



Once-more scattered next event estimation

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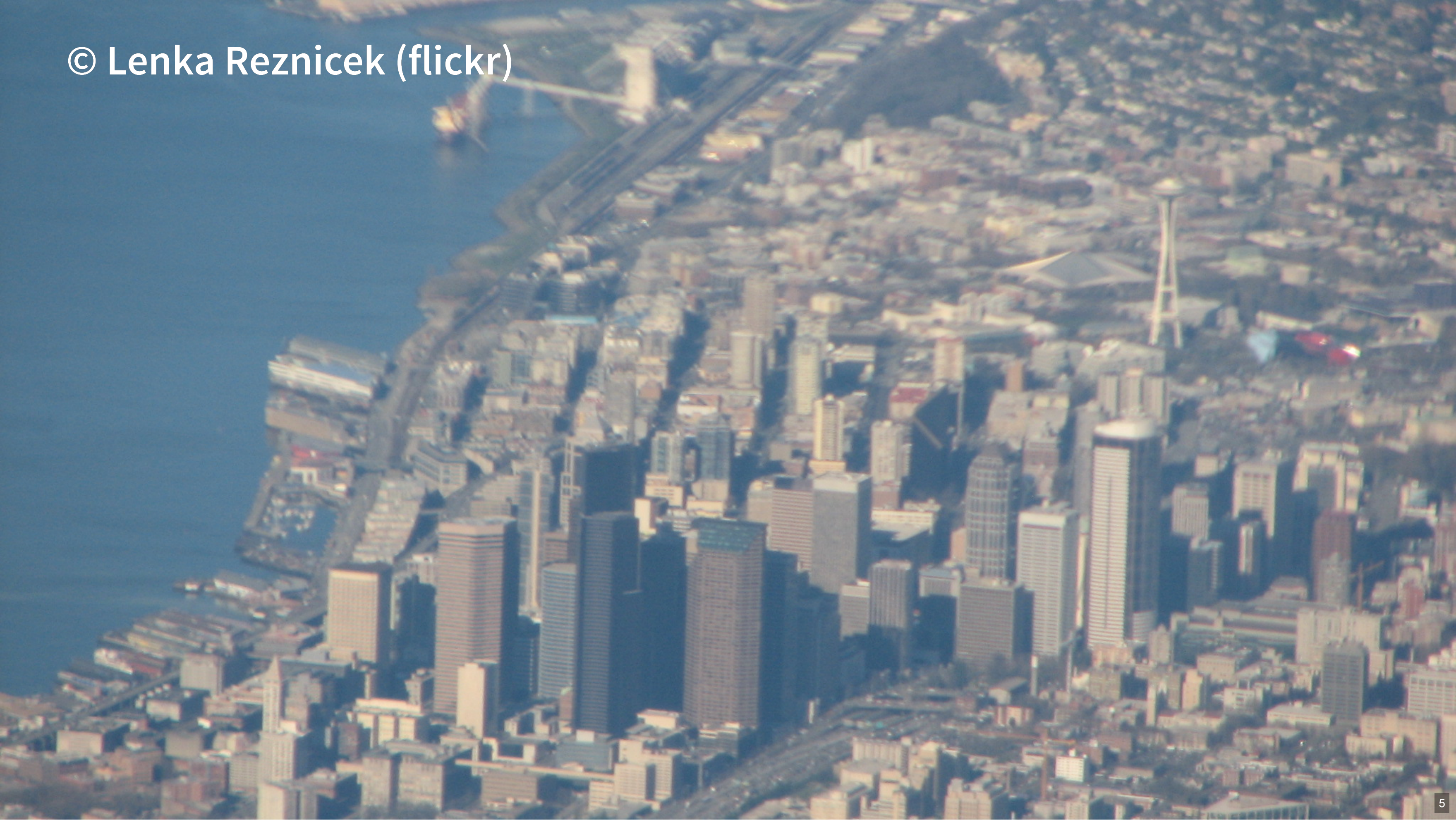
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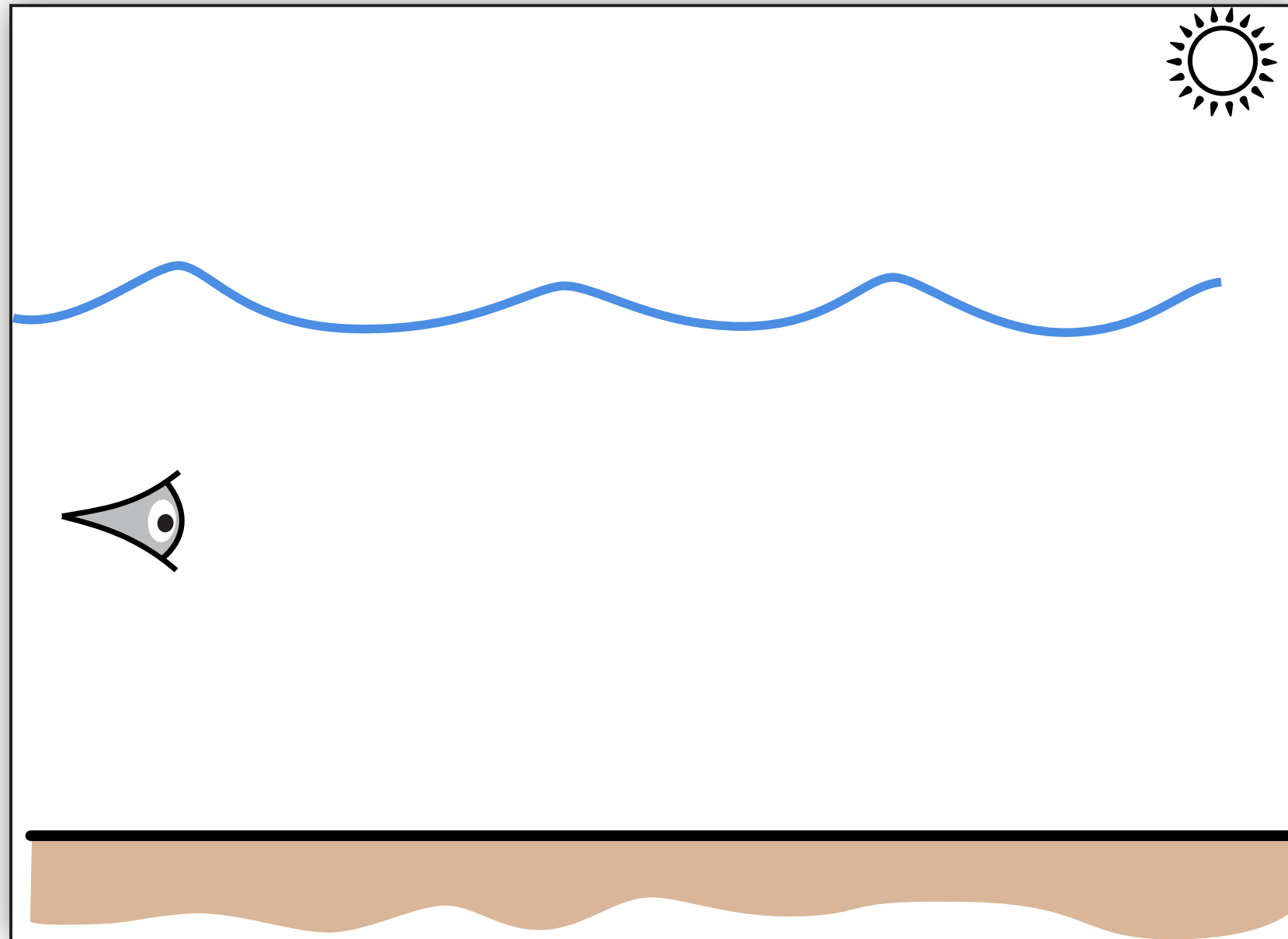


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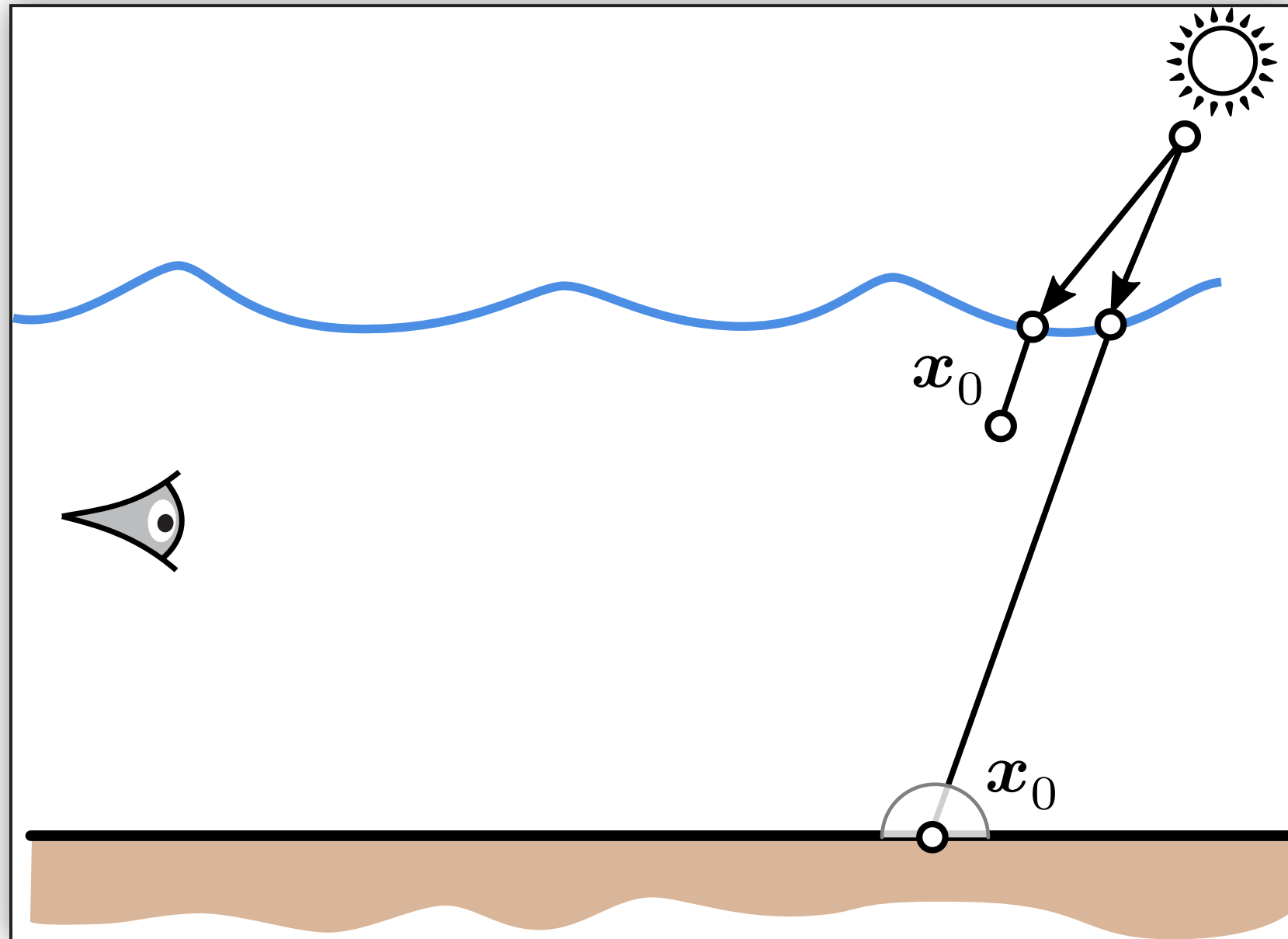
Which transport paths create this effect?

- ▶ Subtle blurring with depth
- ▶ Let's take the underwater example:



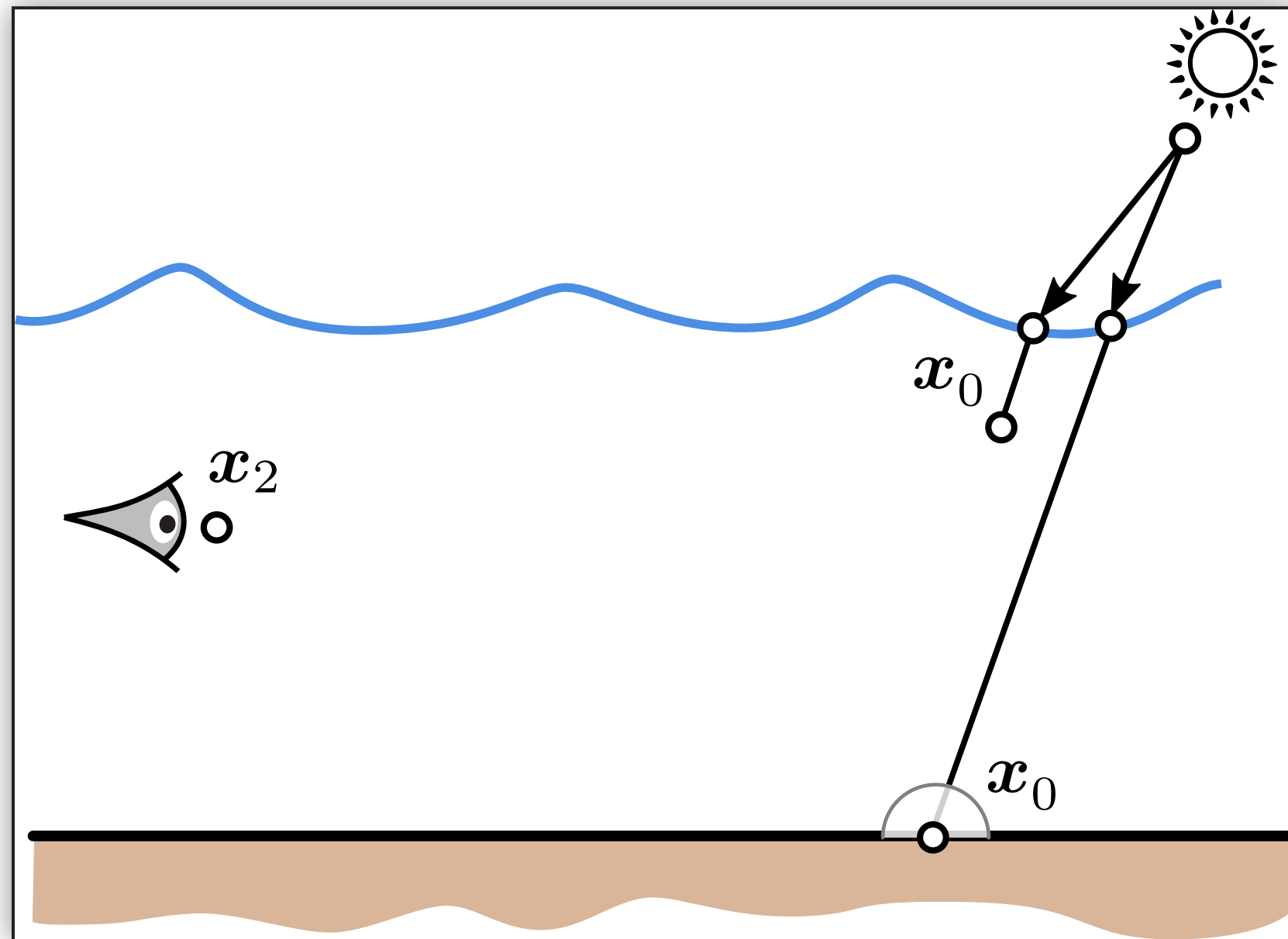
Which transport paths create this effect?

- ▶ Let's take the underwater example:
- ▶ Light travels from the sun to under water



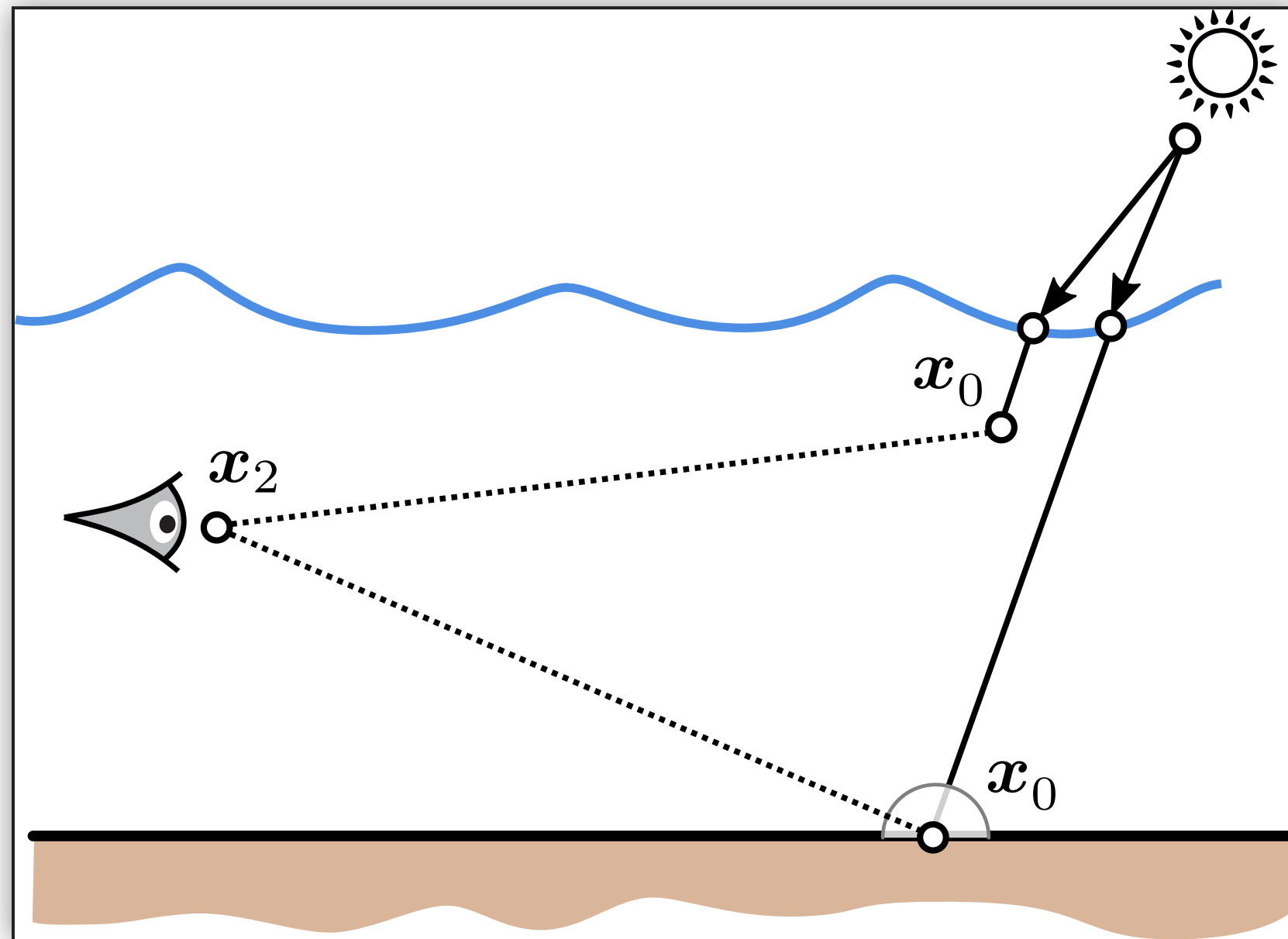
Which transport paths create this effect?

- ▶ At each endpoint x_0 :
- ▶ How do we connect endpoints to x_2 on the eye?



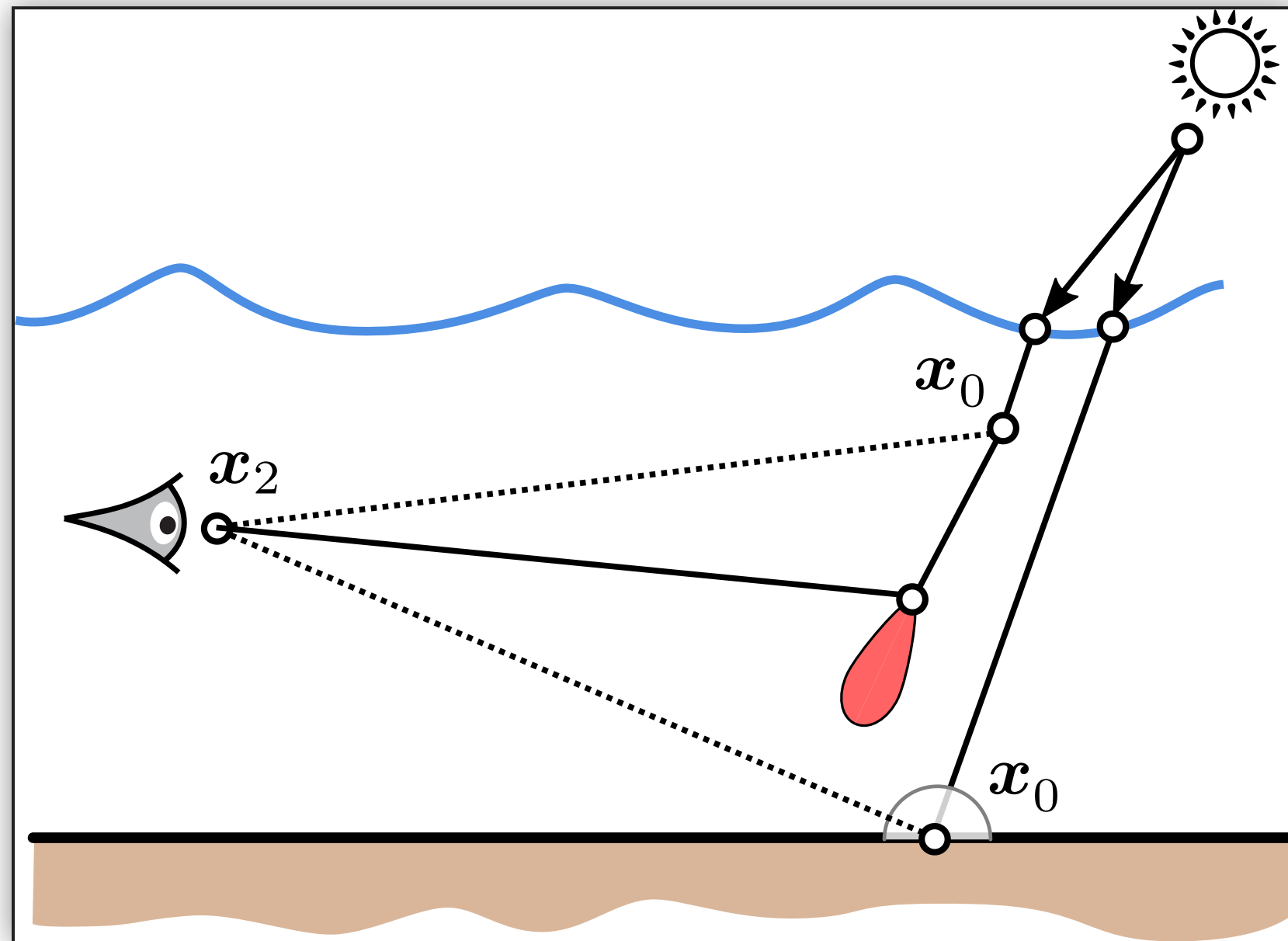
Which transport paths create this effect?

- ▶ Classic next event estimation (NEE)?
- ▶ Results in sharp images, no blur!



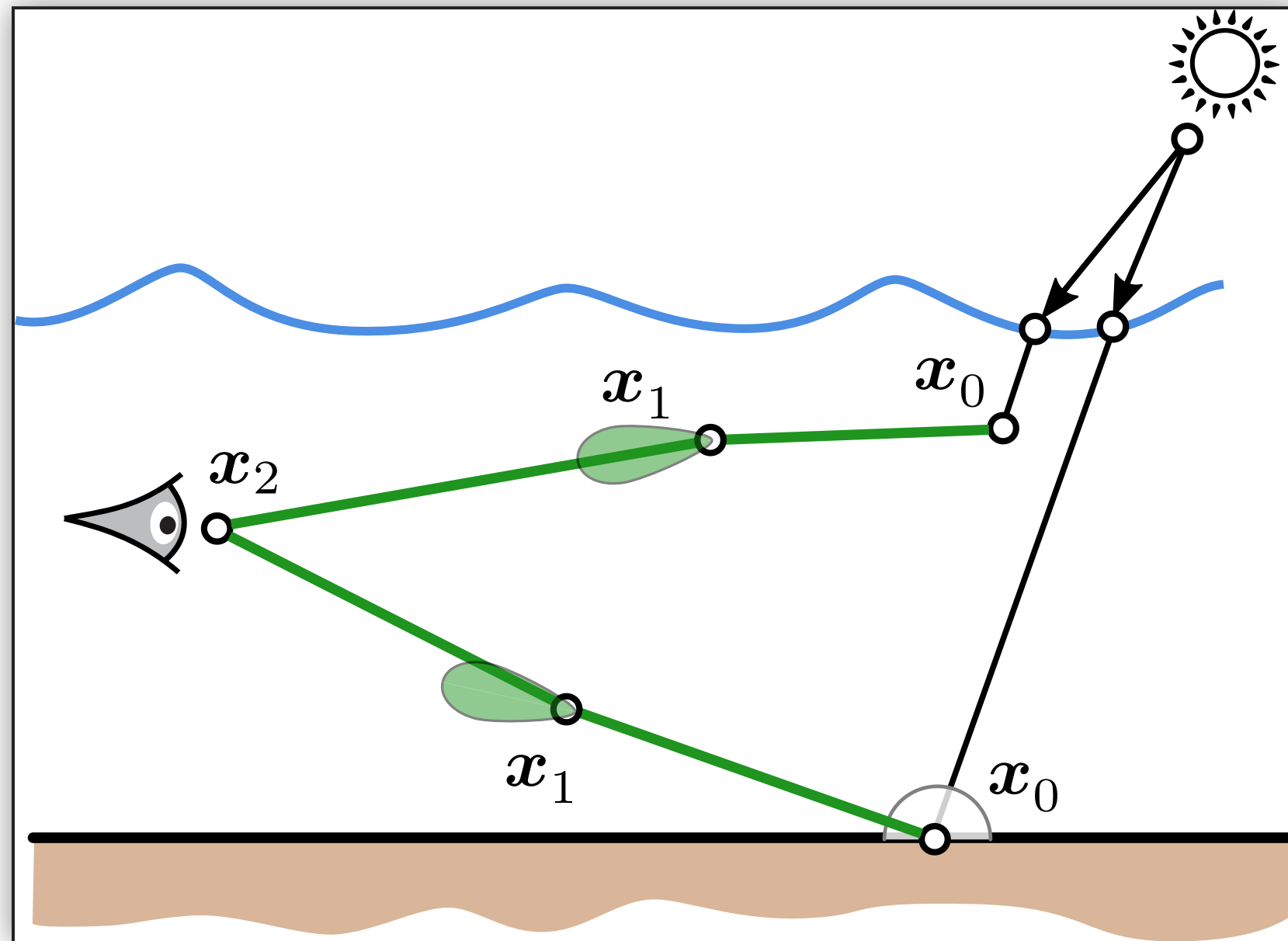
Which transport paths create this effect?

- ▶ Extend the path once more before NEE?
- ▶ Also important, but visually different feature



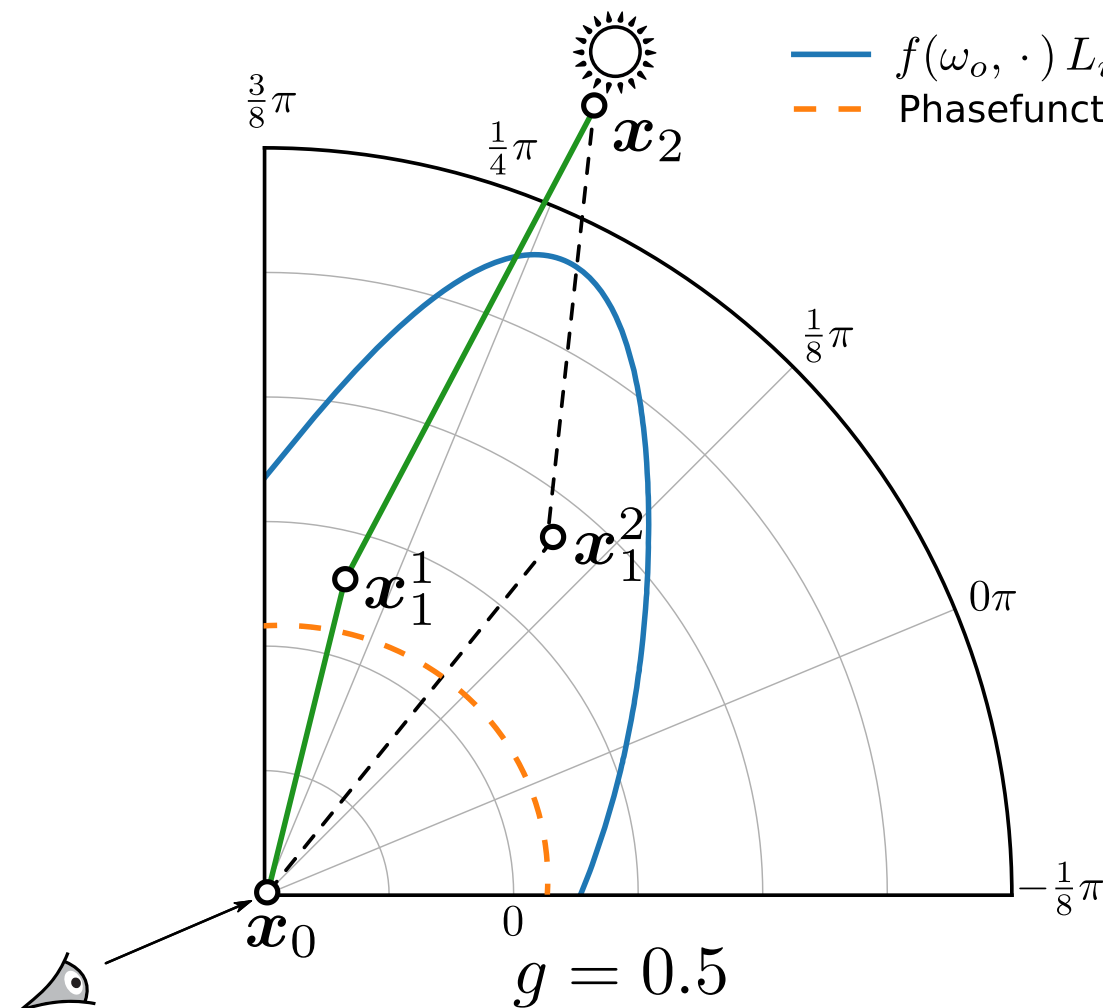
Which transport paths create this effect?

- ▶ Achieve characteristic volumetric blur:
- ▶ Need to sample phase function at x_1 !



How different are the two effects?

for moderately forward scattering phase function



- ▶ Actually the same effect (product of light and phase function)
- ▶ We know how to sample it: via joint importance sampling/tabulation

[GKH*13] Georgiev et al., “Joint importance sampling of low-order volumetric scattering”, SIGGRAPH Asia 2013.

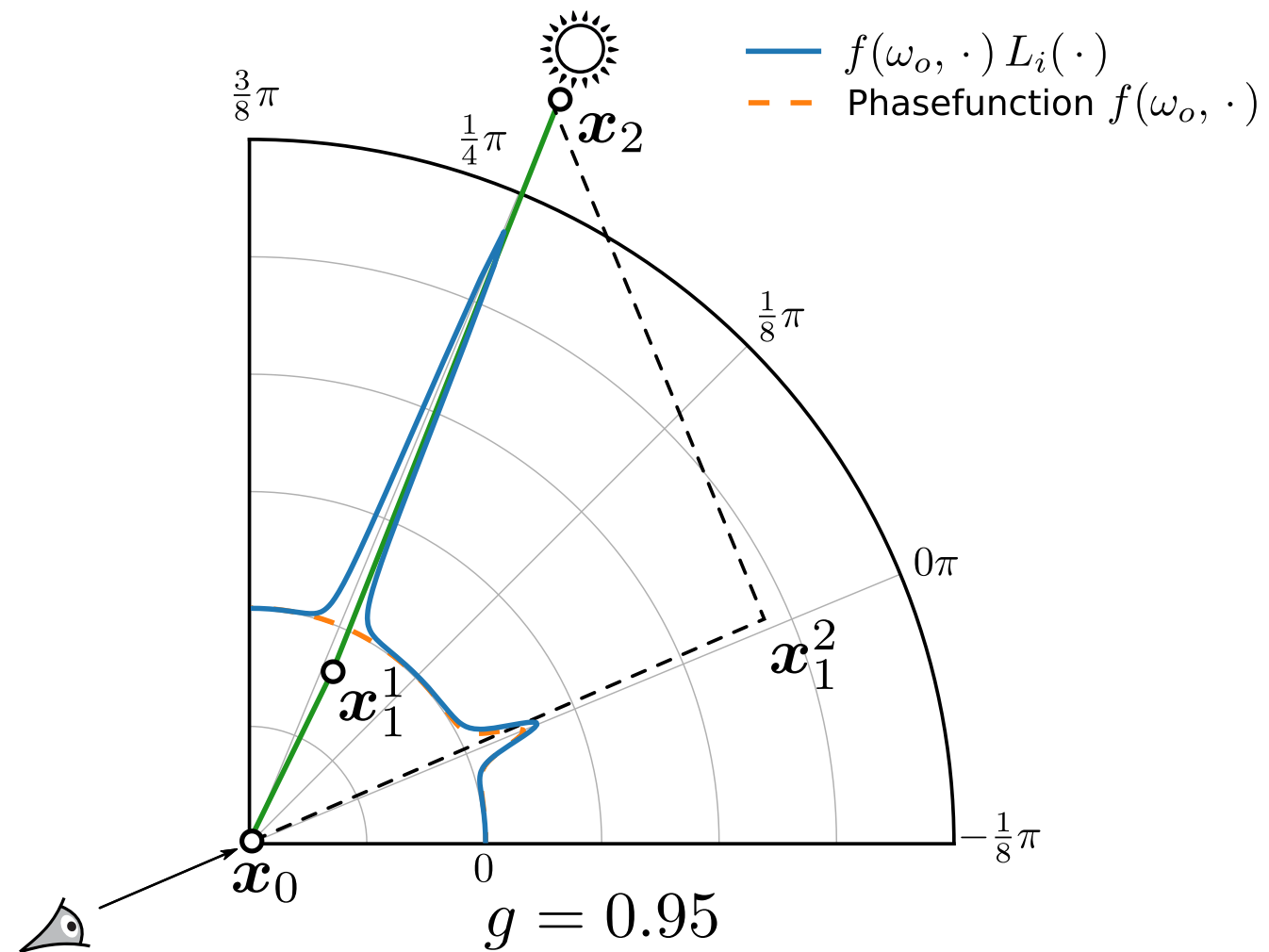
- ▶ Or evaluate analytically via series expansion of the phase function

[PSP10] Pegoraro et al., “A closed-form solution to single scattering for general phase functions and light distributions”, EGSR 2010.

- ▶ Blue line: unit test collected histogram of contributions over all \mathbf{x}_1 , plotted over outgoing angle, contains $L_i \cdot f_s$

How different are the two effects?

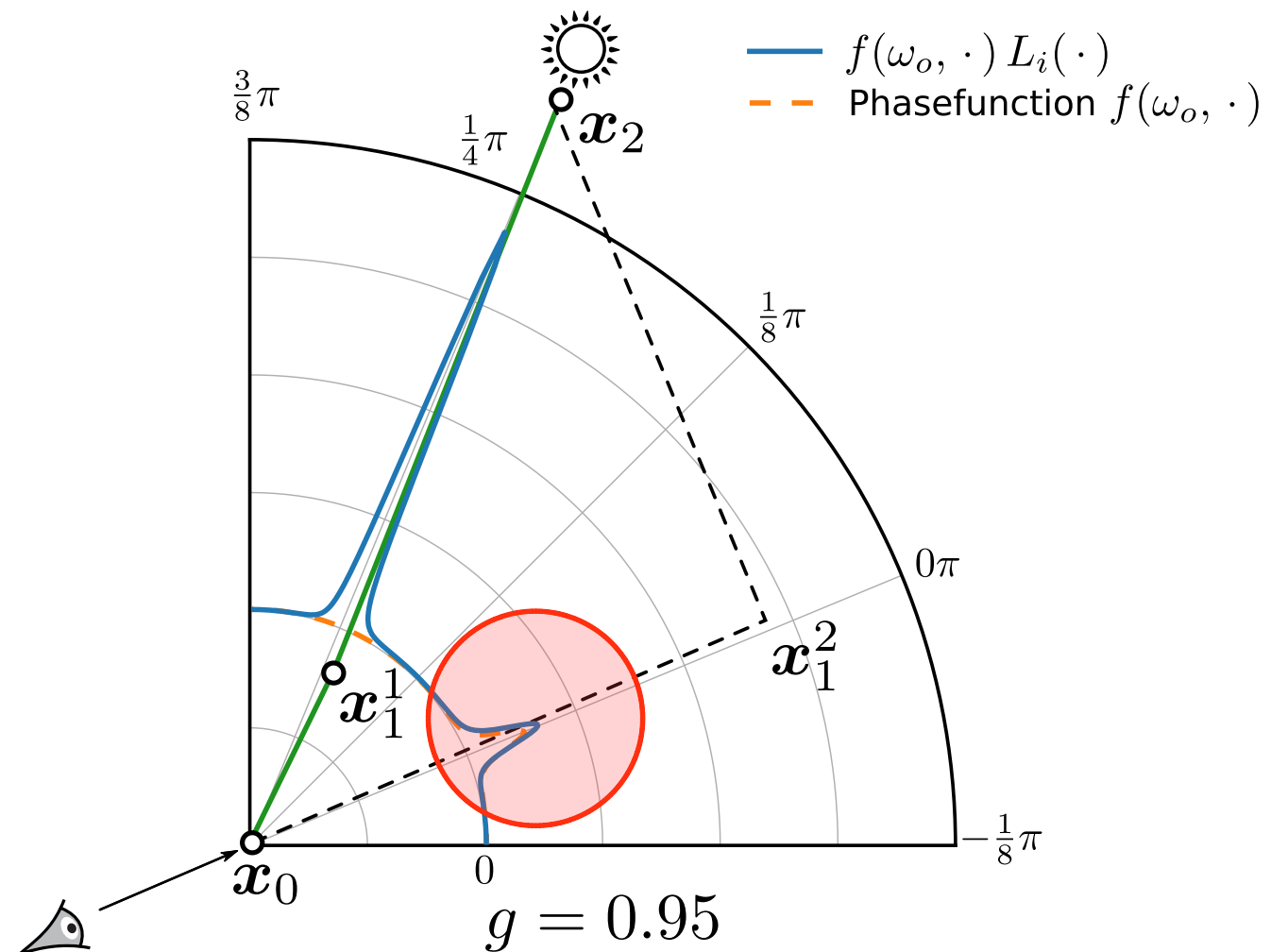
for highly forward scattering phase function



very!

How different are the two effects?

for highly forward scattering phase function

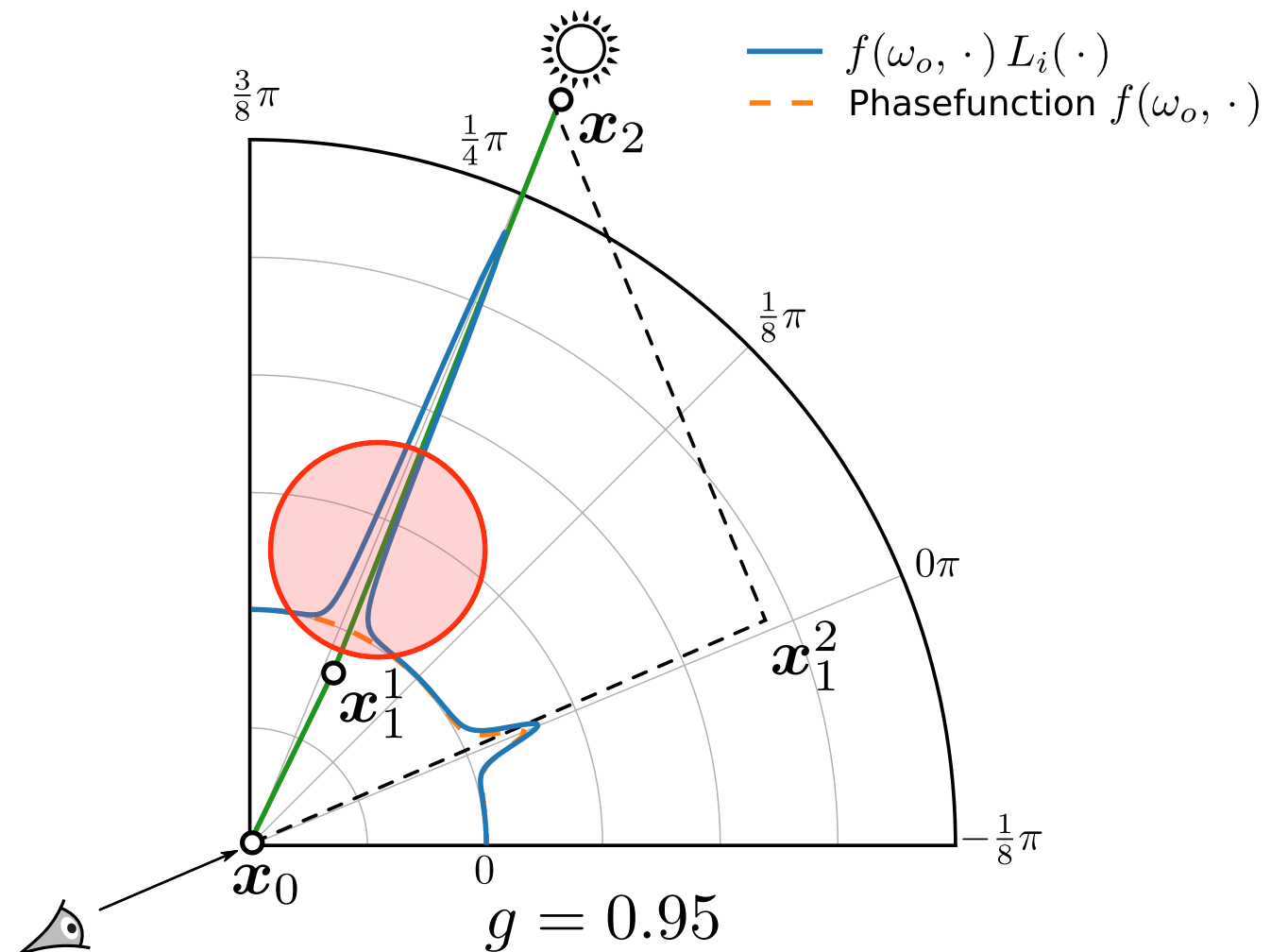


- ▶ Can sample phase function (marked peak), together with equiangular for best connection

[KF12] Kulla and Fajardo, "Importance sampling techniques for path tracing in participating media", EGSR 2012.

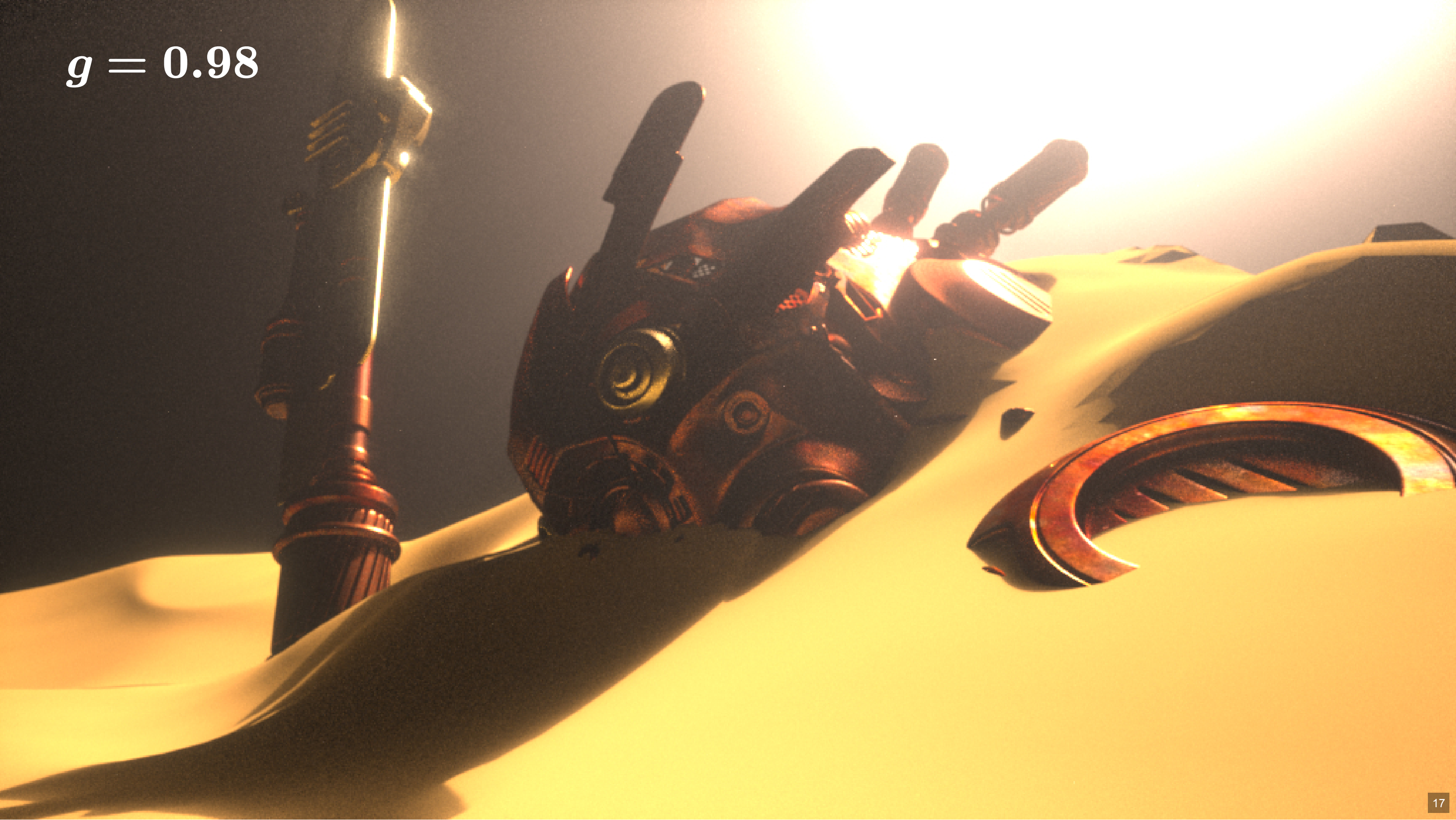
How different are the two effects?

for highly forward scattering phase function



- ▶ Cannot sample the other lobe!
- ▶ This is what we'll do in the remainder of this talk!
- ▶ But is that visually important? What does not-so-peaky look like?

$$g = 0.98$$

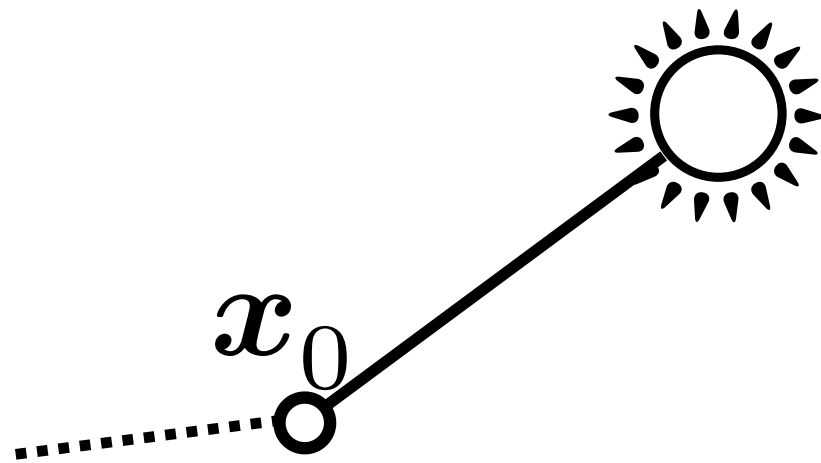


$$g = 0.5$$



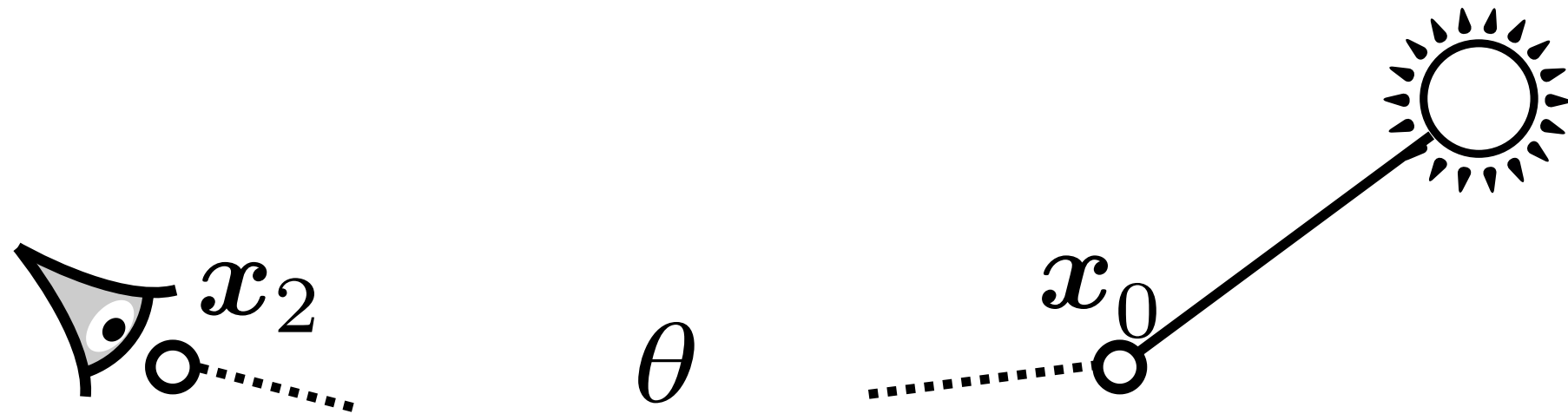
Phase function is most important here!

🔺 Why don't we sample it first?



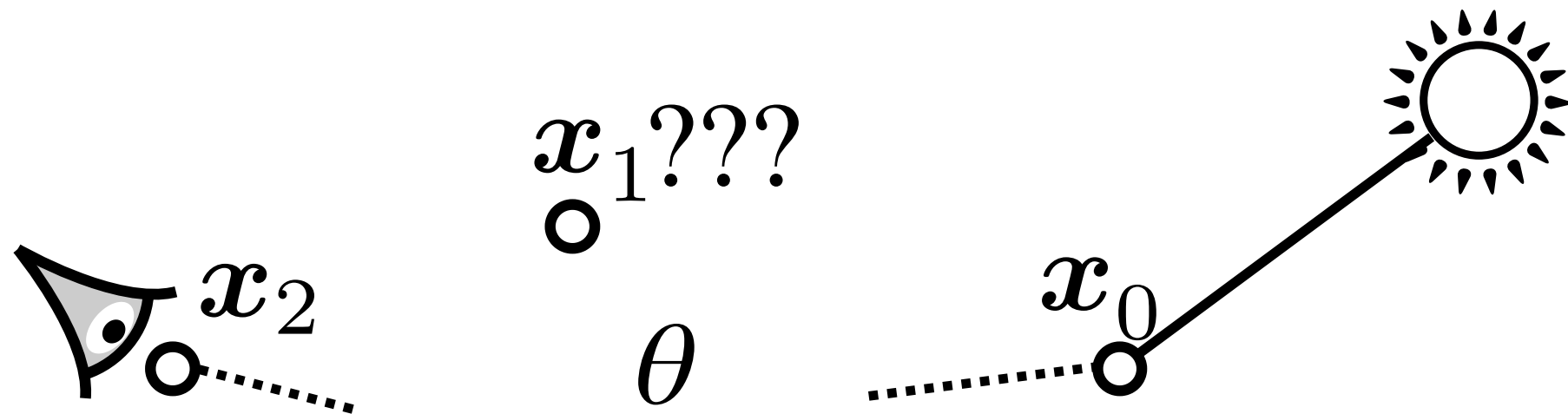
Phase function is most important here!

▶ Why don't we sample it first: fix θ

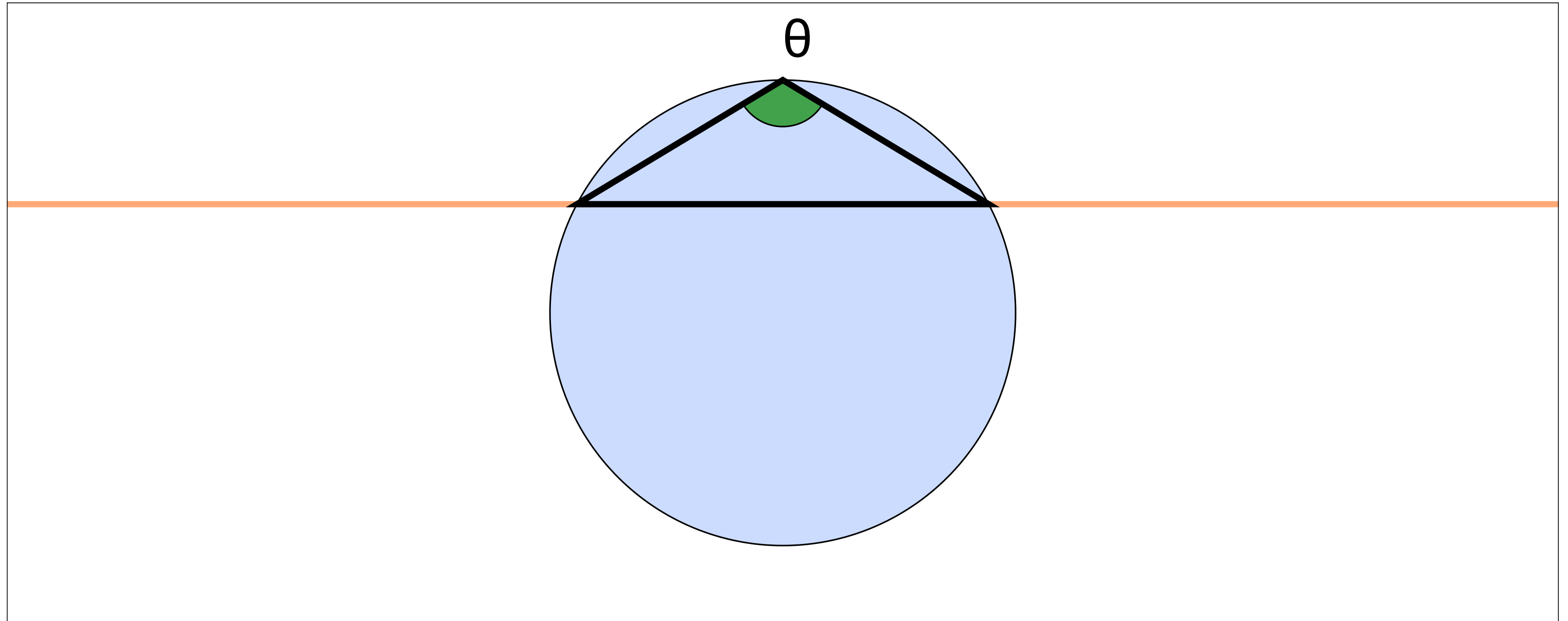


Phase function is most important here!

▶ Where to place x_1 then?



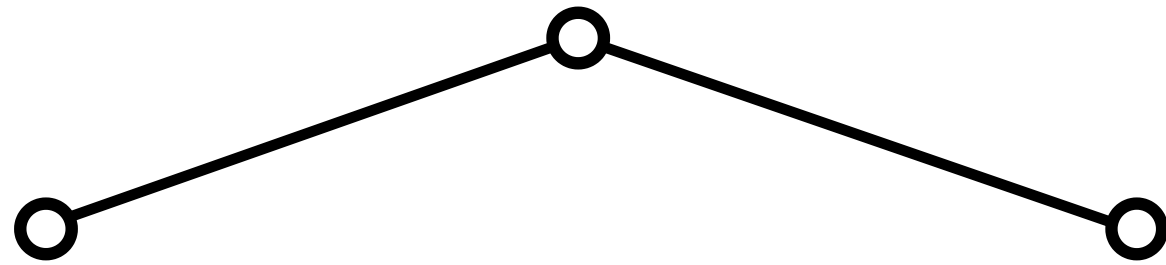
Circumcircle geometry



- ▶ "Waterlevel" in the demo determines θ at center vertex of triangle
- ▶ Picking any x_1 on the arc (above waterlevel) has constant θ !

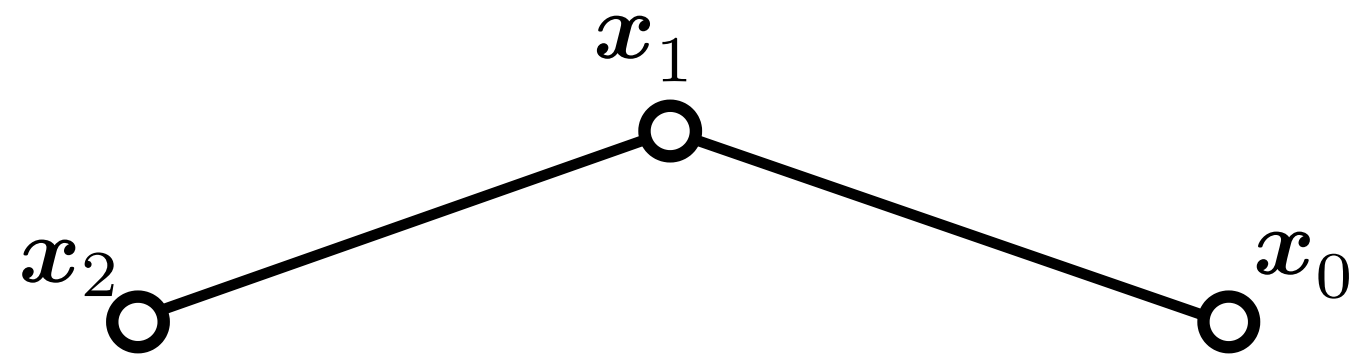
Circumcircle geometry

A few definitions



Circumcircle geometry

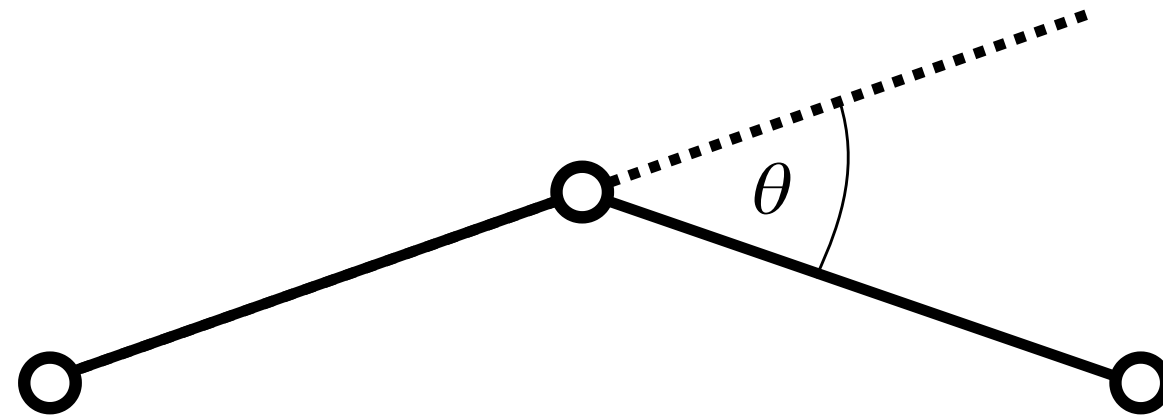
A few definitions



▶ Corner vertices x .

Circumcircle geometry

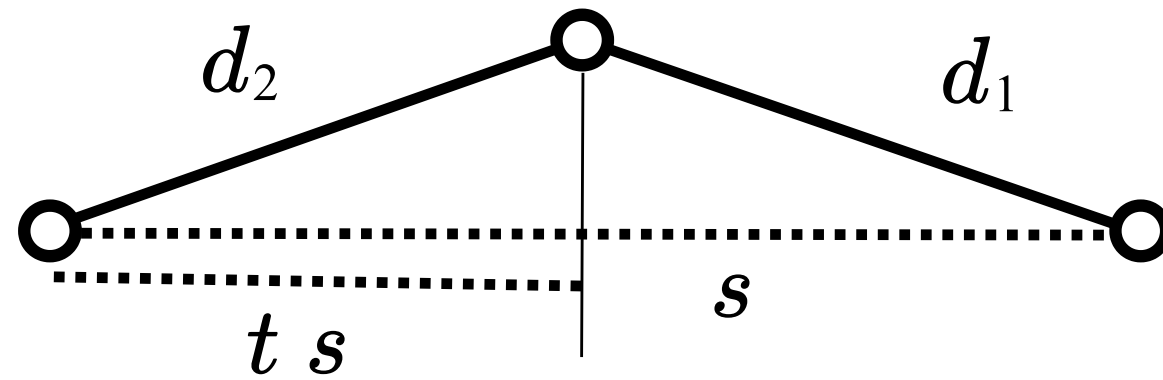
A few definitions



▶ The phase function angle θ

Circumcircle geometry

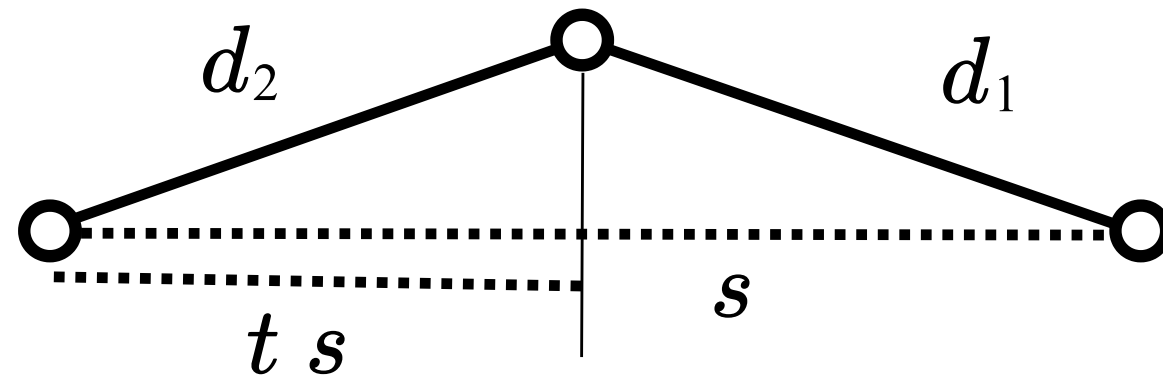
A few definitions



- ▶ Triangle edges: d_1, d_2, s
- ▶ t is the fractional distance between \mathbf{x}_0 and \mathbf{x}_2
- ▶ $t \in [0, 1]$ means $\theta < \pi/2$ means forward scattering only!

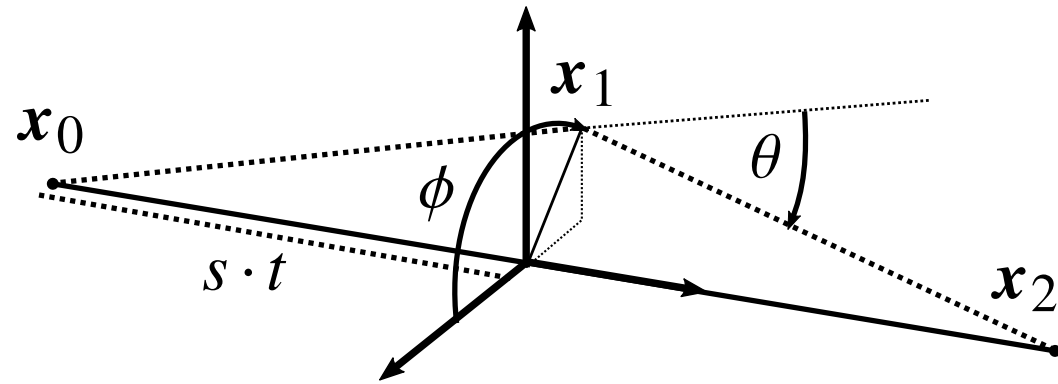
Circumcircle geometry

A few definitions



- ▶ Sample t , then find \mathbf{x}_1 on the arc!
- ▶ Pick t such that the geometry terms $\frac{1}{d_1^2 \cdot d_2^2}$ cancel

A change of variables



- ▶ Need to integrate all flux via any \mathbf{x}_1

$$I(\mathbf{x}_0 \leftrightarrow \mathbf{x}_2) = \int_{\mathbf{x}_1} f(\mathbf{x}_0 \leftrightarrow \mathbf{x}_1 \leftrightarrow \mathbf{x}_2) d\mathbf{x}_1$$

- ▶ Parameterise \mathbf{x}_1 in 3D via θ, ϕ, t
- ▶ Your everyday Monte Carlo change of variables/Jacobian computation, let's do it!

A few pages of maths later..

$$R(\theta) = \frac{\overline{x_0 x_2}}{2s \sin(\pi - \theta)} = \frac{1}{2 \sin(\theta)}. \quad (10)$$

From this we can compute the normalised polar radius r as

$$r(t, R) = \sqrt{R^2 - (1/2 - t)^2} - \sqrt{R^2 - 1/4}, \quad (11)$$

$$r(t, \theta) = \sqrt{\frac{1}{4 \sin^2 \theta} - (1/2 - t)^2} - \sqrt{\frac{1}{4 \sin^2 \theta} - 1/4}. \quad (12)$$

As another intermediate step, we will next go to regular spherical coordinates $(\hat{r}, \hat{\theta}, \hat{\phi} = \phi)$ (see [Figure 7](#)):

$$\int_S f d\mathbf{x} = \int_{\hat{\phi}} \int_{\hat{\theta}} \int_{\hat{r}} f \cdot \left| \frac{\partial \mathbf{x}}{\partial(\hat{\theta}, \hat{r}, \hat{\phi})} \right| d\hat{r} d\hat{\theta} d\hat{\phi} \quad (13)$$

$$= \int_{\hat{\phi}} \int_{\hat{\theta}} \int_{\hat{r}} f \cdot |\hat{r}^2 \sin \hat{\theta}| d\hat{r} d\hat{\theta} d\hat{\phi}. \quad (14)$$

$$|J| = \left| \frac{\partial(\theta, t)}{\partial(\hat{r}, \hat{\theta})} \right| = \left| \frac{\partial \theta}{\partial \hat{r}} \cdot \frac{\partial t}{\partial \hat{\theta}} - \frac{\partial \theta}{\partial \hat{\theta}} \cdot \frac{\partial t}{\partial \hat{r}} \right|. \quad (19)$$

The fractional distance t and its derivatives are simple:

$$t(\hat{r}, \hat{\theta}) = \frac{\hat{r}}{s} \cos \hat{\theta} + 1/2 \quad (20)$$

$$\partial t / \partial \hat{\theta} = -\frac{\hat{r}}{s} \sin \hat{\theta} \quad (21)$$

$$\partial t / \partial \hat{r} = \frac{1}{s} \cos \hat{\theta}. \quad (22)$$

$$d_2^2 = \hat{r}^2 + \frac{s^2}{4} - \hat{r}s \cos \hat{\theta} \quad (23)$$

$$d_1^2 = \hat{r}^2 + \frac{s^2}{4} - \hat{r}s \cos(\pi - \hat{\theta}) = \hat{r}^2 + \frac{s^2}{4} + \hat{r}s \cos \hat{\theta}, \quad (24)$$

and we also simplify the expression for their product

$$d_1^2 \cdot d_2^2 = -\frac{16\hat{r}^2 s^2 \cos^2 \hat{\theta} - s^4 - 8\hat{r}^2 s^2 - 16\hat{r}^4}{16} \quad (25)$$

$$= -\frac{1}{16} (8\hat{r}^2 s^2 (2 \cos^2 \hat{\theta} - 1) - 16\hat{r}^4 - s^4) \quad (26)$$

$$= \frac{1}{16} (16\hat{r}^4 + s^4 - 8\hat{r}^2 s^2 \cos 2\hat{\theta}). \quad (27)$$

Now we are ready to compute θ from $\hat{\theta}$ and \hat{r} as

$$\theta(\hat{r}, \hat{\theta}) = \pi - \arccos\left(\frac{d_1^2 + d_2^2 - s^2}{2d_1 d_2}\right) \quad (28)$$

$$= \pi - \arccos\left(\frac{\hat{r}^2 - s^2/4}{d_1 d_2}\right) \quad (29)$$

$$= \pi - \arccos\left(\frac{4\hat{r}^2 - s^2}{\sqrt{16\hat{r}^4 + s^4 - 8\hat{r}^2 s^2 \cos 2\hat{\theta}}}\right), \quad (30)$$

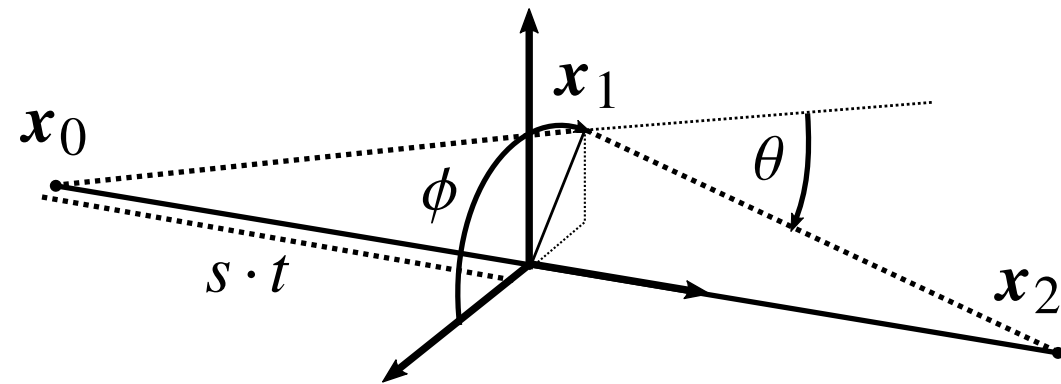
as well as the partial derivatives required for the Jacobian in [Equation \(19\)](#)

$$\partial \theta / \partial \hat{r} = \frac{4s(4\hat{r}^2 + s^2) \sin \hat{\theta}}{16\hat{r}^4 + s^4 - 8\hat{r}^2 s^2 \cos 2\hat{\theta}}, \quad (31)$$

$$\partial \theta / \partial \hat{\theta} = \frac{4\hat{r}s(s^2 - 4\hat{r}^2) \cos \hat{\theta}}{16\hat{r}^4 + s^4 - 8\hat{r}^2 s^2 \cos 2\hat{\theta}}. \quad (32)$$

```
FullSimplify[Abs[4 rr Sin[hh]/(4 rr^2 Cos[2*hh] - s^2)]/Sin[theta] //.
{
  hh -> ArcSin[s r / Sqrt[s^2 (t-1/2)^2 + s^2 r^2]],
  rr -> Sqrt[s^2 (t-1/2)^2 + s^2 r^2],
  r -> Sqrt[1/(4 Sin[theta]^2) - (1/2 - t)^2] - Sqrt[1/(4 Sin[theta]^2) - 1/4]
}]
Out[ ] = -
2 Csc[theta] (-Cot[theta] + Sqrt[-1 + 4 t - 4 t^2 + Csc[theta]^2])
s Abs[8 (-1 + t) t + 2 Cot[theta] (-Cot[theta] + Sqrt[-1 + 4 t - 4 t^2 + Csc[theta]^2])]
In[ ] = TrigReduce[
2 Csc[theta] (-Cot[theta] + Sqrt[-1 + 4 t - 4 t^2 + Csc[theta]^2])
s Abs[8 (-1 + t) t + 2 Cot[theta] (-Cot[theta] + Sqrt[-1 + 4 t - 4 t^2 + Csc[theta]^2])]
]
Out[ ] = -
2 Csc[theta] (Cot[theta] - Sqrt[-1 + 4 t - 4 t^2 + Csc[theta]^2])
s Abs[8 (-1 + t) t + 2 Cot[theta] (-Cot[theta] + Sqrt[-1 + 4 t - 4 t^2 + Csc[theta]^2])]
and as it turns out, the Abs part in the denominator is "always" negative, so remove abs and add a sign
before integrating:
In[ ] = FullSimplify[
2 Csc[theta] (Cot[theta] - Sqrt[-1 + 4 t - 4 t^2 + Csc[theta]^2])
s (8 (-1 + t) t + 2 Cot[theta] (-Cot[theta] + Sqrt[-1 + 4 t - 4 t^2 + Csc[theta]^2]))
]
Out[ ] = -
Csc[theta] (Cot[theta] - Sqrt[-(1 - 2 t)^2 + Csc[theta]^2])
s (4 (-1 + t) t + Cot[theta] (-Cot[theta] + Sqrt[-(1 - 2 t)^2 + Csc[theta]^2]))
```

Sampling



▶ Sample $\theta \sim f_s(\theta) \cdot \sin \theta$

▶ Sample t

$$t = P^{-1}(\xi|\theta) = \cos(\theta - \xi\theta) \sin(\xi\theta) / \sin \theta$$

▶ Sample $\phi \sim \frac{1}{2\pi}$ (trivial)

PDF and Estimator

$$p(\boldsymbol{x}_1) = f_s(\theta) \frac{s}{d_1^2 \cdot d_2^2} \frac{\sin \theta}{\theta}$$
$$\hat{I} = f_c(\boldsymbol{x}_0 \leftrightarrow \boldsymbol{x}_2) \cdot \frac{\theta}{s \sin \theta}$$

PDF and Estimator

$$p(\boldsymbol{x}_1) = f_s(\theta) \frac{s}{d_1^2 \cdot d_2^2} \frac{\sin \theta}{\theta}$$

$$\hat{I} = f_c(\boldsymbol{x}_0 \leftrightarrow \boldsymbol{x}_2) \cdot \frac{\theta}{s \sin \theta}$$

- ▶ Phase function sampling $f_s \cdot \sin \theta$
 - ▶ Stock sampling routine: in solid angle, so theta slice contains Jacobian ($\sin \theta$)
 - ▶ Results in $\theta / \sin \theta$ in estimator (close to 1.0 for forward scattering)

PDF and Estimator

$$p(\mathbf{x}_1) = f_s(\theta) \frac{s}{d_1^2 \cdot d_2^2} \frac{\sin \theta}{\theta}$$
$$\hat{I} = f_c(\mathbf{x}_0 \leftrightarrow \mathbf{x}_2) \cdot \frac{\theta}{s \sin \theta}$$

- ▶ PDF contains geometry terms: $d_1^2 \cdot d_2^2$:)
- ▶ Also contains s , the distance \mathbf{x}_0 to \mathbf{x}_2
 - ▶ Similar to Kalos 1963/equiangular sampling: replaced $1/d^2$ singularity by $1/s$
 - ▶ We include the (important!) phase function
 - ▶ Our distance s is between $\mathbf{x}_0, \mathbf{x}_2$ (not \mathbf{x}_1)

PDF and Estimator

$$p(\mathbf{x}_1) = f_s(\theta) \frac{s}{d_1^2 \cdot d_2^2} \frac{\sin \theta}{\theta}$$

$$\hat{I} = f_c(\mathbf{x}_0 \leftrightarrow \mathbf{x}_2) \cdot \frac{\theta}{s \sin \theta}$$

► It remains to mention the unsampled f_c

$$f_c(\mathbf{x}_0 \leftrightarrow \mathbf{x}_2) = \cos \theta_0 \cdot \cos \theta_2 \cdot \mu_s \cdot T(\mathbf{x}_0, \mathbf{x}_1) \cdot T(\mathbf{x}_1, \mathbf{x}_2) \cdot W(\mathbf{x}_2)$$

Results



equiangular sampling

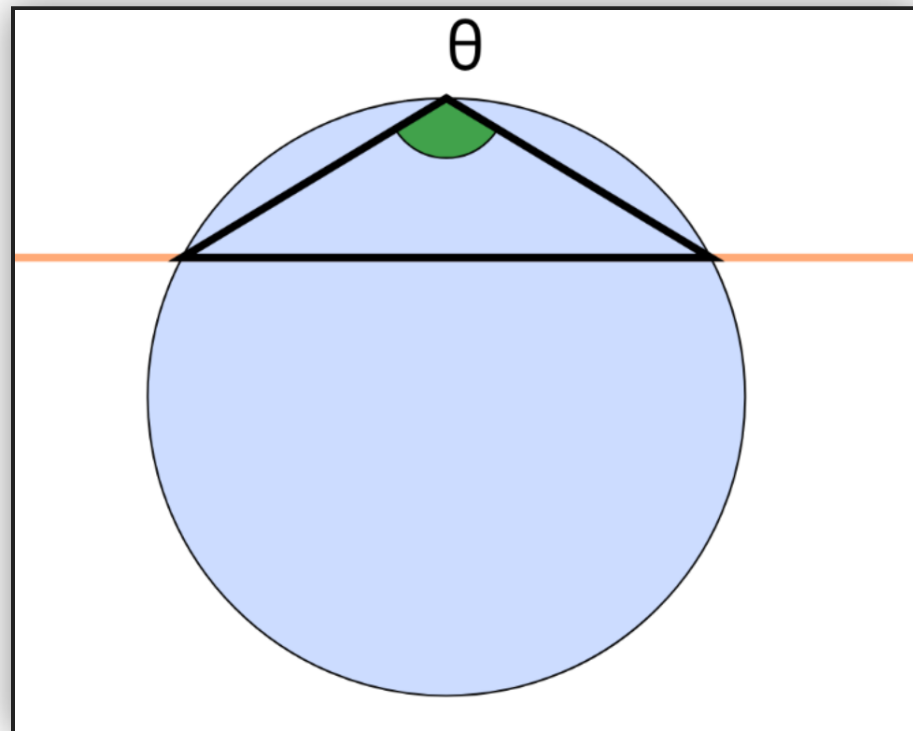
Results



OMNEE (ours)

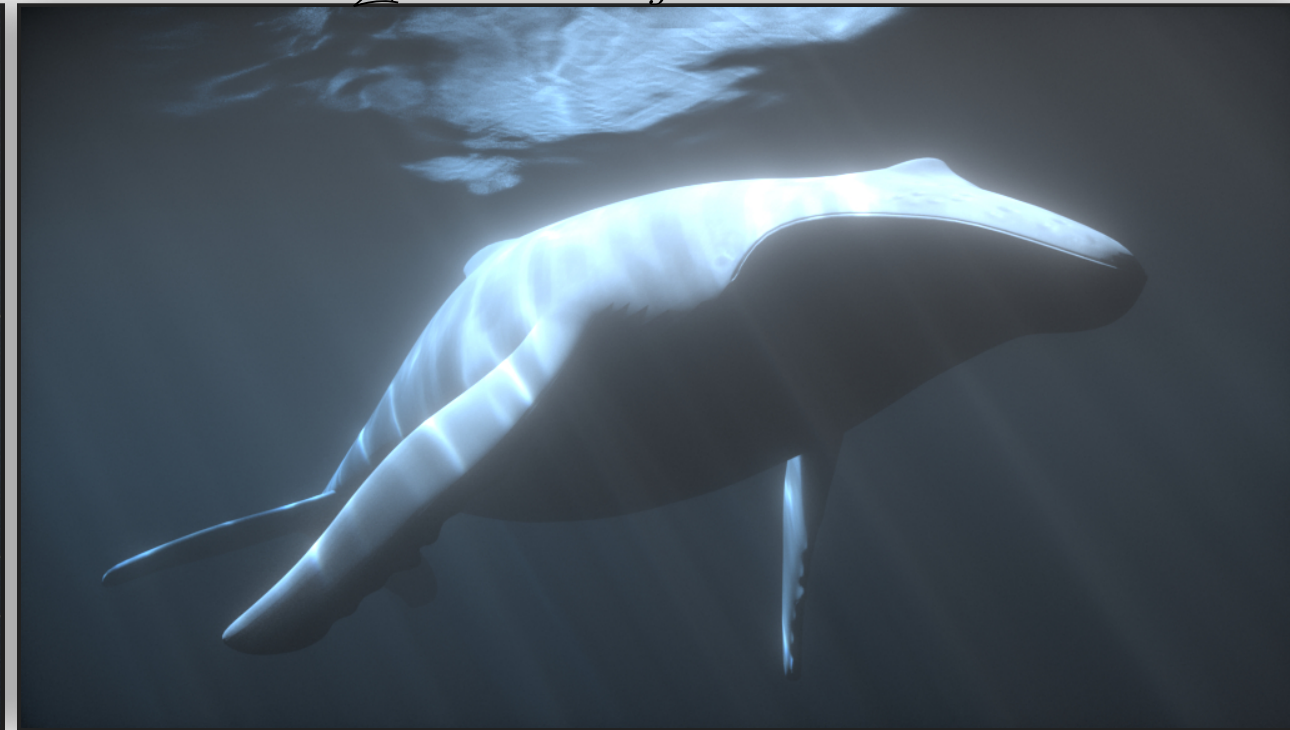
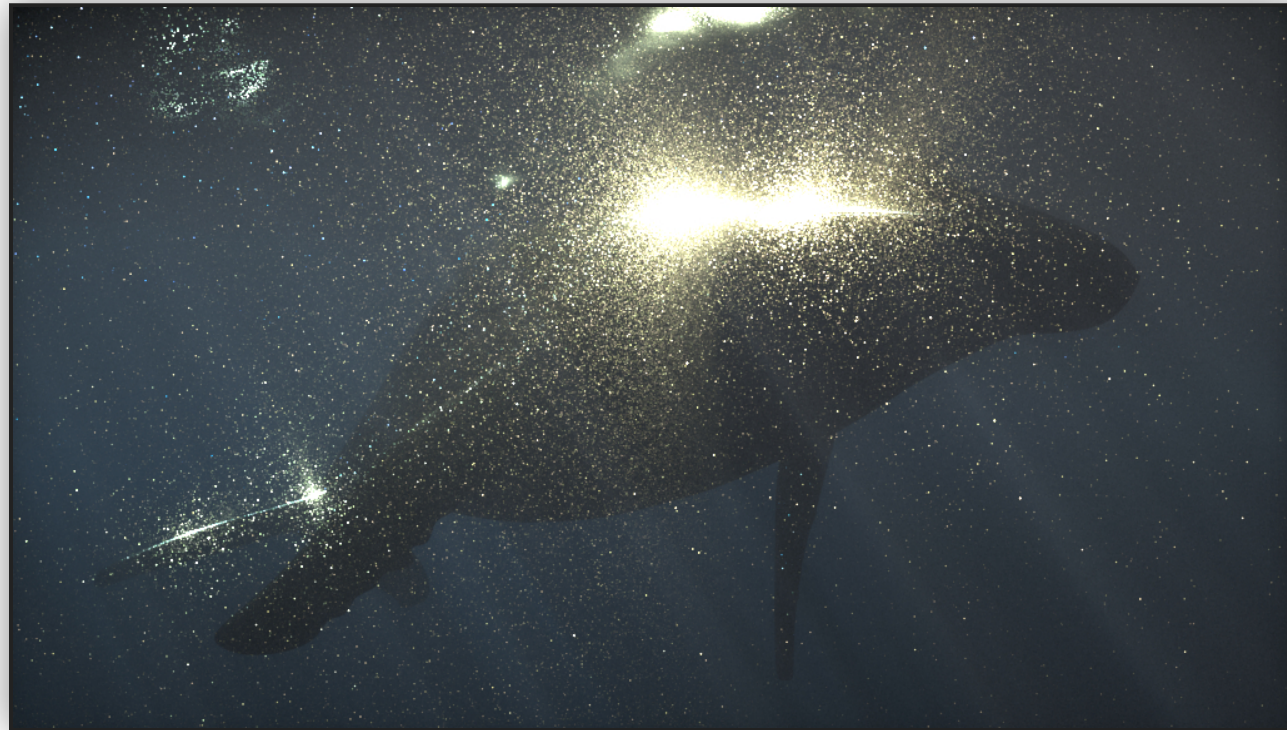
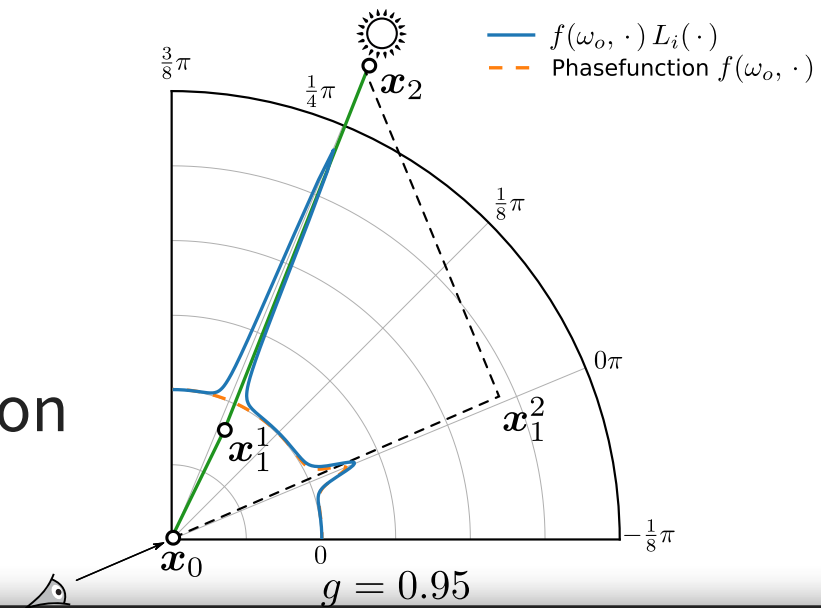
Conclusion

- ▶ Hope that we showed:
 - ▶ Highly peaked forward scattering phase functions are important for the look!
 - ▶ No efficient technique available to us previously
- ▶ We provide *once-more collided flux*:
 - ▶ Sampling the angle at the extra vertex first!
 - ▶ Core of the technique: triangular geometry with circumcircle



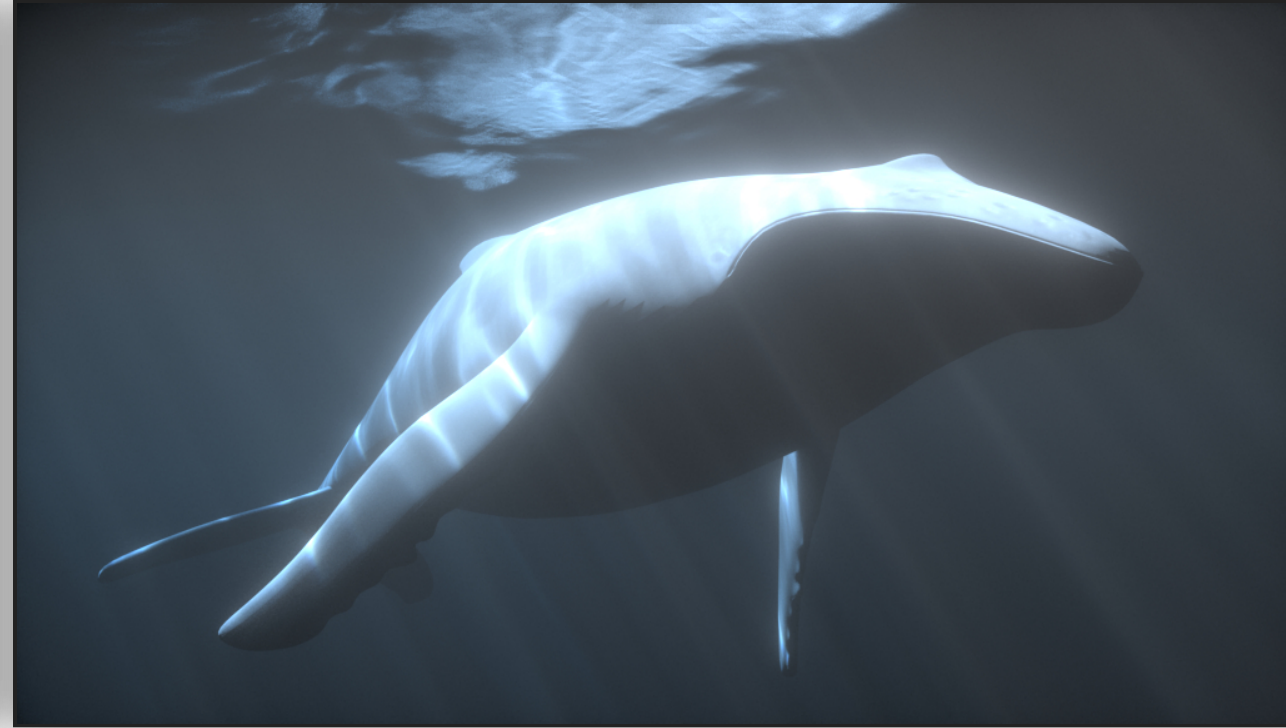
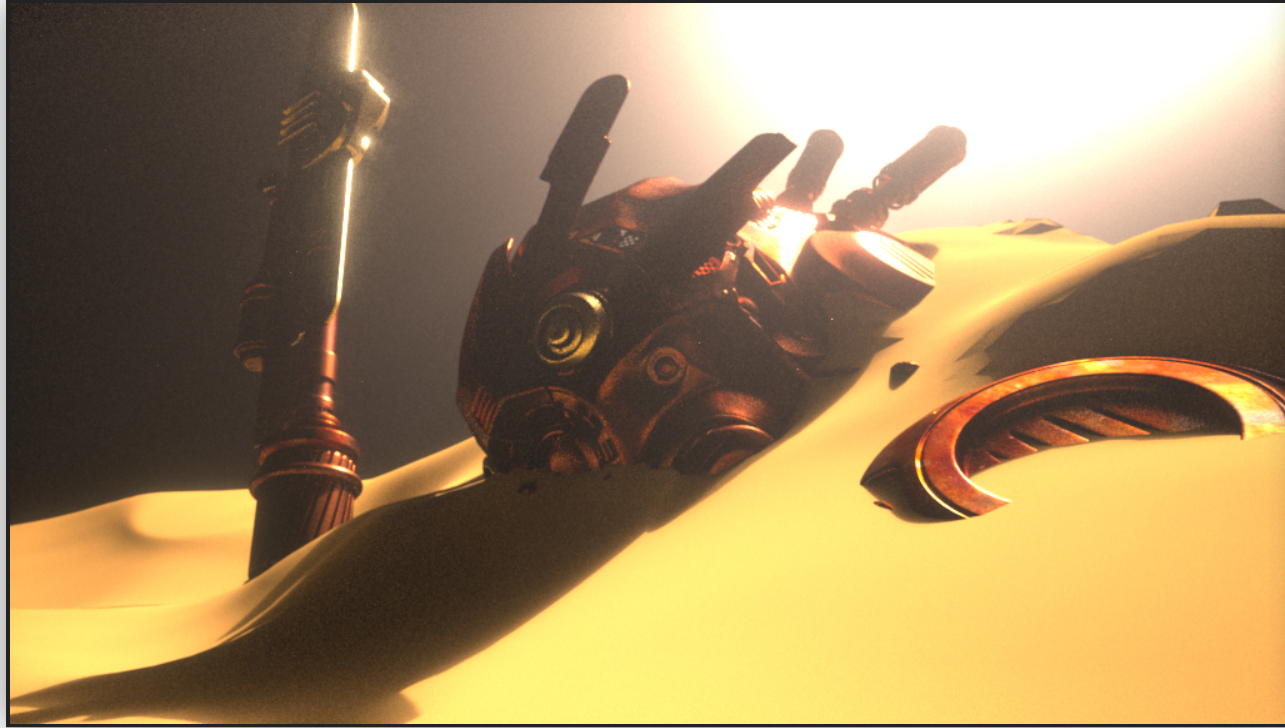
Discussion/Limitations

- ▶ Forward scattering only!
- ▶ We don't sample transmittance
 - ▶ But does it matter? Can be sampled with phase function
- ▶ We don't sample the BSDF/phase function at \mathbf{x}_0 :



- ▶ Can this lead to a parameterisation for more generic multiple scattering?

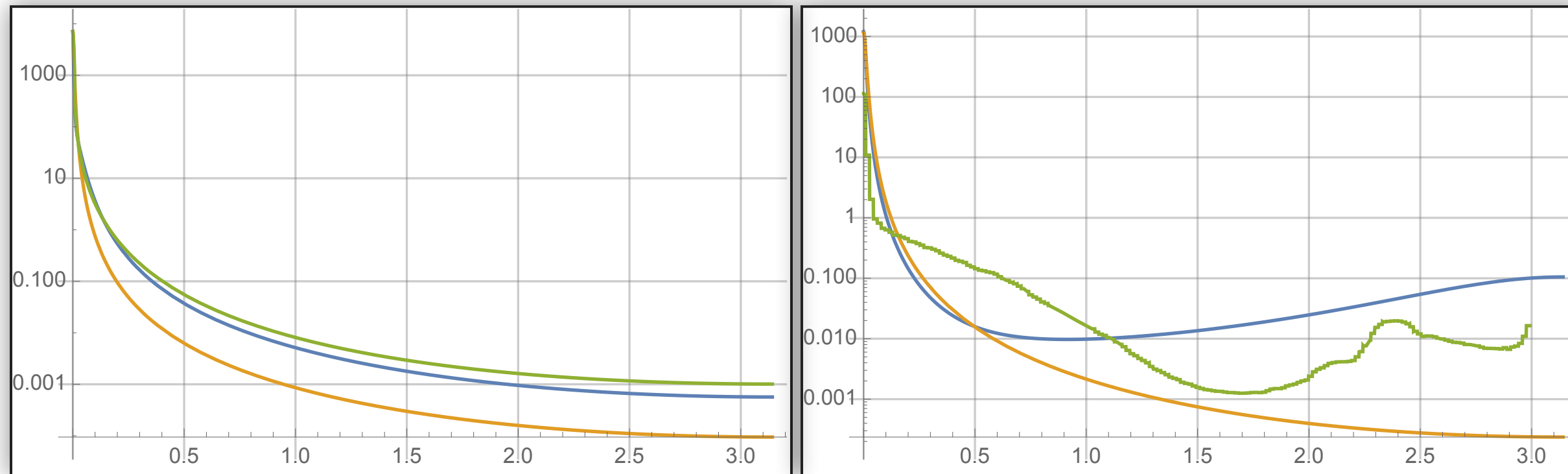
Thank you for listening!



Backup slides

Typical phase functions

- ▶ Are super peaky forward scattering (for water/haze):
- ▶ Two term HG fit: $g_1 = 0.997, g_2 = 0.960$ and $g_1 = 0.990, g_2 = -0.440$



- ▶ Left: Fournier/Forand, Right: Mie
- ▶ But is that visually important? What does not-so-peaky look like?