

# BSSRDF Importance Sampling

Alan King   Christopher Kulla   Alejandro Conty   Marcos Fajardo

SOLIDANGLE



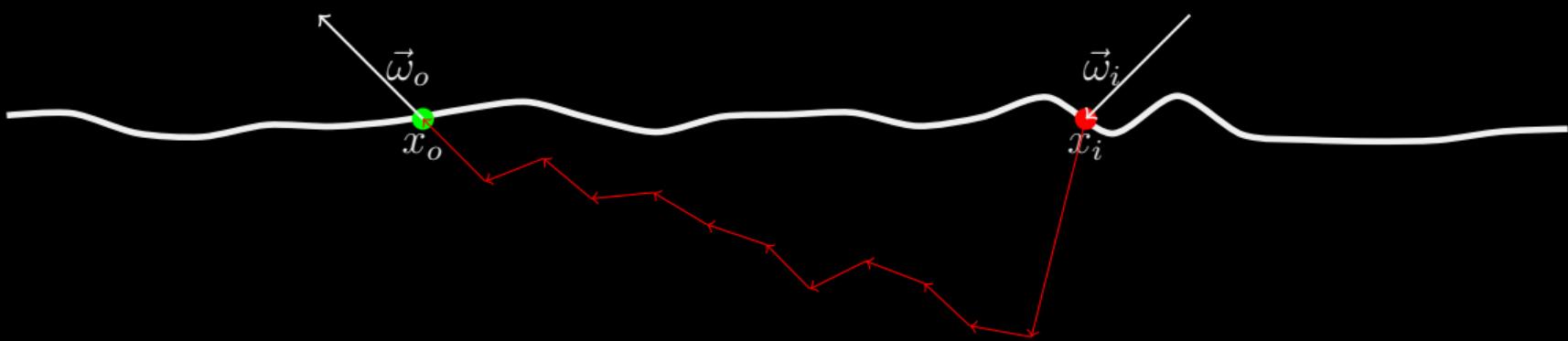
# Background

Most materials scatter light below the surface



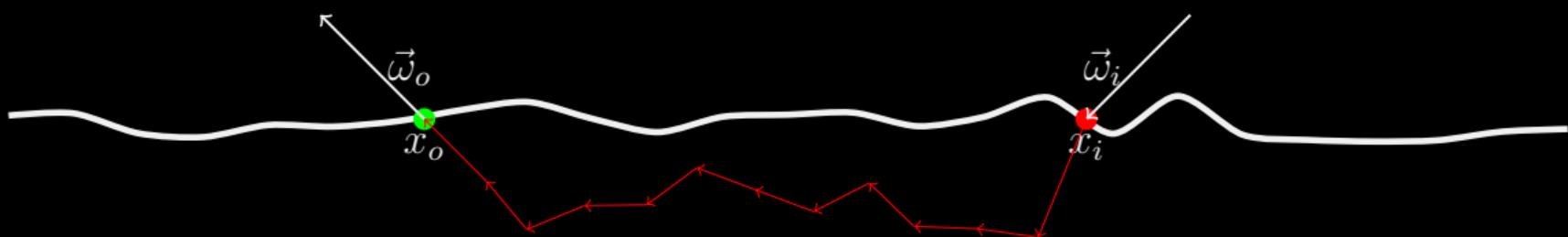
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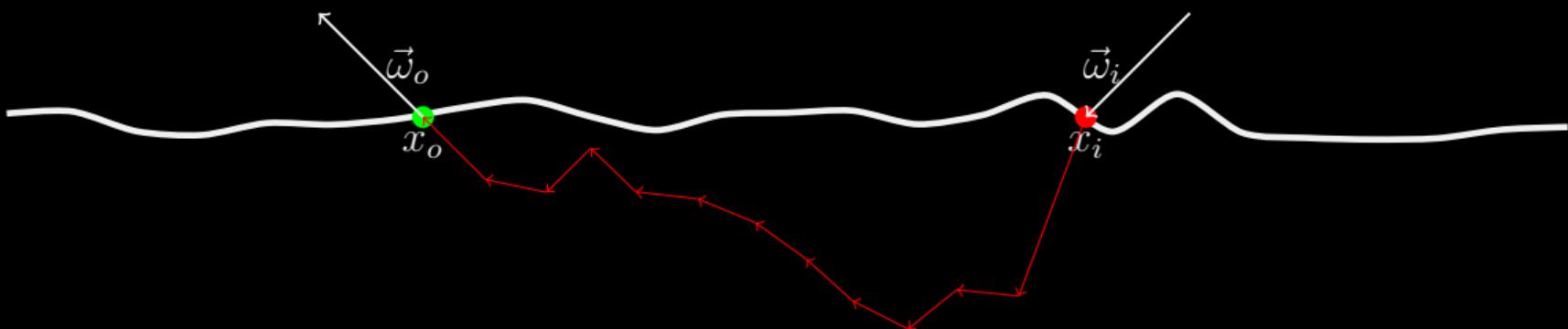
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Most materials scatter light below the surface



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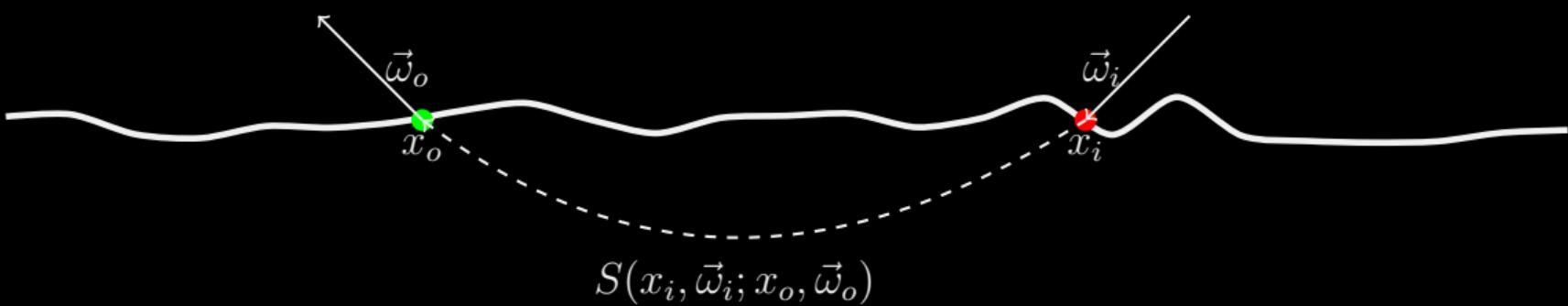
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Most materials scatter light below the surface



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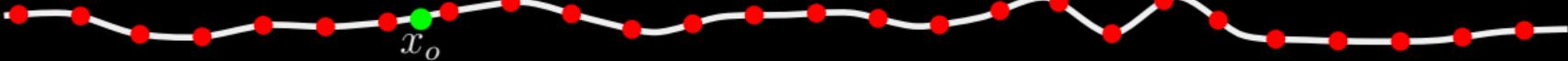
A BSSRDF\* represents this process with a single formula (Jensen et al. [2001])



\*Bidirectional Surface Scattering Distribution Function

# Background

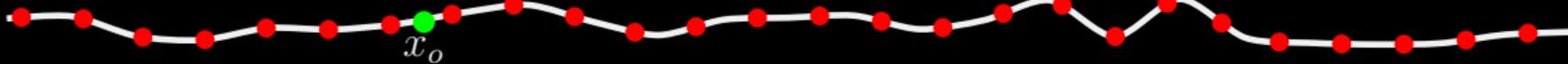
At each shading point, an integral over the entire surface must be performed



$$L_o(x_o, \vec{\omega}_o) = \int_A \int_{2\pi} S(x_i, \vec{\omega}_i; x_o, \vec{\omega}_o) L_i(x_i, \vec{\omega}_i) (\vec{\omega}_i \cdot \vec{n}_i) d\vec{\omega}_i dA(x_i)$$

# Background

We will assume the BSSRDF is radially symmetric and mostly a function of distance  
Our talk focuses on *evaluating* the integral, not the shape of the BSSRDF



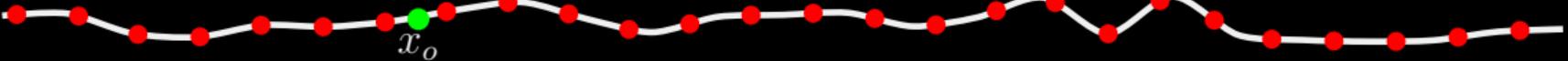
$$L_o(x_o, \vec{\omega}_o) = \int_A R(||x_i - x_o||) \int_{2\pi} L_i(x_i, \vec{\omega}_i)(\vec{\omega}_i \cdot \vec{n}_i) d\vec{\omega}_i dA(x_i)$$

# Background

BSSRDFs are still actively being researched! [Habel et al., 2013], [d'Eon and Irving, 2011], ...  
Simple alternatives to the more sophisticated models include:

Cubic:  $R(r) = \frac{10(R_{\max} - r)^3}{\pi R_{\max}^5}$

Gaussian:  $R(r) = \frac{1}{2\pi\nu^2} e^{-r^2/2\nu^2}$



$$L_o(x_o, \vec{\omega}_o) = \int_A R(||x_i - x_o||) \int_{2\pi} L_i(x_i, \vec{\omega}_i)(\vec{\omega}_i \cdot \vec{n}_i) d\vec{\omega}_i dA(x_i)$$

## Previous Work - Point Clouds (Jensen and Buhler [2002])



- ▶ Distribute points across the mesh

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- ▶ Distribute points across the mesh
- ▶ Compute lighting at each sample

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- ▶ Compute lighting at each sample
- ▶ Integrate by traversing data-structure

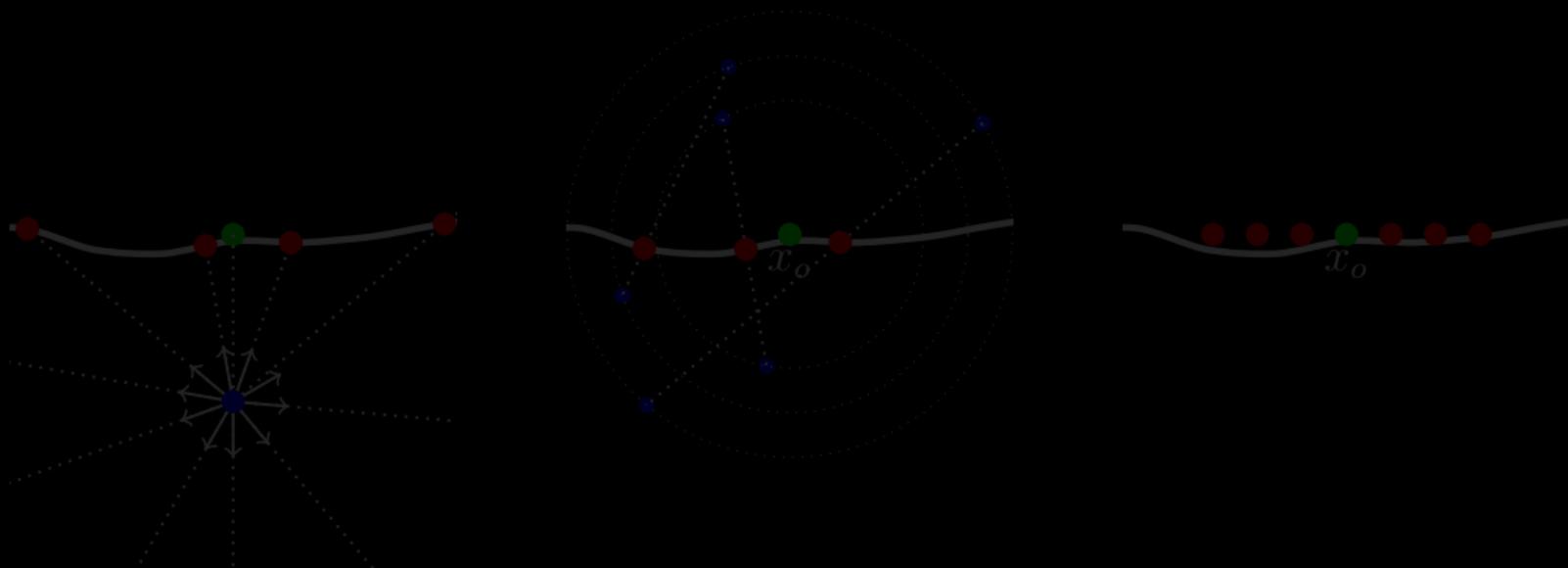
## Previous Work - Point Clouds (Jensen and Buhler [2002])



- ▶ Distribute points across the mesh
- ▶ Compute lighting at each sample
- ▶ Integrate by traversing data-structure
- ▶ Drawbacks
  - ▶ Additional memory
  - ▶ Requires a pre-pass
  - ▶ Unfriendly to progressive rendering
  - ▶ Point density  $\approx$  mean free path
  - ▶ Flickering artifacts

# Previous Work - Monte Carlo Methods

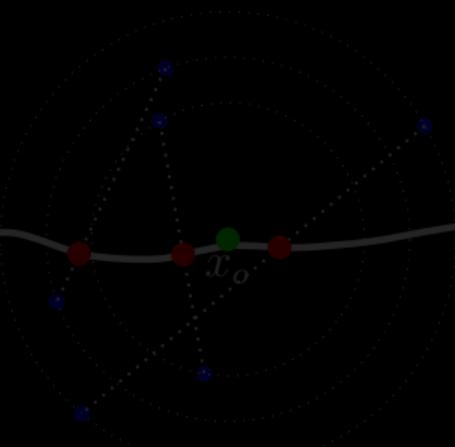
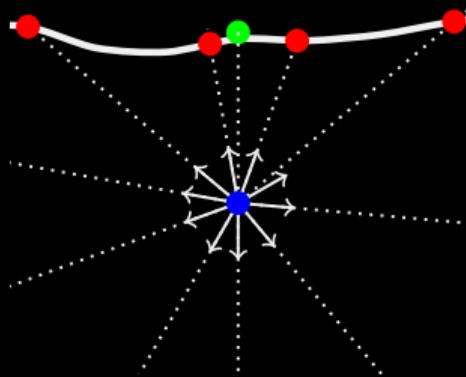
Three MC methods have been proposed



# Previous Work - Monte Carlo Methods

Christensen et al. [2012]

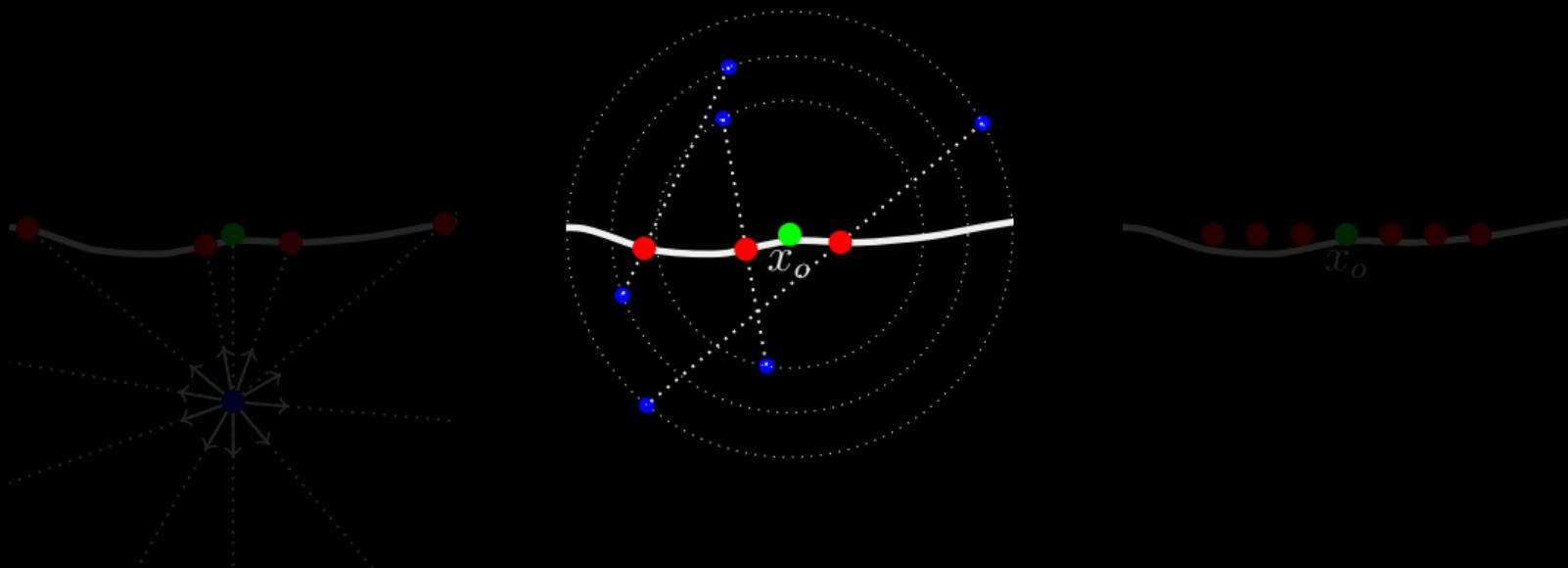
Multiresolution Radiosity Caching for Global Illumination in Movies



# Previous Work - Monte Carlo Methods

Walter et al. [2012]

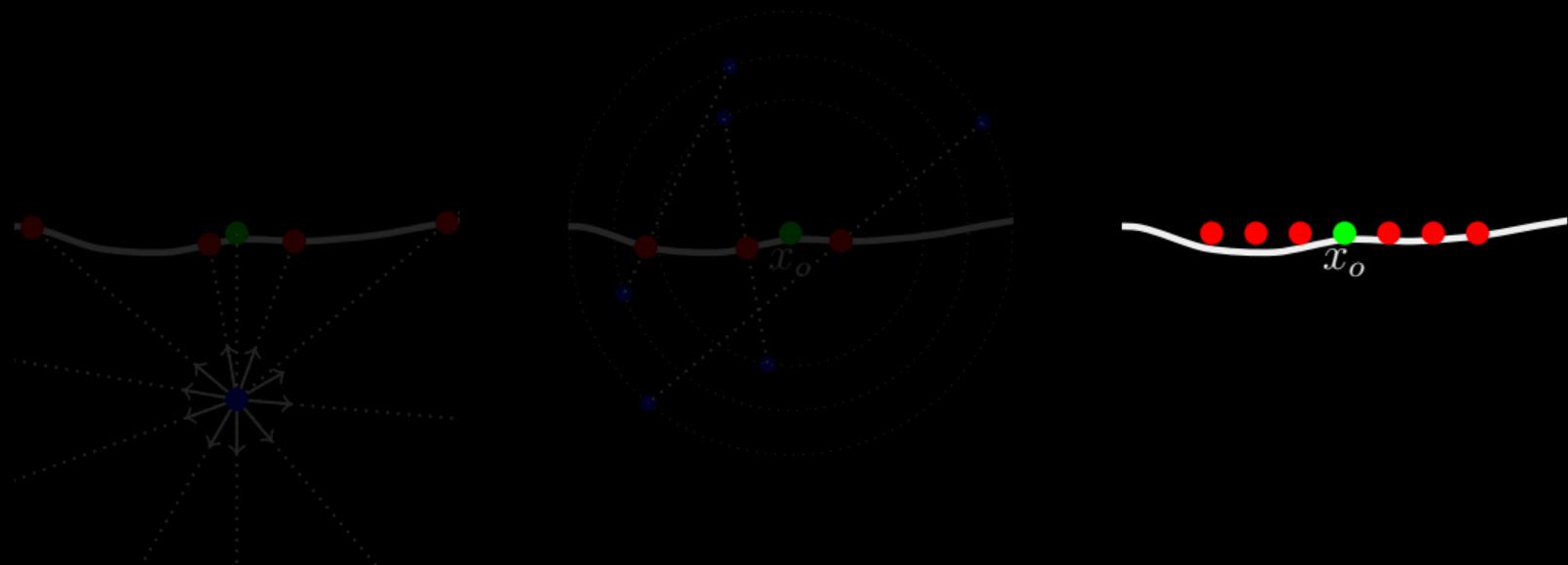
Bidirectional Lightcuts (Appendix B)



# Previous Work - Monte Carlo Methods

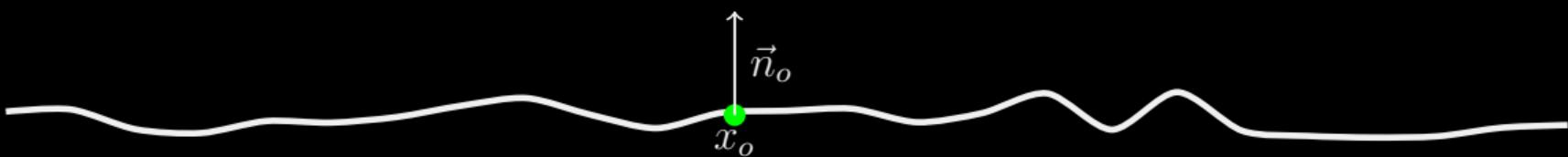
Jensen et al. [2001]

A Practical Model for Subsurface Light Transport



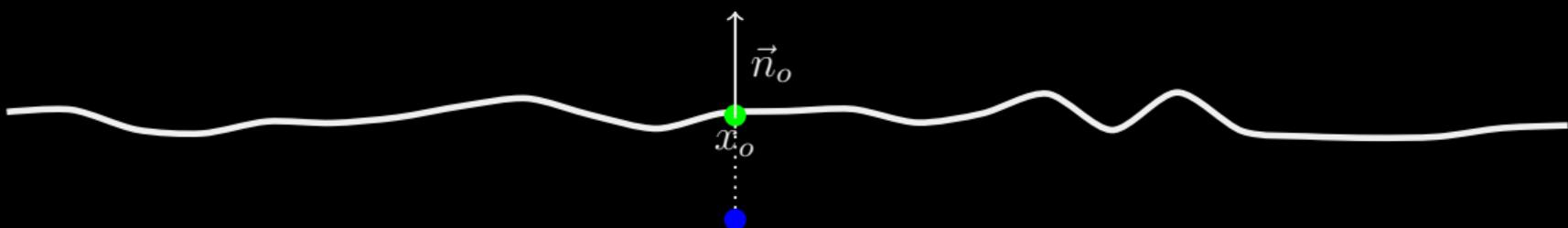
## Previous Work (1/3) - Christensen et al [2012]

Choose a point below the surface



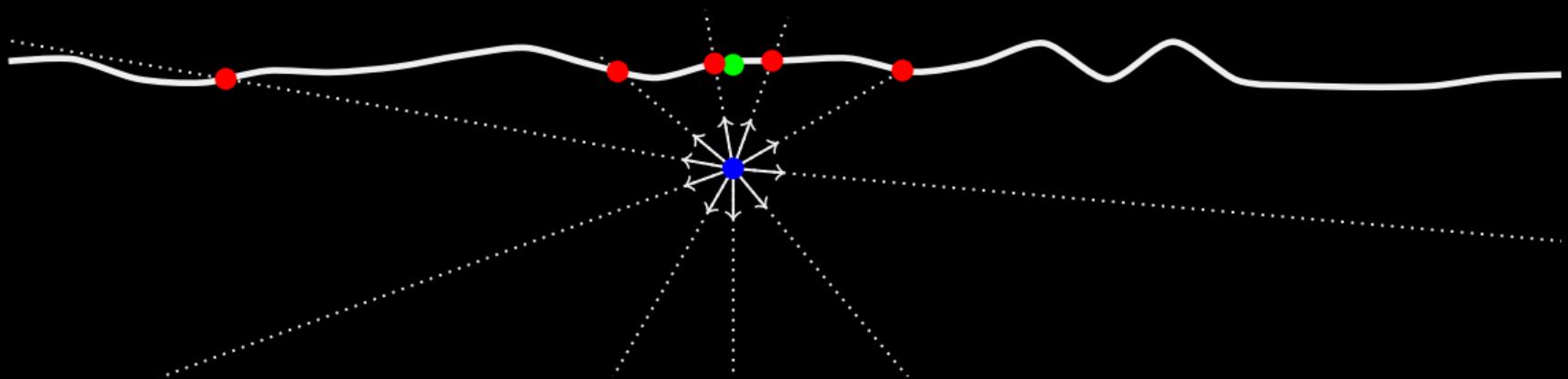
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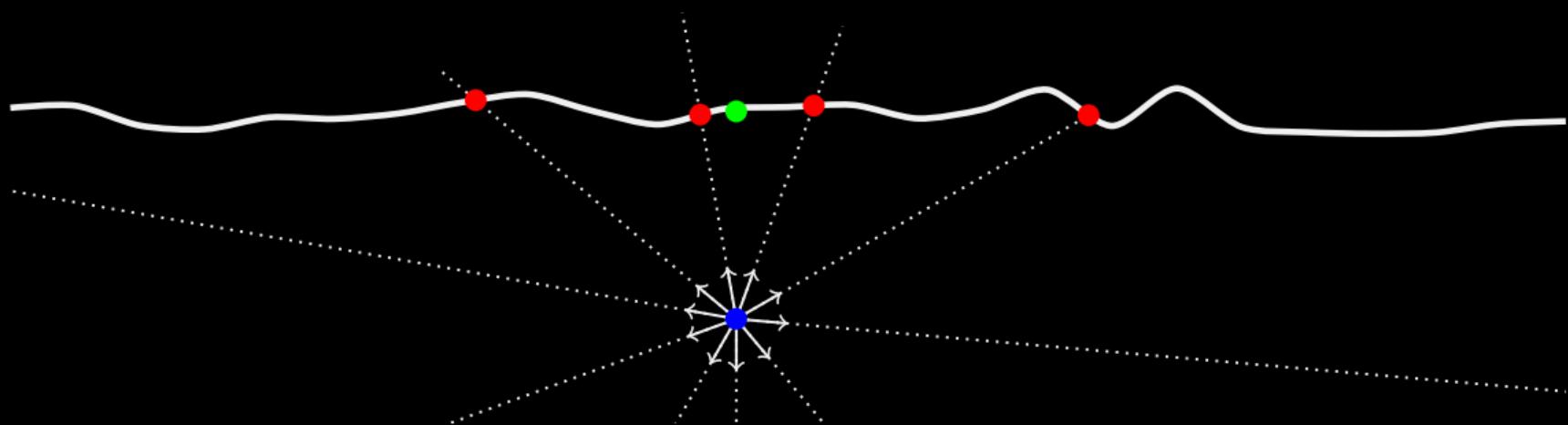
# Previous Work (1/3) - Christensen et al [2012]

Trace rays uniformly



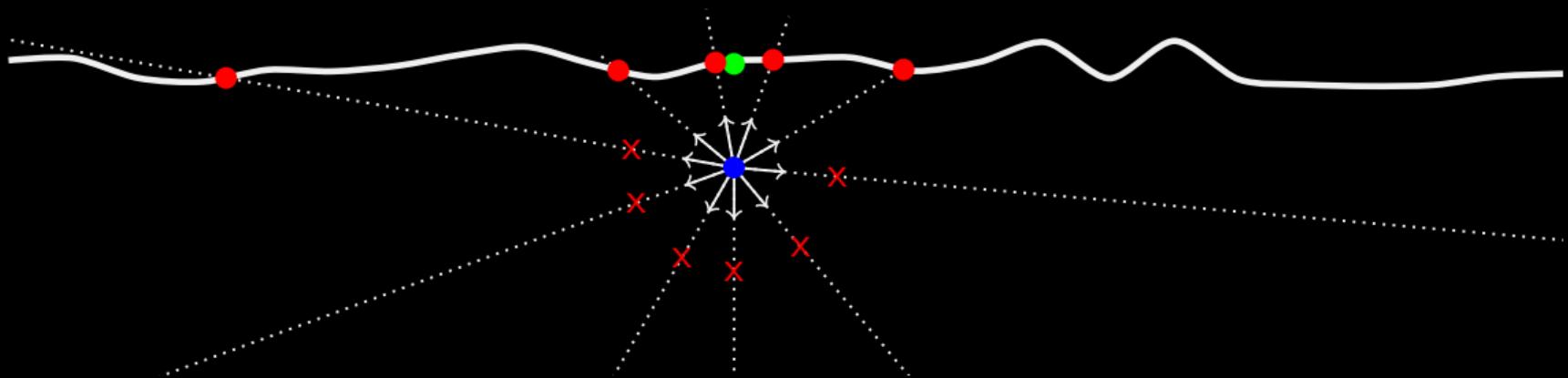
# Previous Work (1/3) - Christensen et al [2012]

Distribution depends on distance to surface



## Previous Work (1/3) - Christensen et al [2012]

Samples have uniform probability but very different weights



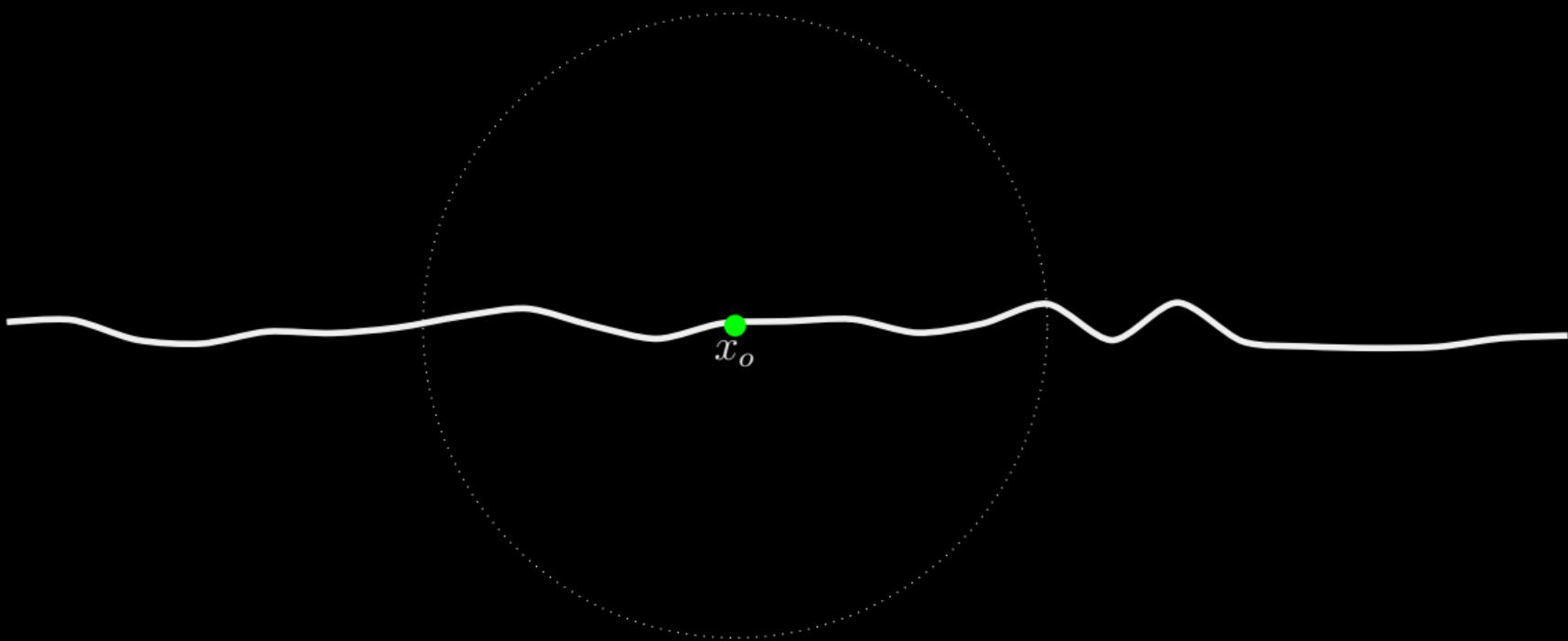
## Previous Work (2/3) - Walter et al [2012]

Choose a radius with a pdf derived from  $R(r)$



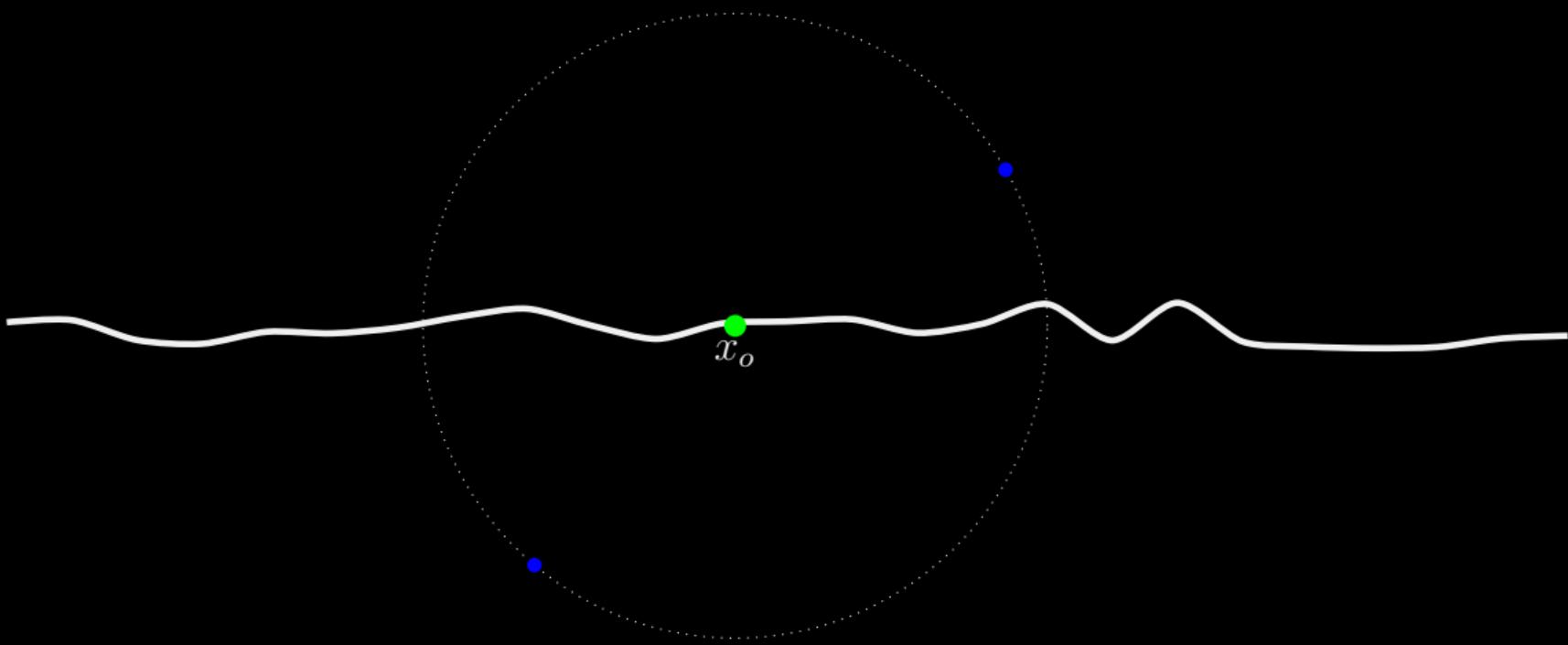
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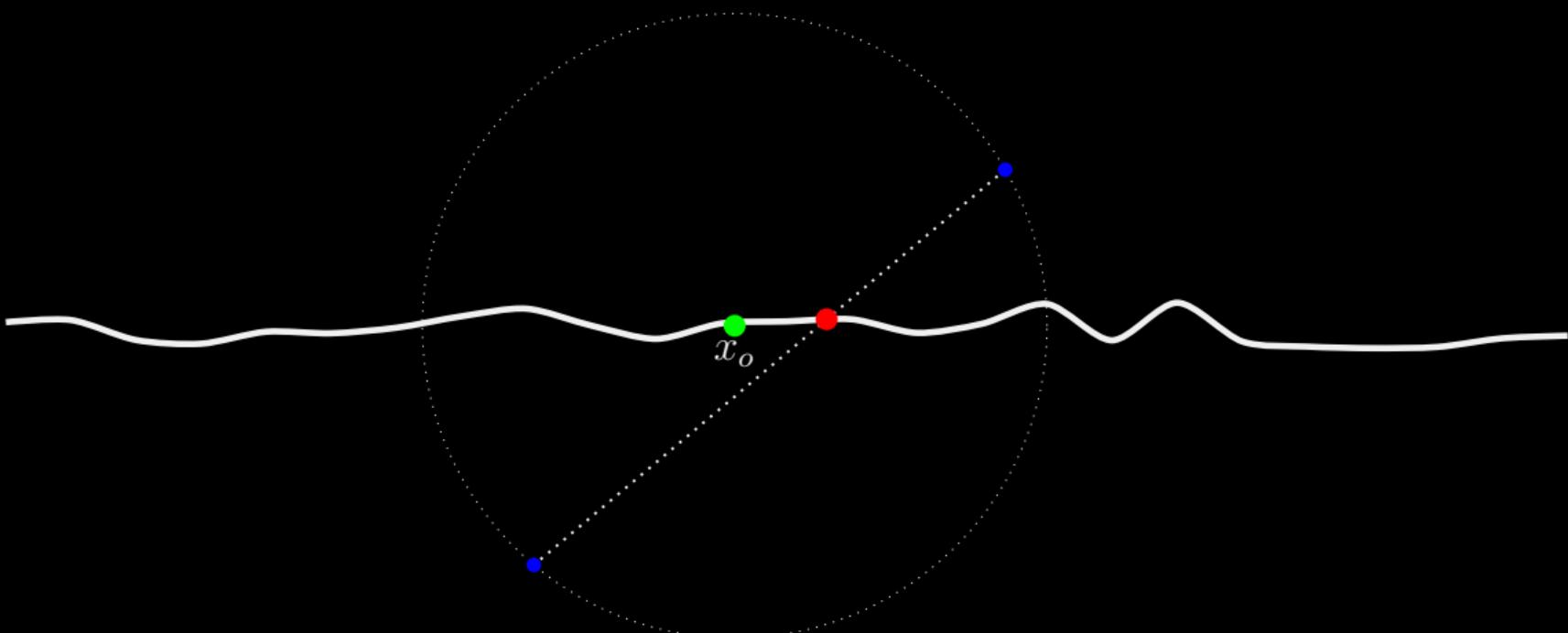
## Previous Work (2/3) - Walter et al [2012]

Choose two random points on this sphere



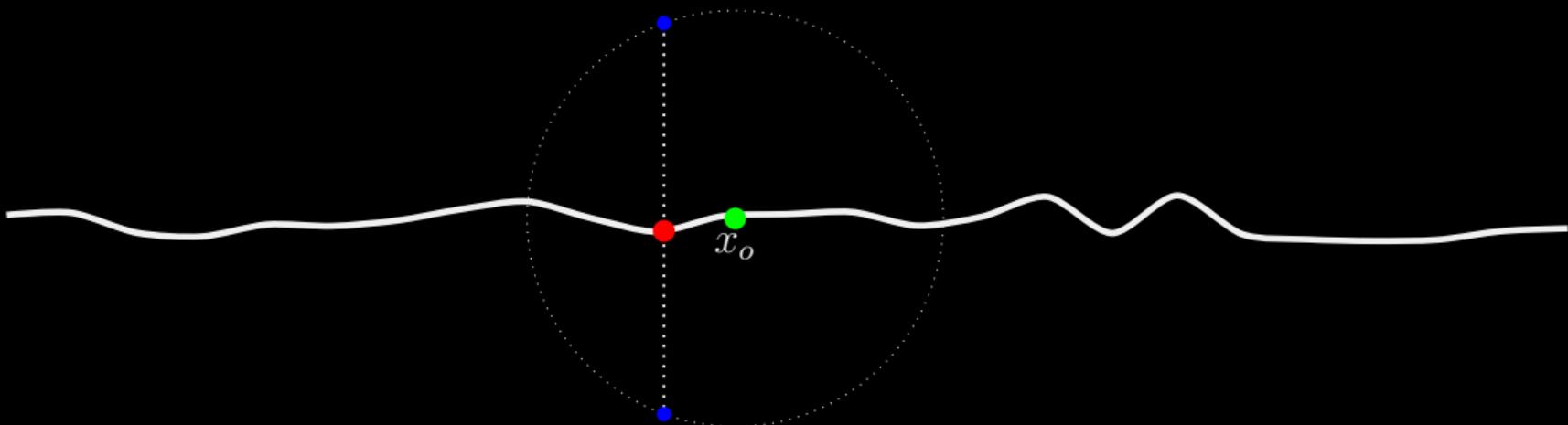
## Previous Work (2/3) - Walter et al [2012]

Intersect ray segment with surface



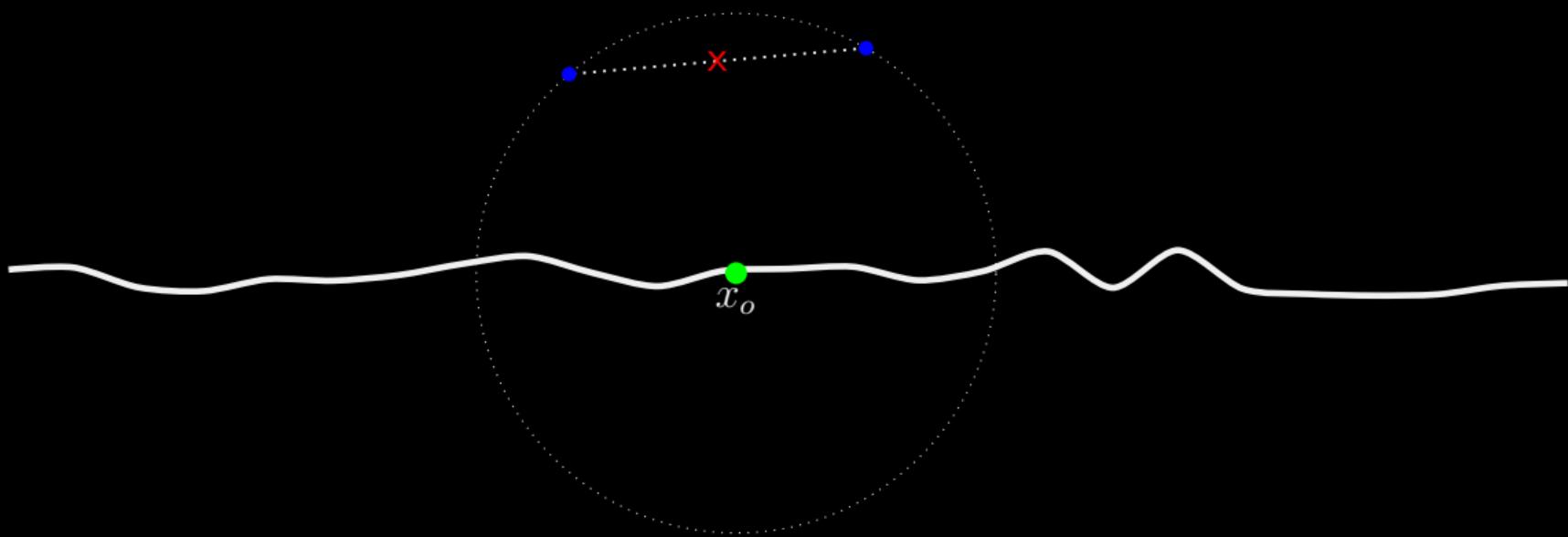
## Previous Work (2/3) - Walter et al [2012]

Requires 5 random numbers ( $r, \theta_a, \phi_a, \theta_b, \phi_b$ )



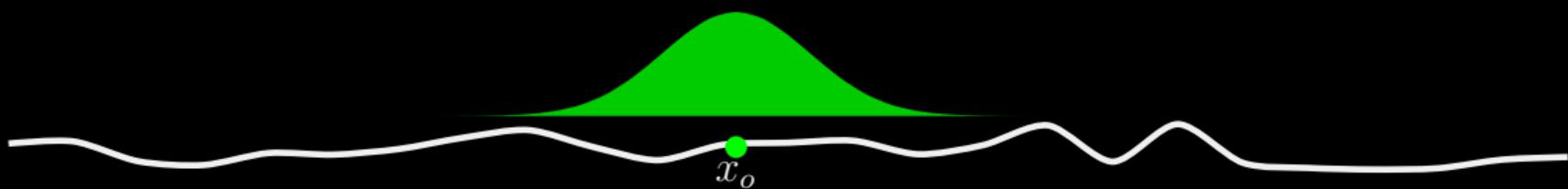
## Previous Work (2/3) - Walter et al [2012]

Some rays do not produce any samples



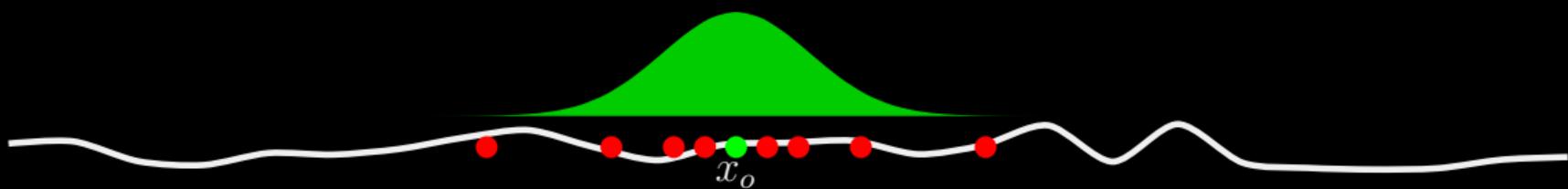
## Previous work (3/3) - Jensen et. al [2001]

Distribute points on disk around  $x_o$  according to  $R(r)$



# Previous work (3/3) - Jensen et. al [2001]

Optimal distribution for flat planes



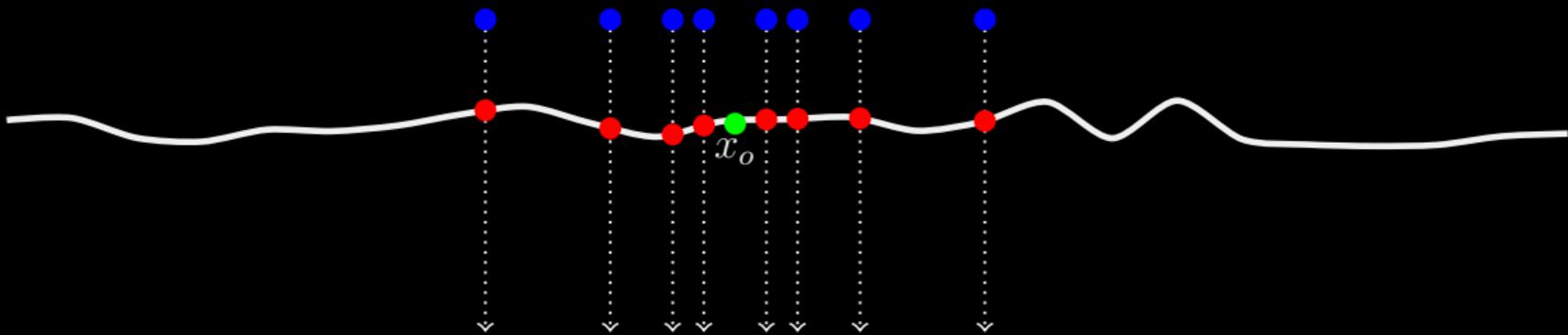
## Previous work (3/3) - Jensen et. al [2001]

Samples do not lie on the surface in general case



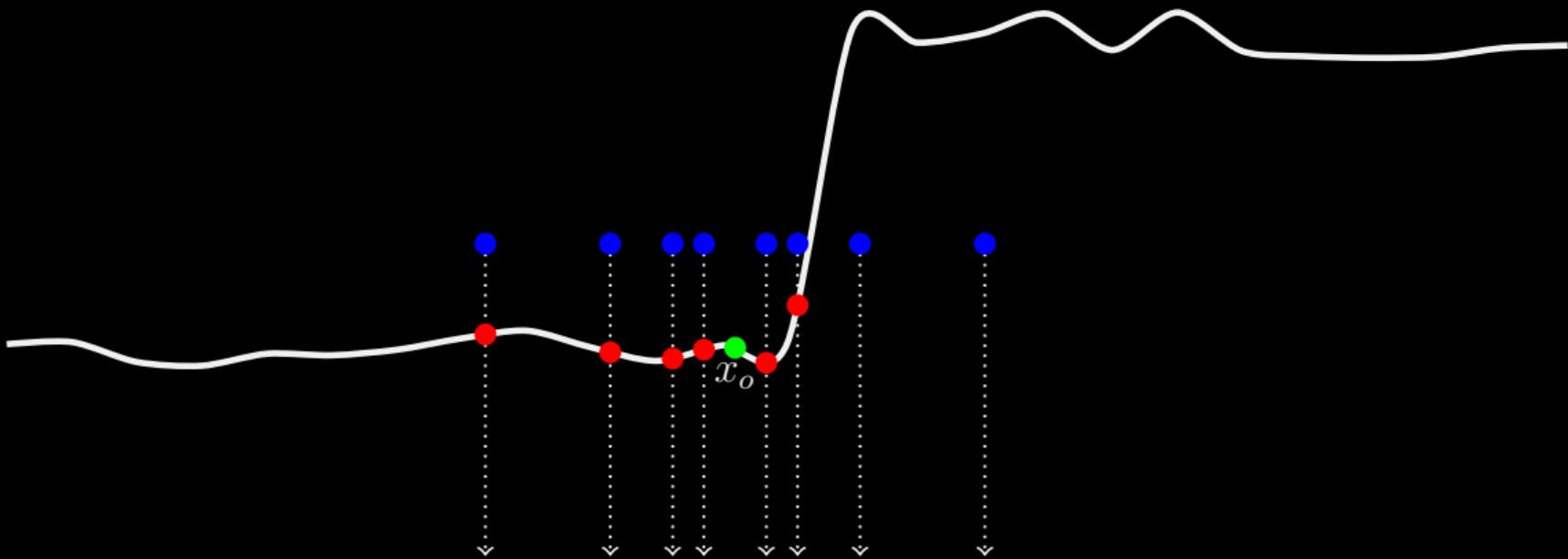
## Previous work (3/3) - Jensen et. al [2001]

Hery [2003] proposed a simple top-down projection



# Previous work (3/3) - Jensen et. al [2001]

Still not robust to all cases

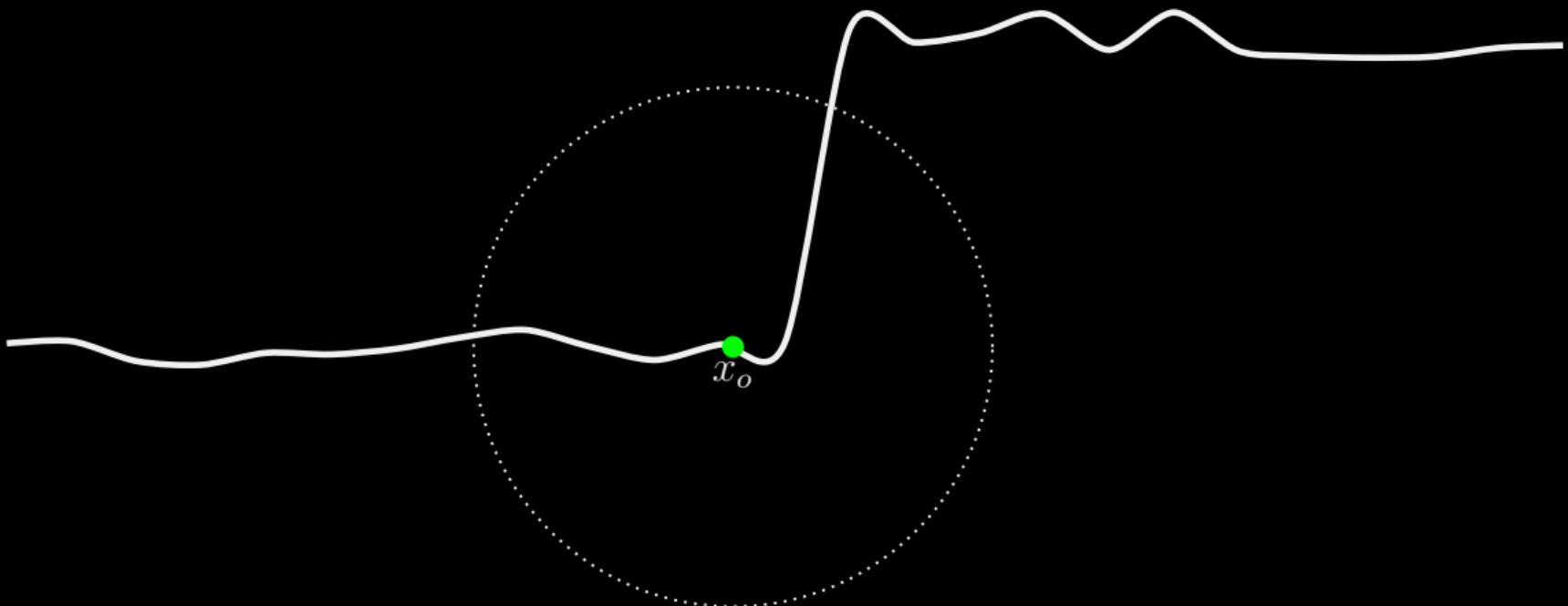


# Our approach

- ▶ Based on Jensen's disk sampling approach
- ▶ Introduce a robust projection method
- ▶ Extend method to weighted sums of profiles

# Our approach

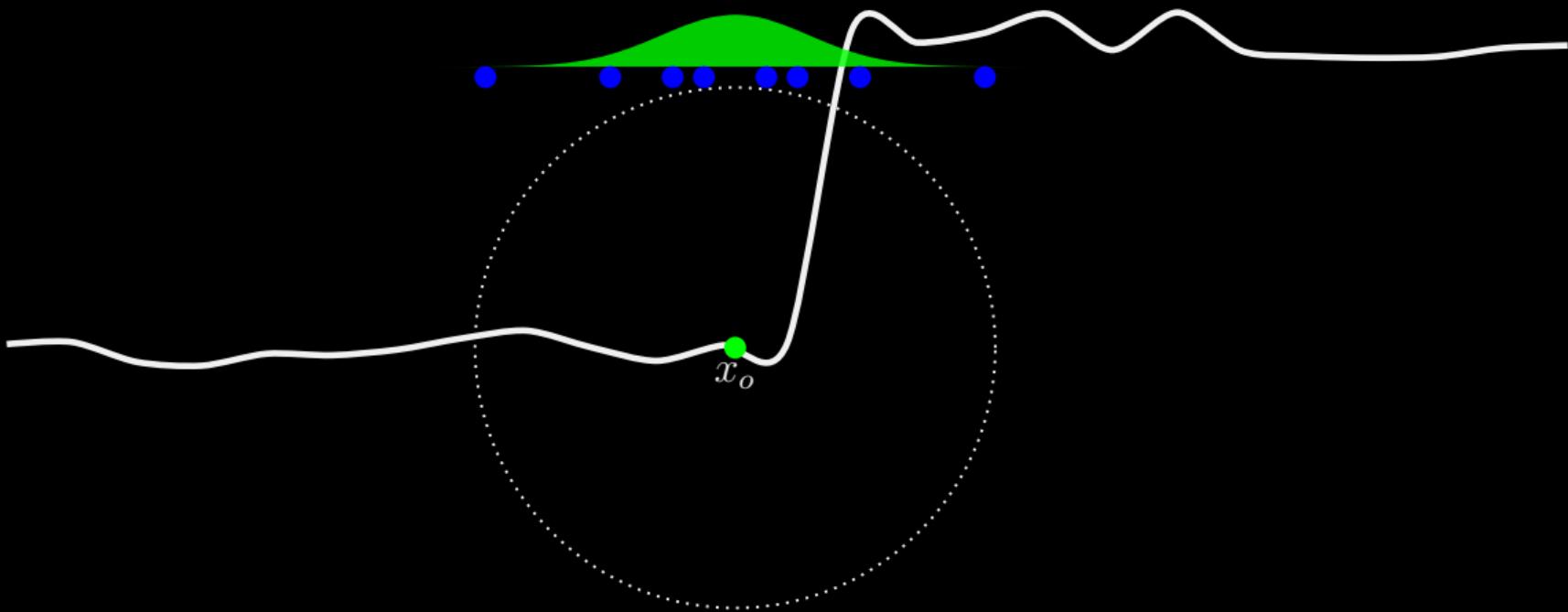
Define  $R_{\max}$  to make search volume well defined



(Not a strict requirement, but keeps probe rays short)

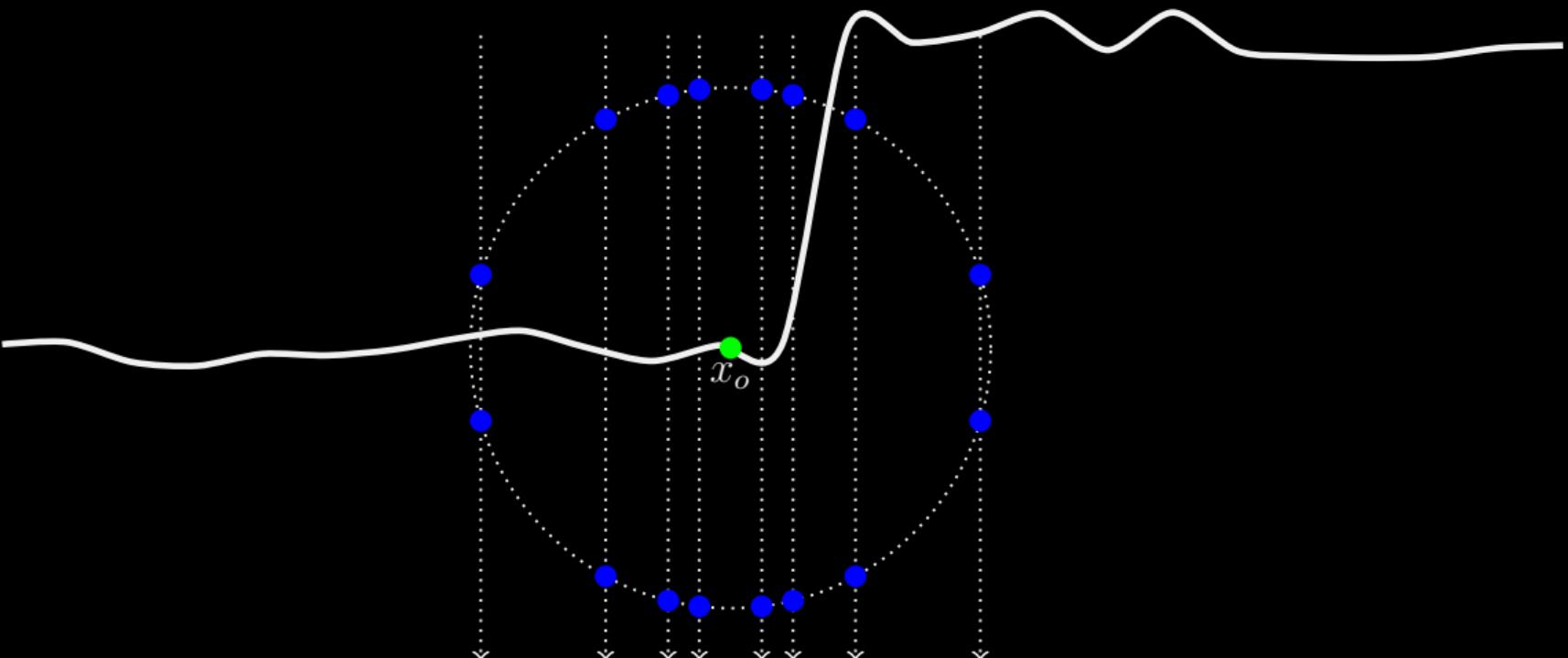
# Our approach

Distribute samples on disk above the surface according to  $R(r)$



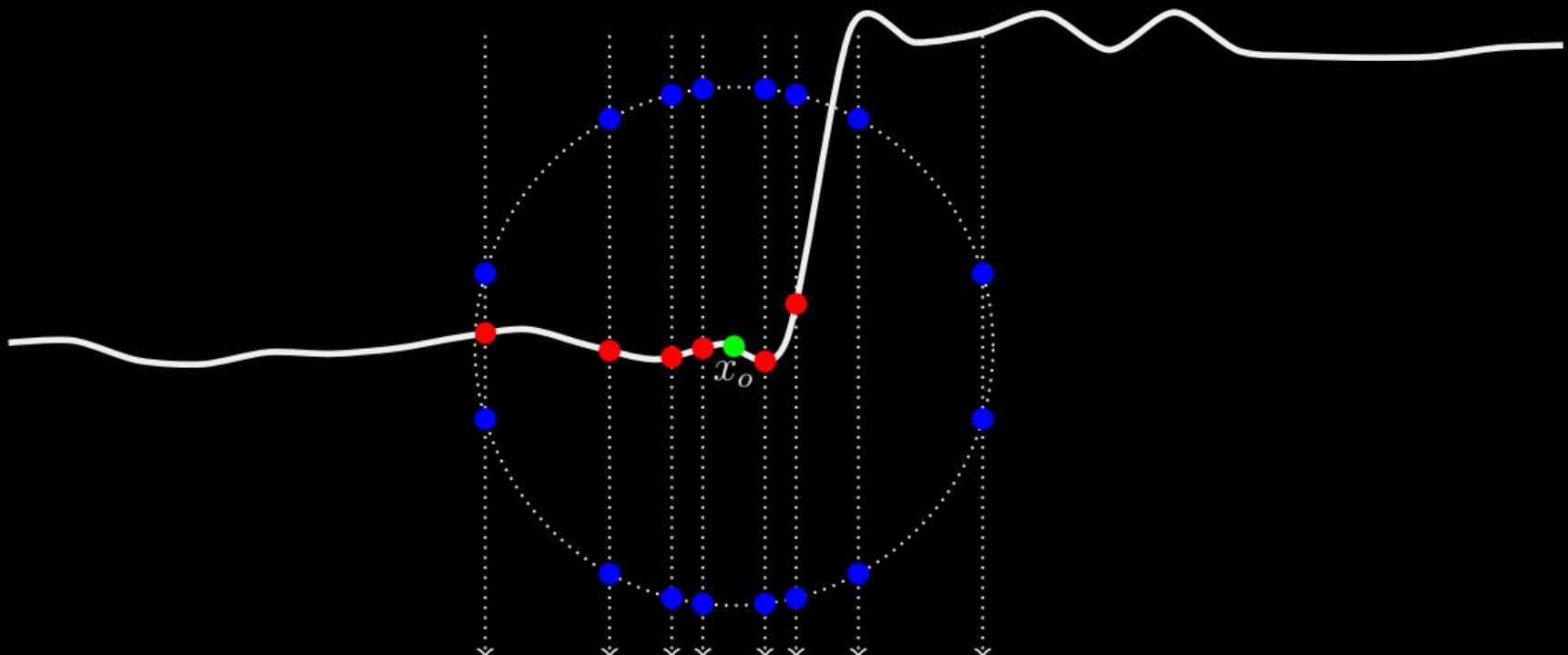
# Our approach

Probe along normal direction, find all hits inside sphere



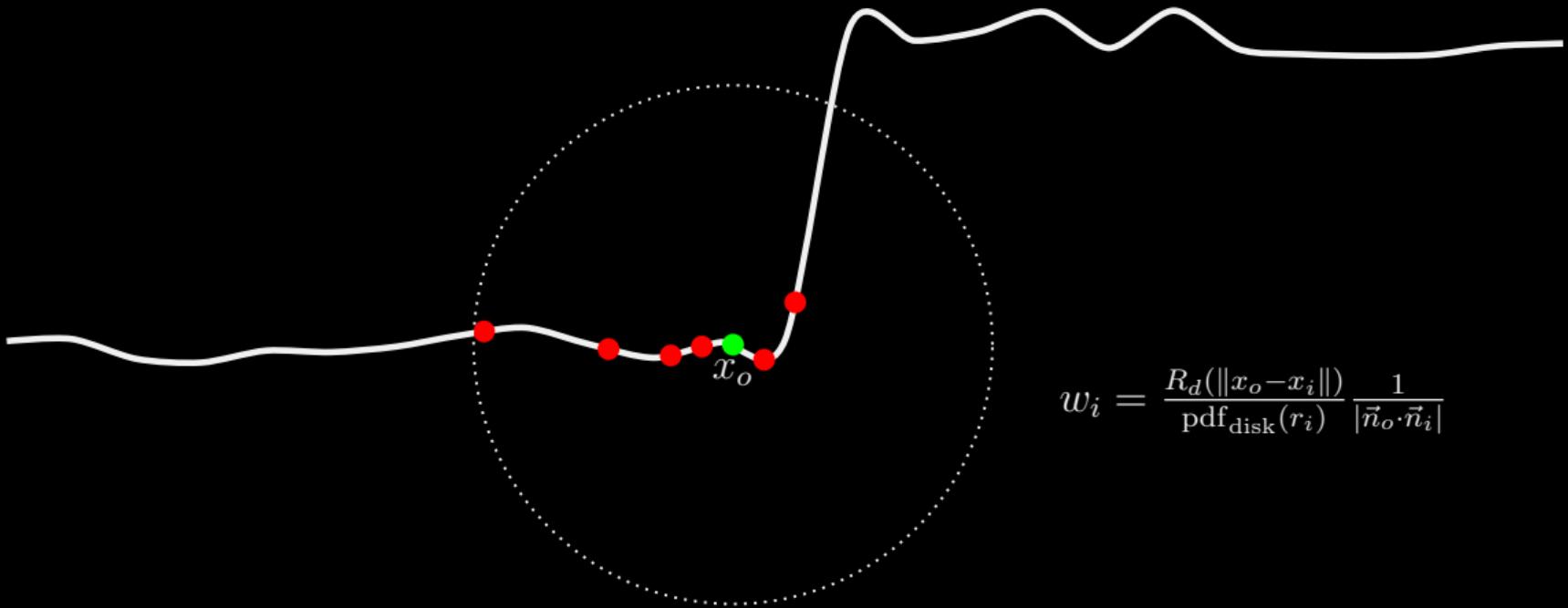
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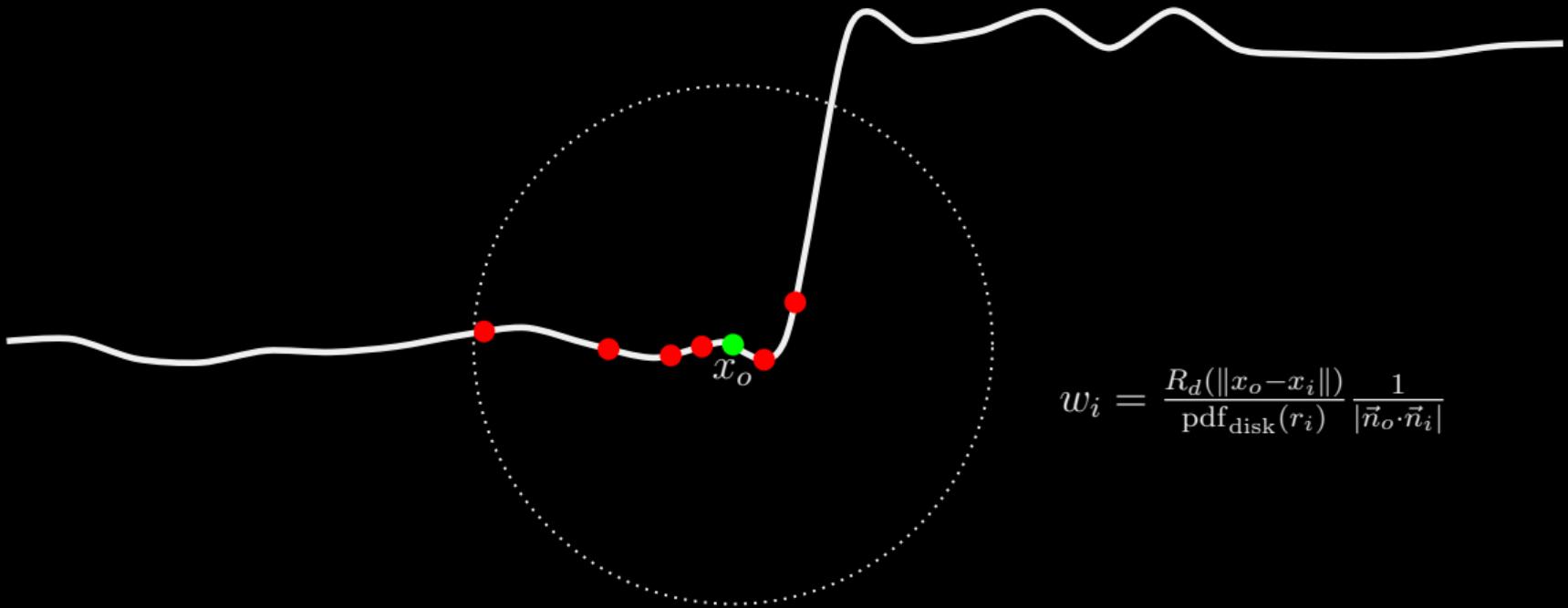
# Our approach

In flat regions,  $|\vec{n}_o \cdot \vec{n}_i| \rightarrow 1$  and  $r_i \approx \|x_o - x_i\|$  so  $w_i \approx 1$



# Our approach

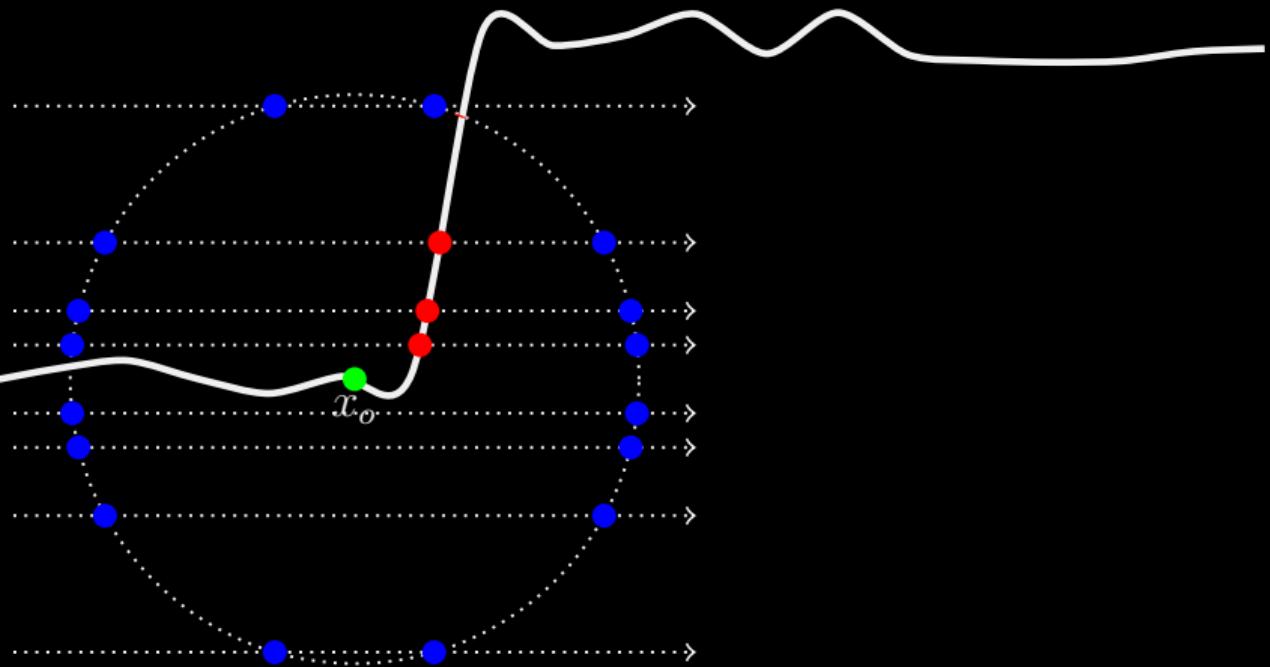
In perpendicular regions:  $|\vec{n}_o \cdot \vec{n}_i| \rightarrow 0$  and  $r_i \neq \|x_o - x_i\|$  so  $w_i \rightarrow \infty$



$$w_i = \frac{R_d(\|x_o - x_i\|)}{\text{pdf}_{\text{disk}}(r_i)} \frac{1}{|\vec{n}_o \cdot \vec{n}_i|}$$

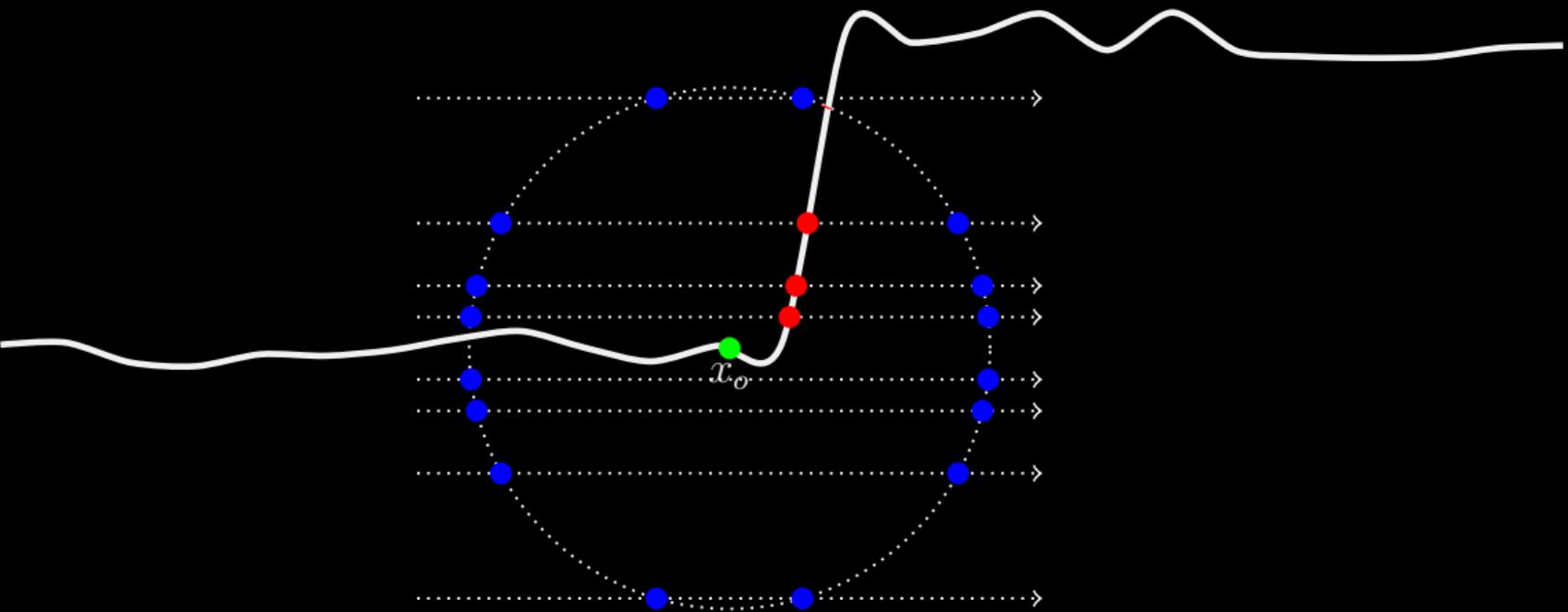
# Our approach

We solve this by probing along *orthogonal* directions as well



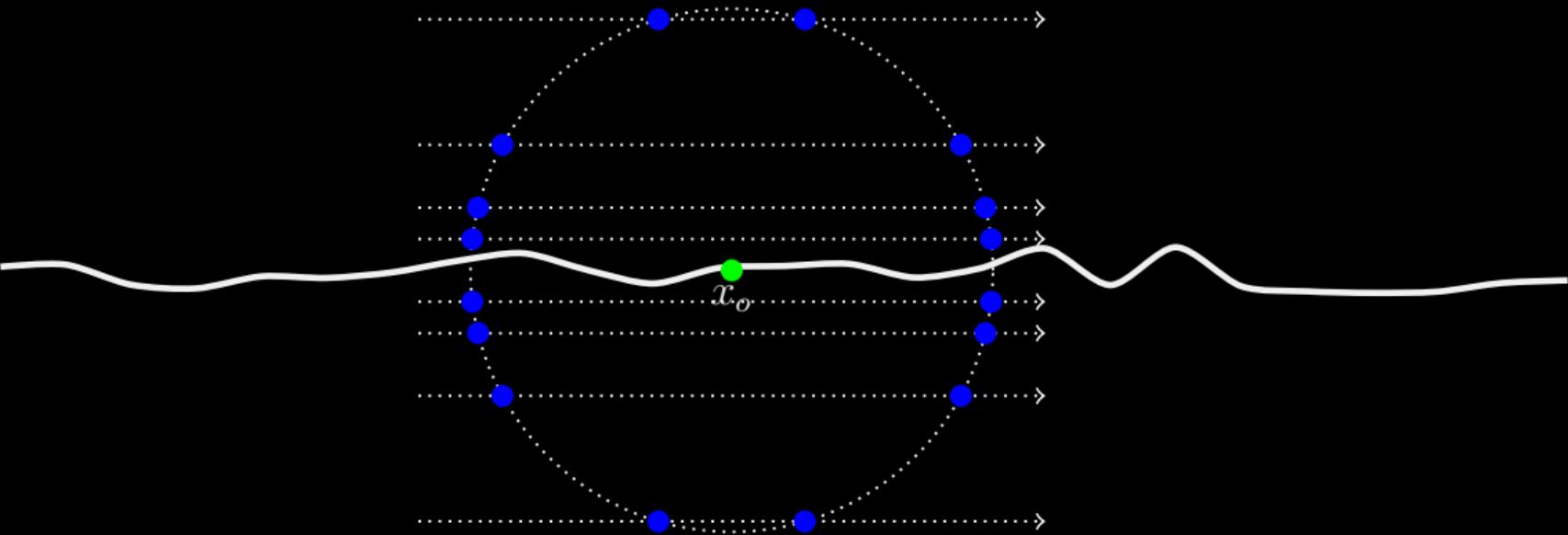
# Our approach - Axis MIS

Combine estimators with *multiple importance sampling* to keep the best of each

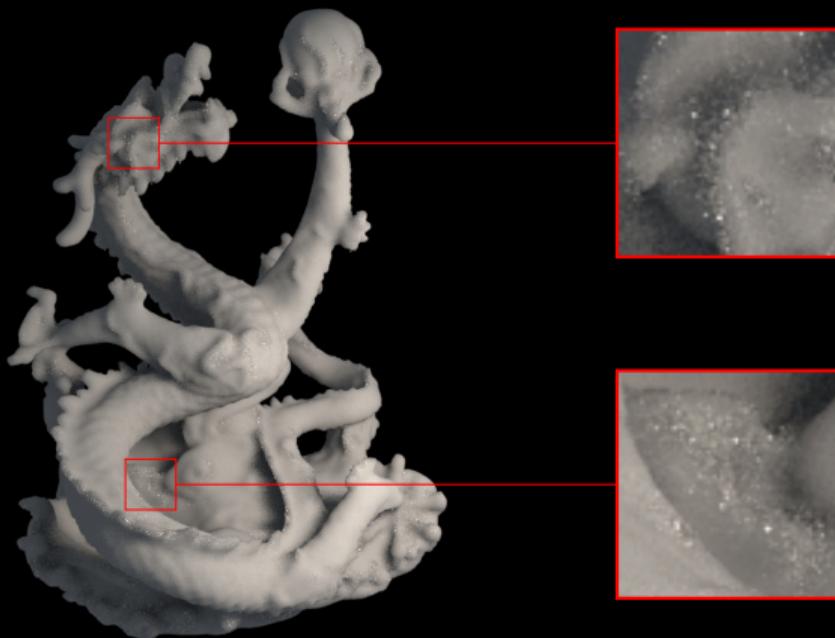


# Our approach - Axis MIS

Some performance is lost in flat regions for more uniform variance overall

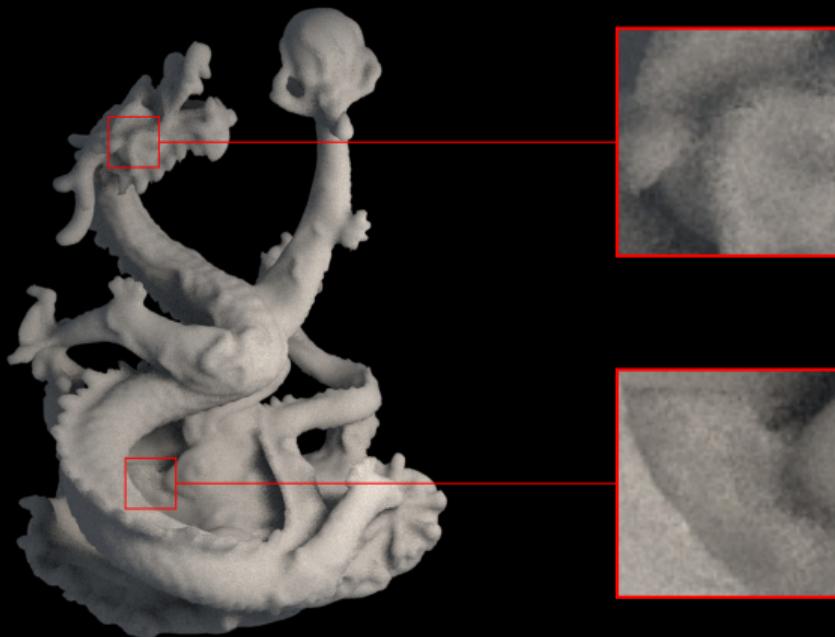


# Axis MIS - Results



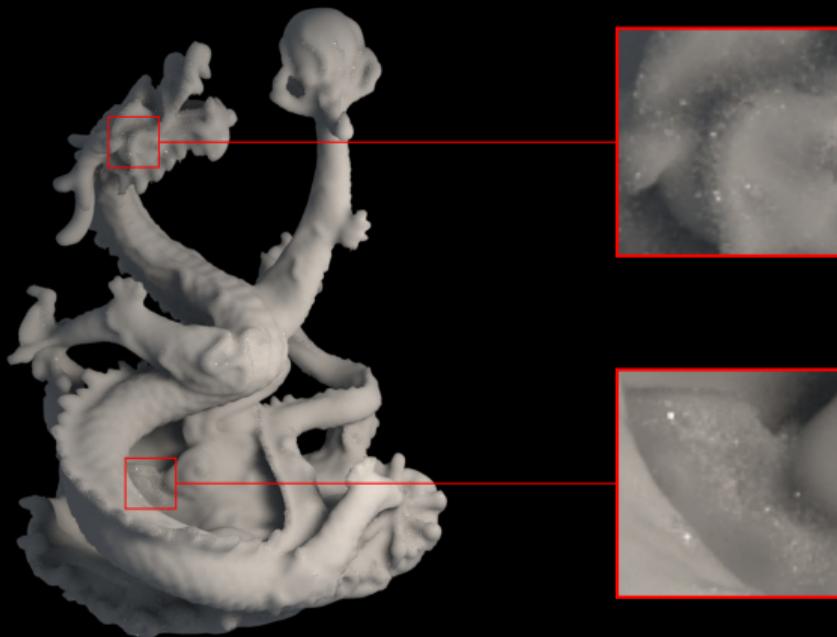
16 paths / pixel  
Probe along N only

# Axis MIS - Results



16 paths / pixel  
Probe along U,V,N with MIS

# Axis MIS - Results



64 paths / pixel  
Probe along N only

# Axis MIS - Results



64 paths / pixel  
Probe along U,V,N with MIS

# Implementation details

- ▶ Choice of axes is arbitrary, we found shading tangent frame works best
- ▶ Assign probabilities ( $\vec{u}$ :  $\frac{1}{4}$ ,  $\vec{v}$ :  $\frac{1}{4}$ ,  $\vec{n}$ :  $\frac{1}{2}$ )
- ▶ Re-use random number of axis selection for random radius
- ▶ Shade *all* hits encountered along the probe ray to handle thin regions
- ▶ Or stochastically choose *one* hit among all probe hits if splitting is not desirable
- ▶ Trace probe rays directly against the surface, bypassing scene hierarchy

## Color MIS - Weighted Sums of BSSRDFs



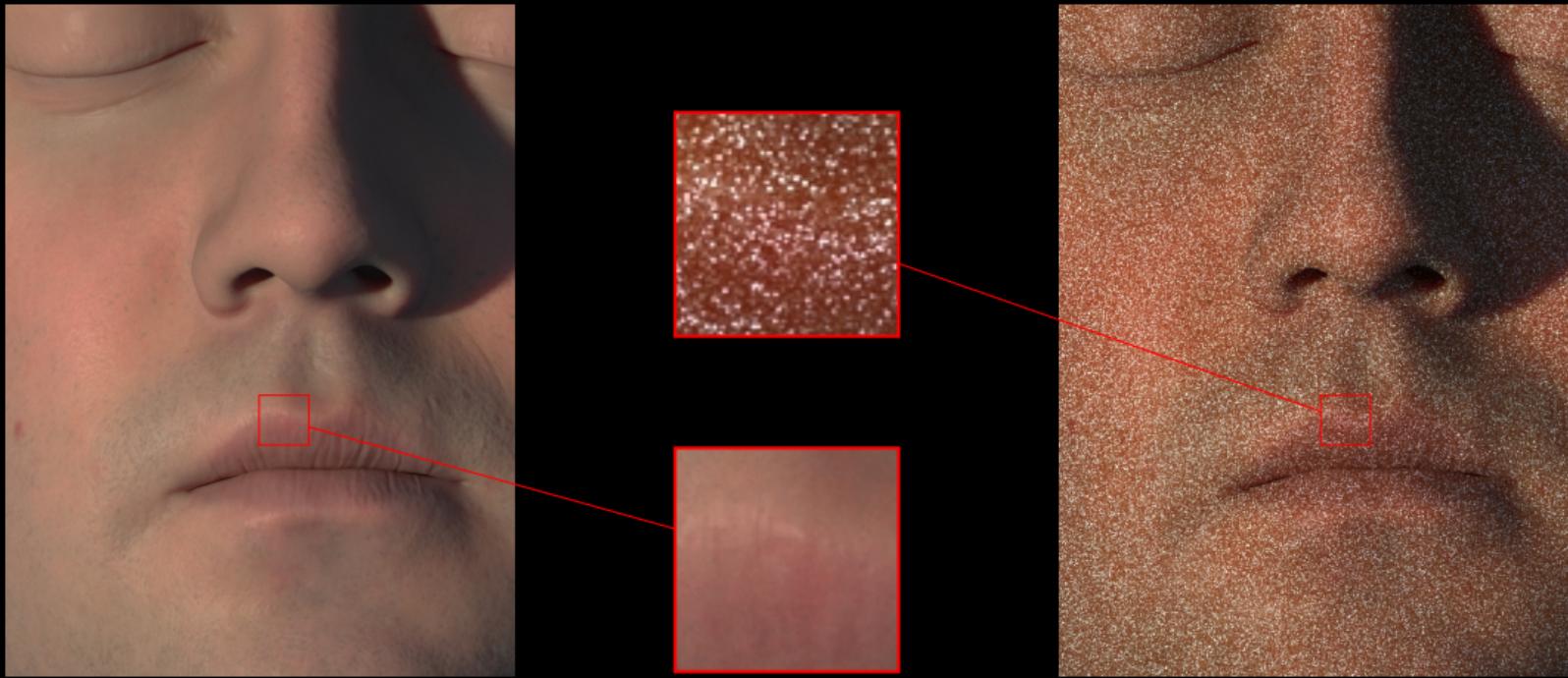
Complex materials like skin are best expressed as weighted sums of simple profiles

# Color MIS - Weighted Sums of BSSRDFs



Complex materials like skin are best expressed as weighted sums of simple profiles

# Color MIS - Weighted Sums of BSSRDFs



MIS between profiles allows more efficient sampling than using the widest alone

## Results - Bonus Features



Fine details like bump are easy to preserve with a traced approach

## Results - Bonus Features

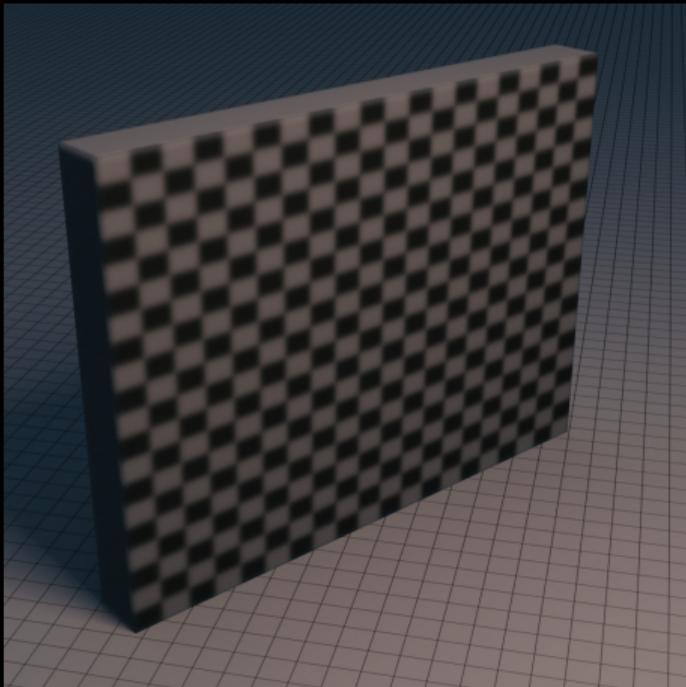
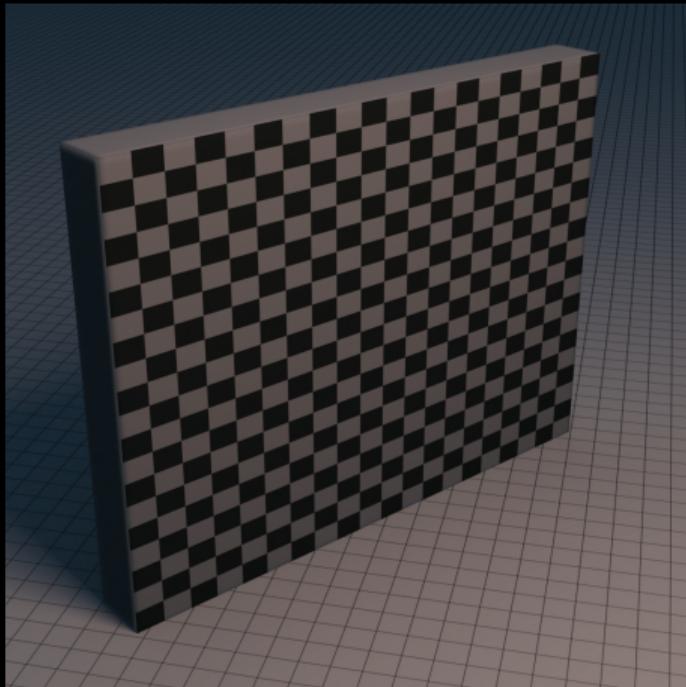


Diffuse BRDF

BSSRDF (no bump)

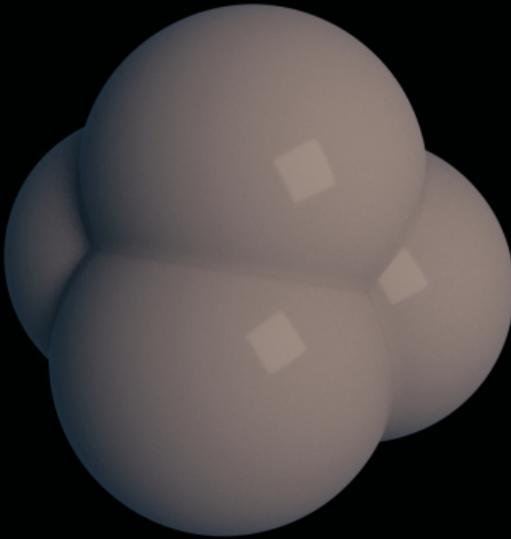
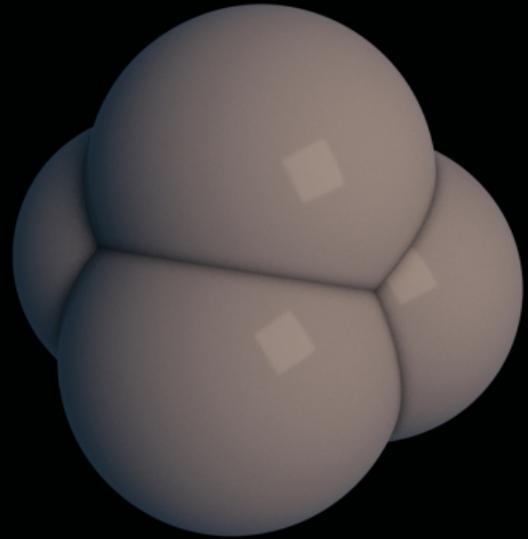
BSSRDF (with bump)

## Results - Bonus Features



Albedo may be blurred along with illumination as well

## Results - Bonus Features



Easy to blur across meshes to avoid seams

## Results - Bonus Features



- ▶ Bi-directional extension is straightforward
- ▶ Create “virtual” vertex to continue path from
- ▶ Select probe hits stochastically if multiple are found

## Results - Bonus Features

- ▶ Motion blur is always correct with traced approach
- ▶ Point clouds usually locked to a single instant
- ▶ Important for fast animation or large receivers



# Production Results



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# Conclusion & Future Work

- ▶ Introduced a simple importance sampling method for BSSRDFs
- ▶ Only requires two random numbers and supports weighted sums of profiles
- ▶ Replaced a much more complex point cloud implementation
- ▶ Much easier for artists to use
- ▶ Perform a more detailed comparison with previous work
- ▶ Extend technique to work with non-radially symmetric profiles

Thanks for listening!



Questions?