# Path Tracing Workshop Part 2: Path Tracing 

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intel.

## Recap

## ShaderToy

## Runs a full-viewport fragment shader in WebGL

Program that runs once per pixel to compute its color
In each exercise you complete 1 function in a ShaderToy (// TODO )
Exercise $\mathrm{N}+1$ has a reference solution for exercise N (no peeking)
To change the code, just type
To recompile/run, click play
To save, copy your code to a text file


## ShaderToy

## Runs a full-viewport fragment shader in WebGL

## Program that runs once per pixel to compute its color

In each exercise you complete 1 function in a ShaderToy (// TODO )
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To change the code, just type
To recompile/run, click play
To save, copy your code to a text file
Or create an account and a fork


## Proper WebGL config

By default, ANGLE makes big WebGL shaders run slowly on Windows


Then restart Chrome


Then reload ShaderToy tabs

## Ray-mesh intersection test

What do we see along a ray?
The closest intersected triangle!
Ray tracing finds this closest hit
Foundation of path tracing


Implemented in hardware
But we do it in software

## Our goals

Learn rendering basics
Write a path tracer
In GLSL on ShaderToy
Have fun
Part 1: Ray tracing
Part 2: Path tracing


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## Global illumination

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Top of the box is an area light Surfaces can be lit directly


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Top of the box is an area light Surfaces can be lit directly But also indirectly


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Top of the box is an area light Surfaces can be lit directly

But also indirectly
Via paths of arbitrary length


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Path tracing starts at camera
Finds a light when it is lucky


## Global illumination

Top of the box is an area light
Surfaces can be lit directly
But also indirectly
Via paths of arbitrary length
Path tracing starts at camera
Finds a light when it is lucky
The colors are called "radiance"


## Radiance

$L(\mathbf{x}, \omega)=$ color for ray $\mathbf{x}+t \omega$
Pixel = radiance for camera ray


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$L(\mathbf{x}, \omega)=$ color for ray $\mathbf{x}+t \omega$
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Plenoptic function/radiance field
Constant along rays in vacuum


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$$
L(\mathbf{y}, \omega)=L(\mathbf{x}, \omega)
$$



## Radiance

$L(\mathbf{x}, \omega)=$ color for ray $\mathbf{x}+t \omega$
Pixel = radiance for camera ray
Plenoptic function/radiance field
Constant along rays in vacuum
$L(\mathbf{y}, \omega)=L(\mathbf{x}, \omega)$
Ray tracing transports radiance
Light transport


## Irradiance

Beam of cross-sectional area $A$ hits surface area $A^{\prime}$


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$$
\cos (\theta)=\frac{\text { adjacent }}{\text { hypotenuse }}=\frac{A}{A^{\prime}}
$$



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Beam of cross-sectional area $A$ hits surface area $A^{\prime}$
$\cos (\theta)=\frac{\text { adjacent }}{\text { hypotenuse }}=\frac{A}{A^{\prime}}=\mathbf{n} \cdot \omega$
Because we ensure $\|\mathbf{n}\|=\|\omega\|=1$


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$\cos (\theta)=\frac{\text { adjacent }}{\text { hypotenuse }}=\frac{A}{A^{\prime}}=\mathbf{n} \cdot \omega$
Because we ensure $\|\mathbf{n}\|=\|\omega\|=1$
Irradiance gathers all light at point $\mathbf{x}$
Weighted integral over radiance:

$$
E(\mathbf{x}, \mathbf{n})=\int_{\Omega(\mathbf{x})} L(\mathbf{x}, \omega) \mathbf{n} \cdot \omega \mathrm{d} \omega
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Because we ensure $\|\mathbf{n}\|=\|\omega\|=1$
Irradiance gathers all light at point $\mathbf{x}$
Weighted integral over radiance:

$E(\mathbf{x}, \mathbf{n})=\int_{\Omega(\mathbf{x})} L(\mathbf{x}, \omega) \mathbf{n} \cdot \omega \mathrm{d} \omega$
Where $\Omega(\mathbf{x}) \subseteq \mathbb{R}^{3}$ is a hemisphere: $\omega \in \Omega(\mathbf{x}) \Leftrightarrow\|\omega\|=1, \mathbf{n} \cdot \omega \geq 0$

## The rendering equation

$$
L_{o}(\mathbf{x})=L_{e}(\mathbf{x})+\frac{a(\mathbf{x})}{\pi} \int_{\Omega(\mathbf{x})} L(\mathbf{x}, \omega) \mathbf{n}(\mathbf{x}) \cdot \omega \mathrm{d} \omega
$$

Result: Outgoing radiance $L_{o}(\mathbf{x})$ for diffuse surface at $\mathbf{x}$

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Compute incoming irradiance $E(\mathbf{x}, \mathbf{n}(\mathbf{x}))$, i.e. total light reaching $\mathbf{x}$ Multiply by the surface color $a(\mathbf{x})$ (component-wise)

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Compute incoming irradiance $E(\mathbf{x}, \mathbf{n}(\mathbf{x}))$, i.e. total light reaching $\mathbf{x}$
Multiply by the surface color $a(\mathbf{x})$ (component-wise)
Divide by $\pi$ to ensure energy conservation

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Result: Outgoing radiance $L_{o}(\mathbf{x})$ for diffuse surface at $\mathbf{x}$
Compute incoming irradiance $E(\mathbf{x}, \mathbf{n}(\mathbf{x}))$, i.e. total light reaching $\mathbf{x}$
Multiply by the surface color $a(\mathbf{x})$ (component-wise)
Divide by $\pi$ to ensure energy conservation
Add light emitted at $\mathbf{x}$ ( 0 if there is no light source at $\mathbf{x}$ )

## Mesh representation

```
    // A triangle along with some shading parameters
    struct triangle_t {
        // The positions of the three vertices (v_0, v_1, v_2)
    X vec3 positions[3];
    // A vector of length 1, orthogonal to the triangle (n)
    vec3 normal;
    // The albedo of the triangle (i.e. the fraction of
    a(\mathbf{x}) // red/green/blue light that gets reflected) (a)
    a(\mathbf{X) vec3 color;}
        // The radiance emitted by the triangle (for light sources) (L_e)
L
    };
```


## The rendering equation: Challenges

$$
L_{o}(\mathbf{x})=L_{e}(\mathbf{x})+\frac{a(\mathbf{x})}{\pi} \int_{\Omega(\mathbf{x})} L(\mathbf{x}, \omega) \mathbf{n}(\mathbf{x}) \cdot \omega \mathrm{d} \omega
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We have to integrate over $\Omega(\mathbf{x})$


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We need $L(\mathbf{x}, \omega)$


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We need $L(\mathbf{x}, \omega)$

$$
\mathbf{y}=\text { ray_intersection }(\mathbf{x}, \omega)=\mathbf{x}+t \omega
$$

$$
L(\mathbf{x}, \omega)=L_{o}(\mathbf{y})
$$



## The rendering equation: Challenges

$L_{o}(\mathbf{x})=L_{e}(\mathbf{x})+\frac{a(\mathbf{x})}{\pi} \int_{\Omega(\mathbf{x})} L(\mathbf{x}, \omega) \mathbf{n}(\mathbf{x}) \cdot \omega \mathrm{d} \omega$
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We need $L(\mathbf{x}, \omega)$
$\mathbf{y}=$ ray_intersection $(\mathbf{x}, \omega)=\mathbf{x}+t \omega$
$L(\mathbf{x}, \omega)=L_{o}(\mathbf{y})$


So we need $L_{o}(\mathbf{y})$ to compute $L_{o}(\mathbf{x})$

# Monte Carlo integration 

## Monte Carlo integration

We cannot integrate over $\infty$ many $\omega \in \Omega(\mathbf{x})$ exactly
Instead, pick $\omega_{1} \in \Omega(\mathbf{x})$ at random

$$
\begin{aligned}
& \int_{\Omega(\mathbf{x})} L(\mathbf{x}, \omega) \mathbf{n}(\mathbf{x}) \cdot \omega \mathrm{d} \omega \\
\approx & 2 \pi L\left(\mathbf{x}, \omega_{1}\right) \mathbf{n}(\mathbf{x}) \cdot \omega_{1}
\end{aligned}
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## Monte Carlo integration

We cannot integrate over $\infty$ many $\omega \in \Omega(\mathbf{x})$ exactly
Instead, pick $\omega_{1}, \ldots, \omega_{N} \in \Omega(\mathbf{x})$ at random

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\begin{aligned}
& \int_{\Omega(\mathbf{x})} L(\mathbf{x}, \omega) \mathbf{n}(\mathbf{x}) \cdot \omega \mathrm{d} \omega \\
\approx & 2 \pi \frac{1}{N} \sum_{j=1}^{N} L\left(\mathbf{x}, \omega_{j}\right) \mathbf{n}(\mathbf{x}) \cdot \omega_{j}
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Equal for $N \rightarrow \infty$ (with 100\% probability)

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Equal for $N \rightarrow \infty$ (with 100\% probability)
Error is zero-mean noise


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$$
N=8
$$

## Monte Carlo integration

We cannot integrate over $\infty$ many $\omega \in \Omega(\mathbf{x})$ exactly
Instead, pick $\omega_{1}, \ldots, \omega_{N} \in \Omega(\mathbf{x})$ at random
$\int_{\Omega(\mathbf{x})} L(\mathbf{x}, \omega) \mathbf{n}(\mathbf{x}) \cdot \omega \mathrm{d} \omega$
$\approx 2 \pi \frac{1}{N} \sum_{j=1}^{N} L\left(\mathbf{x}, \omega_{j}\right) \mathbf{n}(\mathbf{x}) \cdot \omega_{j}$
Equal for $N \rightarrow \infty$ (with 100\% probability)
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Error is zero-mean noise


## Non-uniform sphere sampling

Random generator gives uniform $u_{0}, u_{1} \in[0,1)$
Map to sphere with spherical coordinates:
$\varphi=2 \pi u_{0}, \theta=\pi u_{1}$
$\omega_{\mathrm{x}}=\cos (\varphi) \sin (\theta)$
$\omega_{\mathrm{y}}=\sin (\varphi) \sin (\theta)$
$\omega_{\mathrm{z}}=\cos (\theta)$



Problem: Too many samples at the top

## Uniform sphere sampling

Pick $\omega_{z} \in[-1,1)$ uniformly:
$\omega_{\mathrm{z}}=2 u_{1}-1$
$\varphi=2 \pi u_{0}$
$\omega_{\mathrm{x}}=\cos (\varphi) \sqrt{1-\omega_{\mathrm{z}}^{2}}$
$\omega_{\mathrm{y}}=\sin (\varphi) \sqrt{1-\omega_{\mathrm{z}}^{2}}$
Looks right


Derivation in chapter 13.6.1 of pbr-book.org

## Uniform hemisphere sampling

Directions with $\mathbf{n} \cdot \omega<0$ contribute nothing

Start with $\omega$ on the sphere Mirror if $\mathbf{n} \cdot \omega<0$ :
$\omega^{\prime}=\omega-2(\mathbf{n} \cdot \omega) \mathbf{n}$


## Uniform hemisphere sampling

Directions with $\mathbf{n} \cdot \omega<0$ contribute nothing

Start with $\omega$ on the sphere
Mirror if $\mathbf{n} \cdot \omega<0$ :
$\omega^{\prime}=\omega-2(\mathbf{n} \cdot \omega) \mathbf{n}$
i.e. subtract $\mathbf{n}$-component twice

$-(\mathbf{n} \cdot \omega) \mathbf{n}$
都

## Uniform hemisphere sampling

Directions with $\mathbf{n} \cdot \omega<0$ contribute nothing

Start with $\omega$ on the sphere Mirror if $\mathbf{n} \cdot \omega<0$ :
$\omega^{\prime}=\omega-2(\mathbf{n} \cdot \omega) \mathbf{n}$
i.e. subtract $\mathbf{n}$-component twice


## Exercise 4: Uniform sphere sampling

Complete sample_sphere()
Inputs: Uniform $u_{0}, u_{1} \in[0,1)$
Output: Uniform random direction $\omega$
The framework displays 512 samples
Use the formulas discussed 2 slides ago
Use $\cos (), \sin (), \operatorname{sqrt}(), \operatorname{vec} 3()$


Correct result

## Exercise 4: Uniform sphere sampling

Complete sample_sphere()
Inputs: Uniform $u_{0}, u_{1} \in[0,1)$
Output: Uniform random direction $\omega$
The framework displays 512 samples
Use the formulas discussed 2 slides ago
Use $\cos (), \sin (), \operatorname{sqrt}(), \operatorname{vec} 3()$


Correct result

## Exercise 5: Uniform hemisphere sampling

Complete sample_hemisphere()
Inputs: Uniform $u_{0}, u_{1} \in[0,1)$, normal $\mathbf{n}(\mathbf{x})$
Output: Uniform random direction $\omega \in \Omega(\mathbf{x})$
The framework displays 512 samples
Use the formulas discussed 2 slides ago
Use if, dot(), *, -


Correct result

## Exercise 5: Uniform hemisphere sampling

Complete sample_hemisphere()
Inputs: Uniform $u_{0}, u_{1} \in[0,1)$, normal $\mathbf{n}(\mathbf{x})$
Output: Uniform random direction $\omega \in \Omega(\mathbf{x})$
The framework displays 512 samples
Use the formulas discussed 2 slides ago
Use if, $\operatorname{dot}(), *$,


## Pseudorandom number generator

```
// A pseudo-random number generator
// \param seed Numbers that are different for each invocation. Gets updated so
// that it can be reused.
// \return Two independent, uniform, pseudo-random numbers in [0,1) (u_0, u_1)
vec2 get_random_numbers(inout uvec2 seed) {
    // This is PCG2D: https://jcgt.org/published/0009/03/02/
    seed = 1664525u * seed + 1013904223u;
    seed.x += 1664525u * seed.y;
    seed.y += 1664525u * seed.x;
    seed ^= (seed >> 16u);
    seed.x += 1664525u * seed.y;
    seed.y += 1664525u * seed.x;
    seed ^= (seed >> 16u);
    // Convert to float. The constant here is 2^-32.
    return vec2(seed) * 2.32830643654e-10;
}
```


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// \param seed Numbers that are different for each invocation. Gets updated so
// that it can be reused.
// \return Two independent, uniform, pseudo-random numbers in [0,1) (u_0, u_1)
vec2 get_random_numbers(inout uvec2 seed) {
    // ...
}
```

```
// Use a different seed for each pixel and each frame
uvec2 seed = uvec2(pixel_coord) ^ uvec2(iFrame << 16);
// This gives us 2 uniform random numbers in [0,1)
vec2 rands_0 = get_random_numbers(seed);
// These are different random numbers because seed has changed
vec2 rands_1 = get_random_numbers(seed);
```


## Exercise 6: Direct illumination

Complete compute_direct_illumination()
Inputs: A triangle and a point $\mathbf{x}$ on it
Output: Radiance (emission + direct illum.)
Use $N=1$ random samples $\omega \in \Omega(\mathbf{x})$
Trace ray $\mathbf{x}, \omega$ to find $L_{e}(\mathbf{y})$ at hit $\mathbf{y}$
Compute: $L_{e}(\mathbf{x})+\frac{a(\mathbf{x})}{\pi} 2 \pi L_{e}(\mathbf{y}) \mathbf{n}(\mathbf{x}) \cdot \omega$

Use sample_hemisphere(), ray_mesh_intersection()


Correct result SAMPLE_COUNT=1

## Exercise 6: Direct illumination

Complete compute_direct_illumination()
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Output: Radiance (emission + direct illum.)
Use $N=1$ random samples $\omega \in \Omega(\mathbf{x})$
Trace ray $\mathbf{x}, \omega$ to find $L_{e}(\mathbf{y})$ at hit $\mathbf{y}$
Compute: $L_{e}(\mathbf{x})+\frac{a(\mathbf{x})}{\pi} 2 \pi L_{e}(\mathbf{y}) \mathbf{n}(\mathbf{x}) \cdot \omega$
Use sample_hemisphere(), ray_mesh_intersection()


Correct result SAMPLE_COUNT=8

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Use sample_hemisphere(), ray_mesh_intersection()


Correct result SAMPLE_COUNT=8

## Path tracing

## Path tracing

Given camera ray $\mathbf{x}_{0}, \omega_{0}$
Want to approximate $L\left(\mathbf{x}_{0}, \omega_{0}\right)$
$\mathbf{x}_{1}=$ ray_intersection $\left(\mathbf{x}_{0}, \omega_{0}\right)$
Monte Carlo estimate with $N=1$ :
$\omega_{1} \in \Omega\left(\mathbf{x}_{1}\right)$ random sample


$$
L\left(\mathbf{x}_{0}, \omega_{0}\right)=L_{o}\left(\mathbf{x}_{1}\right) \approx L_{e}\left(\mathbf{x}_{1}\right)+\frac{a\left(\mathbf{x}_{1}\right)}{\pi} 2 \pi L\left(\mathbf{x}_{1}, \omega_{1}\right) \mathbf{n}\left(\mathbf{x}_{1}\right) \cdot \omega_{1}
$$

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Want to approximate $L\left(\mathbf{x}_{0}, \omega_{0}\right)$
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$$

## Path tracing

Given ray $\mathbf{x}_{1}, \omega_{1}$
Want to approximate $L\left(\mathbf{x}_{1}, \omega_{1}\right)$
$\mathbf{x}_{2}=$ ray_intersection $\left(\mathbf{x}_{1}, \omega_{1}\right)$
Monte Carlo estimate with $N=1$ :
$\omega_{2} \in \Omega\left(\mathbf{x}_{2}\right)$ random sample


$$
L\left(\mathbf{x}_{1}, \omega_{1}\right)=L_{o}\left(\mathbf{x}_{2}\right) \approx L_{e}\left(\mathbf{x}_{2}\right)+\frac{a\left(\mathbf{x}_{2}\right)}{\pi} 2 \pi L\left(\mathbf{x}_{2}, \omega_{2}\right) \mathbf{n}\left(\mathbf{x}_{2}\right) \cdot \omega_{2}
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$$

## Path tracing

Given ray $\mathbf{x}_{2}, \omega_{2}$
Want to approximate $L\left(\mathbf{x}_{2}, \omega_{2}\right)$
$\mathbf{x}_{3}=$ ray_intersection $\left(\mathbf{x}_{2}, \omega_{2}\right)$
Monte Carlo estimate with $N=1$ :
$\omega_{3} \in \Omega\left(\mathbf{x}_{3}\right)$ random sample


$$
L\left(\mathbf{x}_{2}, \omega_{2}\right)=L_{o}\left(\mathbf{x}_{3}\right) \approx L_{e}\left(\mathbf{x}_{3}\right)+\frac{a\left(\mathbf{x}_{3}\right)}{\pi} 2 \pi L\left(\mathbf{x}_{3}, \omega_{3}\right) \mathbf{n}\left(\mathbf{x}_{3}\right) \cdot \omega_{3}
$$

## Path tracing

Given ray $\mathbf{x}_{2}, \omega_{2}$
Want to approximate $L\left(\mathbf{x}_{2}, \omega_{2}\right)$
$\mathbf{x}_{3}=$ ray_intersection $\left(\mathbf{x}_{2}, \omega_{2}\right)$
Monte Carlo estimate with $N=1$ :
$\omega_{3} \in \Omega\left(\mathbf{x}_{3}\right)$ random sample

$L\left(\mathbf{x}_{2}, \omega_{2}\right)=L_{o}\left(\mathbf{x}_{3}\right) \approx L_{e}\left(\mathbf{x}_{3}\right)+\frac{a\left(\mathbf{x}_{3}\right)}{\pi} 2 \pi L\left(\mathbf{x}_{3}, \omega_{3}\right) \mathbf{n}\left(\mathbf{x}_{3}\right) \cdot \omega_{3}$

## Path tracing

Given ray $\mathbf{x}_{3}, \omega_{3}$
Want to approximate $L\left(\mathbf{x}_{3}, \omega_{3}\right)$
$\mathbf{x}_{4}=$ ray_intersection $\left(\mathbf{x}_{3}, \omega_{3}\right)$
Monte Carlo estimate with $N=1$ :
$\omega_{4} \in \Omega\left(\mathbf{x}_{4}\right)$ random sample


$$
L\left(\mathbf{x}_{3}, \omega_{3}\right)=L_{o}\left(\mathbf{x}_{4}\right) \approx L_{e}\left(\mathbf{x}_{4}\right)+\frac{a\left(\mathbf{x}_{4}\right)}{\pi} 2 \pi L\left(\mathbf{x}_{4}, \omega_{4}\right) \mathbf{n}\left(\mathbf{x}_{4}\right) \cdot \omega_{4}
$$

## Path tracing recursion

GLSL spec: "Static and dynamic recursion is not allowed."

## Path tracing recursion loop

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$$
L\left(\mathbf{x}_{0}, \omega_{0}\right) \approx L_{e}\left(\mathbf{x}_{1}\right)
$$

## Path tracing recursion loop

GLSL spec: "Static and dynamic recursion is not allowed."

$$
\begin{aligned}
L\left(\mathbf{x}_{0}, \omega_{0}\right) & \approx L_{e}\left(\mathbf{x}_{1}\right) \\
& +\left(a\left(\mathbf{x}_{1}\right) 2 \mathbf{n}\left(\mathbf{x}_{1}\right) \cdot \omega_{1}\right) L_{e}\left(\mathbf{x}_{2}\right)
\end{aligned}
$$

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$$
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& +\left(a\left(\mathbf{x}_{1}\right) 2 \mathbf{n}\left(\mathbf{x}_{1}\right) \cdot \omega_{1}\right)\left(a\left(\mathbf{x}_{2}\right) 2 \mathbf{n}\left(\mathbf{x}_{2}\right) \cdot \omega_{2}\right) L_{e}\left(\mathbf{x}_{3}\right)
\end{aligned}
$$

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& +\left(a\left(\mathbf{x}_{1}\right) 2 \mathbf{n}\left(\mathbf{x}_{1}\right) \cdot \omega_{1}\right) L_{e}\left(\mathbf{x}_{2}\right) \\
& +\underbrace{\left(a\left(\mathbf{x}_{1}\right) 2 \mathbf{n}\left(\mathbf{x}_{1}\right) \cdot \omega_{1}\right)\left(a\left(\mathbf{x}_{2}\right) 2 \mathbf{n}\left(\mathbf{x}_{2}\right) \cdot \omega_{2}\right)}_{T_{2}} L_{e}\left(\mathbf{x}_{3}\right) \\
& \vdots
\end{aligned}
$$

## Path tracing recursion loop

GLSL spec: "Static and dynamic recursion is not allowed."

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L\left(\mathbf{x}_{0}, \omega_{0}\right) \approx L_{e}\left(\mathbf{x}_{1}\right)
$$

$$
\begin{aligned}
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& \vdots
\end{aligned}
$$

Add emission and update throughput weight $T_{j}$ in each iteration:

$$
\begin{array}{ll}
L_{j+1}=L_{j}+T_{j} L_{e}\left(\mathbf{x}_{j+1}\right), & L_{0}=0 \\
T_{j+1}=T_{j} a\left(\mathbf{x}_{j+1}\right) 2 \mathbf{n}\left(\mathbf{x}_{j+1}\right) \cdot \omega_{j+1}, & T_{0}=1
\end{array} \quad j=0, \ldots
$$

## Exercise 7: Path tracing

Complete get_ray_radiance()
Input: A ray $\mathbf{x}_{0}, \omega_{0}$
Output: $L\left(\mathbf{x}_{0}, \omega_{0}\right)$ (Monte Carlo estimate)
Use a for-loop with max_Path_Length iterations
Trace ray $\mathbf{x}_{j}, \omega_{j}$, break if it hits nothing Update the ray origin: $\mathbf{x}_{j+1}=\mathbf{x}_{j}+t_{j} \omega_{j}$ Add $T_{j} L_{e}\left(\mathbf{x}_{j+1}\right)$ to the radiance
Sample a direction $\omega_{j+1} \in \Omega\left(\mathbf{x}_{j+1}\right)$
Mul. throughput by $a\left(\mathbf{x}_{j+1}\right) 2 \mathbf{n}\left(\mathbf{x}_{j+1}\right) \cdot \omega_{j+1}$


Correct result SAMPLE_COUNT=1

## Exercise 7: Path tracing

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Mul. throughput by $a\left(\mathbf{x}_{j+1}\right) 2 \mathbf{n}\left(\mathbf{x}_{j+1}\right) \cdot \omega_{j+1}$

## Progressive rendering

Taking more samples is the outer-most loop:

```
out_color.rgb = vec3(0.0);
for (int i = 0; i != SAMPLE_COUNT; ++i)
    out_color.rgb += get_ray_radiance(camera_position, ray_direction, seed);
out_color.rgb /= float(SAMPLE_COUNT);
```

A large sample count hangs/crashes your browser
Instead, distribute work over frames
ShaderToy technicalities, not an exercise
Keep it running for better images

## Path tracing is

## General

Predictable
Scalable
Parallelizable
Extendable
Efficient

## Path tracing is

General $\quad 1$ framework for all light transport
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1 framework for all light transport
Physically correct image + noise

Across samples or pixels

## Path tracing is

General $\quad 1$ framework for all light transport
Predictable Physically correct image + noise
Scalable Sample count allows tradeoffs
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Across samples or pixels
To spectral/volumetric/differentiable rendering
Efficient

## Path tracing is

| General | 1 framework for all light transport |
| :--- | :--- |
| Predictable | Physically correct image + noise |
| Scalable | Sample count allows tradeoffs |
| Parallelizable | Across samples or pixels |
| Extendable | To spectral/volumetric/differentiable rendering |
| Efficient | When effort is focused on important work |

## Path tracing is

General

1 framework for all light transport

Scalable Sample count allows tradeoffs
Parallelizable
Extendable
Efficient

Predictable Physically correct image + noise

Across samples or pixels
To spectral/volumetric/differentiable rendering
When effort is focused on important work

The default in offline rendering, the future in real-time rendering

## Faster path tracers

Acceleration structures and traversal
Stratification: Quasi-random numbers that improve convergence Importance sampling:

Light sampling, a.k.a. next event estimation
(Specular) BRDF importance sampling
Path guiding
Multiple importance sampling
Spatiotemporal (neural) denoising

## Faster path tracers

## Acceleration structures and traversal

Stratification: Quasi-random numbers that improve convergence Importance sampling:

Light sampling, a.k.a. next event estimation
(Specular) BRDF importance sampling
Part 3?
Path guiding
Multiple importance sampling
Spatiotemporal (neural) denoising

Thanks!

## Backup

## The rendering equation

$L_{o}(\mathbf{x})=L_{e}(\mathbf{x})+\frac{a(\mathbf{x})}{\pi} \int_{\Omega(\mathbf{x})} L(\mathbf{x}, \omega) \mathbf{n}(\mathbf{x}) \cdot \omega \mathrm{d} \omega$
$\mathbf{n}(\mathbf{x})$ is the normal vector at $\mathbf{x}$
$a(\mathbf{x})$ is the albedo at $\mathbf{x}$
$L(\mathbf{x}, \omega)$ is incoming radiance at $\mathbf{x}$ from $\omega$
$L_{o}(\mathbf{x})$ is the outgoing radiance at $\mathbf{x}$
$L_{e}(\mathbf{x})$ is emitted radiance at $\mathbf{x}$

