### Course Updates

- Tutorial this week
  - Assignment 3 and Assignment 4
- Assignment 3
  - Programming is due Friday
  - Theory is due Monday
- Assignment 4 (only programming, can be done in groups of 2)
  - Send me e-mail with the names of people in your group
  - Due date: December 3<sup>rd</sup>
  - Demo Day: December 3<sup>rd</sup>

#### Short Review

- Ray casting
  - Generate a ray through each pixel (x,y) in the image plane
- Ray-surface intersection
  - Triangles, planar patches, spheres, etc.
- Computing normal at the "hit point"
- Lighting at the point
  - Whitted Model (Phong lighting + recursive global lighting term)

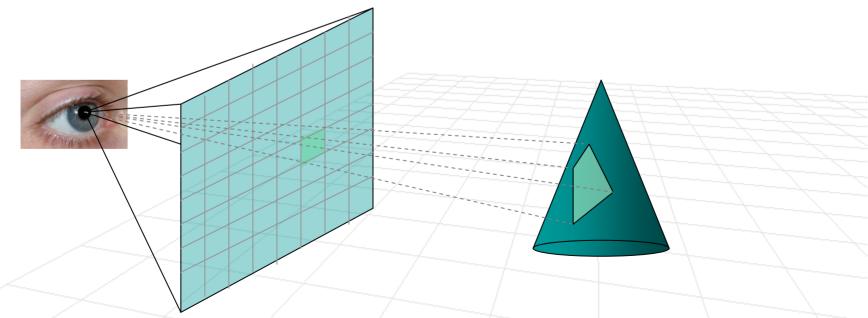
#### Radiometry

- Theory of lighting
- Bidirectional Reflectance Distribution Functions (BRDFs)
- How to compute radiance (by integrating over the incoming directions to compute irradiance)

#### How will all of this help in Ray Tracing?

- We will consider a more accurate (and much more expensive) approximation to the radiance at the "hit point" based on the integral of the BRDF and incident irradiance
- What do we integrate over?

We integrate over area of a pixel



# Distribution Ray Tracing

#### Computer Graphics, CSCD18 Fall 2007 Instructor: Leonid Sigal

#### Distribution Ray Tracing

- In Basic Ray Tracing we computed lighting very crudely
  - Phong + specular global lighting
- In Distributed Ray Tracing we want to compute the lighting as accurately as possible
  - Use the formalism of Radiometry introduced in last class
  - Compute irradiance at each pixel (by integrating all the incoming light)
  - Since integrals are can not be done analytically, we will employ numeric approximations

#### Radiance at a Point

- Recall that radiance (shading) at a surface point is given by  $L(\overline{p}, \vec{d}_e) = \int \rho(\vec{d}_e, \vec{d}_i) L(\overline{p}, -\vec{d}_i) (\vec{n} \cdot \vec{d}_i) d\omega$
- If we parameterize directions in spherical coordinates and assume small differential solid angle, we get  $L(\overline{p}, \vec{d}_e) = \int \rho(\vec{d}_e, \vec{d}_i(\phi, \theta)) L(\overline{p}, -\vec{d}_i(\phi, \theta)) (\vec{n} \cdot \vec{d}_i(\phi, \theta)) \sin\theta d\theta d\phi$  $\boldsymbol{\phi} \in [0, 2\pi] \boldsymbol{\theta} \in [0, 2\pi]$

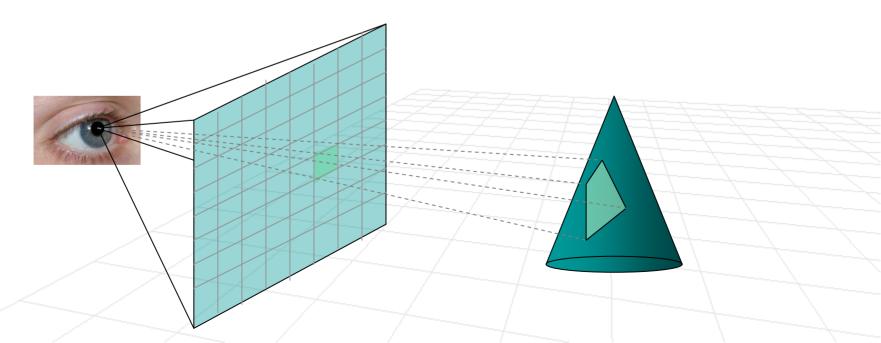
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#### Irradiance at a Pixel

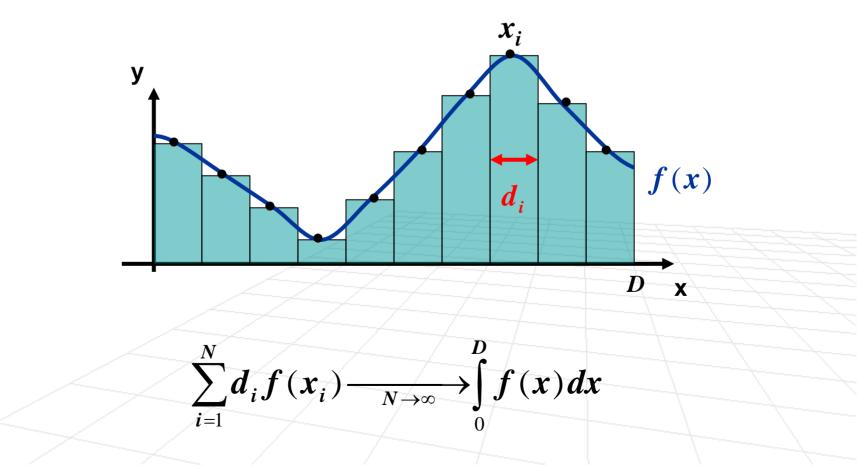
To compute the color of the pixel, we need to compute total light energy (flux) passing through the pixel (rectangle) (i.e. we need to compute the total irradiance at a pixel)

$$\Phi_{i,j} = \int_{\alpha_{\min} \le \alpha \le \alpha_{\max}} \int_{\beta_{\min} \le \beta \le \beta_{\max}} H(\alpha,\beta) d\alpha d\beta$$



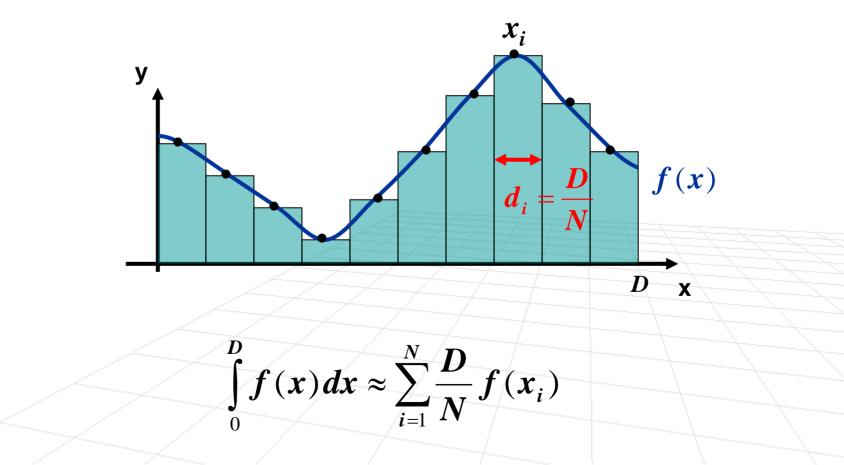
### Numerical Integration (1D Case)

- **Remember:** integral is an area under the curve
- We can approximate any integral numerically as follows



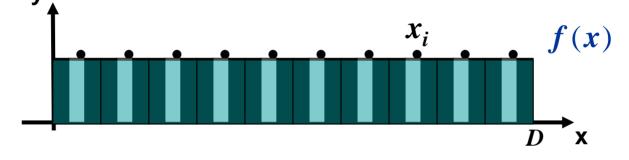
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#### Monte Carlo Integration

 Idea: randomize points x<sub>i</sub> to avoid structured noise (e.g. due to periodic texture)

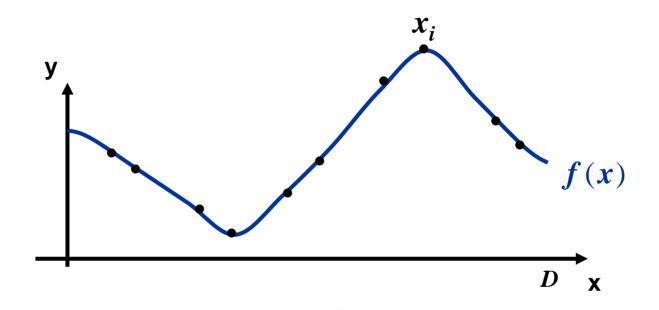


- Draw N random samples x<sub>i</sub> independently from uniform distribution Q(x)=U[0,D] (i.e. Q(x) = 1/D is the uniform probability density function)
- Then approximation to the integral becomes

$$\frac{1}{N} \sum w_i f(x_i) \approx \int f(x) dx \text{, for } w_i = \frac{1}{Q(x)}$$

We can also use other Q's for efficiency !!! (a.k.a. importance sampling)

#### Monte Carlo Integration



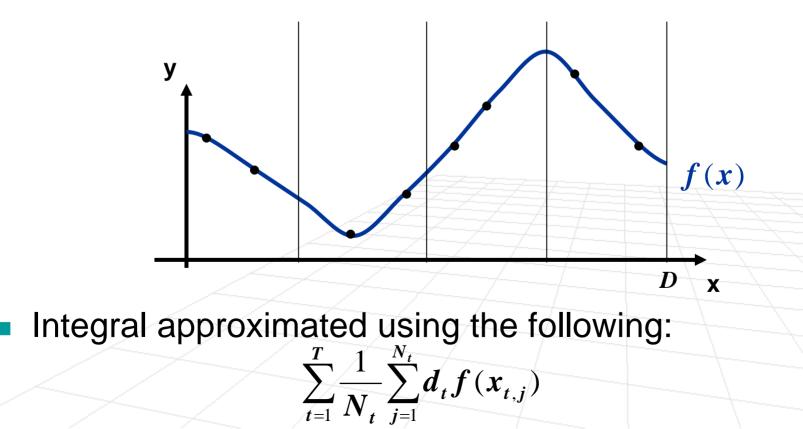
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## Stratified Sampling

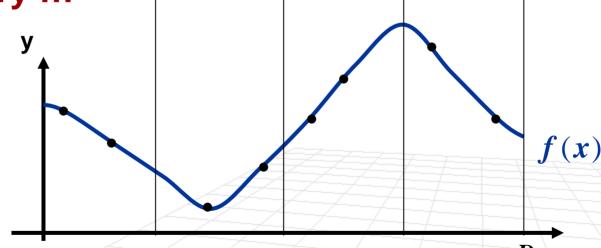
- Idea: combination of uniform sampling plus random jitter
- Break domain into T intervals of widths  $d_t$  and  $N_t$  samples in interval t



## Stratified Sampling

If intervals are uniform  $d_t = D/T$  and there are same number of samples in each interval  $N_t = N/T$  then this approximation reduces to:  $\sum_{t=1}^{T} \sum_{j=1}^{N_t} \frac{D}{N} f(x_{t,j})$ 

In general, the interval size and the # of samples can vary !!!



X

Integral approximated using the following:

$$\sum_{t=1}^{T} \frac{1}{N_{t}} \sum_{j=1}^{N_{t}} d_{t} f(x_{t,j})$$

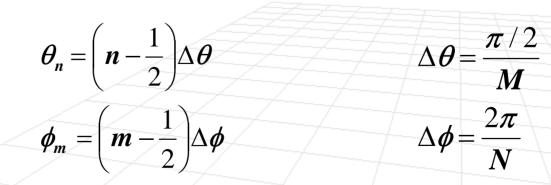
#### Back to Distribution Ray Tracing

- Based on one of the approximate integration approaches we need to compute
  - Let's try uniform sampling

$$L(\overline{p}, \vec{d}_e) = \int_{\phi \in [0, 2\pi]} \int_{\theta \in [0, 2\pi]} \rho(\vec{d}_e, \vec{d}_i(\phi, \theta)) L(\overline{p}, -\vec{d}_i(\phi, \theta)) (\vec{n} \cdot \vec{d}_i(\phi, \theta)) \sin\theta \, d\theta \, d\phi$$

$$\approx \sum_{m=1}^{M} \sum_{n=1}^{N} \rho \left( \vec{d}_{e}, \vec{d}_{i}(\phi_{m}, \theta_{n}) \right) L \left( \overline{p}, -\vec{d}_{i}(\phi_{m}, \theta_{n}) \right) \left( \vec{n} \cdot \vec{d}_{i}(\phi_{m}, \theta_{n}) \right) \sin \theta \, \Delta \theta \, \Delta \phi$$

where



midpoint of the interval (sample point)

Interval width

## Importance Sampling in Distribution Ray Tracing

- **Problem:** Uniform sampling is too expensive (e.g. 100 samples/hemisphere with depth of ray recursion of  $4 \Rightarrow 100^4 = 10^8$  samples per pixel ... with  $10^5$  pixels  $=>10^{15}$  samples)
- Solution: Sample more densely (using importance sampling) where we know that effects will be most significant (e.g. visible surfaces, light sources, etc.)
  - Direction toward point or extended light source are significant
  - Specular and off-axis specular are significant
  - Texture/lightness gradients are significant
  - Sample less with greater depth of recursion

#### Importance Sampling (review)

• Idea: Approximates any integral by samples drawn independently and identically from some desired importance distribution Q(x)

$$\frac{1}{N}\sum f(x_i) \approx \int Q(x)f(x)dx, \quad x_i \sim Q(x)$$

 This is not quite what we want, but if we (scale) or divide by Q(x<sub>i</sub>)

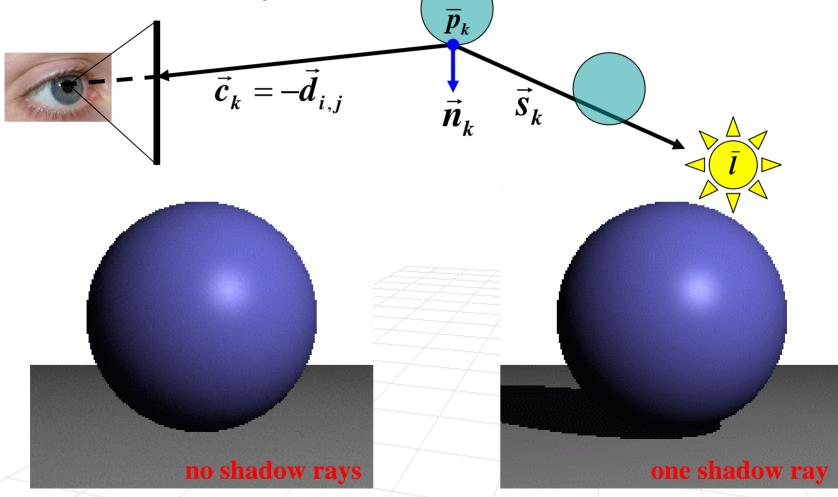
$$\frac{1}{N} \sum w_i f(x_i) \approx \int f(x) dx \text{, for } w_i = \frac{1}{Q(x_i)}$$

## Benefits of Distribution Ray Tracing

- Better global diffuse lighting
  - Color bleeding
  - Bouncing highlights
- Extended light sources
- Anti-aliasing
- Motion blur
- Depth of field
- Subsurface scattering

#### Shadows in Ray Tracing

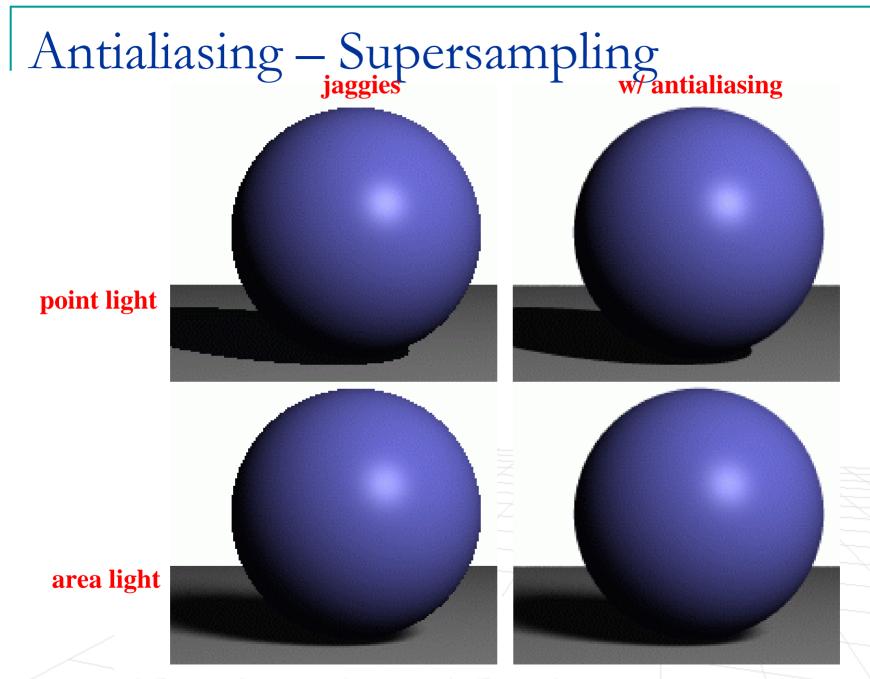
 Recall, we shoot a ray towards a light source and see if it is intercepted



Images from the slides by Durand and Cutler

# Soft Shadows with Distribution Ray Tracing Lets shoot multiple rays from the same point and attenuate the color based on how many rays are intercepted $p_k$ $\vec{c}_k = -d_{i,i}$ lots of shadow rays one shadow ray

Images from the slides by Durand and Cutler



Images from the slides by Durand and Cutler

## Specular Reflections

 Recall, we had to shoot a ray in a perfect specular reflection direction (with respect to the camera) and get the radiance at the resulting hit point

