



**CS 563 Advanced Topics in
Computer Graphics
*Volume Scattering***

by Paulo Gonçalves de Barros

Introduction

- Scenes in vacuum
- Real-life
 - Atmosphere
 - Smoke
 - Haze
 - Clouds

- Scenes in vacuum
- Real-life
 - Atmosphere
 - Smoke
 - Haze
 - Clouds
- Volume scattering
 - Participating media
 - Its effect on light rays passing through it

- Volume Scattering processes
- Phase Functions
- Volume Interface
 - Homogeneous Media
 - Varying Density Volumes
 - Volume Aggregates

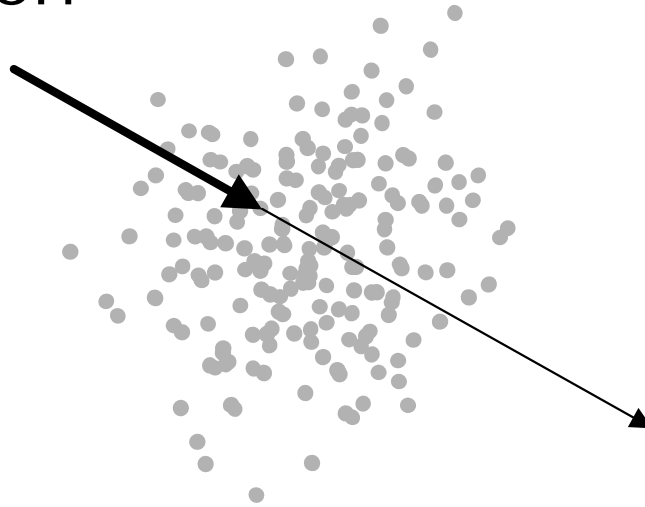


Volume Scattering Processes

- Participating media properties
 - Absorption
 - Emission
 - Scattering
 - Out-scattering
 - In-scattering
 - Homogeneous or Inhomogeneous

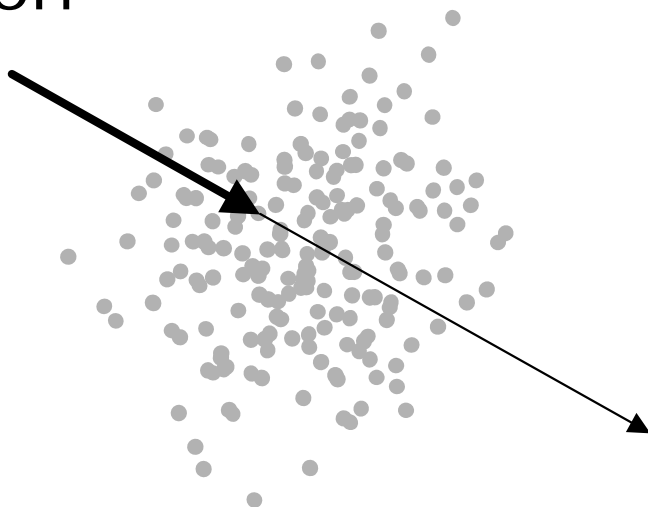
Volume Scattering Processes

- Absorption

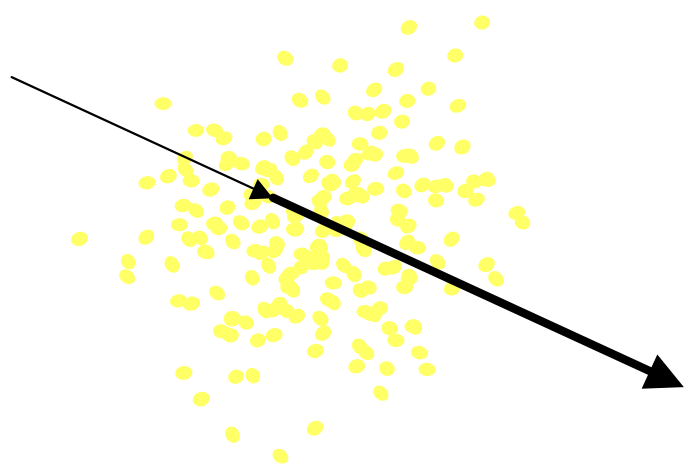


Volume Scattering Processes

- Absorption

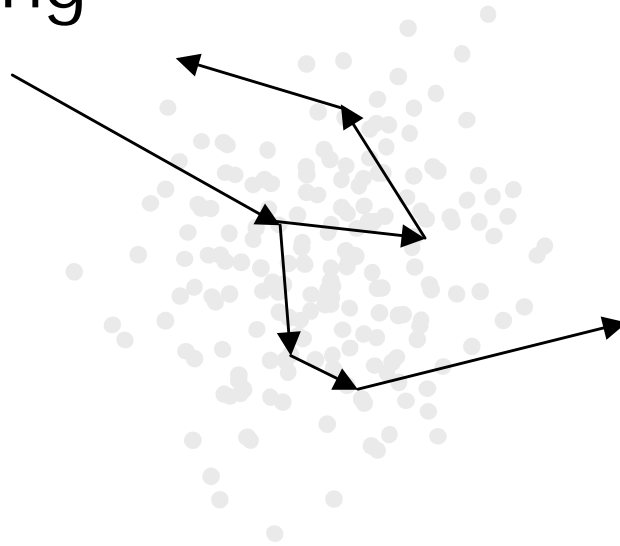


- Emission



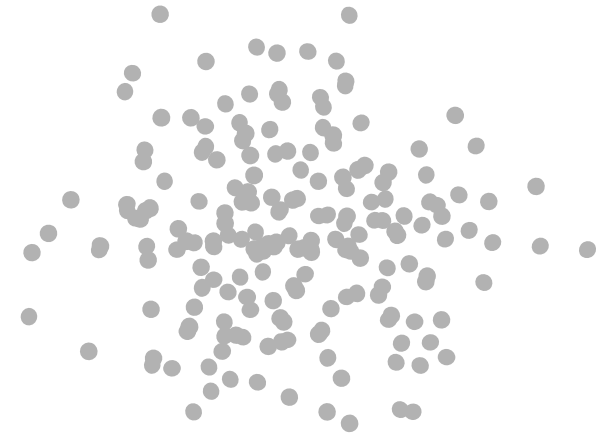
Volume Scattering Processes

- Scattering



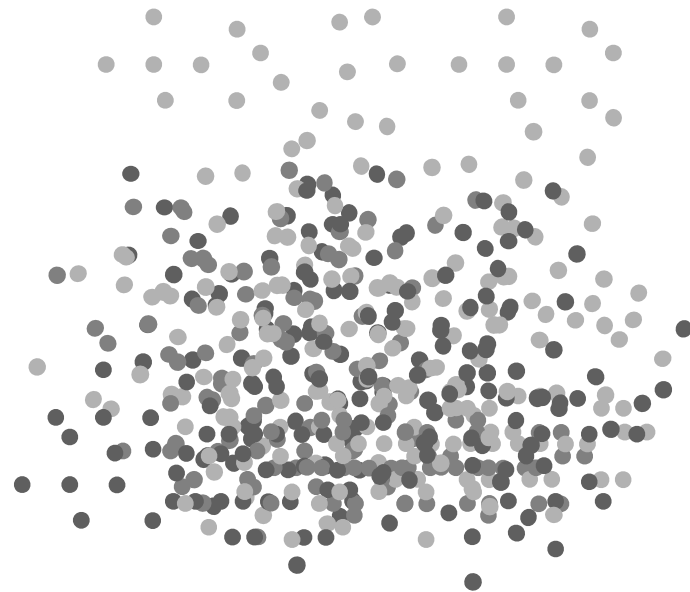
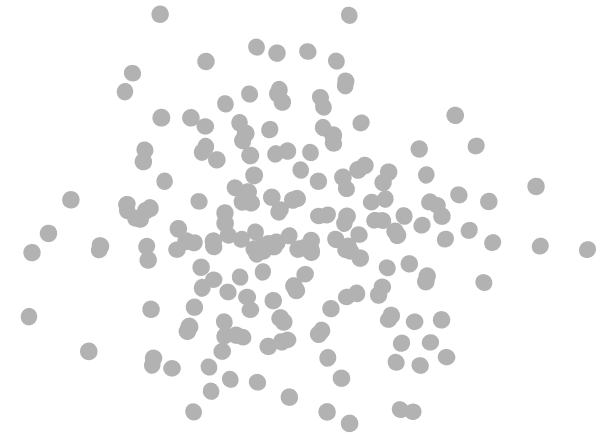
Volume Scattering Processes

- Homogeneous
 - Constant particle density
 - Uniform particle types distribution



Volume Scattering Processes

- Homogeneous
 - Constant particle density
 - Uniform particle types distribution
- Inhomogeneous
 - Varying particle density
 - Varying particle distribution



Volume Scattering Processes

- Absorption
 - Light is absorbed by medium
 - Ray radiance decreases through the medium





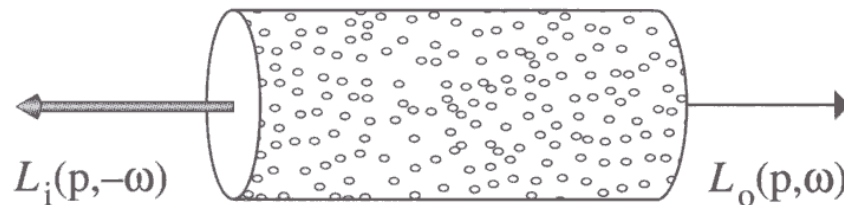
Volume Scattering Processes

- Absorption cross section s_a
 - Light absorption probability density per unit distance traveled in medium
 - Units ? m^{-1}
 - dt ? through-medium-travel unit
 - Values may be larger than 1
 - Influence factors
 - Position (p)
 - Direction (?)
 - Spectrum

Volume Scattering Processes

- Change in radiance per unit
 - Difference between incoming and outgoing radiance

$$dL_o(p, \mathbf{w}) = L_o(p, \mathbf{w}) - L_i(p, \mathbf{w})$$



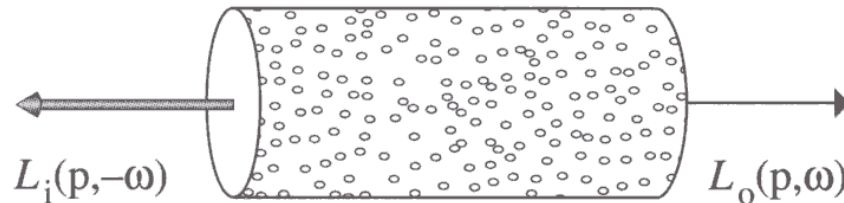
Volume Scattering Processes

- Change in radiance per unit
 - Difference between incoming and outgoing radiance

$$dL_o(p, \mathbf{w}) = L_o(p, \mathbf{w}) - L_i(p, \mathbf{w})$$

- Negative fraction of L_i

$$dL_o(p, \mathbf{w}) = -\mathbf{S}_a(p, \mathbf{w})L_i(p, -\mathbf{w})dt$$



Volume Scattering Processes

- Absorbed radiance
 - Traveled a distance d through medium

$$\underbrace{L(\mathbf{p} + \mathbf{w}d, \mathbf{w})}_{L_o} = \underbrace{L(\mathbf{p}, \mathbf{w})}_{L_i} \underbrace{e^{-\int_0^d \mathbf{s}_a(\mathbf{p} + \mathbf{w}t, \mathbf{w}) dt}}_{\text{Probability density function}}$$

\mathbf{s}_a integrated along d

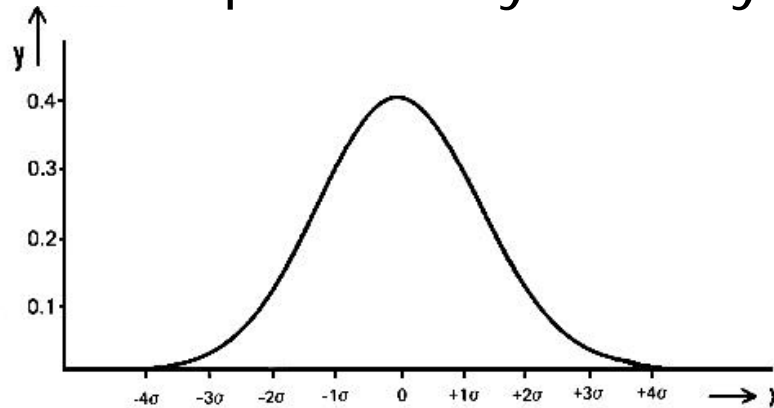
Volume Scattering Processes

- Absorbed radiance
 - Traveled a distance d through medium

$$L(\mathbf{p} + \mathbf{w}d, \mathbf{w}) = L(\mathbf{p}, \mathbf{w}) e^{-\int_0^d s_a(\mathbf{p} + \mathbf{w}t, \mathbf{w}) dt}$$

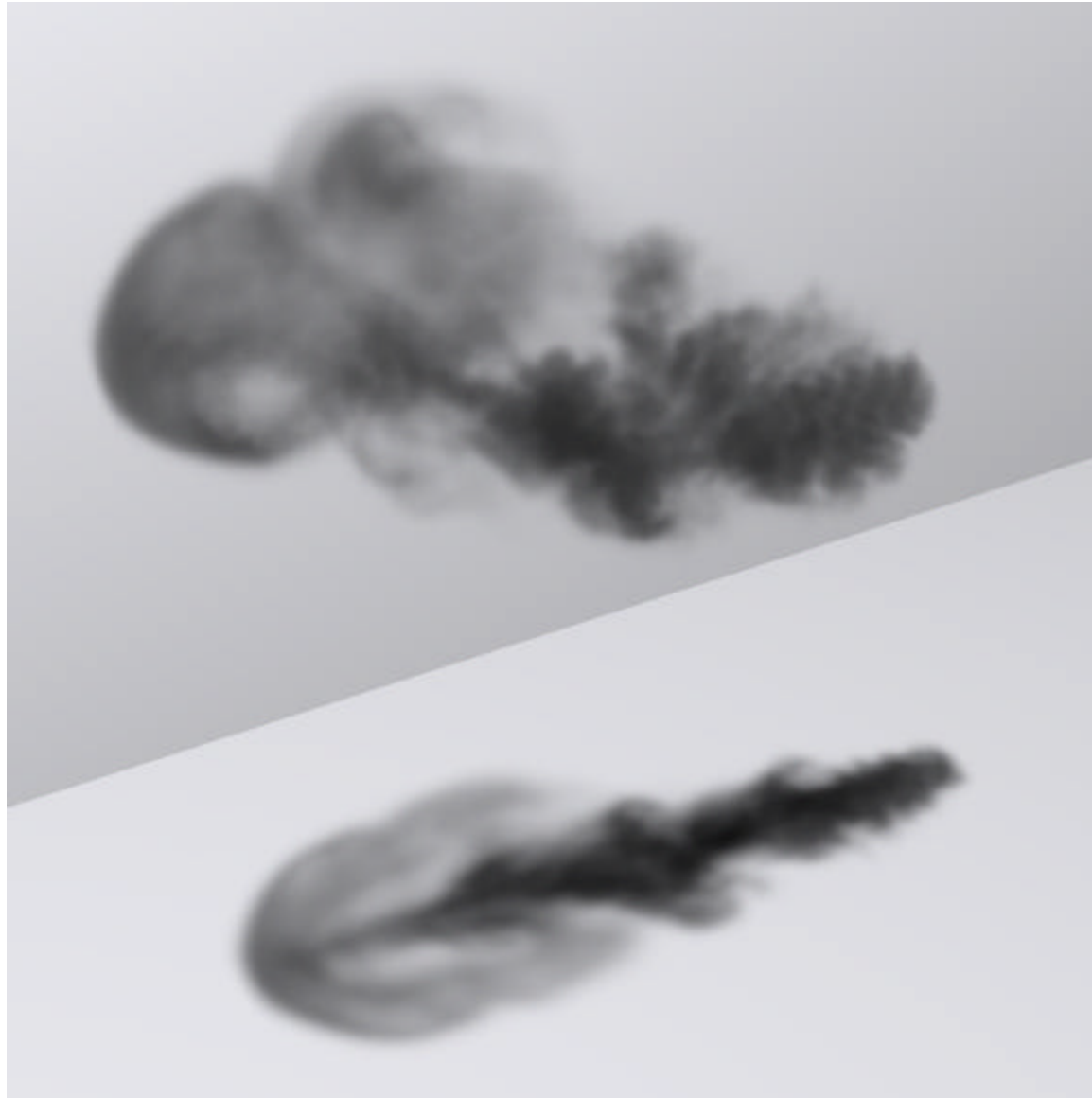
L_0 L_i s_a integrated in d
 Probability density function

- Normal probability density function (Gaussian)



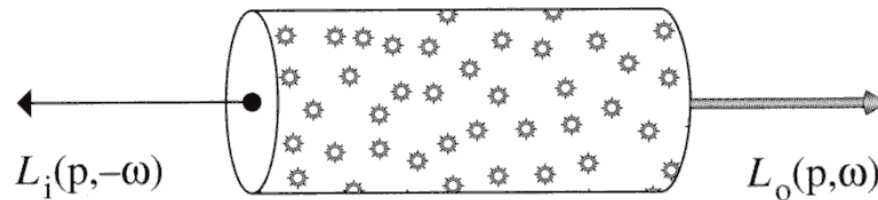
$$\phi(x) = \frac{1}{\sqrt{2\pi}} e^{-\frac{x^2}{2}}$$

Volume Scattering Processes



Volume Scattering Processes

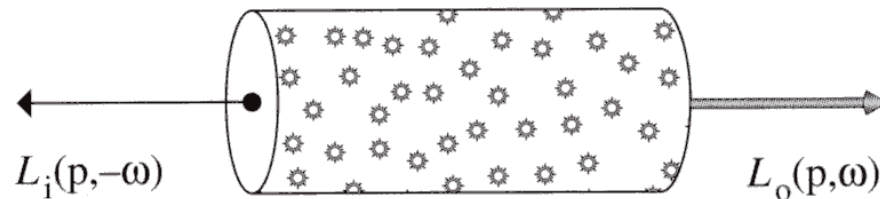
- Emission
 - Light is emitted by the medium
- Emitted radiance: $L_{ve}(p, \mathbf{w})$
 - Independent of incoming light



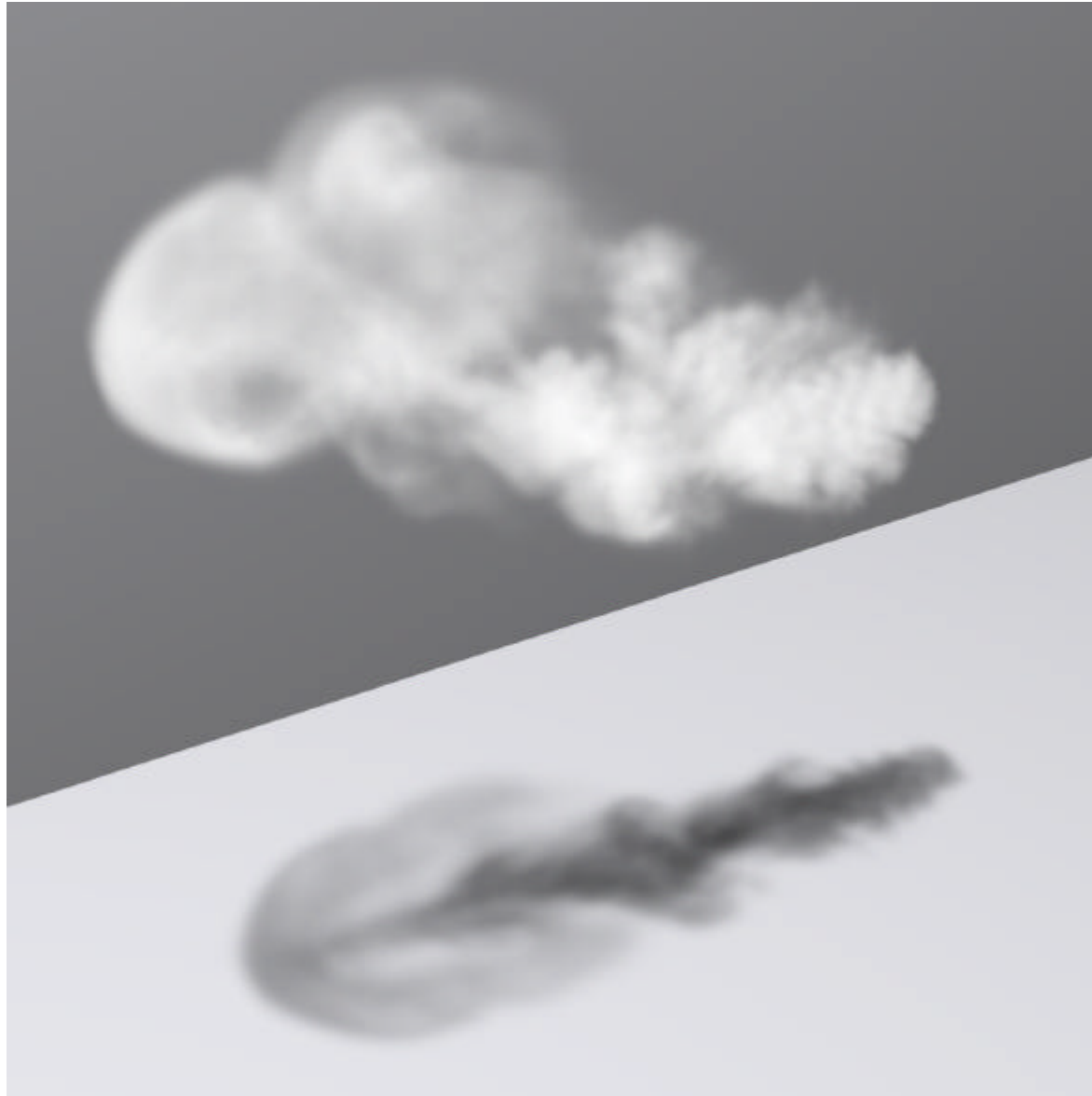
Volume Scattering Processes

- Emission
 - Light is emitted by the medium
- Emitted radiance: $L_{ve}(p, \mathbf{w})$
 - Independent of incoming light
- Change in radiance per unit

$$dL_o(p, \mathbf{w}) = L_{ve}(p, \mathbf{w})dt$$



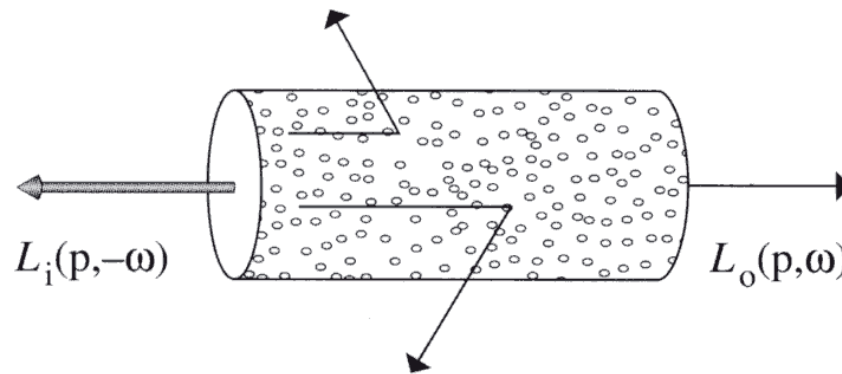
Volume Scattering Processes



Volume Scattering Processes

- Out-scattering
 - Light is scattered out of the path of the ray
 - Probability density for scattering: s_s
 - Reduction in radiance is given by

$$dL_o(p, \omega) = -\mathbf{S}_s(p, \omega)L_i(p, -\omega)dt$$



Volume Scattering Processes

- Total radiance reduction
 - Absorption
 - Scattering
- Attenuation or extinction
 - Coefficient: s_t

$$\mathbf{S}_t(p, \mathbf{w}) = \mathbf{S}_a(p, \mathbf{w}) + \mathbf{S}_s(p, \mathbf{w})$$

- Change in radiance per unit

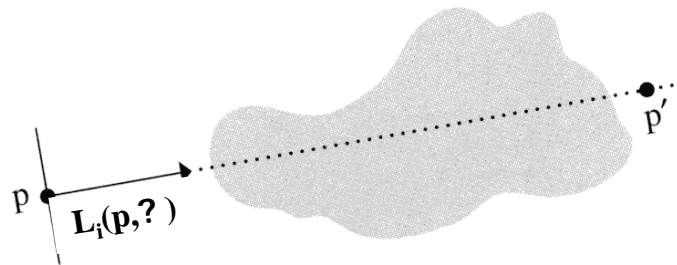
$$dL_o(p, \mathbf{w}) = -\mathbf{S}_t(p, \mathbf{w})L_i(p, -\mathbf{w})dt$$

Volume Scattering Processes

- Beam transmittance T_r

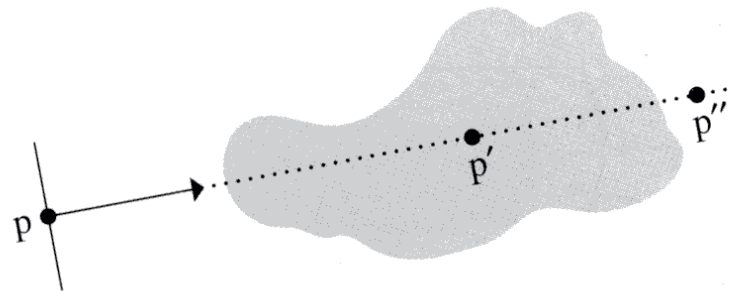
s_t integrated along d (p to p')

$$T_r(\mathbf{p} \rightarrow \mathbf{p}') = e^{-\int_0^d \mathbf{s}_t(\mathbf{p} + \mathbf{w}t, \mathbf{w}) dt}$$
$$\underbrace{L(\mathbf{p}')}_{L_o} = \underbrace{T_r(\mathbf{p} \rightarrow \mathbf{p}')}_{\text{Probability density function}} \underbrace{L(\mathbf{p}, \mathbf{w})}_{L_i}$$



Volume Scattering Processes

- Transmittance
 - Fraction of light that is transmitted between two points
 - Values between 0 and 1
 - Properties
 - $Tr(p \rightarrow p) = 1$
 - In vacuum: $Tr(p \rightarrow p') = 1$, for all p'
 - $Tr(p \rightarrow p'') = Tr(p \rightarrow p') Tr(p' \rightarrow p'')$



Volume Scattering Processes

$$T_r(\mathbf{p} \rightarrow \mathbf{p}') = e^{-\int_0^d \mathbf{s}_t(\mathbf{p} + \mathbf{w}t, \mathbf{w}) dt}$$

- Optical thickness

$$t(\mathbf{p} \rightarrow \mathbf{p}') = \int_0^d \mathbf{s}_t(\mathbf{p} + \mathbf{w}t, \mathbf{w}) dt$$

- Homogeneous medium
 - s_t is position independent
 - Transmittance reduced to Beer's Law

$$T_r(\mathbf{p} \rightarrow \mathbf{p}') = e^{-s_t d}$$

Volume Scattering Processes

- Beer's Law

$$A = alc$$

In PBRT:

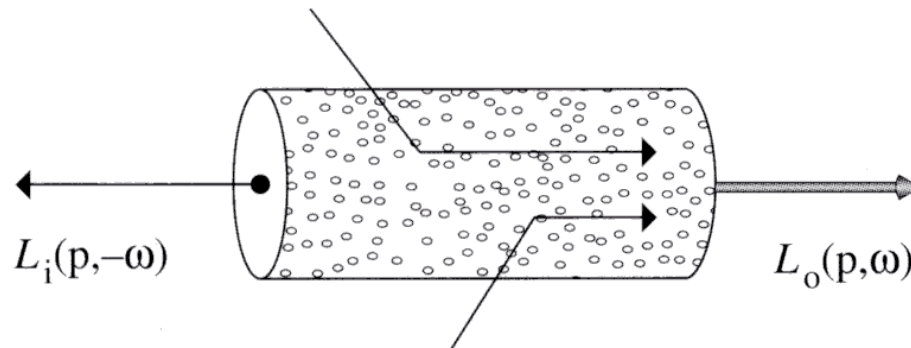
$$\mathbf{s}_t = \mathbf{a}(c)$$

$$d = l$$

- A = amount of light absorbed
- \mathbf{a} = Absorption coefficient or molar absorptivity of medium
- l = distance light travels through medium
- c = Concentration or particle density

Volume Scattering Processes

- In-scattering
 - Outside light scatters converging to ray path
 - Phase functions to represent scattered radiation in a point



Volume Scattering Processes

- Phase function (PF)
 - Volumetric analog of BSDF
 - Normalization constraints
 - PF defines a direction's scattering probability distribution

$$\int_{S^2} p(\mathbf{w} \rightarrow \mathbf{w}') d\mathbf{w}' = 1$$

- Change in radiance per unit

$$dL_o(p, \mathbf{w}) = S(p, \mathbf{w}) dt$$

Volume Scattering Processes

- $S(\mathbf{p}, \mathbf{w})$ includes volume emission

$$S(\mathbf{p}, \mathbf{w}) = \underbrace{L_{ve}(\mathbf{p}, \mathbf{w})}_{\text{Emission}} + \underbrace{\mathbf{s}_s(\mathbf{p}, \mathbf{w}) \int_{S^2} p(\mathbf{p}, -\mathbf{w}' \rightarrow \mathbf{w}) L_i(\mathbf{p}, \mathbf{w}') d\mathbf{w}'}_{\text{In-scattering}}$$

Volume Scattering Processes

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The diagram illustrates the components of the radiance equation. The first term, $L_{ve}(\mathbf{p}, \mathbf{w})$, is labeled "Emission". The second term is a product of $\mathbf{s}_s(\mathbf{p}, \mathbf{w})$, labeled "In-scattering Probability", and an integral over the sphere S^2 of $p(\mathbf{p}, -\mathbf{w}' \rightarrow \mathbf{w}) L_i(\mathbf{p}, \mathbf{w}') d\mathbf{w}'$, labeled "Amount of added radiance" and "In-scattering".

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Amount of added radiance

In-scattering

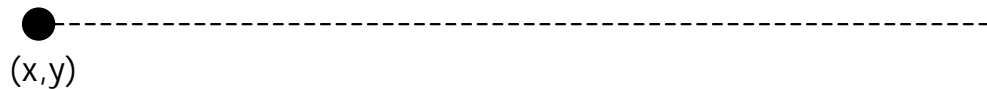
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Amount of added radiance

In-scattering

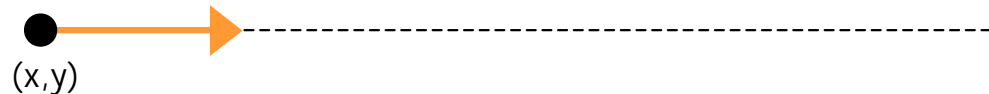


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In-scattering

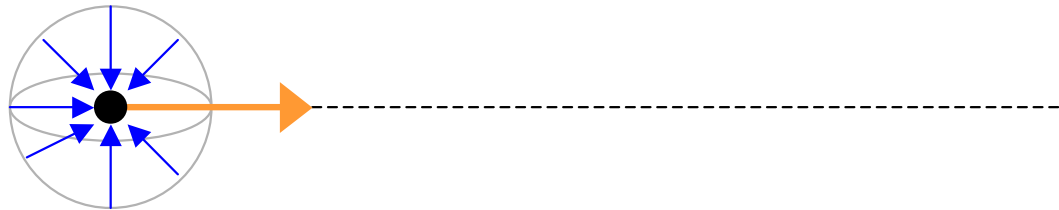


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In-scattering

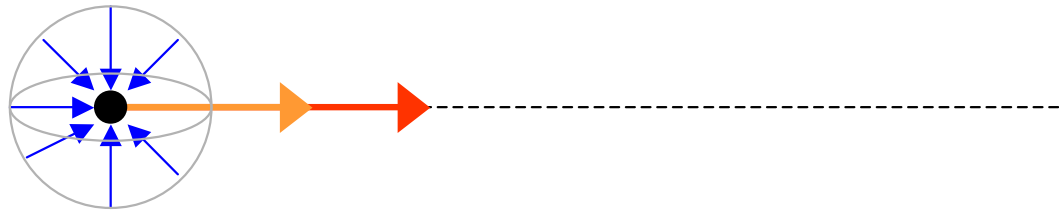


Volume Scattering Processes

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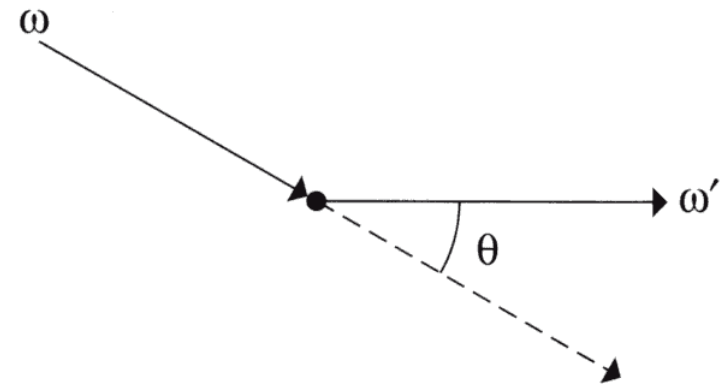
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Amount of added radiance



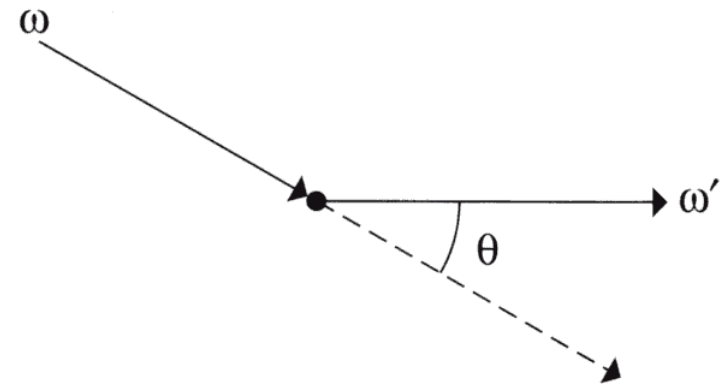
Phase Functions

- BSDFs for volume scattering
- Vary complexity according to medium
 - Isotropic
 - Anisotropic



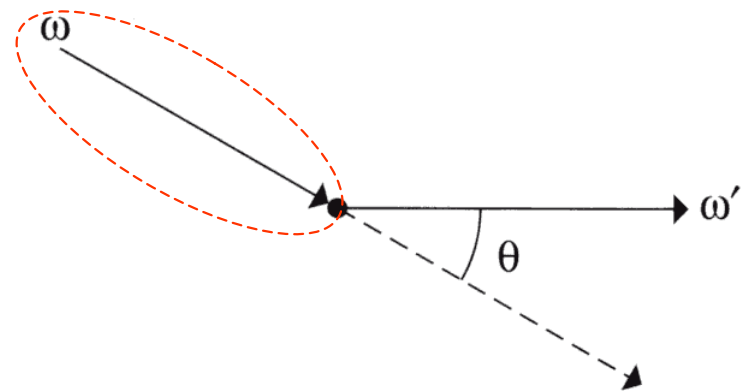
Phase Functions

- BSDFs for volume scattering
- Vary complexity according to medium
 - Isotropic
 - Anisotropic
- Properties
 - Direction reciprocity
 - May also be classified as
 - Isotropic – uniform scattering
 - Anisotropic – variable scattering



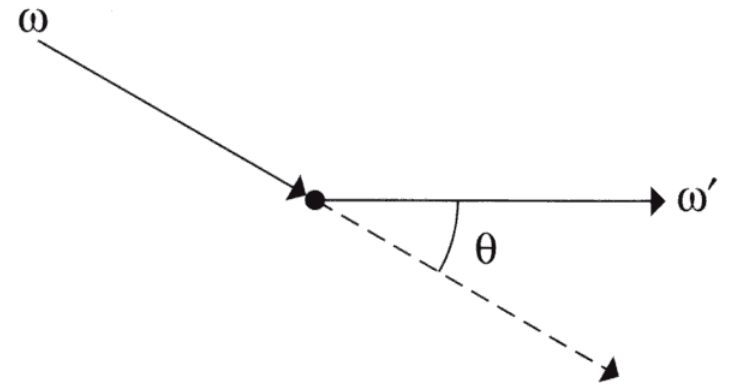
Phase Functions

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Phase Functions

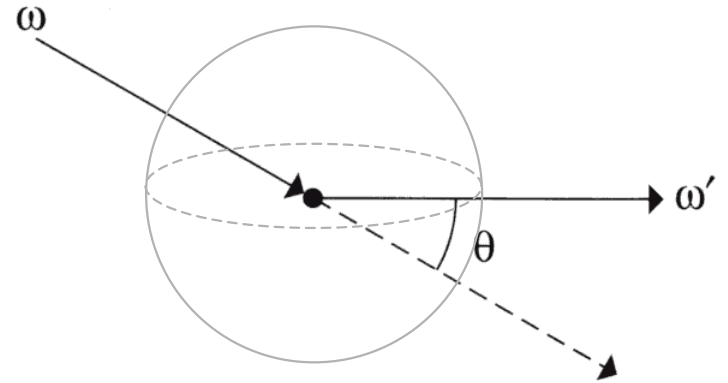
- Isotropic
 - Basic PFs
 - PFs is constant



Phase Functions

- Isotropic
 - Basic PFs
 - PFs is constant
 - Since
 - Area of sphere = $4\pi r^2$
 - pfs are normalized ($r = 1$)

$$p_{isotropic}(\mathbf{w} \rightarrow \mathbf{w}') = \frac{1}{4\pi}$$





Phase Functions

- Rayleigh
 - Very small particles
 - Accurately describes light scattering when
 - Particle radii $<$ light wavelength
 - Good for atmospheric simulation



Phase Functions

- Mie
 - Based on Maxwell's equations
 - Broader range of particle sizes
 - Good for fog and water droplets simulation

- Henyey and Greenstein
 - Easy to fit
 - Single control parameter
 - Controls relative proportion of forward backward scattering
 - $g \in (-1, 1)$
 - $g < 0$: back scattering

$$p_{HG}(\cos \mathbf{q} : g) = \frac{1}{4\mathbf{p}} \frac{1 - g^2}{(1 + g^2 - 2g(\cos \mathbf{q}))^{3/2}}$$

Phase Functions

- Increase complexity by combination

$$p(\cos \mathbf{q}) = \sum_{i=1}^n w_i p_{HG}(\cos \mathbf{q} : g_i)$$

Phase Functions

- Increase complexity by combination

$$p(\cos \mathbf{q}) = \sum_{i=1}^n w_i p_{HG}(\cos \mathbf{q} : g_i)$$

- More efficient version
 - Avoids 3/2 power computation
 - $k \sim 1.55g - 0.55g^3$

$$p_{Schlick}(\cos \mathbf{q}) = \frac{1}{4p} \frac{1 - k^2}{(1 - k \cos \mathbf{q})^2}$$



Volume Interface and Homogeneous Media

- VolumeRegion class
 - Volume Scattering Interface in PBRT
 - General methods
 - BBox
 - IntersectP
 - Scattering information methods
 - Sigma_a (absorption)
 - Sigma_s (scattering)
 - Lve (emission)
 - P (phase value)
 - Sigma_t (attenuation)
 - Tau (optical thickness)



Volume Interface and Homogeneous Media

- Homogeneous volumes
 - Uniform particle density
 - One type of particle
- HomogeneousVolume : VolumeRegion
 - s_s And s_a are constant

Varying-Density Volumes



Homogeneous volume participating medium



Varying-Density Volumes

- Inhomogeneous volumes
 - Still one type of particle
 - Spatially variable density
 - Scales scattering properties according to density, except for Tau
- DensityRegion : VoumeRegion
 - Method for obtaining density added
 - Tau not implemented
 - Dependent on shape and density distribution function

Varying-Density Volumes

- 3D Grids
 - VolumeGrid : DensityRegion
 - Density values defined in a 3D matrix
 - Intermediary values are interpolated
 - Manhattan distance
 - p1 (x1, y1) and p2 (x2, y2)
Manhattan distance is $|x1 - x2| + |y1 - y2|$.
 - Trilinear interpolation
 - Used in smoke pictures



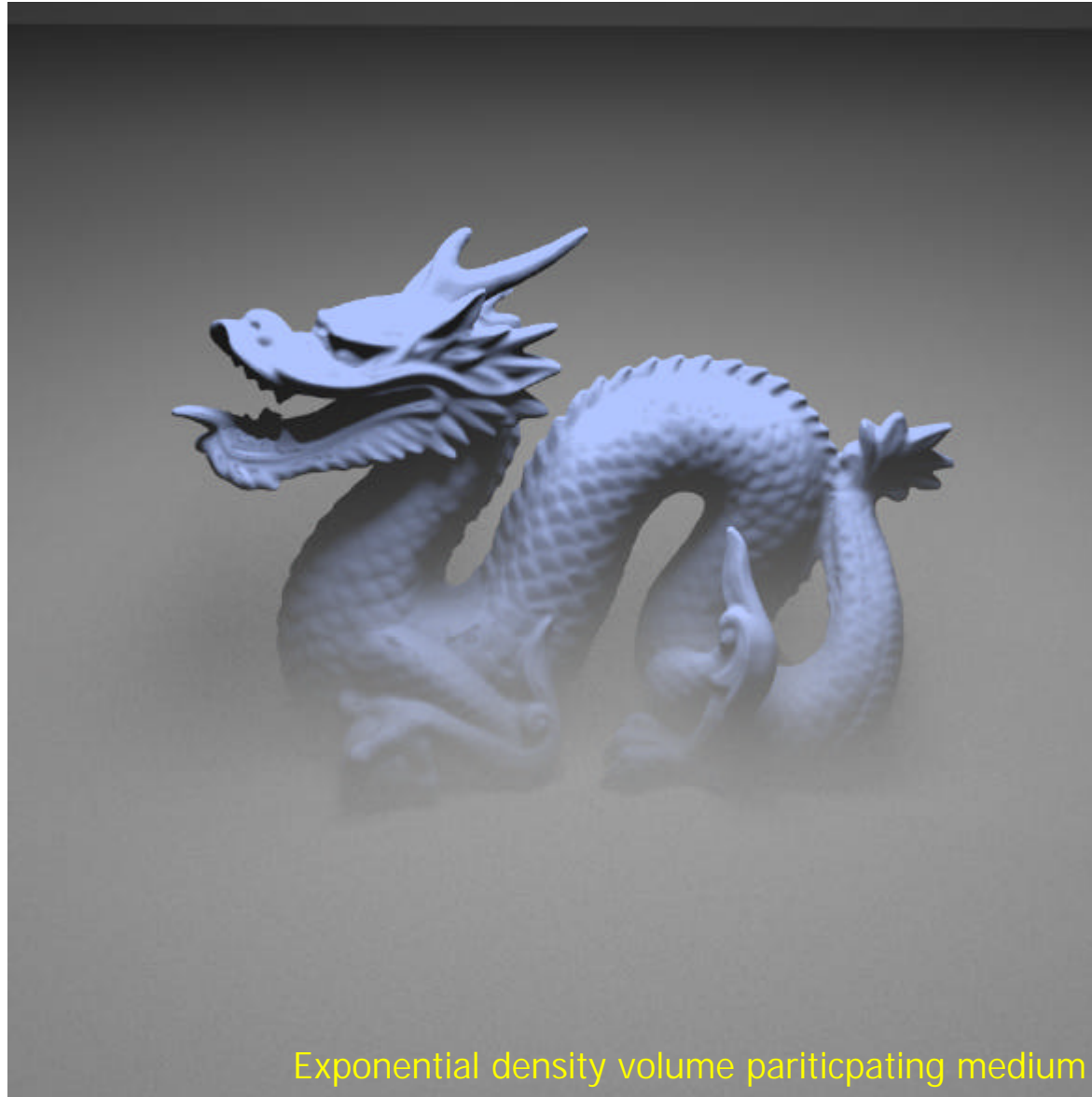
Varying-Density Volumes

- Exponential Density Volume
 - Exponential Density : Density Region
 - Density varies with height

$$d(h) = ae^{-bh}$$

- Good for modelling Earth's atmosphere

Varying-Density Volumes



Exponential density volume participating medium

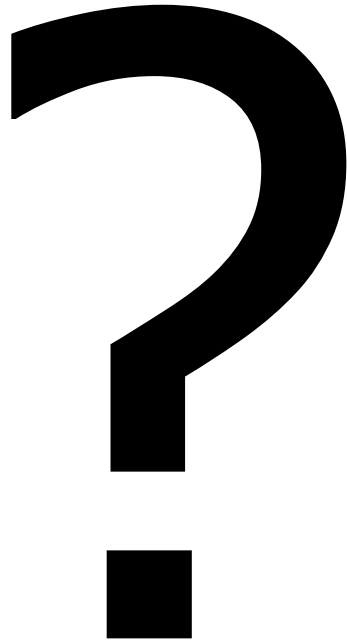


Volume Aggregates

- AggregateVolume
 - Many Volume Regions
- Advantages
 - Simplifies scene
 - Easy integration with 3D structures
- Parameters creation
 - Sum of individual volumes` parameters

References

1. [CS779](#): Rendering Images with Computers, University of Wisconsin
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4. [Beer's Law](#), Sheffield Hallam University, Faculty of Health and Wellbeing, Biosciences Division
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6. Physically Based Rendering, Matt Phar, Greg Humphreys, Elsevier, 2004.



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