

Sampling and Reconstruction of Visual Appearance: From Denoising to View Synthesis

CSE 274 [Fall 2022], Lecture 2

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Motivation: BRDFs, Radiometry

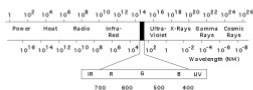
- Basics of Illumination, Reflection
- Formal radiometric analysis (not ad-hoc)
- Reflection Equation
- Ray Tracing and Rendering Equation 2nd half
- Monte Carlo Rendering next week
- Appreciate formal analysis in a graduate course, even if not absolutely essential in practice
- Please e-mail re papers you want to present (by Th)*

2

Light

Visible electromagnetic radiation

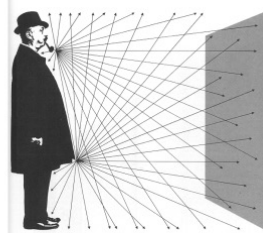
Power spectrum



Polarization

Photon (quantum effects)

Wave (interference, diffraction)



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Radiometry

- Physical measurement of electromagnetic energy
- Measure spatial (and angular) properties of light
 - Radiance, Irradiance
- Reflection functions: Bi-Directional Reflectance Distribution Function or BRDF
- Reflection Equation
- Simple BRDF models

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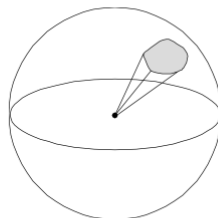
Angles and Solid Angles

■ Angle $\theta = \frac{l}{r}$

⇒ circle has 2π radians

■ Solid angle $\Omega = \frac{A}{R^2}$

⇒ sphere has 4π steradians

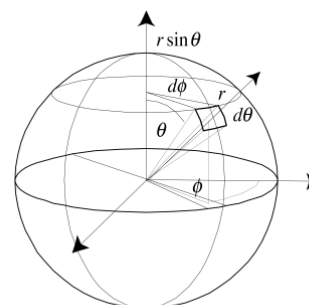


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Differential Solid Angles



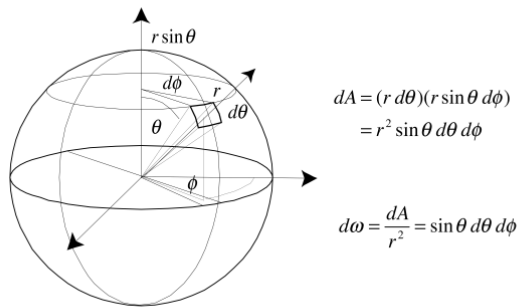
$$dA = (r d\theta)(r \sin \theta d\phi) \\ = r^2 \sin \theta d\theta d\phi$$

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Differential Solid Angles

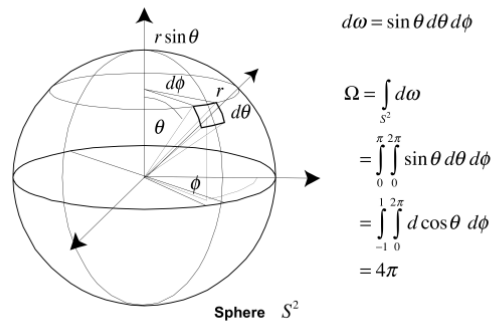


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Differential Solid Angles



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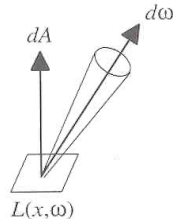
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Radiance

- Power per unit projected area perpendicular to the ray per unit solid angle in the direction of the ray

- Symbol: $L(x, \omega)$ (W/m² sr)

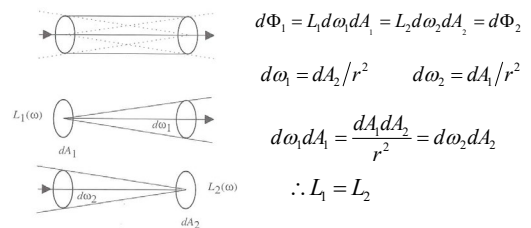
- Flux given by $d\Phi = L(x, \omega) \cos \theta d\omega dA$



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Radiance properties

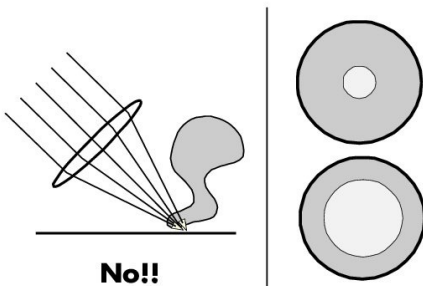
- Radiance constant as propagates along ray
 - Derived from conservation of flux
 - Fundamental in Light Transport.



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Quiz

Does radiance increase under a magnifying glass?



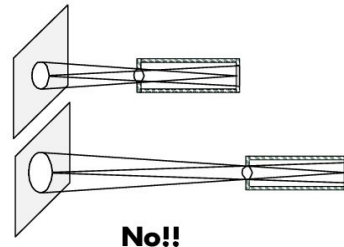
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Quiz

Does the brightness that a wall appears to the eye depend on the distance of the viewer to the wall?



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Radiance properties

- Sensor response proportional to radiance (constant of proportionality is throughput)
 - Far away surface: See more, but subtends smaller angle
 - Wall equally bright across viewing distances

Consequences

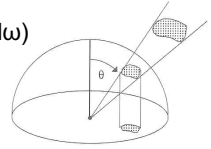
- Radiance associated with rays in a ray tracer
- Other radiometric quants derived from radiance

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Irradiance, Radiosity

- Irradiance E is radiant power per unit area
- Integrate incoming radiance over hemisphere

- Projected solid angle ($\cos \theta d\omega$)
- Uniform illumination:
Irradiance = π [CW 24,25]
- Units: W/m^2



- Radiant Exitance (radiosity)
 - Power per unit area leaving surface (like irradiance)

Figure 2.8: Projection of differential area.

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Directional Power Arriving at a Surface

$$d^2\Phi_i(x, \omega) = L_i(x, \omega) \cos \theta dA d\omega$$

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Irradiance from the Environment

$$d^2\Phi_i(x, \omega) = L_i(x, \omega) \cos \theta dA d\omega$$

$$dE(x, \omega) = L_i(x, \omega) \cos \theta d\omega$$



Light meter

$$E(x) = \int_{H^2} L_i(x, \omega) \cos \theta d\omega$$

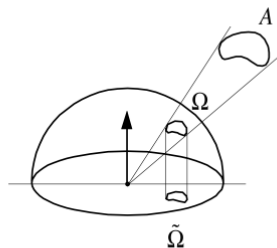
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Uniform Area Source

$$\begin{aligned} E(x) &= \int_{H^2} L \cos \theta d\omega \\ &= L \int_{\Omega} \cos \theta d\omega \\ &= L \tilde{\Omega} \end{aligned}$$

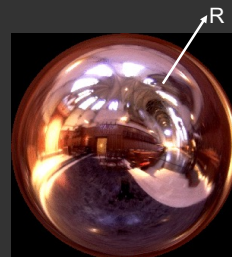


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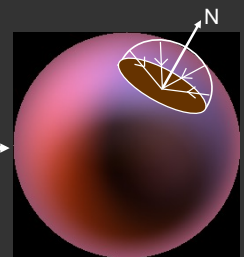
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Irradiance Environment Maps



Incident Radiance
(Illumination Environment Map)



Irradiance Environment Map

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Radiometry

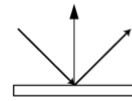
- Physical measurement of electromagnetic energy
- Measure spatial (and angular) properties of light
 - Radiance, Irradiance
 - Reflection functions: Bi-Directional Reflectance Distribution Function or BRDF
 - Reflection Equation
 - Simple BRDF models

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Types of Reflection Functions

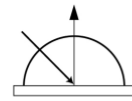
Ideal Specular

- Reflection Law
- Mirror



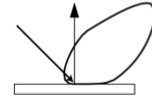
Ideal Diffuse

- Lambert's Law
- Matte



Specular

- Glossy
- Directional diffuse

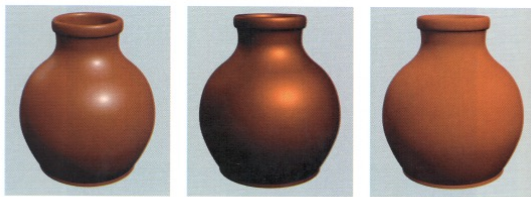


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Materials



Plastic

Metal

Matte

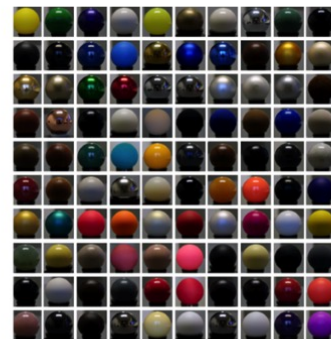
From Apodaca and Gritz, *Advanced RenderMan*

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Spheres [Matusik et al.]



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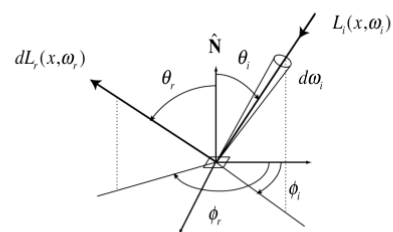
Building up the BRDF

- Bi-Directional Reflectance Distribution Function [Nicodemus 77]
- Function based on incident, view direction
- Relates incoming light energy to outgoing
- Unifying framework for many materials

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The BRDF

Bidirectional Reflectance-Distribution Function



$$f_r(\omega_i \rightarrow \omega_r) \equiv \frac{dL_r(\omega_i \rightarrow \omega_r)}{dE_i} \left[\frac{1}{sr} \right]$$

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BRDF

- Reflected Radiance proportional Irradiance
- Constant proportionality: BRDF
- Ratio of outgoing light (radiance) to incoming light (irradiance)
 - Bidirectional Reflection Distribution Function
 - (4 Vars) units 1/sr

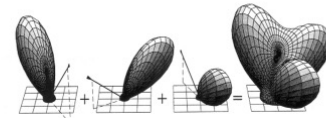
$$f(\omega_i, \omega_r) = \frac{L_r(\omega_r)}{L_i(\omega_i) \cos \theta_i d\omega_i}$$

$$L_r(\omega_r) = L_i(\omega_i) f(\omega_i, \omega_r) \cos \theta_i d\omega_i$$

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Properties of BRDF's

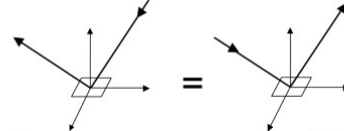
1. Linearity



From Sillion, Arvo, Westin, Greenberg

2. Reciprocity principle

$$f_r(\omega_r \rightarrow \omega_i) = f_r(\omega_i \rightarrow \omega_r)$$



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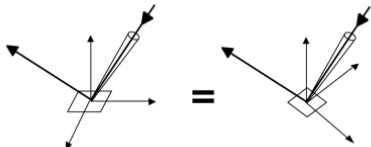
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Properties of BRDF's

3. Isotropic vs. anisotropic

$$f_r(\theta_i, \phi_i; \theta_r, \phi_r) = f_r(\theta_i, \theta_r, \phi_r - \phi_i)$$



Reciprocity and isotropy

$$f_r(\theta_i, \theta_r, \phi_r - \phi_i) = f_r(\theta_r, \theta_i, \phi_i - \phi_r) = f_r(\theta_i, \theta_r, |\phi_r - \phi_i|)$$

4. Energy conservation

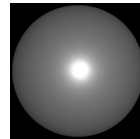
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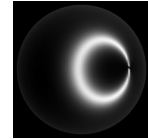
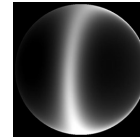
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Isotropic vs Anisotropic

- Isotropic: Most materials (you can rotate about normal without changing reflections)
- Anisotropic: brushed metal etc. preferred tangential direction



Isotropic



Anisotropic

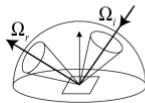
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Energy Conservation

$$\frac{d\Phi_r}{d\Phi_i} = \frac{\int_{\Omega_r} L_r(\omega_r) \cos \theta_r d\omega_r}{\int_{\Omega_i} L_i(\omega_i) \cos \theta_i d\omega_i}$$

$$= \frac{\int_{\Omega_r} \int_{\Omega_i} f_r(\omega_i \rightarrow \omega_r) L_i(\omega_i) \cos \theta_i d\omega_i \cos \theta_r d\omega_r}{\int_{\Omega_i} L_i(\omega_i) \cos \theta_i d\omega_i}$$

$$\leq 1$$

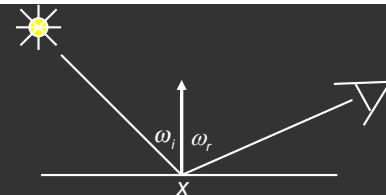


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Reflection Equation



$$L_r(x, \omega_r) = L_e(x, \omega_r) + L_i(x, \omega_i) f(x, \omega_i, \omega_r) (\omega_i \cdot n)$$

Reflected Light (Output Image) Emission Incident Light (from light source) BRDF Cosine of Incident angle

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Reflection Equation

Sum over all light sources

$$L_r(x, \omega_r) = L_e(x, \omega_r) + \sum L_i(x, \omega_i) f(x, \omega_i, \omega_r) (\omega_i \cdot n)$$

Reflected Light (Output Image)	Emission	Incident Light (from light source)	BRDF	Cosine of Incident angle
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Reflection Equation

Replace sum with integral

$$L_r(x, \omega_r) = L_e(x, \omega_r) + \int_{\Omega} L_i(x, \omega_i) f(x, \omega_i, \omega_r) \cos \theta_i d\omega_i$$

Reflected Light (Output Image)	Emission	Incident Light (from light source)	BRDF	Cosine of Incident angle
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Radiometry

- Physical measurement of electromagnetic energy
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Brdf Viewer plots

bv written by Szymon Rusinkiewicz

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Ideal Diffuse Reflection

Assume light is equally likely to be reflected in any output direction (independent of input direction).

$$L_{r,d}(\omega_r) = \int f_{r,d} L_i(\omega_i) \cos \theta_i d\omega_i$$

$$= f_{r,d} \int L_i(\omega_i) \cos \theta_i d\omega_i$$

$$= f_{r,d} E$$

$$M = \int L_r(\omega_r) \cos \theta_r d\omega_r = L_r \int \cos \theta_r d\omega_r = \pi L_r$$

$$\rho_d = \frac{M}{E} = \frac{\pi L_r}{E} = \frac{\pi f_{r,d} E}{E} = \pi f_{r,d} \Rightarrow f_{r,d} = \frac{\rho_d}{\pi}$$

Lambert's Cosine Law $M = \rho_d E_s \cos \theta_s$

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Torrance-Sparrow

Fresnel term:
allows for wavelength dependency

Geometric Attenuation:
reduces the output based on the amount of shadowing or masking that occurs.

$$f = \frac{F(\theta_i) G(\omega_i, \omega_r) D(\theta_h)}{4 \cos(\theta_i) \cos(\theta_r)}$$

How much of the macroscopic surface is visible to the light source

How much of the macroscopic surface is visible to the viewer

Distribution:
distribution function determines what percentage of microfacets are oriented to reflect in the viewer direction.

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Other BRDF models

- Empirical: Measure and build a 4D table
- Anisotropic models for hair, brushed steel
- Cartoon shaders, funky BRDFs
- Capturing spatial variation
- Very active area of research

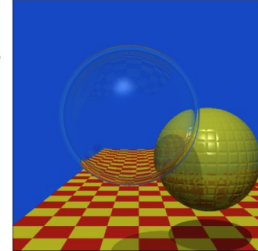
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Ray Tracing History

Ray Tracing in Computer Graphics

"An improved
Illumination model
for shaded display,"
T. Whitted,
CACM 1980

Resolution:
512 x 512
Time:
VAX 11/780 (1979)
74 min.
PC (2006)
6 sec.



Spheres and Checkerboard, T. Whitted, 1979

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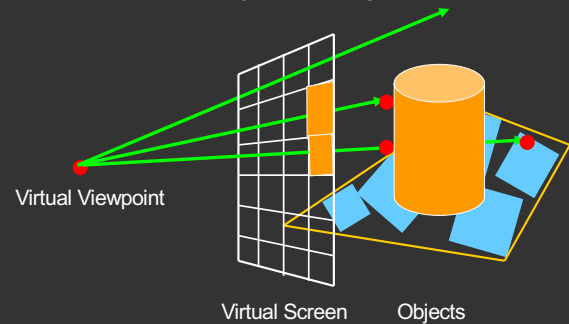
From SIGGRAPH 18



Real Photo: Instructor and Turner Whitted at SIGGRAPH 18

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Ray Casting



Raytracing is not as fast as OpenGL

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Outline in Code

```
Image Raytrace (Camera cam, Scene scene, int width, int height)
{
    Image image = new Image (width, height) ;
    for (int i = 0 ; i < height ; i++)
        for (int j = 0 ; j < width ; j++) {
            Ray ray = RayThruPixel (cam, i, j) ;
            Intersection hit = Intersect (ray, scene) ;
            image[i][j] = FindColor (hit) ;
        }
    return image ;
}
```

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Ray/Object Intersections

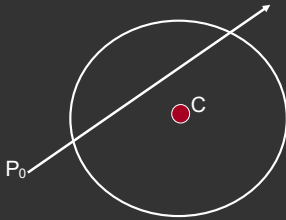
- Heart of Ray Tracer
 - One of the main initial research areas
 - Optimized routines for wide variety of primitives
- Various types of info
 - Shadow rays: Intersection/No Intersection
 - Primary rays: Point of intersection, material, normals
 - Texture coordinates
- Work out examples
 - Triangle, sphere, polygon, general implicit surface

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Ray-Sphere Intersection

$$\text{ray} \equiv \vec{P} = \vec{P}_0 + \vec{P}_1 t$$

$$\text{sphere} \equiv (\vec{P} - \vec{C}) \cdot (\vec{P} - \vec{C}) - r^2 = 0$$



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Ray-Sphere Intersection

$$\text{ray} \equiv \vec{P} = \vec{P}_0 + \vec{P}_1 t$$

$$\text{sphere} \equiv (\vec{P} - \vec{C}) \cdot (\vec{P} - \vec{C}) - r^2 = 0$$

Substitute

$$\text{ray} \equiv \vec{P} = \vec{P}_0 + \vec{P}_1 t$$

$$\text{sphere} \equiv (\vec{P}_0 + \vec{P}_1 t - \vec{C}) \cdot (\vec{P}_0 + \vec{P}_1 t - \vec{C}) - r^2 = 0$$

Simplify

$$t^2 (\vec{P}_1 \cdot \vec{P}_1) + 2t \vec{P}_1 \cdot (\vec{P}_0 - \vec{C}) + (\vec{P}_0 - \vec{C}) \cdot (\vec{P}_0 - \vec{C}) - r^2 = 0$$

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Ray-Sphere Intersection

$$t^2 (\vec{P}_1 \cdot \vec{P}_1) + 2t \vec{P}_1 \cdot (\vec{P}_0 - \vec{C}) + (\vec{P}_0 - \vec{C}) \cdot (\vec{P}_0 - \vec{C}) - r^2 = 0$$

Solve quadratic equations for t

- 2 real positive roots: pick smaller root
- Both roots same: tangent to sphere
- One positive, one negative root: ray origin inside sphere (pick + root)
- Complex roots: no intersection (check discriminant of equation first)



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Ray-Sphere Intersection

- Intersection point: $\text{ray} \equiv \vec{P} = \vec{P}_0 + \vec{P}_1 t$
- Normal (for sphere, this is same as coordinates in sphere frame of reference, useful other tasks)

$$\text{normal} = \frac{\vec{P} - \vec{C}}{|\vec{P} - \vec{C}|}$$

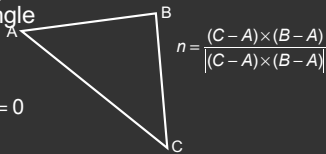
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Ray-Triangle Intersection

- One approach: Ray-Plane intersection, then check if inside triangle

- Plane equation:

$$\text{plane} \equiv \vec{P} \cdot \vec{n} - \vec{A} \cdot \vec{n} = 0$$



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Ray-Triangle Intersection

- One approach: Ray-Plane intersection, then check if inside triangle

- Plane equation:

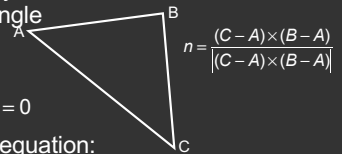
$$\text{plane} \equiv \vec{P} \cdot \vec{n} - \vec{A} \cdot \vec{n} = 0$$

- Combine with ray equation:

$$\text{ray} \equiv \vec{P} = \vec{P}_0 + \vec{P}_1 t$$

$$(\vec{P}_0 + \vec{P}_1 t) \cdot \vec{n} = \vec{A} \cdot \vec{n}$$

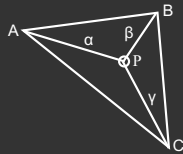
$$t = \frac{\vec{A} \cdot \vec{n} - \vec{P}_0 \cdot \vec{n}}{\vec{P}_1 \cdot \vec{n}}$$



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Ray inside Triangle

- Once intersect with plane, still need to find if in triangle
- Many possibilities for triangles, general polygons (point in polygon tests)
- We find parametrically [barycentric coordinates]. Also useful for other applications (texture mapping)



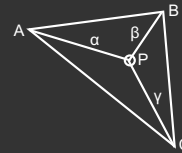
$$P = \alpha A + \beta B + \gamma C$$

$$\alpha \geq 0, \beta \geq 0, \gamma \geq 0$$

$$\alpha + \beta + \gamma = 1$$

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Ray inside Triangle



$$P = \alpha A + \beta B + \gamma C$$

$$\alpha \geq 0, \beta \geq 0, \gamma \geq 0$$

$$\alpha + \beta + \gamma = 1$$

$$P - A = \beta(B - A) + \gamma(C - A)$$

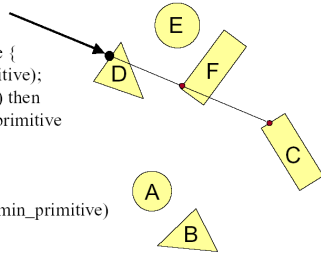
$$0 \leq \beta \leq 1, 0 \leq \gamma \leq 1$$

$$\beta + \gamma \leq 1$$

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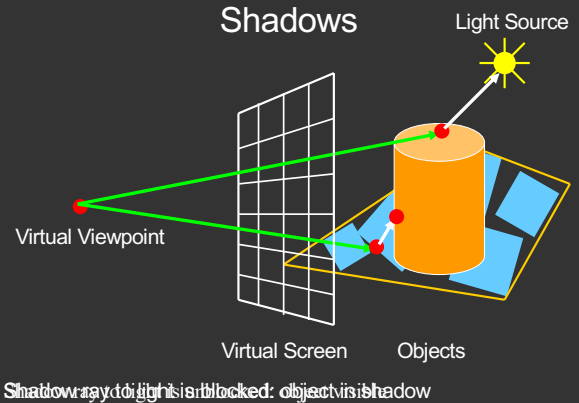
Ray Scene Intersection

```
Intersection FindIntersection(Ray ray, Scene scene)
{
    min_t = infinity
    min_primitive = NULL
    For each primitive in scene {
        t = Intersect(ray, primitive);
        if (t > 0 && t < min_t) then
            min_primitive = primitive
            min_t = t
    }
    return Intersection(min_t, min_primitive)
}
```



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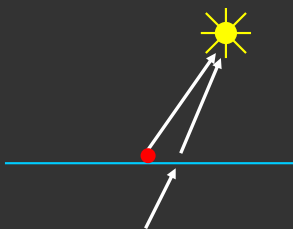
Shadows



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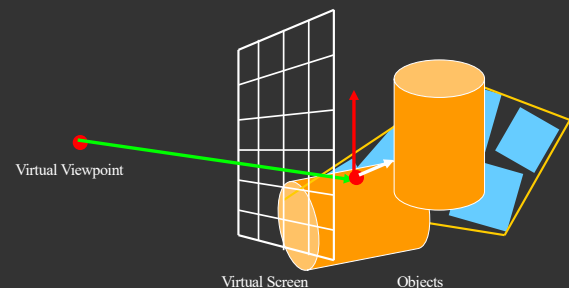
Shadows: Numerical Issues

- Numerical inaccuracy may cause intersection to be below surface (effect exaggerated in figure)
- Causing surface to incorrectly shadow itself
- Move a little towards light before shooting shadow ray



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Mirror Reflections/Refractions



Generate reflected ray in mirror direction,
Get reflections and refractions of objects

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Recursive Ray Tracing

For each pixel

- Trace Primary Eye Ray, find intersection
- Trace Secondary Shadow Ray(s) to all light(s)
 - $\text{Color} = \text{Visible ? Illumination Model : 0 ;}$
- Trace Reflected Ray
 - $\text{Color} += \text{reflectivity} * \text{Color of reflected ray}$
- Need acceleration structure for performance

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Interactive Raytracing

- Ray tracing historically slow
- Now viable alternative for complex scenes
 - Key is sublinear complexity with acceleration; need not process all triangles in scene
- Allows many effects hard in hardware
- Today graphics hardware and software (NVIDIA Optix 6, RTX chips 10G+ rays per second). [Video](#)

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