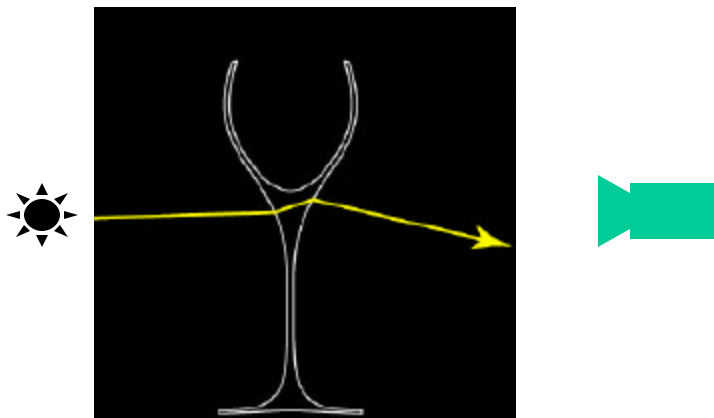
Topics in Image-Based Modeling and Rendering  
CSE291 J00  
Lecture 12

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## Environment Matte

Basic Assumption: Single ray into object, single ray out.



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**Background textures w/ foreground object**

**Background Textures**

**Note: Complex  $O(\log k)$**

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## Explanation of $\Phi$

$$F = \sum_{i=1}^m R_i M(T_i, A_i)$$

$R_i$ : Reflectance coefficient

$M$ : Texture mapping operator for axis-aligned rectangle ( $A_i$ ) of texture ( $T_i$ )

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# Environment Matte Example



**Alpha Matte**

**Environment Matte**

**Photograph**

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# A composited object



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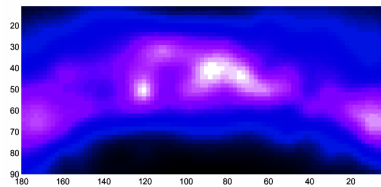
# BRDF

## Surface Reflectance Models

### Common Models

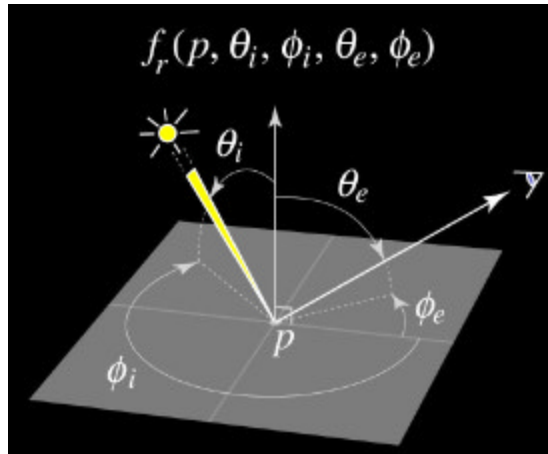
- Lambertian
- Phong
- Physics-based
  - Specular  
[Blinn 1977], [Cook-Torrance 1982], [Ward 1992]
  - Diffuse  
[Hanrahan, Kreuger 1993]
  - Generalized Lambertian  
[Oren, Nayar 1995]
  - Thoroughly Pitted Surfaces  
[Koenderink et al 1999]
- Phenomenological  
[Koenderink, Van Doorn 1996]

### Arbitrary Reflectance



- Non-parametric model
- Anisotropic
- Non-uniform over surface
- BRDF Measurement [Dana et al, 1999]

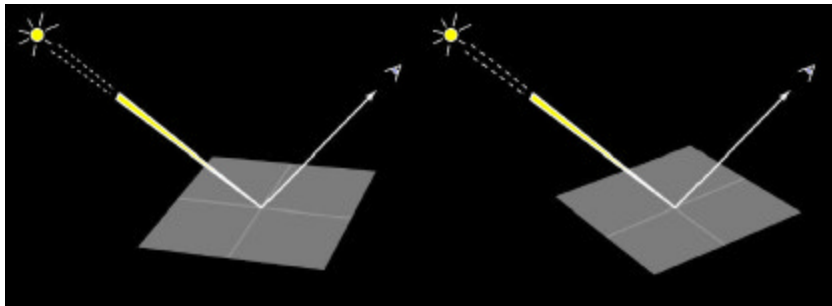
# BRDF



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Adapted from Steve Marschner

## Isotropic BRDF Function of Three variables

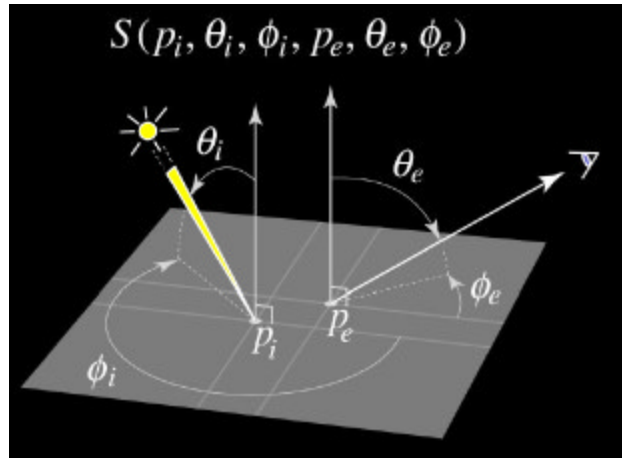


$$f_r(\theta_i, \phi_i, \theta_e, \phi_e) = f_i(\theta_i, \theta_e, \phi_i - \phi_e)$$

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# BSSRDF

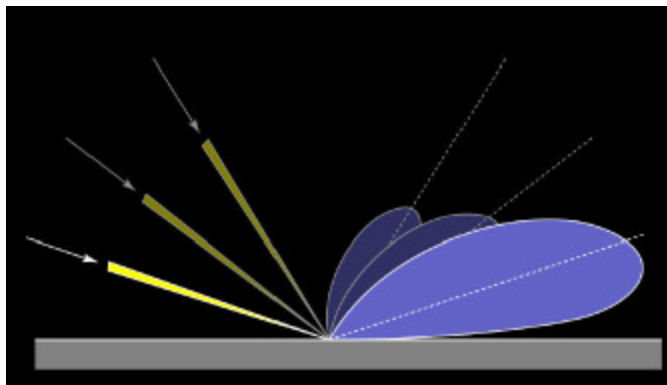


## Bidirectional Subsurface Scattering Reflectance Distribution Function

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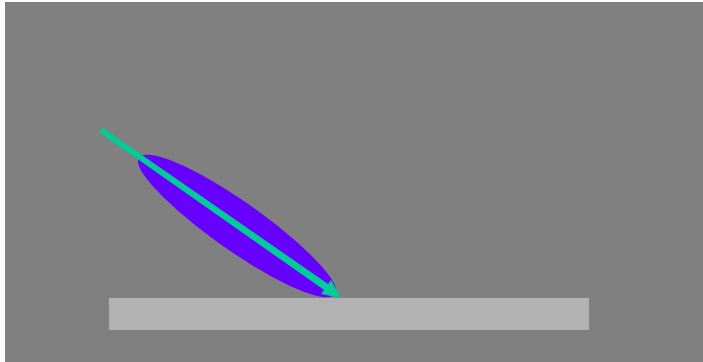
# Off Specular Reflection



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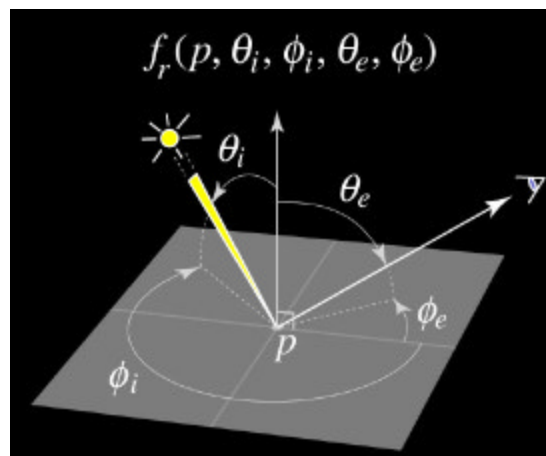
# Backscatter



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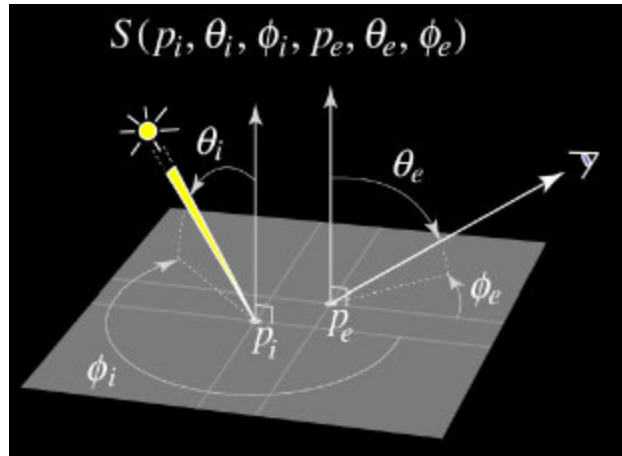
# BRDF



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# BSSRDF



**Bidirectional Subsurface Scattering Reflectance  
Distribution Function**

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# Materials: Conductor



**Conductor**

**Conductor +  
Microgeometry**

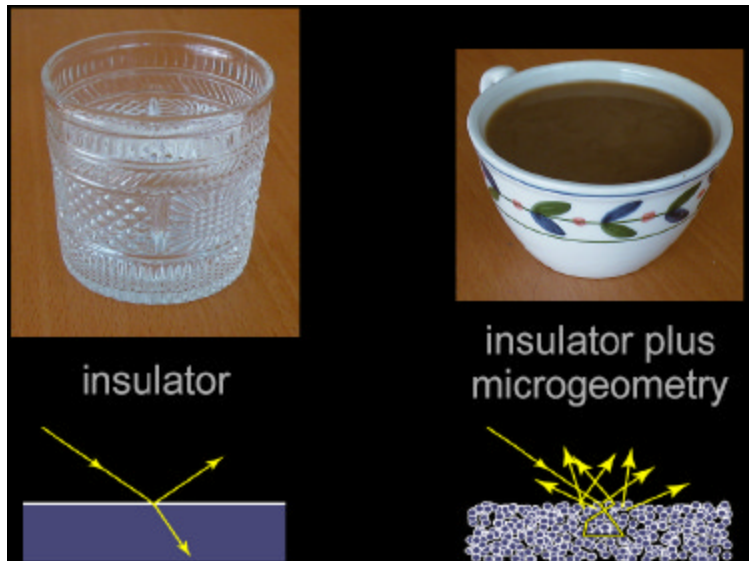


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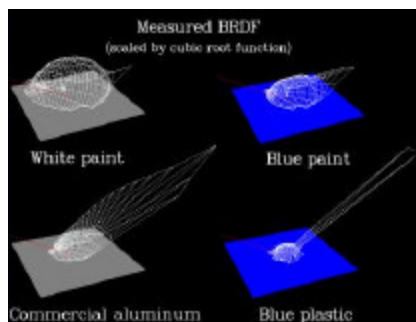
# Material: Insulator



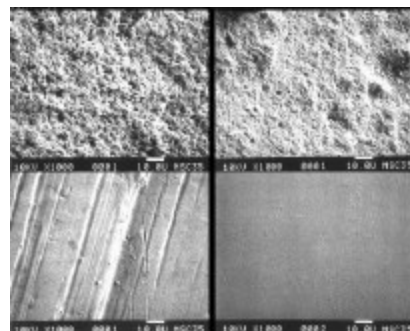
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# Measured BRDFs



BRDF cross-sections



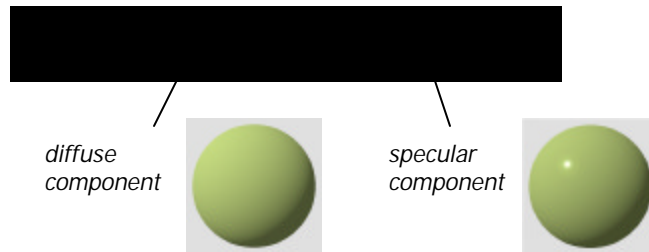
Surface microstructure

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# Ward reflectance model

- A physically realizable variant of the Phong model (satisfies energy conservation and reciprocity).



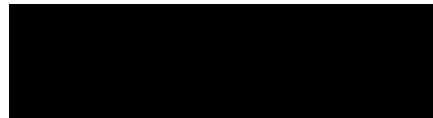
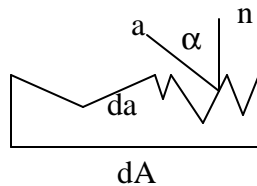
- $\rho_d$ : proportion of incident radiation reflected diffusely.
- $\rho_s$ : proportion of incident radiation reflected specularly.
- $\alpha$ : surface roughness, or blur in specular component.

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From Ron Dror's slides

# Cook-Torrance Model (1982)

- Diffuse (Lambertian) and Specular and Fresnel reflection
- Microfacet model – surface is modeled as a collection of parallel symmetric V-groves called microfacets (facets are large w.r.t. wavelength, small w.r.t. pixel size).

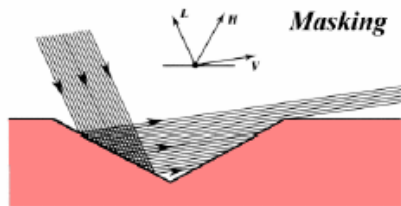


- Facet distribution is given by a specific distribution (e.g., Gaussian,  $D = k \exp(\alpha/m)^2$ )
- Facets are purely specular

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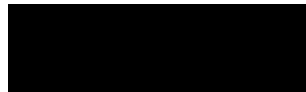
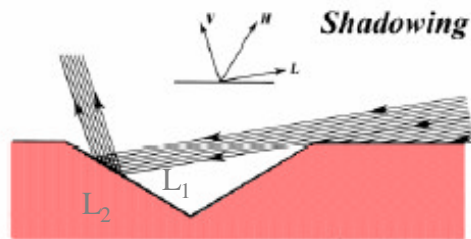
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## Geometric Attenuation: Masking and Shadowing



Geometric Attenuation

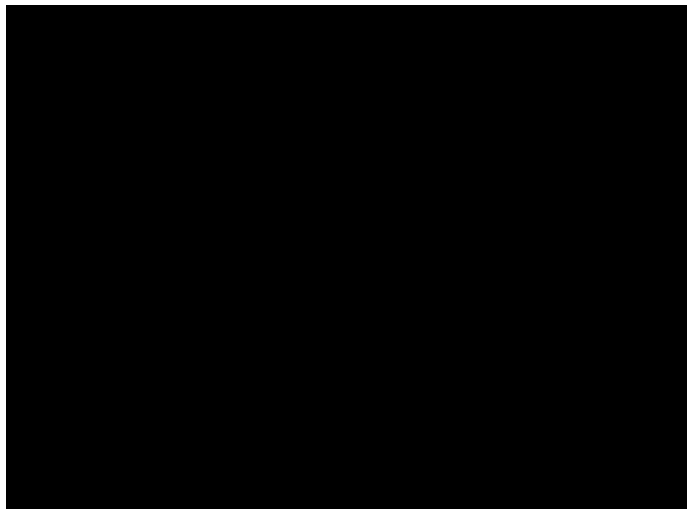
$$G=1-L_1/L_2$$



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## Fresnel Equation for Polished Copper



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# Reflectance as Function of Angle of Incidence for Copper



Blue

Green

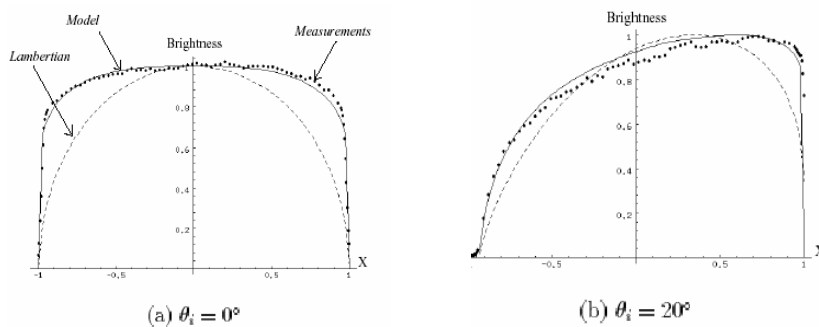
Red

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## Generalized Lambertian Model (Oren, Nayar 1994)

- Like Torrance-Sparrow, but with Lambertian facets.
- Intensity doesn't fall off as quickly as function of incident illumination.



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Rough Cylindrical Clay Vase

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# Velvet: A general BRDF

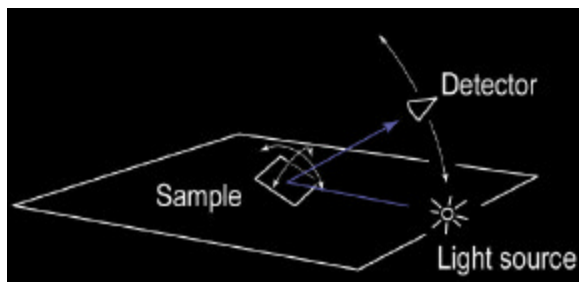
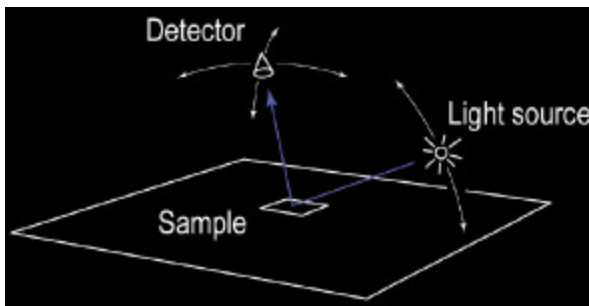


Portrait of Sir Thomas More, Hans Holbein the Younger, 1527

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[ After Koenderink, et al. 1998 ]

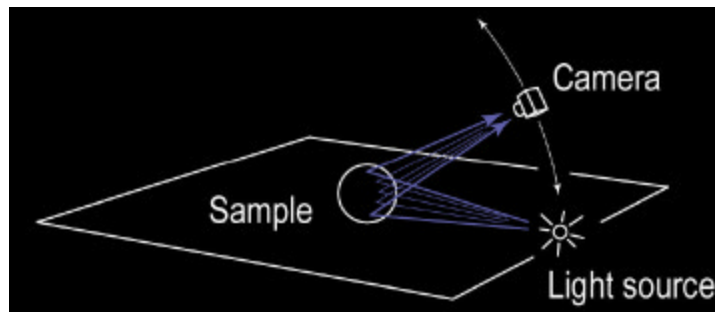
## Measuring Isotropic BRDF's



Adapted from Steve Marschner

## Image-based: Marschner

- Known Geometry of Sample,
- From single image, one obtains 2-D slice of BRDF.

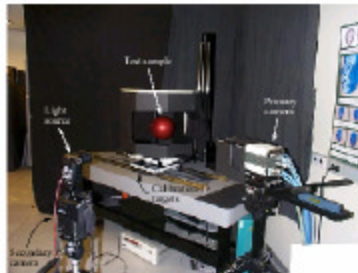


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Adapted from Steve Marschner

## Known illumination: inverse rendering

- If one assumes that illumination and surface geometry are known in advance, one can recover samples of the BRDF from an image (Marschner; Sato & Ikeuchi).



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From Ron Dror's slides

# Empirical BRDF's

Consider a collection of basis functions  $b_j(\theta_i, \phi_i, \theta_e, \phi_e)$

Represent an arbitrary BRDF as

$$r(\mathbf{q}_i, \mathbf{f}_i, \mathbf{q}_r, \mathbf{f}_r) = \sum_j w_j b_j(\mathbf{q}_i, \mathbf{f}_i, \mathbf{q}_r, \mathbf{f}_r)$$

Given measurements, estimate  $w_j$  to fit BRDF to data.

What is a good set of basis functions?

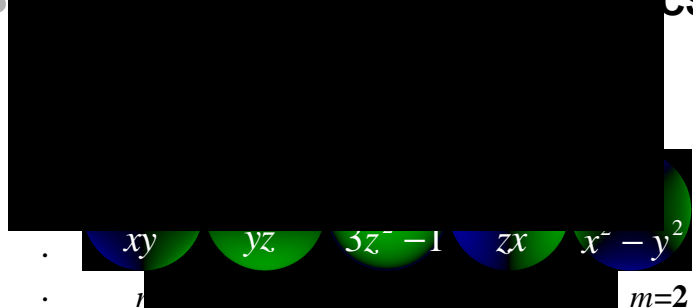
1. Product of spherical harmonics
2. Wavelets
3. Zernike polynomials

# Spherical Harmonics

(Basri, Jacobs'01; Ramamoorthi, Hanrahan'01)

- A set of orthonormal basis functions defined on the unit sphere
- The first nine harmonics:  $Y_{lm}(\mathbf{q}, \mathbf{f})$

- Definition (SPHERICAL HARMONICS):



(Borrowed from: Ramamoorthi, Hanrahan, SIGGRAPH'01)

# Phenomenological BRDF model

## Zernike Polynomials

[Koenderink & van Doorn, 1996]

- A problem with spherical harmonics, half of sphere should be zero.
- General compact representation defined on disk
- Preserve Helmholtz Reciprocity
- Preserve reciprocity/isotropy if desired
- Domain is product of hemispheres
- Same topology as unit disk, adapt basis

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## Zernike Polynomials

- Optics, complete orthogonal basis on unit disk using polynomials of radius

$$Z_n^m(\mathbf{r}, \mathbf{f}) = \sqrt{\frac{n+1}{p}} R_n^m(\mathbf{r}) e^{im\mathbf{f}}$$

$n-|m|$  even  
 $|m| \leq n$

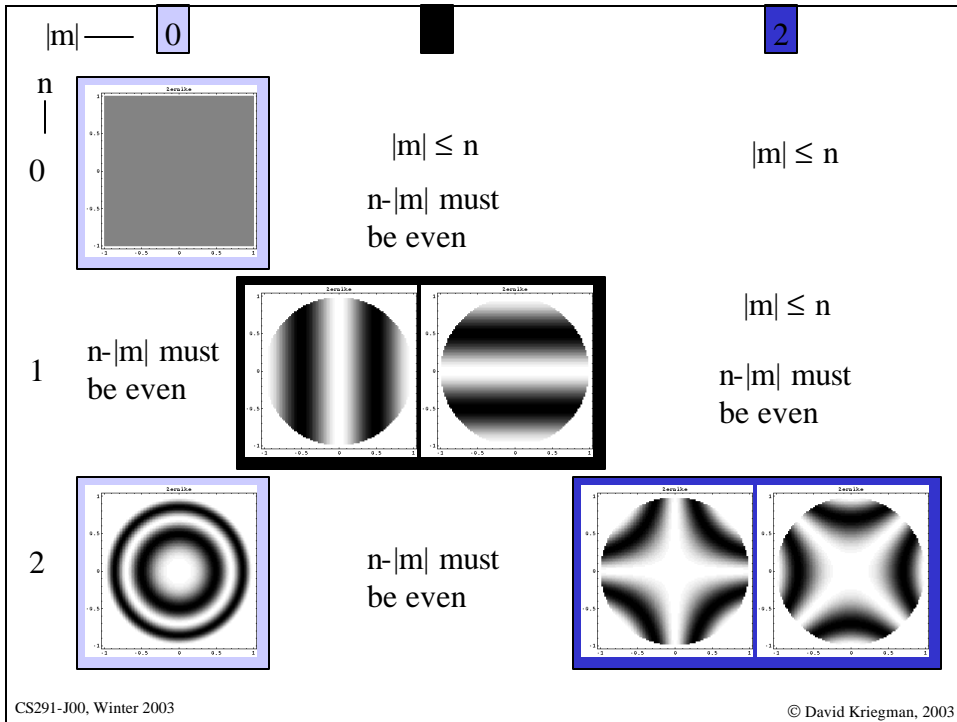
- R has terms of degree at least m. Even or odd depending on m even or odd
- Orthonormal, using measure  $\rho d\rho d\phi$

Cool Demo: <http://wyant.opt-sci.arizona.edu/zernikes/zernikes.htm>

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## “Relighting”

1. Steerable lighting
2. Lambertian Surfaces and linear subspaces
3. Arbitrary BRDF, arbitrary lighting

## Superposition of lighting: An important point

If  $I_1 = R(S, L_1)$  is the image of a scene  $S$  under lighting  $L_1$   
and if  $I_2 = R(S, L_2)$  is the image of a scene  $S$  under lighting  $L_2$ ,

then the image of the scene under lighting  $L_1+L_2$  is simply

$$I_1 + I_2$$

## Basis functions: Example

Consider sinusoid of frequency  $f$ , we can specify any sinusoid  
as sum of two basis sinusoids  $\cos(ft)$  and  $\sin(ft)$  as:

$$a \cos(ft) + (1-a) \sin(ft)$$

Such basis function are sometimes called steerable functions  
– over some transformation of the parameter (e.g.  $t$  here,  
 $(x,y)$  for image plane), the function can be represented as  
the linear combination of a finite collection of basis  
functions.

# Steerable lighting for relighting

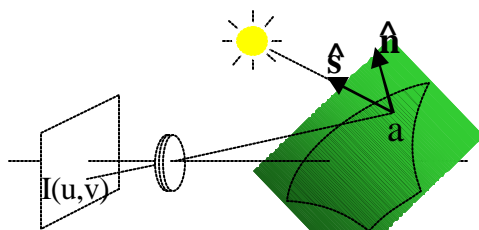
1. Choose a steerable basis for the lighting – all rendering lighting conditions will be defined as linear combinations of the basis lighting.
2. Gather (or synthesize) images of a scene under the basis lighting.
3. Render new images by taking linear combinations of basis images.

Why does it work? Superposition

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Lambertian Surface:  $\rho(\theta_{in}, \phi_{in}; \theta_{out}, \phi_{out}) = \text{constant}$



At image location  $(u,v)$ , the intensity of a pixel  $I(u,v)$  is:

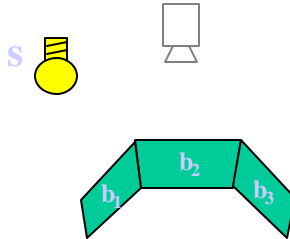
$$I(u, v) = [a(u, v) \hat{\mathbf{n}}(u, v)] \cdot [s_0 \hat{\mathbf{s}}] \\ = \mathbf{b}(u, v) \cdot \mathbf{s}$$

where

- $a(u,v)$  is the albedo of the surface projecting to  $(u,v)$ .
- $\hat{\mathbf{n}}(u,v)$  is the direction of the surface normal.
- $s_0$  is the light source intensity.
- $\hat{\mathbf{s}}$  is the direction to the light source.

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## Image Formation Model: No shadows



Lambertian model without shadowing:

$$\mathbf{I} = \mathbf{B} \mathbf{s}$$

where

$\mathbf{I}$  is an  $n$ -pixel image vector

$\mathbf{B}$  is a matrix whose rows are unit normals scaled by the albedos

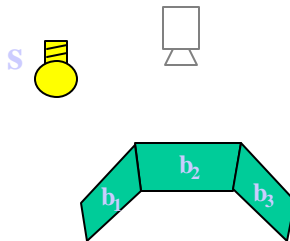
$\mathbf{s} \in \mathbf{R}^3$  is a vector of the light source direction scaled by intensity

$$\mathbf{B} = \begin{bmatrix} -\mathbf{b}_1^T - \\ -\mathbf{b}_2^T - \\ \dots \\ -\mathbf{b}_n^T - \end{bmatrix} \quad n \times 3$$

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## Image Formation Model: Convex Object



Lambertian model with attached shadows:

$$\mathbf{I} = \max(\mathbf{B} \mathbf{s}, \mathbf{0})$$

where

$\mathbf{I}$  is an  $n$ -pixel image vector

$\mathbf{B}$  is a matrix whose rows are unit normals scaled by the albedos

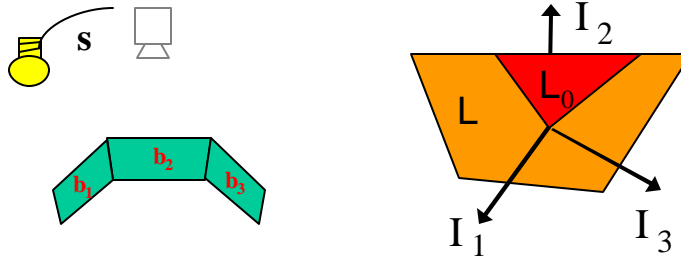
$\mathbf{s} \in \mathbf{R}^3$  is a vector of the light source direction scaled by intensity

$$\mathbf{B} = \begin{bmatrix} -\mathbf{b}_1^T - \\ -\mathbf{b}_2^T - \\ \dots \\ -\mathbf{b}_n^T - \end{bmatrix} \quad n \times 3$$

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# Illumination Subspace



$$L = \{ \mathbf{I} \mid \mathbf{I} = \mathbf{B}\mathbf{s}, \text{ for all } \mathbf{s} \in \mathbb{R}^3 \}$$

- $L$  is a 3-D linear subspace of image space,  $\mathbf{R}^n$ .
- $L$  is spanned by 3 linearly independent images.
- Cone can be generated from  $L$ .
- See also [Woodham 81], [Shashua 92], [Hallinan 95], [Hayakawa 94], [Rosenholtz, Koenderink 96]

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# Multiple Sources: No shadows

- Consider two sources
- Light source 1:  $\mathbf{I}_1 = \mathbf{B}\mathbf{s}_1$
- Light source 2:  $\mathbf{I}_2 = \mathbf{B}\mathbf{s}_2$
- Image with both lights on:

$$\mathbf{I} = \mathbf{I}_1 + \mathbf{I}_2 = \mathbf{B}\mathbf{s}_1 + \mathbf{B}\mathbf{s}_2 = \mathbf{B}(\mathbf{s}_1 + \mathbf{s}_2)$$

So, what does this mean?

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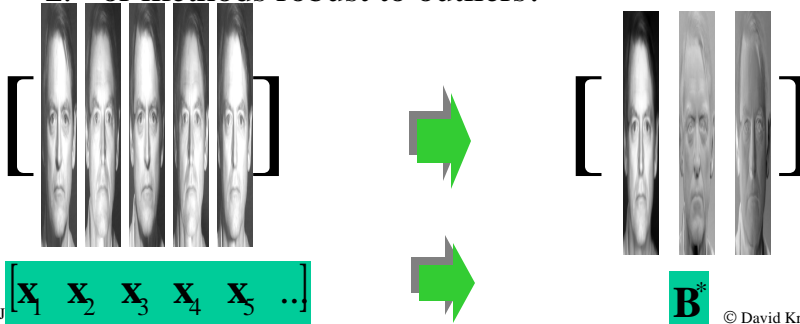
# Computing $L$

For  $k$  images  $X = [x_1, x_2, \dots, x_k]$  imaged under  $k$  unknown point light sources  $S = [s_1, s_2, \dots, s_k]$ ,

$$X = B S$$

Given  $k \geq 3$  images we can compute  $B^*$  that spans  $L$  with

1. singular value decomposition
2. or methods robust to outliers.



# Still Life

Original Images



Basis Images



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# Samples from the Cone

1 Light



2 Lights



3 Lights

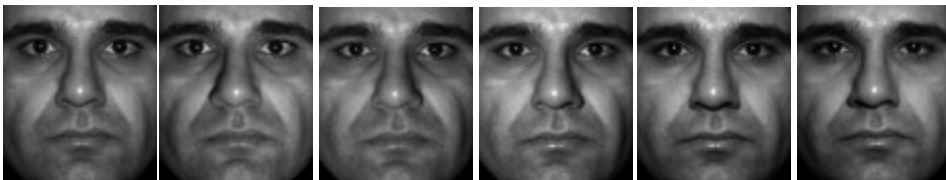


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## Face Basis

Original Images



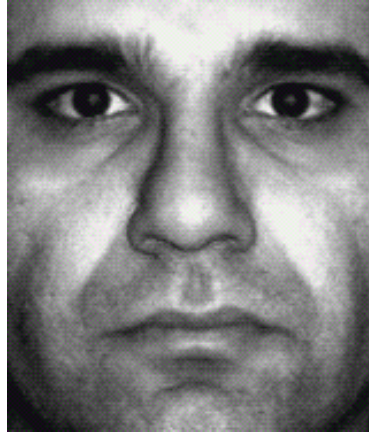
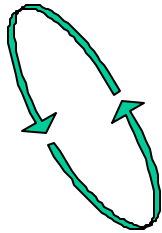
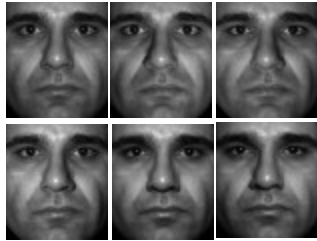
Basis Images spanning L



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# Image-Based Rendering: Attached Shadows



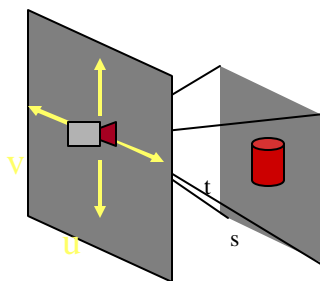
Single Light Source

Face Movie

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# Lumigraph/Light Field Rendering



[Levoy, Hanrahan, 1996]  
[Gortler et al, 1996]



- Set of light rays is a 4-D manifold.
- Single camera image provides a 2-D sampling of the real scene's radiance.
- Moving the camera over a 2-D surface yields a sampling of 4-D radiance (light) field  $L(u,v,s,t)$ .
- Assume lighting is fixed.

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# Lumigraph/Light Field Rendering

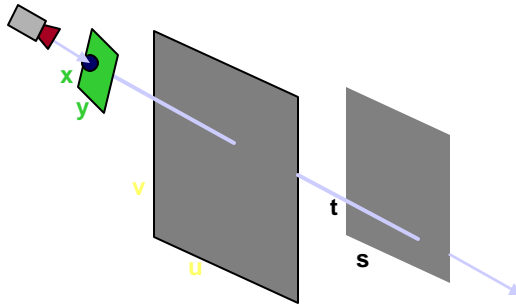


Image from new viewpoint but under same lighting is rendered by indexing each visual ray into the Lumigraph

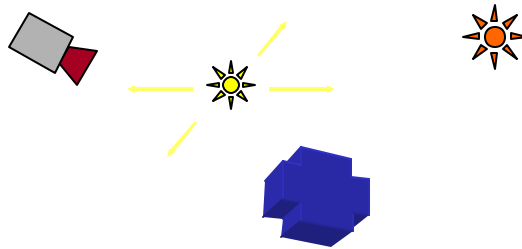
$$I(x,y) = L(u,v,s,t)$$

where  $u,v,s,t$  are functions of  $(x,y)$ .

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## A not so good idea



### No and Yes

- Scene depth is needed.
- Depth reconstruction method.
- Rendering method.

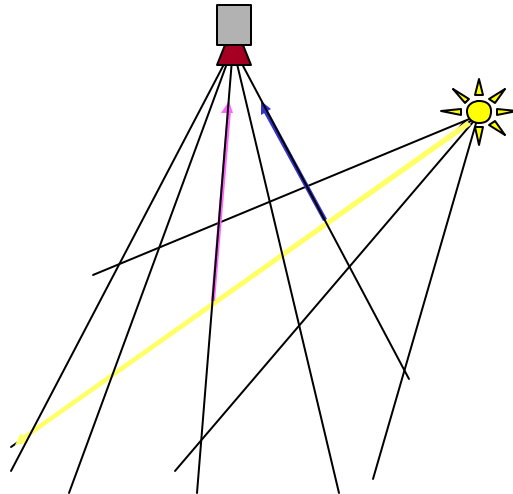
Can we synthesize images under novel lighting by indexing into the image set?

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## Why is depth needed? Correspondence

- Isotropic point light source in known position
- Calibrated camera

- Which pixel corresponds to which light source ray?
- Which light source ray indirectly illuminates which pixel?



A 2-D schematic

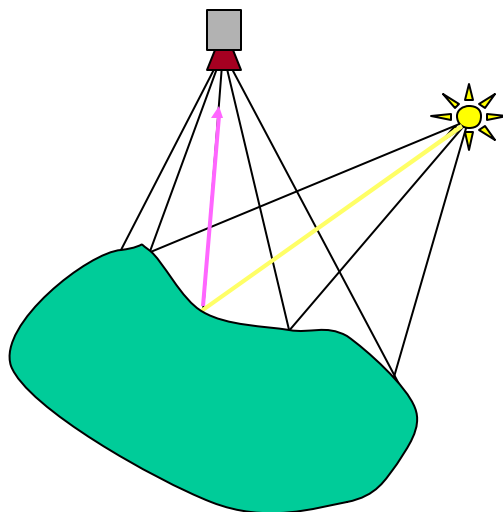
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## Why is depth needed? Correspondence

- Isotropic point light source in known position.
- Calibrated camera

- Which pixel corresponds to which light source ray?
- Which light source ray indirectly illuminates which pixel?

Depth resolves this.

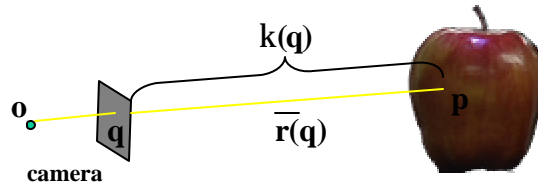


A 2-D schematic

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# Scene Depth

We would like to recover the depth  $l$  :



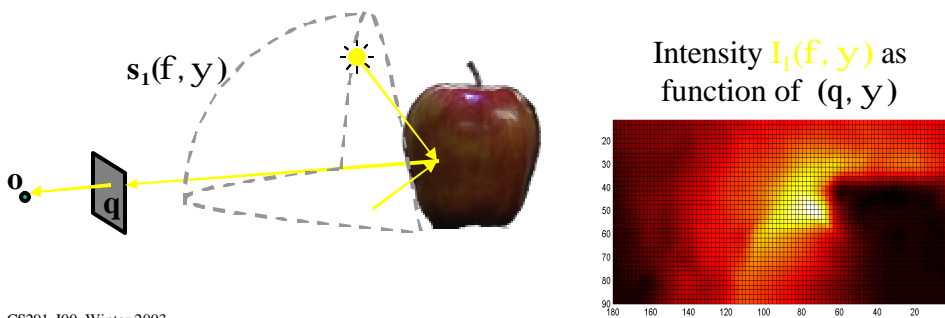
$$\mathbf{p}(k) = \mathbf{o} + l \bar{\mathbf{r}}$$

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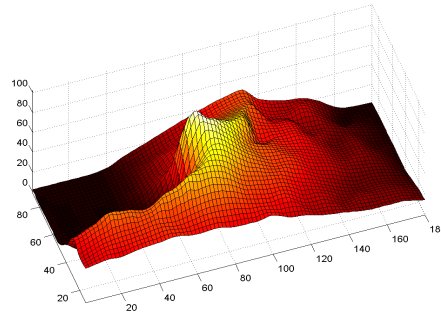
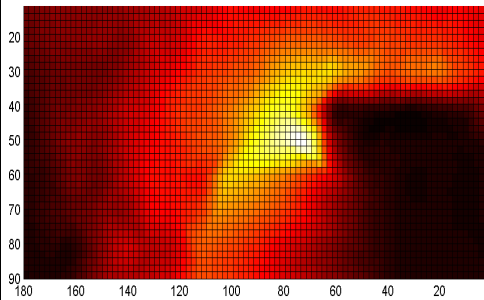
## Reconstruction from the Illumination Field

1. Consider fixed camera and point light source
2. Light moves over a star-shaped surface



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# Intensity of One Pixel: $I_1(f_1, y_1)$



This is effectively a 2-D slice of a surface point's BRDF except for

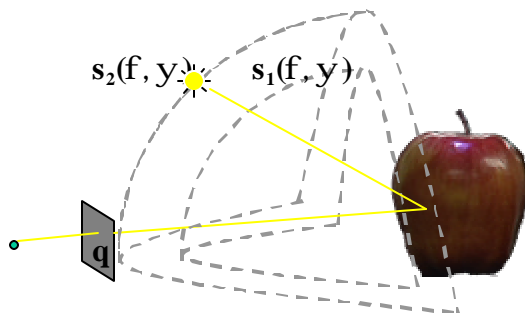
- **Shadowing**
- **Variation in the distance between the sources and the surface point.**

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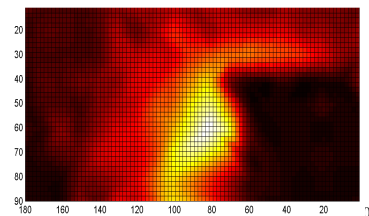
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# Double Covering of the Illumination Field

Consider the effect of moving the light over a second surface:

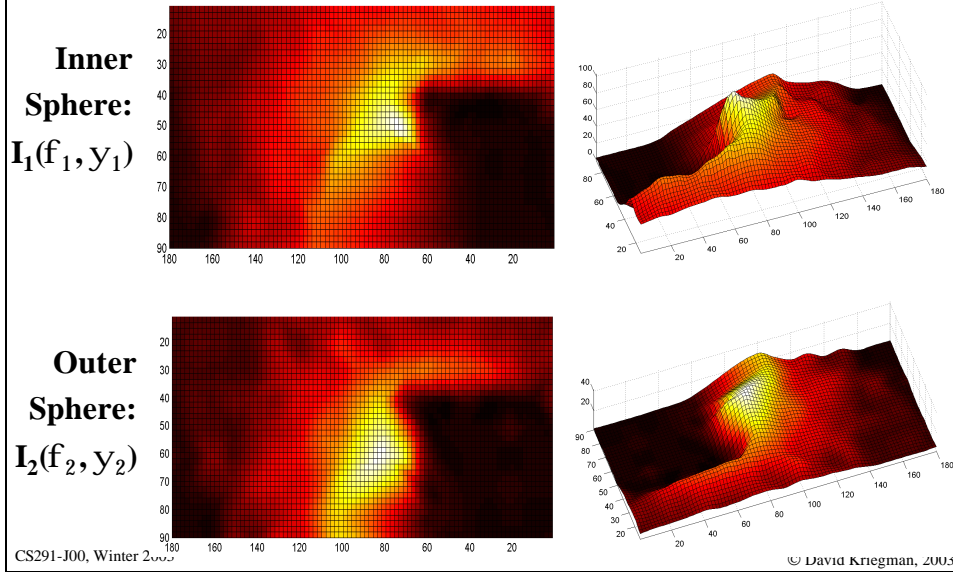


Intensity  $I_2(f, y)$  as a function of  $(f, y)$

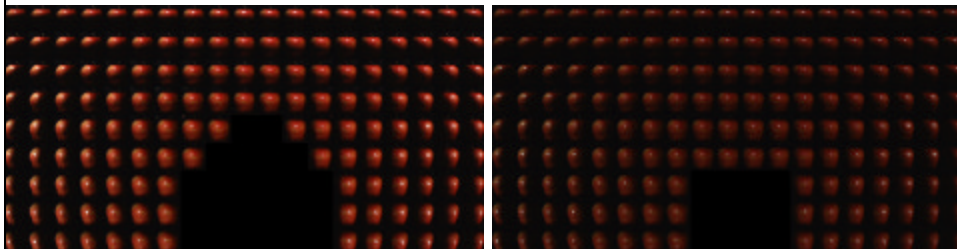
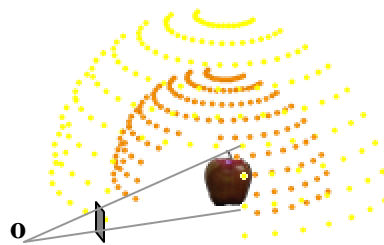
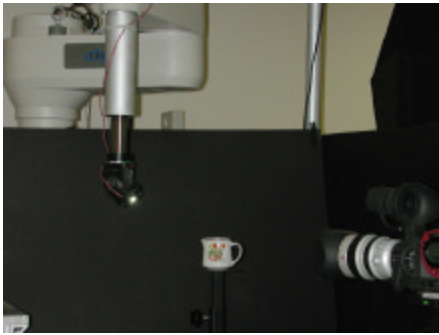


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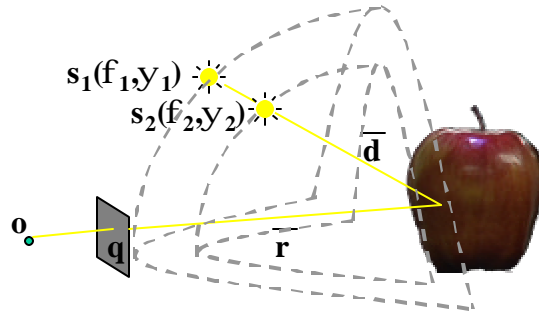
# $I_1(f_1, y_1)$ and $I_2(f_2, y_2)$



# Image Acquisition



## Relation Between Intensity Maps



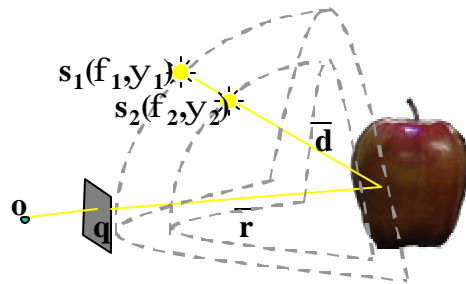
**When the surface point  $p$ ,  $s_1(f_1, y_1)$  and  $s_2(f_2, y_2)$  are collinear (in correspondence), the measured pixel intensities are simply related by the relative  $1/r^2$  losses.**

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## Depth Estimation

This correspondence can be expressed as a change of coordinates  $f_2(f_1, y_1; l)$  and  $y_2(f_1, y_1; l)$  parameterized by the depth  $l$ . We can then estimate  $l$  by minimizing



$$O(l) = \int \int [I_2(f_2(f_1, y_1; l), y_2(f_1, y_1; l)) - d^2(\mathbf{p}(l))I_1(f_1, y_1)]^2 df_1 dy_1$$

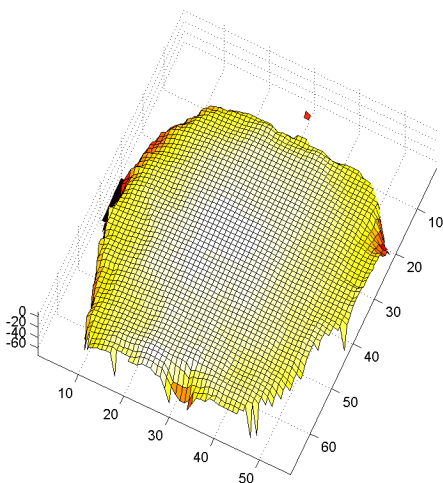
where

$$d^2(\mathbf{p}(l)) = \frac{\|\mathbf{p}(l) - \mathbf{s}_1\|^2}{\|\mathbf{p}(l) - \mathbf{s}_2\|^2}$$

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## An apple and its depth map



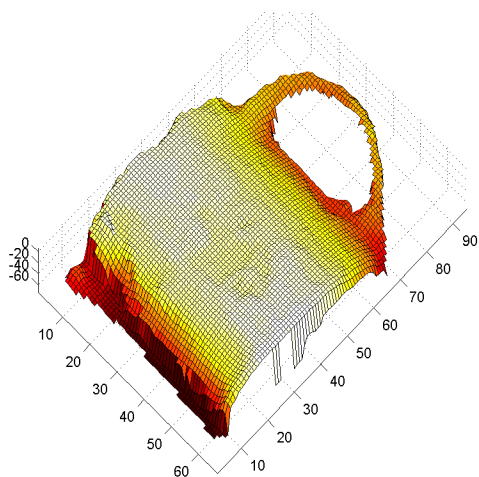
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## A Reconstructed Depth Map



**143 Images on  
each surface**

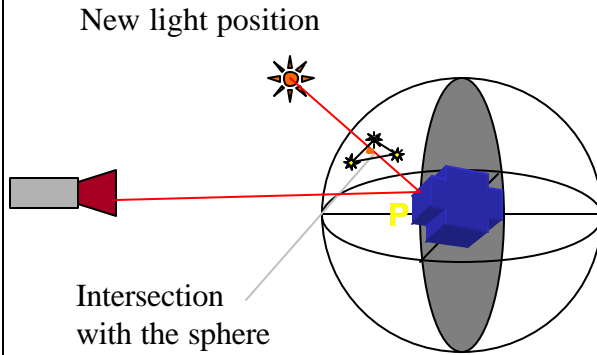


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# Rendering Synthetic Images

## Point Source Example



- For a given image point, there is a scene point: **P**
- Intersect light ray through **P** with sphere.
- Find triangle of light sources containing **P**.
- Interpolate pixel intensities of images corresponding to the triangle vertices & scale by  $1/r^2$

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## Rendered Images

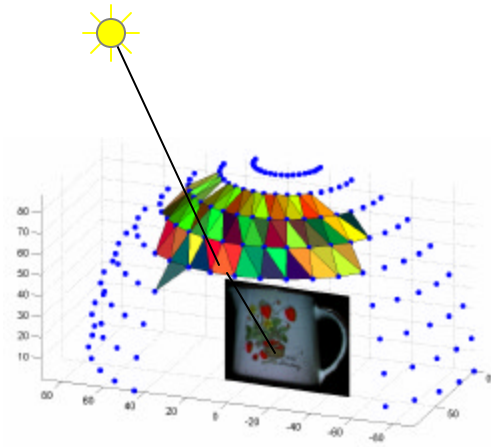
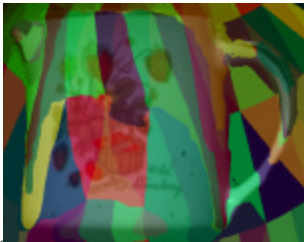


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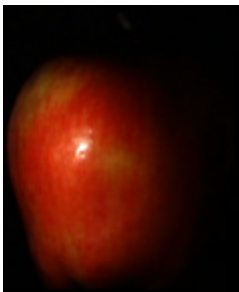
# Indexing and Interpolation: Pixel by Pixel



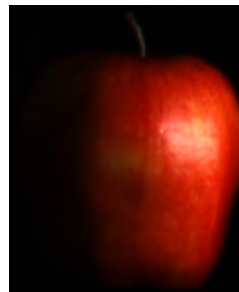
CS291-300, Winter 2005

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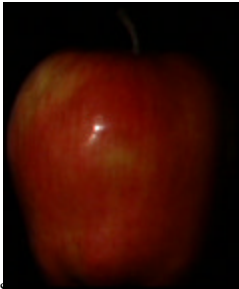
# Application: Rendering Isolated Objects



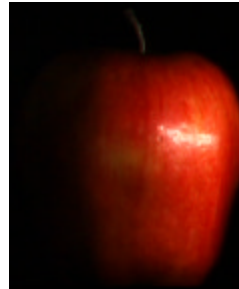
**Close Point  
Source**



**Area  
Source**



**Far Point  
Source**



**Line  
Source**

CS291-300, Winter 2005

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## Application: Rendering Isolated Objects



**Point Source  
(not on captured surface)**

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**Multiple Sources -  
Area Source**

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## Rendered Image: A Sea Shell

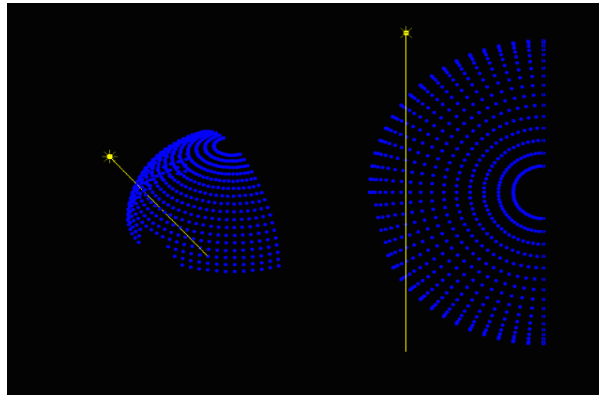


**Isotropic point  
light source  
located between  
acquisition  
spheres.**

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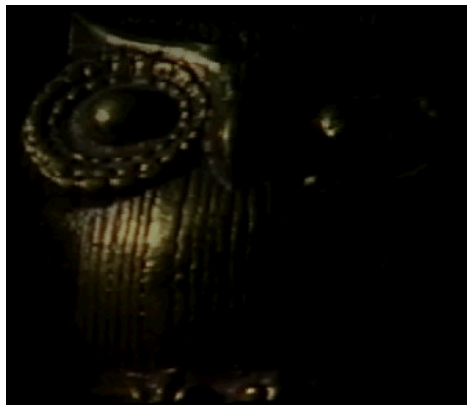
# Moving Light source



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# Moving Light source



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# A Moving Light Source



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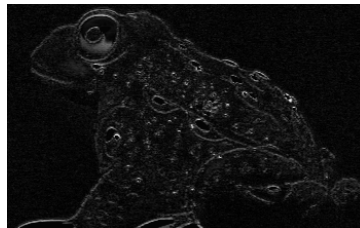
# A comparison



Real Image



Rendered Image



Magnitude of difference Image

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## Embedding Objects in Synthetic Scenes



- Blue Moon Rendering Tools to render scene
- Custom surface shader to implement rendering method by indexing the illumination dataset

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