



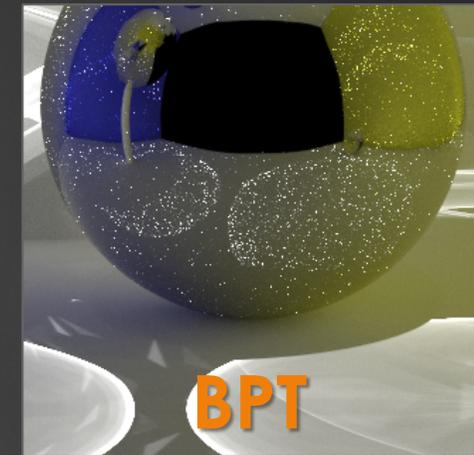
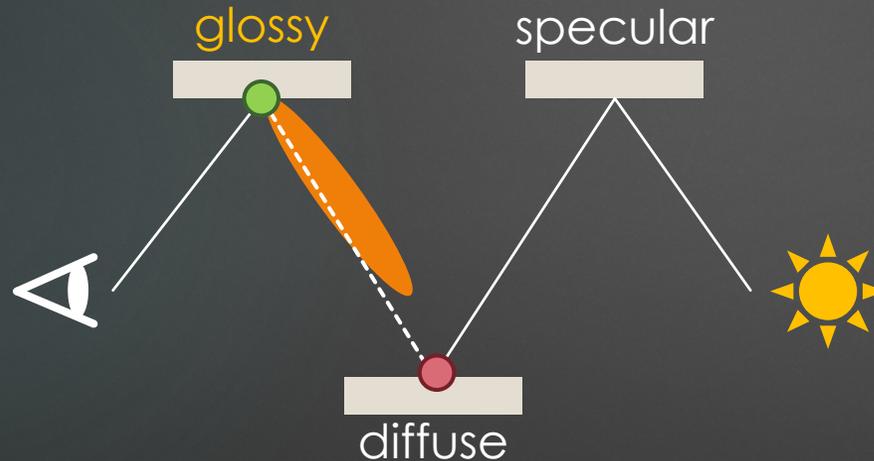
Hierarchical Russian Roulette for Vertex Connections

YUSUKE TOKUYOSHI (SQUARE ENIX CO., LTD.)

TAKAHIRO HARADA (ADVANCED MICRO DEVICES, INC.)

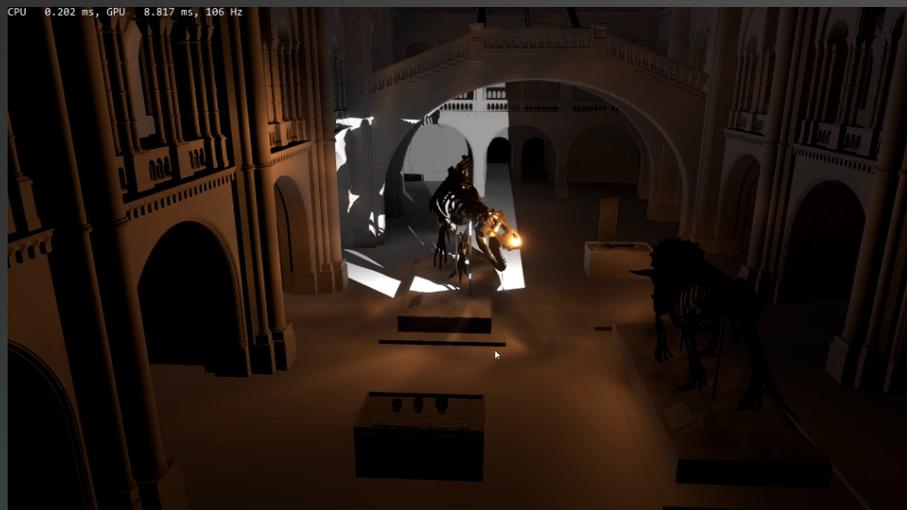
Specular-Diffuse-Glossy Paths in BPT

- ▶ Connectable
- ▶ Inefficient for **extremely glossy** surfaces ☹️
- ▶ Need many samples ☹️



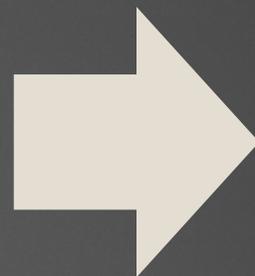
GGX roughness: 0.0001

Previous Work



Stochastic light culling for VPLs
[Tokuyoshi16,17]

- ✗ SDG paths
- ✗ Uncorrelated variance
- ✗ Anisotropic BRDFs

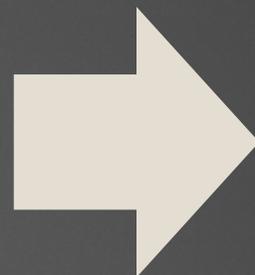


Our method for offline BPT

Previous Work



Stochastic light culling for VPLs
[Tokuyoshi16,17]



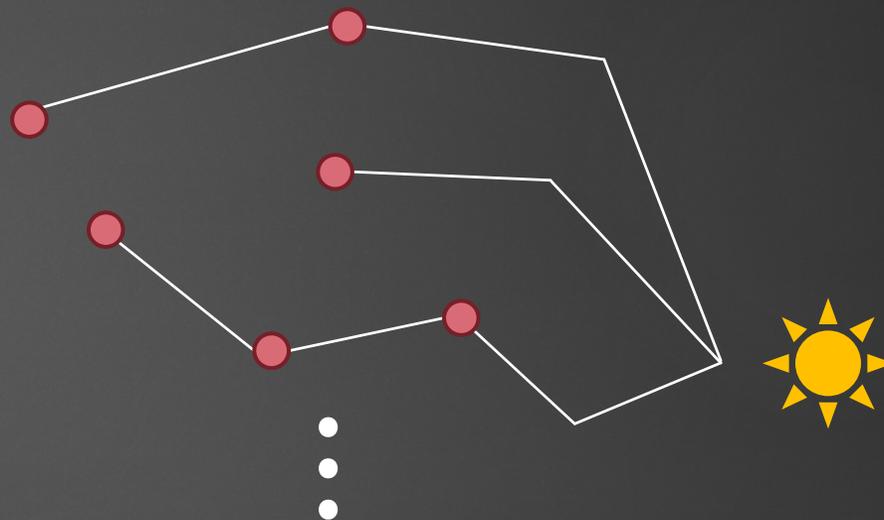
Our method for offline BPT

- ✓ SDG paths
- ✓ Uncorrelated variance
- ✓ Anisotropic BRDFs

Overview of Our BPT



Light-subpath tracing pass

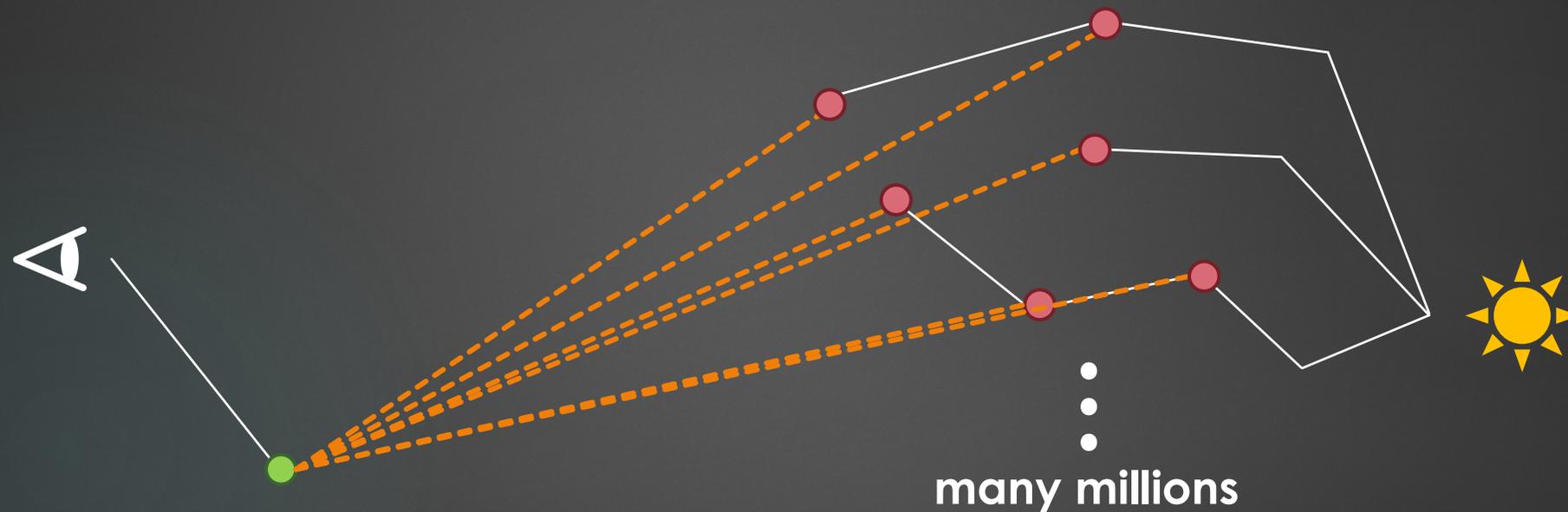


many millions

Store light vertices in a cache
similar to virtual point lights [Keller97]

Overview of Our BPT

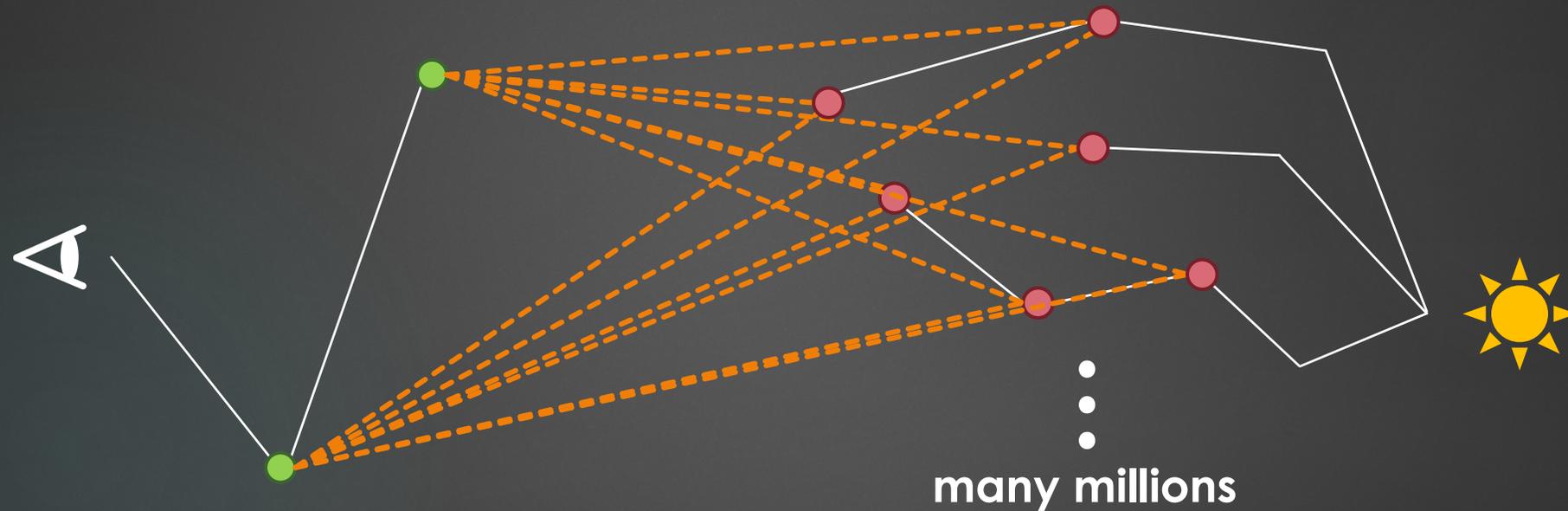
Eye-subpath tracing pass



Russian roulette [Arvo90] for all the vertex connections
(Probability \propto Scattering lobe / Distance²)

Overview of Our BPT

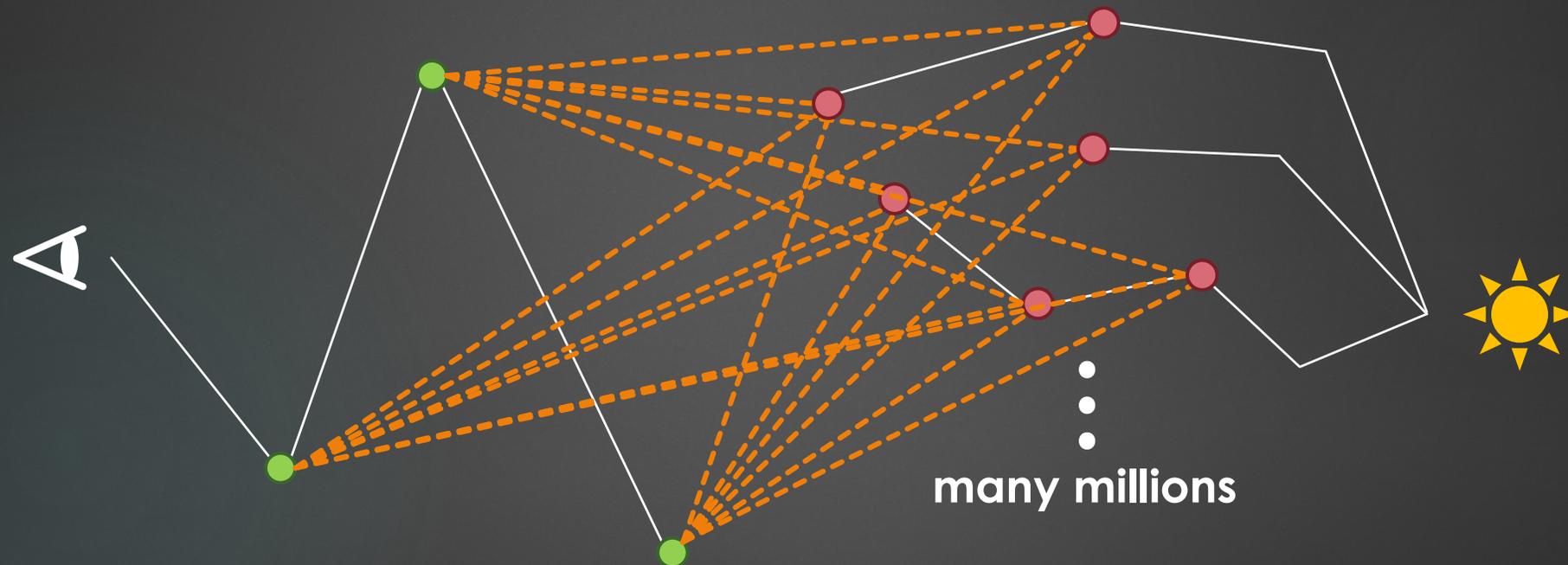
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Overview of Our BPT

Eye-subpath tracing pass



Russian roulette [Arvo90] for all the vertex connections
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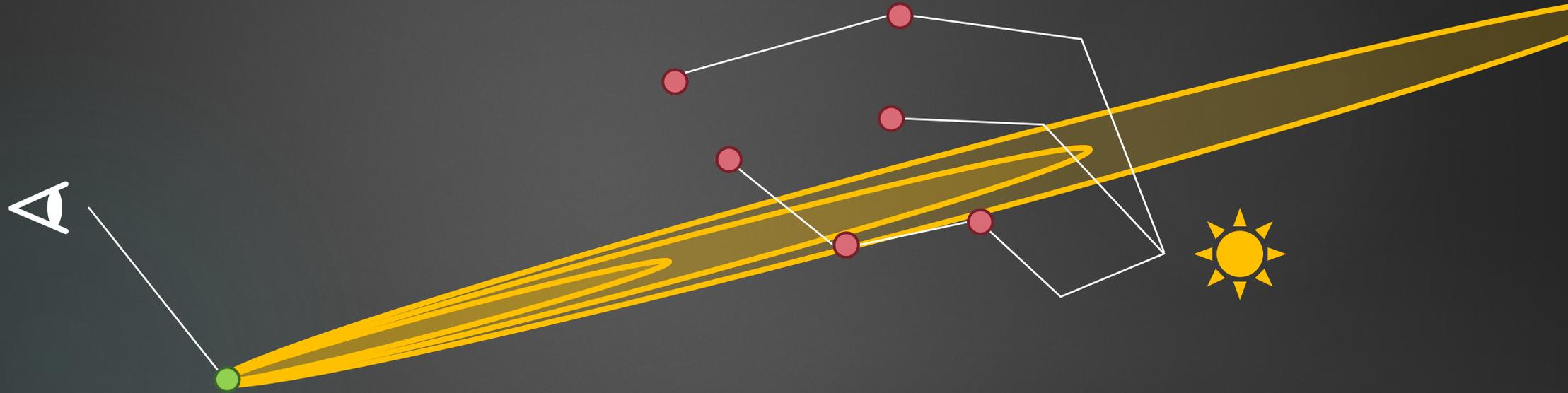
Overview of Our BPT

Eye-subpath tracing pass



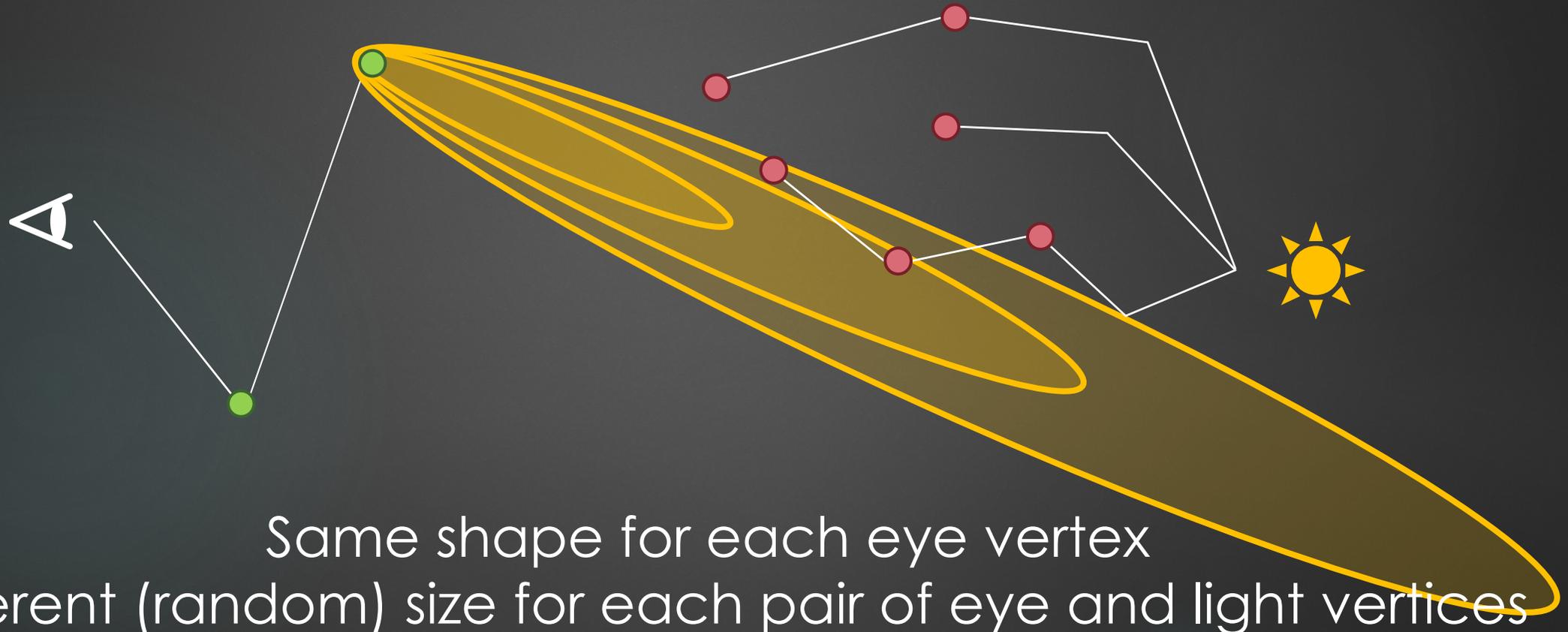
Russian roulette [Arvo90] for all the vertex connections
(Probability \propto Scattering lobe / Distance²)

Acceptance Range in World Space



Same shape for each eye vertex
Different (random) size for each pair of eye and light vertices

Acceptance Range in World Space



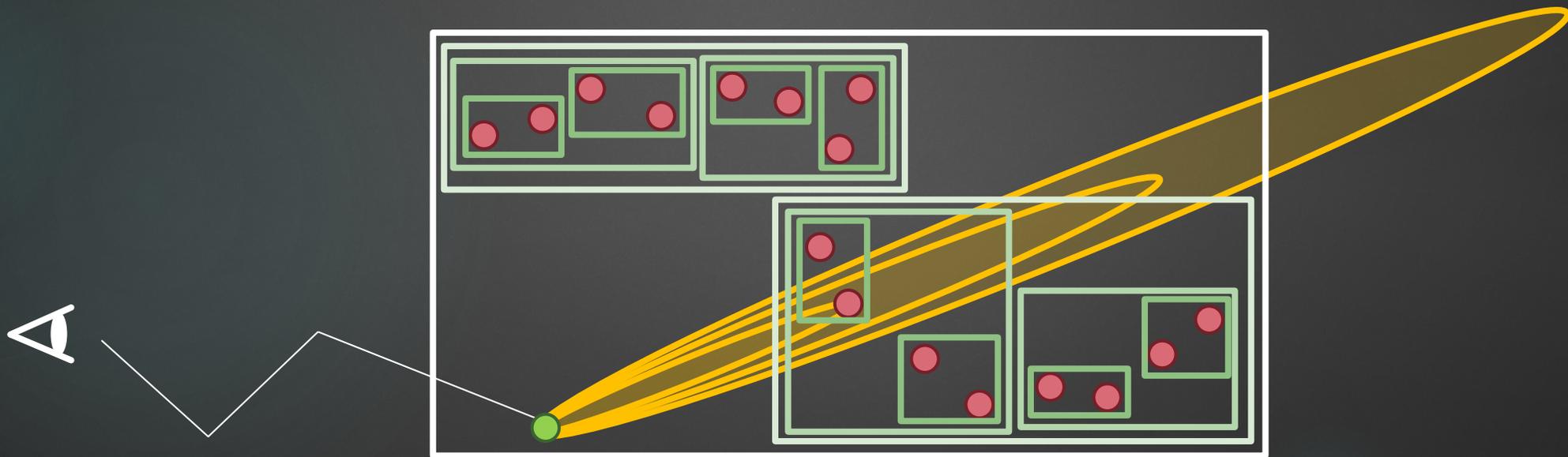
Acceptance Range in World Space



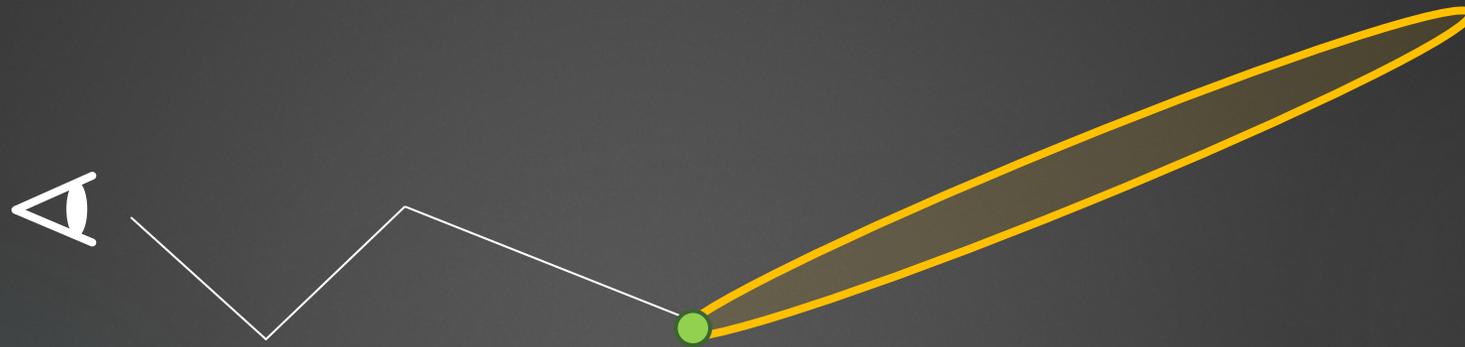
Same shape for each eye vertex
Different (random) size for each pair of eye and light vertices

Culling Using BVH

- ▶ Build a BVH for cached light vertices
- ▶ Hierarchical intersection tests between the range and each BVH node
- ▶ Ellipsoidal range is used for a simple intersection test



Stochastic Scattering Range



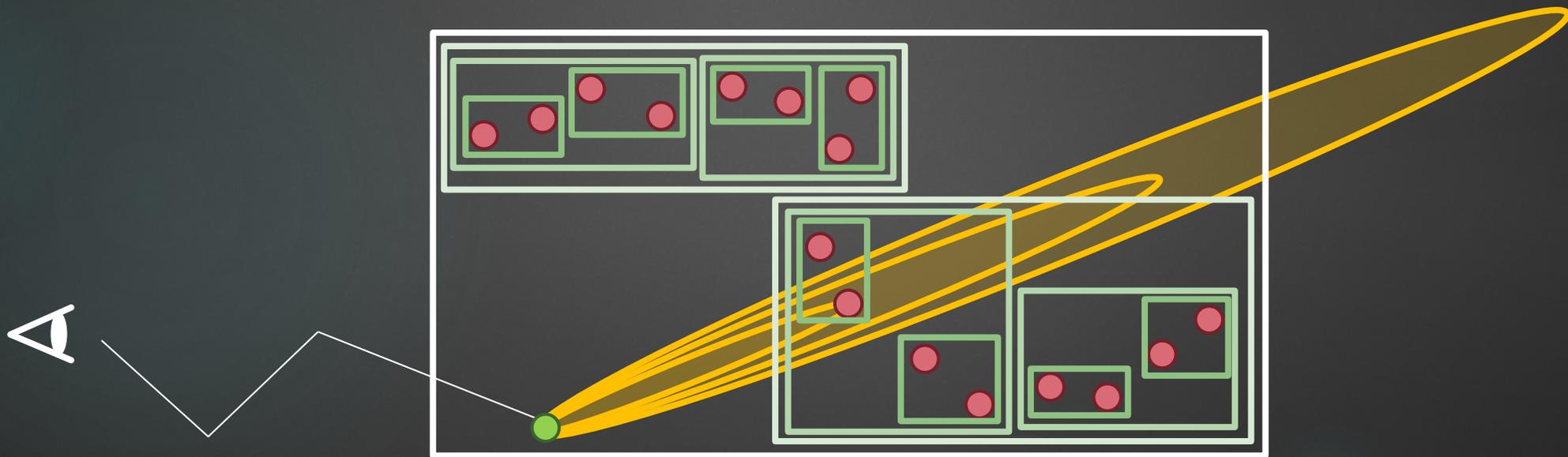
Approximated to make an ellipsoidal range

$$\text{Range} = \sqrt{\frac{\text{Constant} \times \text{Scattering lobe}}{\text{Uniform random number} \in [0,1)}}$$

Different for each pair of eye and light vertices

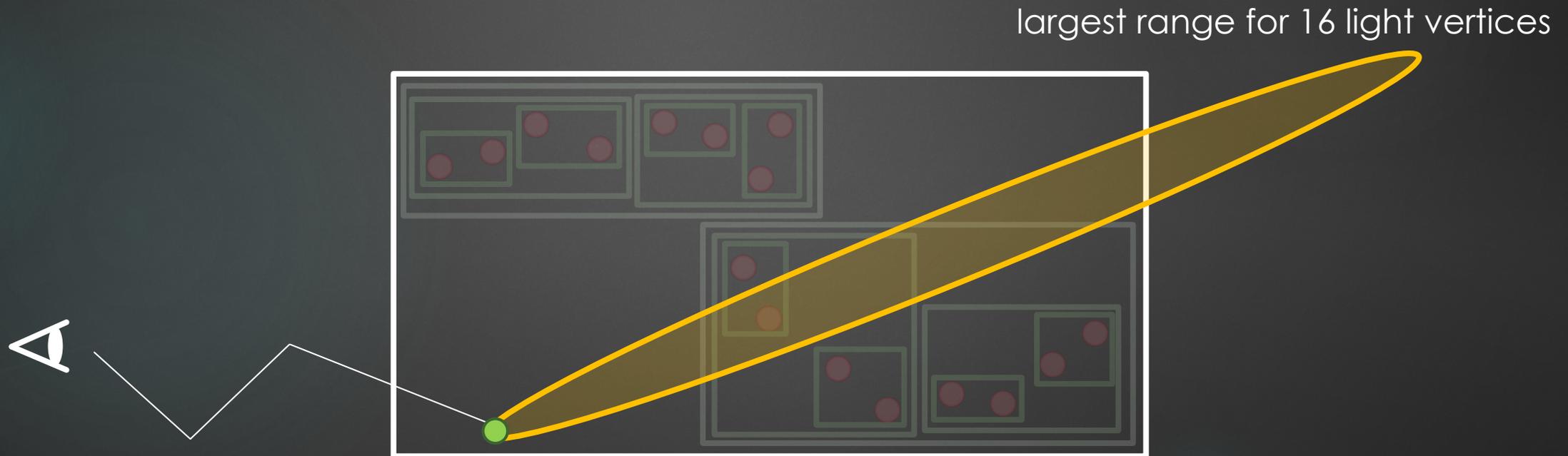
Range Size in BVH Traversal

- ▶ Random for each light vertex (i.e., leaf node)
- ▶ Use the **largest size** in each node for conservative intersection test



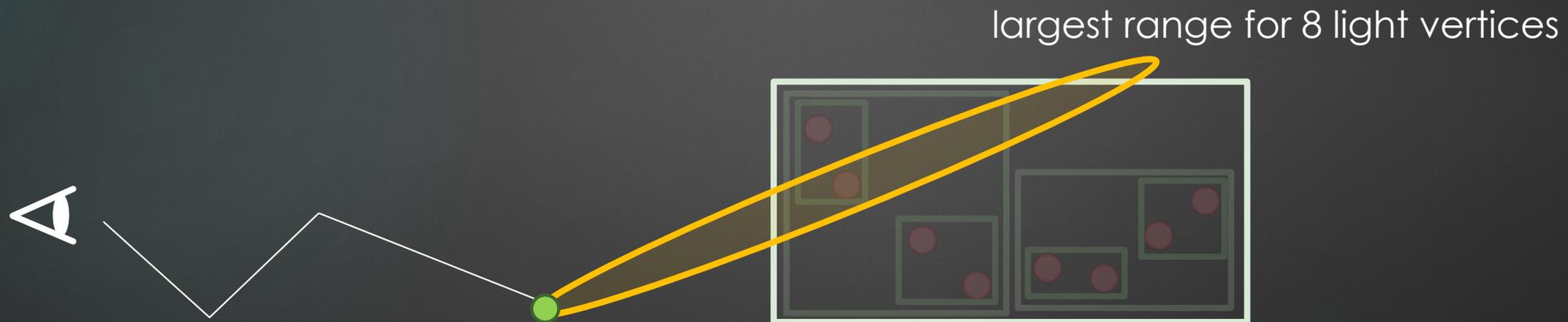
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$$\text{Largest range} = \sqrt{\frac{\text{Constant} \times \text{Scattering lobe}}{\text{Minimum of uniform random numbers}}}$$

Range Size in BVH Traversal

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$$\text{Largest range} = \sqrt{\frac{\text{Constant} \times \text{Scattering lobe}}{\text{Minimum of uniform random numbers}}}$$

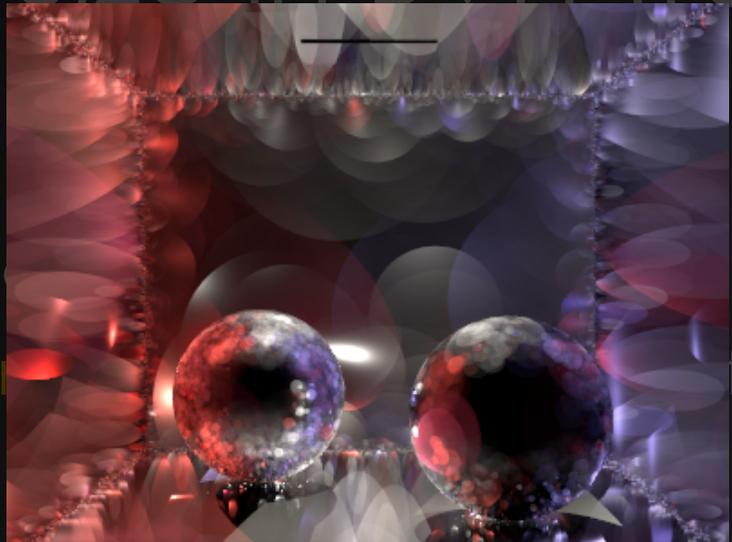
Pregenerate and store in each node?

(Similar to lightcuts [Walter05] & stochastic light culling [Tokuyoshi16])

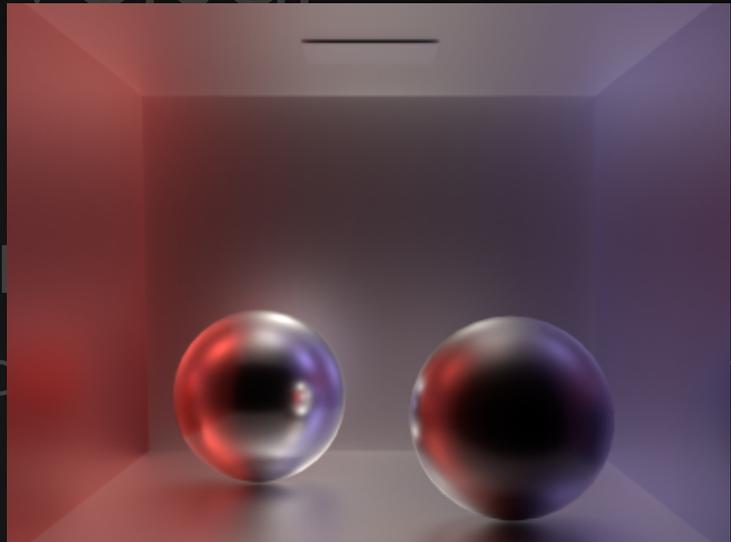


Range Size in BVH Traversal

- ▶ Random for
- ▶ Use the largest range for intersection test



Pregeneration



Reference

Correlation of variance ☹️

$$\sqrt{\frac{\text{Constant} \times \text{Scattering Jobs}}{\text{Minimum of uniform random numbers}}}$$

Pregenerate and store in each node?

(Similar to lightcuts [Walter05] & stochastic light culling [Tokuyoshi16])

Range Size in BVH Traversal

- ▶ Random for each light vertex (i.e., leaf node)
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$$\text{Largest range} = \sqrt{\frac{\text{Constant} \times \text{Scattering lobe}}{\text{Minimum of uniform random numbers}}}$$

~~Pregenerate and store in each node?~~

(Similar to lightcuts [Walter05] & stochastic light culling [Tokuyoshi16])

Range Size in BVH Traversal

- ▶ Random for each light vertex (i.e., leaf node)
- ▶ Use the **largest size** in each node for conservative intersection test

$$\text{Largest range} = \sqrt{\frac{\text{Constant} \times \text{Scattering lobe}}{\text{Minimum of uniform random numbers}}}$$

Different for each pair of eye vertex and BVH node

Top-down Minimum Random Number Generation



On-the-fly generation
in BVH traversal

Top-down Minimum Random Number Generation

- ▶ Generate a minimum random number larger than the parent at each orange node



Top-down Minimum Random Number Generation



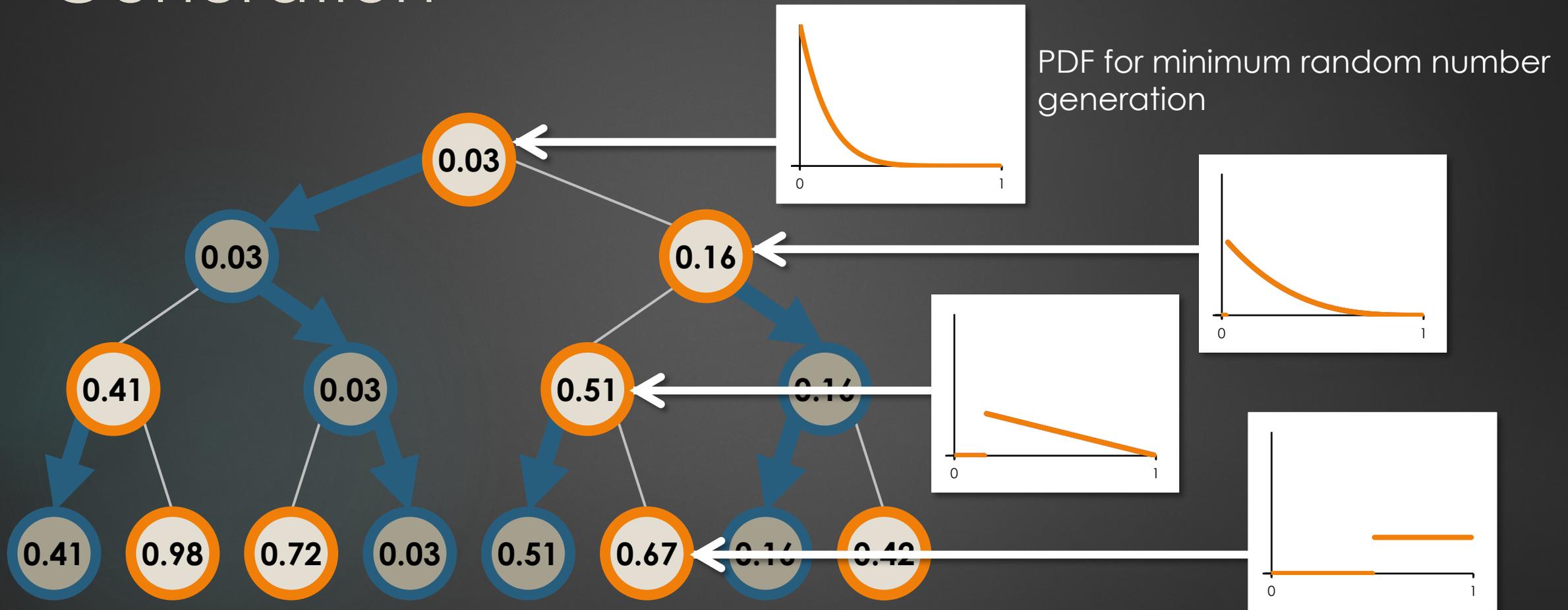
- ▶ Generate a minimum random number larger than the parent at each orange node
- ▶ Transmit to single randomly selected child node (blue)

Top-down Minimum Random Number Generation



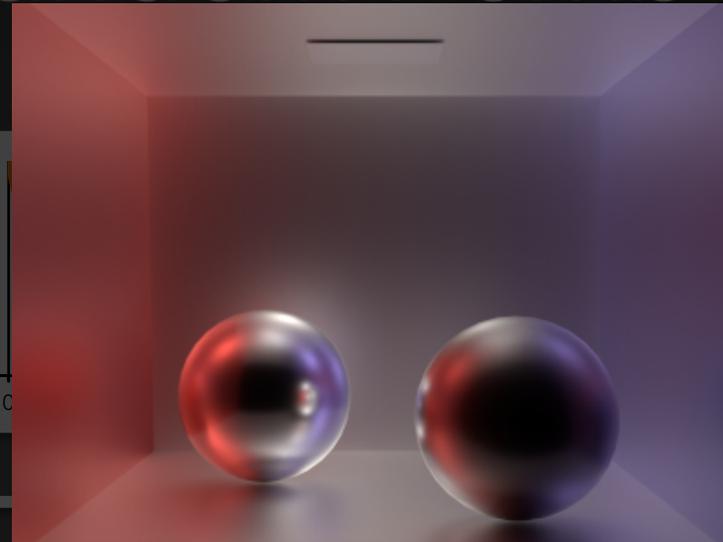
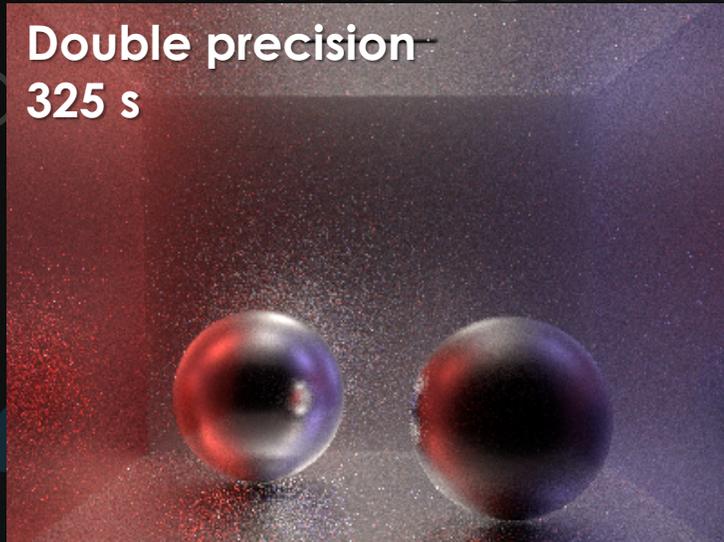
- ▶ Generate a minimum random number larger than the parent at each orange node
- ▶ Transmit to single randomly selected child node (blue)
- ▶ Orange and blue nodes are siblings

Top-down Minimum Random Number Generation





Top-down Minimum Random Number Generators



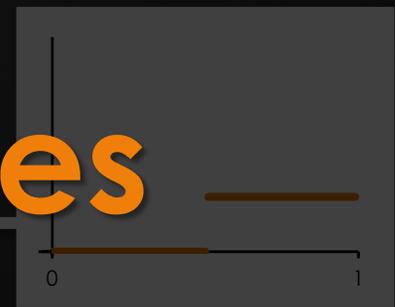
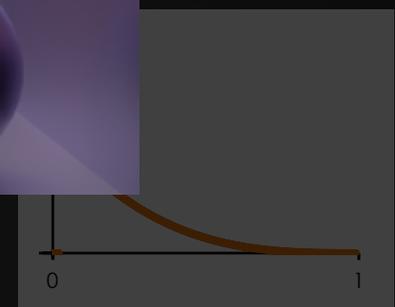
Ours

Reference

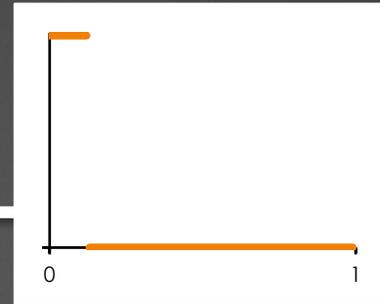
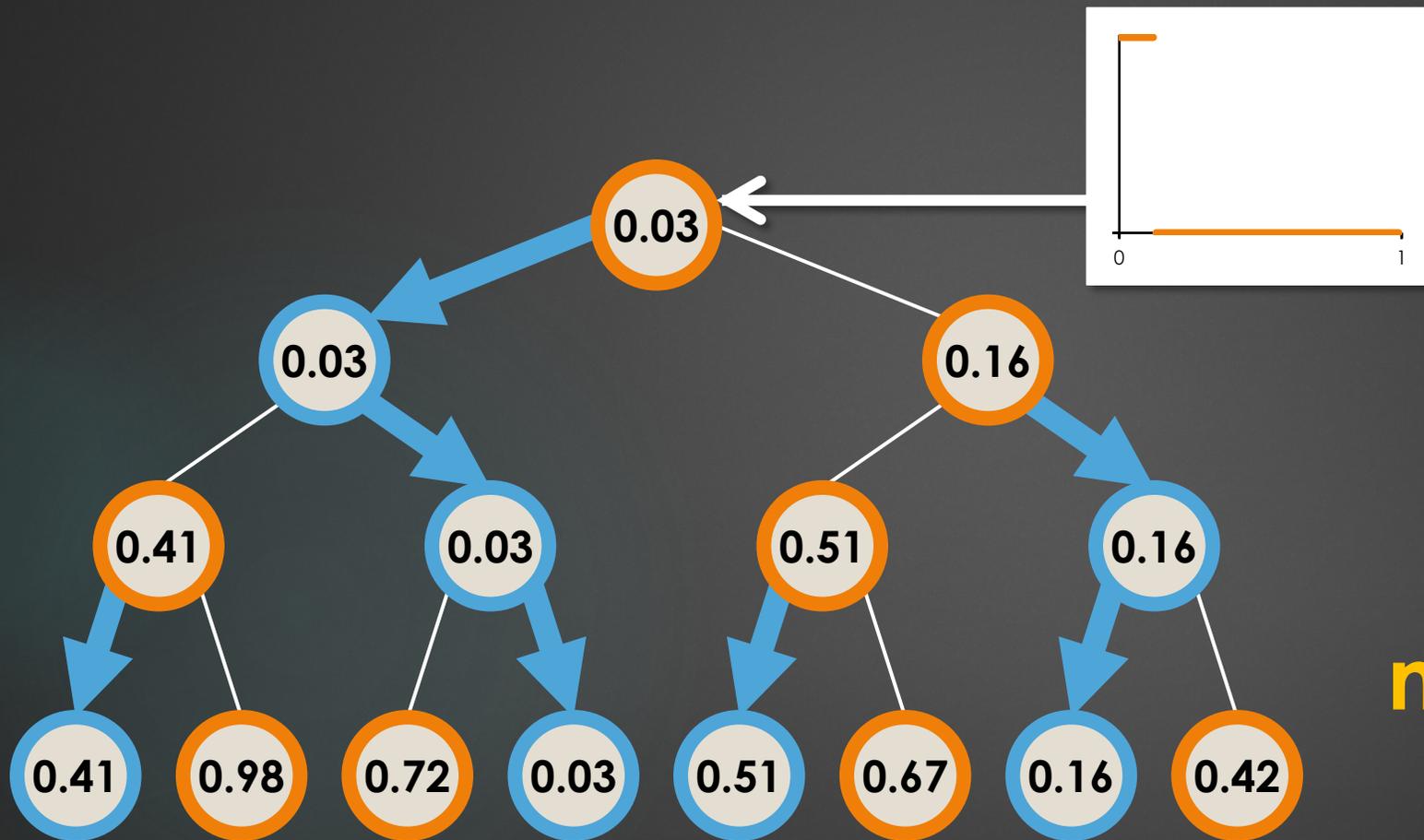


**Numerical error ☹️
for millions of leaf nodes**

random number



Semi-Stratified Sampling



PDF for minimum random number generation

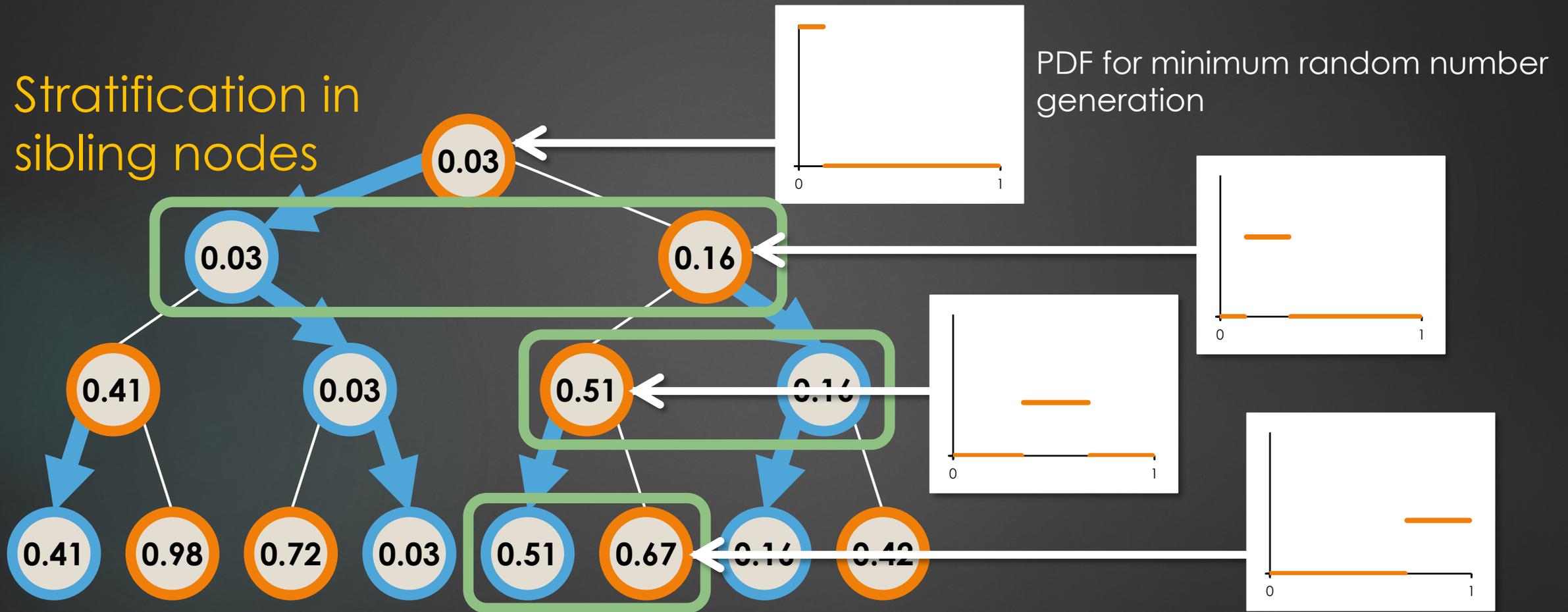
Uniform in the stratum

**Simple &
numerically stable**

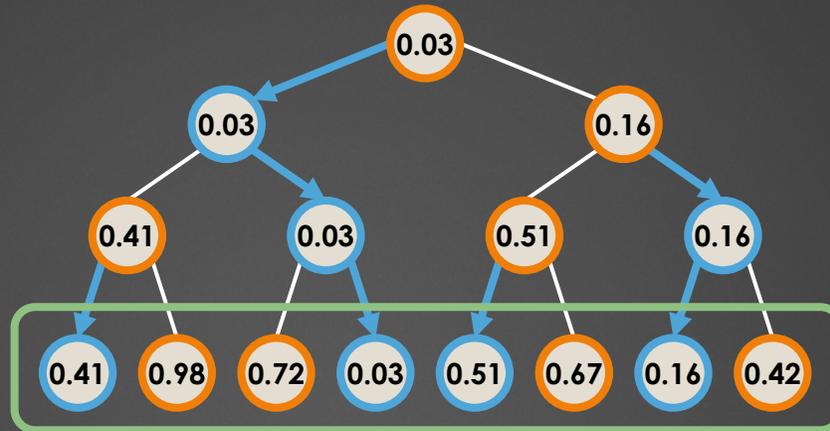


Semi-Stratified Sampling

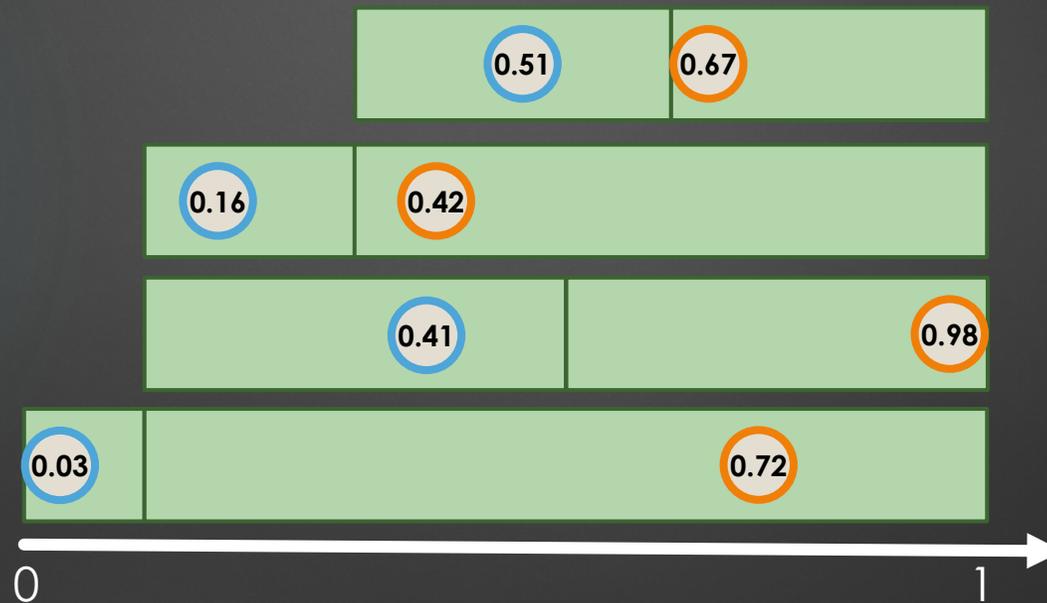
Stratification in sibling nodes



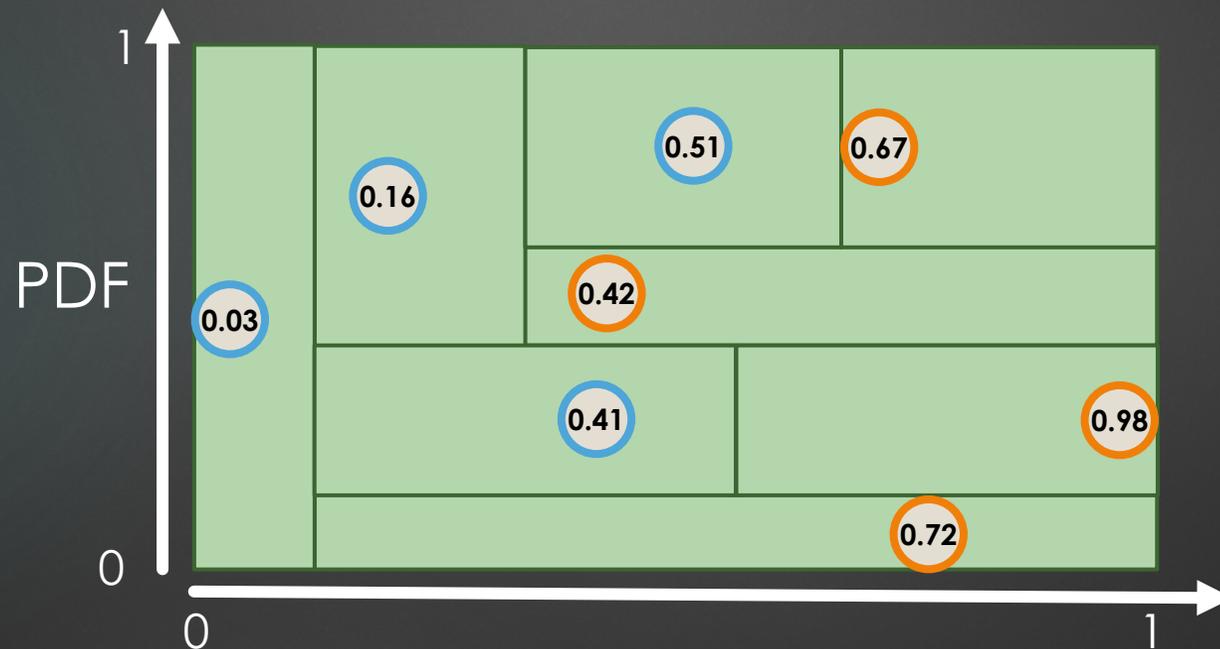
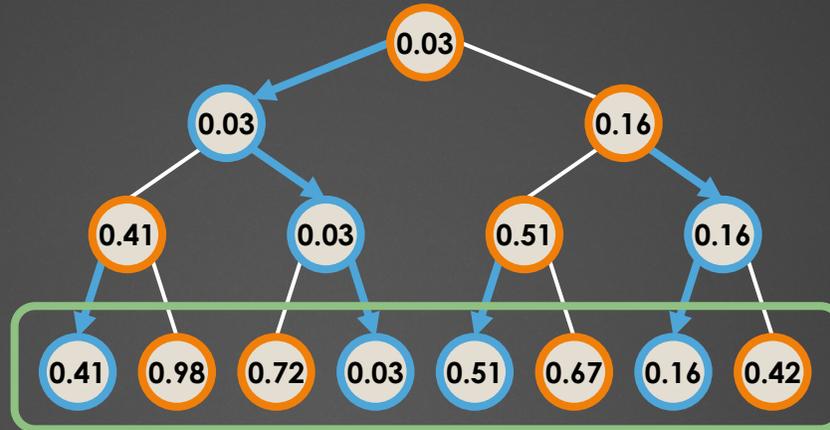
Overlaps of Strata at the Leaf Level



Stratified only in two sibling nodes

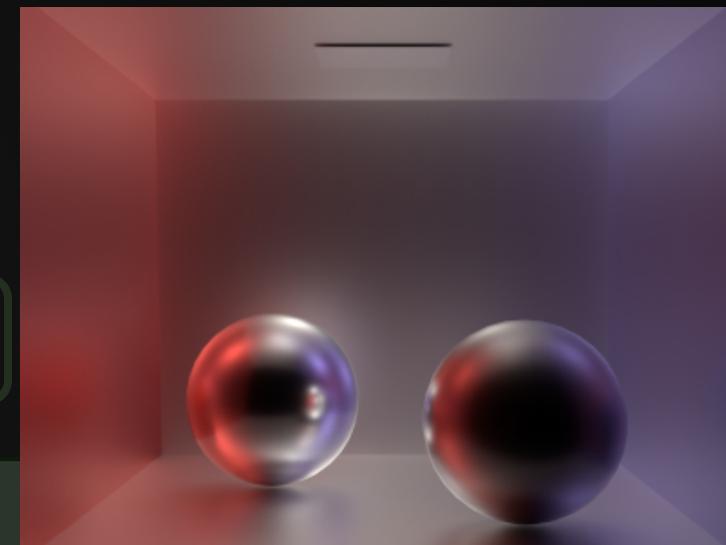
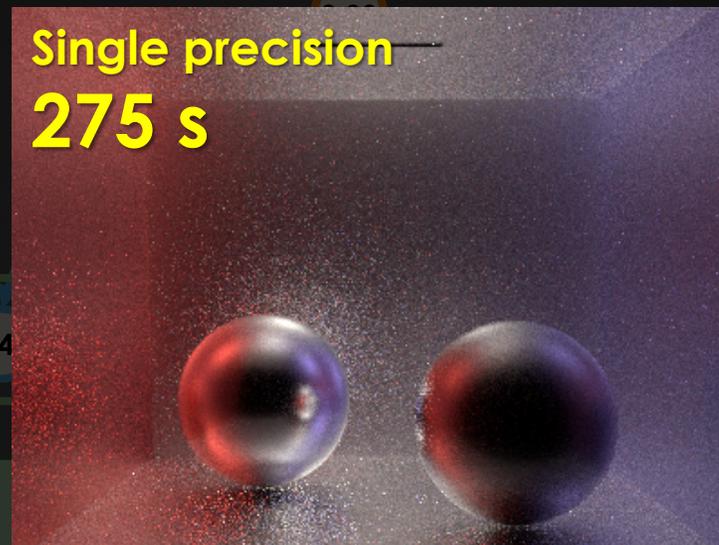
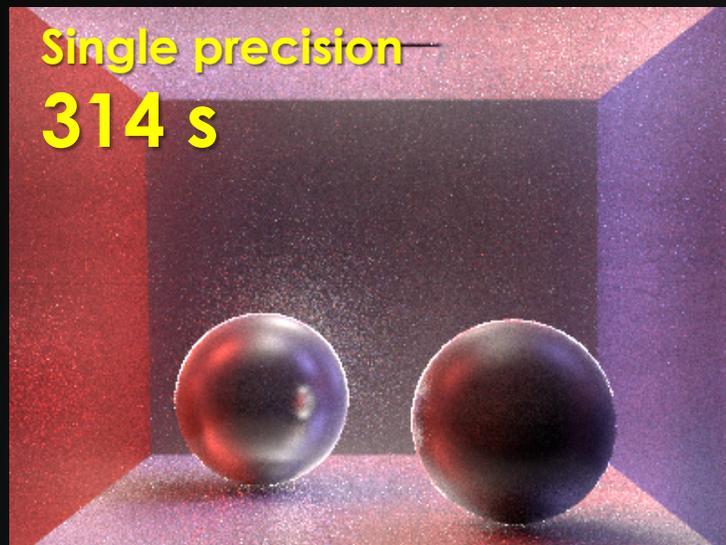


Overlaps of Strata at the Leaf Level



Unbiased

Overlaps of Strata at the Leaf Level





Range for Anisotropic Microfacet BRDFs

Anisotropic Scattering Lobes

- ▶ Scattering lobe is anisotropic for microfacet BRDFs
 - ▶ Even if the NDF is isotropic
- ▶ Make a tight ellipsoidal range
- ▶ Approximate the scattering lobe using a *Squared Ellipsoidal Lobe*

$$\text{Probability} = \min\left(\frac{\text{Constant} \times \text{Scattering lobe}}{\text{Distance}^2}, 1\right)$$

$$\text{Range} = \sqrt{\frac{\text{Constant} \times \text{Scattering lobe}}{\text{Uniform random number}}}$$

GGX-based Squared Ellipsoidal Lobe

Isotropic GGX distribution

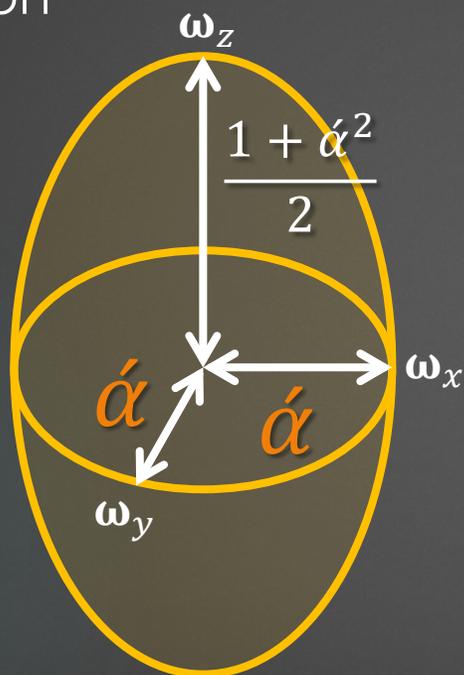
$$D(\cos \theta, \alpha)$$



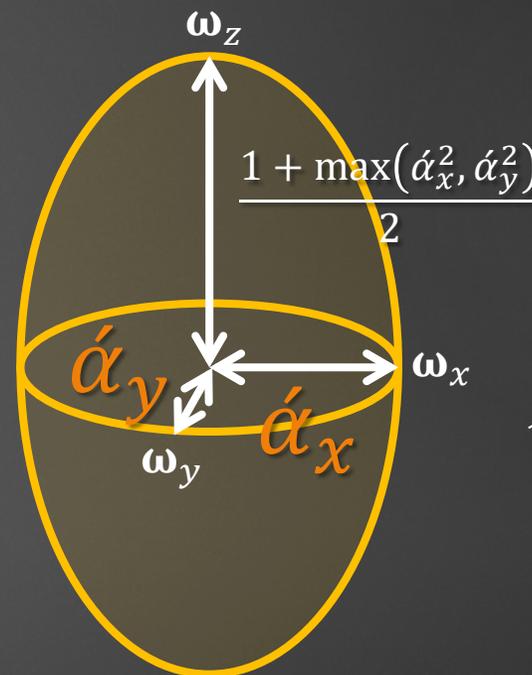
$$\sqrt{\pi \alpha^2 D\left(\cos \frac{\theta}{2}, \alpha\right)}$$

Spheroid

[Tokuyoshi17]



$$(\cos \theta = \omega \cdot \omega_z)$$



$$\sqrt{K\left(\omega; \begin{bmatrix} \omega_x \\ \omega_y \\ \omega_z \end{bmatrix}, \alpha_x, \alpha_y\right)}$$

Ellipsoid

GGX-based Squared Ellipsoidal Lobe

$$K \left(\boldsymbol{\omega}; \begin{bmatrix} \boldsymbol{\omega}_x \\ \boldsymbol{\omega}_y \\ \boldsymbol{\omega}_z \end{bmatrix}, \alpha_x, \alpha_y \right) = \frac{4\alpha_{\max}^4}{(U - v_z + \alpha_{\max}^2(U + v_z))^2}$$

$$\alpha_{\max} = \max(\alpha_x, \alpha_y)$$

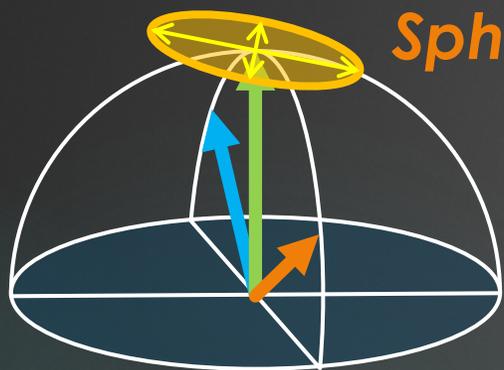
$$[v_x, v_y, v_z] = [\boldsymbol{\omega} \cdot \boldsymbol{\omega}_x, \boldsymbol{\omega} \cdot \boldsymbol{\omega}_y, \boldsymbol{\omega} \cdot \boldsymbol{\omega}_z]$$

$$U = \sqrt{\frac{\alpha_{\max}^2}{\alpha_x^2} v_x^2 + \frac{\alpha_{\max}^2}{\alpha_y^2} v_y^2 + v_z^2}$$

Approximately equal to an anisotropic GGX lobe for small roughness

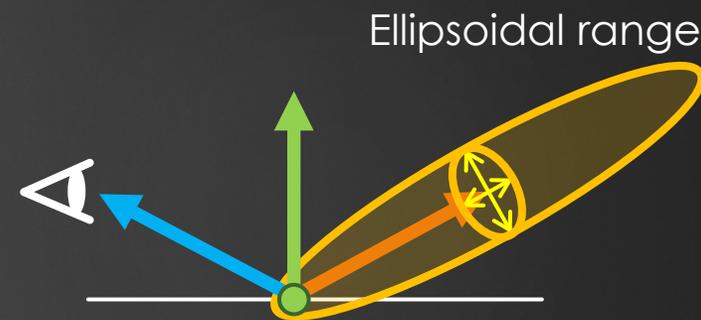
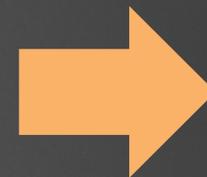
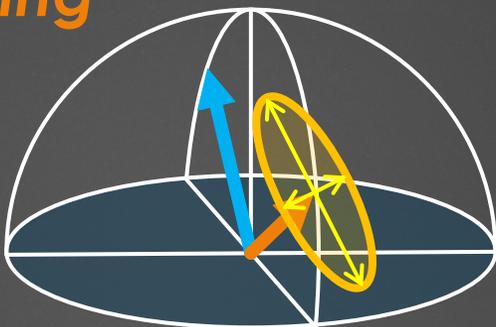
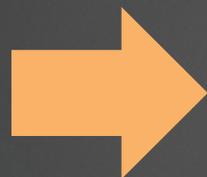
$$\approx 4\pi\alpha_x\alpha_y D \left(\boldsymbol{\omega}; \begin{bmatrix} \boldsymbol{\omega}_x \\ \boldsymbol{\omega}_y \\ \boldsymbol{\omega}_z \end{bmatrix}, 2\alpha_x, 2\alpha_y \right)$$

Analytical Lobe Approximation



Spherical warping

[Xu13]



$$\pi\alpha_x\alpha_y D\left(\omega_h(\omega); \begin{bmatrix} \mathbf{t}_x \\ \mathbf{t}_y \\ \mathbf{n} \end{bmatrix}, \alpha_x, \alpha_y\right)$$

GGX NDF

\approx

$$\pi\alpha'_x\alpha'_y D\left(\omega; \begin{bmatrix} \omega_x \\ \omega_y \\ \omega_z \end{bmatrix}, \alpha'_x, \alpha'_y\right)$$

GGX scattering lobe

\approx

$$K\left(\omega; \begin{bmatrix} \omega_x \\ \omega_y \\ \omega_z \end{bmatrix}, \frac{\alpha'_x}{2}, \frac{\alpha'_y}{2}\right)$$

Squared ellipsoidal lobe



Results

1600×1200 SCREEN RESOLUTION

AMD RYZEN™ THREADRIPPER™ 2990WX PROCESSOR

Combination with PCBPT [Popov15] (15 min)



Caustics reflected on the mirror (GGX roughness: 0.0001)

Combination with PCBPT [Popov15] (15 min)



Caustics reflected on the mirror (GGX roughness: 0.0001)

Combination with VCM [Georgiev12, Hachisuka12] (60 min)

PCVCM: PCBPT + vertex merging



Initial merging radius:



PCVCM
5 pixels

(9311 iterations)



PCVCM
0.6 pixel

(9475 iterations)

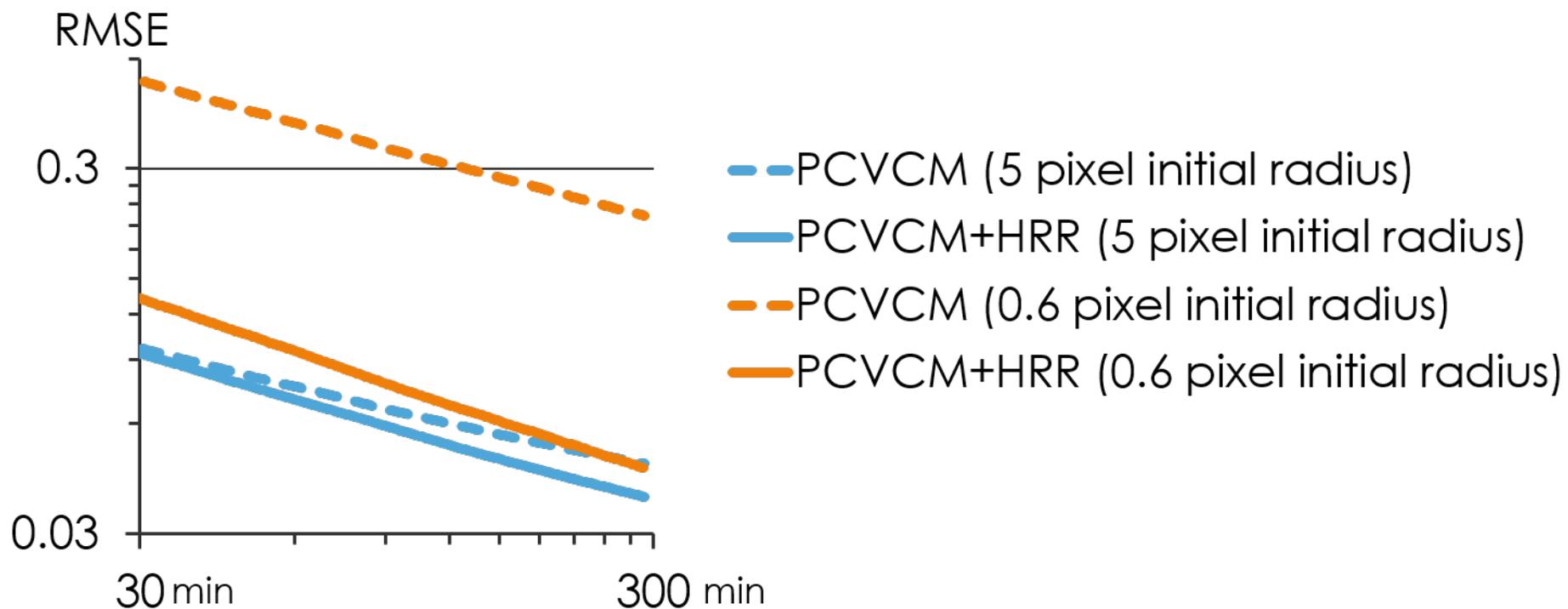


PCVCM+HRR
0.6 pixel

(7090 iterations)



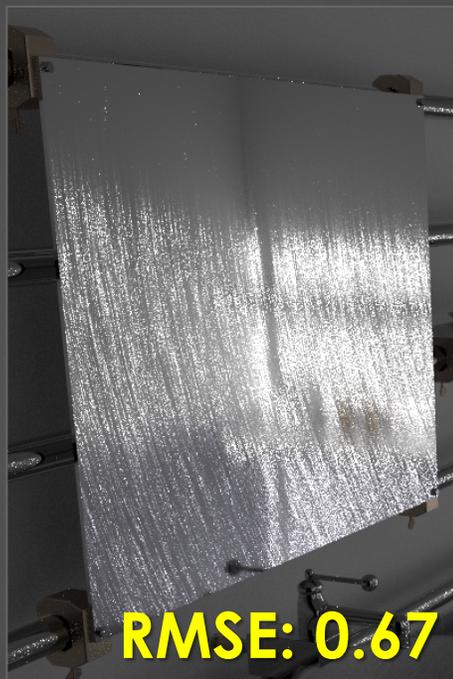
Convergence Speed



Anisotropic BRDF (15 min)

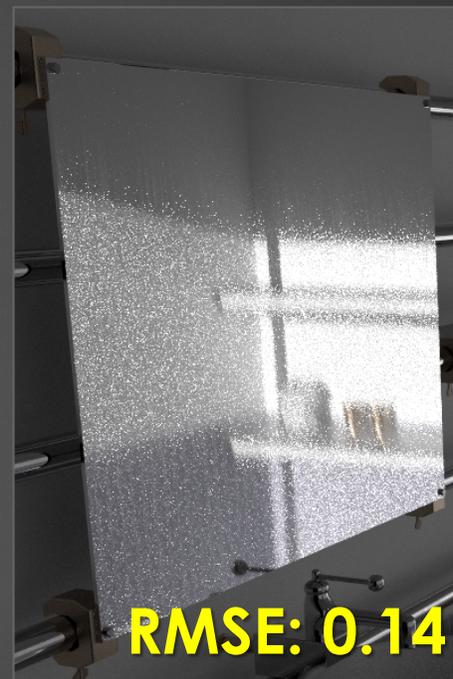


Roughness: (0.0001, 0.01)



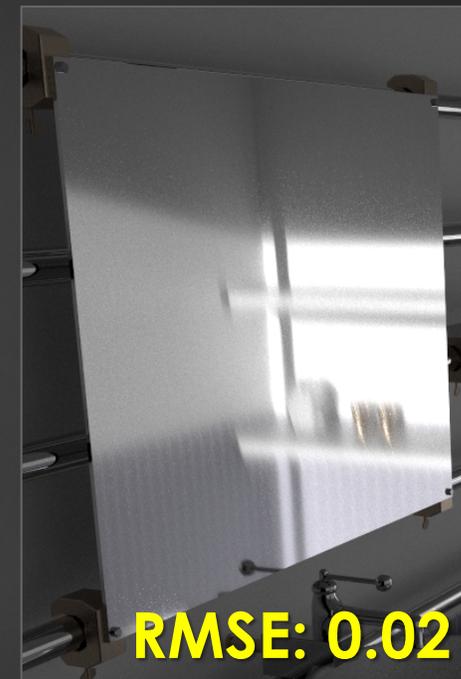
RMSE: 0.67

PCBPT



RMSE: 0.14

PCBPT+HRR
(spheroidal range)



RMSE: 0.02

PCBPT+HRR
(ellipsoidal range)

Related Work: Many-Light Methods

Pregenerated random numbers (require storage)

- Correlation can be reduced by sacrificing the memory usage [Walter06], but cannot be avoided completely

	MIS for SDG paths	Uncorrelated variance	Anisotropic BRDFs
Lightcuts [Walter05]	X	X	X
Stochastic light culling [Tokuyoshi16,17]	X	X	X
Many-light importance sampling [Estevez18]	X	✓	X
Ours	✓	✓	✓

On-the-fly random number generation
(no storage)

Limitations



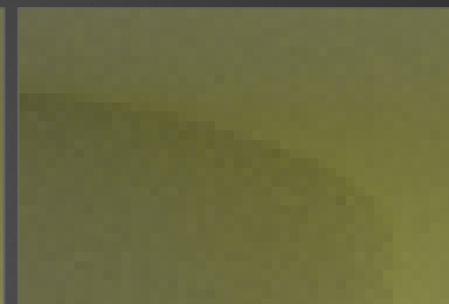
PCBPT+HRR



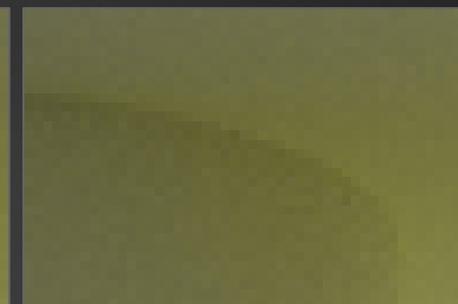
Reference



PCBPT+HRR



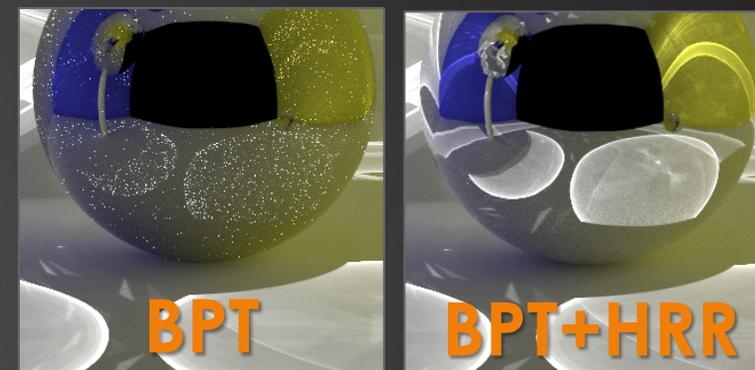
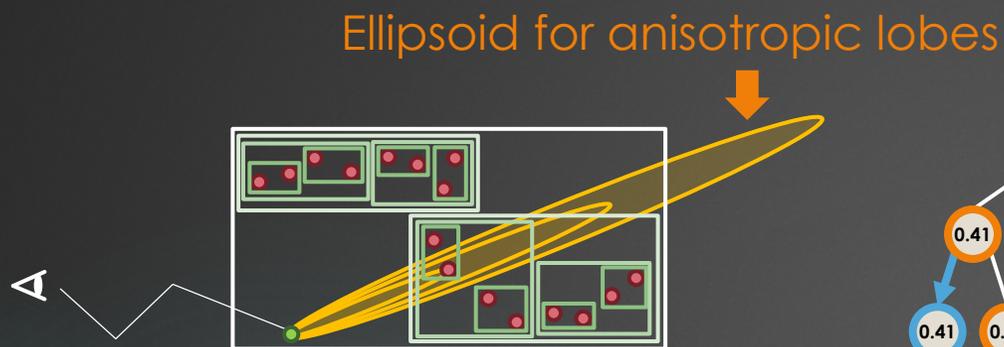
PCBPT+HRR
(+outlier rejection)



PCVCM+HRR

- ▶ Perfectly specular surfaces
- ▶ Fireflies can still occur on near singularities
 - ▶ Can be removed easily by VCM or using outlier rejection [Zirr18]
- ▶ Glossy-to-glossy interreflections
- ▶ Correlation of paths due to path reuse (similar to VCM)
 - ▶ Future work: correlation-aware MIS heuristics [Jendersie19]

Conclusions



- ▶ BVH-based acceleration for many Russian roulettes
- ▶ On-the-fly minimum random number generation in BVH traversal
- ▶ Efficient ellipsoidal range for anisotropic BRDFs
- ▶ Limited to glossy reflections, but efficient for **extremely glossy** reflections
 - ▶ E.g., GGX roughness: 0.0001 (hard to distinguish from perfectly specular surfaces)

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