
COS526: Advanced Computer Graphics



Tom Funkhouser
Fall 2016

Background

Image Processing

- Basic signal processing
- Filtering, resampling, warping, ...

Rendering

- Polygon rendering pipeline
- Basic ray tracing

Modeling

- Basic 3D object representations
- Polygonal meshes

Background

Image Processing

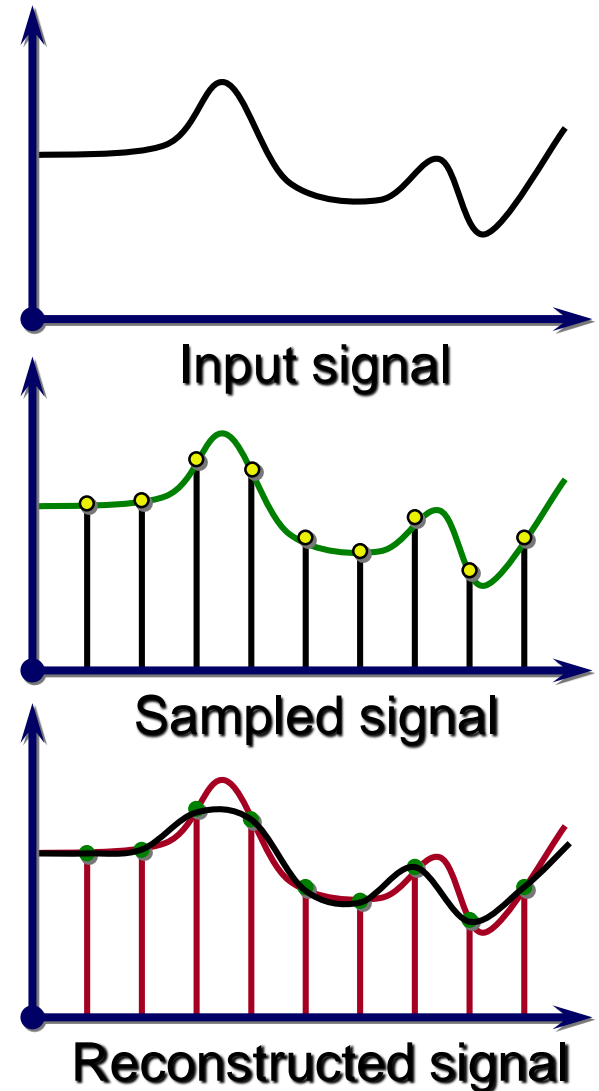
- Basic signal processing
- Filtering, resampling, warping, ...

Rendering

- Polygon rendering pipeline
- Basic ray tracing

Modeling

- Basic 3D object representations
- Polygonal meshes



Background

Image Processing

- Basic signal processing
- Filtering, resampling, warping, ...

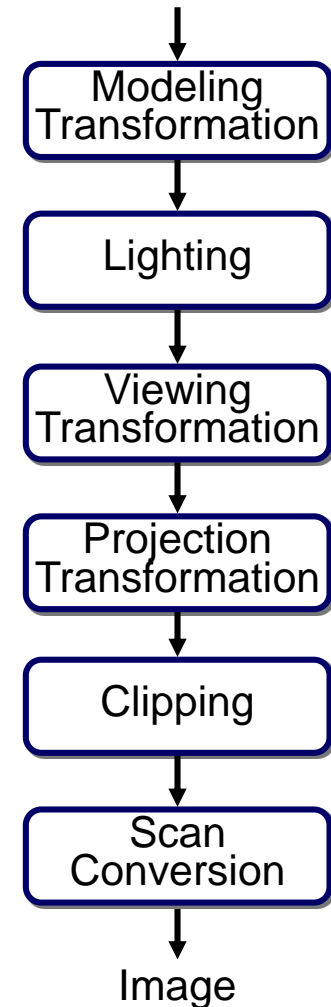
Rendering

- Polygon rendering pipeline
- Basic ray tracing

Modeling

- Basic 3D object representations
- Polygonal meshes

3D Geometric Primitives



Background

Image Processing

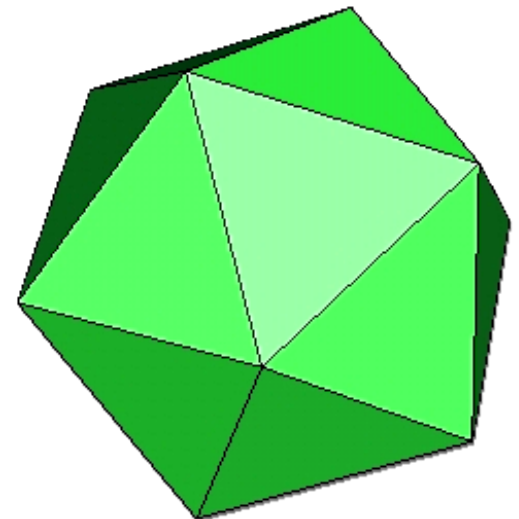
- Basic signal processing
- Filtering, resampling, warping, ...

Rendering

- Polygon rendering pipeline
- Basic ray tracing

Modeling

- Basic 3D object representations
- Polygonal meshes



CS526 Syllabus



- Global illumination
 - Monte Carlo path tracing
 - Photon mapping
- RGBD point sets
 - Image processing
 - Image-based rendering
 - 3D reconstruction
- Polygonal meshes
 - Mesh representations
 - Mesh analysis
 - Shape collections
- Special topics
 - Computational photography?
 - Fabrication?
 - Others?



CS526 Syllabus



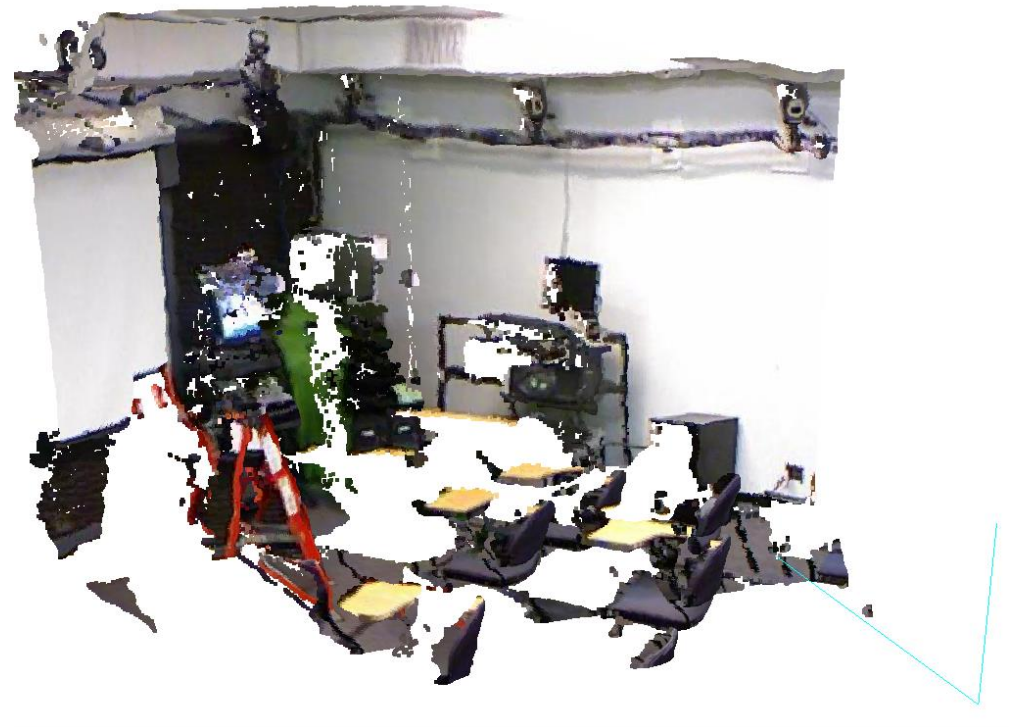
- Global illumination
 - Monte Carlo path tracing
 - Photon mapping
- RGBD point sets
 - Image processing
 - Image-based rendering
 - 3D reconstruction
- Polygonal meshes
 - Mesh representations
 - Mesh analysis
 - Shape collections
- Special topics
 - Computational photography?
 - Fabrication?
 - Others?





CS526 Syllabus

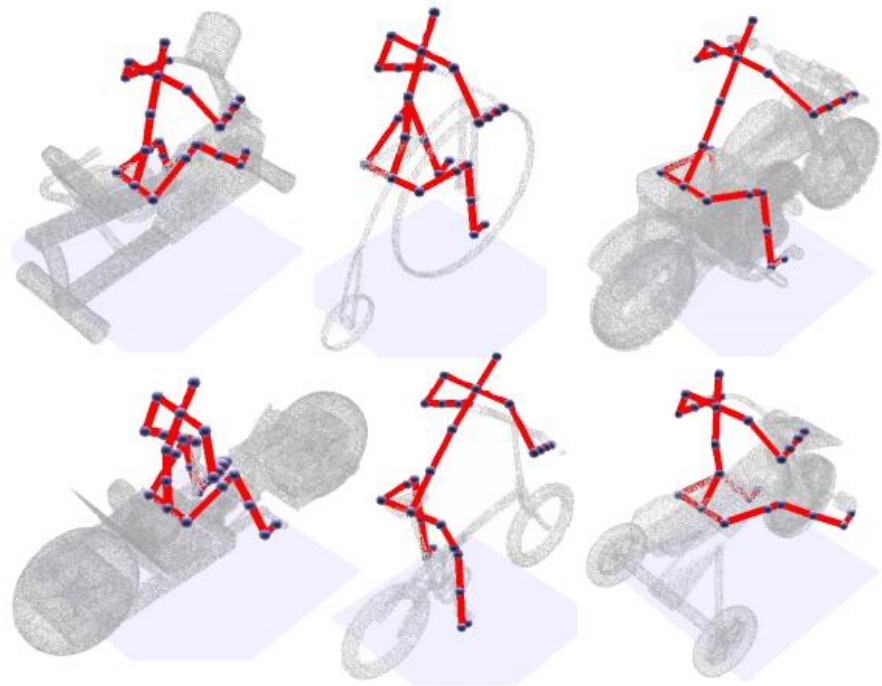
- Global illumination
 - Monte Carlo path tracing
 - Photon mapping
- RGBD point sets
 - Image processing
 - Image-based rendering
 - 3D reconstruction
- Polygonal meshes
 - Mesh representations
 - Mesh analysis
 - Shape collections
- Special topics
 - Computational photography?
 - Fabrication?
 - Others?





CS526 Syllabus

- Global illumination
 - Monte Carlo path tracing
 - Photon mapping
- RGBD point sets
 - Image processing
 - Image-based rendering
 - 3D reconstruction
- Polygonal meshes
 - Mesh representations
 - Mesh manipulation
 - Shape analysis
- Special topics
 - Computational photography?
 - Fabrication?
 - Others?





CS526 Syllabus

- Global illumination
 - Monte Carlo path tracing
 - Photon mapping
- RGBD point sets
 - Image processing
 - Image-based rendering
 - 3D reconstruction
- Polygonal meshes
 - Mesh representations
 - Mesh analysis
 - Shape collections
- **Special topics**
 - **Computational photography?**
 - **3D printing?**
 - **Others?**

CS526 Syllabus



COS526: Syllabus

www.cs.princeton.edu/courses/archive/fall16/cos526/syllabus.php

Syllabus (tentative)

Week	Lectures (click for notes)	Readings
Wed 9/14	Rendering Equation	[kajiya86] [zimmerman98] [greenberg97]
1 Mon 9/19	Monte Carlo Path Tracing	[jensen03]
Wed 9/21	Photon Mapping	[jensen96] [jensen01] [radiometry]
2 Mon 9/26	Reflectance	
Tue 9/27	Written Exercise 1 due	
Wed 9/28	Radiosity	[cohen88]
3 Mon 10/3	Real-time Rendering	
Wed 10/5	Image-Based Rendering	[shum00] [levoy96]
Sun 10/9	Programming Assignment 1 due	
4 Mon 10/10	Point Sets	[kobbelt04] [pfister00] [rusinkiewicz00]
Wed 10/12	Point Set Processing	
5 Mon 10/17	Point Set Surface Reconstruction	[hoppe92] [kazhdan06]
Tue 10/18	Written Exercise 2 due	
Wed 10/19	Point Set Alignment	[tami13] [rusinkiewicz201] [henry10]
6 Mon 10/24	Point Set Segmentation and Labeling	
Wed 10/26	Point Set Completion	
Fri 10/28	Programming Assignment 2 due	
Fall break!		
7 Mon 11/7	Polygonal Meshes	[botsch08] [alliez08]
Wed 11/9	Polygonal Mesh Analysis	[mitra14] [levy09] [zhang10]
8 Mon 11/14	Polygonal Mesh Manipulation	[sorkine05]
Wed 11/16	Polygonal Mesh Correspondence	[hormann08] [vankaick10]
9 Sun 11/20	Written Exercise 3 due	
Mon 11/21	Polygonal Mesh Segmentation	[shamir08]
Wed 11/23	Thanksgiving	
10 Mon 11/28	TBA	
Wed 11/30	TBA	
Wed 11/30	Programming Assignment 3 due	
11 Mon 12/5	TBA	
Wed 12/7	TBA	
Wed 12/7	Final Project Proposal due	
12 Mon 12/12	Final Project Talks I	
Wed 12/14	Final Project Talks II	
Winter break!		
Tue 1/17	Final Project Report due at 5PM	
TBA	Final Project Demos	

Coursework

3 Short written exercises

3 Programming assignments

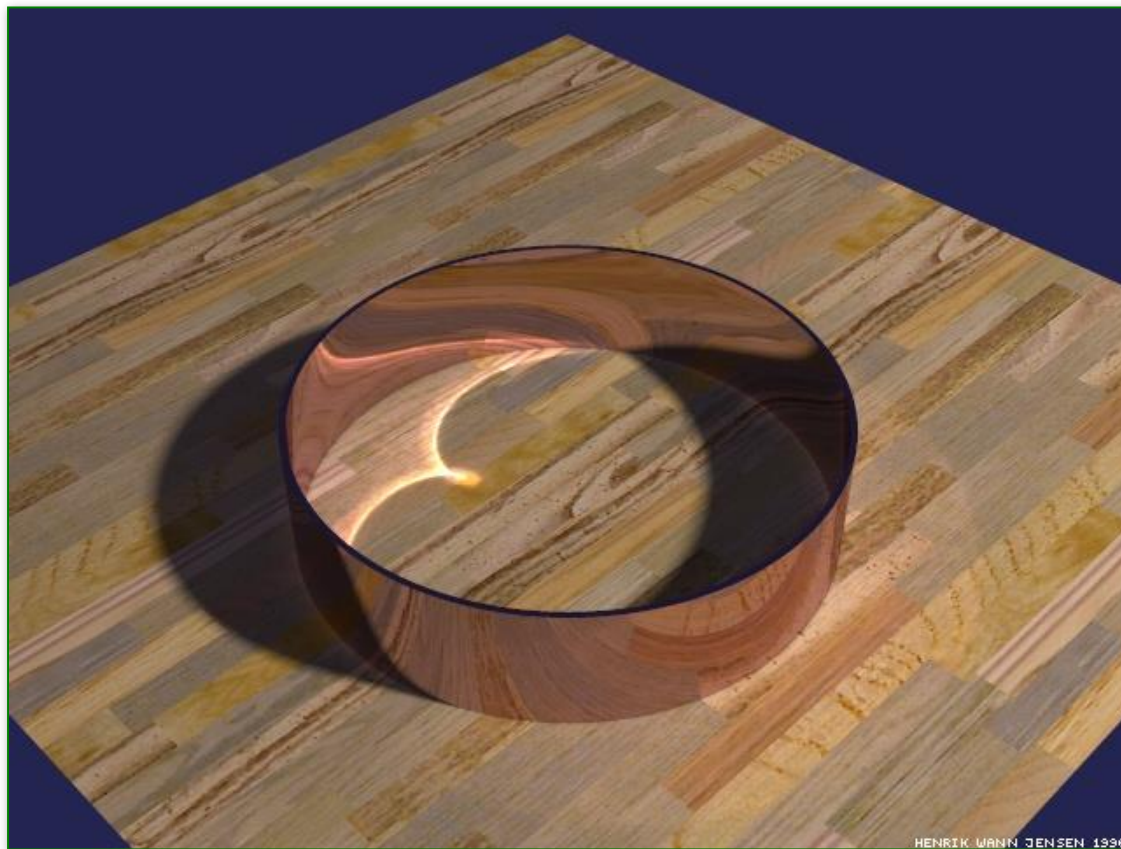
Final project



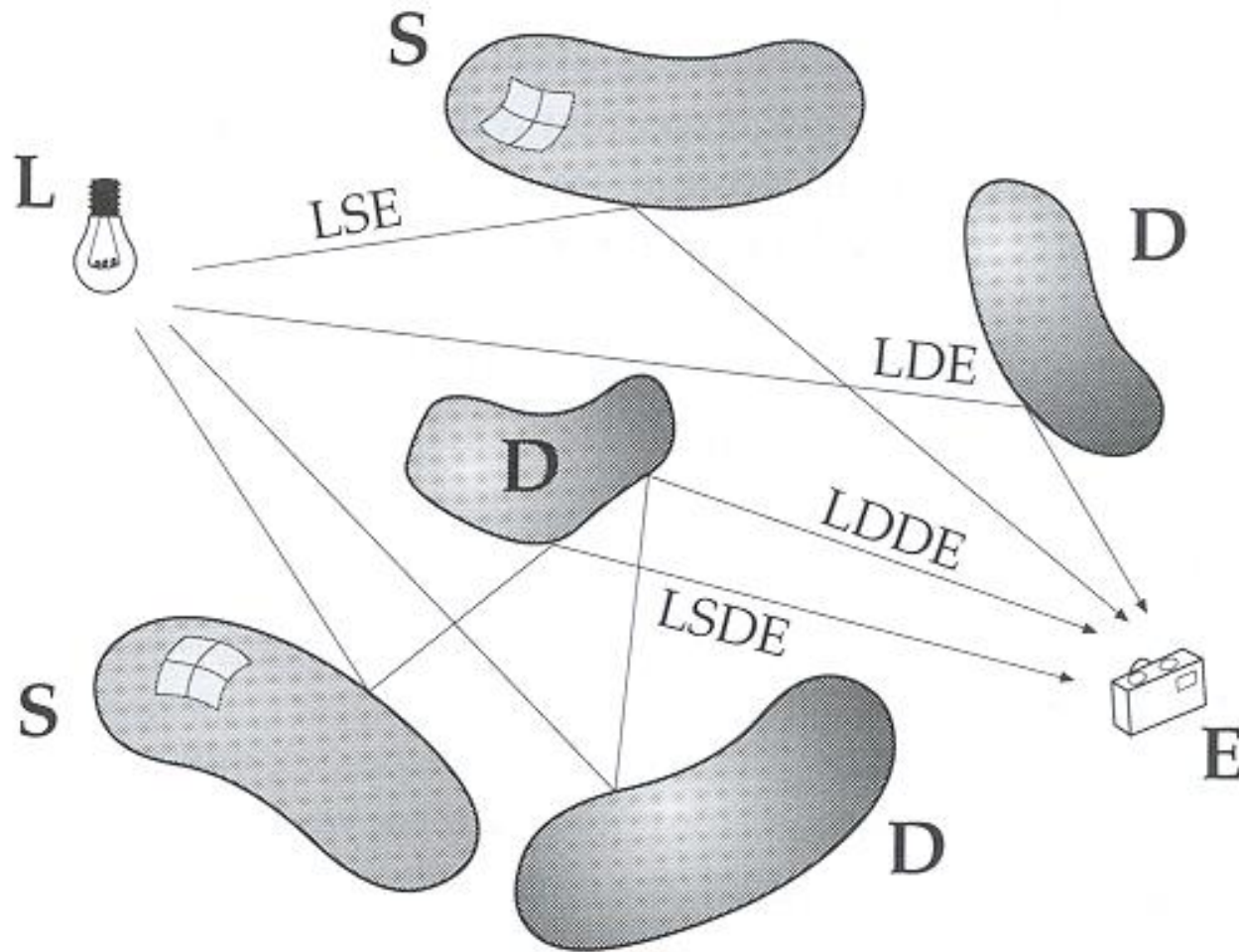
Let's Get Started

Goal

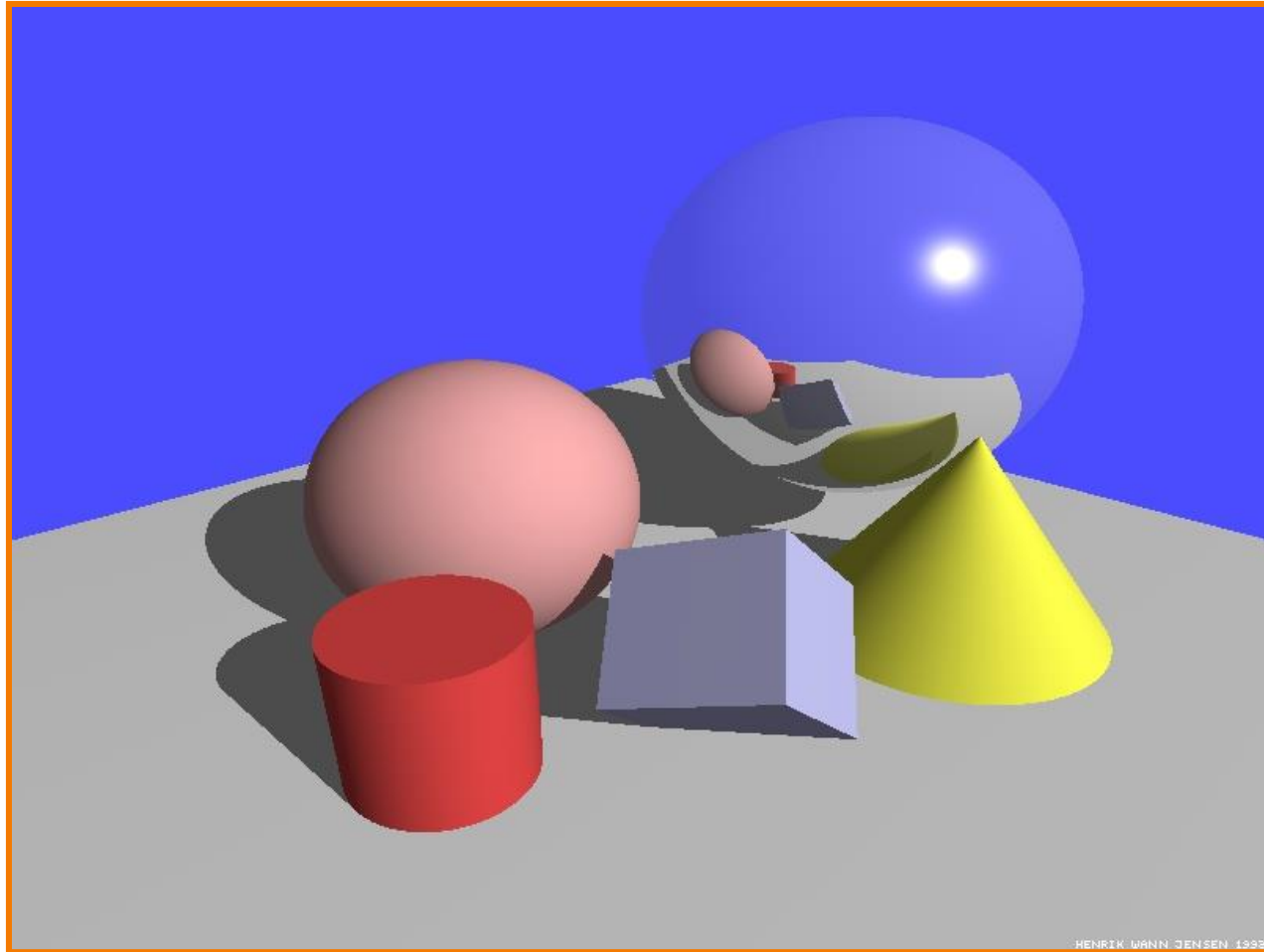
Synthesize image of a 3D scene accounting for all paths of light transport (including indirect illumination)



Path Types



Path Types?

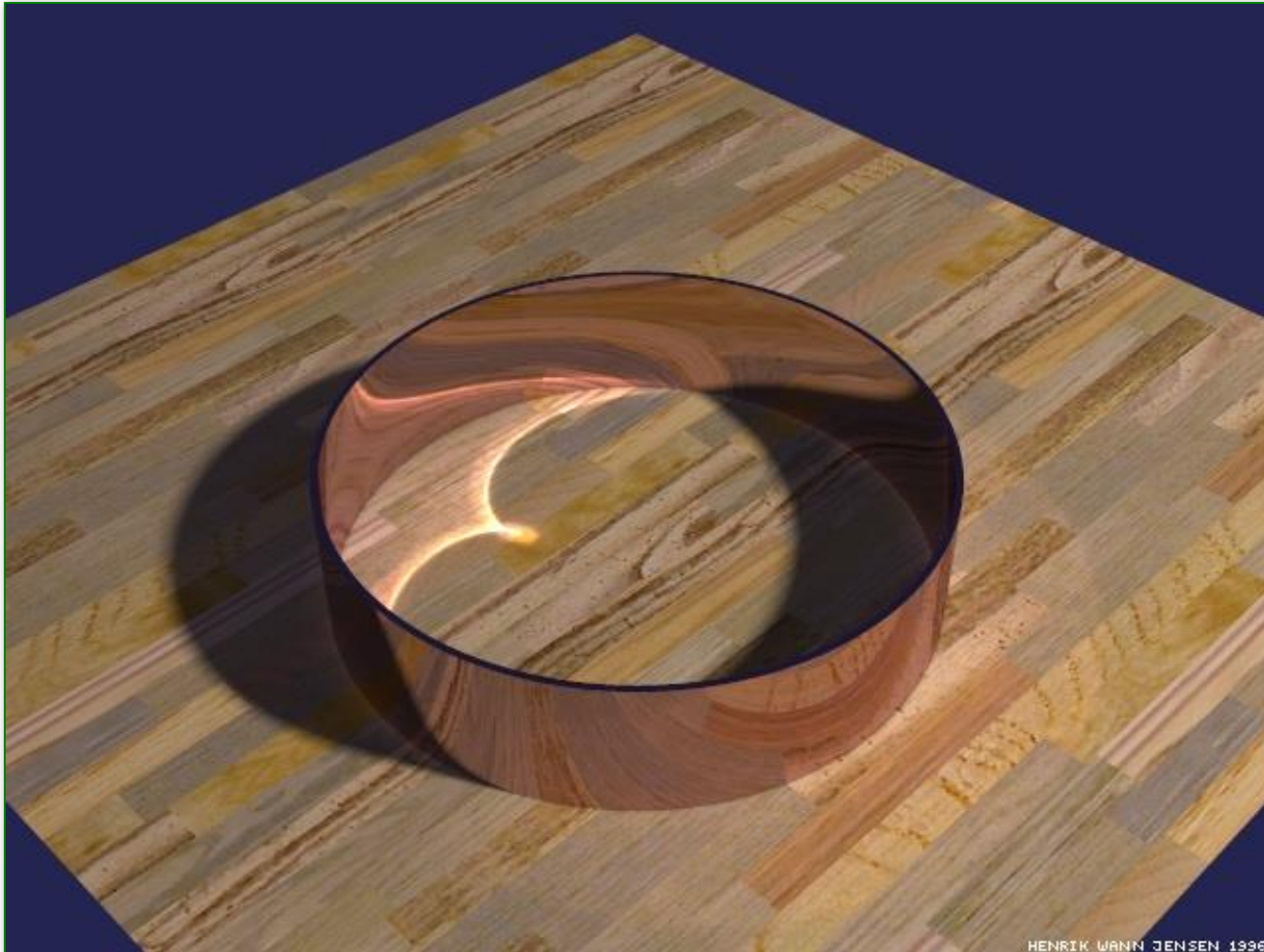


HENRIK WANN JENSEN 1998

Path Types?



Path Types?



Henrik Wann Jensen

Path Types?



Outline

Rendering equation

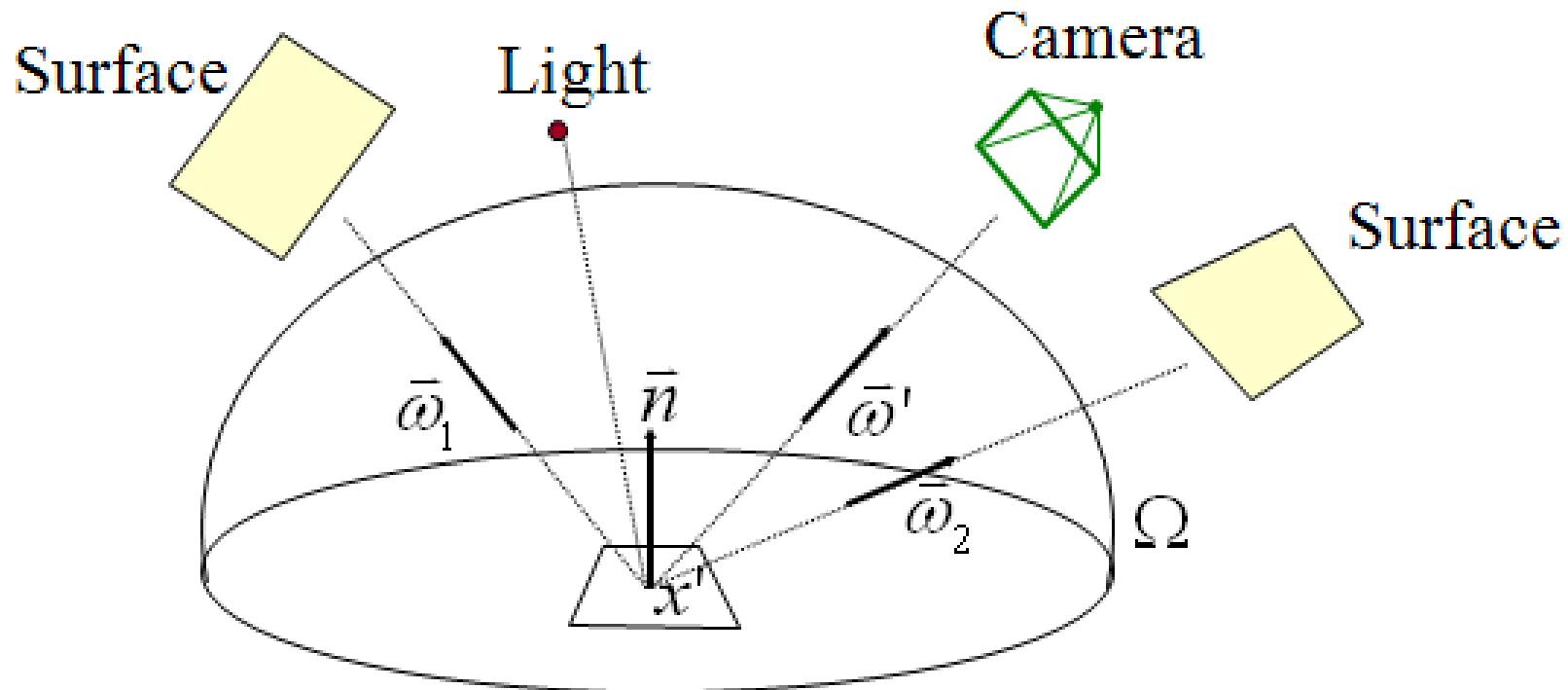
- Explanation of terms

Solution methods

- Direct illumination
- Recursive ray tracing
- Distribution ray tracing
- Path tracing
- Photon Mapping
- Radiosity
- etc.

Rendering Equation (1)

Compute radiance in outgoing direction by integrating reflections over all incoming directions

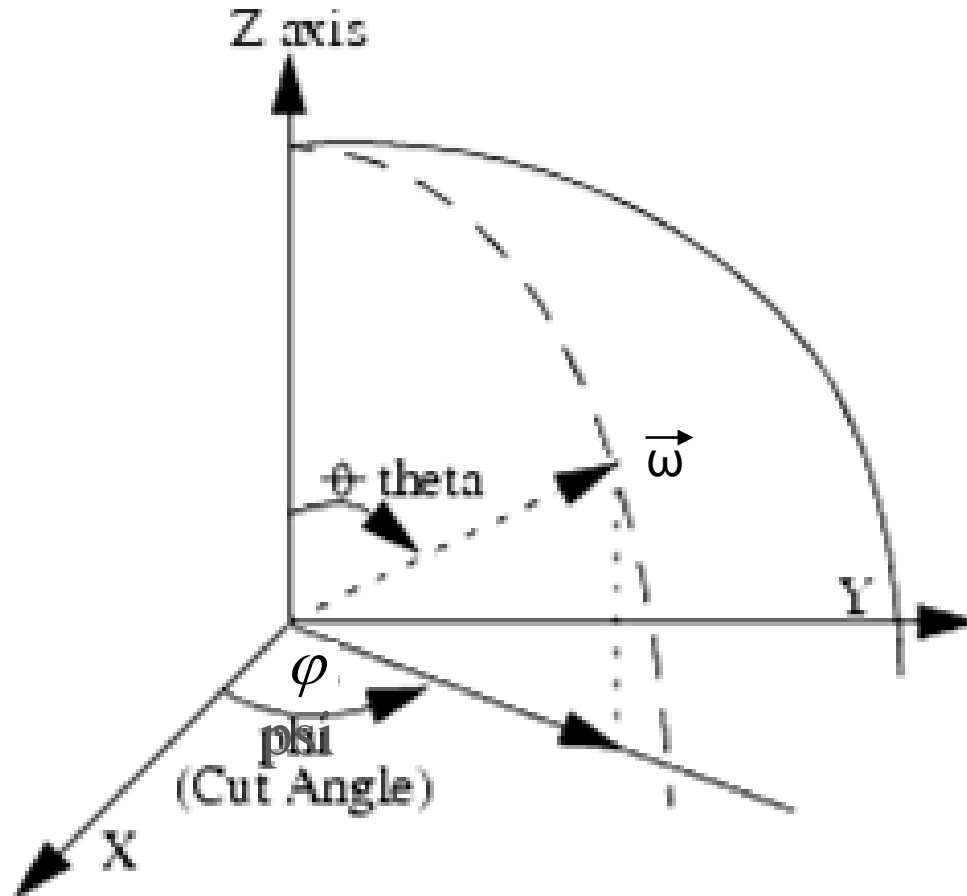


$$L_o(x', \bar{\omega}') = L_e(x', \bar{\omega}') + \int_{\Omega} f_r(x', \bar{\omega}, \bar{\omega}') L_i(x', \bar{\omega}) (\bar{\omega} \cdot \bar{n}) d\bar{\omega}$$

What is $\vec{\omega}$?

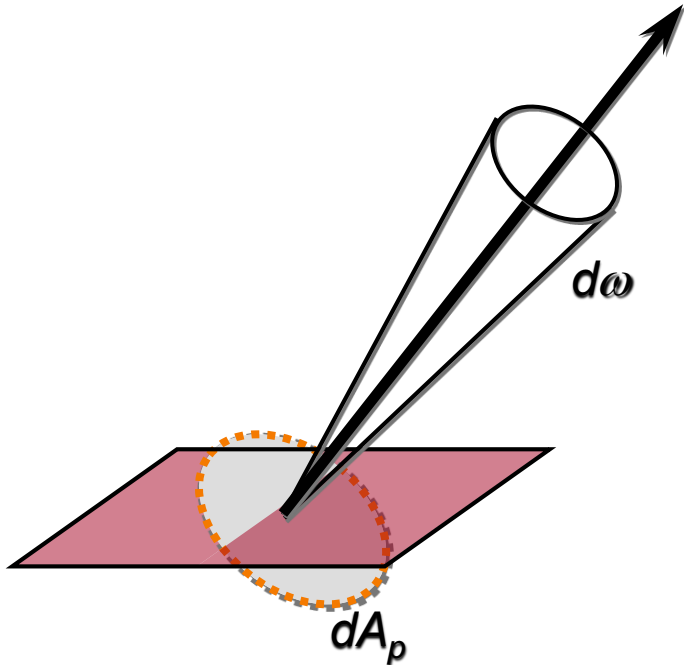
$\vec{\omega}$ is a direction

- 2-dimensional: (φ, θ)



What is L?

- Radiance = power emitted from a surface in a direction
- Power $d\Phi$ per unit area dA_p per unit solid angle $d\omega$



$$L = \frac{d\Phi}{dA_p d\vec{\omega}}$$

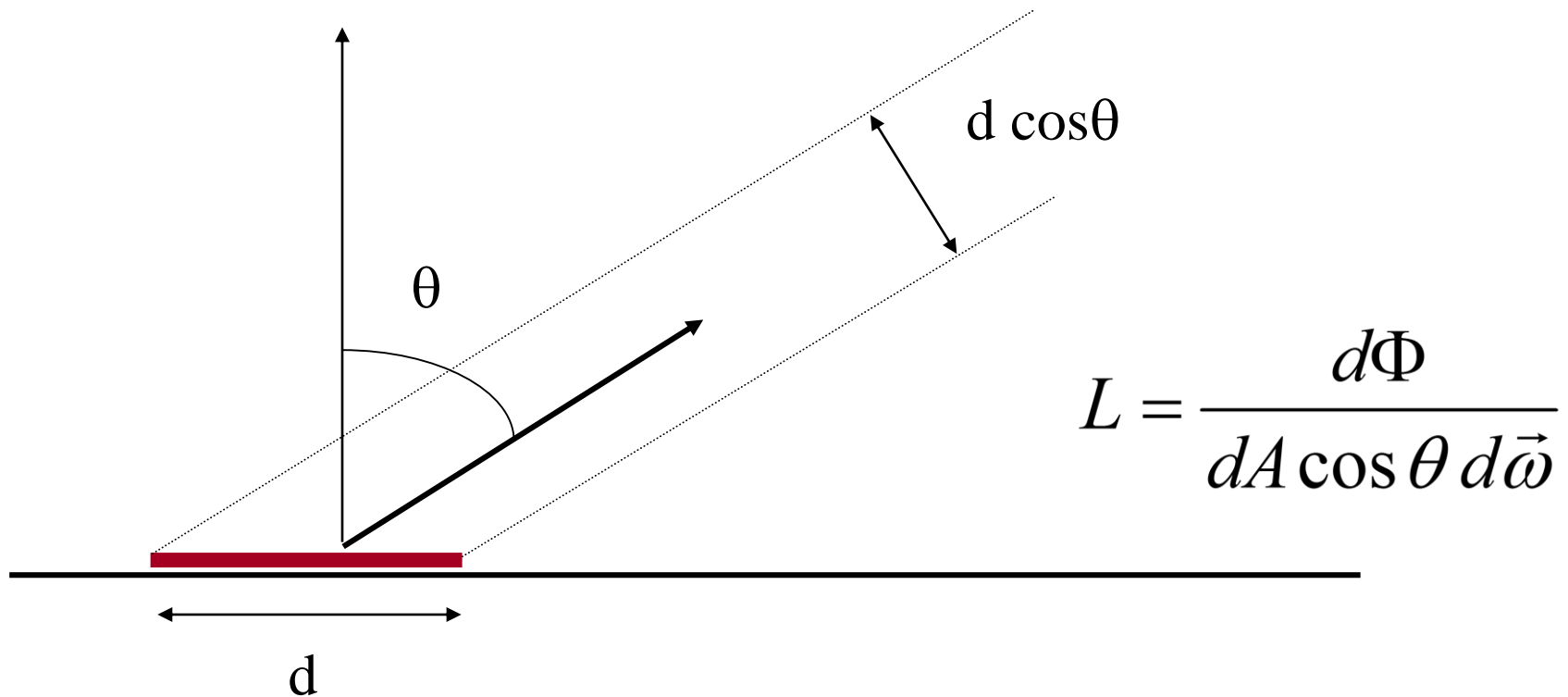
A_p = area perpendicular to given direction

$$L = \frac{d\Phi}{dA \cos \theta d\vec{\omega}}$$

Digression – Why Cosine Term?

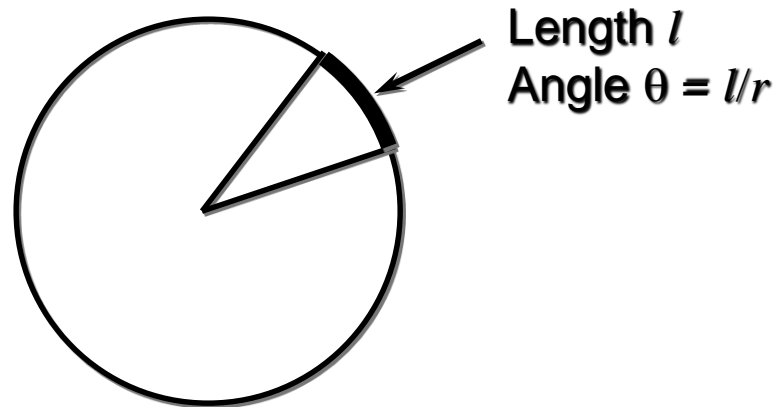
Foreshortening is by cosine of angle.

Radiance gives energy by *effective* surface area.

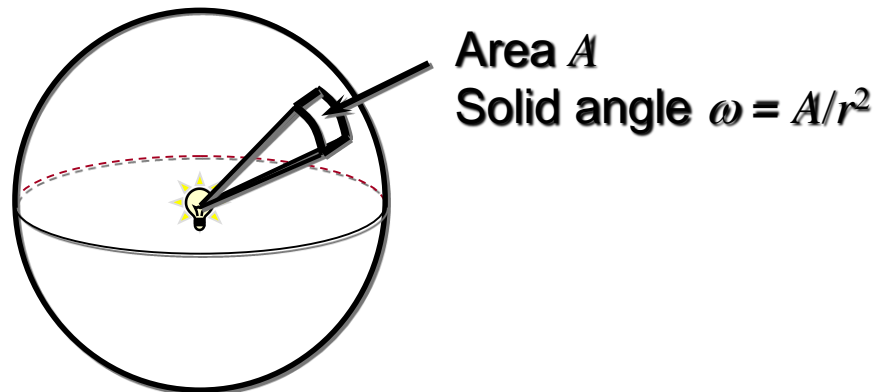


Digression – What is Solid Angle?

Angle in radians



Solid angle in steradians



Digression – Why Radiance?

Radiance doesn't change with distance

- Therefore it's the quantity we want to measure in a path tracer

Radiance is proportional to what a sensor (camera, eye) measures.

- Therefore it's what we want to output

Digression – What Units?

Light is a form of energy

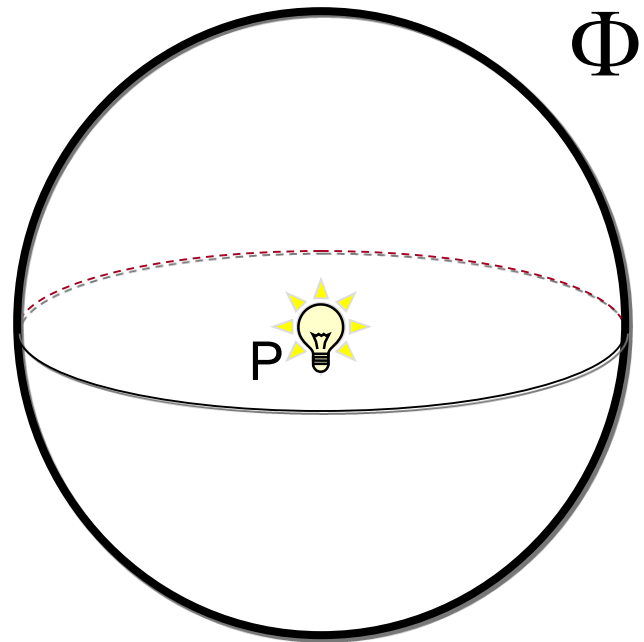
- Measured in Joules (J)

Power: energy per unit time

- Measured in Joules/sec = Watts (W)
- Also called Radiant Flux (Φ)

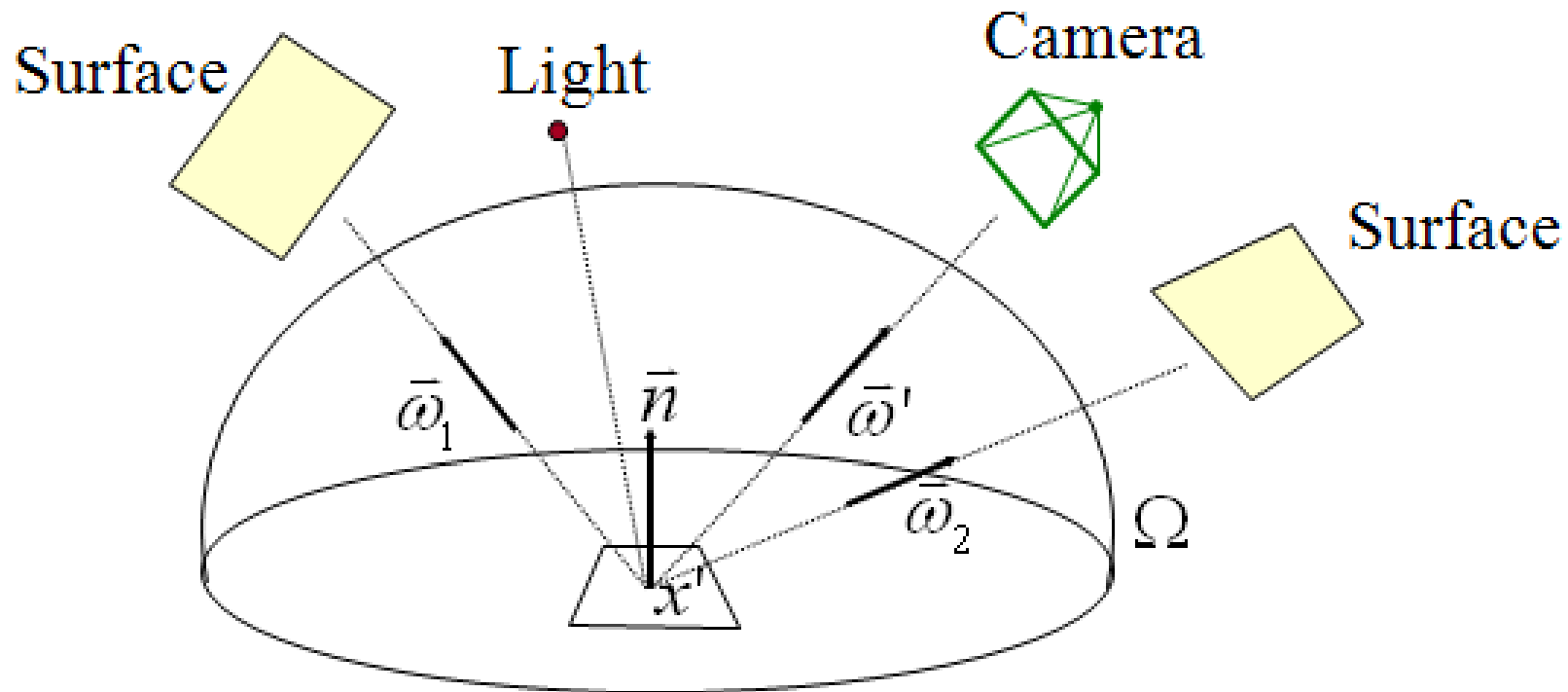
Radiance:

- Measured in $W/m^2/sr$



Rendering Equation (1) ... Again

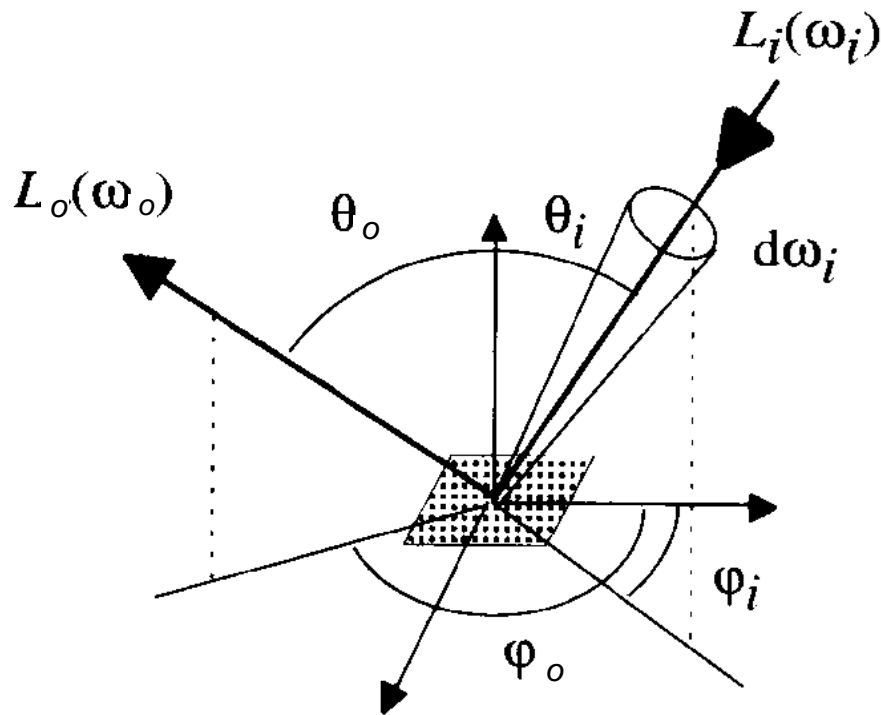
Compute radiance in outgoing direction by integrating reflections over all incoming directions



$$L_o(x', \bar{\omega}') = L_e(x', \bar{\omega}') + \int_{\Omega} f_r(x', \bar{\omega}, \bar{\omega}') L_i(x', \bar{\omega}) (\bar{\omega} \cdot \bar{n}) d\bar{\omega}$$

What is f_r ?

Bidirectional Reflectance Distribution Function (f_r) = fraction of irradiance E_i in incoming direction $\vec{\omega}_i$ reflected in outgoing direction $\vec{\omega}_o$



$$f_r(\omega_i \rightarrow \omega_o) = \frac{L_o(\omega_o)}{E_i(\omega_i)}$$

$$E_i(\vec{\omega}_i) \equiv L_i(\vec{\omega}_i) \cos \theta_i d\omega$$

$$f_r(\vec{\omega}_i \rightarrow \vec{\omega}_o) \equiv \frac{L_o(\vec{\omega}_o)}{L_i(\vec{\omega}_i) \cos \theta_i d\omega_i}$$

What is f_r ?

BRDF (f_r) is usually a 4-dimensional function for each of three frequencies:

$$f_r(\theta_i, \varphi_i, \theta_o, \varphi_o) = \frac{L_o(\theta_o, \varphi_o)}{E_i(\theta_i, \varphi_i)}$$

BRDF (f_r) is an intrinsic property of a surface material

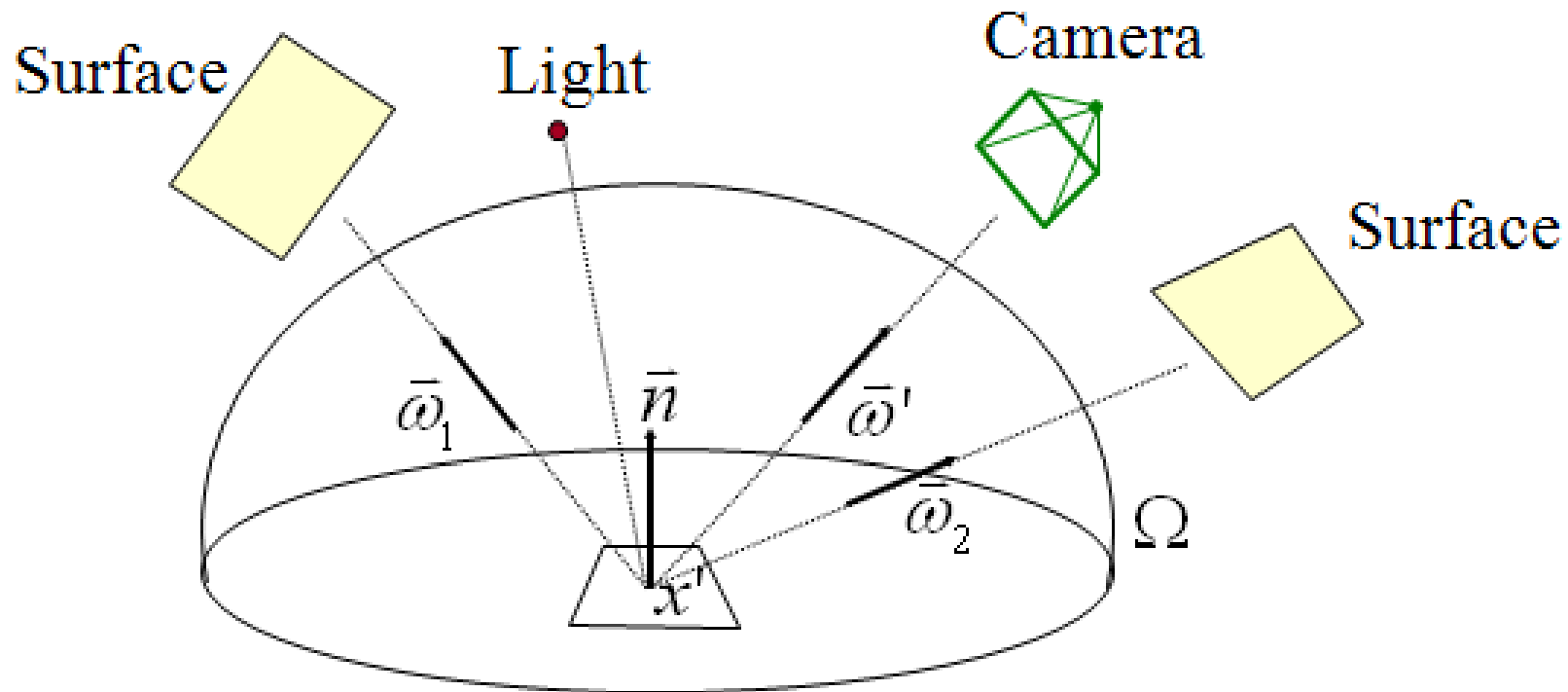
- Provided as part of material with scene description

Outgoing radiance and incoming irradiance are proportional to one another:

$$dL_o(\vec{\omega}_o) \propto dE_i(\vec{\omega}_i)$$

Rendering Equation (1) ... Again

Compute radiance in outgoing direction by integrating reflections over all incoming directions

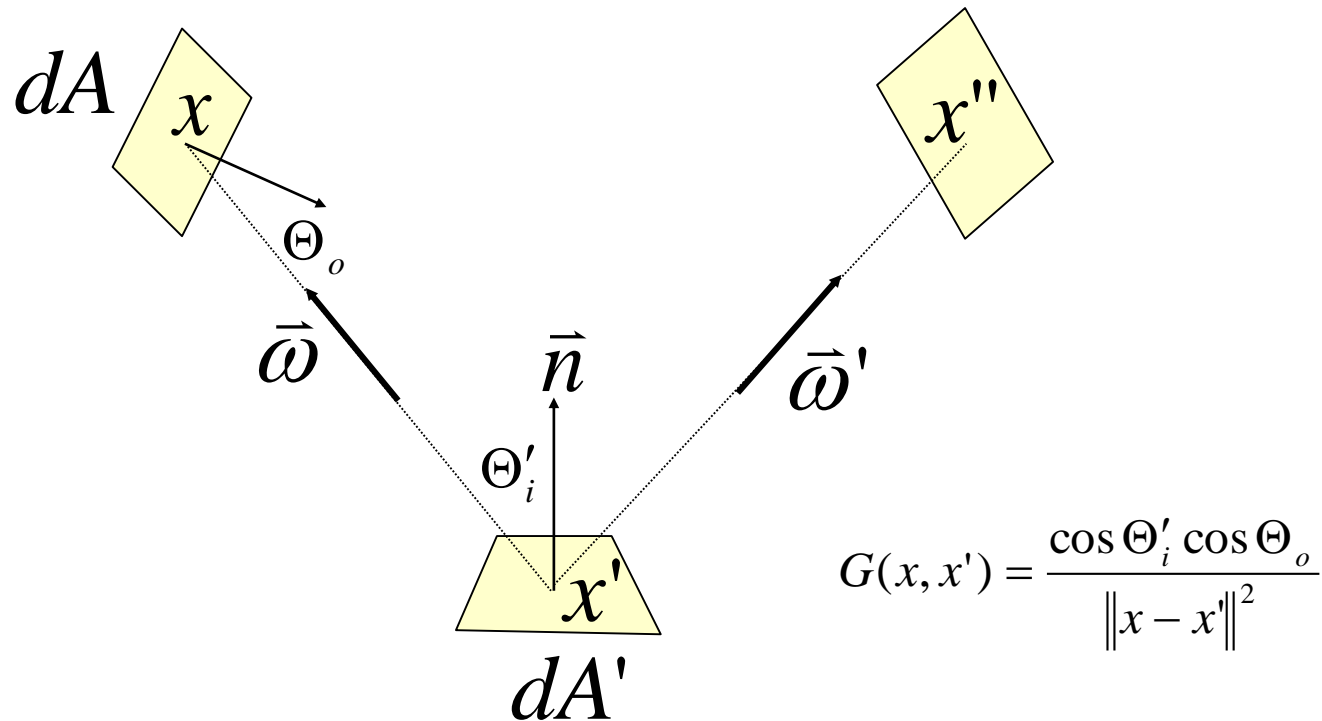


$$L_o(x', \bar{\omega}') = L_e(x', \bar{\omega}') + \int_{\Omega} f_r(x', \bar{\omega}, \bar{\omega}') L_i(x', \bar{\omega}) (\bar{\omega} \cdot \bar{n}) d\bar{\omega}$$

Rendering Equation (2)

Kajiya 1986

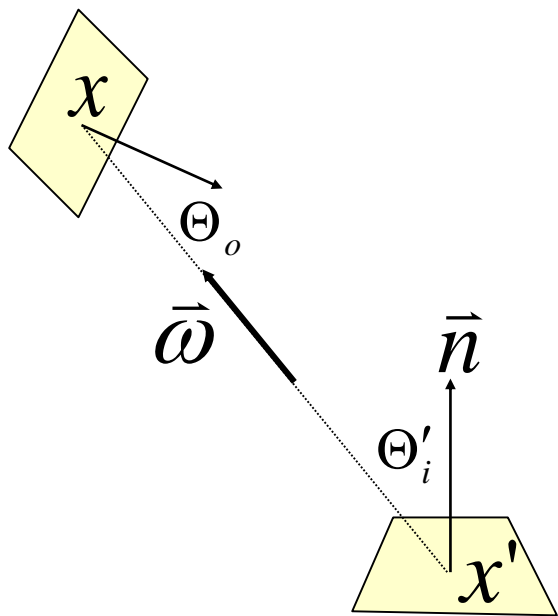
Compute radiance in outgoing direction by integrating reflections of light from other surfaces



$$L(x' \rightarrow x'') = L_e(x' \rightarrow x'') + \int_s f_r(x \rightarrow x' \rightarrow x'') L(x \rightarrow x') V(x, x') G(x, x') dA$$

What is $V(x, x')G(x, x')$?

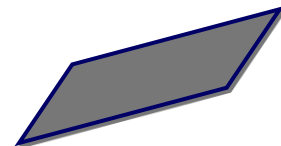
Irradiance at x in direction $\vec{\omega}$ as a fraction of radiance leaving x' in direction $\vec{\omega}$



Move surface away from light:
Inverse square law: $E \sim 1/r^2$



Tilt surface away from light:
Cosine law: $E \sim \mathbf{n} \cdot \mathbf{l}$



$$G(x, x') = \frac{\cos \Theta'_i \cos \Theta_o}{\|x - x'\|^2}$$

Outline

Rendering equation

- Explanation of terms

➤ Solution methods

- Direct illumination
- Recursive ray tracing
- Distribution ray tracing
- Path tracing
- Photon Mapping
- Radiosity
- etc.

Outline

Rendering equation

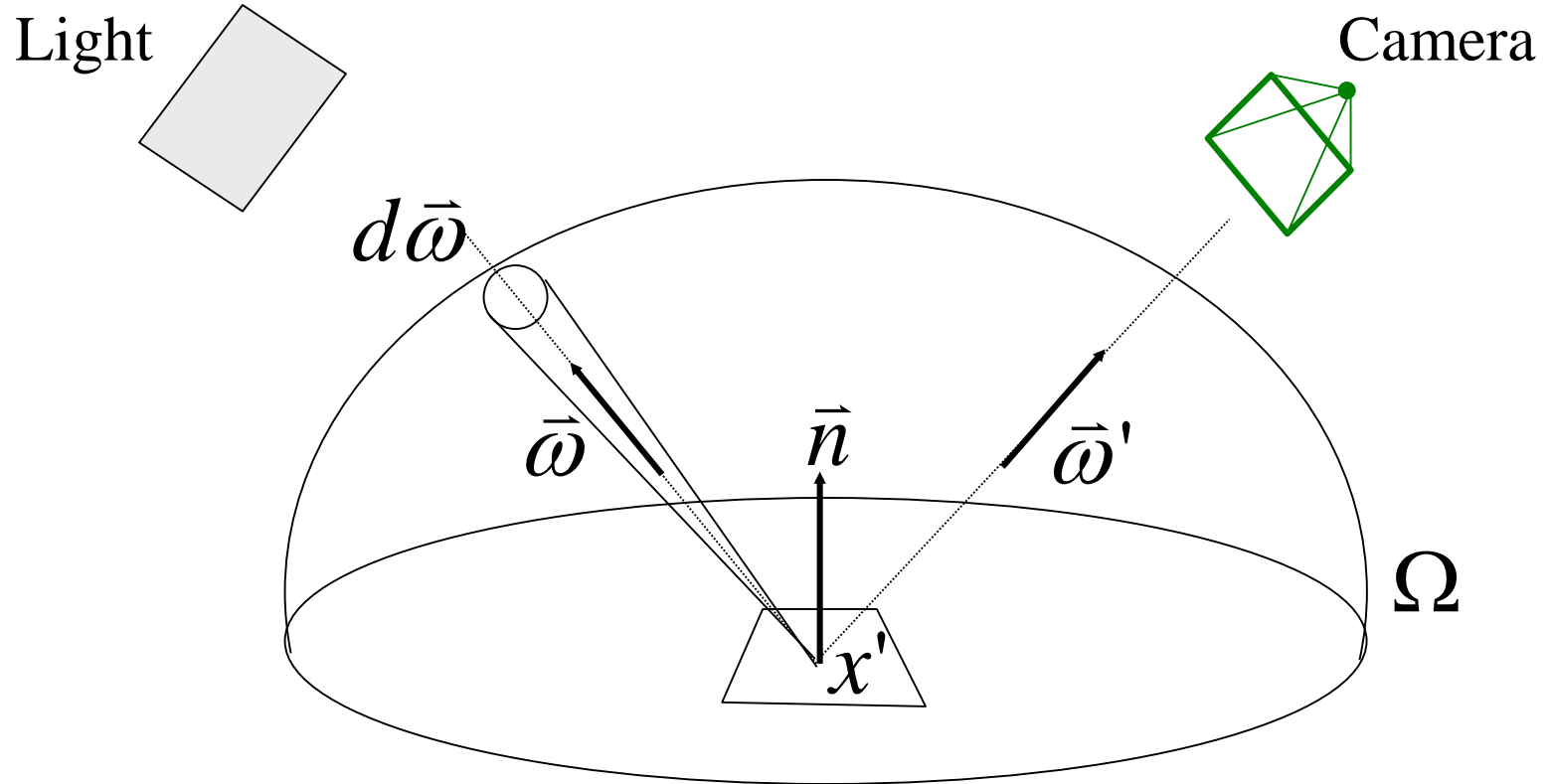
- Rendering is integration

Solution methods

- **Direct illumination**
 - Recursive ray tracing
 - Distribution ray tracing
 - Path tracing
 - Photon Mapping
 - Radiosity
 - etc.

Direct Illumination

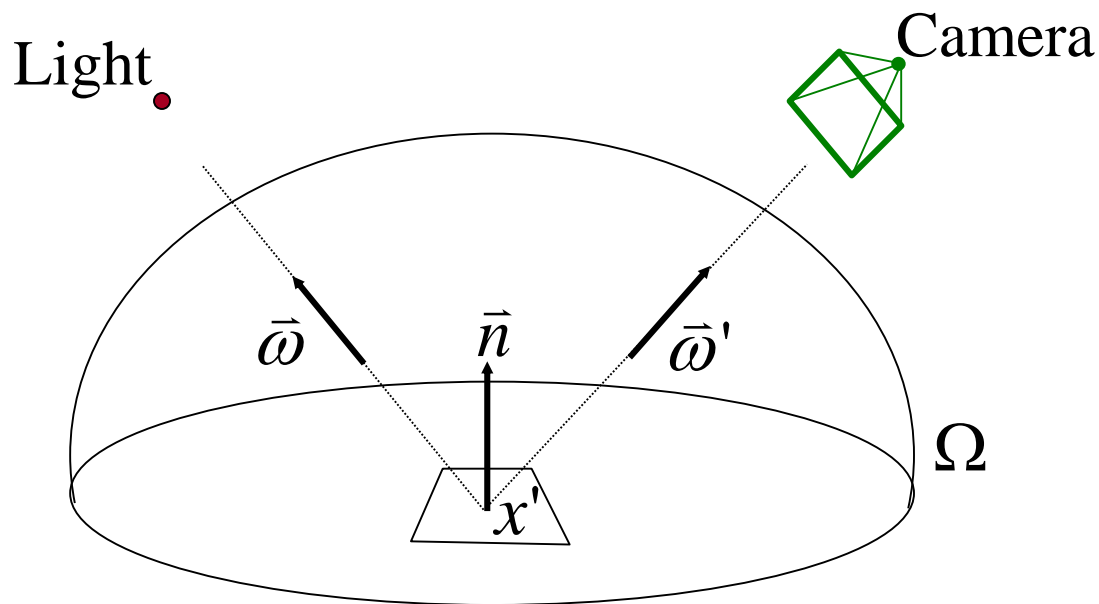
$$L_o(x', \bar{\omega}') = L_e(x', \bar{\omega}') + \int_{\Omega_L} f_r(x', \bar{\omega}, \bar{\omega}') L_i(x', \bar{\omega}) (\bar{\omega} \cdot \bar{n}) d\bar{\omega}$$



OpenGL

$$L_o(x', \bar{\omega}') = L_e(x', \bar{\omega}') + \int_{\Omega} f_r(x', \bar{\omega}, \bar{\omega}') L_i(x', \bar{\omega}) (\bar{\omega} \cdot \bar{n}) d\bar{\omega}$$

Assume
direct illumination
from point lights
and ignore visibility



$$L_o(x', \bar{\omega}') = L_e(x', \bar{\omega}') + \sum_{i=1}^{nlights} f_r(x', \bar{\omega}, \bar{\omega}') L_i(x', \bar{\omega}) (\bar{\omega} \cdot \bar{n})$$

Outline

Rendering equation

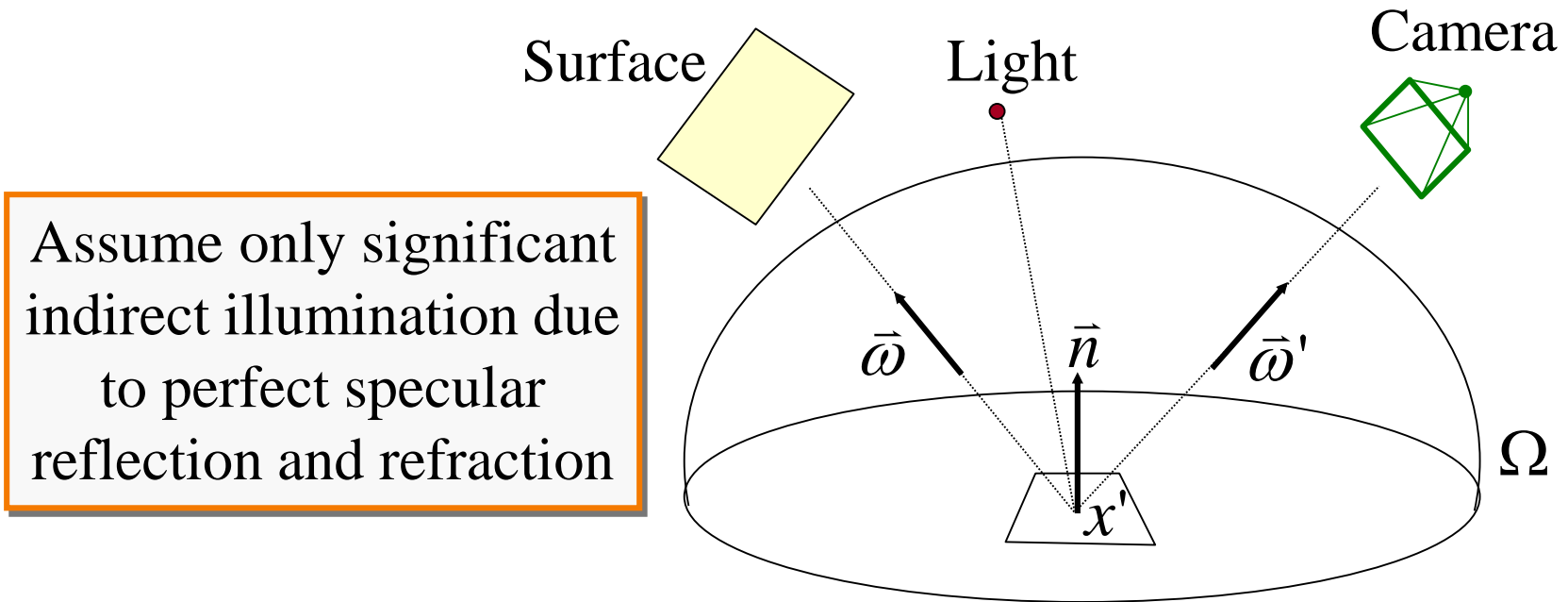
- Rendering is integration

Solution methods

- Direct illumination
- Recursive ray tracing
- Distribution ray tracing
- Path tracing
- Photon Mapping
- Radiosity
- etc.

Recursive Ray Tracing

$$L_o(x', \bar{\omega}') = L_e(x', \bar{\omega}') + \int_{\Omega} f_r(x', \bar{\omega}, \bar{\omega}') L_i(x', \bar{\omega}) (\bar{\omega} \cdot \bar{n}) d\bar{\omega}$$



$$L_o(x', \bar{\omega}') = L_e(x', \bar{\omega}') + \sum_{i=1}^{nlights} f_r(x', \bar{\omega}, \bar{\omega}') L_i(x', \bar{\omega}) (\bar{\omega} \cdot \bar{n}) + specular$$

Outline

Rendering equation

- Rendering is integration

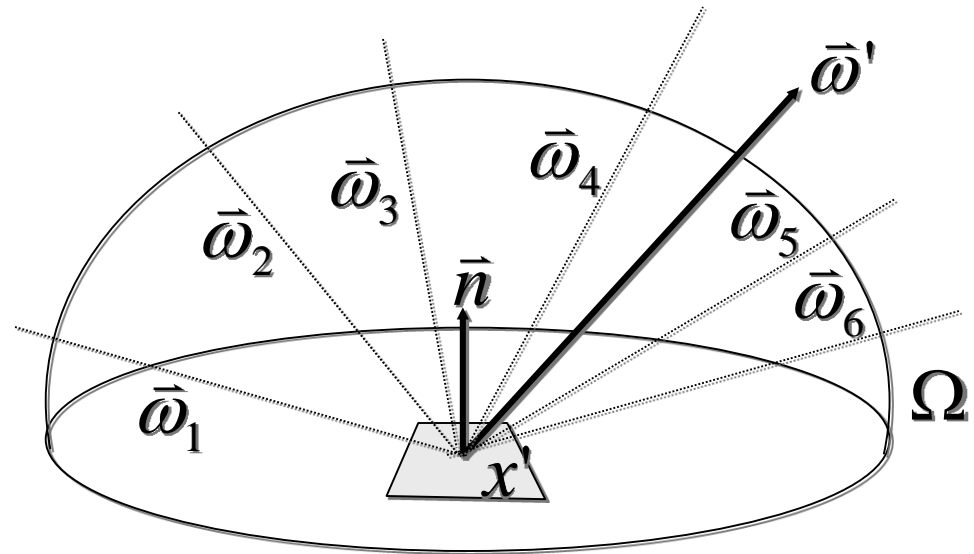
Solution methods

- Direct illumination
- Recursive ray tracing
- **Distribution ray tracing**
- Path tracing
- Photon Mapping
- Radiosity
- etc.

Distribution Ray Tracing

$$L_o(x', \bar{\omega}') = L_e(x', \bar{\omega}') + \int_{\Omega} f_r(x', \bar{\omega}, \bar{\omega}') L_i(x', \bar{\omega}) (\bar{\omega} \cdot \bar{n}) d\bar{\omega}$$

Estimate integral
for each reflection
by random sampling



Also:

- Depth of field
- Motion blur
- etc.

Outline

Rendering equation

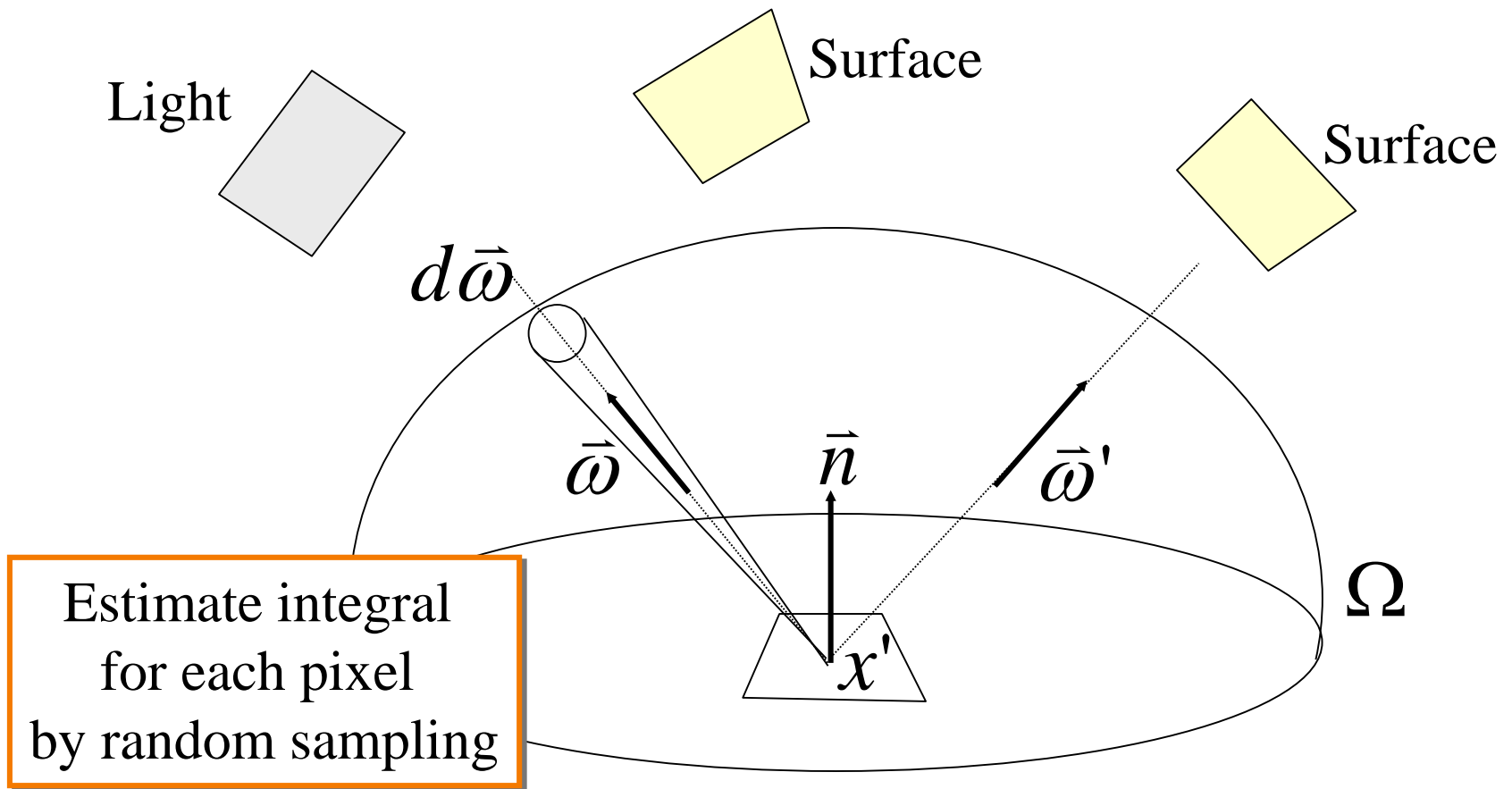
- Rendering is integration

Solution methods

- Direct illumination
- Recursive ray tracing
- Distribution ray tracing
- Path tracing
- Photon Mapping
- Radiosity
- etc.

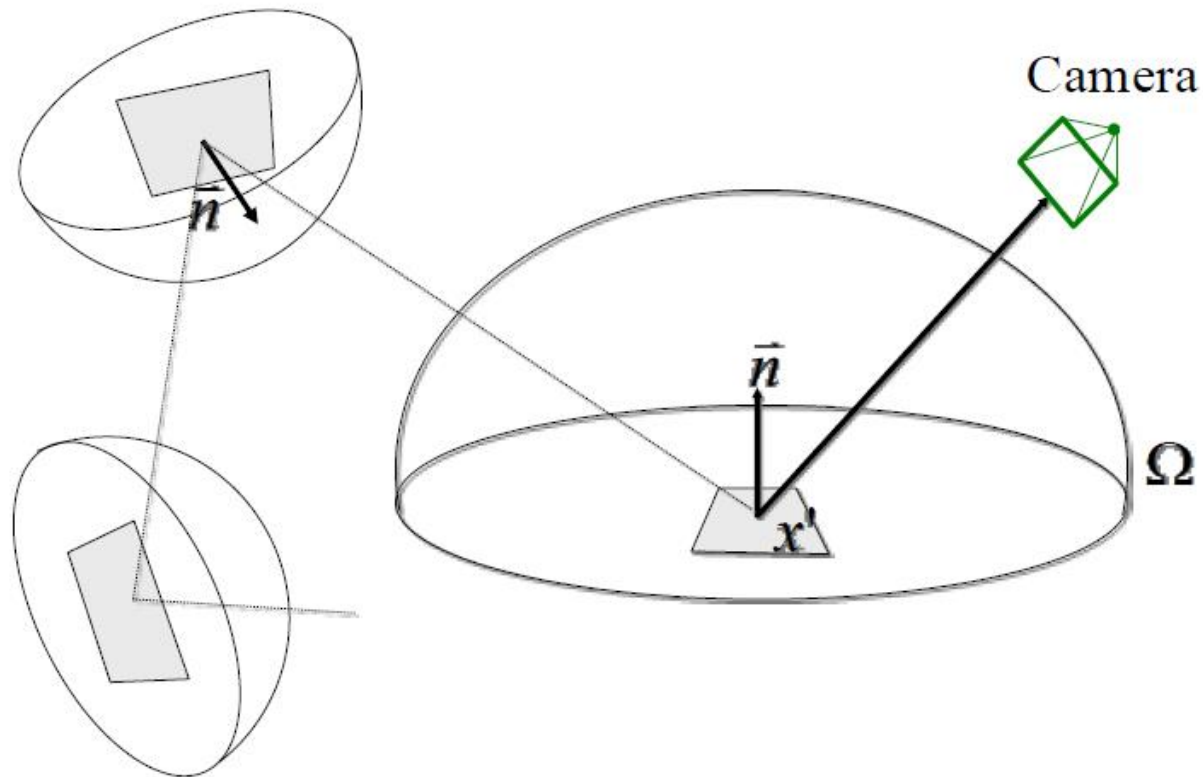
Path Tracing

$$L_o(x', \bar{\omega}') = L_e(x', \bar{\omega}') + \int_{\Omega} f_r(x', \bar{\omega}, \bar{\omega}') L_i(x', \bar{\omega}) (\bar{\omega} \cdot \bar{n}) d\bar{\omega}$$



Path Tracing

Estimate integral for each pixel by sampling paths from the camera



Outline

Rendering equation

- Rendering is integration

Solution methods

- Direct illumination
- Recursive ray tracing
- Distribution ray tracing
- Path tracing
- **Photon Mapping**
- Radiosity
- etc.

Photon Mapping

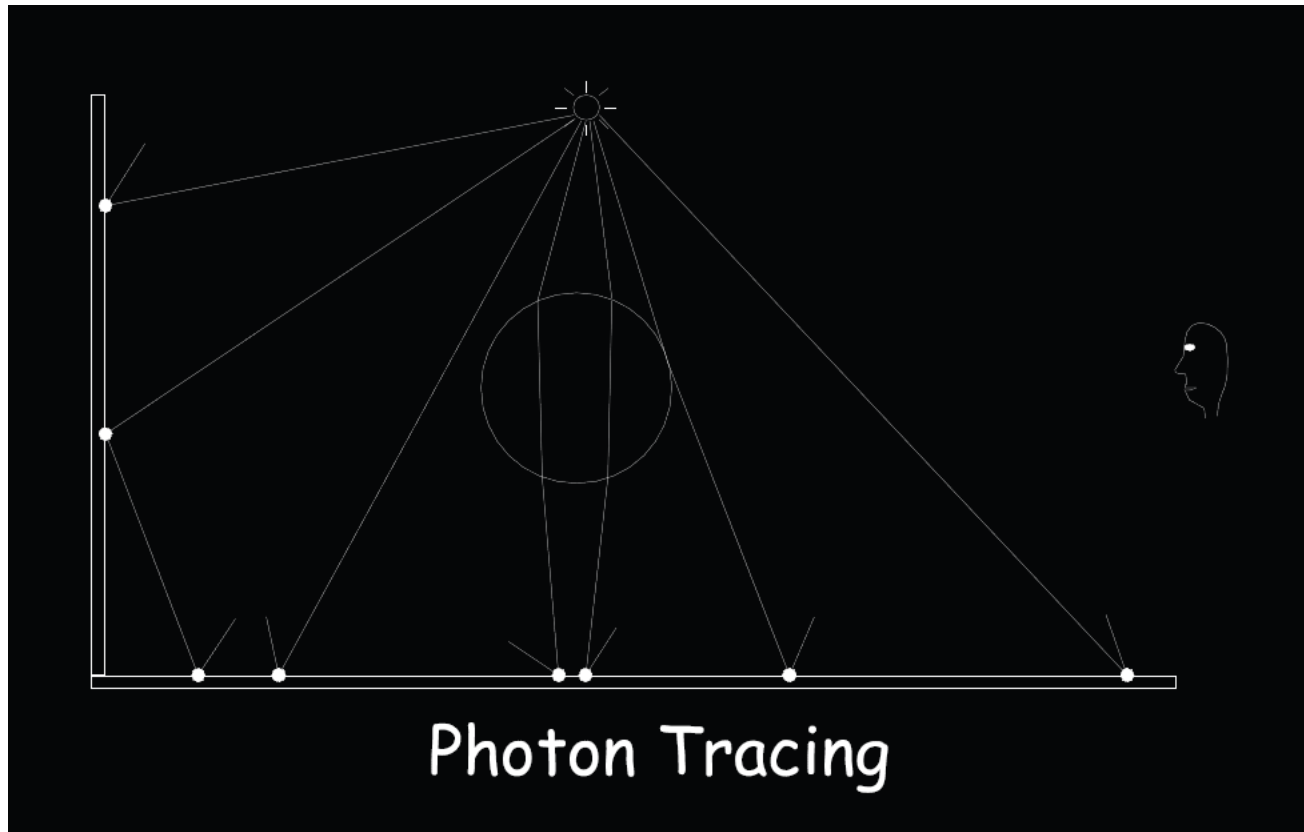
Two pass method:

1. Build photon map by tracing paths from lights
2. Render image by tracing paths from camera

Photon Mapping

Two pass method:

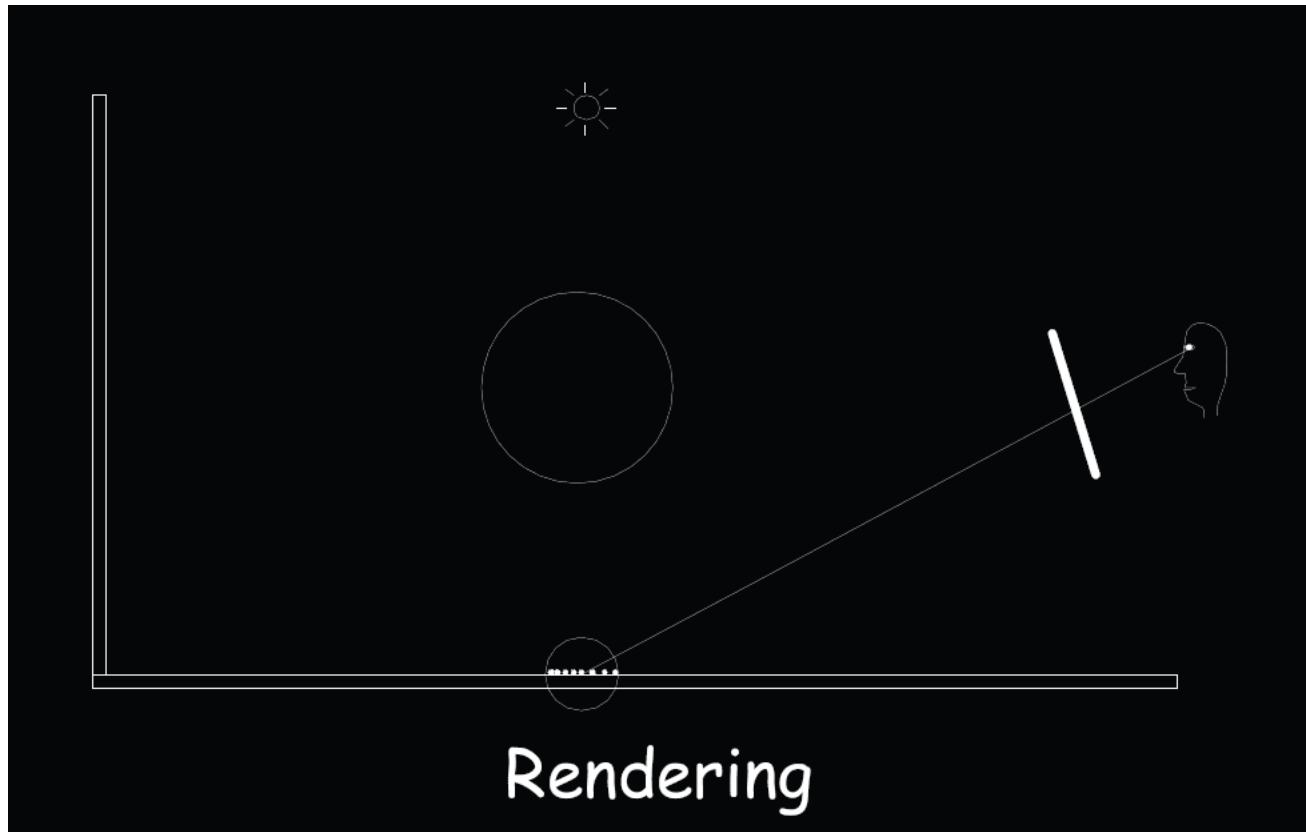
1. Build photon map by tracing paths from lights
2. Render image by tracing paths from camera



Photon Mapping

Two pass method:

1. Build photon map by tracing paths from lights
2. Render image by tracing paths from camera



Outline

Rendering equation

- Rendering is integration

Solution methods

- Direct illumination
- Recursive ray tracing
- Distribution ray tracing
- Path tracing
- Photon Mapping
- Radiosity
- etc.

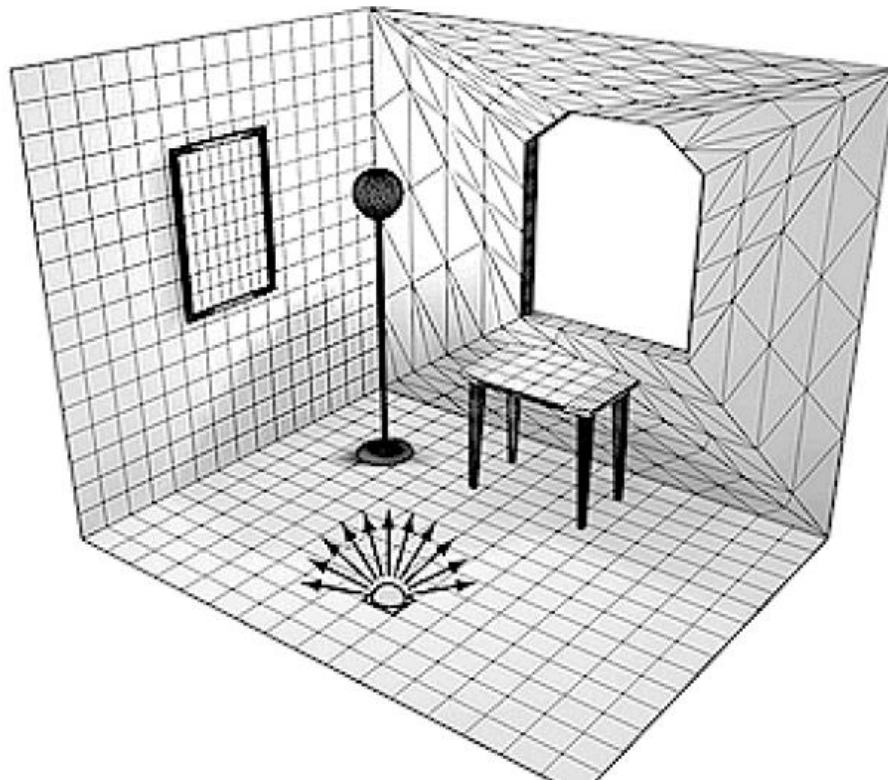
Radiosity

Discretize surfaces into small patches



Radiosity

Assume simple function (constant) is good approximation for radiosity (sum of all energy leaving a point) within a patch



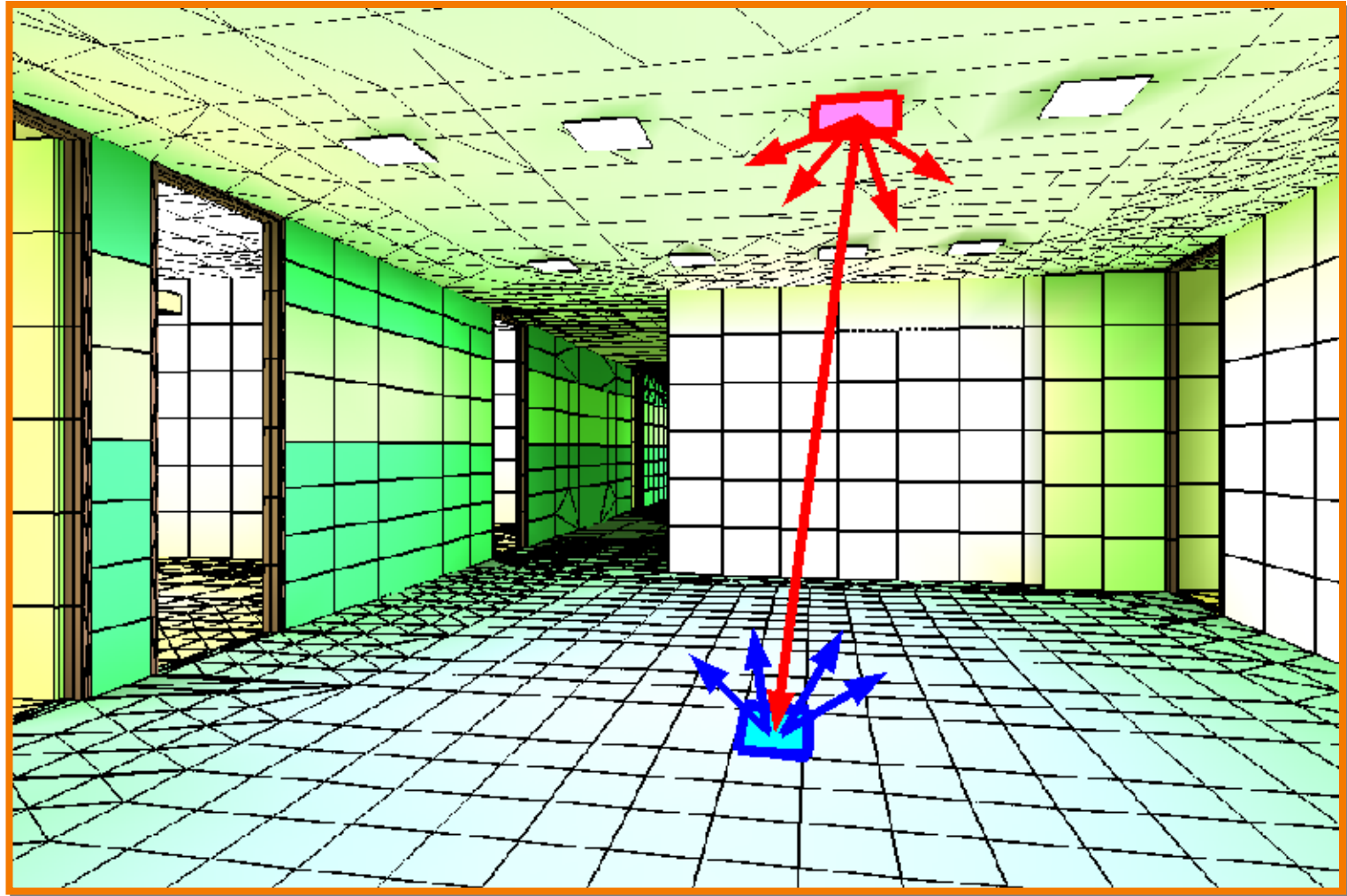
Radiosity

Leads to sparse linear system of equations

$$B_i A_i = E_i A_i + \rho_i \sum_{j=1}^N F_{ji} B_j A_j$$

$$\begin{bmatrix} 1 - \rho_1 F_{1,1} & \cdot & \cdot & \cdot & -\rho_1 F_{1,n} \\ -\rho_2 F_{2,1} & 1 - \rho_2 F_{2,2} & \cdot & \cdot & -\rho_2 F_{2,n} \\ \cdot & \cdot & \cdot & \cdot & \cdot \\ \cdot & \cdot & \cdot & \cdot & \cdot \\ -\rho_{n-1} F_{n-1,1} & \cdot & \cdot & \cdot & -\rho_{n-1} F_{n-1,n} \\ -\rho_n F_{n,1} & \cdot & \cdot & \cdot & 1 - \rho_n F_{n,n} \end{bmatrix} \begin{bmatrix} B_1 \\ B_2 \\ \cdot \\ \cdot \\ \cdot \\ B_n \end{bmatrix} = \begin{bmatrix} E_1 \\ E_2 \\ \cdot \\ \cdot \\ \cdot \\ E_n \end{bmatrix}$$

Radiosity



Outline

Rendering equation

- Explanation of terms

Solution methods

- Direct illumination
- Recursive ray tracing
- Distribution ray tracing
- Path tracing
- Photon Mapping
- Radiosity
- etc.

Which method is best?

Summary

Rendering equation

- Rendering is integration

Different solution methods are best for different types of scenes (depending on path types)

- Direct illumination - LDE
- Recursive ray tracing - LDS^*E
- Distribution ray tracing – $L(SD)^*E$
- Path tracing– $L(SD)^*E$
- Photon Mapping– $L(SD)^*E$ (biased)
- Radiosity – LD^*E
- etc.

Radiometric and Photometric Units

Radiant energy Joule (J)	Luminous energy Talbot
Radiant flux or power (F) Watt (W) = J / sec	Luminous power Lumen (lm) = talbot / sec = cd · sr
Radiant intensity (I) W / sr	Luminous intensity Candela (cd)
Irradiance (E) W / m ²	Illuminance Lux = lm / m ²
Radiance (L) W / m ² / sr	Luminance Nit = lm / m ² / sr
Radiosity (B) W / m ²	Luminosity Lux = lm / m ²