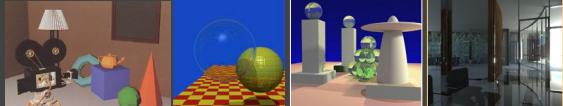


## Computer Graphics II: Rendering

CSE 168[Spr 20],Lecture 15: Volumetric Rendering  
Ravi Ramamoorthi

<http://viscomp.ucsd.edu/classes/cse168/sp20>



### To Do

- Start working on final projects (initial results and proposal due in a week). Ask me if problems
- Volumetric rendering (this lecture) may be one component of the final project (but hard, be careful)
- Increasingly accurate appearance requires volumetric scattering (even for skin, hair, fur)
- Continues to be an active area of research

Many slides courtesy Pat Hanrahan/Matt Pharr (Stanford CS 348b) and Steve Rotenberg, Henrik Wann Jensen (UCSD CSE 168)

### Volumetric Scattering



### Volumetric Scattering

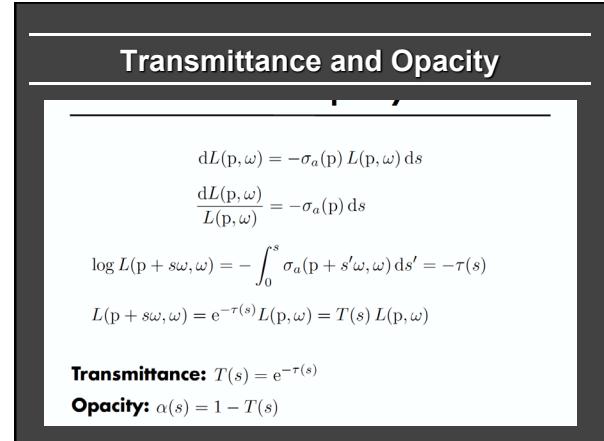
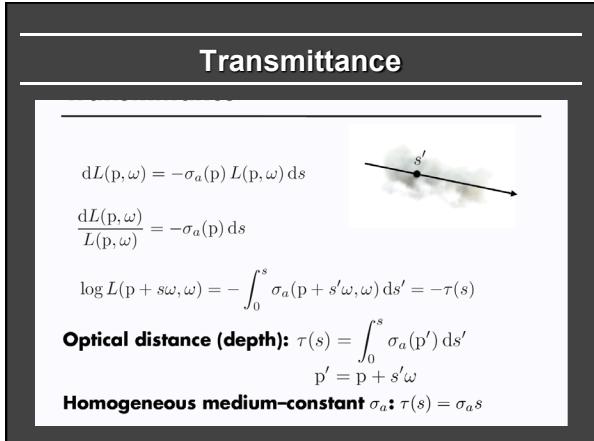
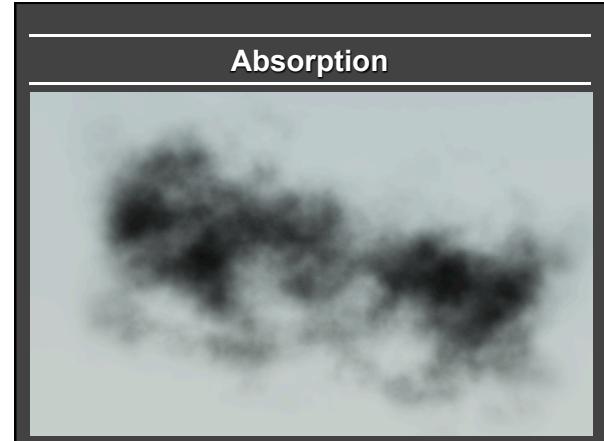
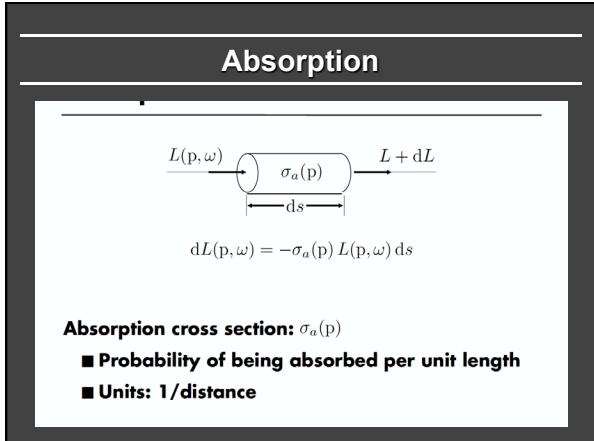
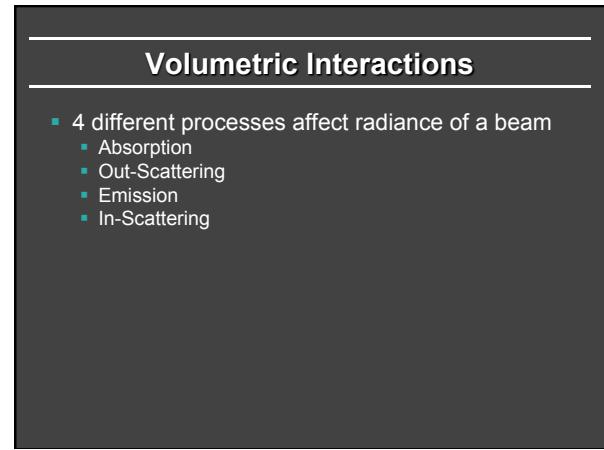
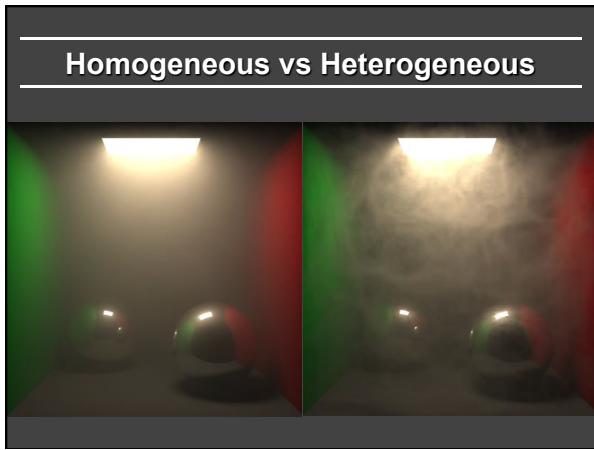


### Volumetric Scattering

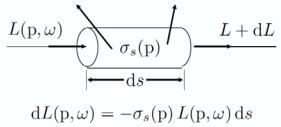
- Participating Media (light participates via scattering)
  - Volumetric phenomena like clouds, smoke, fire
  - Subsurface scattering, translucency (wax, human skin)
  - These are not surfaces with well-defined BRDFs
  - Rather volumes where light can scatter
  - Medium is often known as a participating medium
- Surface Rendering: Radiance Constant along Ray
  - Only true in absence of participating media
  - *No longer true for volumetric scattering*
  - *Often replace ray tracing with ray marching in medium*
- Volumetric Properties
  - BRDF replaced by phase function
  - Must consider absorption and scattering in medium

### Homogeneous vs Heterogeneous

- Homogeneous: Properties constant everywhere
  - Example: Fog often represented as homogeneous
- Heterogeneous: Varies across space
  - Example: Smoke, fire etc.
  - Sometimes called inhomogeneous
- Homogeneous volumes often easier
  - Some computational shortcuts (transmittance etc.)
  - Some analytic formulae



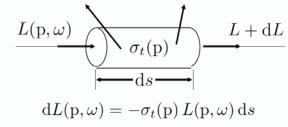
## Out-Scattering



**Scattering cross-section:**  $\sigma_s$

■ **Probability of being scattered per unit length**

## Extinction



**Total cross section:**  $\sigma_t = \sigma_a + \sigma_s$

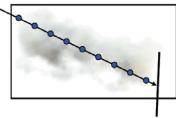
**Albedo:**  $W = \frac{\sigma_s}{\sigma_t} = \frac{\sigma_s}{\sigma_a + \sigma_s}$

**Optical distance from absorption and scattering:**

$$\tau(s) = \int_0^s \sigma_t(p') ds'$$

## Ray Marching for Transmittance

$$\tau(s) = \int_0^s \sigma_t(x + s' \omega) ds'$$

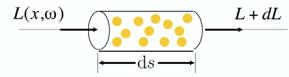


**Monte Carlo not necessary for 1D—can use a Riemann sum:**

$$\tau(s) \approx \frac{s}{N} \sum_i^N \sigma_t(x_i)$$

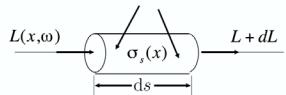
$$x_i = x + \frac{i + 0.5}{N} \omega$$

## Emission



$$dL(p, \omega) = \sigma_a(p) L_e(p, \omega) ds$$

## In-Scattering



$$S(p, \omega) = \sigma_s(p) \int_{S^2} p(\omega' \rightarrow \omega) L(p, \omega') d\omega'$$

**Phase function:**  $p(\omega' \rightarrow \omega)$

**Reciprocity:**  $p(\omega' \rightarrow \omega) = p(\omega \rightarrow \omega')$

**Energy conservation:**  $\int_{S^2} p(\omega' \rightarrow \omega) d\omega' = 1$

## Scattering Phase Functions

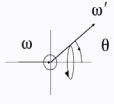
- Light interacts with volume, scatters in some spherical distribution
- Similar to light scattering off a surface
- Phase function analogous to a surface BRDF
- Depends only on cosine of incident-outgoing
- Like BRDFs, volumetric phase functions must be reciprocal and conserve energy
- Similar to BRDFs, we will want to do importance sampling and evaluation of phase functions

## Phase Functions

**Phase angle**  $\cos \theta = \omega \cdot \omega'$

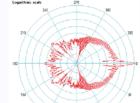
### Phase functions

■ **Isotropic:**  $p(\cos \theta) = \frac{1}{4\pi}$



■ **Rayleigh:**  $p(\cos \theta) = \frac{3}{4}(1 + \cos^2 \theta)$  with  $\sigma_s \propto \frac{1}{\lambda^4}$

■ **Mie:**



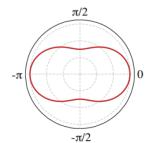
(Philip Leven)

## Rayleigh Scattering

- Rayleigh scattering describes the scattering of light by particles much smaller than the wavelength

$$p(\cos \theta) = \frac{3}{16\pi} (1 + \cos^2 \theta)$$

$$\sigma_s = \frac{2\pi^5 d^6}{3} \left( \frac{n^2 - 1}{n^2 + 2} \right)^2$$



- Where  $\lambda$  is the wavelength of light,  $d$  is the diameter of the particle, and  $n$  is the index of refraction of the particle
- The strong dependence on wavelength ( $\lambda^4$ ) causes greater scattering towards the blue end of the spectrum
- The blue color of the sky is caused by Rayleigh scattering of sunlight by air molecules

## Rayleigh Scattering: Blue Sky, Red Sunset



From Greenler: Rainbows, Halos, and Glories

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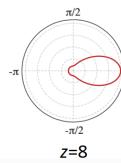
## Mie Scattering

- Scatter electromagnetic waves by spherical particles
- Size of particles same scale as wavelength of light
- Water droplets in atmosphere, fat droplets in milk
- After Gustave Mie, Ludvig Lorenz

## Empirical Mie Approximation

- The following empirical function is often used to approximate the shape of Mie scattering

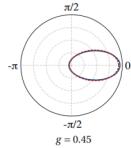
$$p(\cos \theta) = \frac{1}{4\pi} \left( \frac{1}{2} + \frac{(z+1)}{2} \left( \frac{1 + \cos \theta}{2} \right)^z \right)$$



## Henyey-Greenstein Function

- The Henyey-Greenstein phase function is an empirical function originally designed to model the scattering in galactic dust clouds

$$p(\cos \theta) = \frac{1 - g^2}{4\pi(1 + g^2 - 2g\cos \theta)^{1.5}}$$



- It uses an anisotropy parameter  $g$  that ranges between -1 (full backscatter) and 1 (full forward scatter), and is isotropic for  $g=0$

## Direct Illumination in a Volume

$$S_d(p', \omega) = \sigma_s(p') \int_{S^2} p(\omega' \rightarrow \omega) L_d(p', \omega') d\omega'$$

- Can treat like direct illumination at a surface
- Sample from phase function's distribution
- Sample from light source distributions
- Weight using multiple importance sampling



## Direct Illumination in a Volume

$$S_d(p', \omega) = \sigma_s(p') \int_{S^2} p(\omega' \rightarrow \omega) L_d(p', \omega') d\omega'$$

**Estimator:**  $\sigma_s(p') \frac{1}{N} \sum_i^N \frac{p(\omega_i \rightarrow \omega) L_d(p', \omega_i)}{p(\omega_i)}$

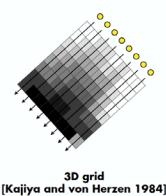
- Computing direct lighting,  $L_d$  can be expensive

- Not just a shadow ray—need to compute transmittance

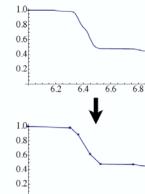


## Transmittance for Shadow Rays

Besides Monte Carlo, precomputed transmittance can be faster for point, distant lights



3D grid  
[Kajiya and von Herzen 1984]



Deep Shadow Maps  
[Lokovic & Veach 2000],  
Adaptive Volumetric  
Shadow Maps  
[Salvi et al. 2010]

## Single-Scattering



## Single-Scattering



Minneart: Color and Light  
In The Open Air



pbrt: Spot-Lit Ball  
In The Fog

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## The Volume Rendering Equation

**Integro-differential equation:**

$$\frac{\partial L(p, \omega)}{\partial s} = -\sigma_t L(p, \omega) + S(p, \omega)$$

**Integro-integral equation:**

$$L(p, \omega) = \int_0^{\infty} T(p') S(p', \omega) ds'$$

Attenuation: absorption and scattering

$$e^{-\int_0^{s'} \sigma_t(p'') ds''}$$

Source: in-scattering (and emission)

$$\sigma_s(p') \int_{S^2} p(\omega' \rightarrow \omega) L(p', \omega') d\omega'$$

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## Volumetric Path Tracing

Integro-integral equation:

$$L(p, \omega) = \int_0^\infty T(p') S(p', \omega) ds'$$

Monte Carlo integration: sample  $s' \sim p(s)$

Estimator:  $\frac{T(p') S(p', \omega)}{p(s')}$

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## Evaluating the Estimator: S

Include indirect illumination in the source term:

$$S(x, \omega) = \sigma_s(x) \int_{S^2} p(\omega' \rightarrow \omega) L(x, \omega') d\omega'$$

↓

$$L(x, \omega') = L_d(x, \omega') + L_i(x, \omega')$$

- Compute direct lighting as before
- Sample incident direction from the phase function's distribution, trace a ray recursively...

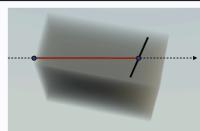
$$L_i(x, \omega') \approx \frac{p(\omega'' \rightarrow \omega') L(x, \omega'')}{p(\omega'')} \quad \text{Uniform spherical directions: } p(\omega'') = \frac{1}{4\pi}$$

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## Linear Sampling of T

We want samples along a finite ray  $[0, t_{\max}]$ .



- Uniform probability along the ray:

$$p(t) = \frac{1}{t_{\max}}$$

- Sampling recipe:

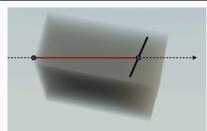
$$\xi = \int_0^t p(t) dt \quad t = \xi t_{\max}$$

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## Exact Sampling of Uniform T

We want samples along a finite ray  $[0, t_{\max}]$ ,  $p(t) \propto e^{-\sigma t}$



- Normalize to find PDF:

$$\int_0^{t_{\max}} e^{-\sigma t} dt = -\frac{1}{\sigma}(e^{-\sigma t_{\max}} - 1) = c \quad p(t) = ce^{-\sigma t}$$

- Invert to find t for a random sample:

$$\xi = \int_0^t p(t) dt$$

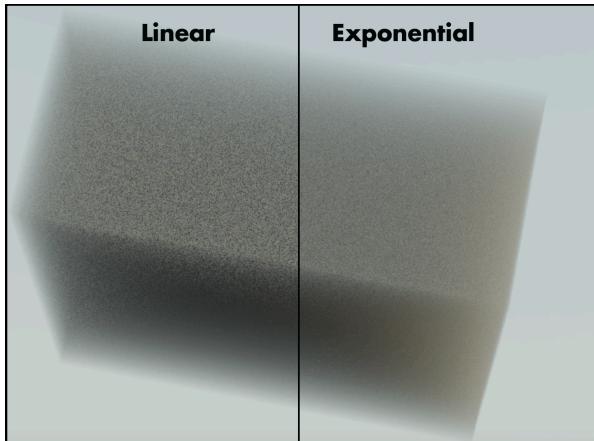
$$t = -\frac{1}{\sigma} \log(1 - \xi(1 - e^{-\sigma t_{\max}}))$$

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Linear

Exponential



## Volumetric Path Tracing

Integro-integral equation:

$$L(p, \omega) = \int_0^\infty T(p') S(p', \omega) ds'$$

Monte Carlo integration: sample  $s' \sim p(s)$

Estimator:  $\frac{T(p') S(p', \omega)}{p(s')}$

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### Single-Scattering



### Multiple Scattering



### Clouds



### Translucency

- Translucency is a volumetric lighting effect with additional effects at the surface (usually rough dielectric type interaction)
- These can be modeled through standard volumetric lighting techniques, or can be optimized through some further methods designed specifically for sub-surface scattering



### Fire

- “Physically Based Modeling and Animation of Fire”, Nguyen, Fedkiw, Jensen, 2003



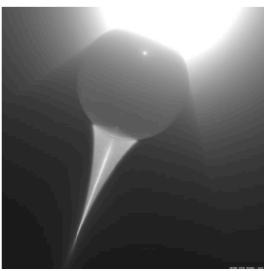
### Sky Rendering

- “A Practical Analytical Model for Daylight”, Preetham, Shirley, Smits, 1999
- “A Physically Based Night Sky Model”, Jensen, Durand, Stark, Premoze, Dorsey, Shirley, 2001
- “Precomputed Atmospheric Scattering”, Bruneton, Neyret, 2008
- “An Analytic Model for Full Spectral Sky-Dome Radiance”, Hosek, Wilkie, 2012



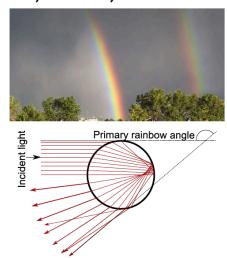
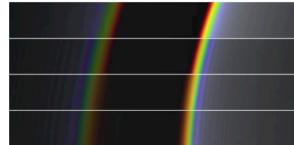
## Volumetric Caustics

- “Efficient Simulation of Light Transport in Scenes with Participating Media using Photon Maps”, Jensen, Christensen, 1998



## Rainbows

- “Physically Based Simulation of Rainbows”, Sadeghi, Munoz, Laven, Jarosz, Seron, Gutierrez, Jensen, 2012



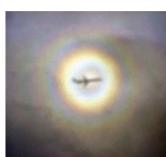
## Atmospheric Phenomena



Corona



Ice Crystal Halo



Glory