# State of the Art in Photon Density Estimation:

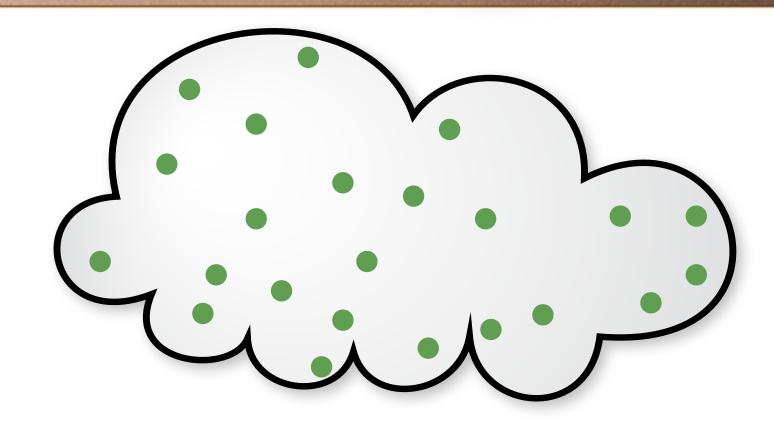
From Photons to Beams

Wojciech Jarosz

THURSDAY, 9 AUGUST 2:00 PM - 5:15 PM | Room 408B

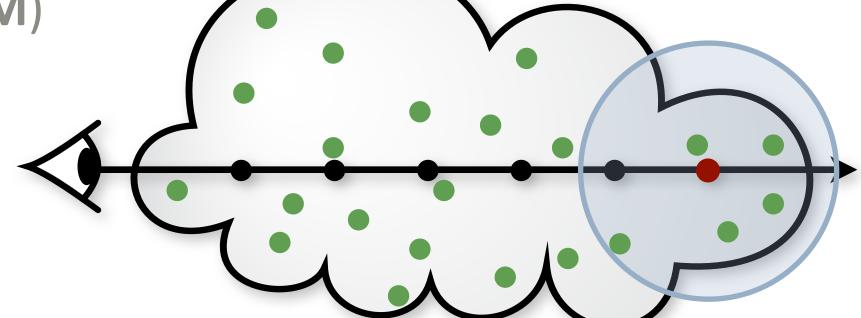


Volumetric Photon Mapping (VPM)
 [Jensen & Christensen 98]



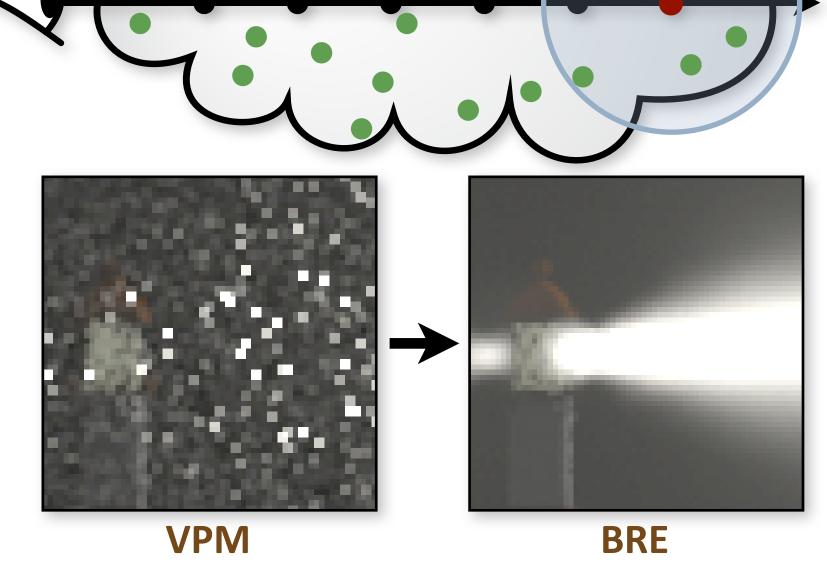


Volumetric Photon Mapping (VPM)
 [Jensen & Christensen 98]



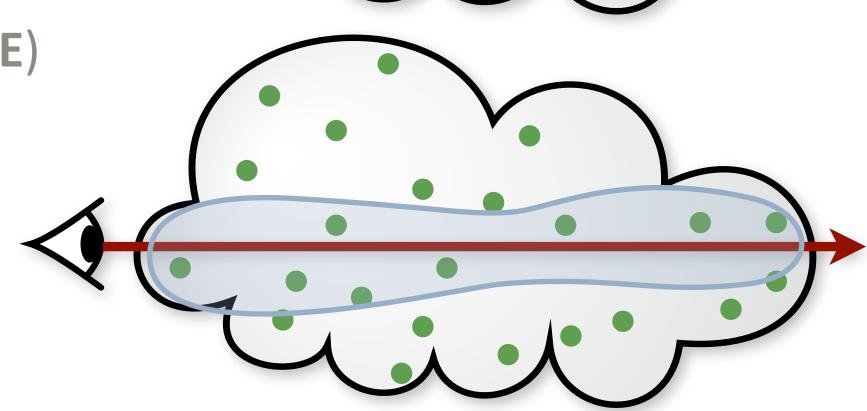


Volumetric Photon Mapping (VPM)
 [Jensen & Christensen 98]



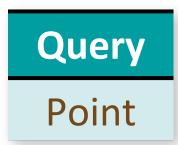


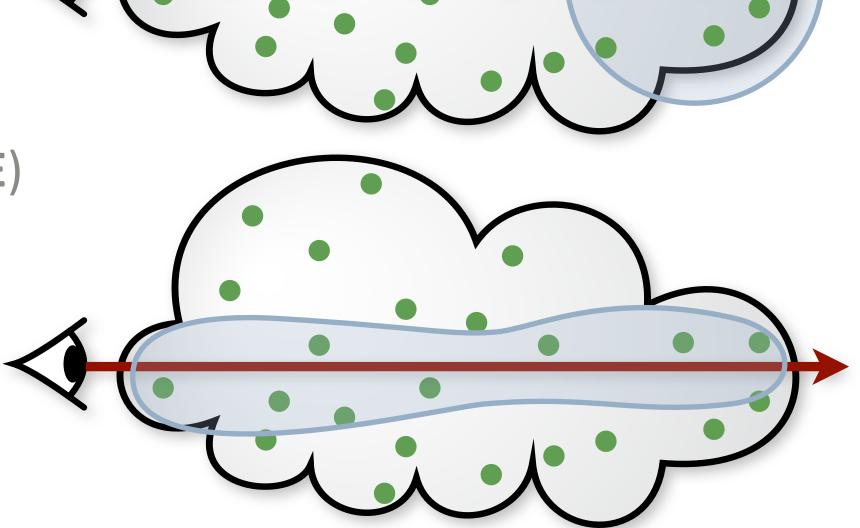
Volumetric Photon Mapping (VPM)
 [Jensen & Christensen 98]





Volumetric Photon Mapping (VPM)
 [Jensen & Christensen 98]

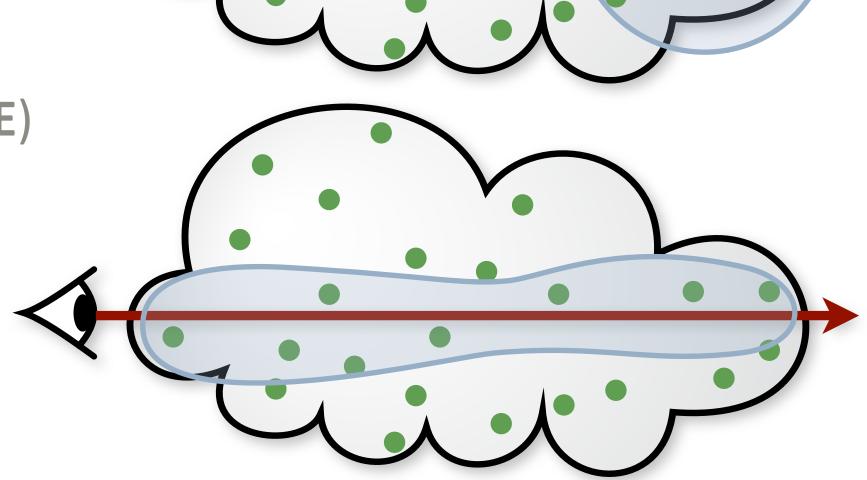






Volumetric Photon Mapping (VPM)
 [Jensen & Christensen 98]

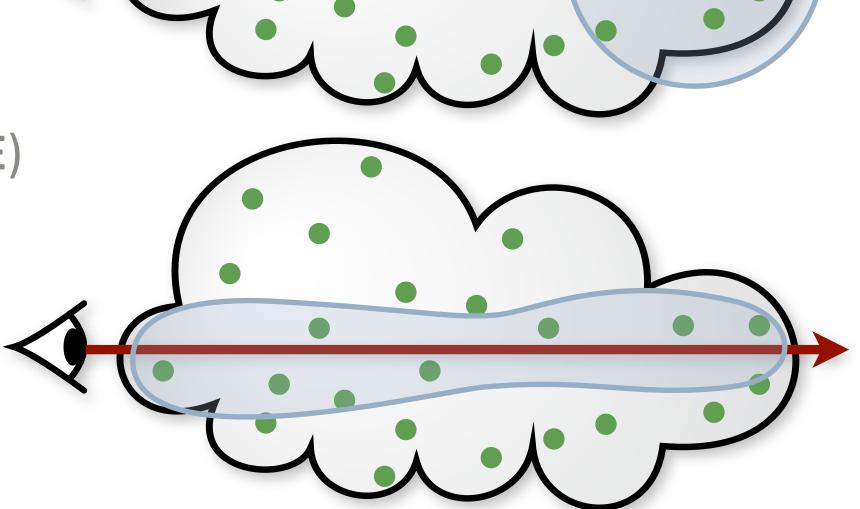
Query	X	Data
Point	X	Point





Volumetric Photon Mapping (VPM)
 [Jensen & Christensen 98]

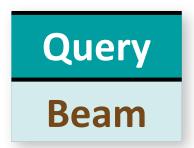
Query	X	Data	Blur
Point	X	Point	(3D)

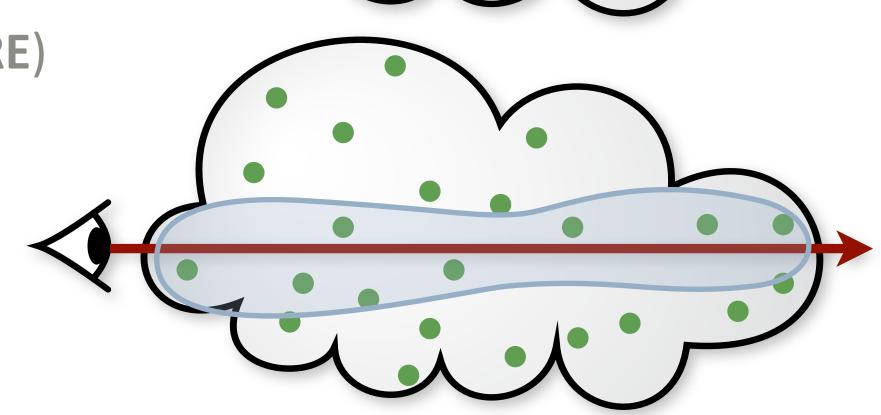




Volumetric Photon Mapping (VPM)
 [Jensen & Christensen 98]

Query	X	Data	Blur
Point	X	Point	(3D)



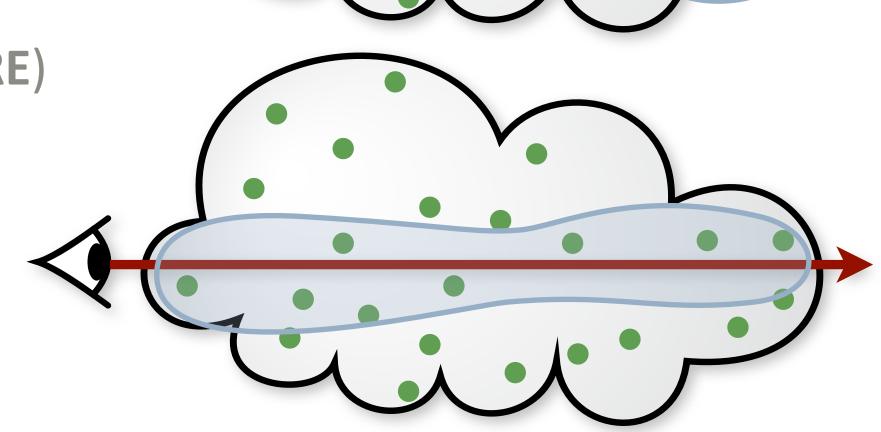




Volumetric Photon Mapping (VPM)
 [Jensen & Christensen 98]

Query	X	Data	Blur
Point	X	Point	(3D)

Query	X	Data
Beam	X	Point

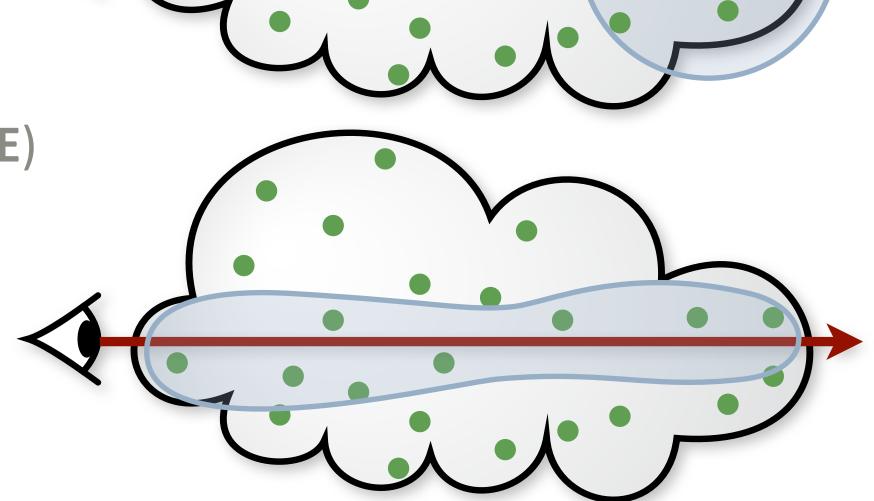




Volumetric Photon Mapping (VPM)
 [Jensen & Christensen 98]

Query	X	Data	Blur
Point	X	Point	(3D)

Query	X	Data	Blur
Beam	X	Point	(2D)





Volumetric Photon Mapping (VPM)
 Beyond Photon Points:
 [Jensen & Christensen 98]

Query	X	Data	Blur
Point	X	Point	(3D)

Query	X	Data	Blur
Beam	X	Point	(2D)



Volumetric Photon Mapping (VPM)
 [Jensen & Christensen 98]

Query	X	Data	Blur
Point	X	Point	(3D)

Beyond Photon Points:

Query
Point/Beam

Query	X	Data	Blur
Beam	X	Point	(2D)



Volumetric Photon Mapping (VPM)

 Beyond Photon Points: [Jensen & Christensen 98]

Query	X	Data	Blur
Point	X	Point	(3D)

Query	Data
Point/Beam	Point/Beam

Query	X	Data	Blur
Beam	X	Point	(2D)



Beyond Photon Points:

Data

Query

Blur

 Volumetric Photon Mapping (VPM) [Jensen & Christensen 98]

Query	X	Data	Blur
Point	X	Point	(3D)

Point/Beam Point/Beam 1D/2D/3D

Query	X	Data	Blur
Beam	X	Point	(2D)



# **Density Estimator Options**

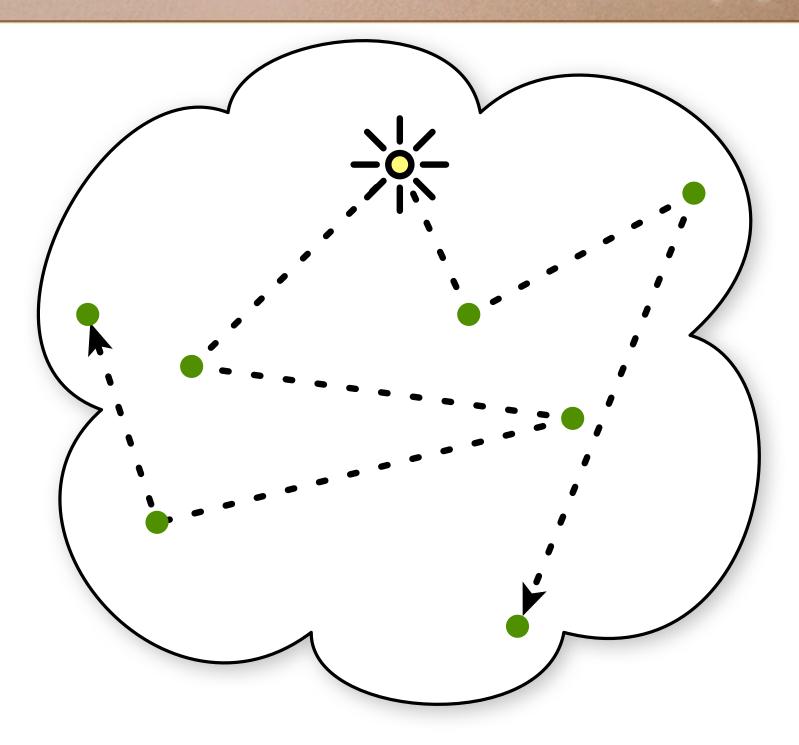
Query	X	Data	Blur
Point	X	Point	(3D)
Beam	X	Point	(2D)



# **Density Estimator Options**

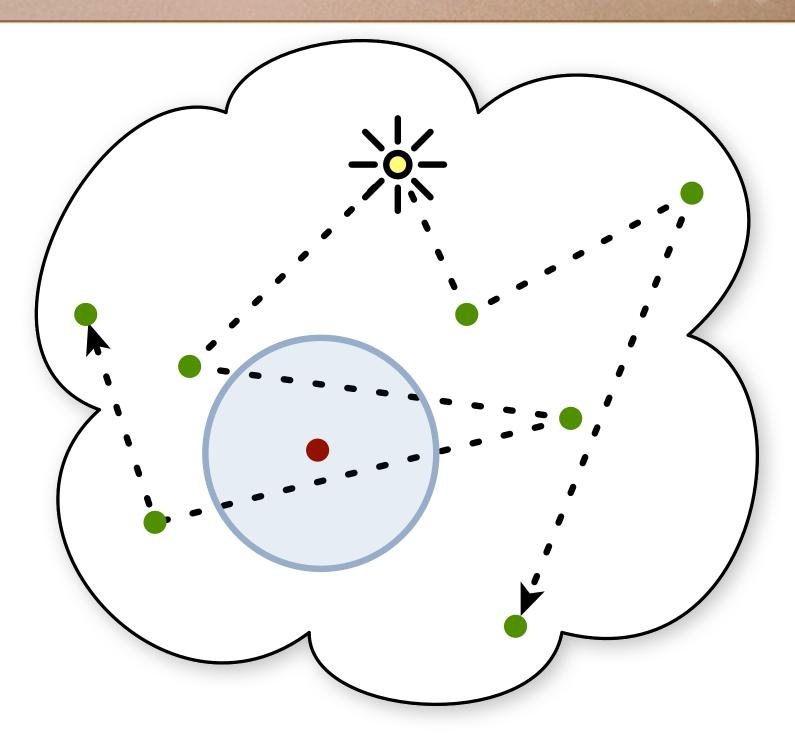
Query	X	Data	Blur
Point	X	Point	(3D)
Beam	X	Point	(2D)
Beam	X	Point	(3D)
Point	X	Beam	(3D)
Point	X	Beam	(2D)
Beam	X	Beam	(3D)
Beam	X	Beam	(2D) <sub>1</sub>
Beam	X	Beam	(2D) <sub>2</sub>
Beam	X	Beam	(1D)





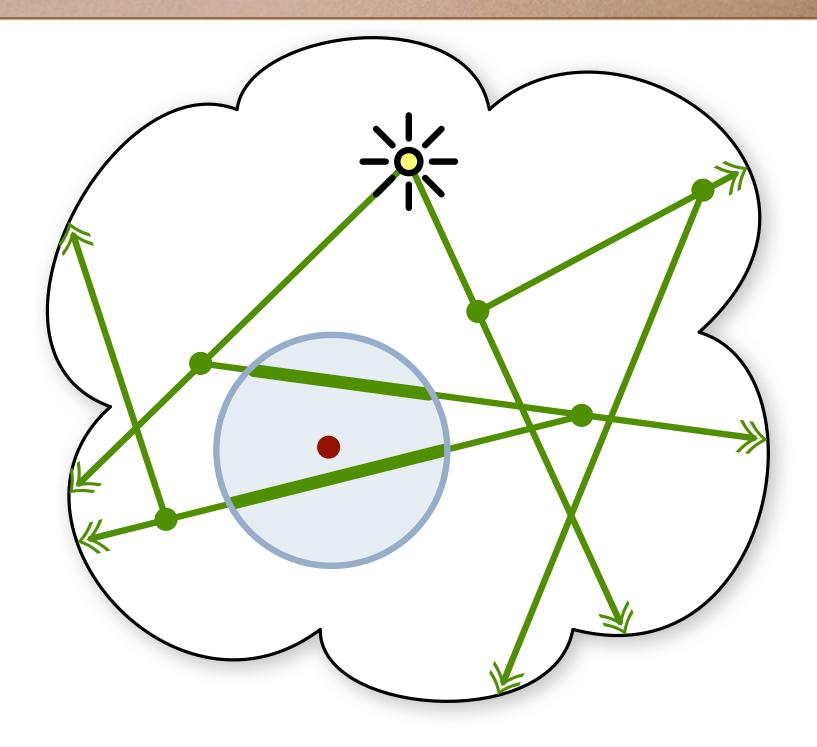
**Photon Points** 



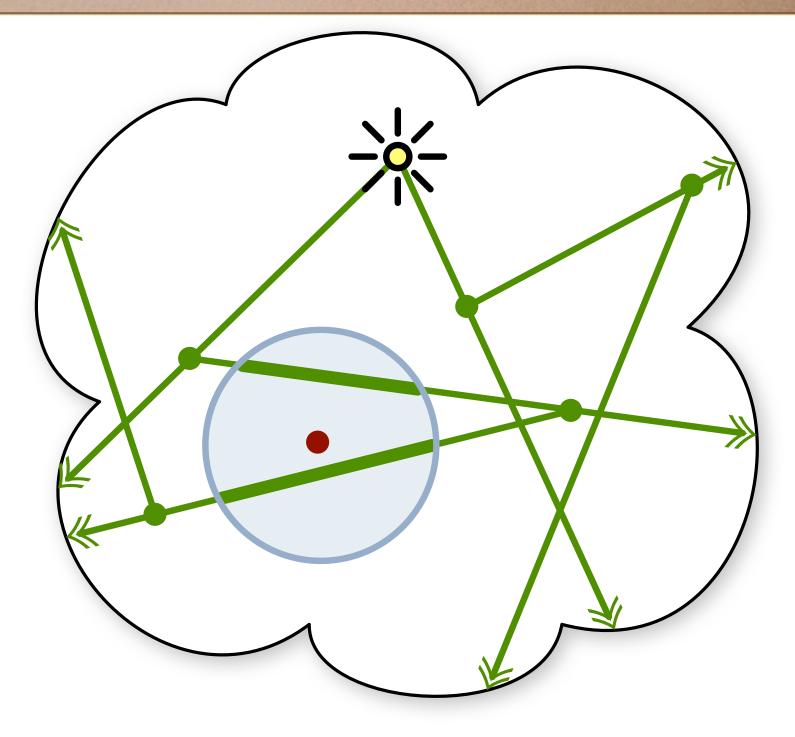


**Photon Points** 







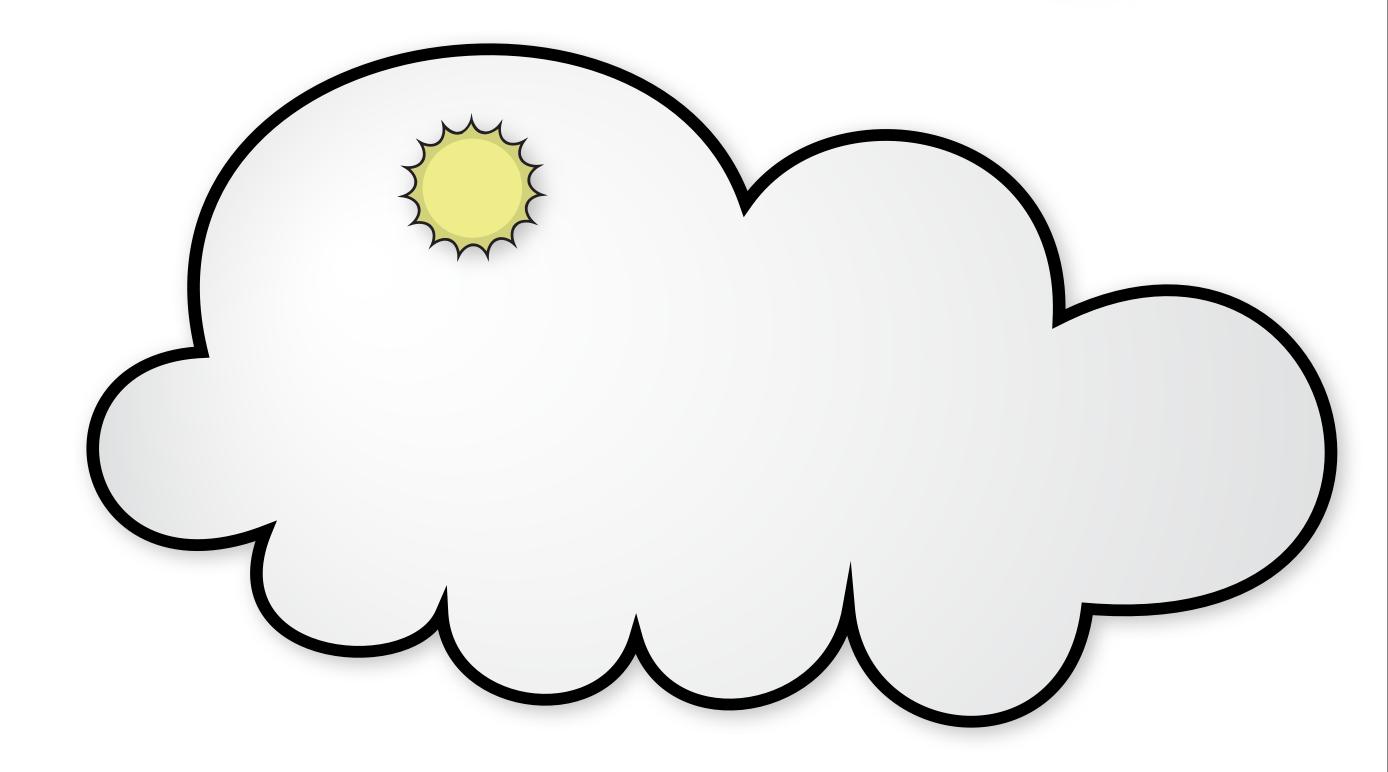


**Photon Beams** 

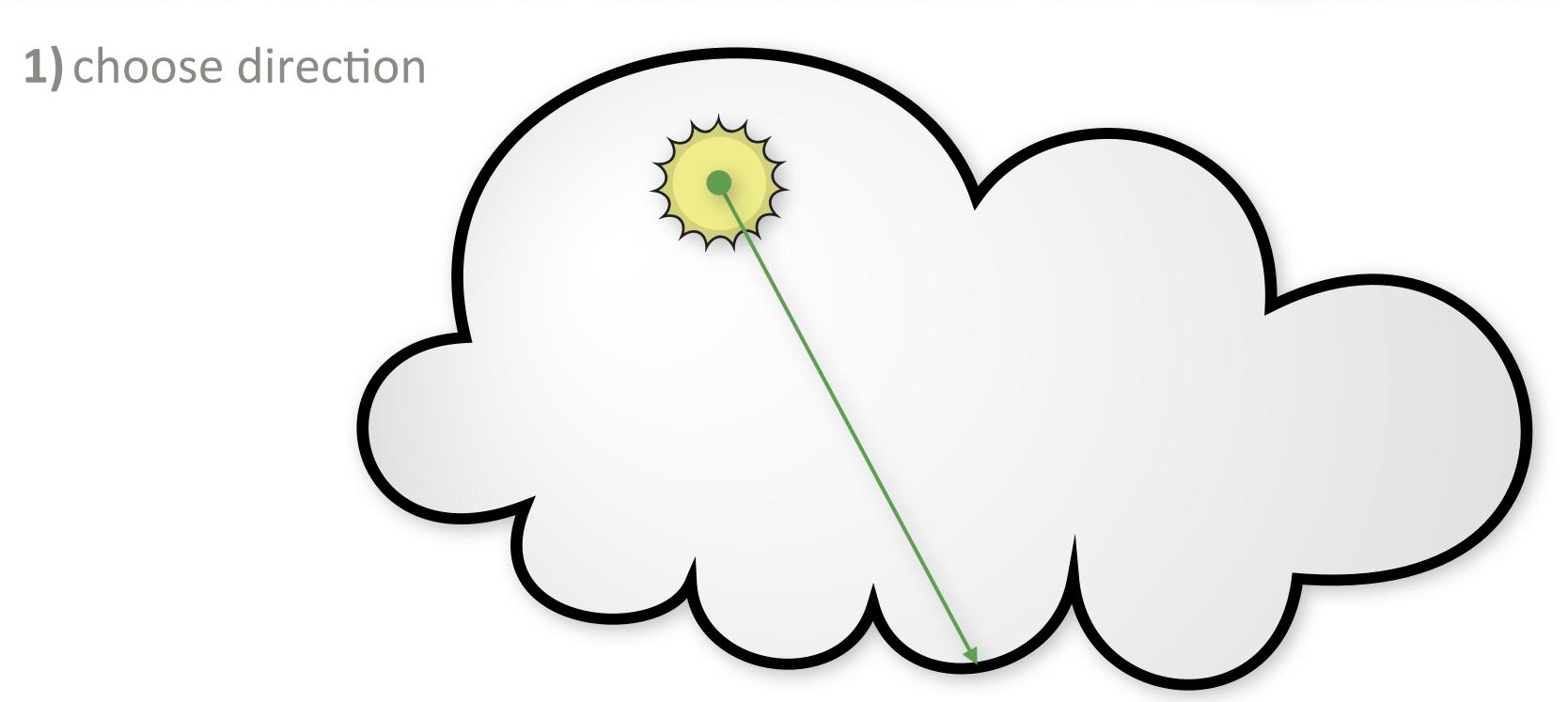


## **Photon Beams**

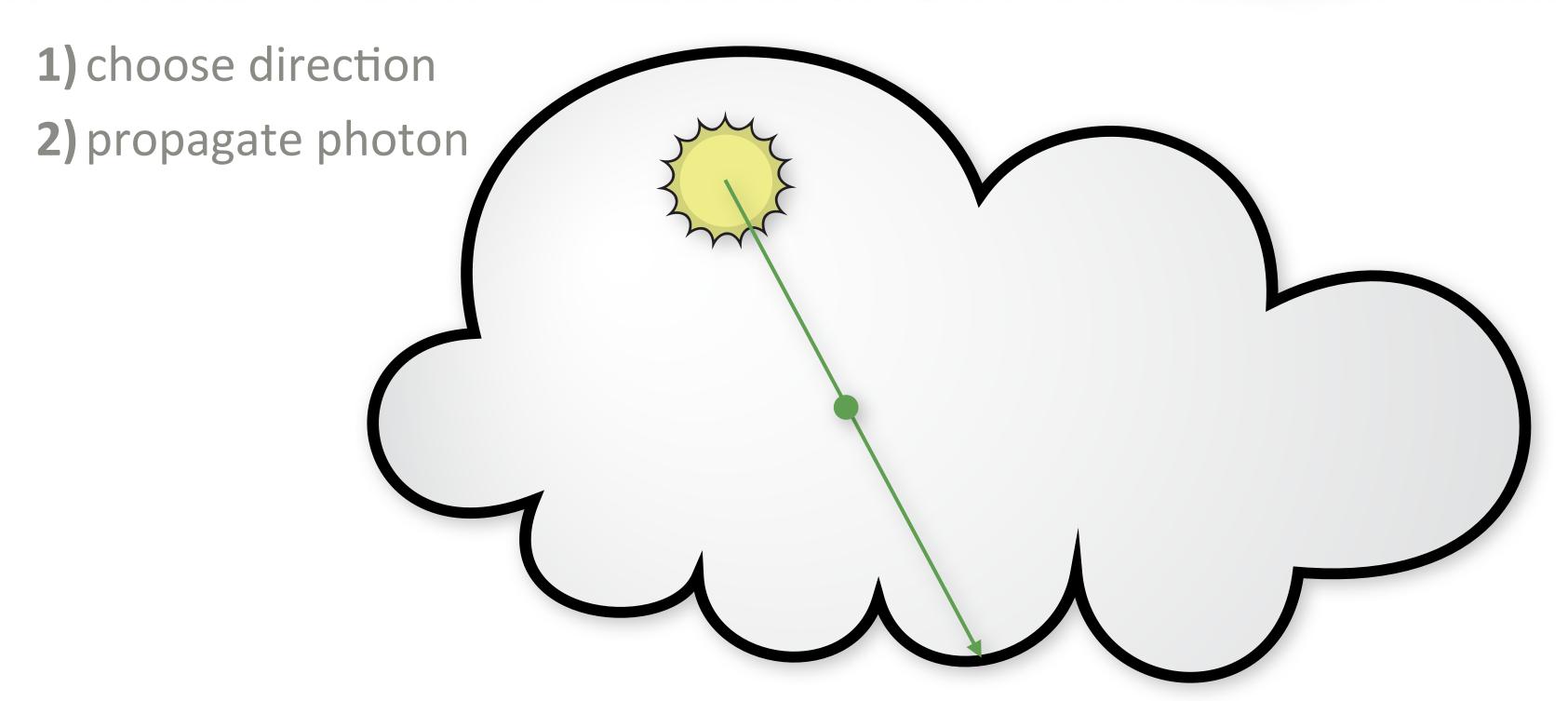




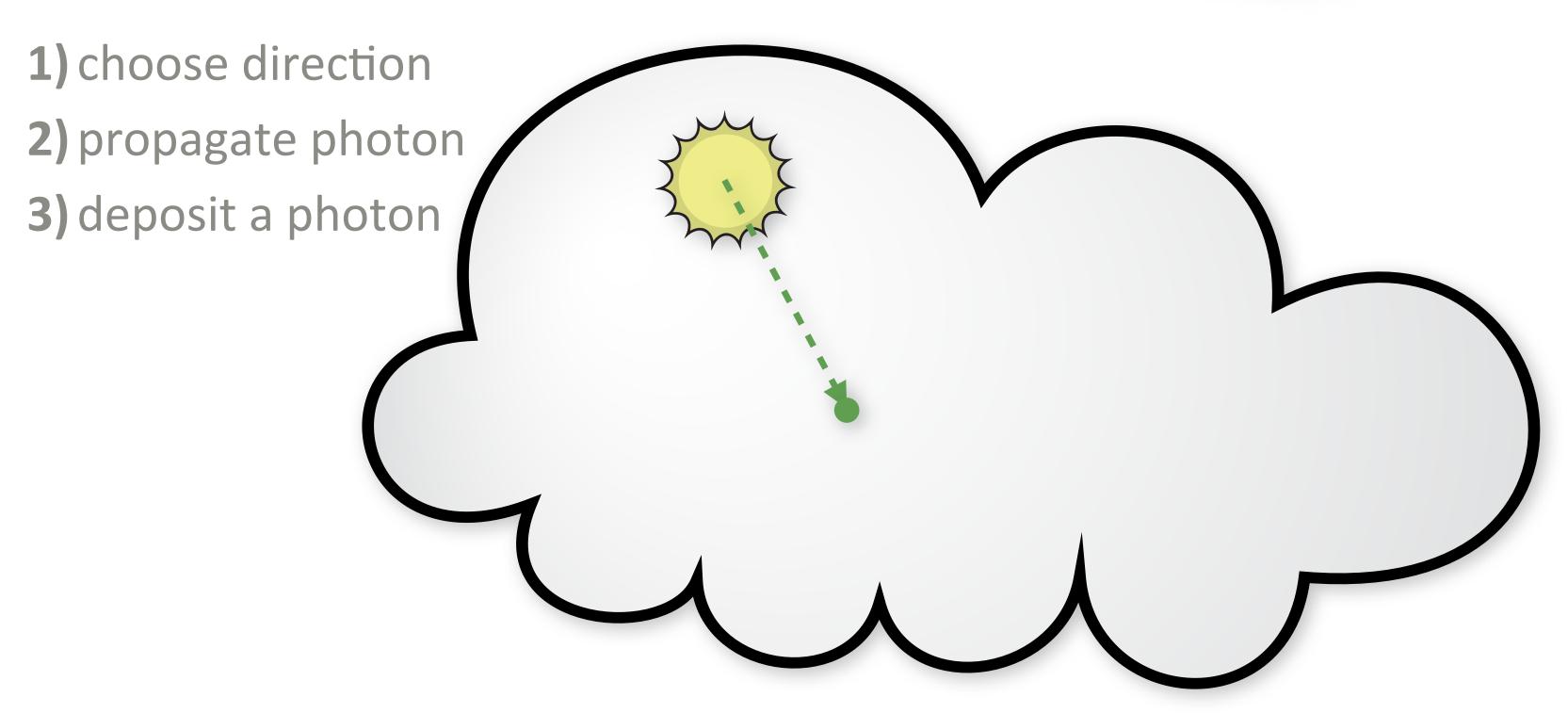








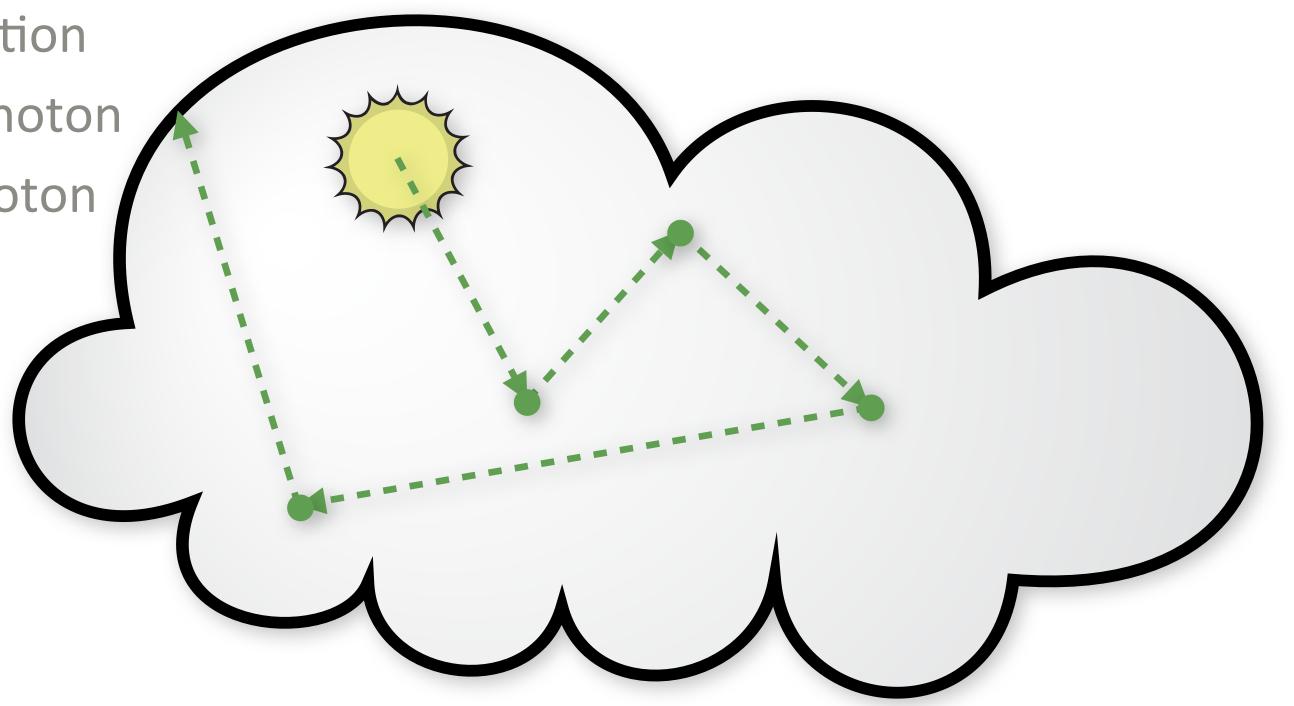






choose direction
 propagate photon
 deposit a photon

4) repeat



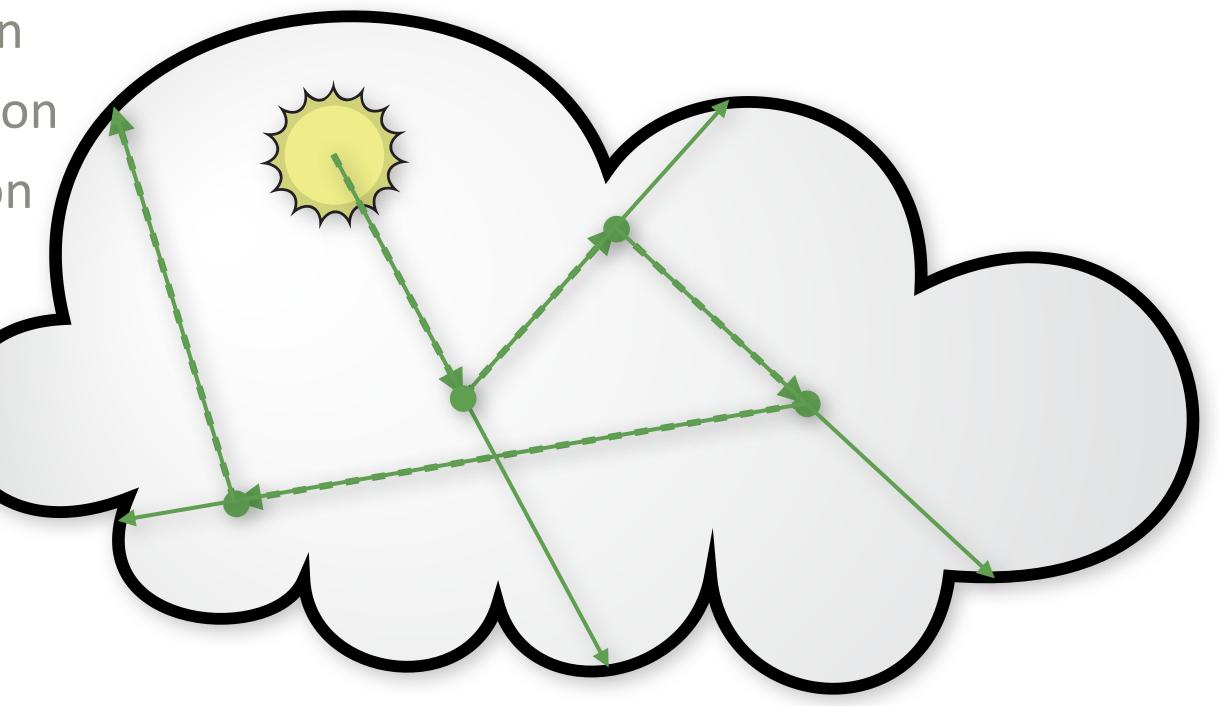


1) choose direction

2) propagate photon

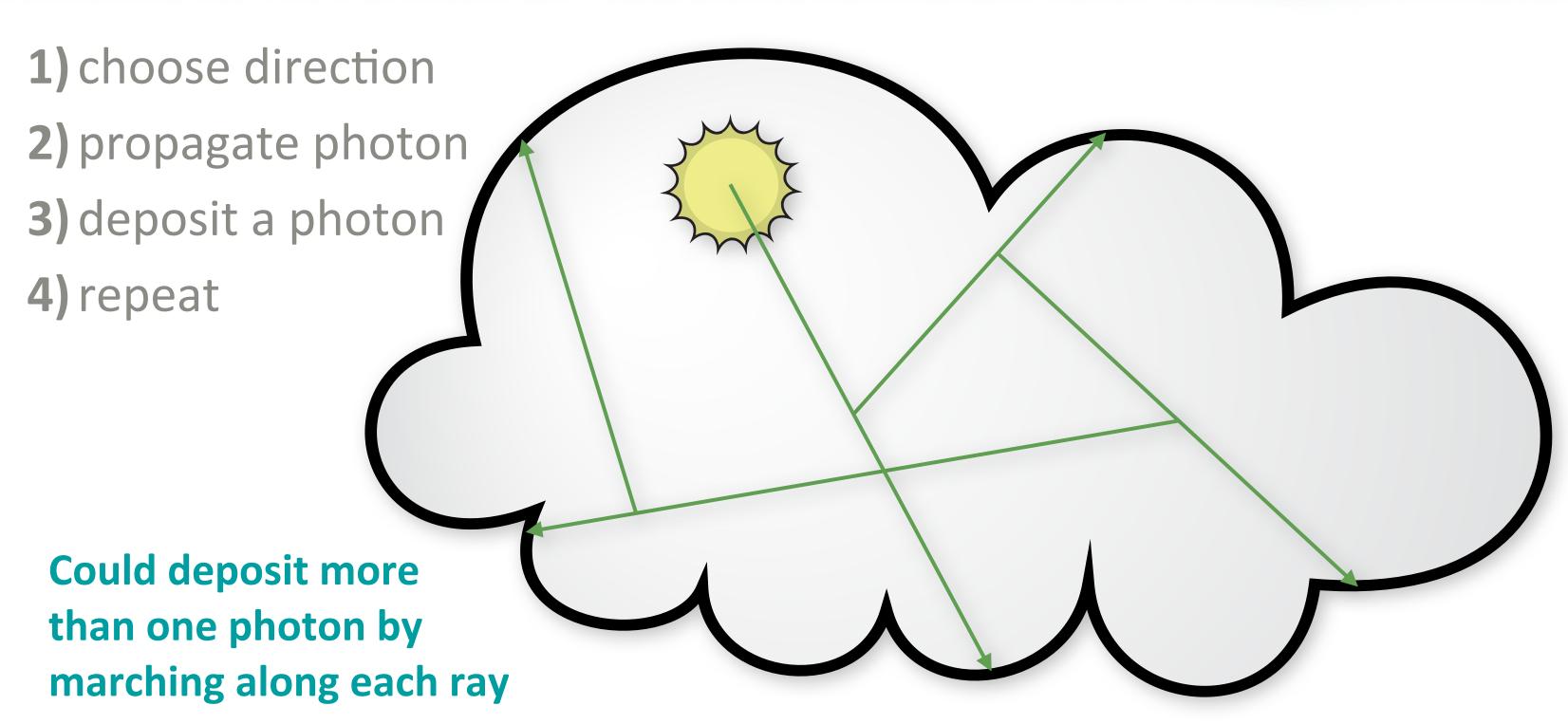
3) deposit a photon

4) repeat





## "Photon Marching"

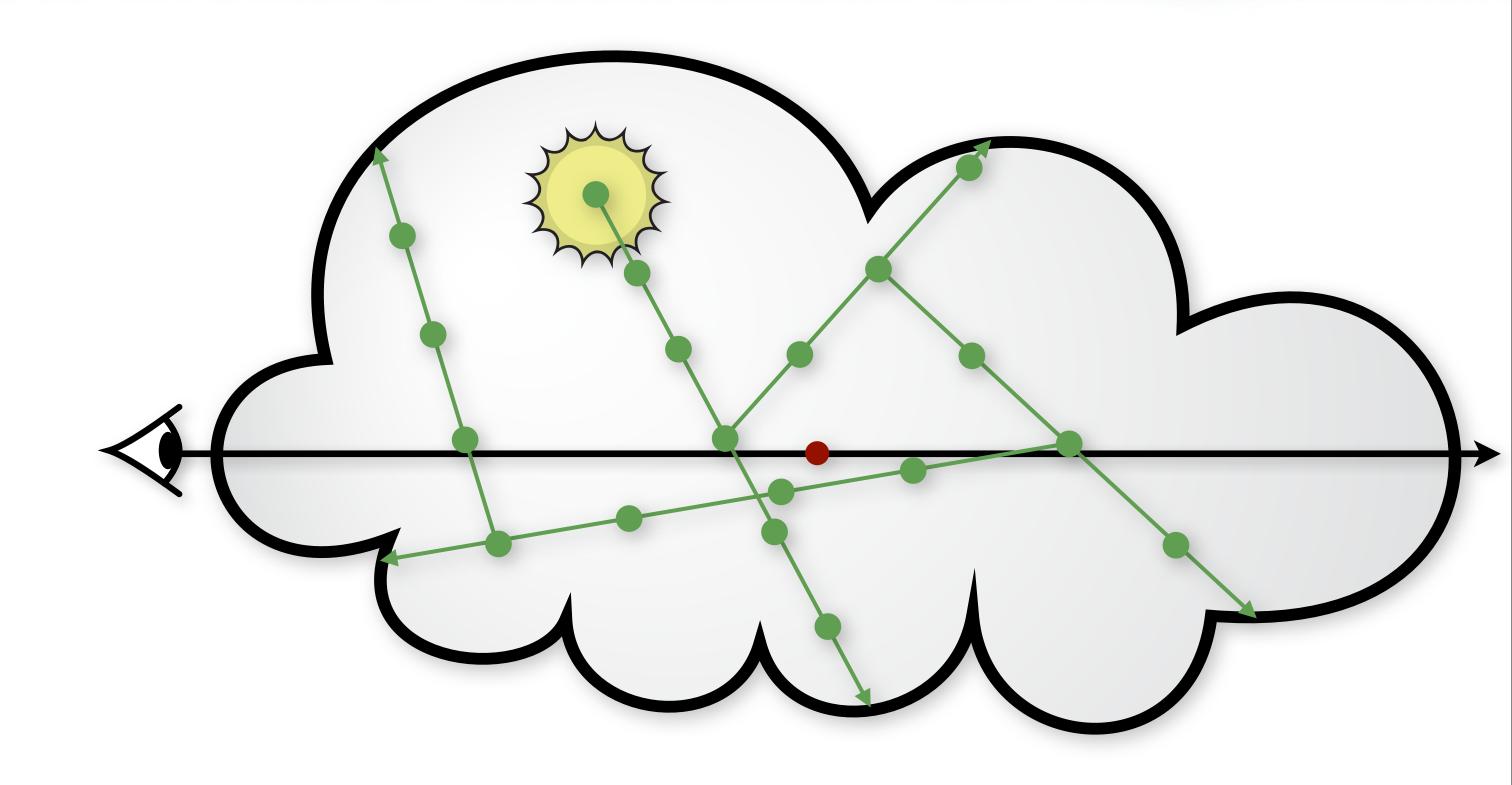




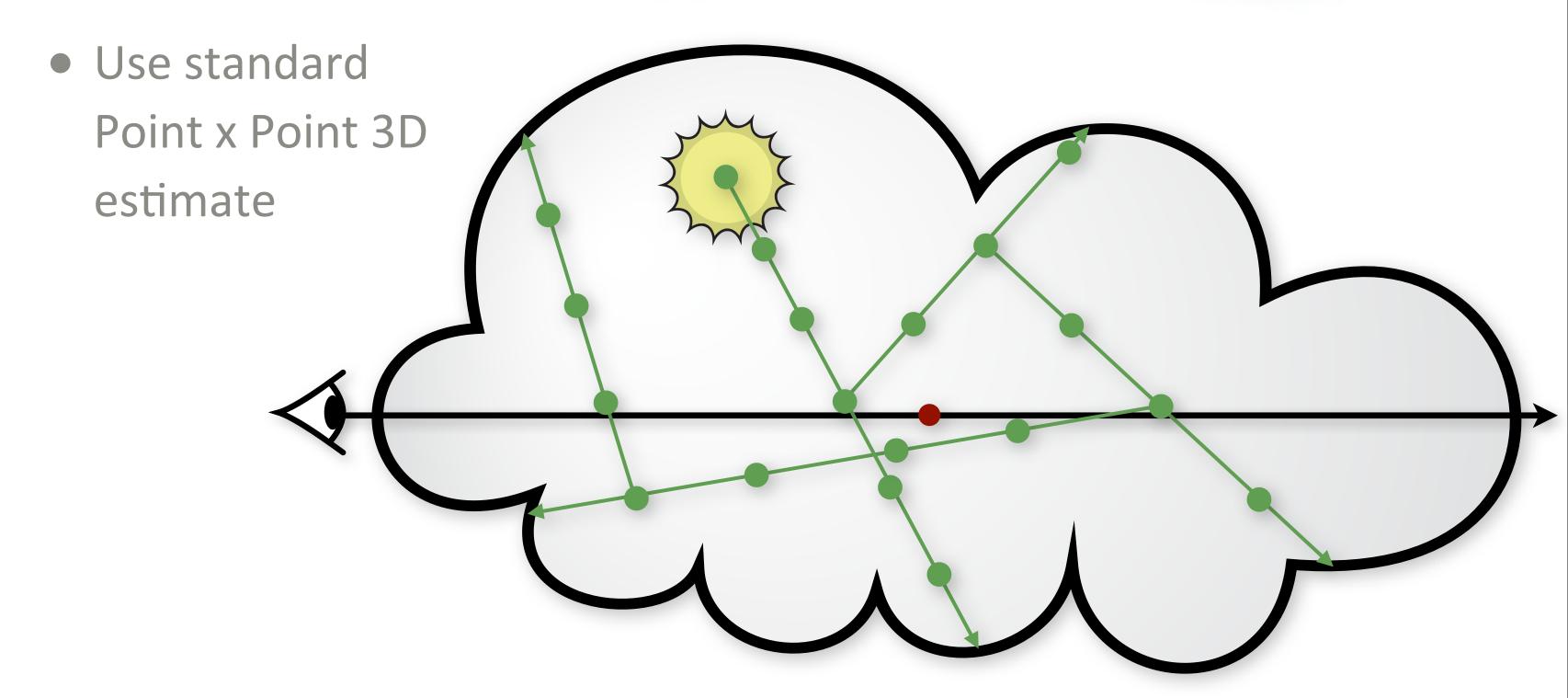
## "Photon Marching"

1) choose direction 2) propagate photon 3) deposit a photon 4) repeat **Could deposit more** than one photon by marching along each ray

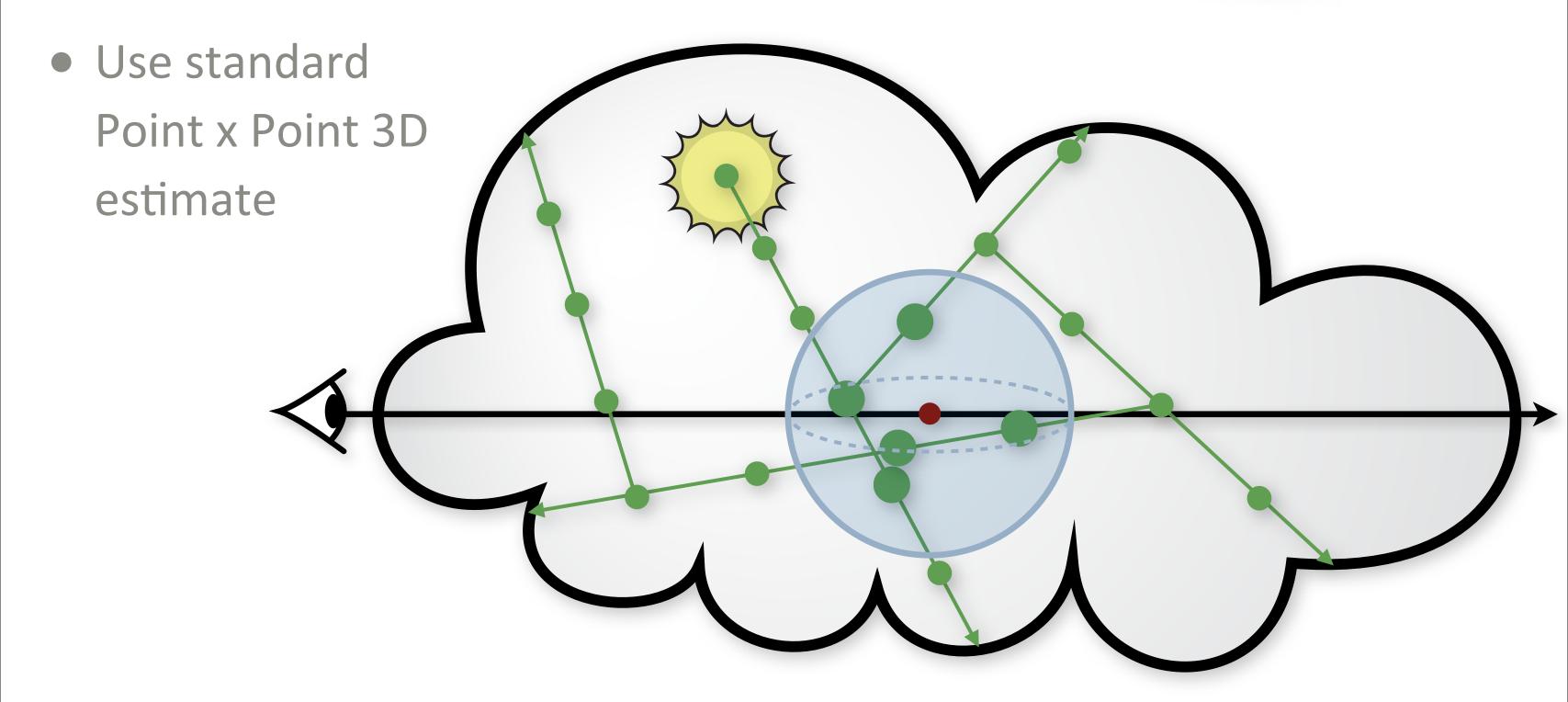




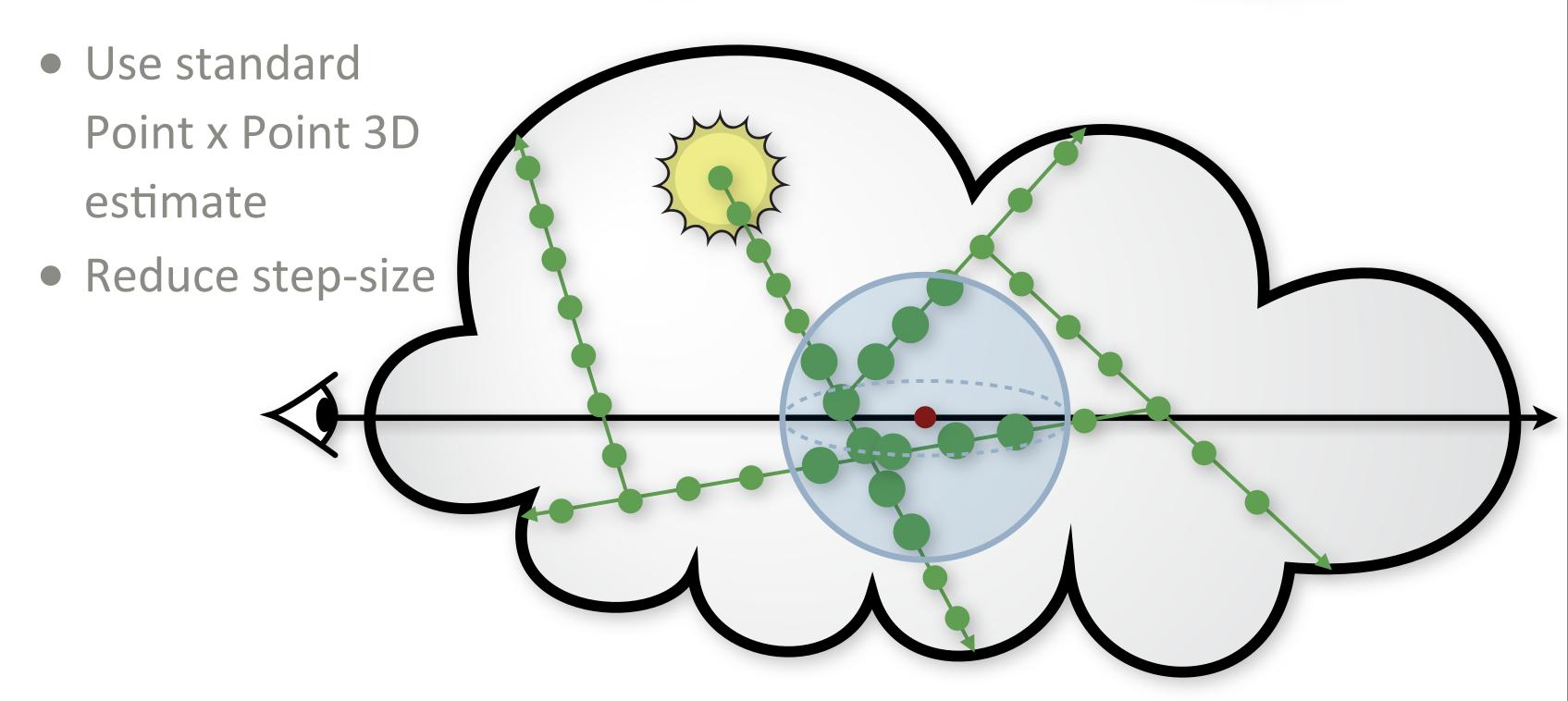




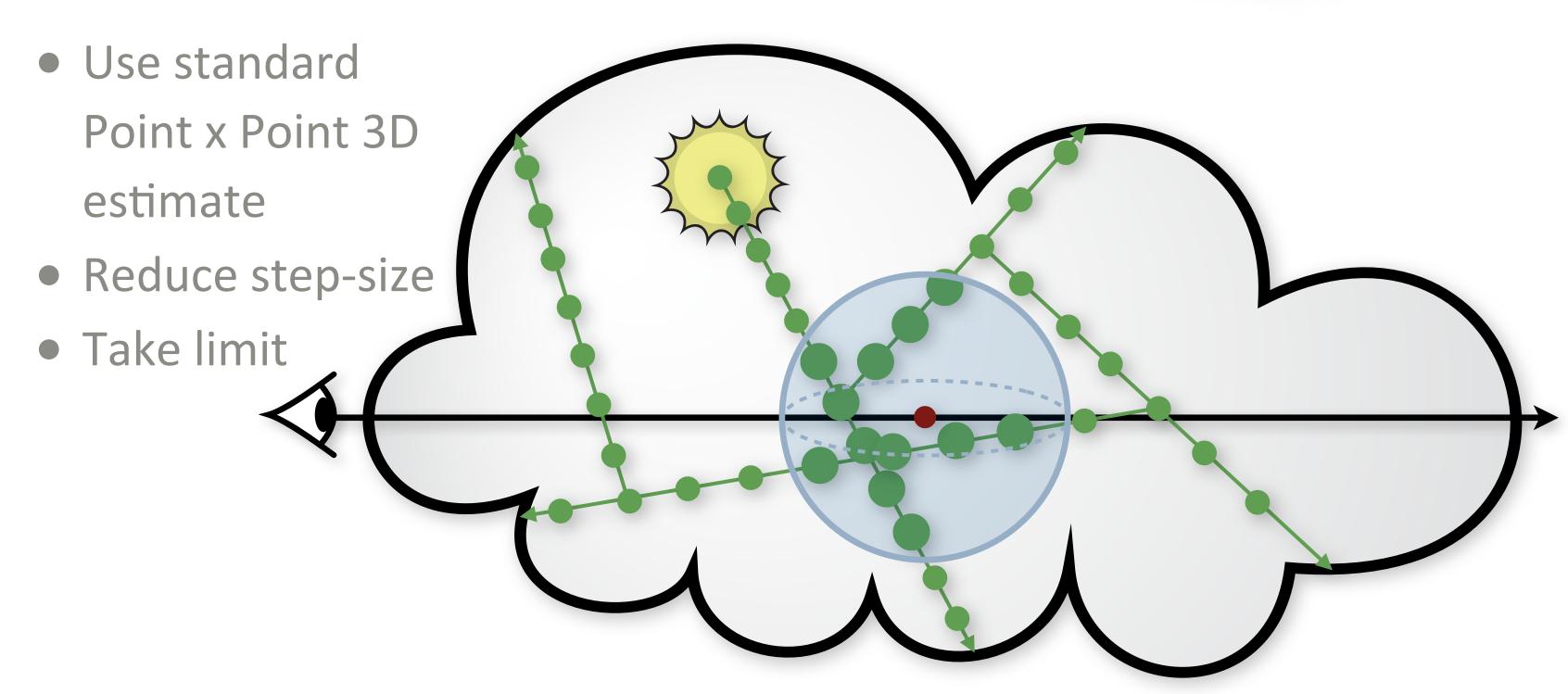




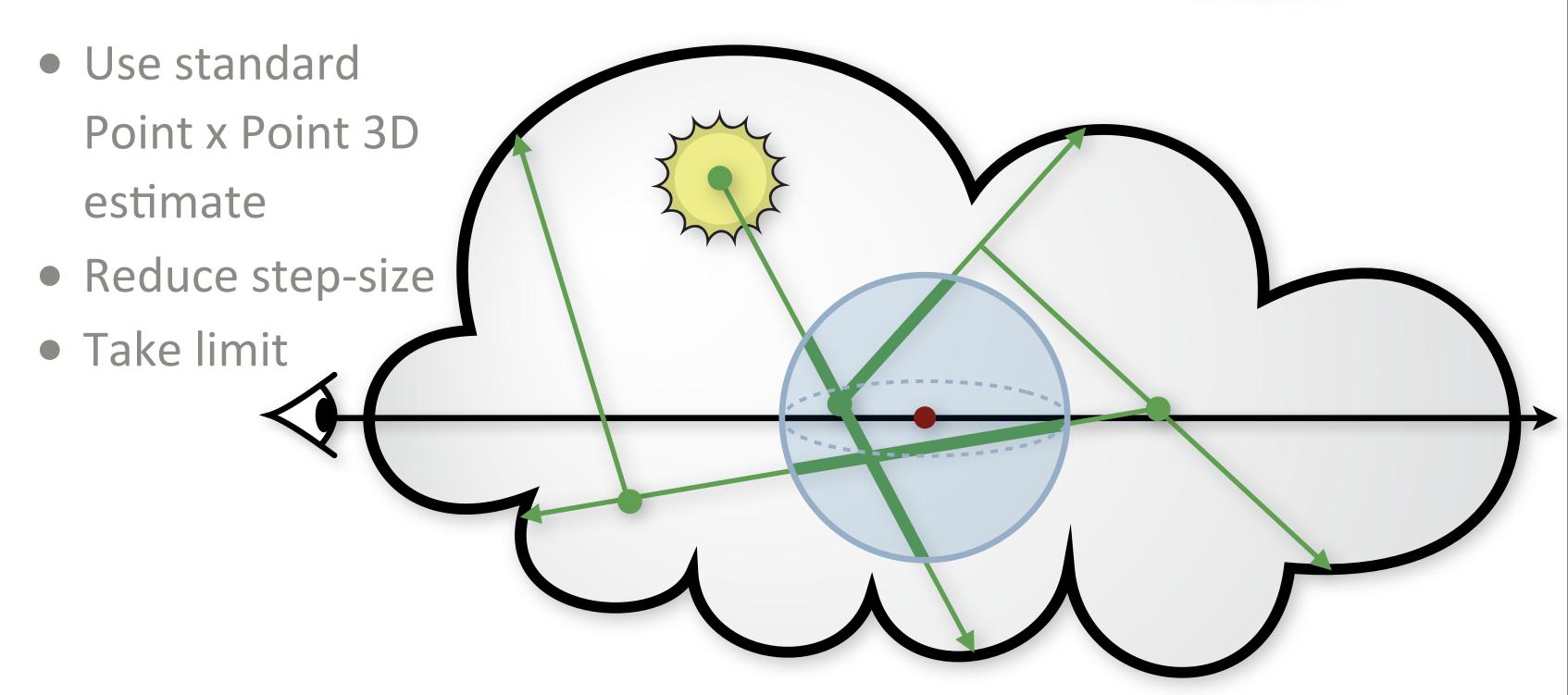




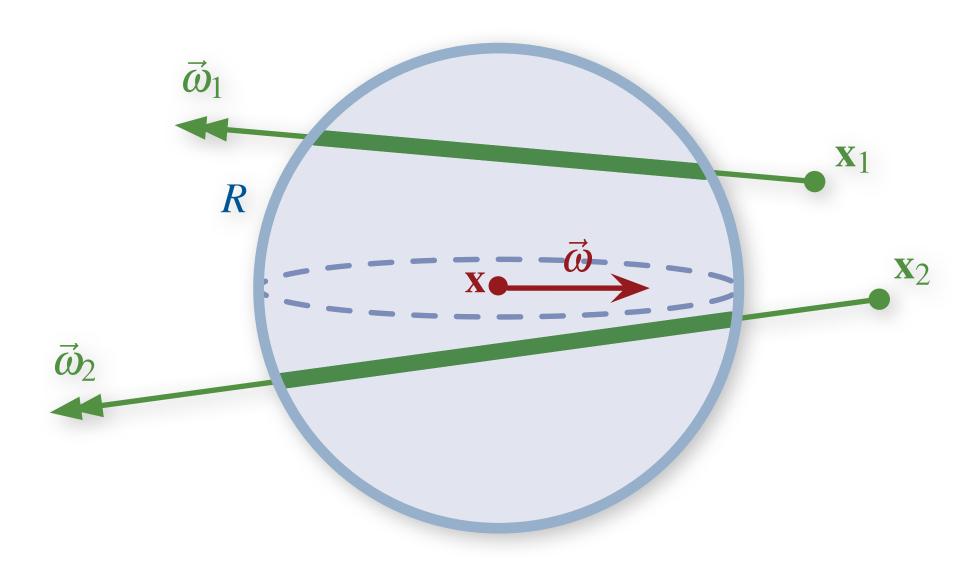






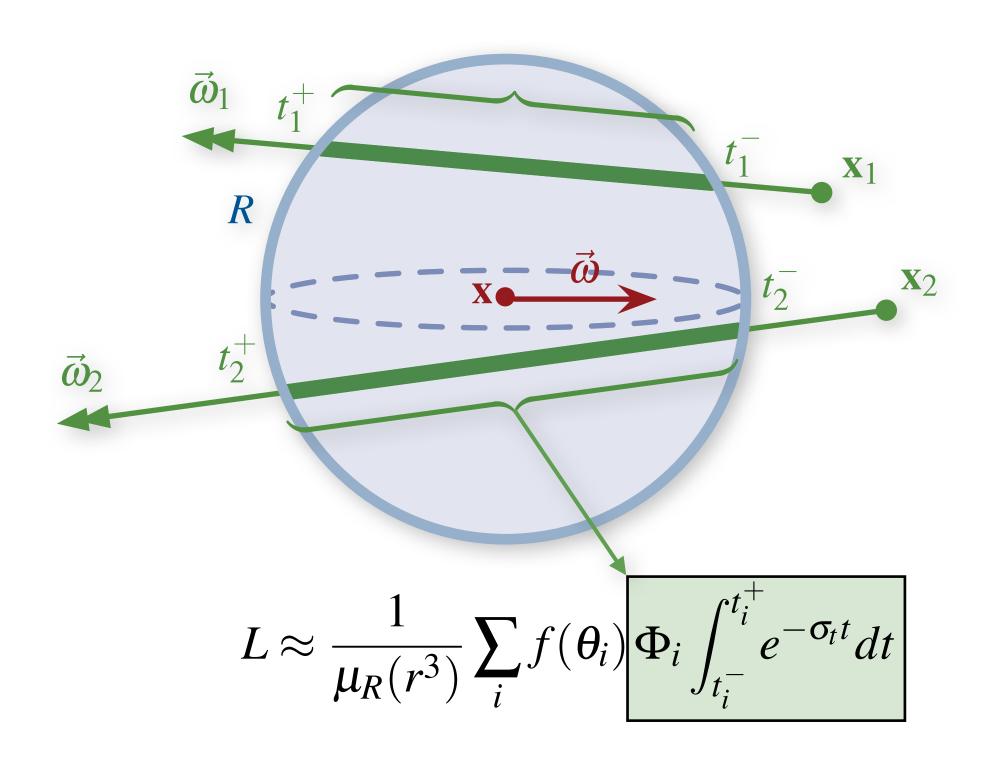




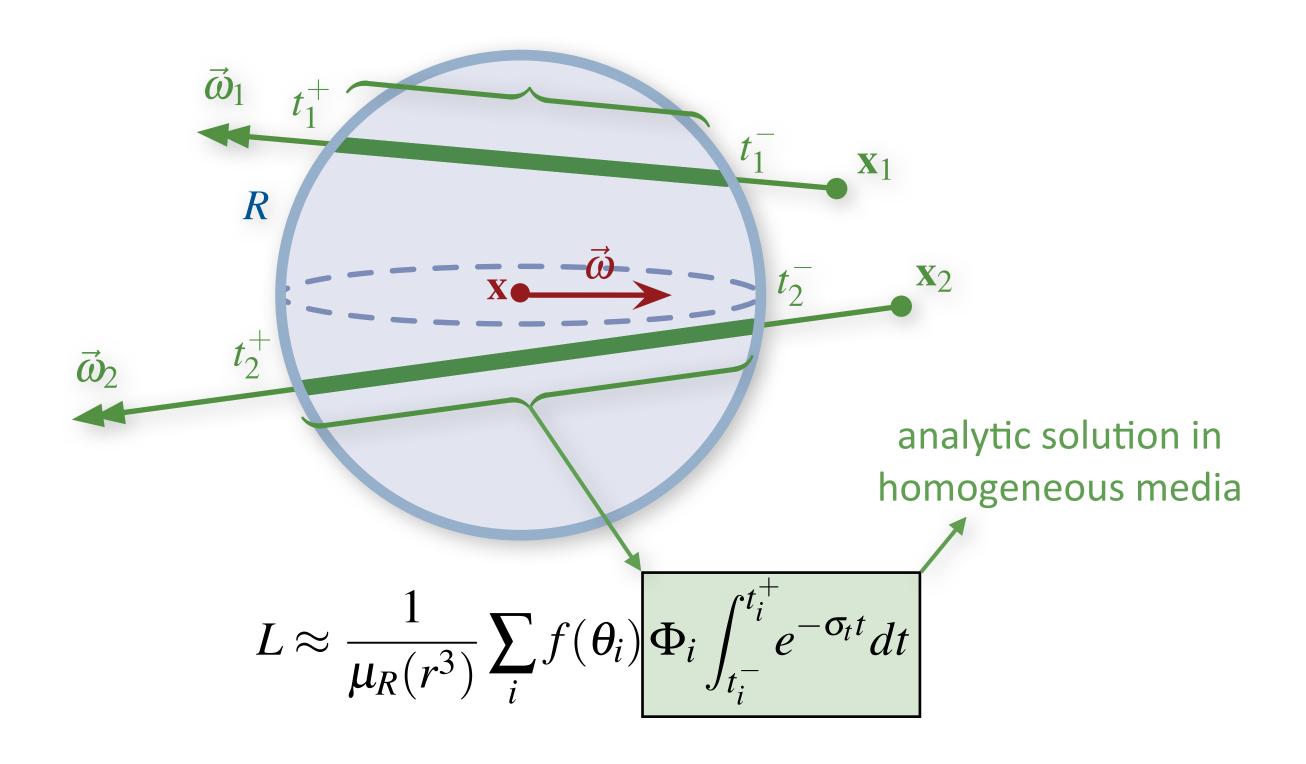


$$L \approx \frac{1}{\mu_R(r^3)} \sum_i f(\theta_i) \Phi_i \int_{t_i^-}^{t_i^+} e^{-\sigma_t t} dt$$

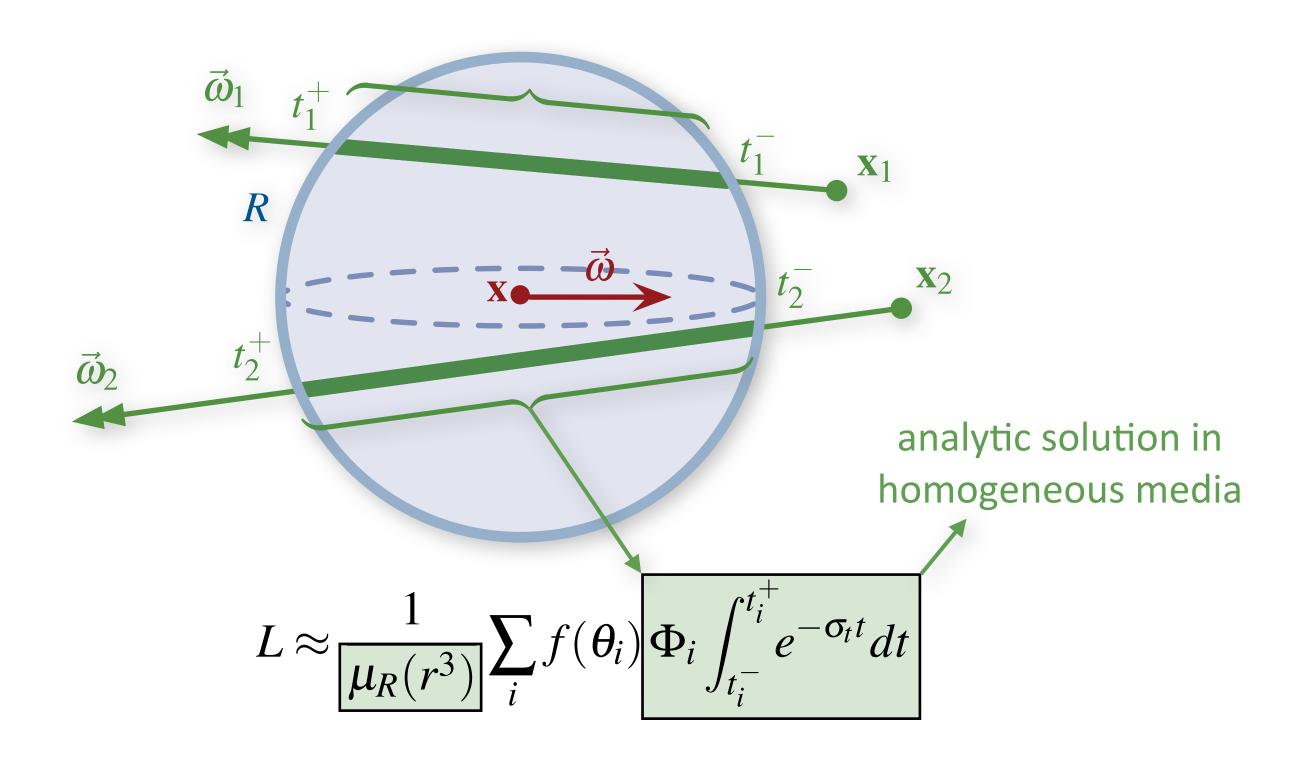




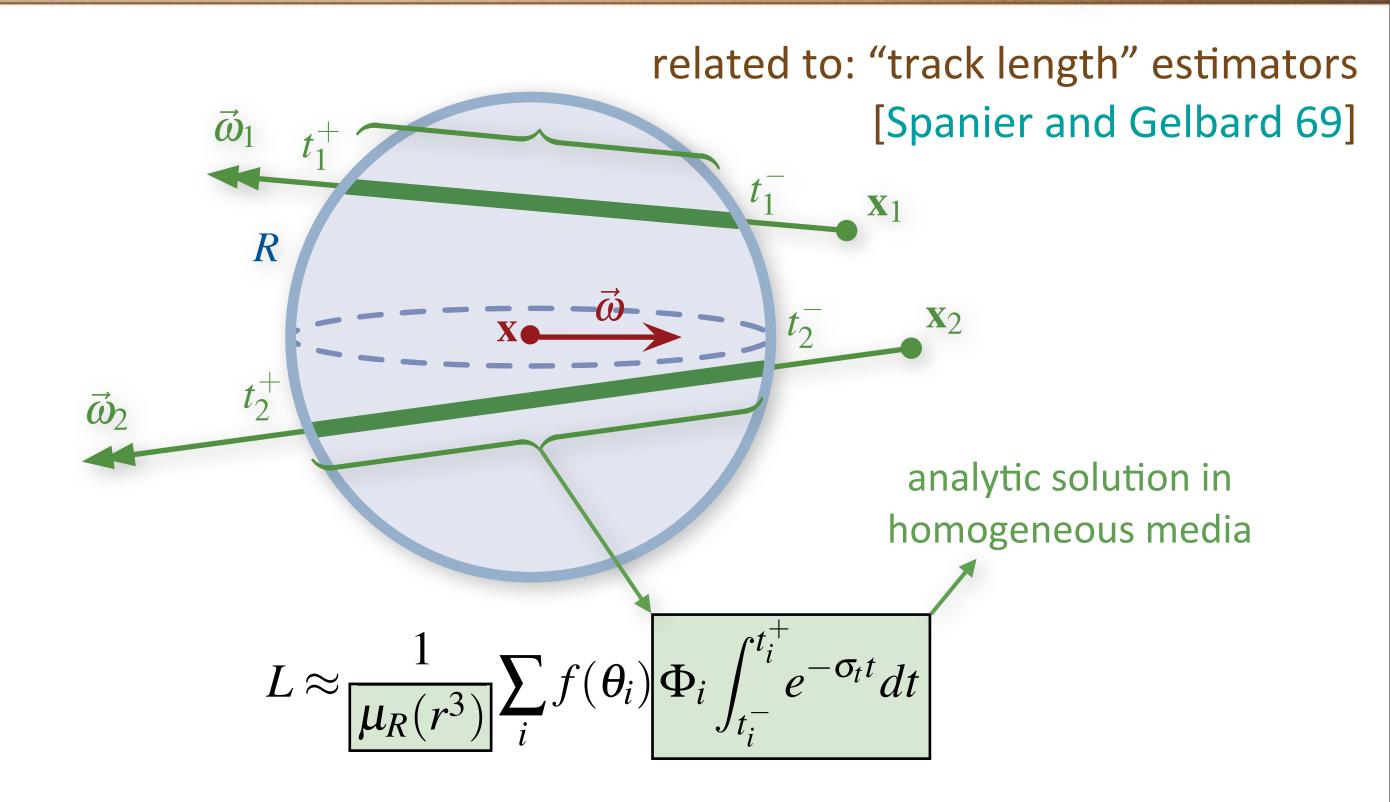




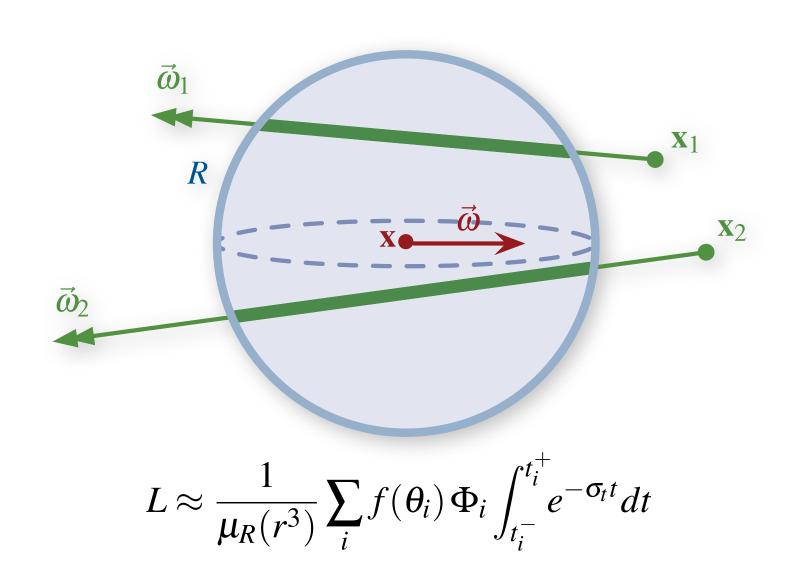




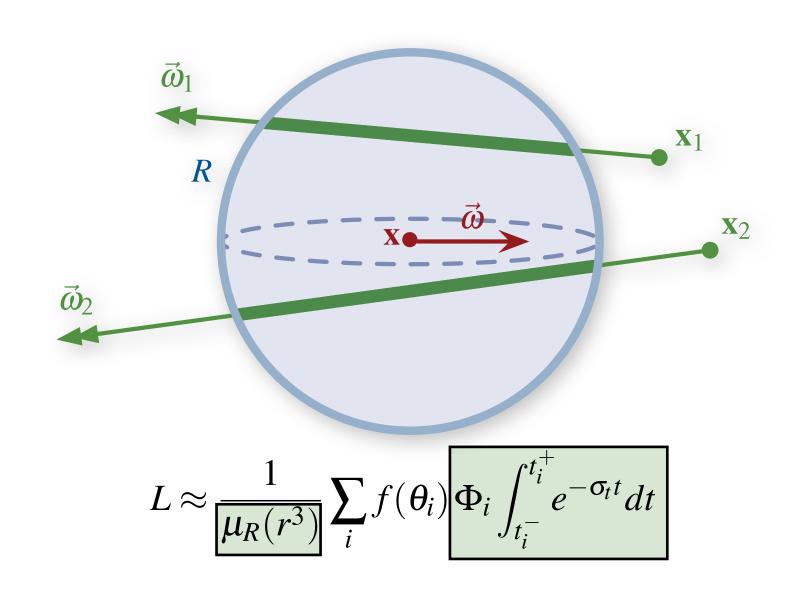




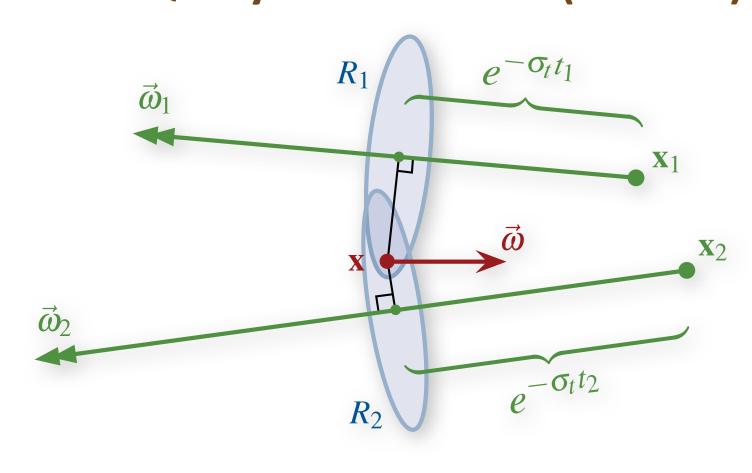






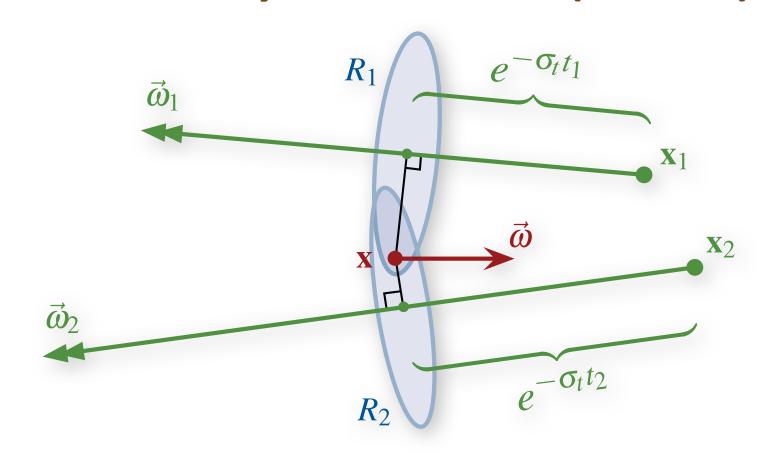






$$L \approx \frac{1}{\mu_R(r^2)} \sum_i f(\theta_i) \Phi_i e^{-\sigma_t t_i}$$





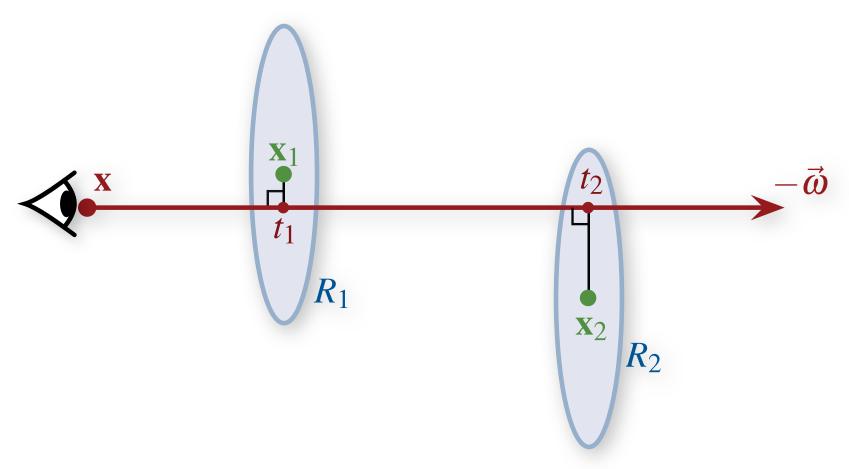
$$L pprox rac{1}{\mu_R(r^2)} \sum_i f(\theta_i) \Phi_i e^{-\sigma_t t_i}$$



#### Radiometric Duality

#### Beam Query x Point Data (2D blur)

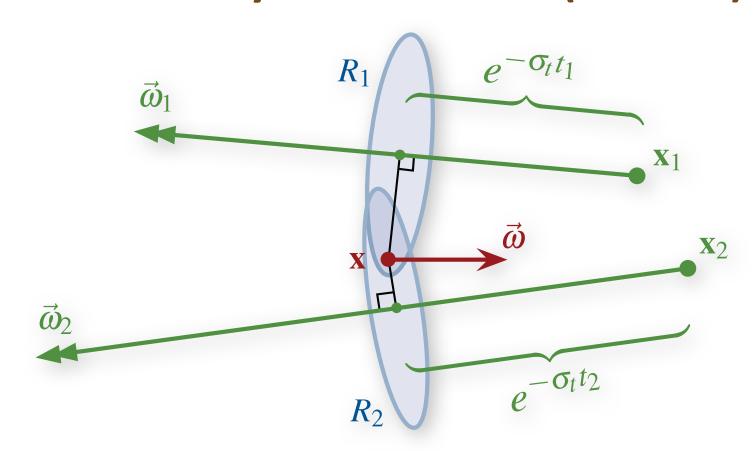
#### Point Query x Beam Data (2D blur)



$$L \approx \frac{1}{\mu_R(r^2)} \sum_i f(\theta_i) \Phi_i e^{-\sigma_t t_i}$$

"Beam Radiance Estimate"

[Jarosz et al. 08]

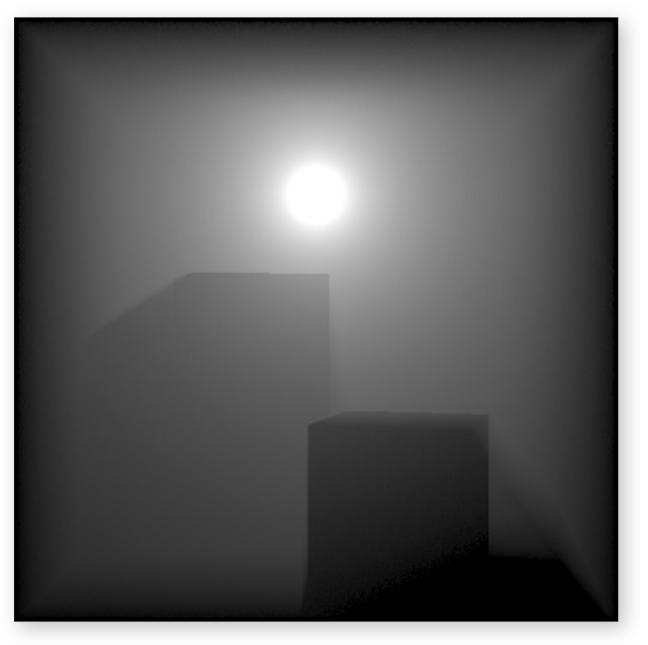


$$L \approx \frac{1}{\mu_R(r^2)} \sum_i f(\theta_i) \Phi_i e^{-\sigma_t t_i}$$



#### Photon Points vs. Photon Beams

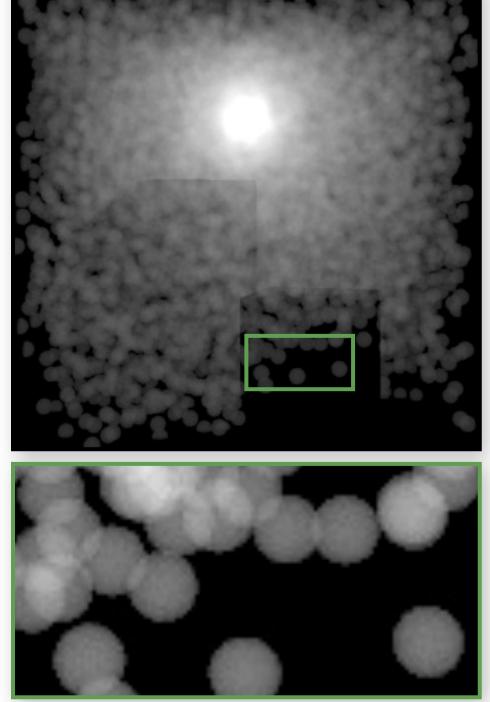
#### **Ground Truth**



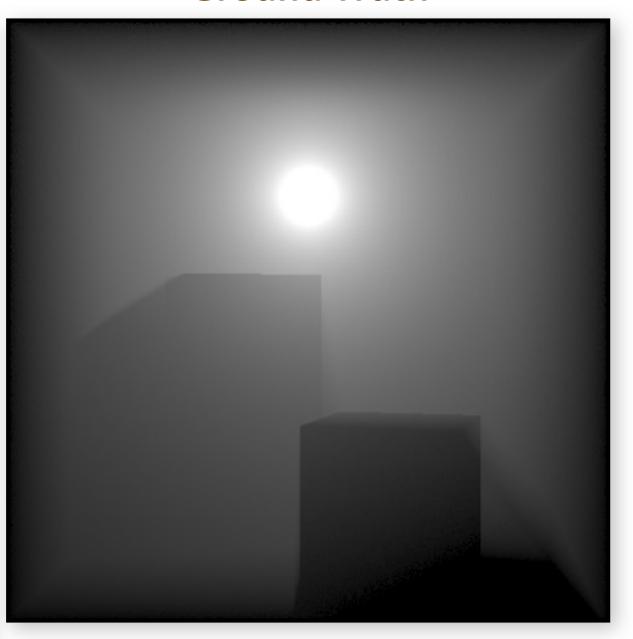


#### Photon Points vs. Photon Beams

#### **100k Photon Points**



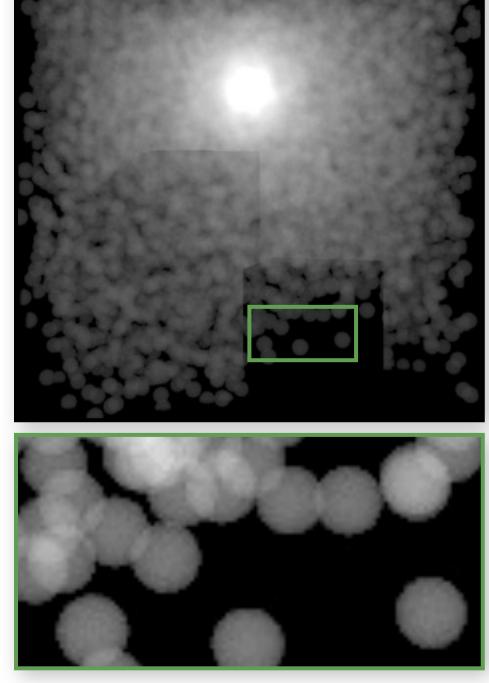
#### **Ground Truth**



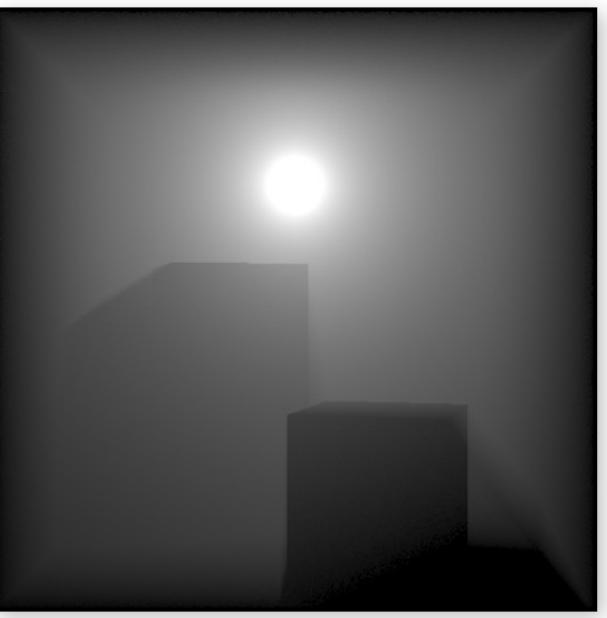


#### Photon Points vs. Photon Beams

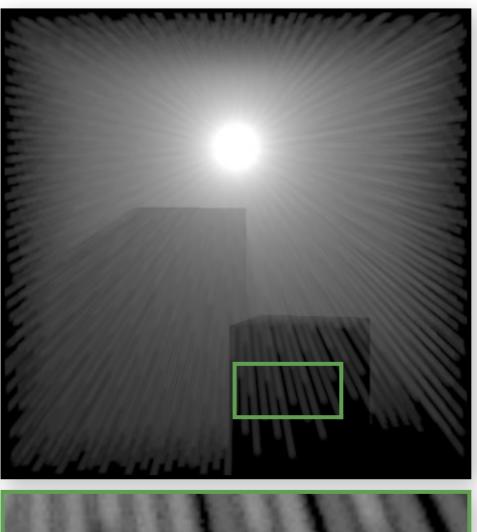
**100k Photon Points** 

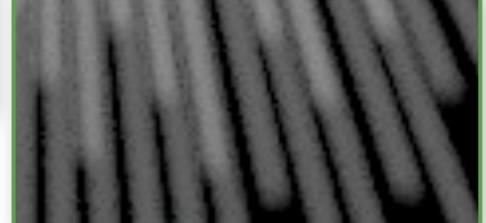


**Ground Truth** 



**5k Photon Beams** 







#### Beam Queries with Photon Beams

- Beam Query x Beam Data (3D)
- Beam Query x Beam Data (2D)<sub>1</sub>
- Beam Query x Beam Data (2D)<sub>2</sub>
- Beam Query x Beam Data (1D)

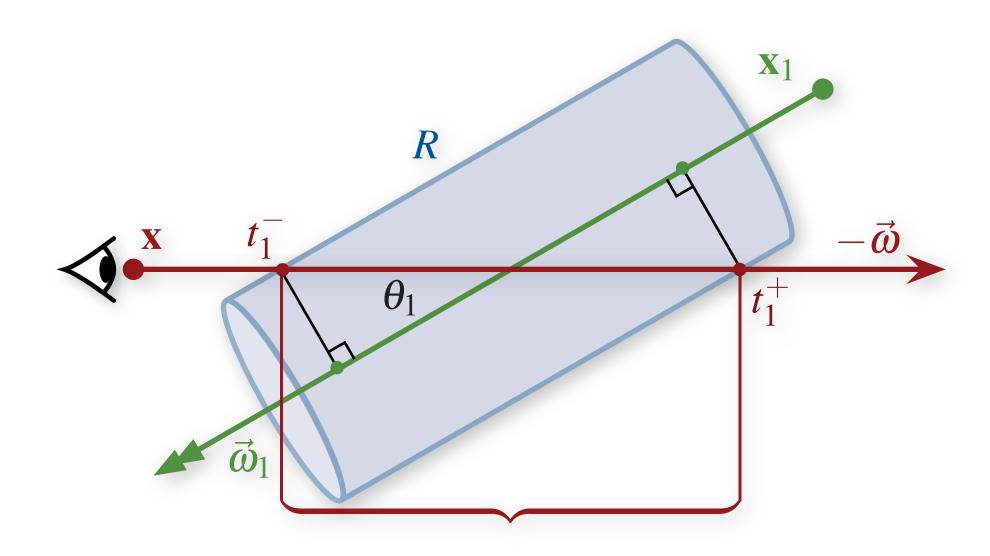


## Beam Query × Beam Data (2D blur)





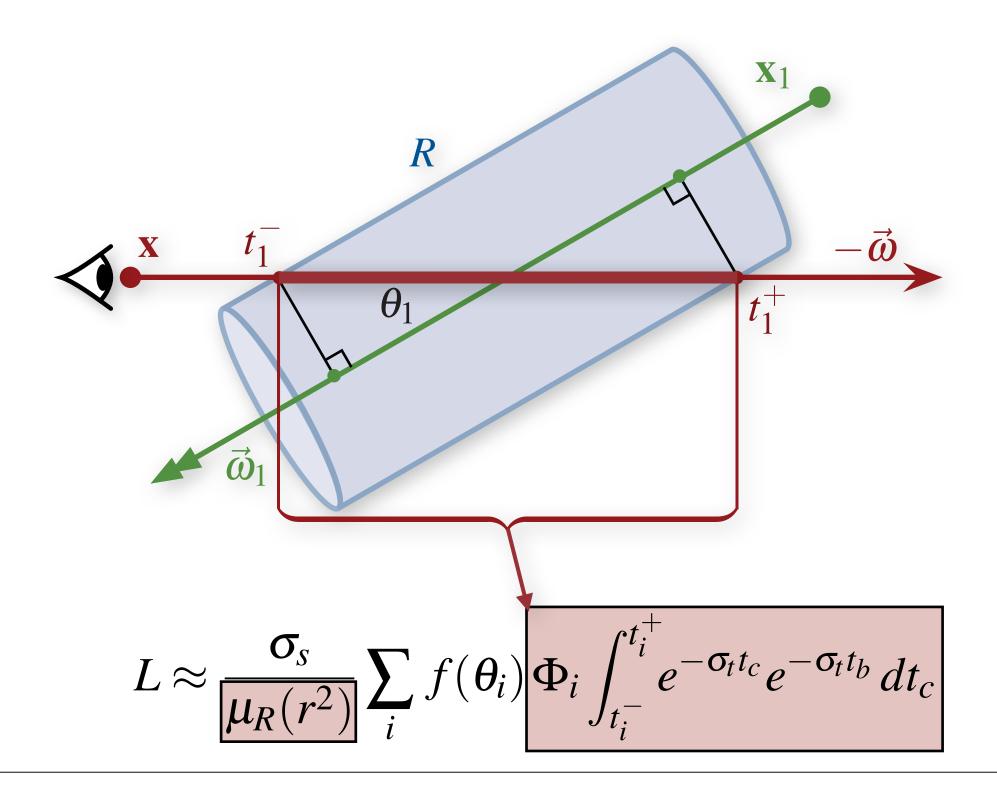
### Beam Query × Beam Data (2D blur)



$$L \approx \frac{\sigma_s}{\mu_R(r^2)} \sum_i f(\theta_i) \Phi_i \int_{t_i^-}^{t_i^+} e^{-\sigma_t t_c} e^{-\sigma_t t_b} dt_c$$

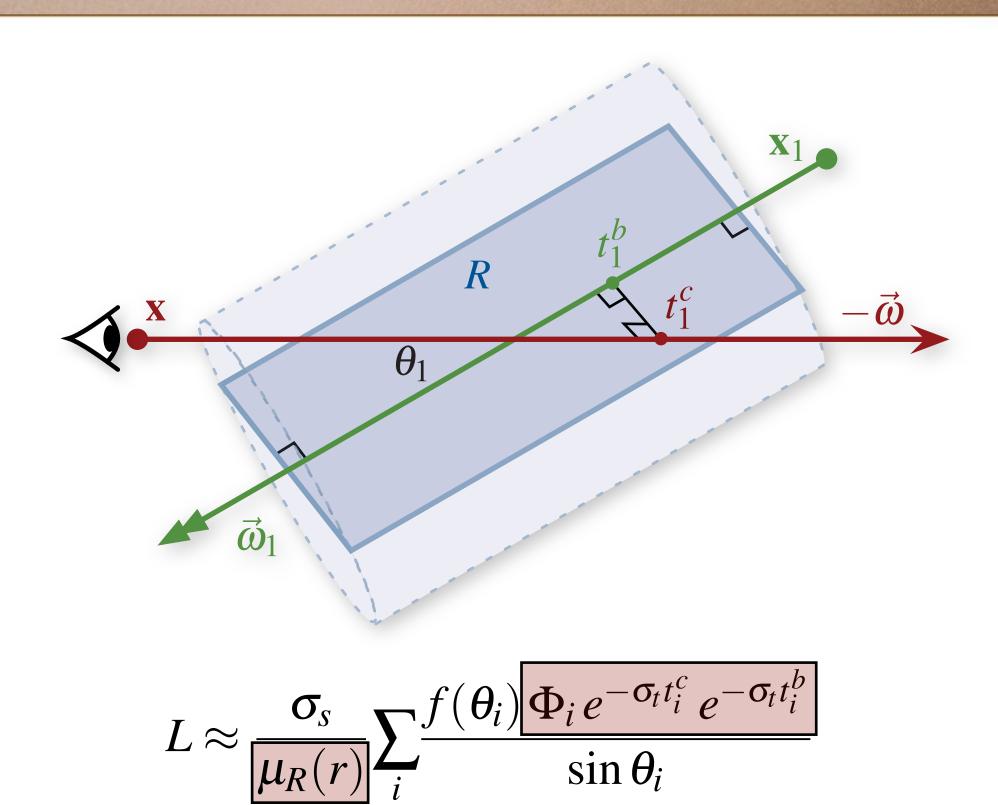


### Beam Query × Beam Data (2D blur)





#### Beam Query × Beam Data (1D blur)







Beam queries remove ray marching



- Beam queries remove ray marching
- Beam data increases data density



- Beam queries remove ray marching
- Beam data increases data density
- Lower blur dimension reduces bias and computation

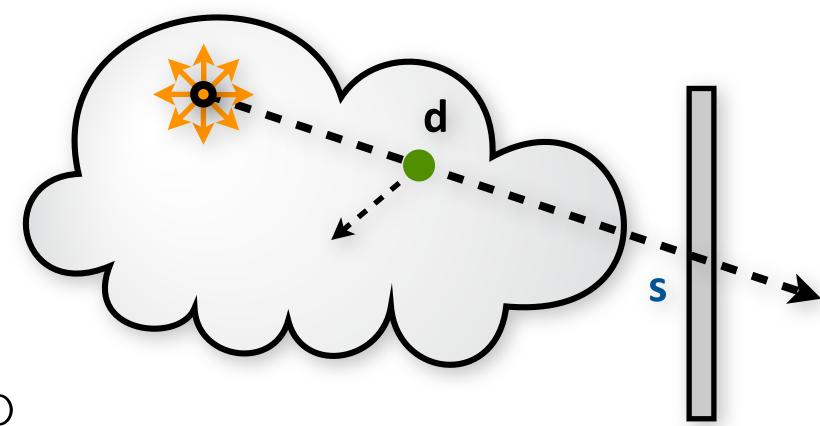


- Beam queries remove ray marching
- Beam data increases data density
- Lower blur dimension reduces bias and computation
- use: Beam Query x Beam Data (1D)



#### **Basic Volumetric Photon Tracer**

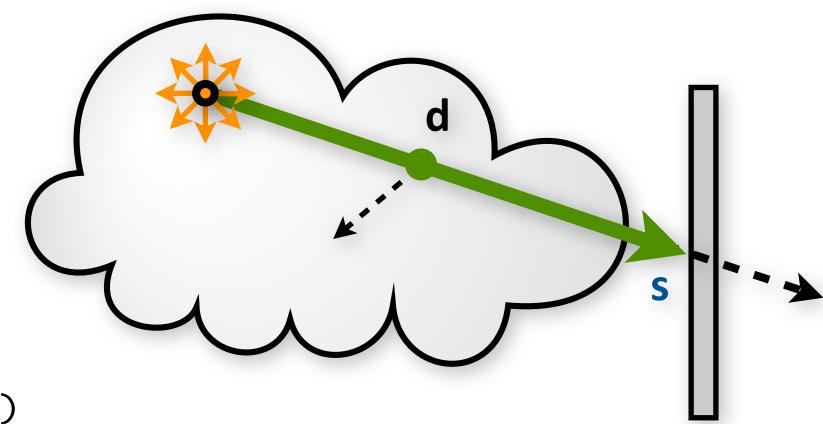
```
void vPT(o, \omega, \Phi)
    s = nearestSurfaceHit(o, \omega)
    d = freeFlightDistance(o, \omega)
    if (d < s) // media scattering
        o += d*\omega // propagate photon
        storeVolumePhoton(o, \omega, \Phi)
        return vPT(o, samplePF(), \Phi * \sigma_s / \sigma_t)
                      // surface scattering
    else
        o += s*\omega // propagate photon
        storeSurfacePhoton(o, ω, Φ)
        (\omega_i, pdf_i) = sampleBRDF(o, \omega)
        return vPT(o, \omega_i, \Phi * BRDF(o,\omega,\omega_i) / pdf<sub>i</sub>)
```





#### **Basic Volumetric Photon Tracer**

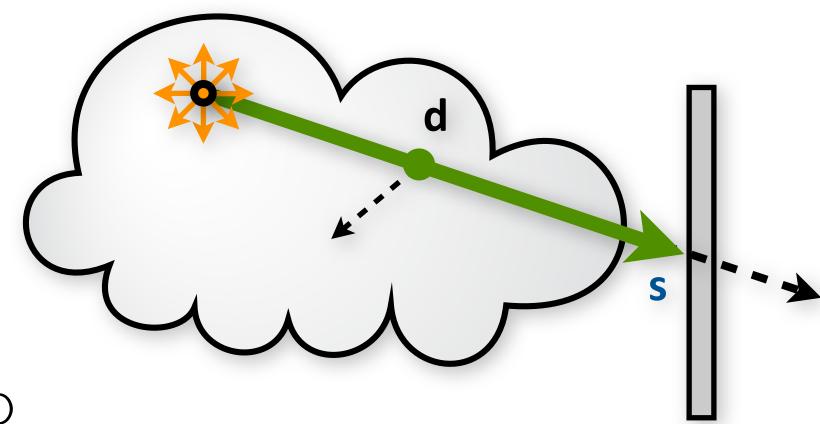
```
void vPT(o, \omega, \Phi)
    s = nearestSurfaceHit(o, \omega)
    storeVolumePhoton(o, \omega, \phi)
    d = freeFlightDistance(o, \omega)
    if (d < s) // media scattering
        o += d*\omega // propagate photon
        return vPT(o, samplePF(), \Phi * \sigma_s / \sigma_t)
    else
                // surface scattering
        o += s*\omega // propagate photon
        storeSurfacePhoton(o, ω, Φ)
        (\omega_i, pdf_i) = sampleBRDF(o, \omega)
        return vPT(o, \omega_i, \Phi * BRDF(o,\omega,\omega_i) / pdf<sub>i</sub>)
```

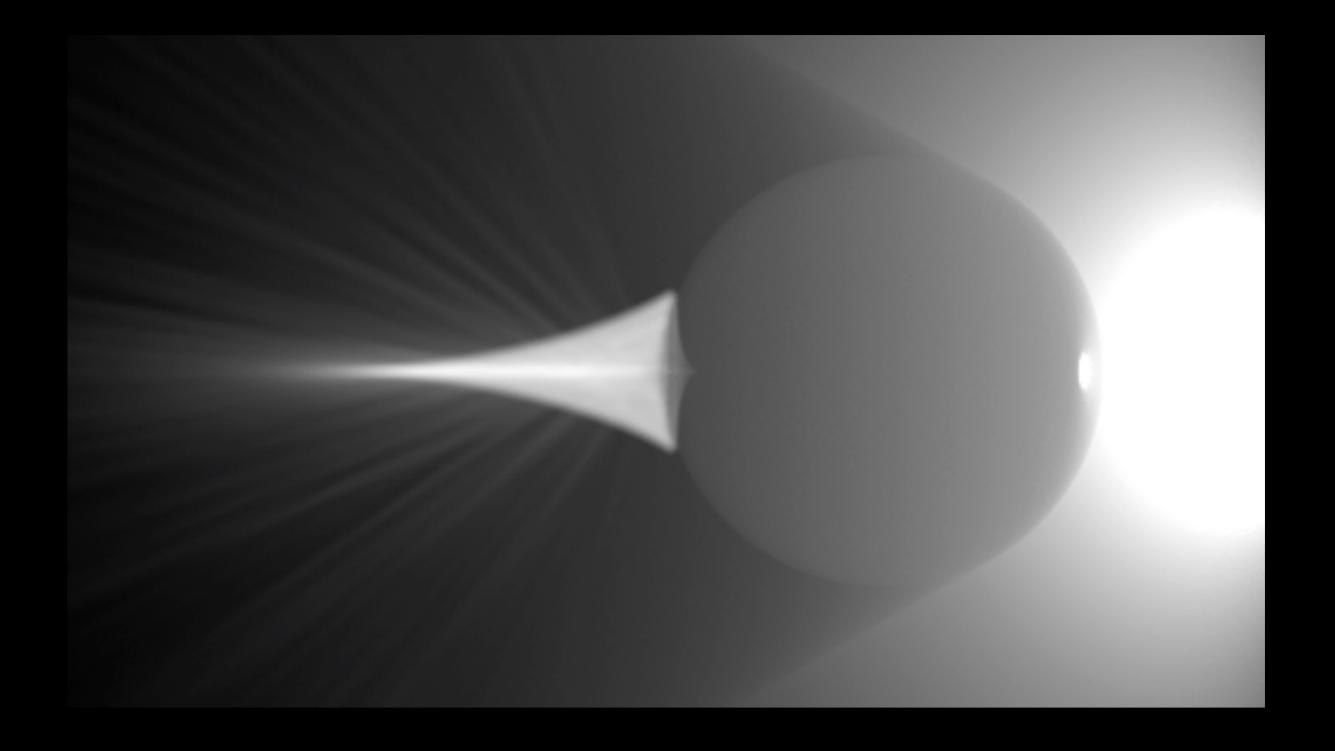


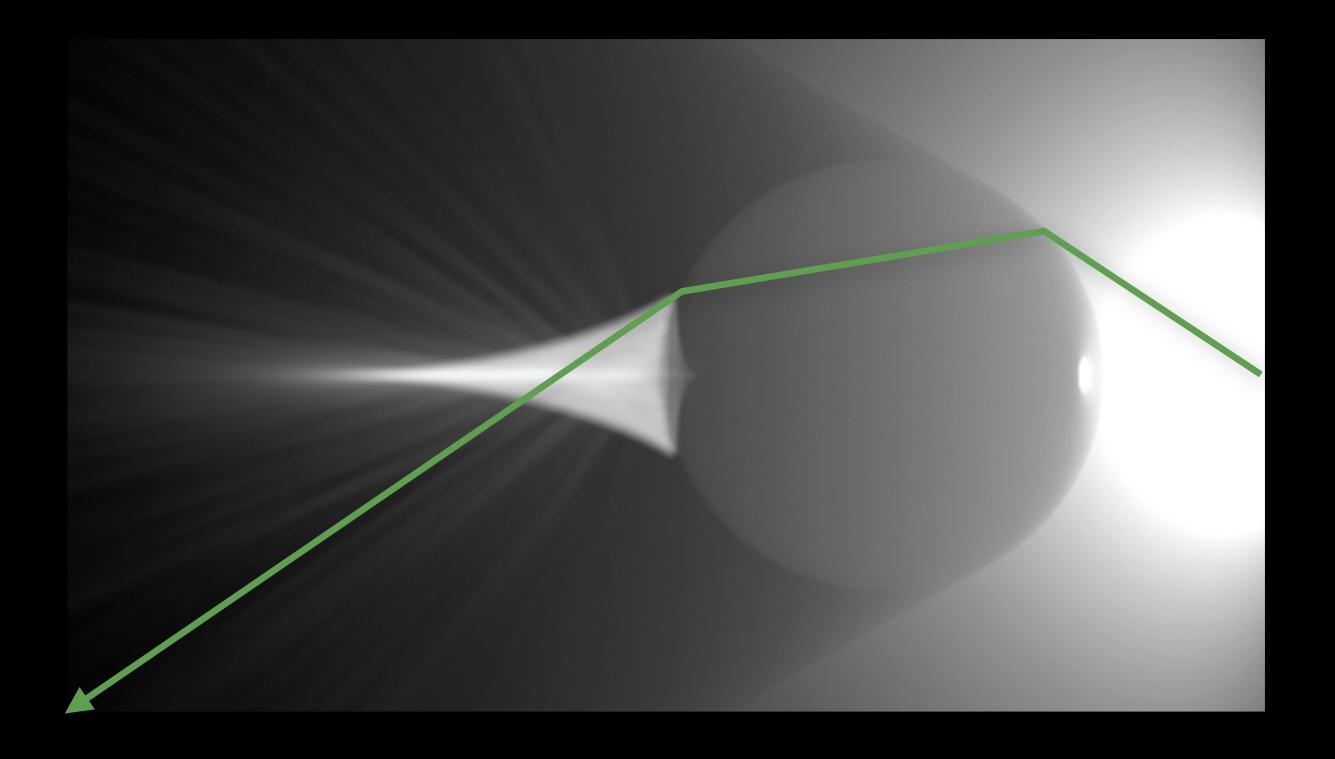


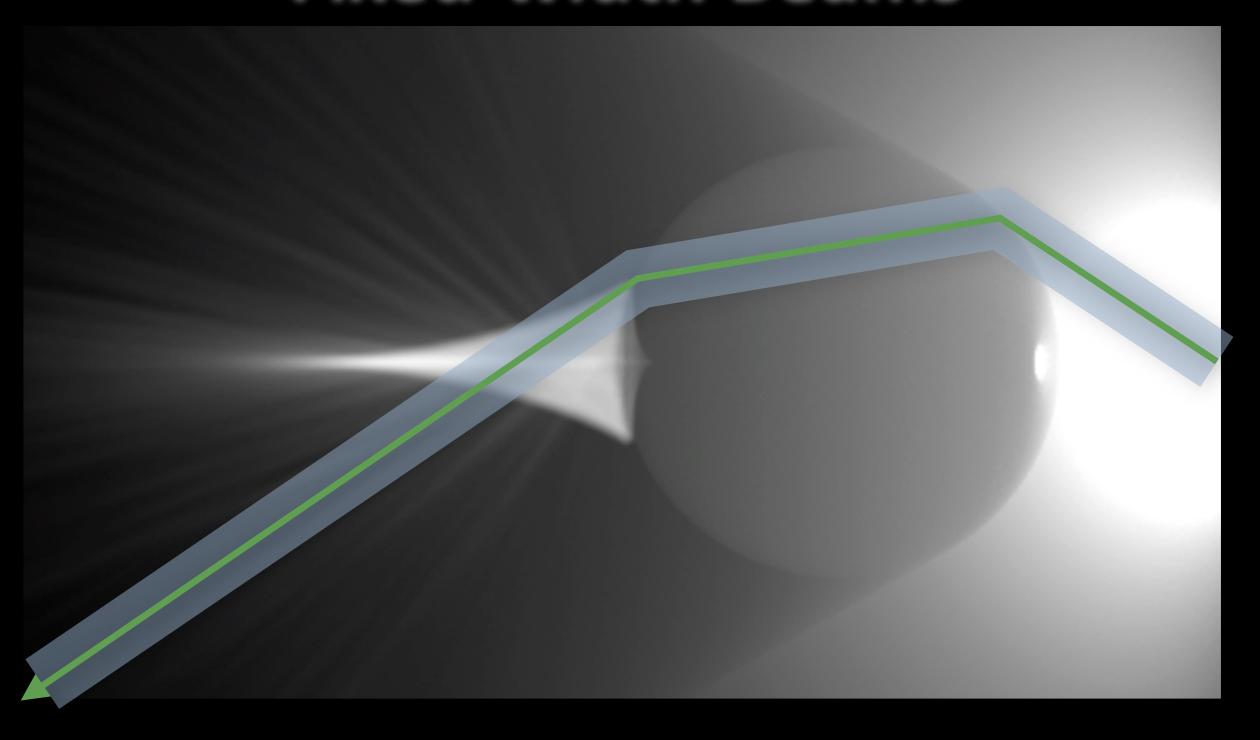
#### **Basic Volumetric Photon Tracer**

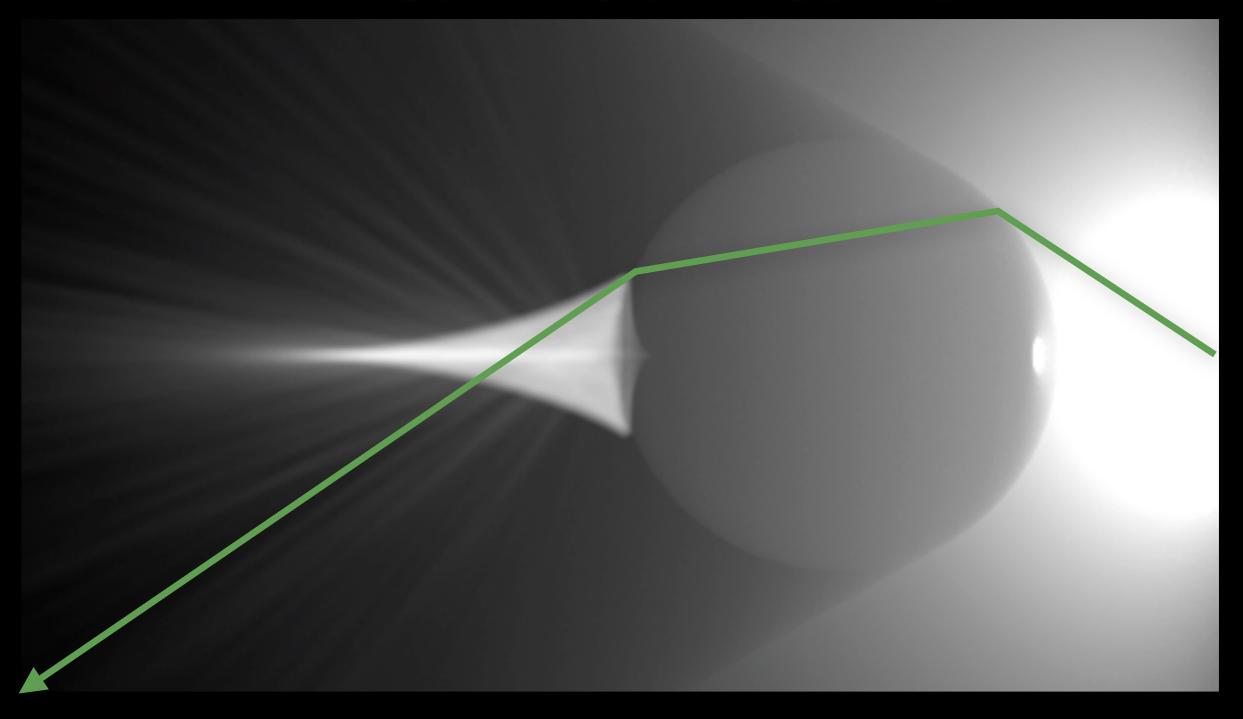
```
void vPT(o, \omega, \Phi)
    s = nearestSurfaceHit(o, \omega)
    storePhotonBeam(o, \omega, s, \phi)
    d = freeFlightDistance(o, \omega)
    if (d < s) // media scattering
        o += d*\omega // propagate photon
        return vPT(o, samplePF(), \Phi * \sigma_s / \sigma_t)
    else
                // surface scattering
        o += s*\omega // propagate photon
        storeSurfacePhoton(o, ω, Φ)
        (\omega_i, pdf_i) = sampleBRDF(o, \omega)
        return vPT(o, \omega_i, \Phi * BRDF(o,\omega,\omega_i) / pdf<sub>i</sub>)
```



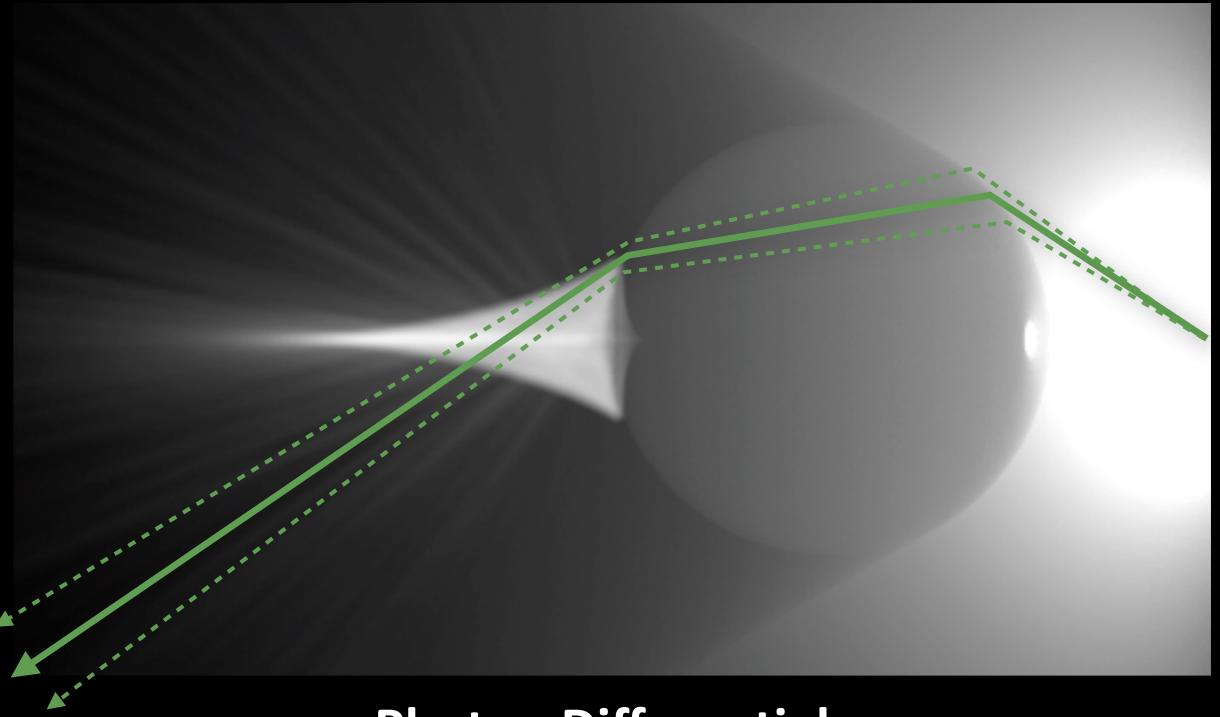




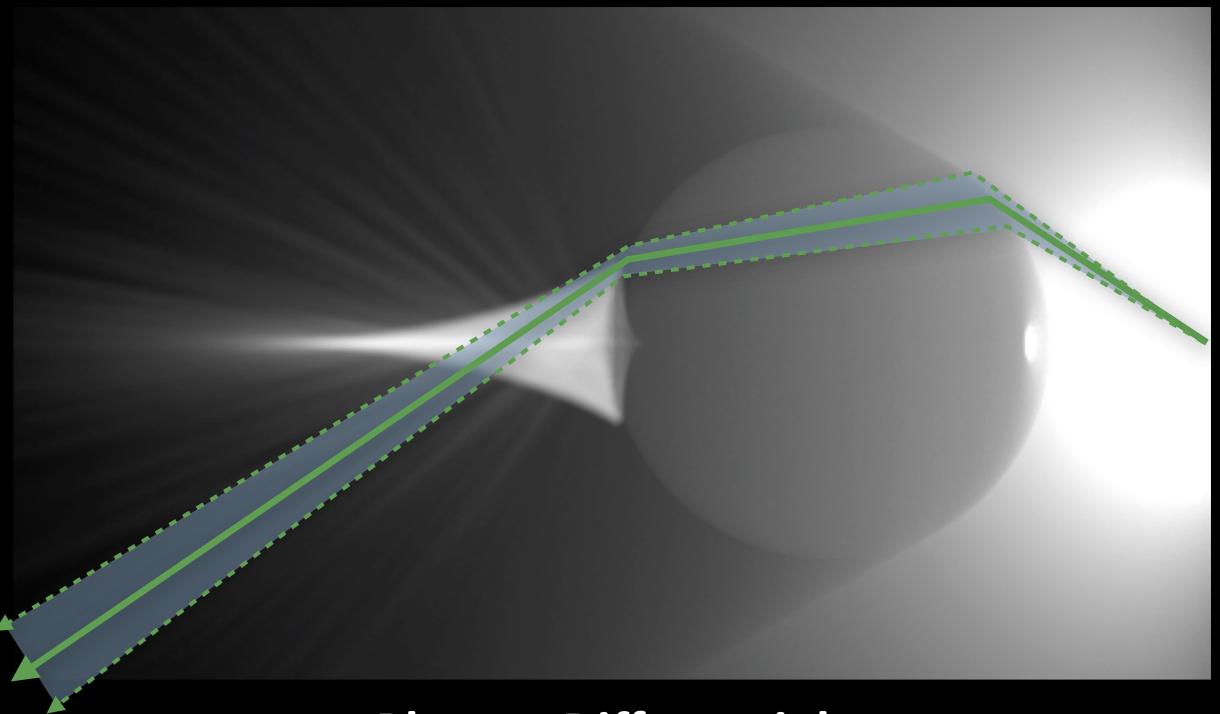




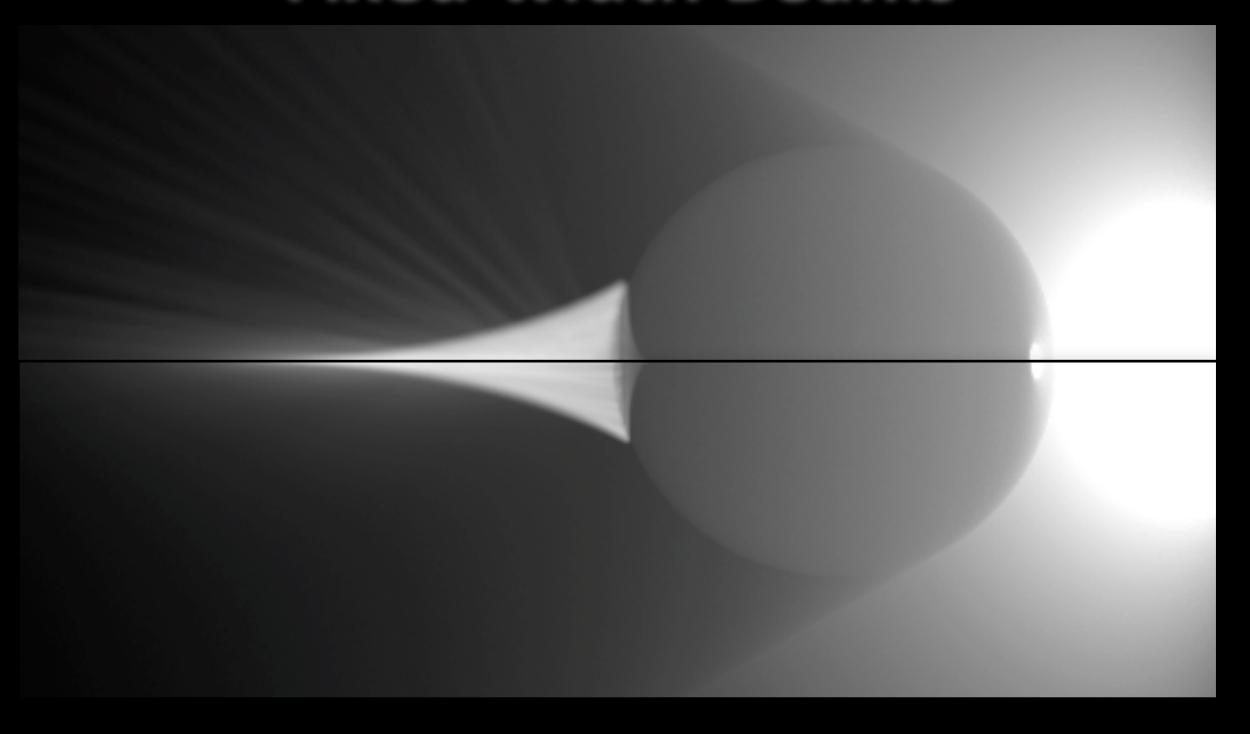
Photon Differentials [Igehy 99, Schjøth et al. 07]



Photon Differentials [Igehy 99, Schjøth et al. 07]



Photon Differentials [Igehy 99, Schjøth et al. 07]



# Adaptive-width Beams



# Rendering



## Rendering

 Need to intersect each ray with all photon beams (expensive!)



### Rendering

- Need to intersect each ray with all photon beams (expensive!)
- Place photon beams in an acceleration structure



# Rendering

- Need to intersect each ray with all photon beams (expensive!)
- Place photon beams in an acceleration structure
- Rasterization (beams are just axial billboards!)





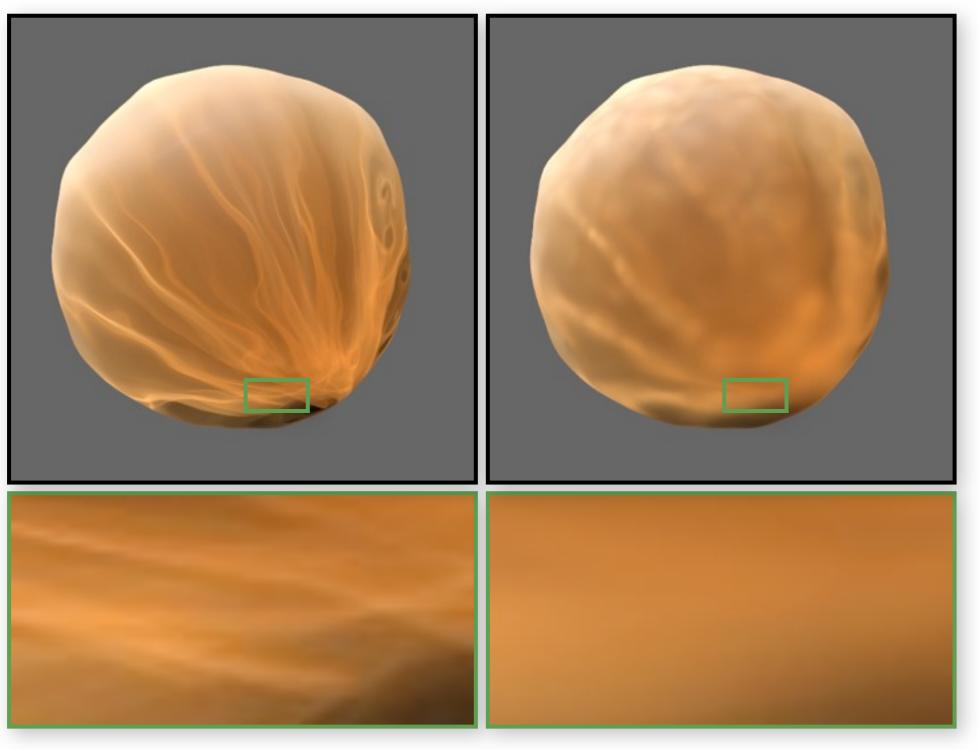






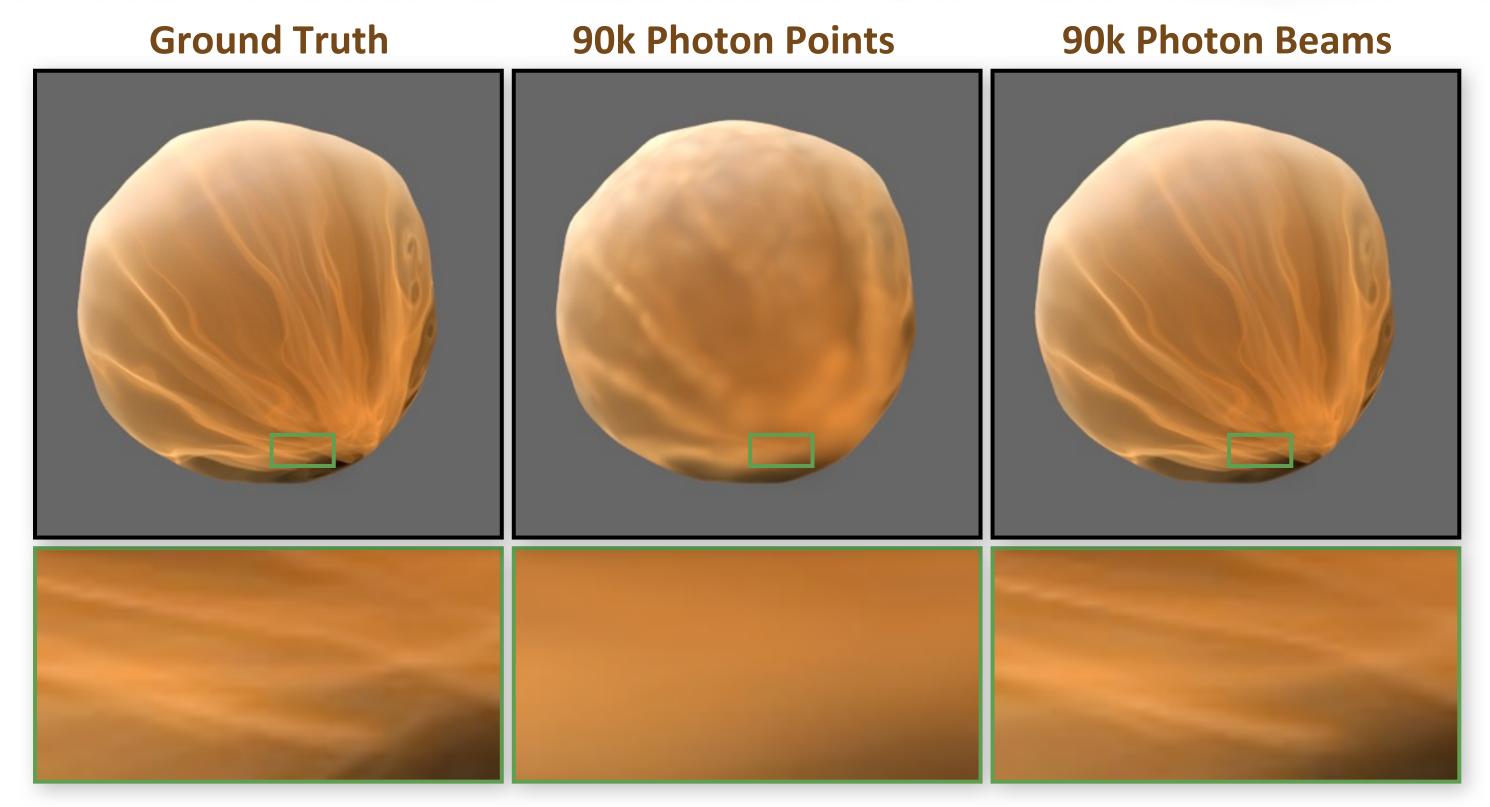
#### **Ground Truth**

#### **90k Photon Points**





courtesy of Bruce Walter



Rendered at 512x512 with up to 16 samples/pixel

# **Equal Photon Count**

**Photon Points** 

**Photon Beams** 



90K Photon **Points** ~ 40 seconds/frame



90K Photon **Beams** ~ 103 seconds/frame

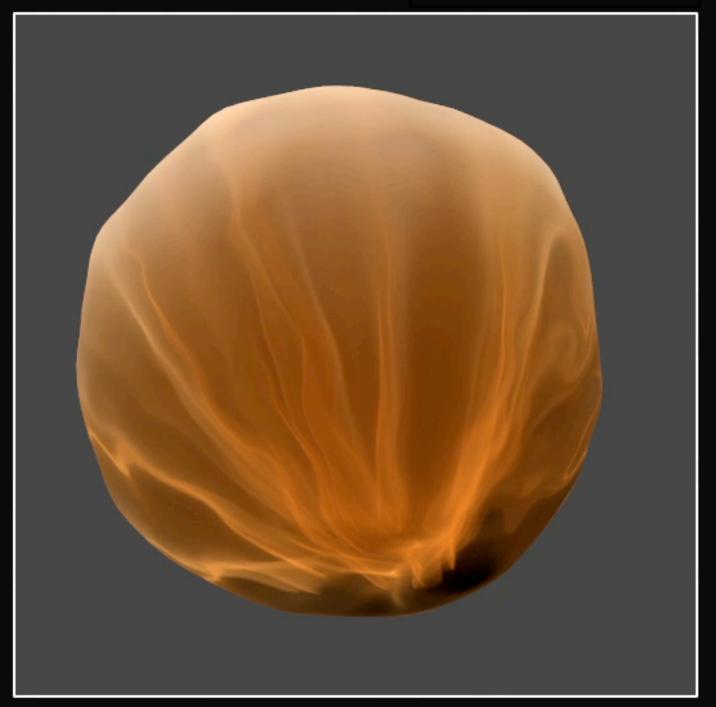
# **Equal Render Time**

#### **Photon Points**

**Photon Beams** 



1.3M Photon **Points** ~ 101 seconds/frame



90K Photon **Beams** ~ 103 seconds/frame

# Lighthouse

#### **Photon Points**



10K Photon **Points** ~ 31 seconds/frame

**Roughly Equal Time** 

#### **Photon Beams**



700 Photon **Beams** ~ 25 seconds/frame

# Lighthouse

# Underwater Sun Beams

Rendered at 1024x576 with up to 16 samples/pixel

1M Photon **Points** 226 seconds/frame

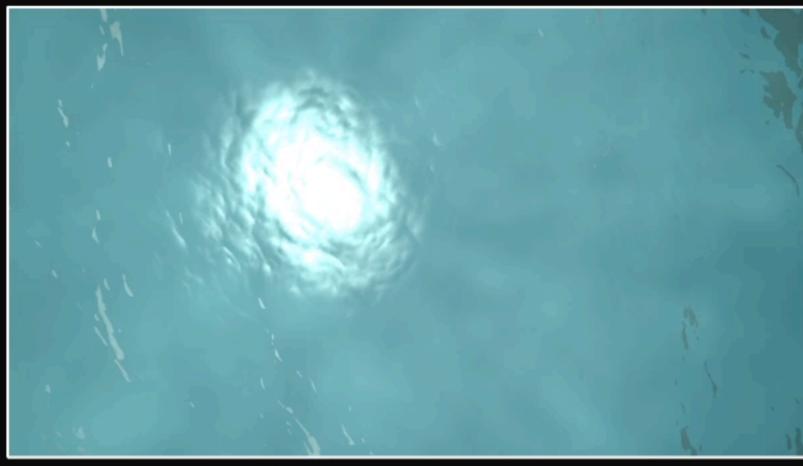
9x Render Time

700 Photon **Beams** ~ 25 seconds/frame

# **Underwater Sun Beams**

**Photon Points** 

**Photon Beams** 



100K Photon **Points** ~ 204 seconds/frame

**Roughly Equal Time** 



25K Photon **Beams** ~ 200 seconds/frame





Combine benefits of:



- Combine benefits of:
  - photon beams



- Combine benefits of:
  - photon beams
  - progressive photon mapping



- Previous derivations not directly applicable
  - beam density vs. point density



- Previous derivations not directly applicable
  - beam density vs. point density
- Reduction factor:  $f_i = \frac{i + \alpha}{i + 1}$



- Previous derivations not directly applicable
  - beam density vs. point density
- Reduction factor:  $f_i = \frac{i + \alpha}{i + 1}$
- Application of factor depends on blur dimensionality
  - Surfaces (2D):  $r_{i+1}^2 = f_i \cdot r_i^2$



- Previous derivations not directly applicable
  - beam density vs. point density
- Reduction factor:  $f_i = \frac{i + \alpha}{i + 1}$
- Application of factor depends on blur dimensionality
  - Surfaces (2D):  $r_{i+1}^2 = f_i \cdot r_i^2$
  - Volumetric photon mapping (3D):  $r_{i+1}^3 = f_i \cdot r_i^3$



- Previous derivations not directly applicable
  - beam density vs. point density
- Reduction factor:  $f_i = \frac{i + \alpha}{i + 1}$
- Application of factor depends on blur dimensionality
  - Surfaces (2D):  $r_{i+1}^2 = f_i \cdot r_i^2$
  - Volumetric photon mapping (3D):  $r_{i+1}^3 = f_i \cdot r_i^3$
  - Beam × Beam (1D):  $r_{i+1} = f_i \cdot r_i$





### Step 1:

- Photon tracing: emit, scatter, store beams
- Scale beam widths by global factor  $r_i$



### Step 1:

- Photon tracing: emit, scatter, store beams
- Scale beam widths by global factor  $r_i$

### Step 2:

 Trace random camera path, evaluate radiance estimate along each ray using beams



### Step 1:

- Photon tracing: emit, scatter, store beams
- Scale beam widths by global factor  $r_i$

### Step 2:

- Trace random camera path, evaluate radiance estimate along each ray using beams
- Display running average



### Step 1:

- Photon tracing: emit, scatter, store beams
- Scale beam widths by global factor  $r_i$

### Step 2:

- Trace random camera path, evaluate radiance estimate along each ray using beams
- Display running average
- Reduce global factor  $r_i$  and repeat



Trivially Parallelizable



### **Evaluating the Transmittance**

 Need to compute transmittance: along photon beam, along camera ray



### **Evaluating the Transmittance**

- Need to compute transmittance: along photon beam, along camera ray
- Homogeneous: analytic



### **Evaluating the Transmittance**

- Need to compute transmittance: along photon beam, along camera ray
- Homogeneous: analytic
- Heterogeneous: use progressive deep shadow maps



# Results & Implementation

- 3 implementations:
  - GPU-only OptiX ray-tracer
  - GPU-only rasterization
  - General: Hybrid CPU/GPU



# Results & Implementation

- 3 implementations:
  - GPU-only OptiX ray-tracer
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BUMPYSPHERE

OPTIX IMPLEMENTATION



2x speed



# Results & Implementation

- 3 implementations:
  - GPU-only OptiX ray-tracer
  - GPU-only rasterization
  - General: Hybrid CPU/GPU

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# OCEAN OPENGL RASTERIZATION-ONLY IMPLEMENTATION

B

 $\alpha = 0.5$ 

alpha = 0.5 R = 0.037695 Shadow map resolution; 64 × 64 pass number; 14 average render time per pass;

2x speed



# Results & Implementation

- 3 implementations:
  - GPU-only OptiX ray-tracer
  - GPU-only rasterization
  - General: Hybrid CPU/GPU

# CARS

1280x720, Depth-of-Field

Pass 1



Homogeneous



Heterogeneous

Pass 1



Pass 2



Pass 4

Average of Passes 1..4



Pass 8



Pass 16

Average of Passes 1..16



Pass 32

Average of Passes 1..32

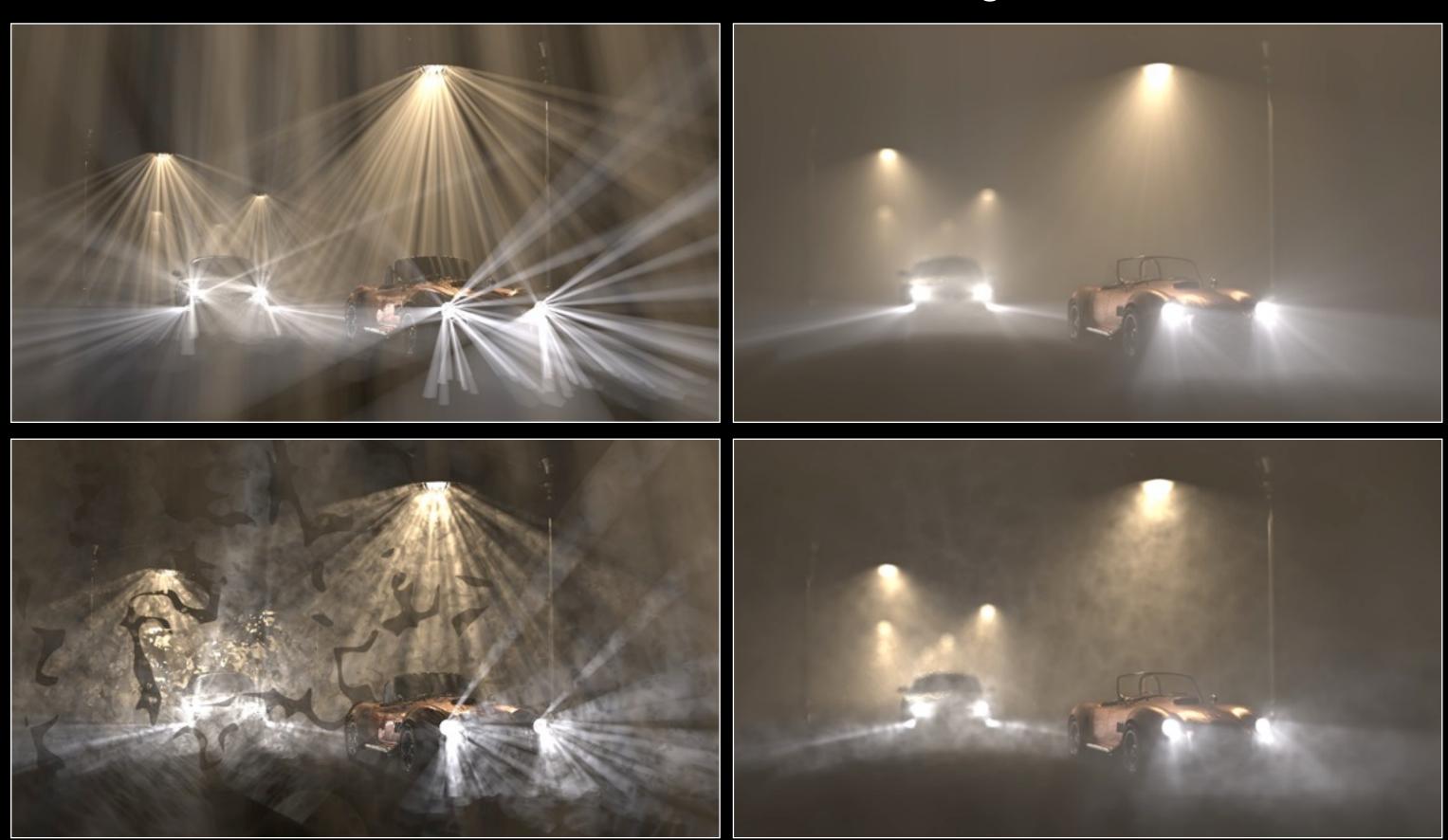


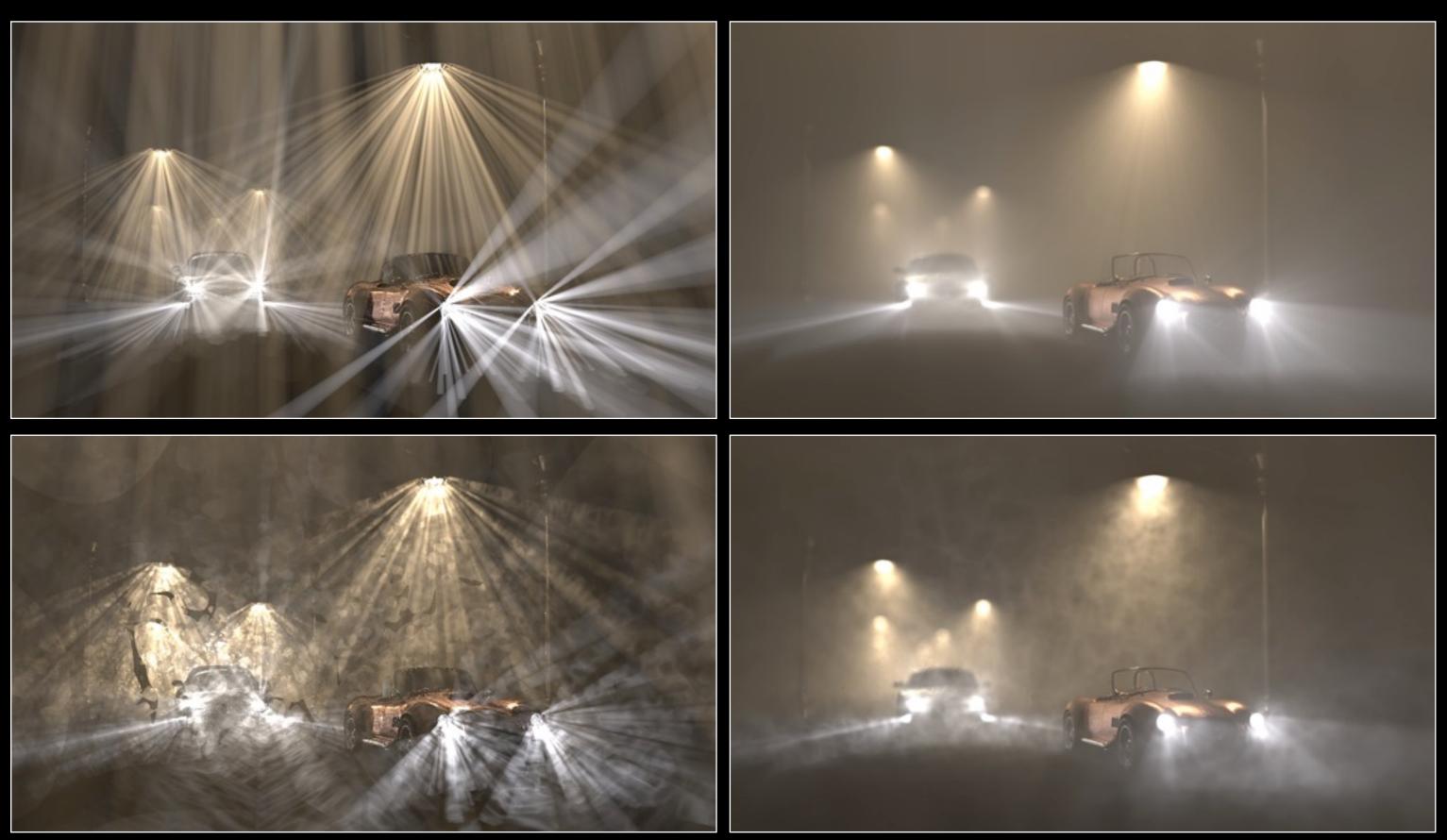
Pass 64

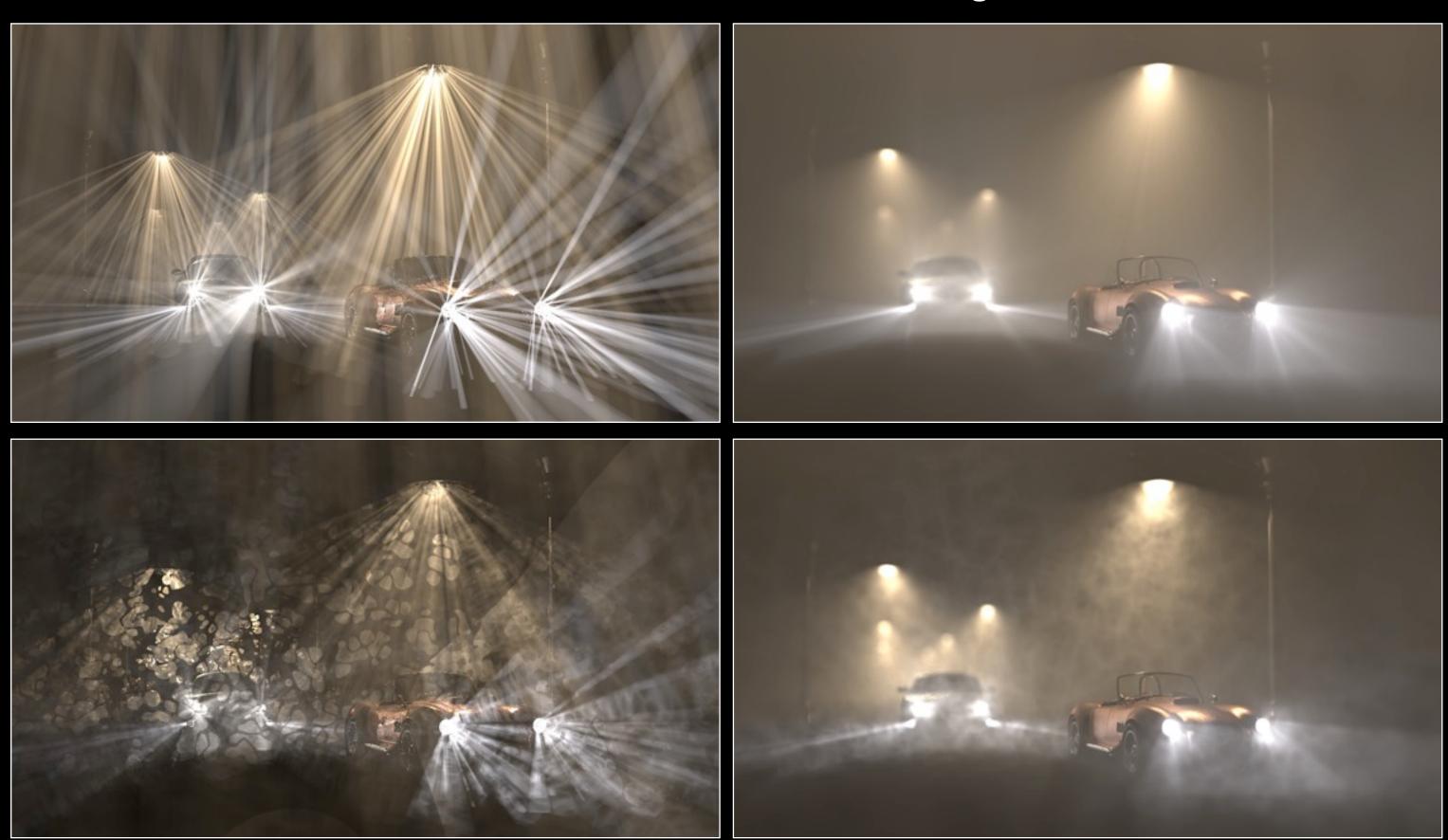




#### Pass 256







## CARS 1280x720, Depth-of-Field

Homogeneous
14.55M Photon Beams
9.5 minutes

Heterogeneous
15.04M Photon Beams
16.8 minutes





## CARS 1280x720, Depth-of-Field

Homogeneous
14.55M Photon Beams
9.5 minutes

Heterogeneous
15.04M Photon Beams
16.8 minutes



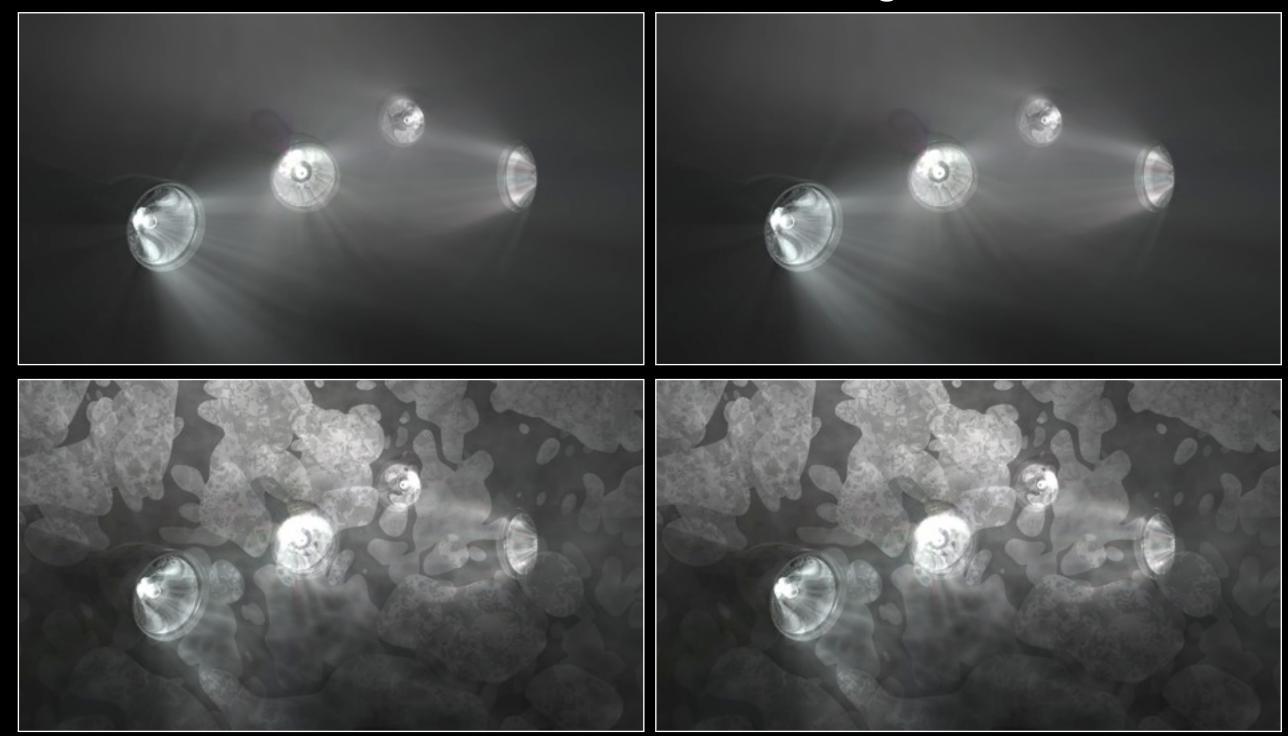


## **FLASHLIGHTS**

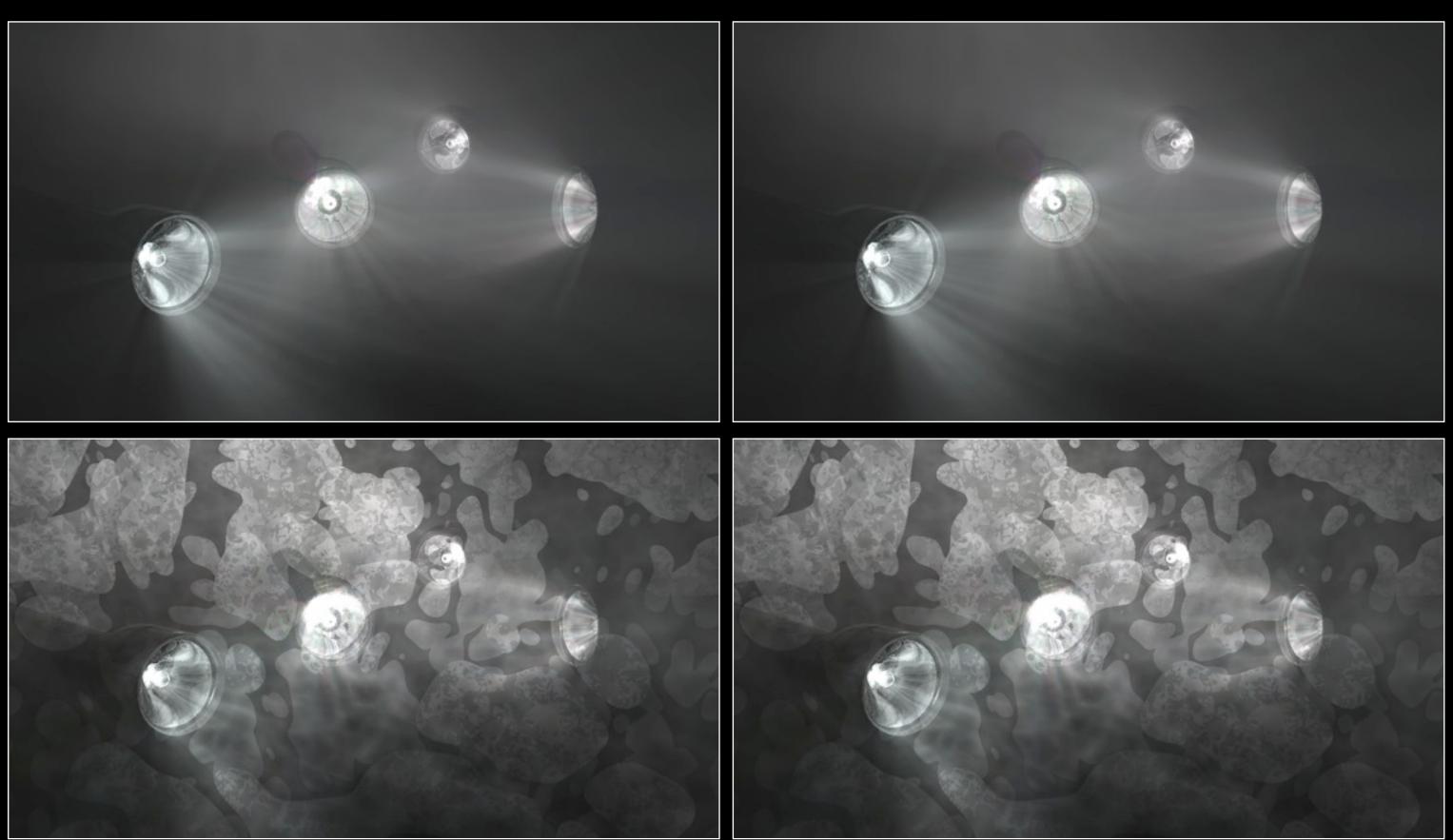
1280x720, Depth-of-Field

Pass 1

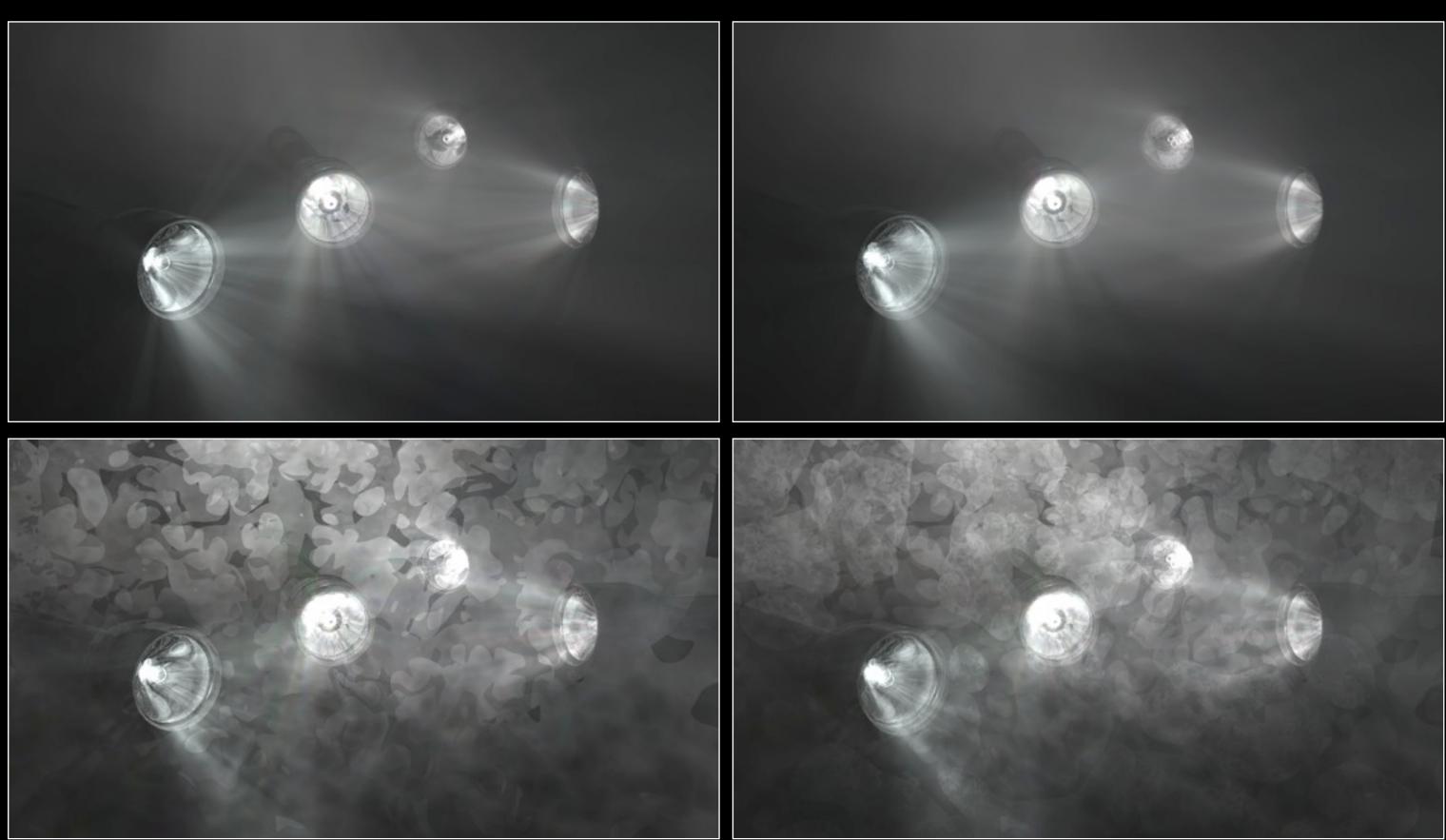
Average of Passes 1..1



Pass 1

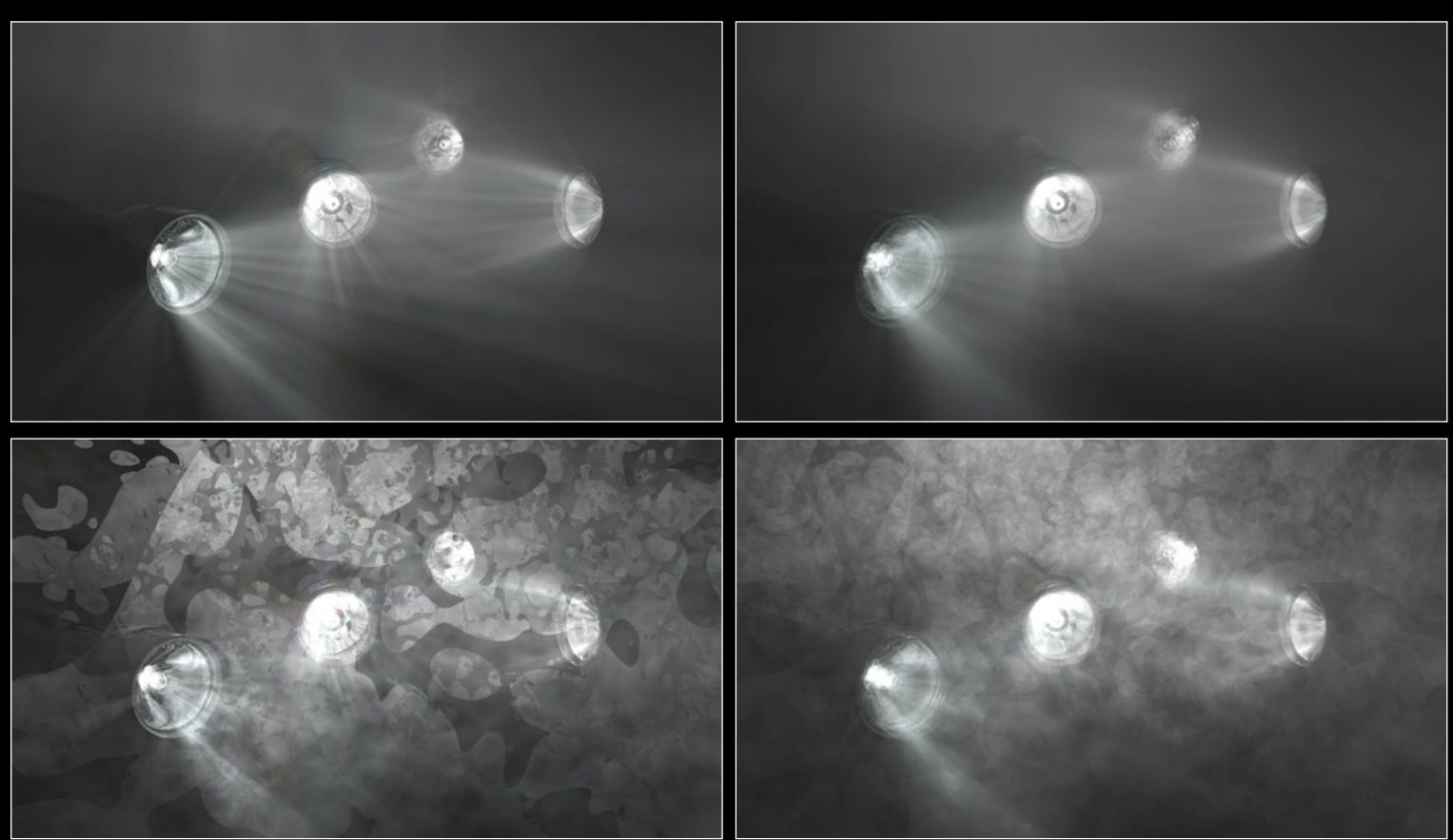


Pass 2

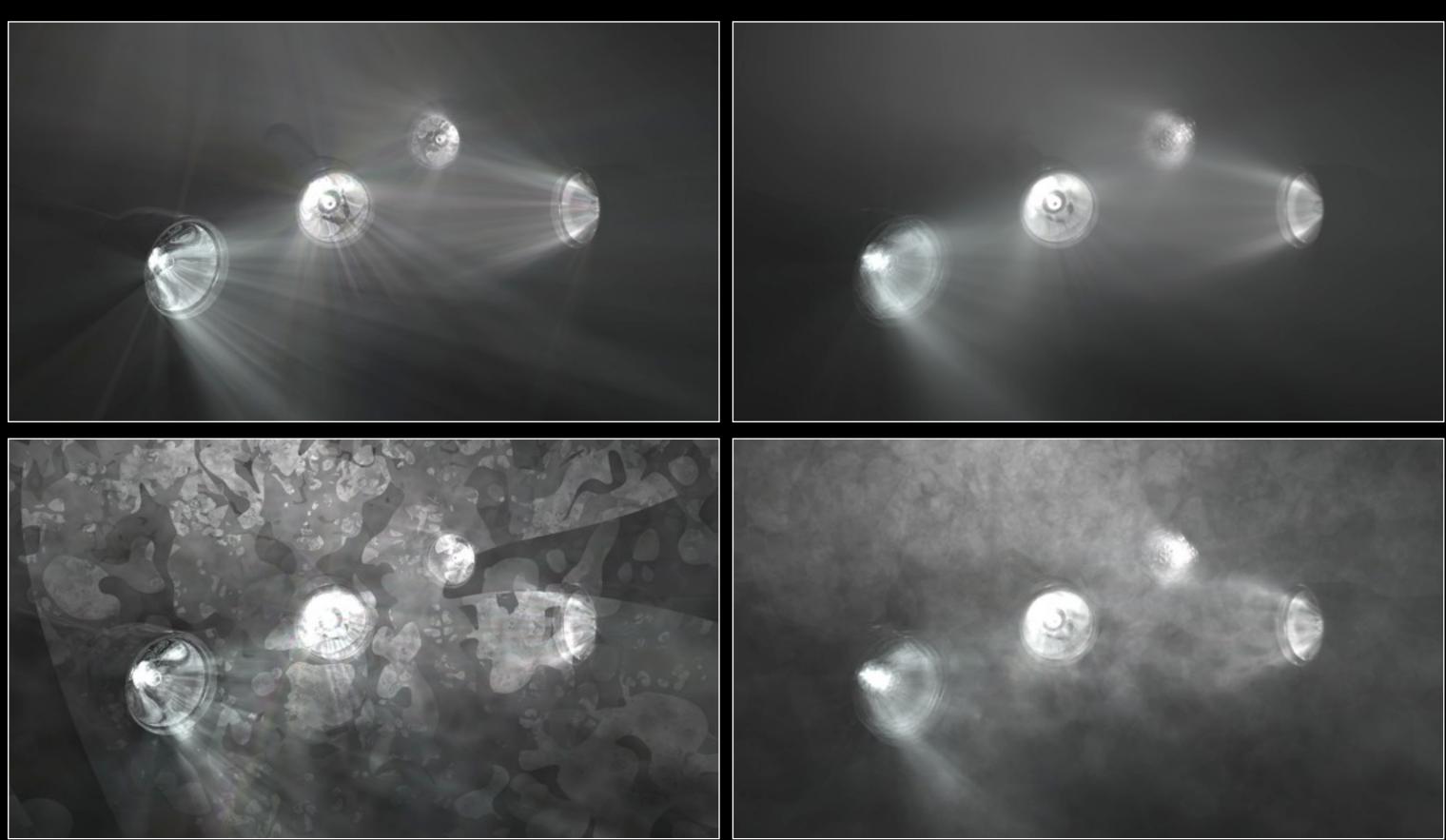


Pass 4

Average of Passes 1..4

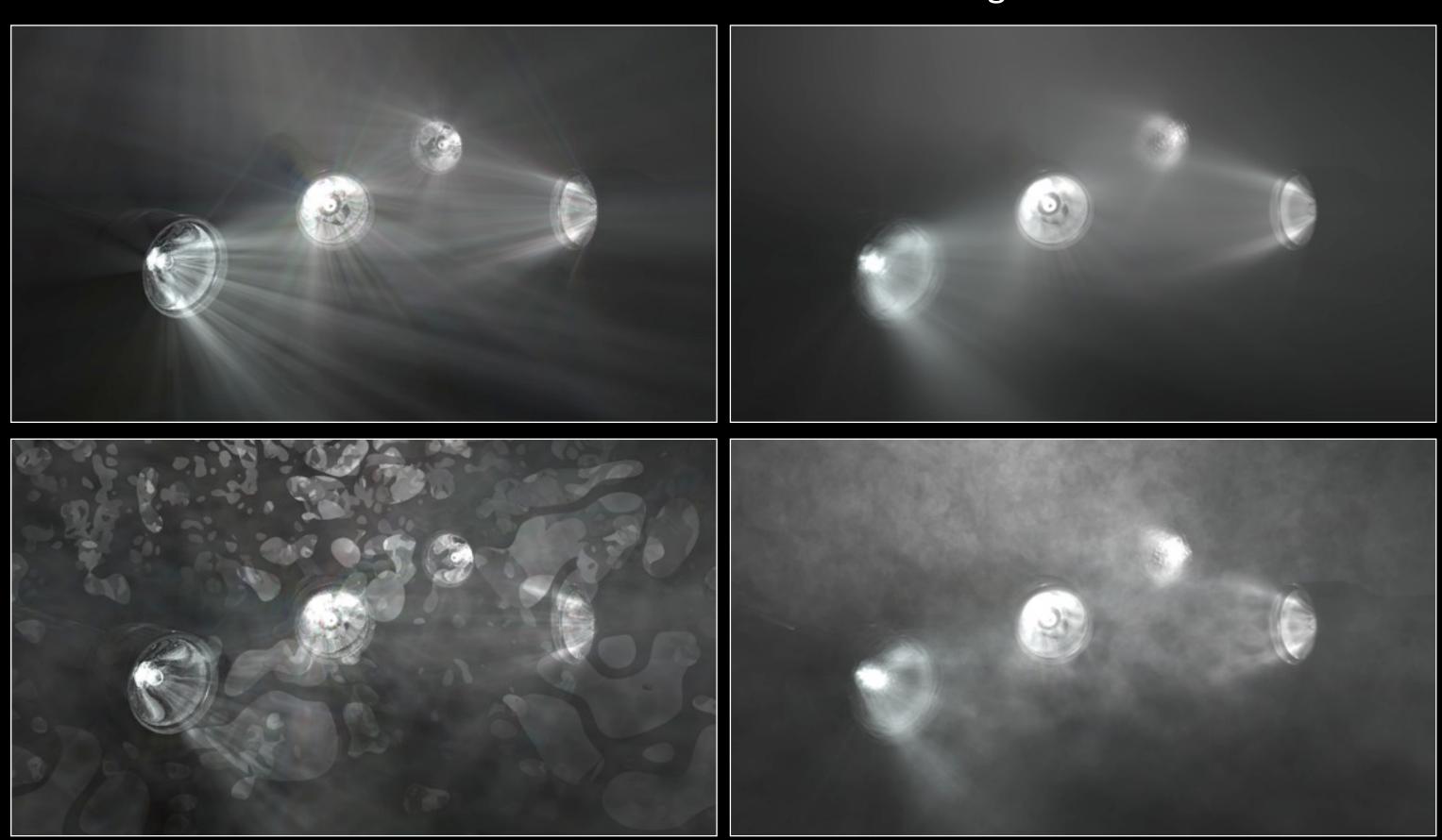


Pass 8



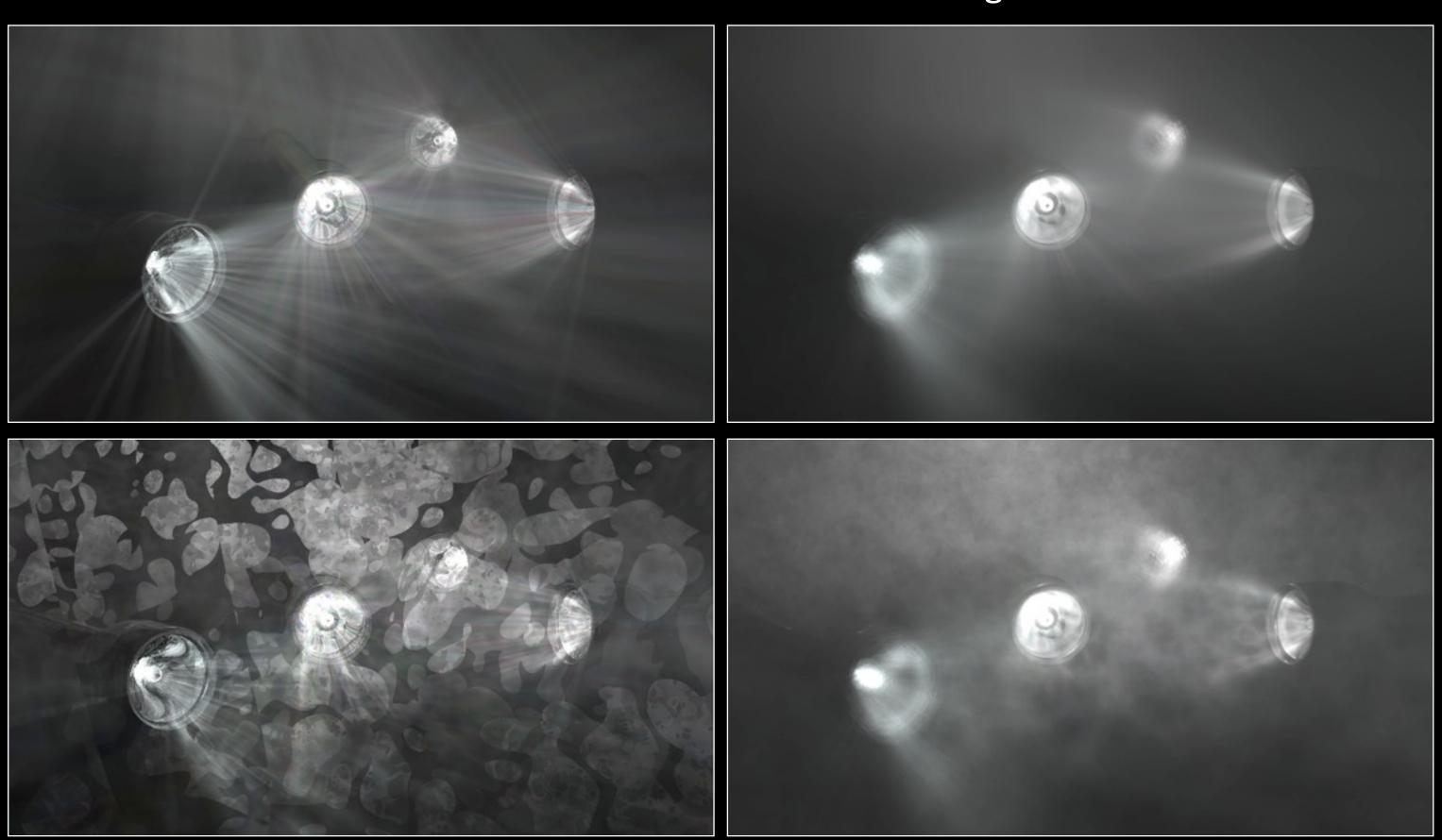
Pass 16

Average of Passes 1..16



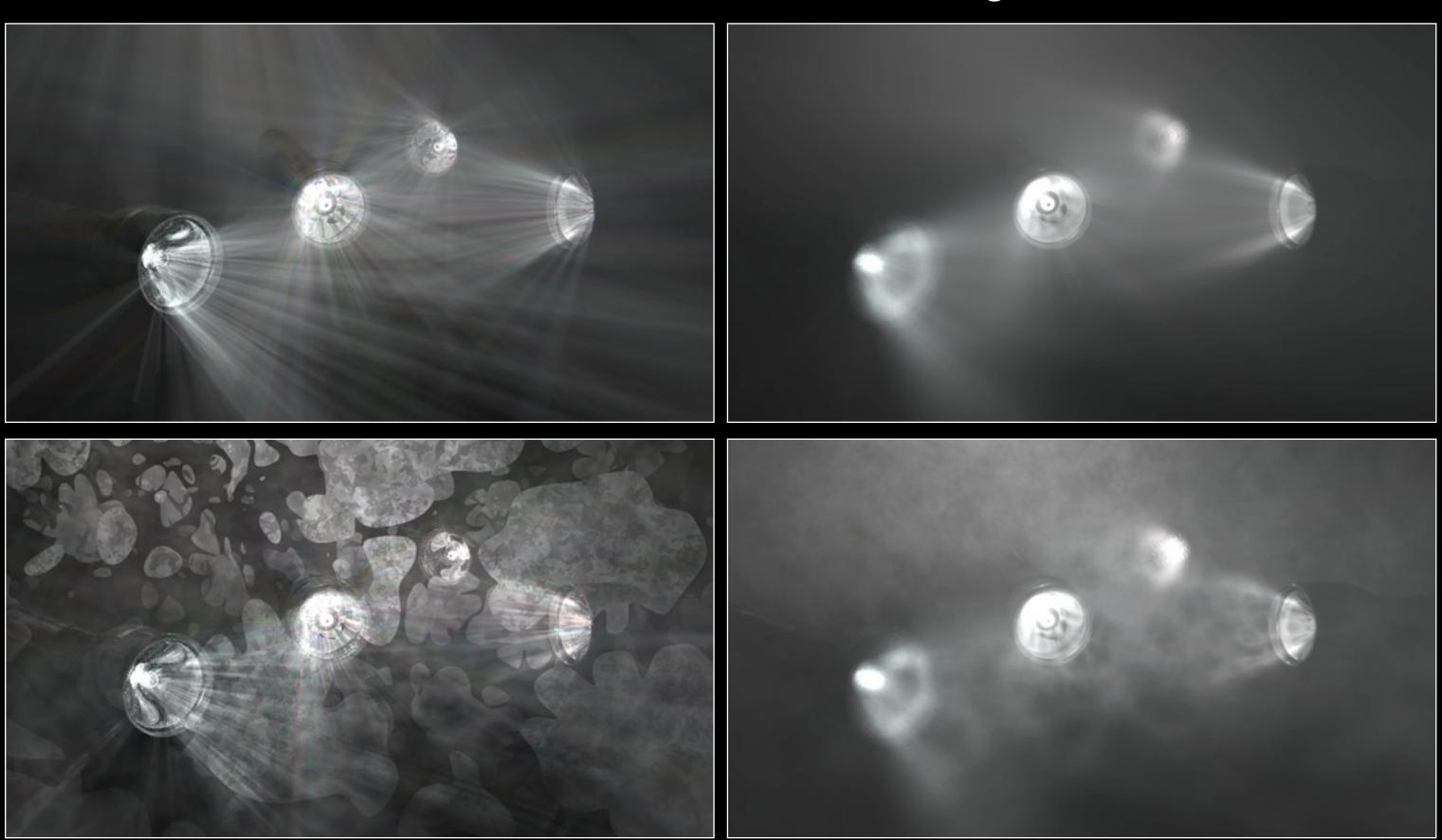
Pass 32

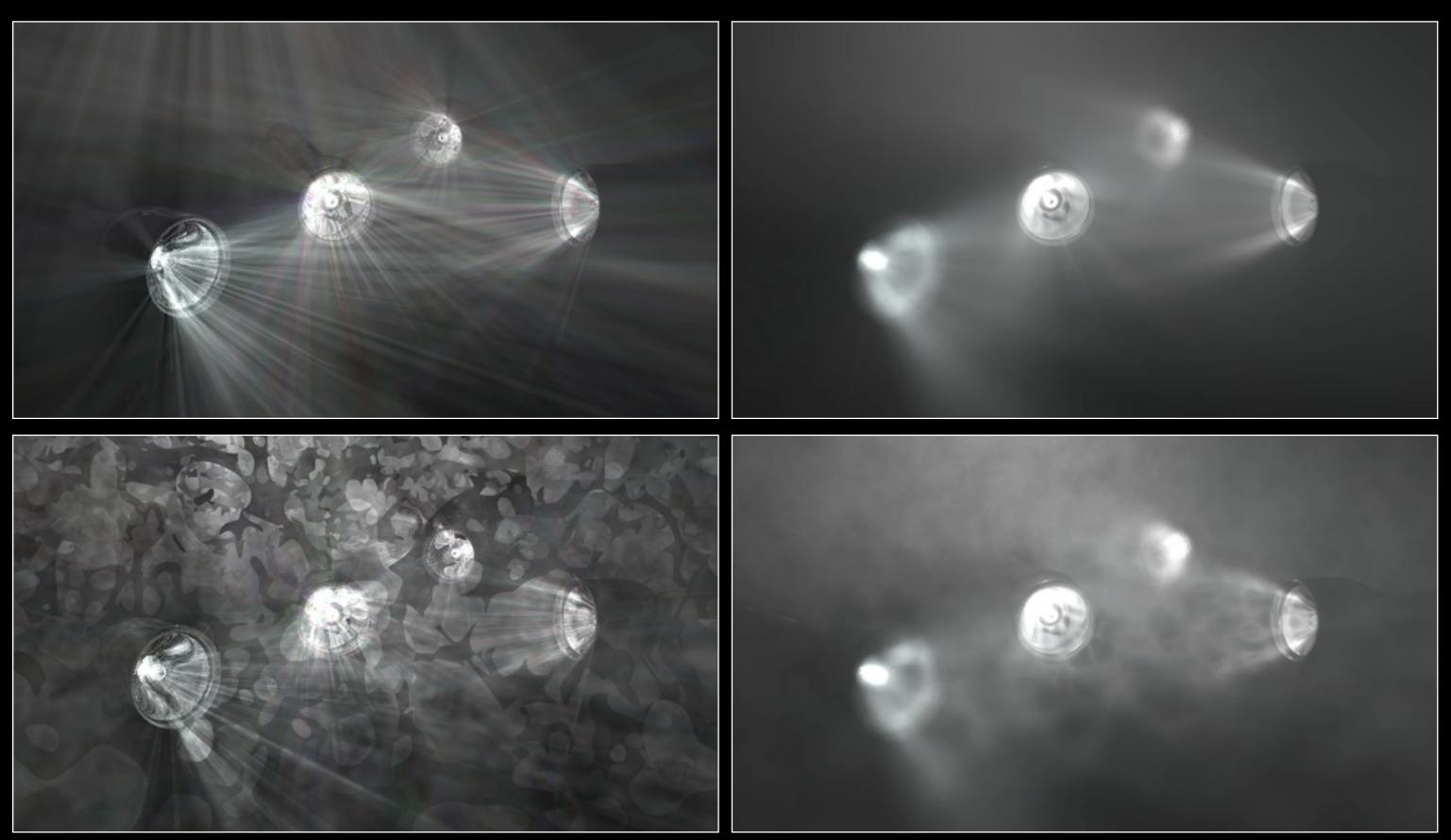
Average of Passes 1..32

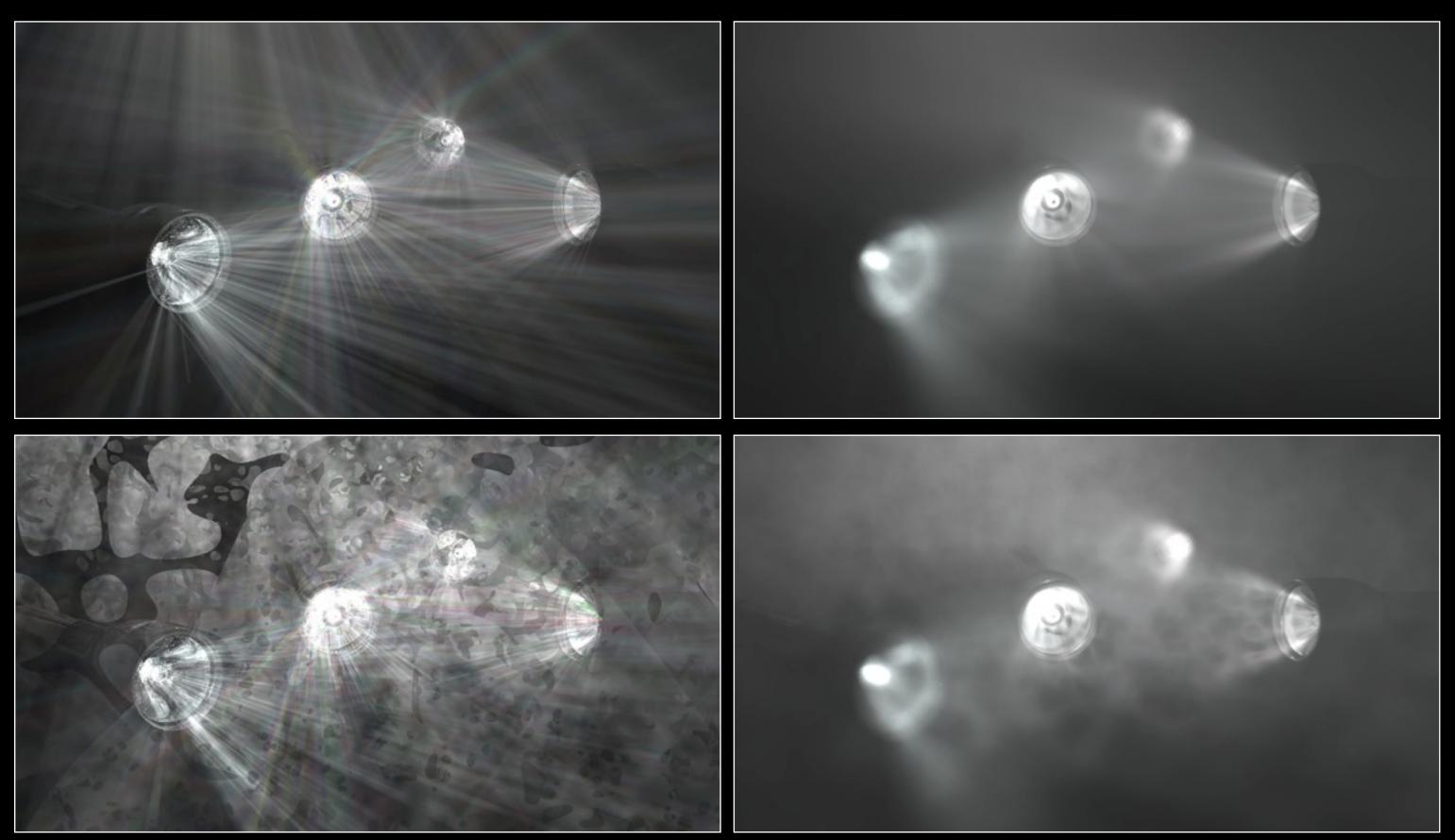


Pass 64

Average of Passes 1..64







## **FLASHLIGHTS**

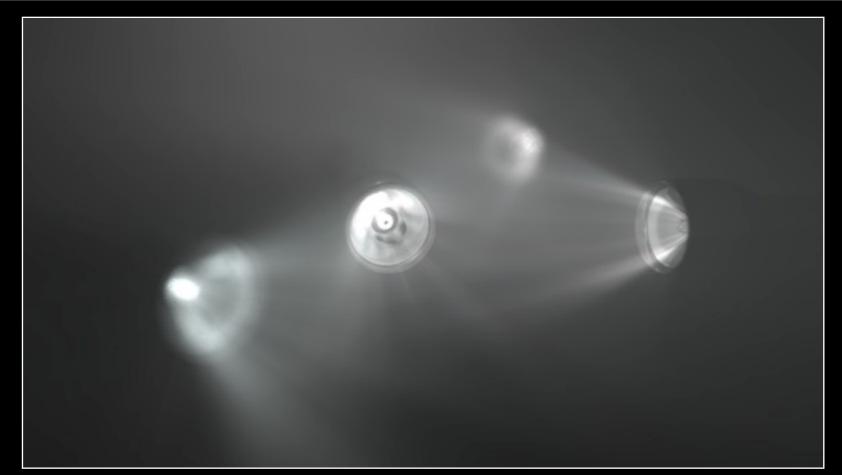
1280x720, Depth-of-Field

Homogeneous
2.1M Photon Beams
8 minutes

Heterogeneous

2.1M Photon Beams

10.8 minutes





## **FLASHLIGHTS**

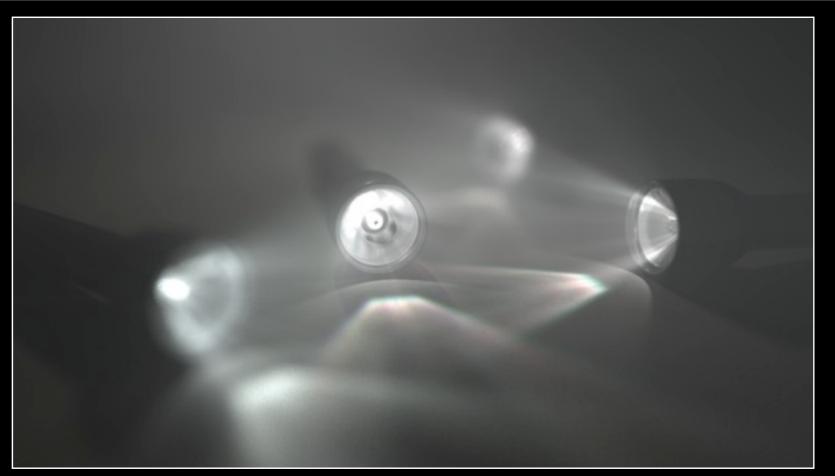
1280x720, Depth-of-Field

Homogeneous
2.1M Photon Beams
8 minutes

Heterogeneous

2.1M Photon Beams

10.8 minutes

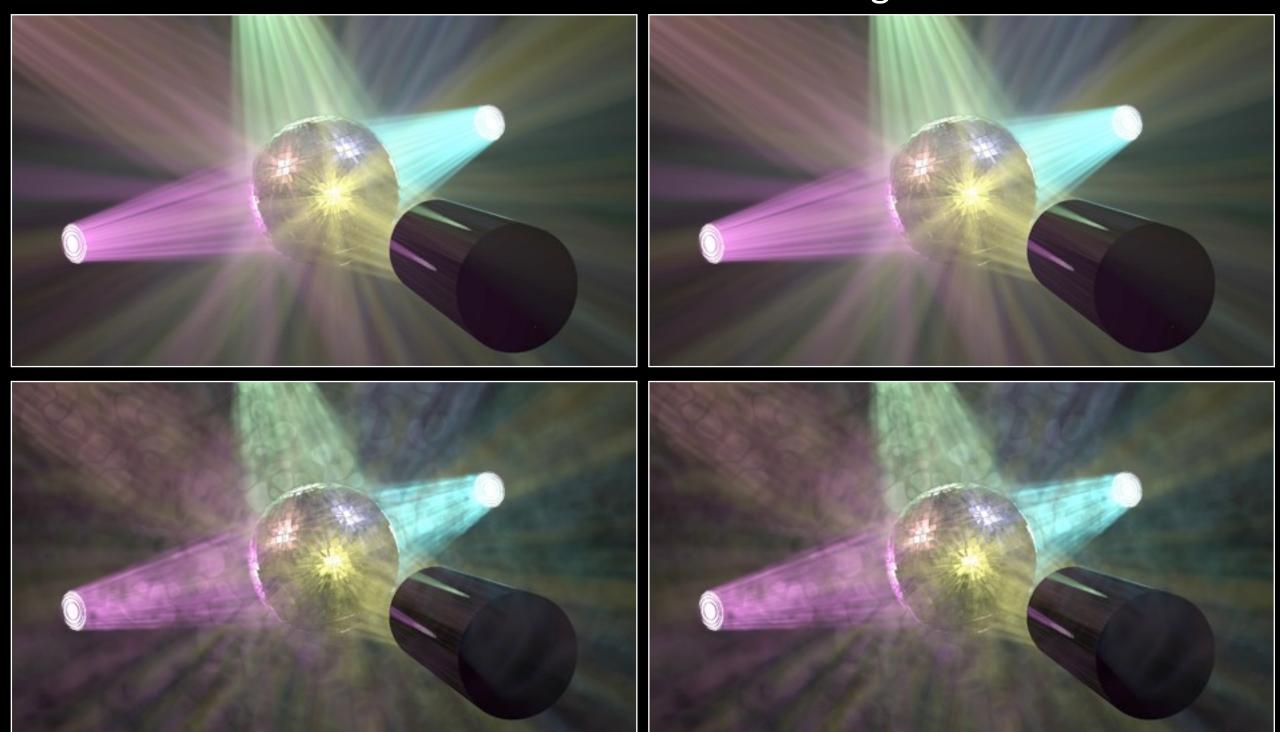




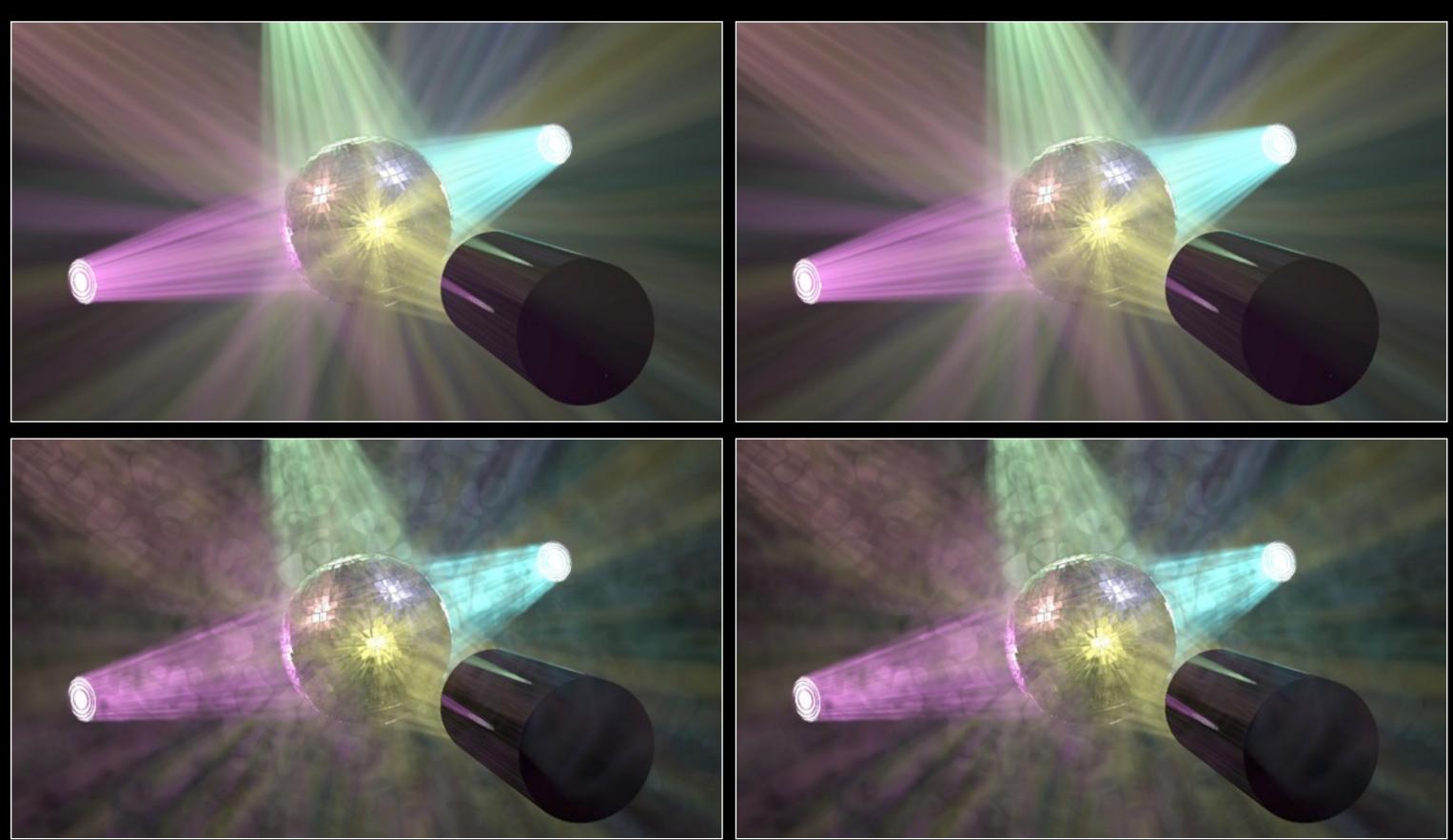
## DISCO

1280x720, Depth-of-Field

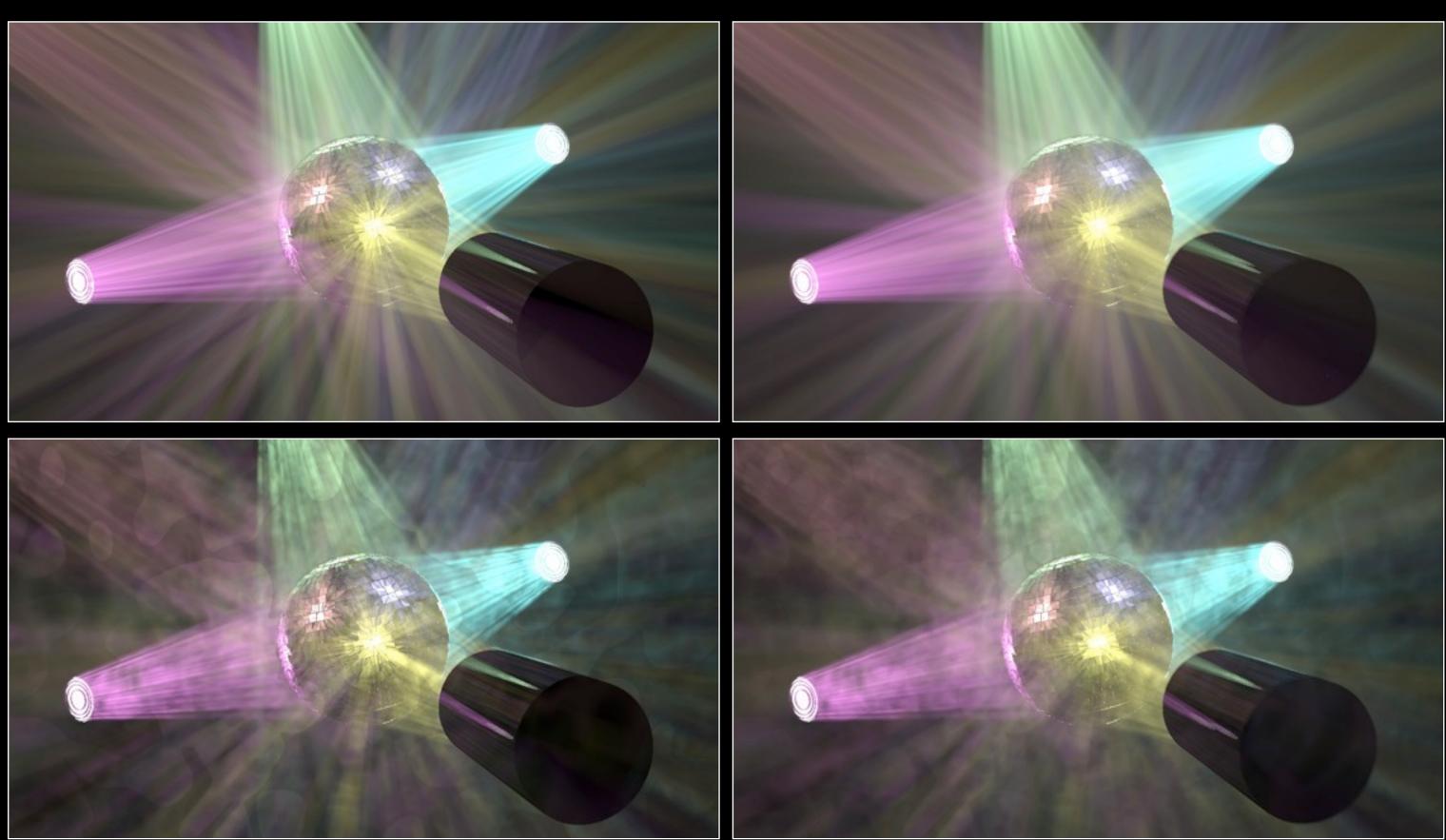
Pass 1



#### Pass 1

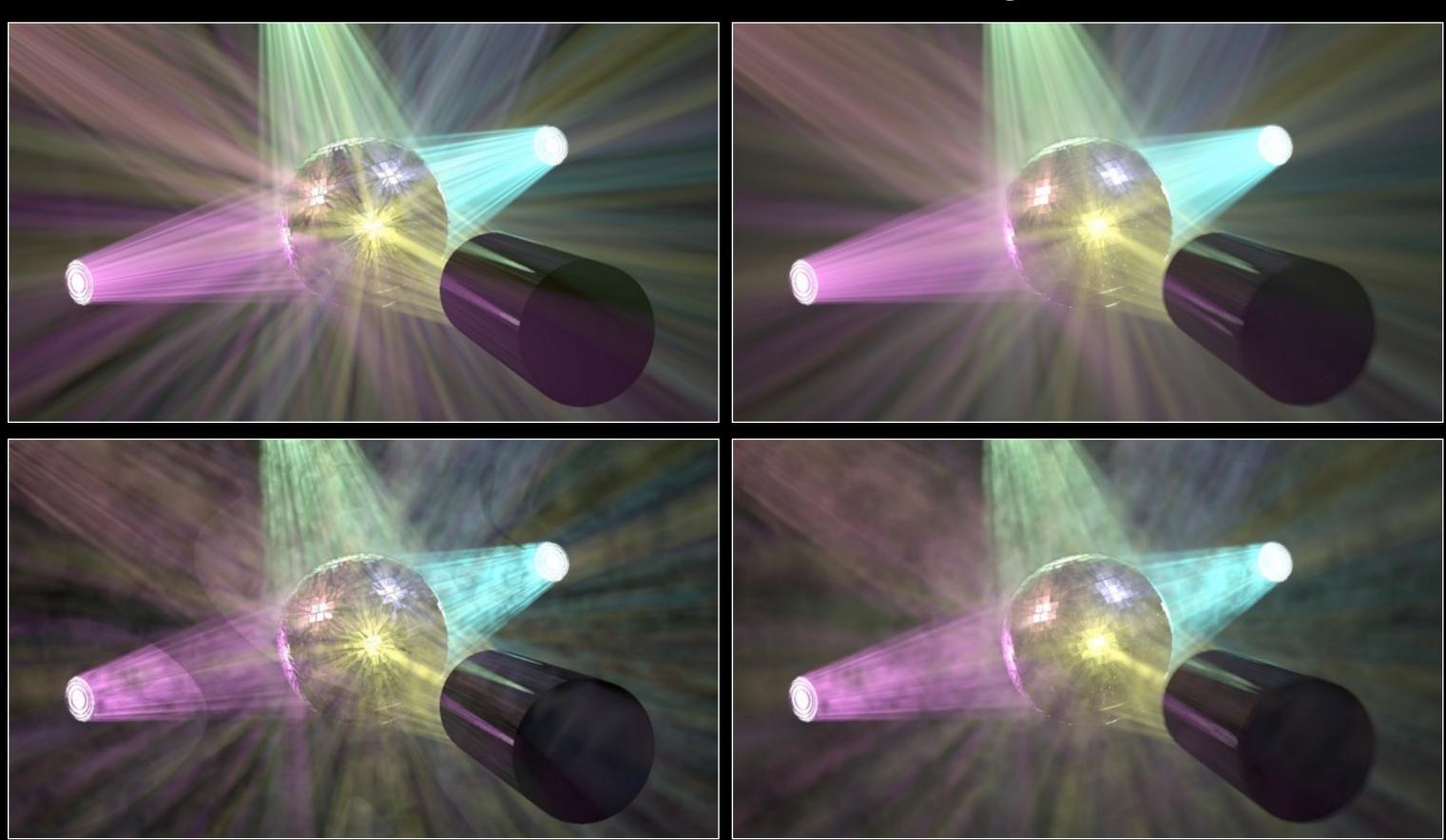


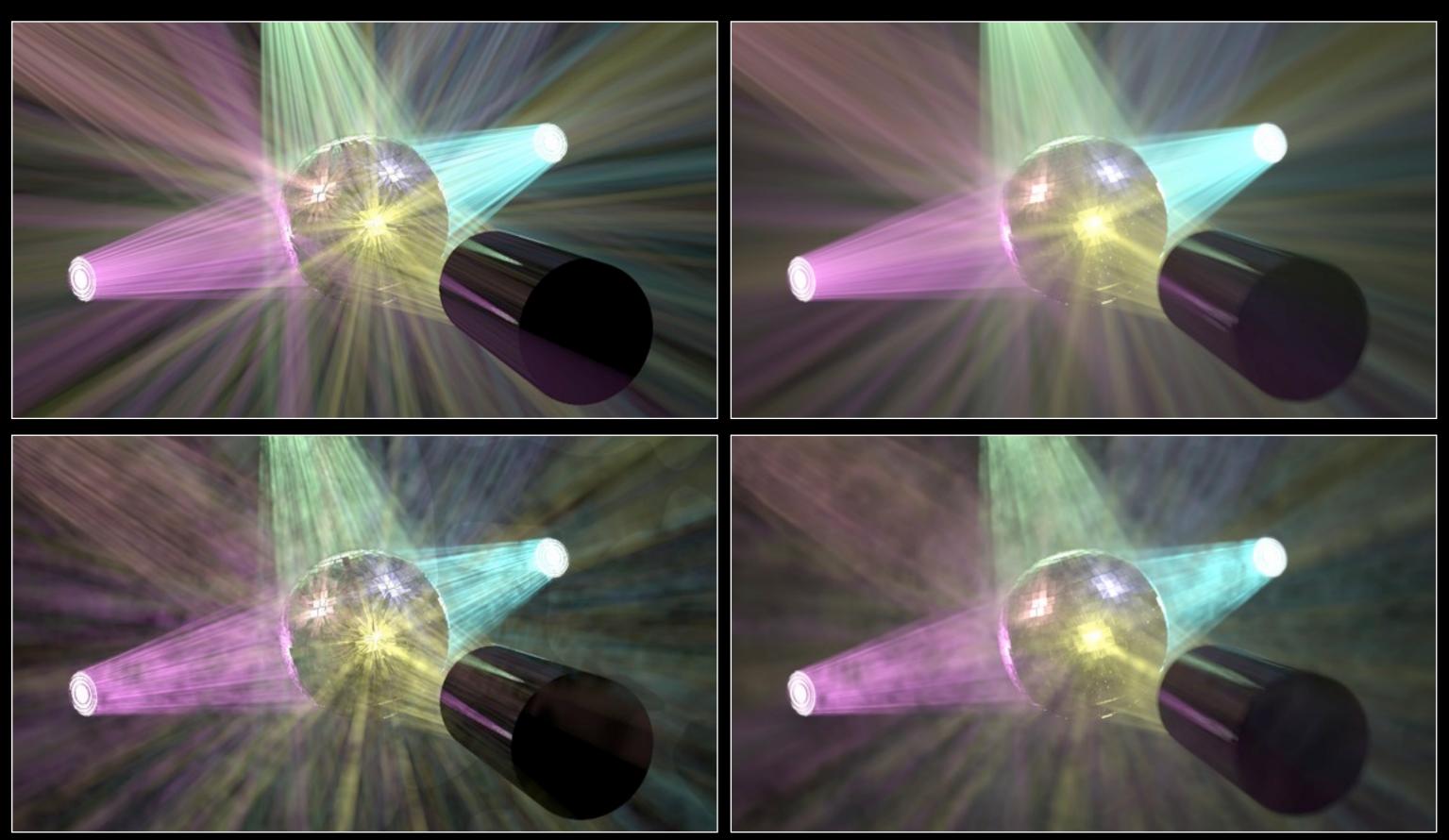
#### Pass 2



Pass 4

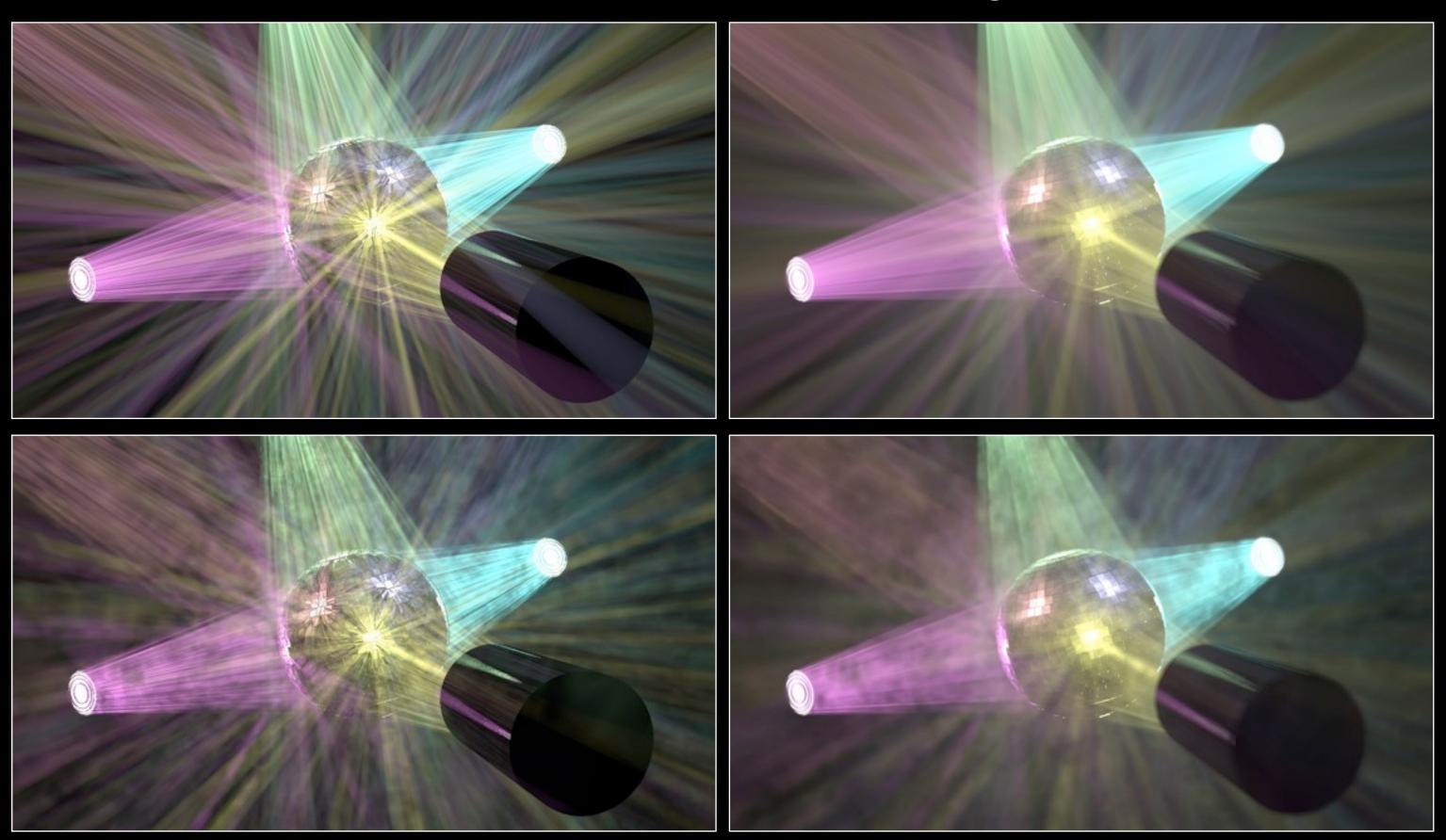
Average of Passes 1..4

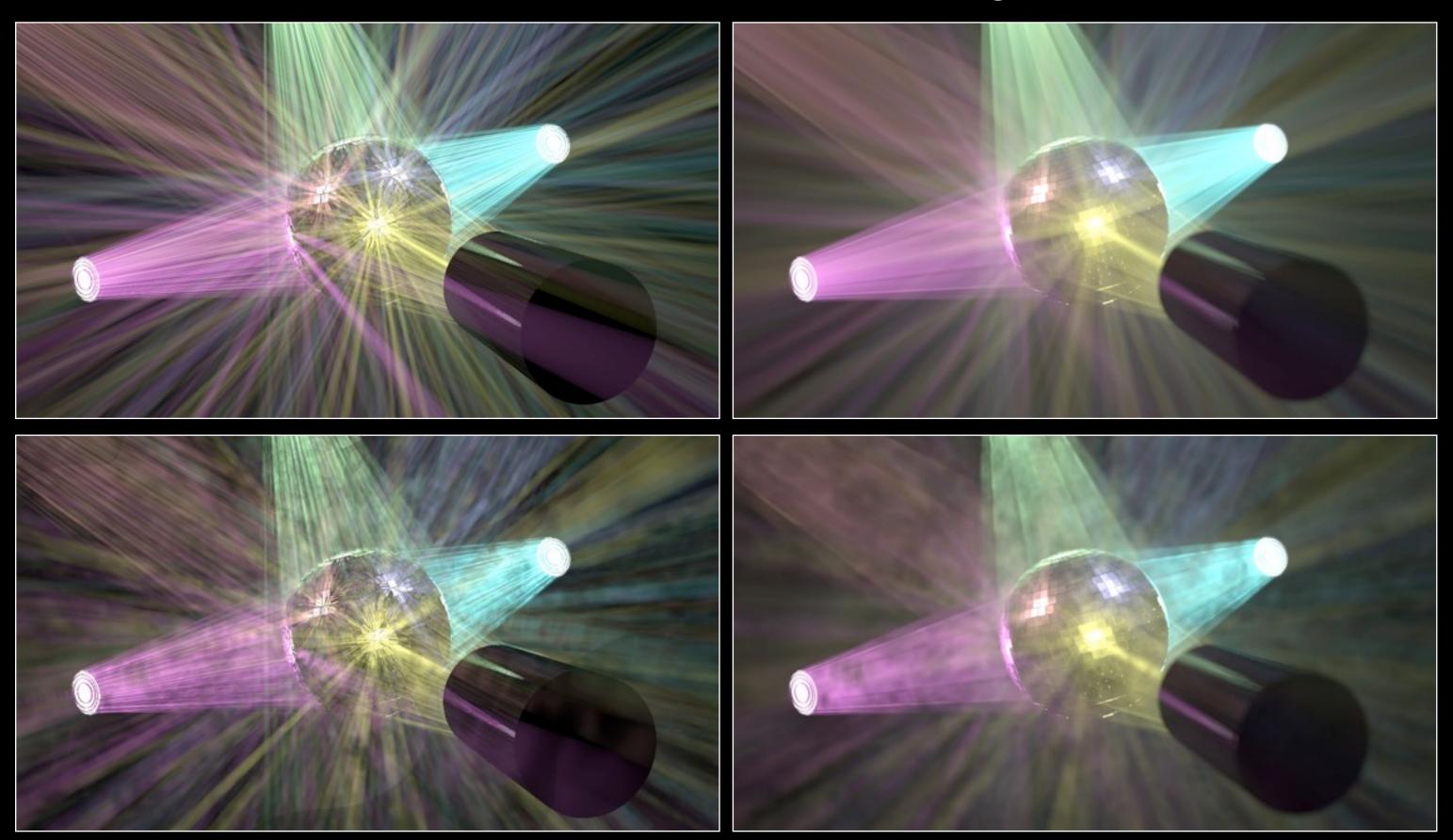




Pass 16

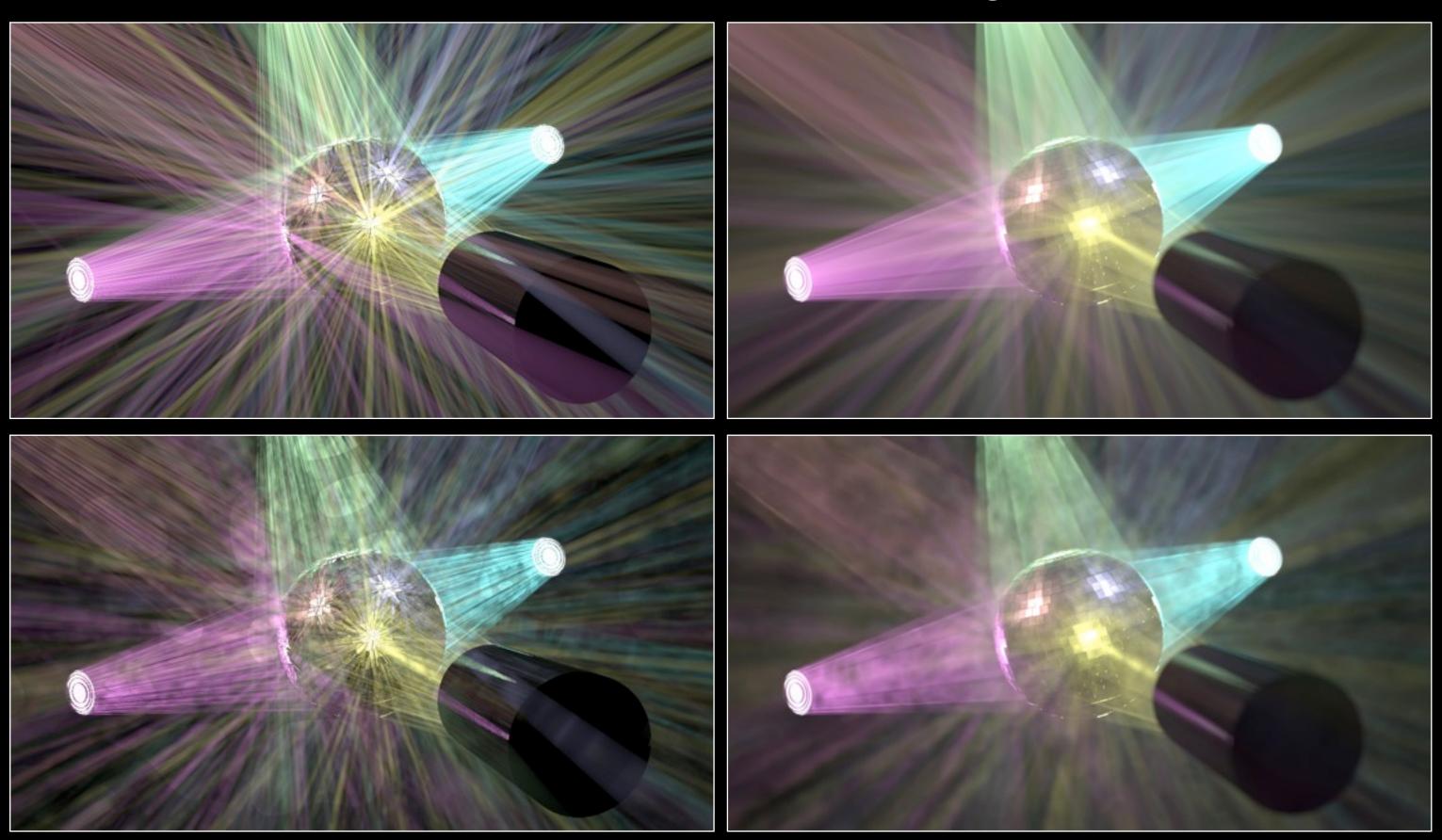
Average of Passes 1..16

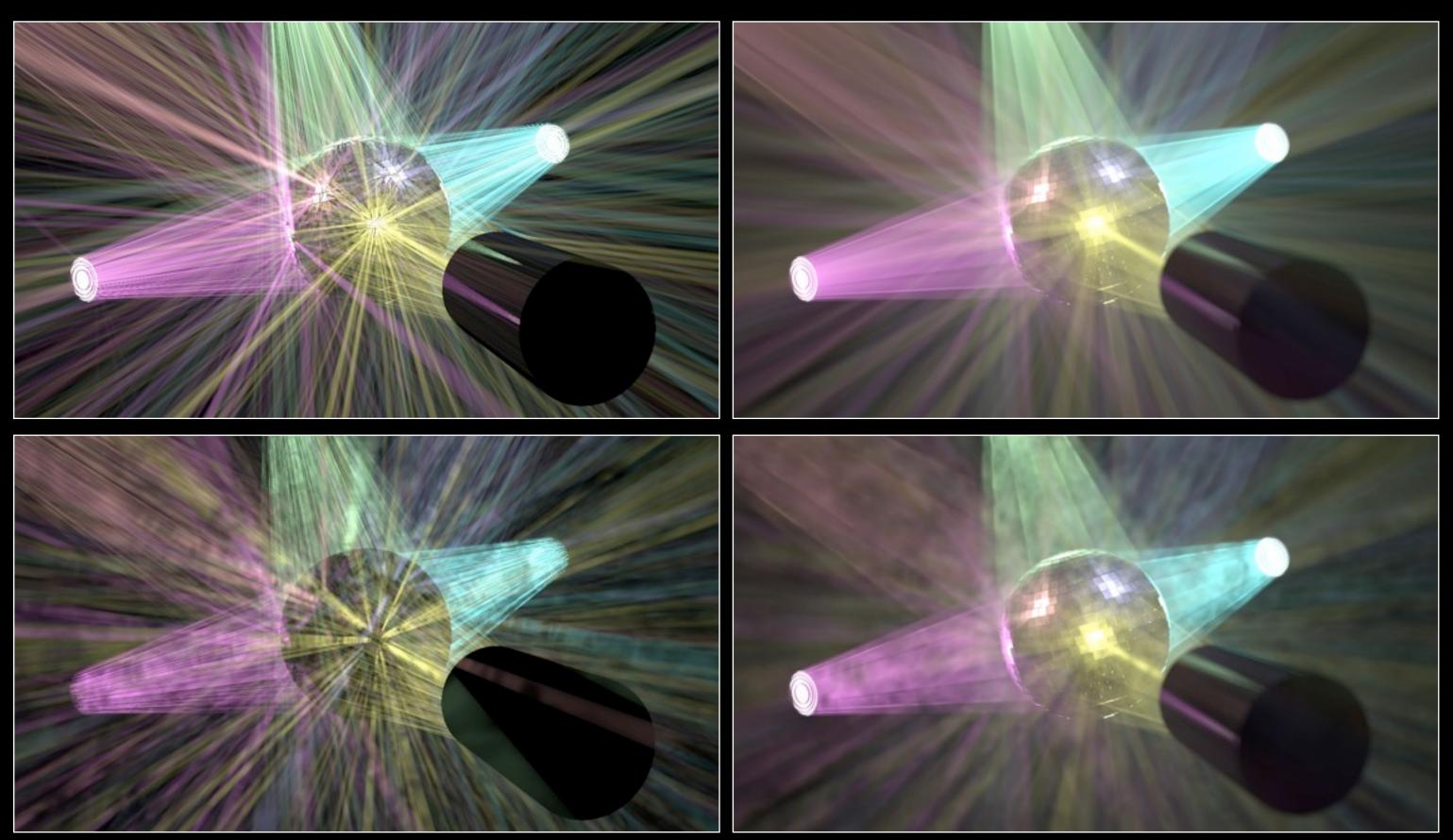


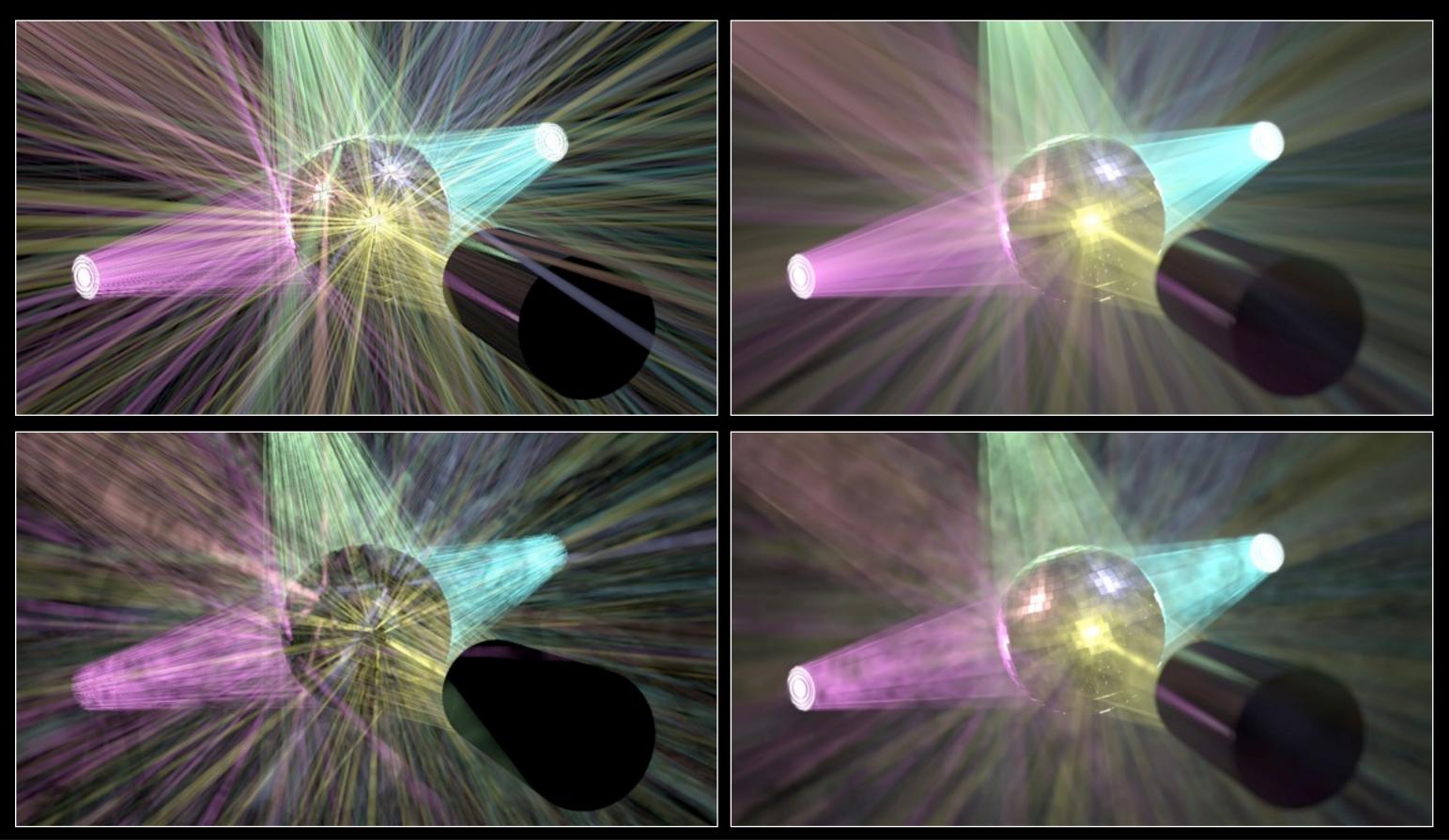


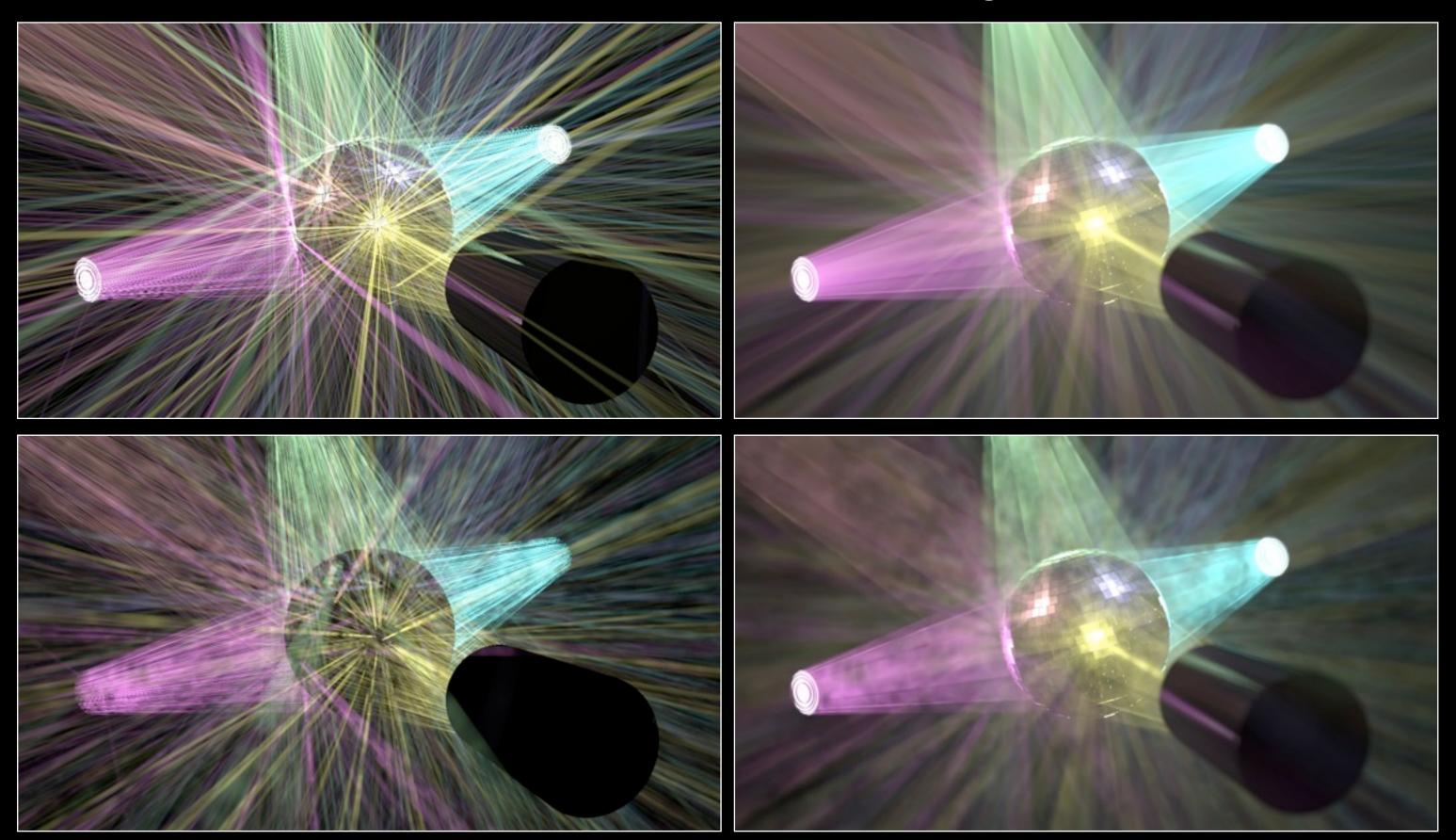
Pass 64

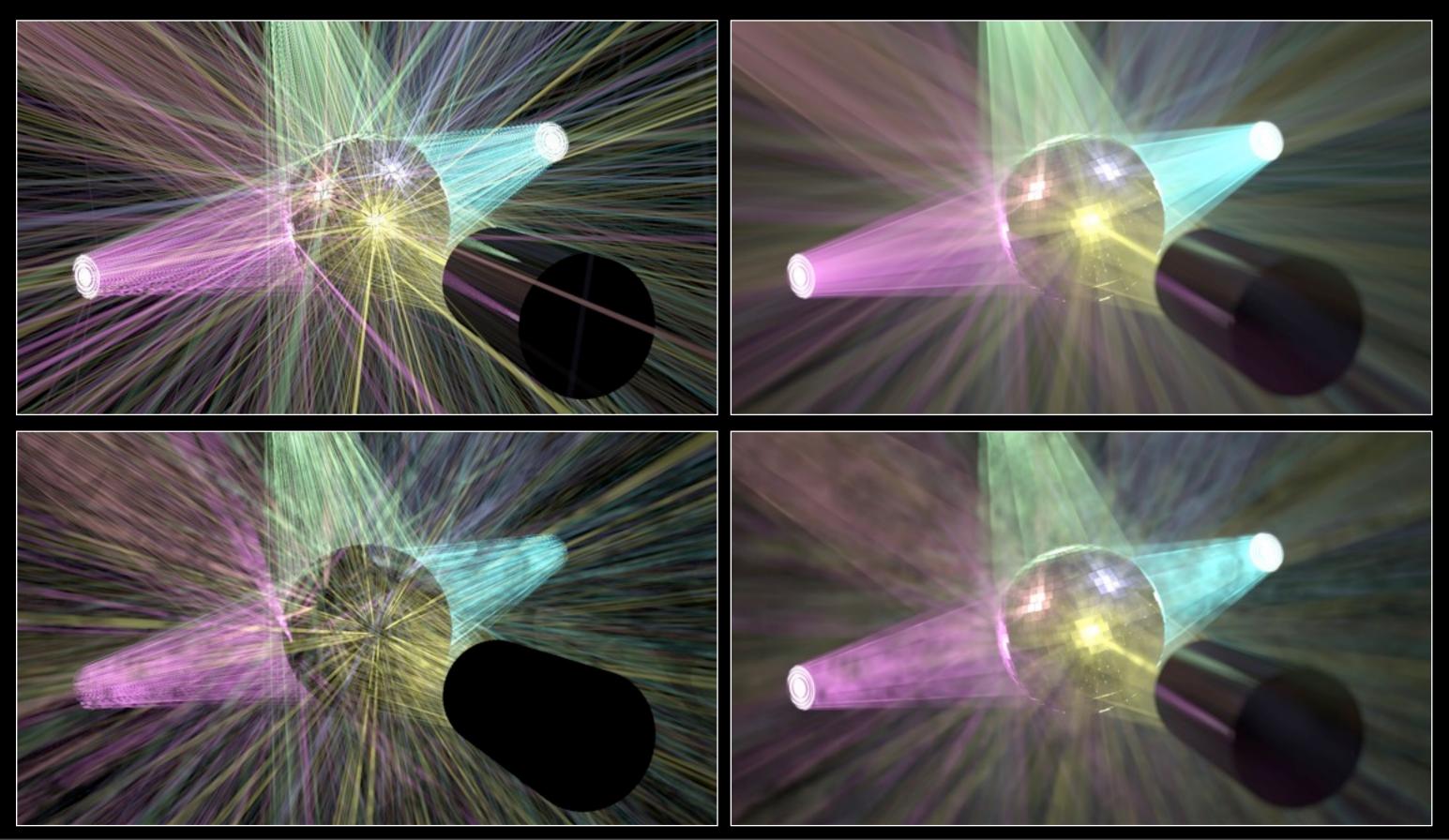
Average of Passes 1..64











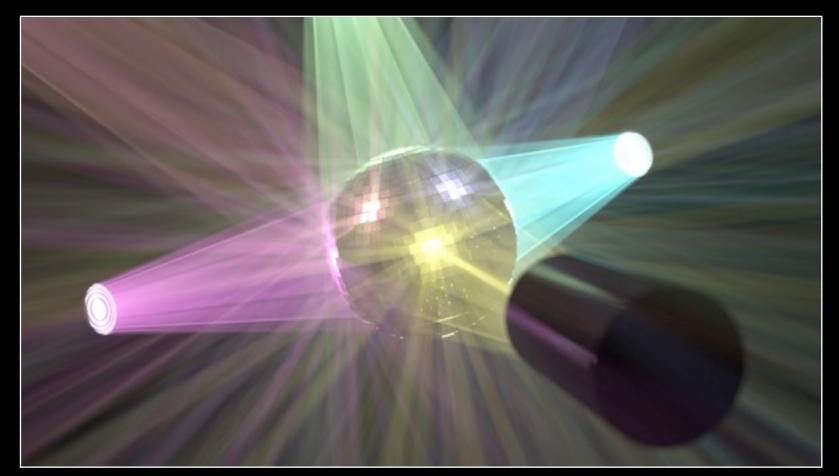
## **DISCO**1280x720, Depth-of-Field

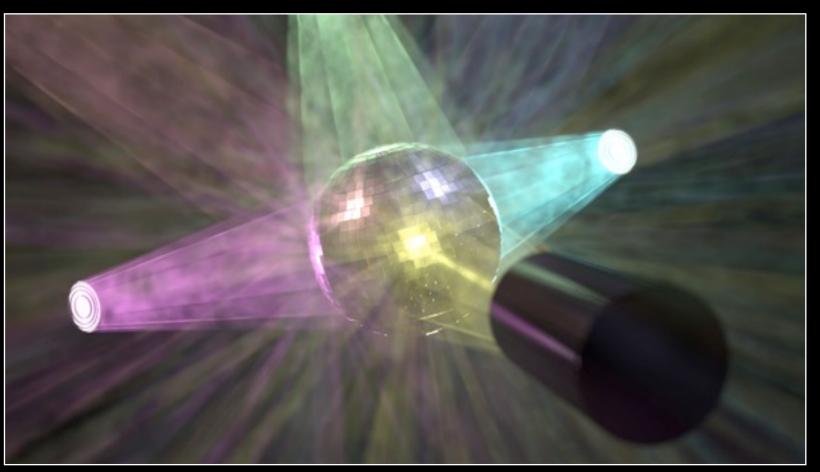
Homogeneous
19.67M Photon Beams
3 minutes

Heterogeneous

16.19M Photon Beams

5.7 minutes





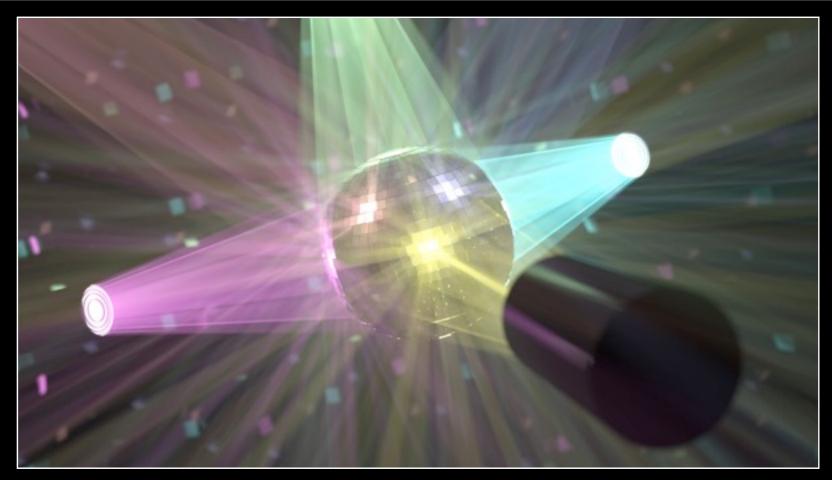
## **DISCO**1280x720, Depth-of-Field

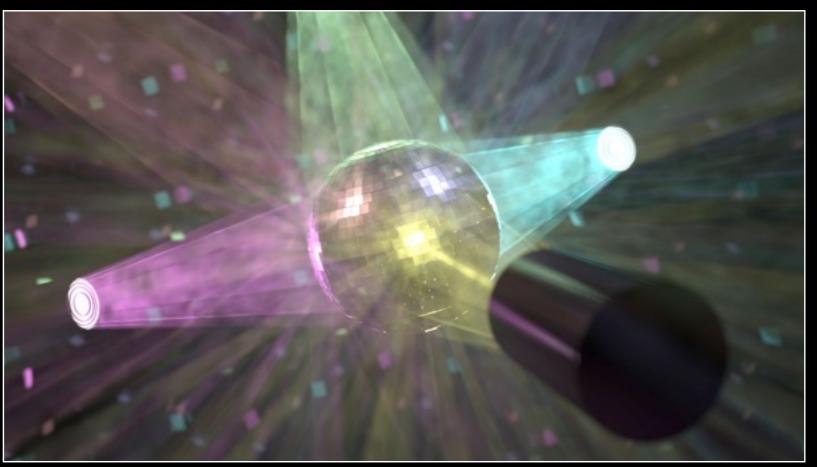
Homogeneous
19.67M Photon Beams
3 minutes

Heterogeneous

16.19M Photon Beams

5.7 minutes





# USER INTERACTION Hybrid CPU/GPU Implementation





Homogeneous

Heterogeneous

**Real-time capture** 

