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## Lecture 15:

## Global Illumination

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## Introduction

## Why bother with physically correct rendering?

- As opposed to making up shaders that look good
- When something goes wrong, you can reason about why, and how to fix it
- It is easy to hack a material shader that looks realistic for specific lighting conditions, but extremely difficult to hack something that allways looks realistic
- Path-tracing may take longer to converge
- But we will know early if something looks wrong


Where does an image come from?


Pinhole
Camera


## Where does an image come from?

- Position, direction and energy come from properties of the light

Photon emitted

- From some random position at the light source
- To some random direction
- Carries some energy $E$


Pinhole
Camera


## Where does an image come from?

- The amount of absorbed energy is a material property
- The direction in which it is reflected depends on the BRDF of the material
- Here, the material is red and diffuse, so green and blue frequencies will be absorbed and the reddish photon may bounce of in most any direction


Pinhole
Camera


Hits a surface

- Some of the energy of some frequencies is absorbed
- The rest is reflected in some direction


## Where does an image come from?

- Here, the surface is more of a mirror so little energy will be absorbed and the photon is more likely to bounce in the perfect reflection direction


Pinhole
Camera


## Where does an image come from?

- The photon will keep bouncing on the surfaces...


Pinhole
Camera


Keeps bouncing on surfaces

- Loosing energy at each hit


## Where does an image come from?

- We could keep following this photon until it left the scene, or ran out of energy



## Where does an image come from?

- Or, by some chance it happens to reflect off a surface, go through the little pinhole and land on our film contributing to a pixel value
- We could generate images like this, by just tracing photon after photon around the scene and record the ones that end up on the film
- But it would take forever


Or happens to hit our film

Pinhole
Camera


## Backward Light Tracing

- Since most of the paths traced would have been wasted, we do this simulation backwards instead
- So, we shoot a ray through the pixel we are interested in, until we hit a surface
- Then we ask: What radiance will leave this point in the direction of my pixel?

$L_{o}\left(p, \omega_{o}\right)=L_{e}\left(p, \omega_{o}\right)+\int_{H^{2}(\vec{n})} f_{r}\left(p, \omega_{i}, \omega_{o}\right) L_{i}\left(p, \omega_{i}\right) \cos \theta_{i} d \omega_{i}$




## The cosine term

- Tells us which amount of the incoming radiance from direction $\omega_{i}$ will land on a unit surface area
- Independent of the material



## The BRDF

- A mirror surface will only have high values when $\omega_{i}=\omega_{o}$
- A diffuse surface has a constant BRDF



## The BRDF

- We (usually) can not solve this equation analytically, since it depends on a scene which we have no nice mathematical description of



## Monte Carlo Integration

## Numerical Integration

- But we can estimate the value of any integral using Monte-Carlo integration
- We then take $N$ random samples over the domain of the integral


$$
L_{o}\left(p, \omega_{o}\right) \approx L_{e}\left(p, \omega_{o}\right)+\frac{1}{N} \sum_{i=0}^{N} \frac{f_{r}\left(p, \omega_{i}, \omega_{o}\right) L_{i}\left(p, \omega_{i}\right) \cos \theta_{i}}{p\left(\omega_{i}\right)}
$$

## Monte Carlo Integration

## Numerical Integration

- This is an unbiased estimator, so the expected value will be exactly the radiance we are after



## Monte Carlo Integration

## Numerical Integration

- This is an unbiased estimator, so the expected value will be exactly the radiance we are after
- Even if we only take ONE sample
- And even if we sample the hemisphere perfectly uniformly (making the PDF constant)


Sample hemisphere uniformly :
$p\left(\omega_{i}\right)=\frac{1}{2 \pi}$

$$
L_{o}\left(p, \omega_{o}\right)=\mathbb{E}\left[L_{e}\left(p, \omega_{o}\right)+\frac{1}{1} \sum_{i=0}^{1} \frac{f_{r}\left(p, \omega_{i}, \omega_{o}\right) L_{i}\left(p, \omega_{i}\right) \cos \theta_{i}}{p\left(\omega_{i}\right)}\right]
$$

## Monte Carlo Integration

## Numerical Integration

- Now we have a very simple estimator for the correct outgoing radiance from $p$
- Since it is unbiased we can evaluate this for every pixel, time and time again and the average will converge towards the correct value

$L_{o}\left(p, \omega_{o}\right)=\mathbb{E}\left[L_{e}\left(p, \omega_{o}\right)+2 \pi f_{r}\left(p, \omega_{i}, \omega_{o}\right) L_{i}\left(p, \omega_{i}\right) \cos \theta_{i}\right]$


## Path Tracing

## Basic path tracing algorithm

- Trace a ray through the pixel, to find the first intersection point $p$

$L_{o}\left(p, \omega_{o}\right) \approx L_{e}\left(p, \omega_{o}\right)+2 \pi f_{r}\left(p, \omega_{i}, \omega_{o}\right) L_{i}\left(p, \omega_{i}\right) \cos \theta_{i}$


## Path Tracing

## Basic path tracing algorithm

- Trace a ray through the pixel, to find the first intersection point $p$
- Choose a random direction $\omega_{i}$ on the hemisphere

$L_{o}\left(p, \omega_{o}\right) \approx L_{e}\left(p, \omega_{o}\right)+2 \pi f_{r}\left(p, \omega_{i}, \omega_{o}\right) L_{i}\left(p, \omega_{i}\right) \cos \theta_{i}$


## Path Tracing

## Basic path tracing algorithm

- Trace a ray through the pixel, to find the first intersection point $p$
- Choose a random direction $\omega_{i}$ on the hemisphere

$L_{o}\left(p, \omega_{o}\right) \approx 0+2 \pi f_{r}\left(p, \omega_{i}, \omega_{o}\right) L_{i}\left(p, \omega_{i}\right) \cos \theta_{i}$


## Path Tracing

## Basic path tracing algorithm

- Trace a ray through the pixel, to find the first intersection point $p$
- Choose a random direction $\omega_{i}$ on the hemisphere
- To evaluate the $L_{i}$ term, we shoot a ray in the direction $\omega_{i}$, and note that $L_{i}$ can be replaced by $L_{o}$ from that point


$$
L_{o}\left(p, \omega_{o}\right) \approx 0+2 \pi f_{r}\left(p, \omega_{i}, \omega_{o}\right) L_{o}\left(p^{\prime},-\omega_{i}\right) \cos \theta_{i}
$$

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$L_{o}\left(p, \omega_{o}\right) \approx 0+2 \pi f_{r}\left(p, \omega_{i}, \omega_{o}\right)\left[L_{e}\left(p^{\prime},-\omega_{i}\right)+2 \pi f_{r}\left(p^{\prime}, \omega^{\prime}{ }_{i},-\omega_{i}\right) L_{i}\left(p^{\prime}, \omega^{\prime}\right) \cos \theta^{\prime}{ }_{i}\right] \cos \theta_{i}$


## Path Tracing

## Basic path tracing algorithm

- Trace a ray through the pixel, to find the first intersection point $p$
- Choose a random direction $\omega_{i}$ on the hemisphere
- To evaluate the $L_{i}$ term, we shoot a ray in the direction $\omega_{i}$, and note that $L_{i}$ can be replaced by $L_{o}$ from that point
- Choose a new random direction and evaluate the BRDF and cosine term


$$
L_{o}\left(p, \omega_{o}\right) \approx 0+2 \pi f_{r}\left(p, \omega_{i}, \omega_{o}\right)\left[0+2 \pi f_{r}\left(p^{\prime}, \omega_{i}^{\prime},-\omega_{i}\right) L_{i}\left(p^{\prime}, \omega_{i}^{\prime}\right) \cos \theta^{\prime}{ }_{i}\right] \cos \theta_{i}
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## Path Tracing

## Basic path tracing algorithm

- Choose a random direction $\omega_{i}$ on the hemisphere
- To evaluate the $L_{i}$ term, we shoot a ray in the direction $\omega_{i}$, and note that $L_{i}$ can be replaced by $L_{o}$ from that point
- Choose a new random direction and evaluate the BRDF and cosine term
- Shoo a new ray to find the next ray on

$L_{o}\left(p, \omega_{o}\right) \approx 0+2 \pi f_{r}\left(p, \omega_{i}, \omega_{o}\right)\left[0+2 \pi f_{r}\left(p^{\prime}, \omega^{\prime}{ }_{i},-\omega_{i}\right) L_{i}\left(p^{\prime}, \omega_{i}^{\prime}\right) \cos \theta^{\prime}{ }_{i}\right] \cos \theta_{i}$


## Path Tracing

## Basic path tracing algorithm

- Choose a new random direction and evaluate the BRDF and cosine term
- Shoo a new ray to find the next ray on the path...
- And hit the light! We replace $L_{i}$ by $L_{o}$ from the new point and since this is a light-source, with no reflections

$L_{o}\left(p, \omega_{o}\right) \approx 0+2 \pi f_{r}\left(p, \omega_{i}, \omega_{o}\right)\left[0+2 \pi f_{r}\left(p^{\prime}, \omega^{\prime}{ }_{i},-\omega_{i}\right) L_{o}\left(p^{\prime \prime},-\omega_{i}^{\prime}\right) \cos \theta_{i}^{\prime}\right] \cos \theta_{i}$


## Path Tracing

## Basic path tracing algorithm

- Choose a new random direction and evaluate the BRDF and cosine term
- Shoo a new ray to find the next ray on the path...
- And hit the light! We replace $L_{i}$ by $L_{o}$ from the new point and since this is a light-source, with no reflections
- We only have to replace $L_{o}$ by $L_{e}$ and we are done

$L_{o}\left(p, \omega_{o}\right) \approx 0+2 \pi f_{r}\left(p, \omega_{i}, \omega_{o}\right)\left[0+2 \pi f_{r}\left(p^{\prime}, \omega_{i}^{\prime},-\omega_{i}\right) L_{e}\left(p^{\prime \prime},-\omega_{i}^{\prime}\right) \cos \theta^{\prime}{ }_{i}\right] \cos \theta_{i}$


## Path Tracing

## Basic path tracing algorithm

- The problem is that it was pure luck that we hit a light-source so soon
- For the majority of paths, the contribution will be close to zero before we ever hit a light...
- Still, it works, and we have an unbiased estimate value of our pixel. Since it is unbiased, we can keep doing this infinitely many times and average the results to get the final correct image

$L_{o}\left(p, \omega_{o}\right) \approx 0+2 \pi f_{r}\left(p, \omega_{i}, \omega_{o}\right)\left[0+2 \pi f_{r}\left(p^{\prime}, \omega_{i}^{\prime},-\omega_{i}\right) L_{e}\left(p^{\prime \prime},-\omega_{i}^{\prime}\right) \cos \theta_{i}^{\prime}\right] \cos \theta_{i}$


## Path Tracing

## Basic path tracing algorithm

- The problem is that it was pure luck that we hit a light-source so soon
- Soluition: separate direct and indirect illumination



## Importance Sampling

- So far we have sampled incoming light uniformly over the hemisphere. Why is that a bad idea?



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## Importance Sampling

## Importance Sampling

- So far we have sampled incoming light uniformly over the hemisphere. Why is that a bad idea?
- We want to shoot more samples where the function we are integrating is high!
- One common type of importance sampling is to create a distribution that resembles the BRDF



## Importance Sampling

$$
L_{o}\left(p, \omega_{o}\right) \approx L_{e}\left(p, \omega_{o}\right)+\frac{1}{N} \sum_{i=0}^{N} \frac{f_{r}\left(p, \omega_{i}, \omega_{o}\right) L_{i}\left(p, \omega_{i}\right) \cos \theta_{i}}{p\left(\omega_{i}\right)}
$$

- We need to make sure our PDF is not low where the function we are sampling can be high
- Or we will accumulate samples with extremely high variance
- Example: We can always generate samples with cosine distribution:

$$
L_{o}\left(p, \omega_{o}\right) \approx L_{e}\left(p, \omega_{o}\right)+\frac{1}{N} \sum_{i=0}^{N} \frac{f_{r}\left(p, \omega_{i}, \omega_{o}\right) L_{i}\left(p, \omega_{i}\right) \cos \theta_{i}}{\frac{\cos \theta_{i}}{\pi}}=\frac{\pi}{N} \sum_{i=0}^{N} f_{r}\left(p, \omega_{i}, \omega_{o}\right) L_{i}\left(p, \omega_{i}\right)
$$

## Stratified Sampling

## Stratified Sampling

- Another standard variance reduction method
- When just choosing samples randomly over the domain, they may "clump" and take a long while to converge



## Stratified Sampling

## Divide domain into "strata"

- Don't sample one strata again until all others have been sampled once



## Multiple Importance Sampling

## Multiple Importance Sampling

- Small light source, diffuse surface
- Direct Illumination
- Stochastic sampling the light sources



## Multiple Importance Sampling

## Multiple Importance Sampling

- Small light source, diffuse surface
- Direct Illumination
- Stochastic sampling the light sources
- Indirect Illumination
- Stochastic sampling the BRDF

$L_{o}\left(p, \omega_{o}\right)=\int_{S} f_{r}\left(p, p \rightarrow q, \omega_{o}\right) L_{e}(s, s \rightarrow p) G(p, s) V(p, s) d s+\int_{H^{2}(\vec{n})} f_{r}\left(p, \omega_{i}, \omega_{o}\right) L_{i}\left(p, \omega_{i}\right) \cos \theta_{i} d \omega_{i}$


## Multiple Importance Sampling

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- Problem: large light source, specullar surface
- Direct Illumination
- Stochastic sampling the light sources



## Multiple Importance Sampling

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- Problem: large light source, specullar surface
- Direct Illumination
- Stochastic sampling the light sources
- Indirect Illumination
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$$
L_{o}\left(p, \omega_{o}\right)=\int_{S} f_{r}\left(p, p \rightarrow q, \omega_{o}\right) L_{e}(s, s \rightarrow p) G(p, s) V(p, s) d s+\int_{H^{2}(\vec{n})} f_{r}\left(p, \omega_{i}, \omega_{o}\right) L_{i}\left(p, \omega_{i}\right) \cos \theta_{i} d \omega_{i}
$$

## Multiple Importance Sampling



## Multiple Importance Sampling

## Multiple Importance Sampling

- Problem: large light source, specullar surface
- Solution: Sample both BRDF and the light source
- Sample BRDF first
- Then light
- PDF of this sampling strategy is (weighted) sum
- Only very low if neither technique is likely to choose direction


Multiple Importance Sampling


## Bidirectional Path Tracing

## Bidirectional path tracing is a combination of

- Shooting rays from the light sources and creating paths in the scene
- Gathering rays from a point on a surface



## Bidirectional path tracing




Ambient Occlusion

## Calculates shadows against assumed constant ambient illumination

- Idea: in most environments, multiple light bounces lead to a very smooth component in the overall illumination
- For this component, incident light on a point is proportional to the part of the environment (opening angle) visible from the point
- Describes well contact shadows, dark corners



## Example: visibility map



## Computation using Ray-Tracing is straightforward

- Start at point $p$
- Sample $N$ directions $\left(\omega_{1}, \omega_{2}, \ldots, \omega_{N}\right)$ from upper hemisphere (e.g. using cosine-weighted hemisphere sampler)
- Transform the samples from their coordinate to the object's coordinate system
- Shot shadow rays from $p$ to $\omega_{i}$ with maximum length $r$ (i.e.: ray. $\mathrm{t}=\mathrm{r}$ )
- Count how many directions are occluded




Without ambient occlusion


With ambient occlusion

Ambient Occlusion


