

## Computer Graphics

CSE 167 [Win 24], Lecture 19: High Quality Rendering  
Ravi Ramamoorthi

<http://viscomp.ucsd.edu/classes/cse167/wi24>

1

## Summary

- Good luck on HW 4, written assignment
- Please consider CSE 168 (Rendering) in spring

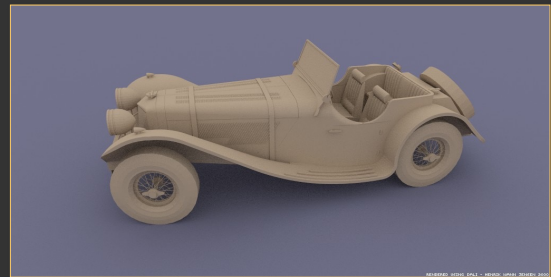
2

## Monte Carlo Path Tracing

- General solution to rendering and global illumination
- Suitable for a variety of general scenes
- Based on Monte Carlo methods
- Enumerate all paths of light transport
- Long history, traces back to rendering eqn Kajiya 86
- (More advanced topic: Slides from CSE 168/274)
- Increasingly, basis for production rendering
- Path tracing today real-time in hardware (for example, using NVIDIA's Optix, Turing, Ada RTX)

3

## Monte Carlo Path Tracing

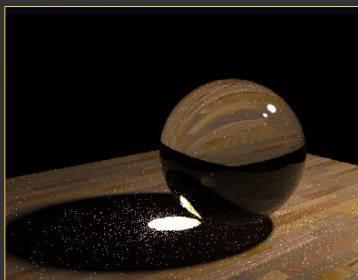


Big diffuse light source, 20 minutes

Jensen

4

## Monte Carlo Path Tracing



1000 paths/pixel

Jensen

5

## Monte Carlo Path Tracing

### Advantages

- Any type of geometry (procedural, curved, ...)
- Any type of BRDF or reflectance (specular, glossy, diffuse, ...)
- Samples all types of paths ( $L(SD)^*E$ )
- Accuracy controlled at pixel level
- Low memory consumption
- Unbiased - error appears as noise in final image

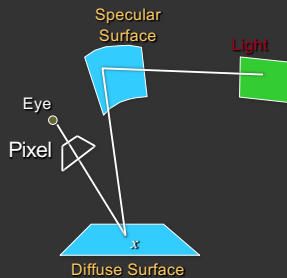
### Disadvantages (standard Monte Carlo problems)

- Slow convergence (square root of number of samples)
- Noise in final image

6

## Monte Carlo Path Tracing

Integrate radiance for each pixel by sampling paths randomly



$$L_o(x, \vec{w}) = L_e(x, \vec{w}) + \int_{\Omega} f_r(x, \vec{w}', \vec{w}) L_i(x, \vec{w}') (\vec{w}' \cdot \vec{n}) d\vec{w}'$$

7

## Simplest Monte Carlo Path Tracer

For each pixel, cast n samples and average

- Choose a ray with  $p = \text{camera}$ ,  $d = (\theta, \phi)$  within pixel
- Pixel color  $\text{+= } (1/n) * \text{TracePath}(p, d)$

TracePath( $p, d$ ) returns (r,g,b) [and calls itself recursively]:

- Trace ray ( $p, d$ ) to find nearest intersection  $p'$
- Select with probability (say) 50%:
  - Emitted:
    - return  $2 * (L_{e_{\text{red}}}, L_{e_{\text{green}}}, L_{e_{\text{blue}}}) // 2 = 1/(50\%)$
  - Reflected:
    - generate ray in random direction  $d'$
    - return  $2 * f_r(d \rightarrow d') * (n * d') * \text{TracePath}(p', d')$

8

## Simplest Monte Carlo Path Tracer

For each pixel, **cast n samples and average over paths**

- Choose a ray with  $p = \text{camera}$ ,  $d = (\theta, \phi)$  within pixel
- Pixel color  $\text{+= } (1/n) * \text{TracePath}(p, d)$

TracePath( $p, d$ ) returns (r,g,b) [and calls itself recursively]:

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9

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Weight = 1/probability  
Remember: unbiased  
requires having  $f(x) / p(x)$

10

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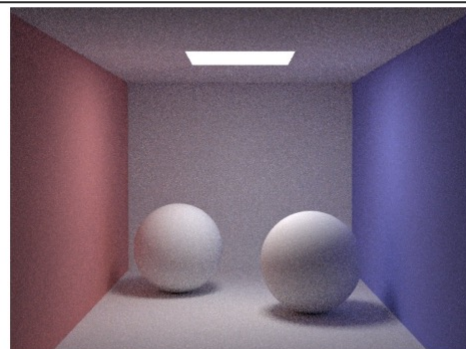
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Path terminated when  
Emission evaluated

11

## Path Tracing



CS348B Lecture 14

10 paths / pixel

Pat Hanrahan, Spring 2009

12

## Arnold Renderer (M. Fajardo)

- Works well diffuse surfaces, hemispherical light



13

## From UCB CS 294 a few years ago



Daniel Ritchie and Lita Cho

14

## Importance Sampling

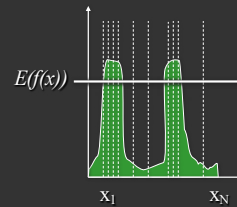
- Pick paths based on energy or expected contribution
  - More samples for high-energy paths
  - Don't pick low-energy paths
- At "macro" level, use to select between reflected vs emitted, or in casting more rays toward light sources
- At "micro" level, importance sample the BRDF to pick ray directions
- Tons of papers in 90s on tricks to reduce variance in Monte Carlo rendering
- Importance sampling now standard in production. I consulted on Pixar's system for movies from 2012+

15

## Importance Sampling

Can pick paths however we want, but contribution weighted by 1/probability

- Already seen this division of 1/prob in weights to emission, reflectance



$$\int_{\Omega} f(x) dx = \frac{1}{N} \sum_{i=1}^N Y_i$$

$$Y_i = \frac{f(x_i)}{p(x_i)}$$

16

## Importance sample Emit vs Reflect

TracePath( $p, d$ ) returns (r,g,b) [and calls itself recursively]:

- Trace ray ( $p, d$ ) to find nearest intersection  $p'$
- If  $L_e = (0,0,0)$  then  $p_{emit} = 0$  else  $p_{emit} = 0.9$  (say)
- If  $\text{random}() < p_{emit}$  then:
  - Emitted:
    - return  $(1/p_{emit}) * (L_{e_{red}}, L_{e_{green}}, L_{e_{blue}})$
  - Else Reflected:
    - generate ray in random direction  $d'$
    - return  $(1/(1-p_{emit})) * f(d \rightarrow d') * (n \cdot d') * \text{TracePath}(p', d')$

17

## More variance reduction

- Discussed "macro" importance sampling
  - Emitted vs reflected
- How about "micro" importance sampling
  - Shoot rays towards light sources in scene
  - Distribute rays according to BRDF

18

## Path Tracing: Include Direct Lighting

```

Step 1. Choose a camera ray  $r$  given the
         $(x, y, u, v, t)$  sample
        weight = 1;
        L = 0
Step 2. Find ray-surface intersection
Step 3.
        L += weight * Lr(light sources)
        weight *= reflectance(r)
        Choose new ray  $r' \sim \text{BRDF pdf}(r)$ 
        Go to Step 2.
    
```

CS348B Lecture 14

Pat Hanrahan, Spring 2009

19

## Monte Carlo Extensions

### Unbiased

- Bidirectional path tracing
- Metropolis light transport

### Biased, but consistent

- Noise filtering
- Adaptive sampling
- Irradiance caching

20

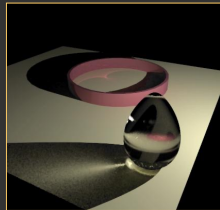
## Monte Carlo Extensions

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RenderPark

21

## Monte Carlo Extensions

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Heinrich

22

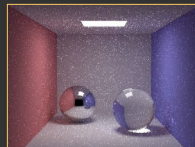
## Monte Carlo Extensions

### Unbiased

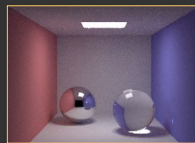
- Bidirectional path tracing
- Metropolis light transport

### Biased, but consistent

- Noise filtering
- Adaptive sampling
- Irradiance caching



Unfiltered



Filtered

Jensen

23

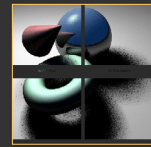
## Monte Carlo Extensions

### Unbiased

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Fixed



Adaptive

Ohbuchi

24

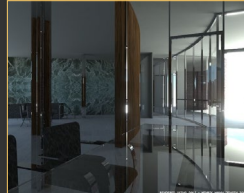
## Monte Carlo Extensions

### Unbiased

- Bidirectional path tracing
- Metropolis light transport

### Biased, but consistent

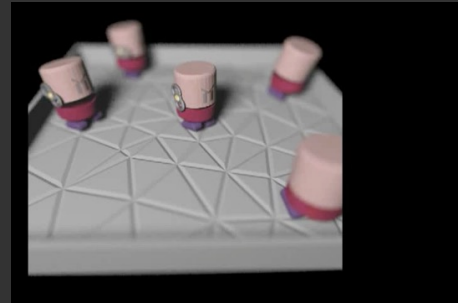
- Noise filtering
- Adaptive sampling
- Irradiance caching



Jensen

25

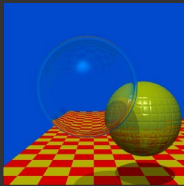
## Monte Carlo Denoising



26

## Impact: Real-Time

- Extend AAF, FSF, MAAF: Predict Filter based on Deep Learning (sample and AI-based denoising)
- NVIDIA software (OptiX 2017), hardware (RTX 2018)
- 40-year journey: ray tracing curiosity to every pixel



Whitted 79 (74 min 512x512)



NVIDIA RTX 2018. OptiX: Pixar real-time previewer

27

## Today: Real-Time Denoising at 1spp



NVIDIA Tier Demo 2021

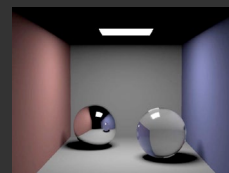
28

## Summary

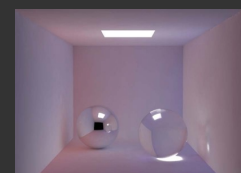
- Monte Carlo methods robust and simple (at least until nitty gritty details) for global illumination
- Must handle many variance reduction methods in practice
- Importance sampling, Bidirectional path tracing, Russian roulette etc.
- Rich field with many papers, systems researched over last 30 years
- Today, hardware for real-time ray, path tracing
- Promising physically-based GPU approach

29

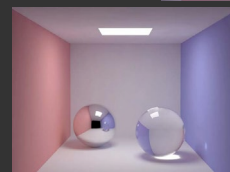
## Smoothness of Indirect Lighting



Direct



Indirect



Direct + Indirect

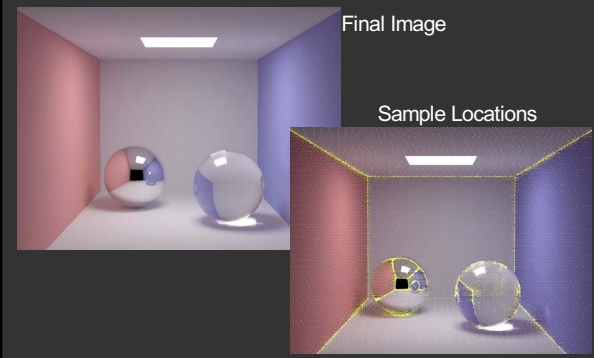
30

## Irradiance Caching

- Empirically, (diffuse) interreflections low frequency
- Therefore, should be able to sample sparsely
- Irradiance caching samples irradiance at few points on surfaces, and then interpolates
- Ward, Rubinstein, Clear. SIGGRAPH 88, *A ray tracing solution for diffuse interreflection*

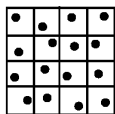
31

## Irradiance Caching Example



32

## Stratified Sampling



**Stratified sampling like jittered sampling**  
Allocate samples per region

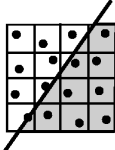
$$N = \sum_{i=1}^m N_i \quad F_N = \frac{1}{N} \sum_{i=1}^m N_i F_i$$

**New variance**

$$V[F_N] = \frac{1}{N^2} \sum_{i=1}^m N_i V[F_i]$$

Thus, if the variance in regions is less than the overall variance, there will be a reduction in resulting variance

For example: An edge through a pixel



$$V[F_N] = \frac{1}{N^2} \sum_{i=1}^{\sqrt{N}} V[F_i] = \frac{V[F_i]}{N^{1.5}}$$

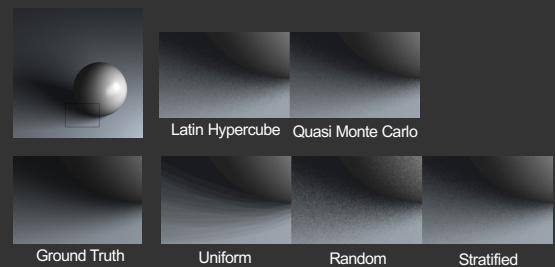
CS348B Lecture 9

Pat Hanrahan, Spring 2002

D. Mitchell 95, Consequences of stratified sampling in graphics

33

## Comparison of simple patterns



Ground Truth Uniform Random Stratified

16 samples for area light, 4 samples per pixel, total 64 samples

If interested, see my recent paper "A Theory of Monte Carlo Visibility Sampling"

Figures courtesy Tianyu Liu

34

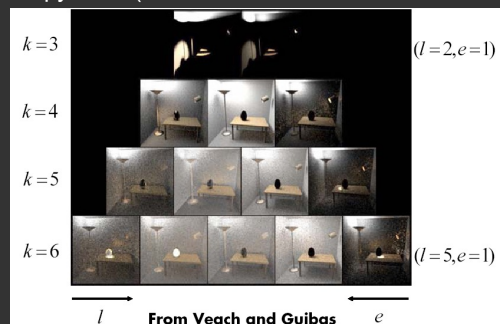
## Path Tracing: From Lights

- Step 1. Choose a light ray
- Step 2. Find ray-surface intersection
- Step 3. Reflect or transmit
  - $u = \text{Uniform}()$
  - if  $u < \text{reflectance}(x)$ 
    - Choose new direction  $d \sim \text{BRDF}(O||)$
    - goto Step 2
  - else if  $u < \text{reflectance}(x) + \text{transmittance}(x)$ 
    - Choose new direction  $d \sim \text{BTDF}(O||)$
    - goto Step 2
  - else // absorption = 1 - reflectance - transmittance
    - terminate on surface; deposit energy

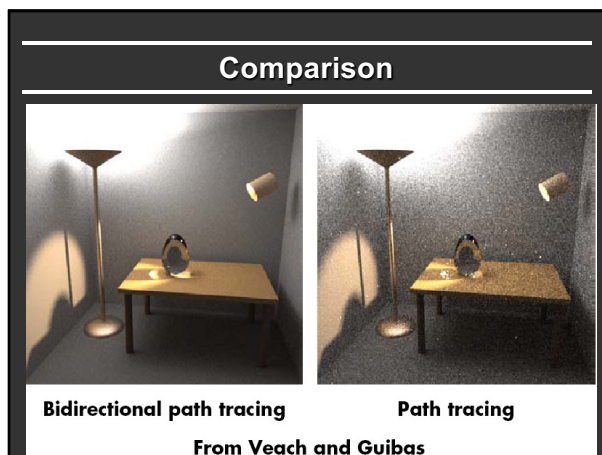
35

## Bidirectional Path Tracing

Path pyramid ( $k = l + e = \text{total number of bounces}$ )



36

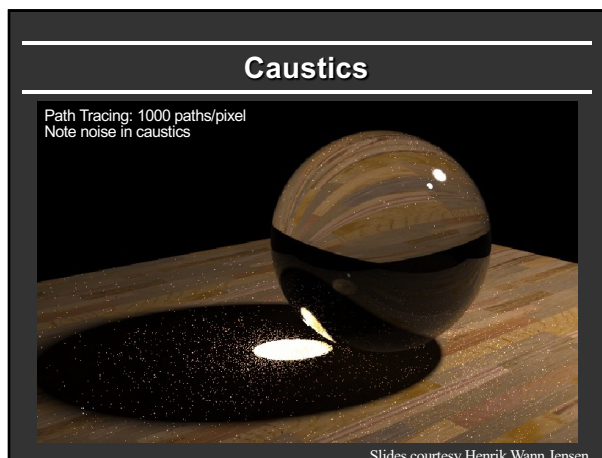


37

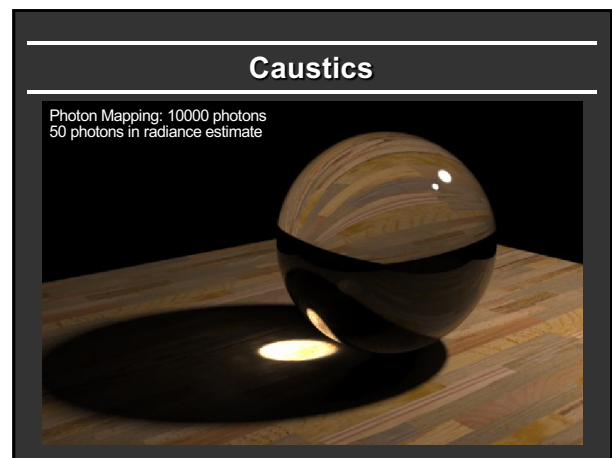
### Why Photon Map?

- Some visual effects like caustics hard with standard path tracing from eye
- May usually miss light source altogether
- Instead, store “photons” from light in kd-tree
- Look-up into this as needed
- Combines tracing from light source, and eye
- Similar to bidirectional path tracing, but compute photon map only once for all eye rays
- Global Illumination using Photon Maps H. Jensen. Rendering Techniques (EGSR 1996), pp 21-30. (Also book: Realistic Image Synthesis using Photon Mapping)*

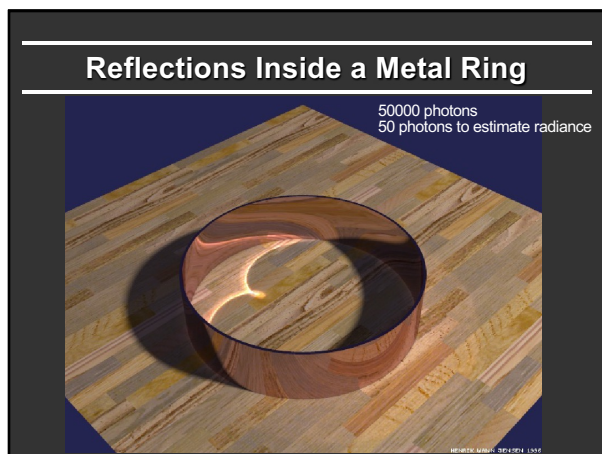
38



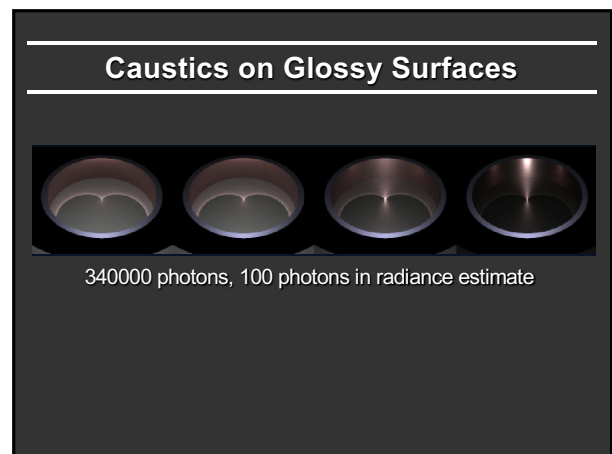
39



40

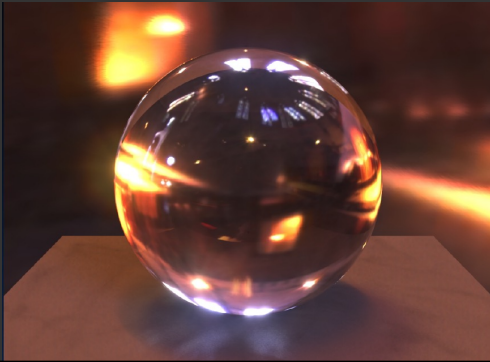


41



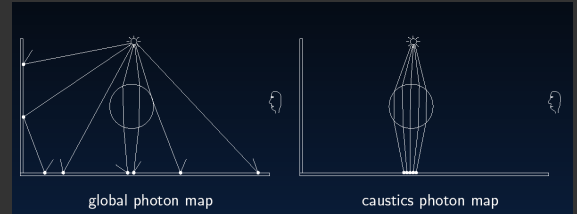
42

### HDR Environment Illumination



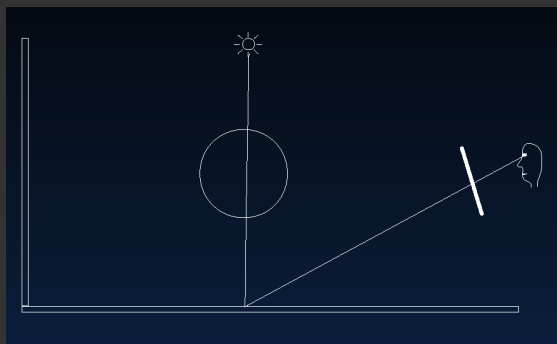
43

### Global Illumination



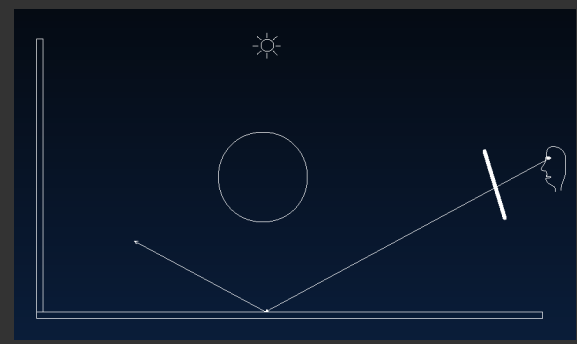
44

### Direct Illumination



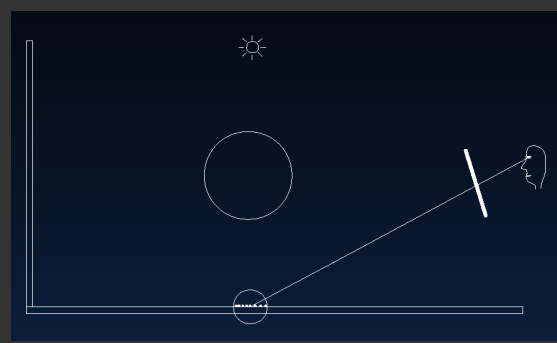
45

### Specular Reflection



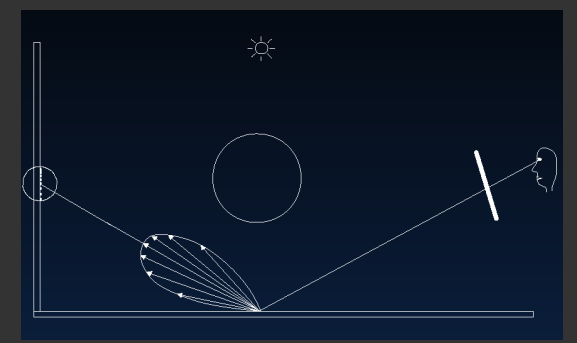
46

### Caustics



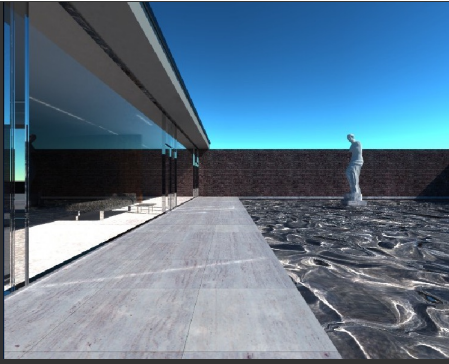
47

### Indirect Illumination



48

## Mies House: Swimming Pool



49