

# Photon surfaces for robust, unbiased volumetric density estimation

Xi Deng, Shaojie Jiao, Benedikt Bitterli, and Wojciech Jarosz

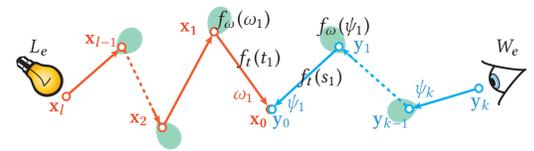
## Introduction

Previous work [Bitterli and Jarosz '17] made unbiased volumetric density estimation possible, but in practice, bias needs to be introduced to remove singularities.

We show how to stay unbiased while removing singularities.

- Our approach includes two parts:
- A framework for deriving “photon surface” estimators.
  - A way to remove singularities from the resulting estimators by combining them using multiple importance sampling (MIS) [Veach and Guibas '95].

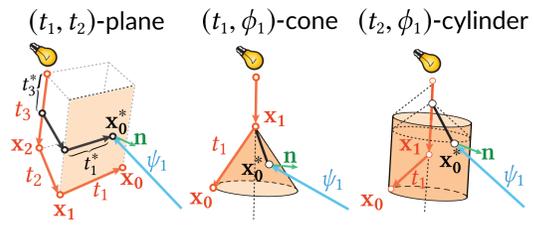
## Photon surfaces



Traditional photon mapping [Jensen and Christensen '98; Jarosz et al. '08, '11] gathers the path contribution inside a finite-sized kernel  $K(g)$ , where  $g$  is the vector between the end points of the camera and light subpaths.

The finite kernel allows paths to contribute even if the subpath endpoints don't coincide, but this also introduces bias. Theoretically, an infinitesimal Dirac delta kernel would remove bias, but would be impossible to sample with Monte Carlo. We use a 3D Dirac delta kernel to eliminate bias, but then analytically pre-integrate 3 sampled dimensions: the distance along the camera ray, and 2 arbitrary sampling dimensions along the photon subpath.

Intuitively, pre-integration along the photon subpath produces “photon surfaces” sweeping the position of the photon for all possible values of the 2 analytically integrated dimensions. Each choice of these 2 dimensions produces a different unbiased photon surface. We can choose any directional dimensions  $\cos \theta, \phi$ ; distance dimension  $t$ ; or dimensions  $u, v$  on the light source, e.g.:



# We created a new class of unbiased photon density estimators and combined them using multiple importance sampling.

	Ours	Previous work
SINGLE	Var: 0.024x MIS $(u, t), (\phi, t), (u, \phi)$ -planes	Beams
2+ BOUNCES	Var: 0.389x MIS 3-planes, cones, cylinders	0D Planes
3+ BOUNCES	Var: 0.340x MIS 3-planes	0D Planes
	Var: 0.225x MIS 3-planes, cones, cylinders	

Come to our talk to learn more! Tuesday, 9 - 10:30 am in Room 152.



## Removing singularities

Each individual photon surface estimator suffers from singularities—e.g. at grazing angles or at the apex of a photon cone—which we would like to remove.

Path sampling PDFs: Since each camera ray-photon surface intersection corresponds to one light path, we can interpret each estimator as a path sampling strategy with a corresponding PDF. Singularities on a photon surface correspond to paths that are vanishingly unlikely to be sampled (extremely low PDF).

Being able to evaluate a path PDF for each estimator enables combining several different photon surface estimators using multiple importance sampling. As long as a singular path in one estimator has a non-zero PDF with another estimator, the singular estimator will be down-weighted, eliminating the singularity.

Here's an example of combining 2 different estimators:



MISing a continuum of strategies: The various choices of 2 analytic dimensions create a large, but countable number of photon surface strategies that we can combine using MIS to mitigate singularities. Additionally, there are infinitely many possible  $u, v$  parametrizations for the light source (e.g., all possible  $u, v$  rotations on a planar light), each resulting in photon surfaces with different PDFs and singularities. We extend traditional MIS—which can combine a discrete number of strategies—to combine such a continuum of strategies.

## References

Benedikt Bitterli and Wojciech Jarosz. Beyond points and beams: Higher-dimensional photon samples for volumetric light transport. *ACM Transactions on Graphics (Proceedings of SIGGRAPH)* 36, 4 (July 2017). doi: 10/gfznr

Wojciech Jarosz, Derek Nowrouzezahrai, Iman Sadeghi, and Henrik Wann Jensen. A comprehensive theory of volumetric radiance estimation using photon points and beams. *ACM Transactions on Graphics (Presented at SIGGRAPH)* 30, 1 (Feb. 2011). doi: 10/fcdh2f

Wojciech Jarosz, Matthias Zwicker, and Henrik Wann Jensen. The beam radiance estimate for volumetric photon mapping. *Computer Graphics Forum (Proceedings of Eurographics)* 27, 2 (April 2008). doi: 10/bjsfsx

Henrik Wann Jensen and Per H. Christensen. Efficient simulation of light transport in scenes with participating media using photon maps. *Annual Conference Series (Proceedings of SIGGRAPH)* 32 (July 1998). doi: 10/b64p36

Eric Veach and Leonidas J. Guibas. Optimally combining sampling techniques for Monte Carlo rendering. *Annual Conference Series (Proceedings of SIGGRAPH)* 29 (August 1995). doi: 10/d7b6n4

