
GRTX

Efficient Ray Tracing for 3D Gaussian-Based Rendering

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3D Gaussian-Based Rendering

3D Gaussian Splatting (3DGS)



3D Gaussian-Based Rendering

Rasterization

3D Gaussian Splatting (3DGS)



3D Gaussians



Rendered Image

Ray-tracing

3D Gaussian Ray Tracing (3DGRT)

e.g., EVER (Google) [1], DSYG (Meta) [2], 3DGRT (NVIDIA) [3]



- [1] Alexander et al., EVER: Exact Volumetric Ellipsoid Rendering for Real-time View Synthesis (ICCV'25)
- [2] Jorge et al., Don't Splat your Gaussians: Volumetric Ray-Traced Primitives for Modeling and Rendering
Scattering and Emissive Media (SIGGRAPH'25)
- [3] Nicolas et al., 3D Gaussian Ray Tracing: Fast Tracing of Particle Scenes (SIGGRAPH Asia'24)

3D Gaussian-Based Rendering

Rasterization

3D Gaussian Splatting (3DGS)



Limitation

Rasterization cannot
model complex light transports



Rendered Image

Ray-tracing

3D Gaussian Ray Tracing (3DGRT)

e.g., EVER (Google) [1], DSYG (Meta) [2], 3DGRT (NVIDIA) [3]



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3D Gaussian-Based Rendering

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Rendered Image

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3D Gaussian-Based Rendering

Rasterization

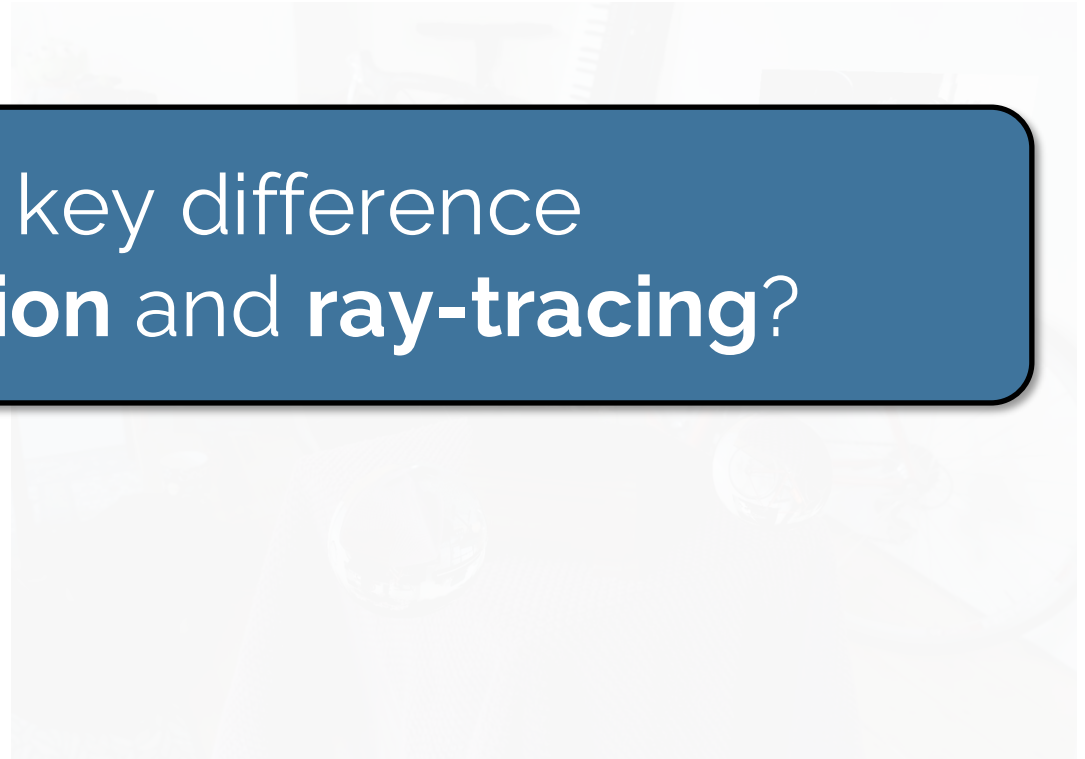
3D Gaussian Splatting (3DGS)



Ray-tracing

3D Gaussian Ray Tracing (3DGRT)

e.g., EVER (Google) [1], DSYG (Meta) [2], 3DGRT (NVIDIA) [3]



Q: What is the key difference
between **rasterization** and **ray-tracing**?

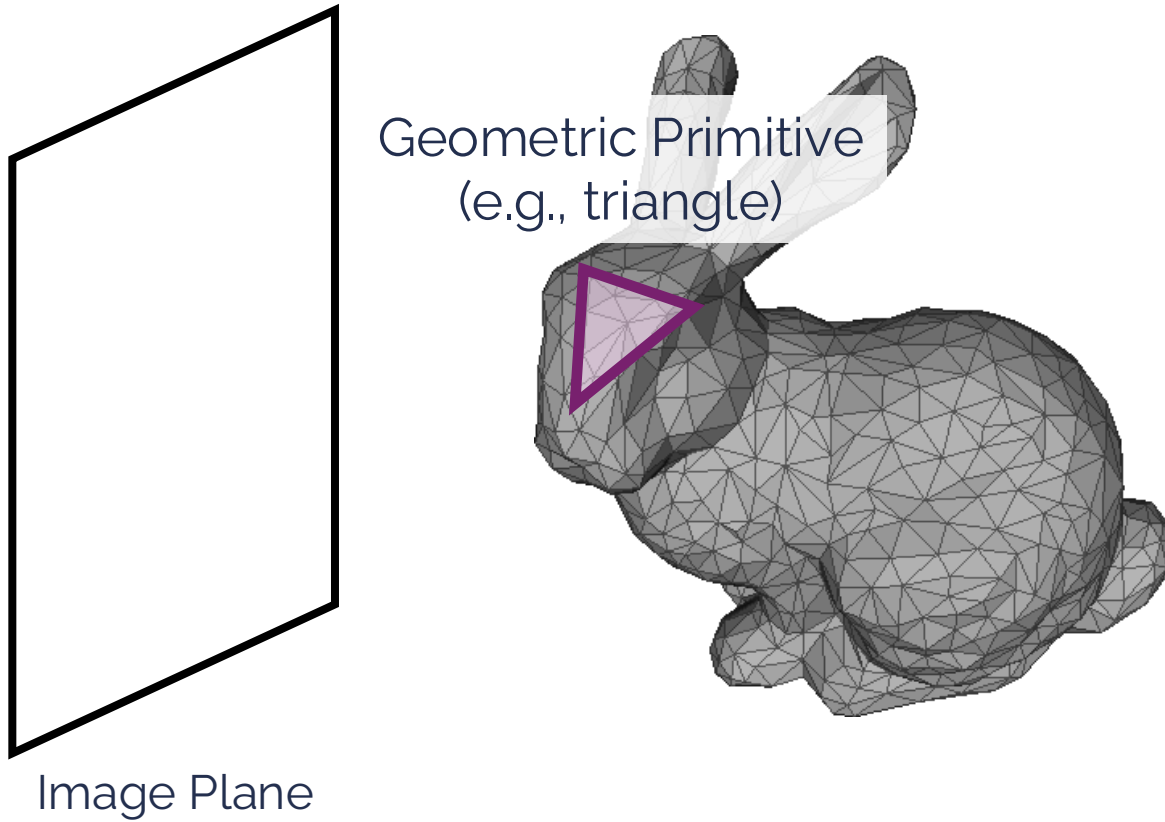


Rendered Image

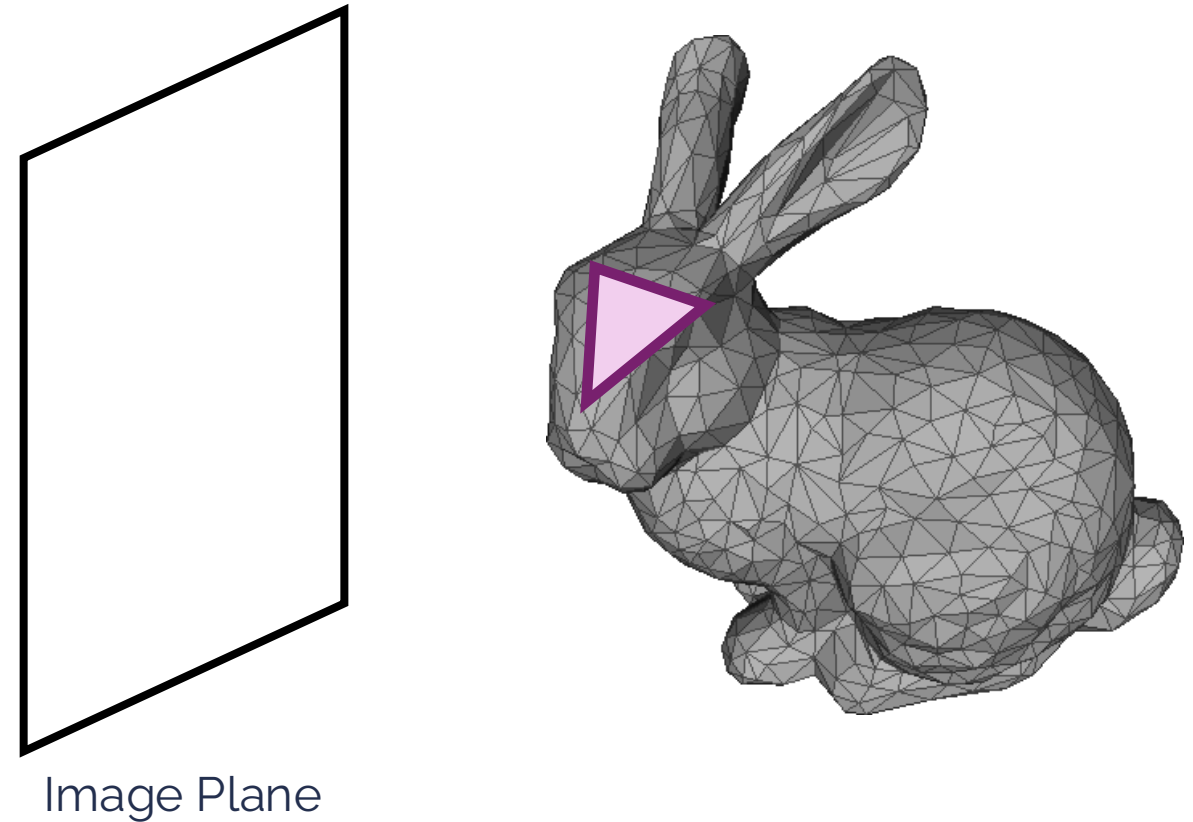
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Scattering and Emissive Media (SIGGRAPH'25)
- [3] Nicolas et al., 3D Gaussian Ray Tracing: Fast Tracing of Particle Scenes (SIGGRAPH Asia'24)

3D Gaussian-Based Rendering

Rasterization

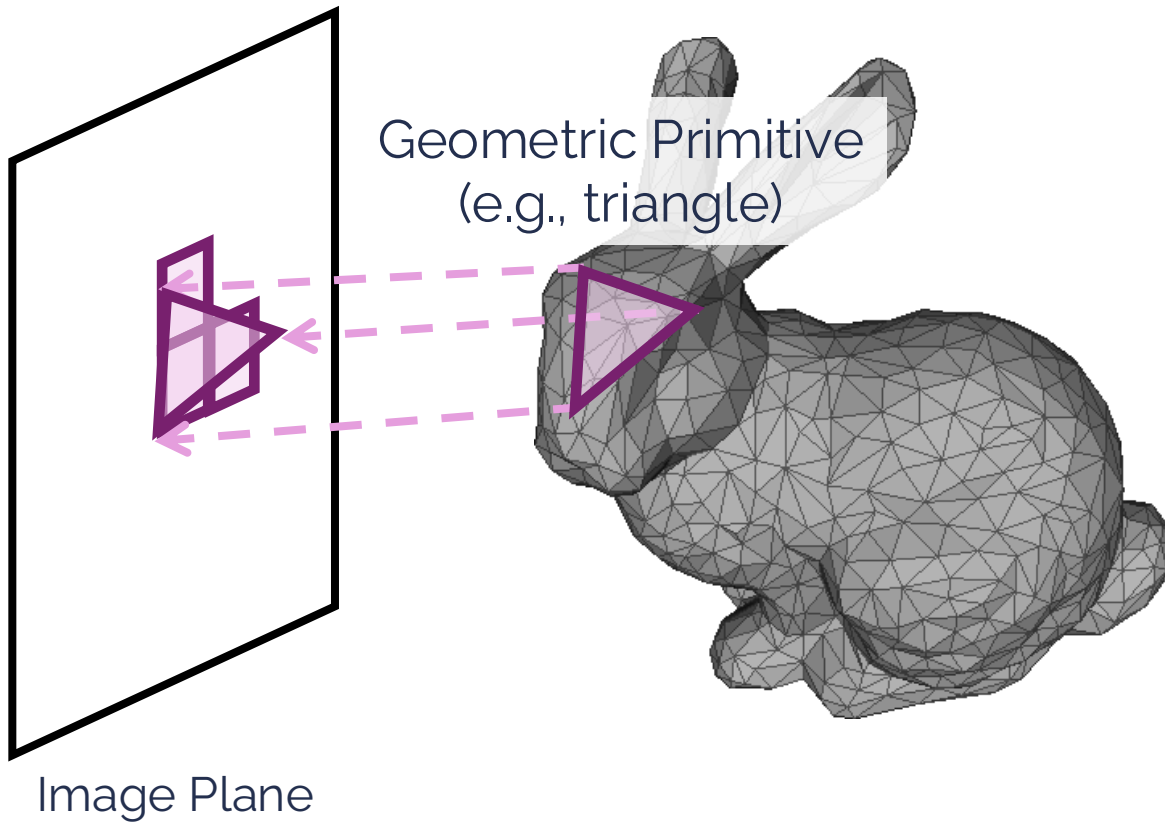


Ray-tracing

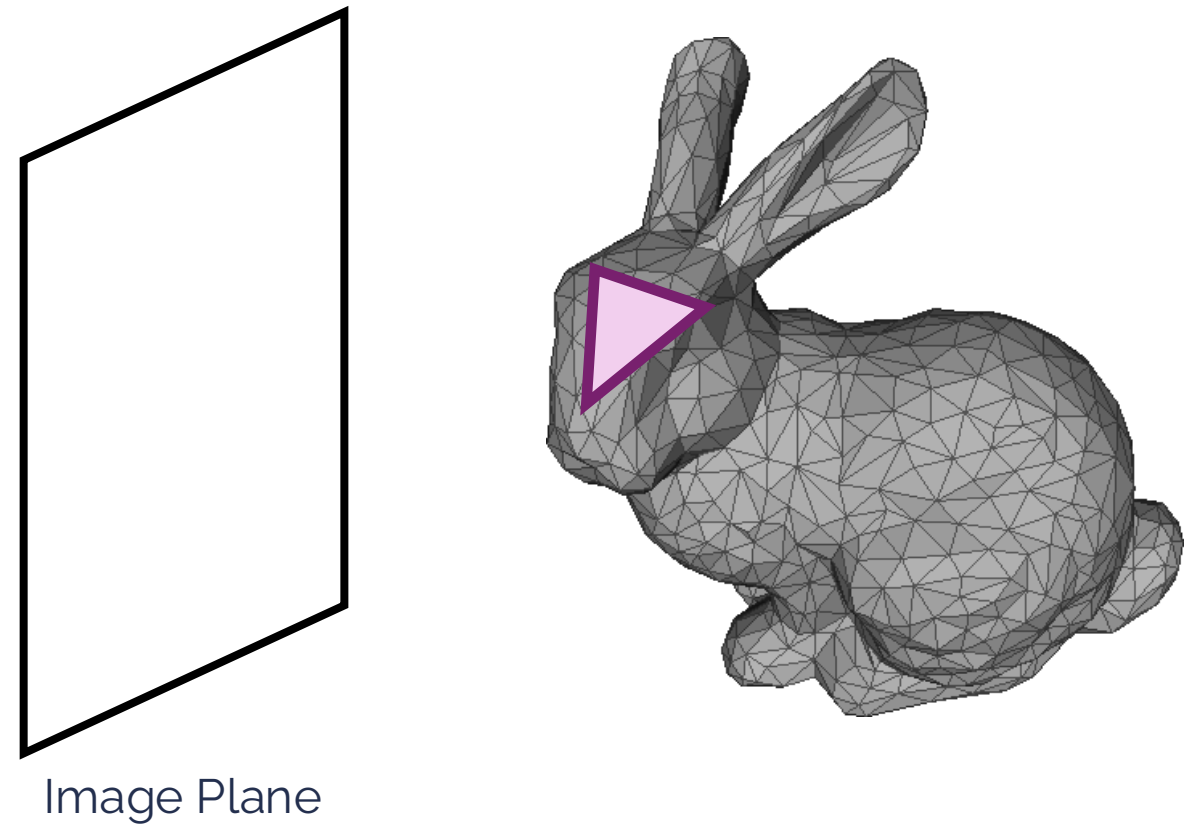


3D Gaussian-Based Rendering

Rasterization

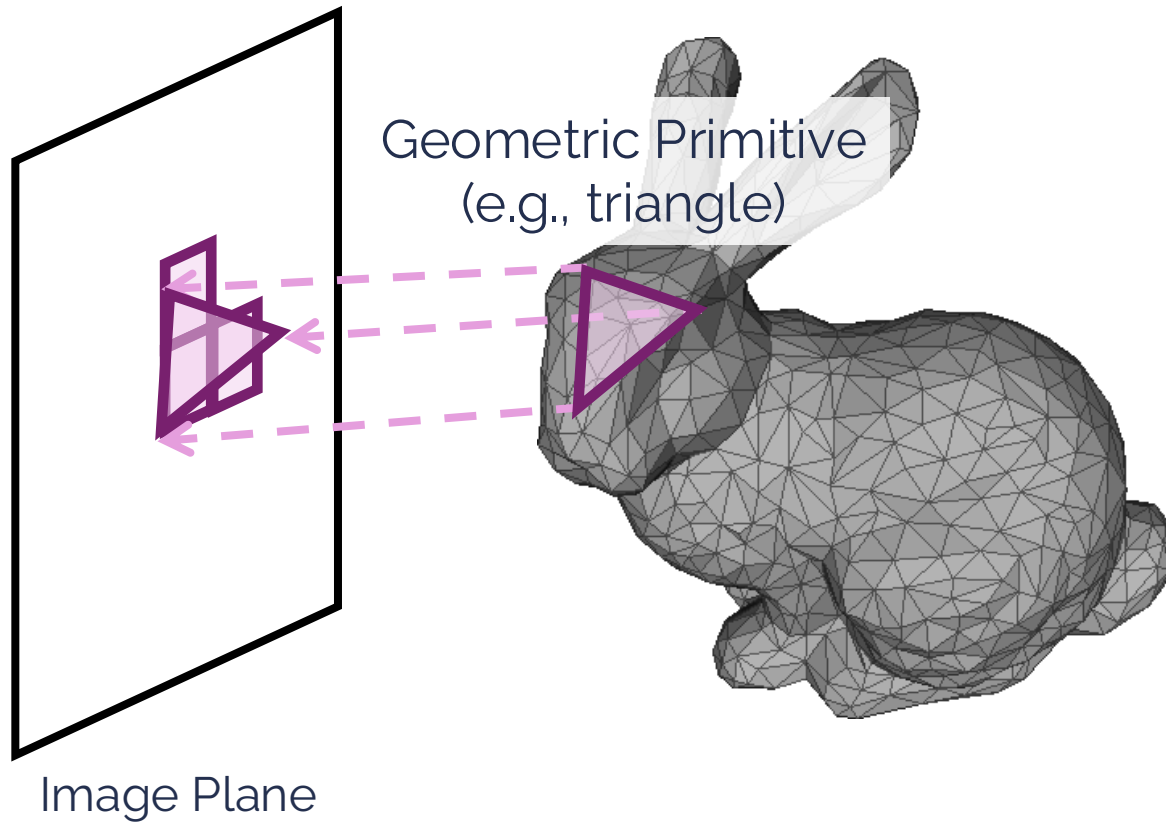


Ray-tracing

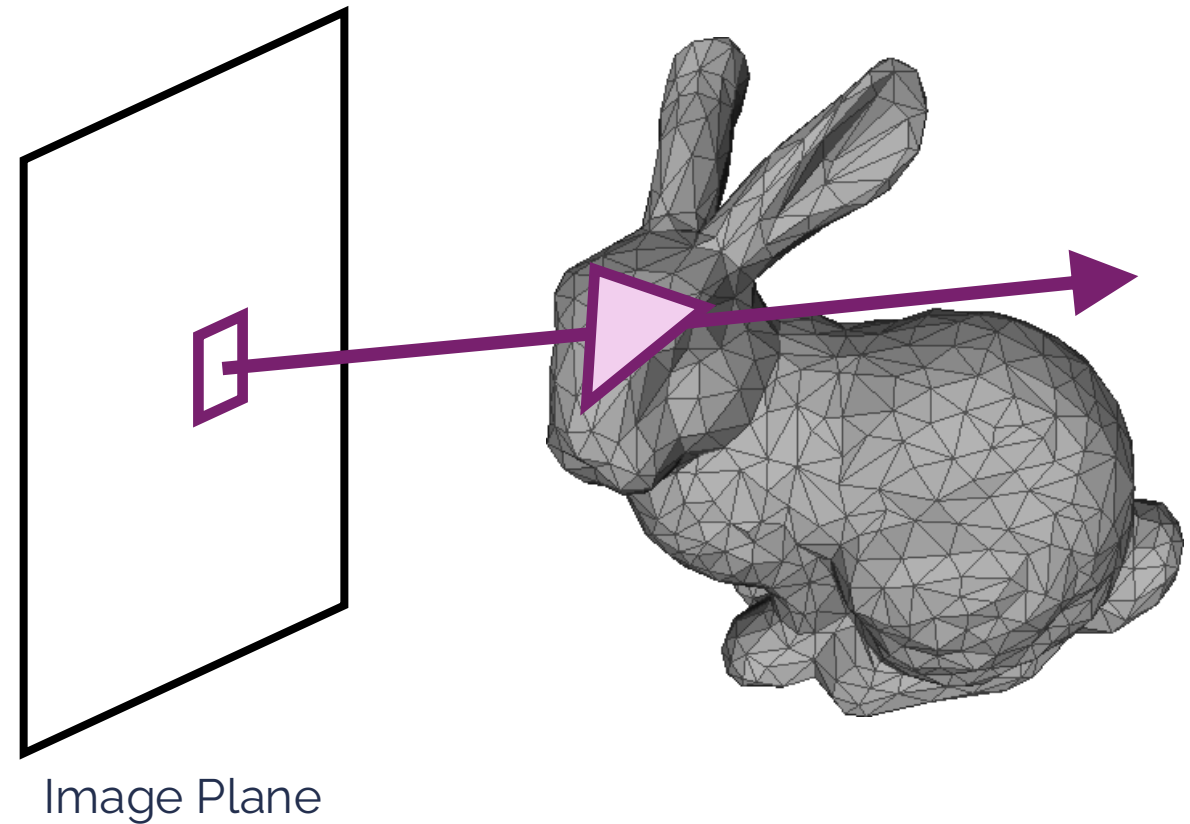


3D Gaussian-Based Rendering

Rasterization

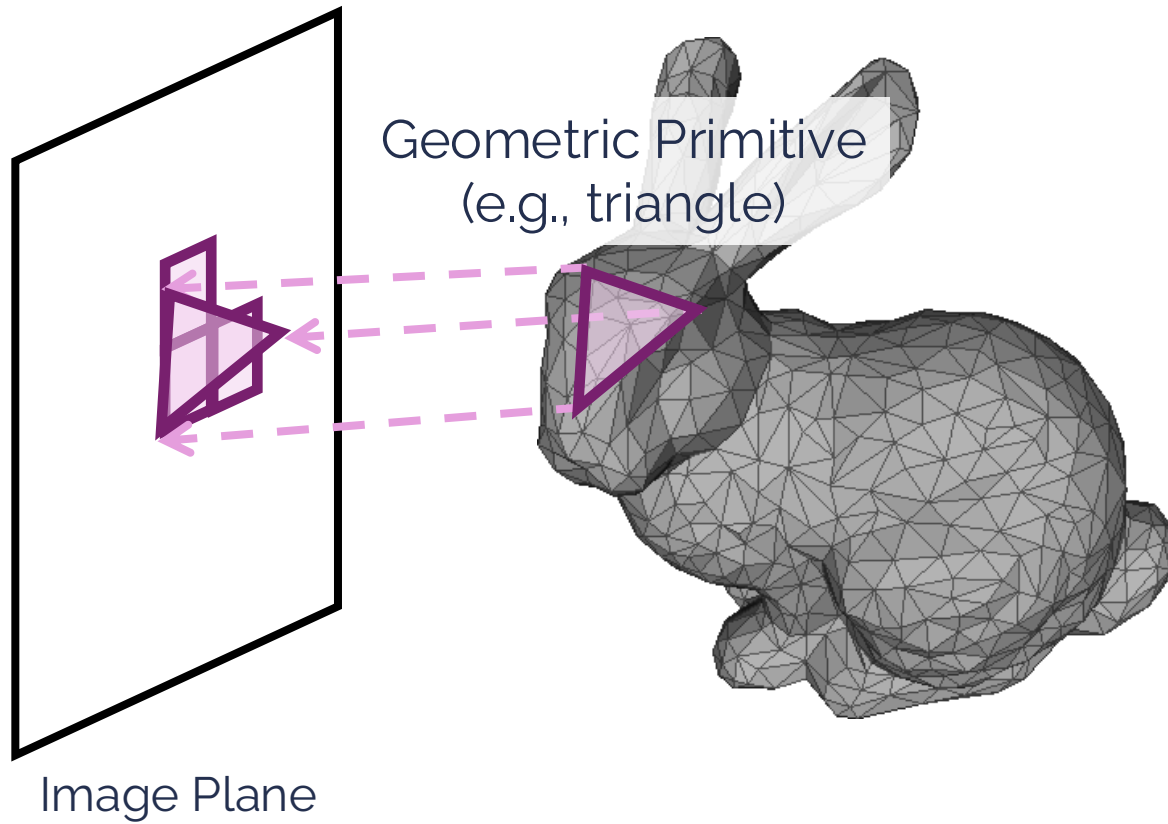


Ray-tracing

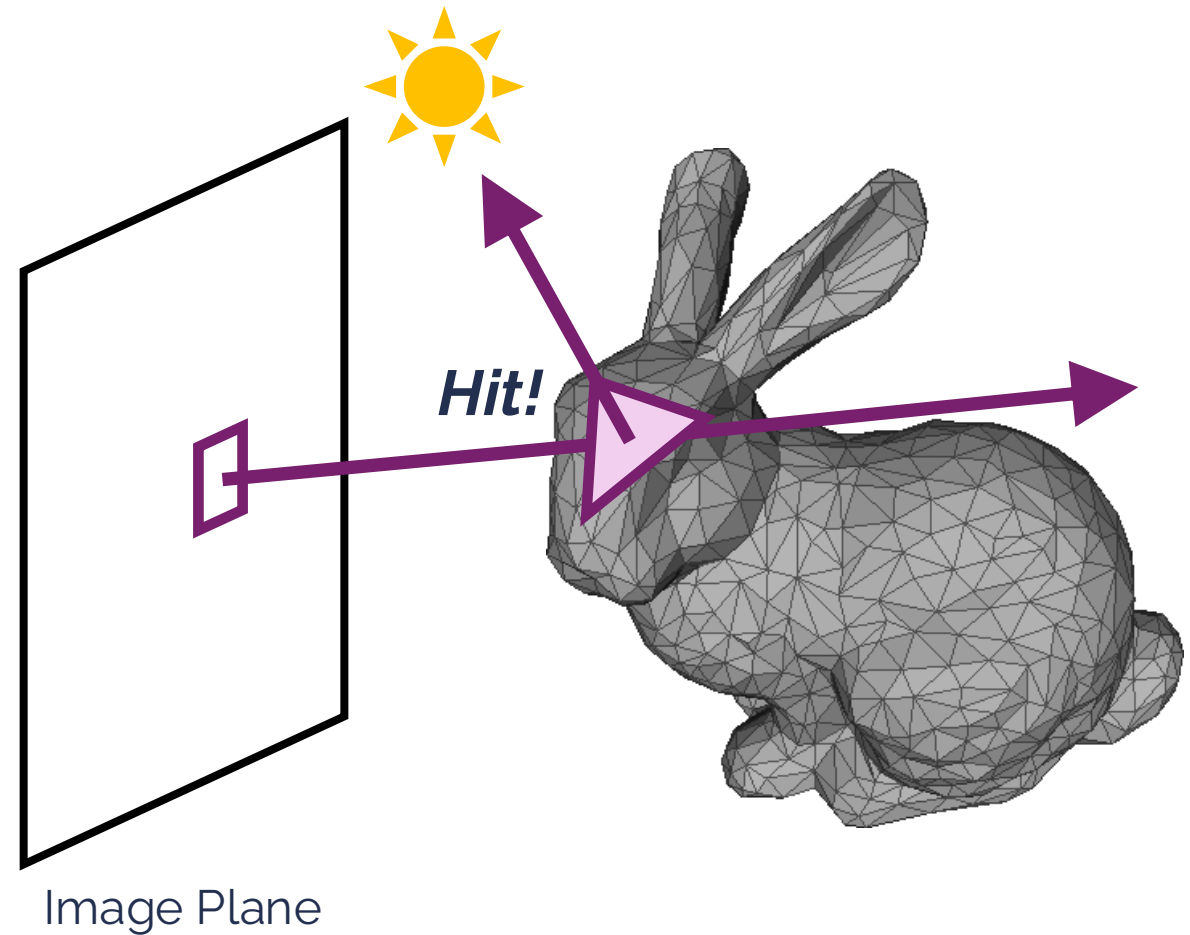


3D Gaussian-Based Rendering

Rasterization

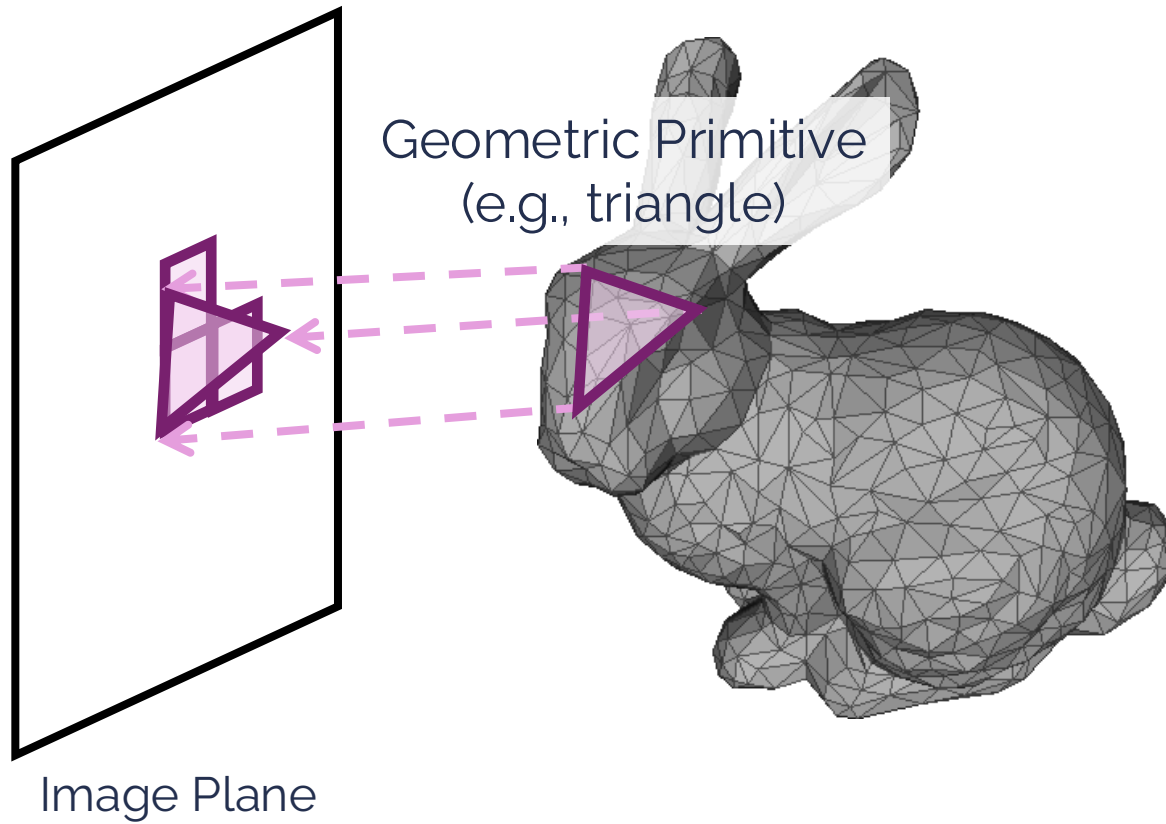


Ray-tracing

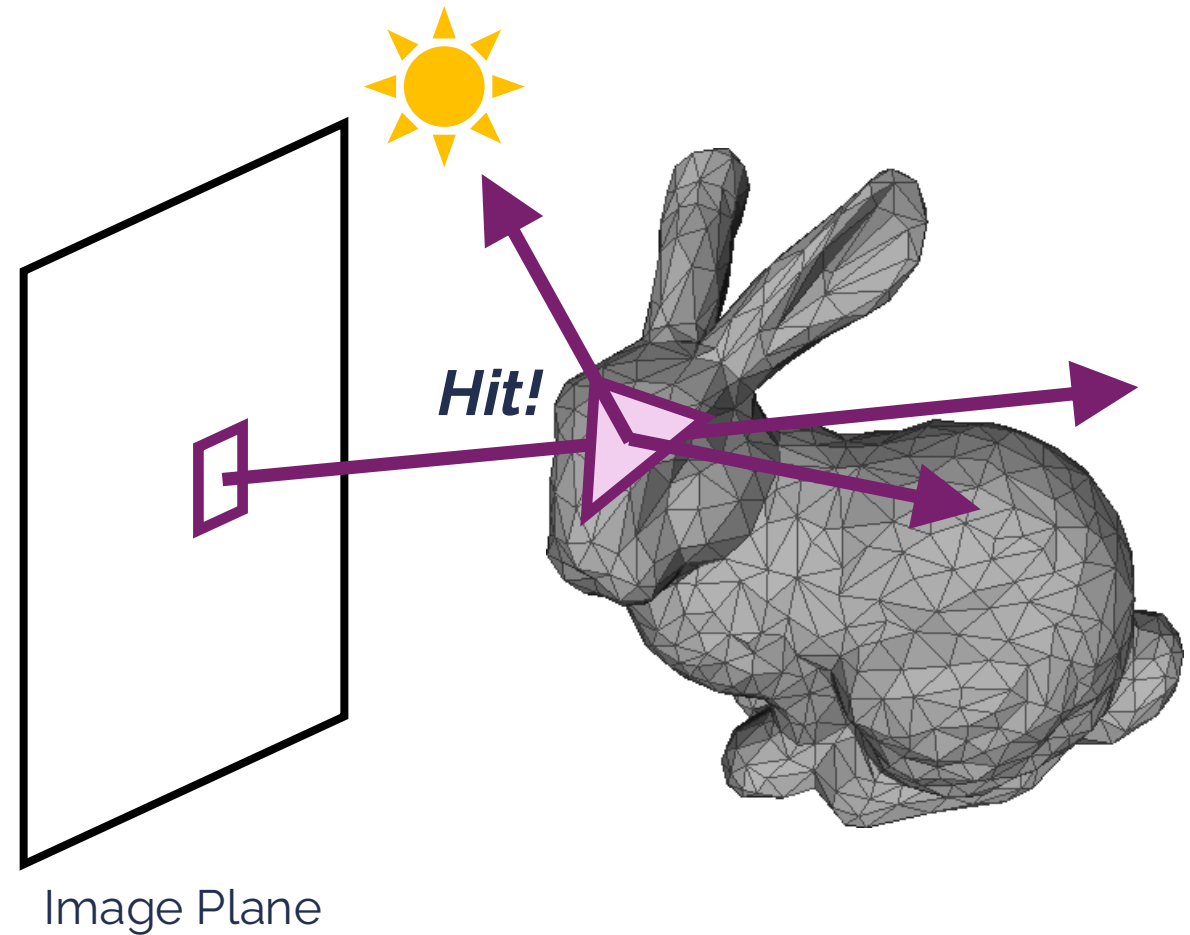


3D Gaussian-Based Rendering

Rasterization

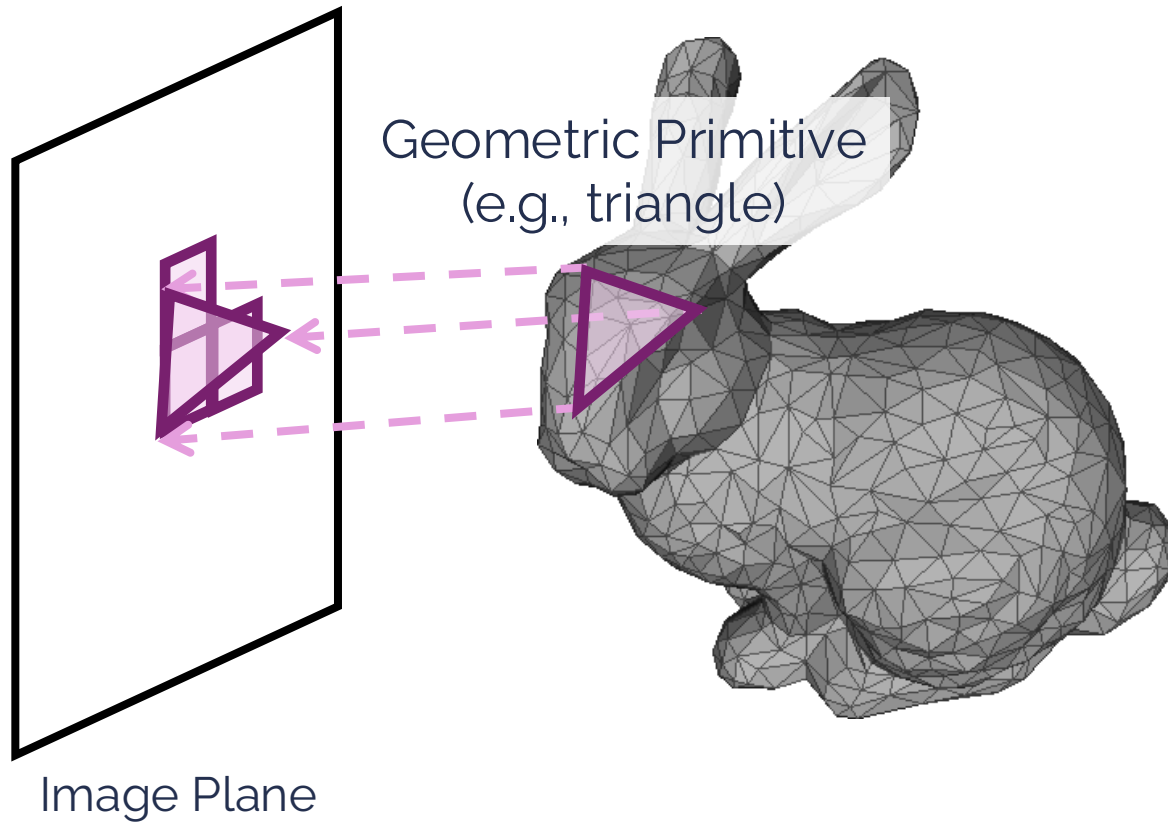


Ray-tracing



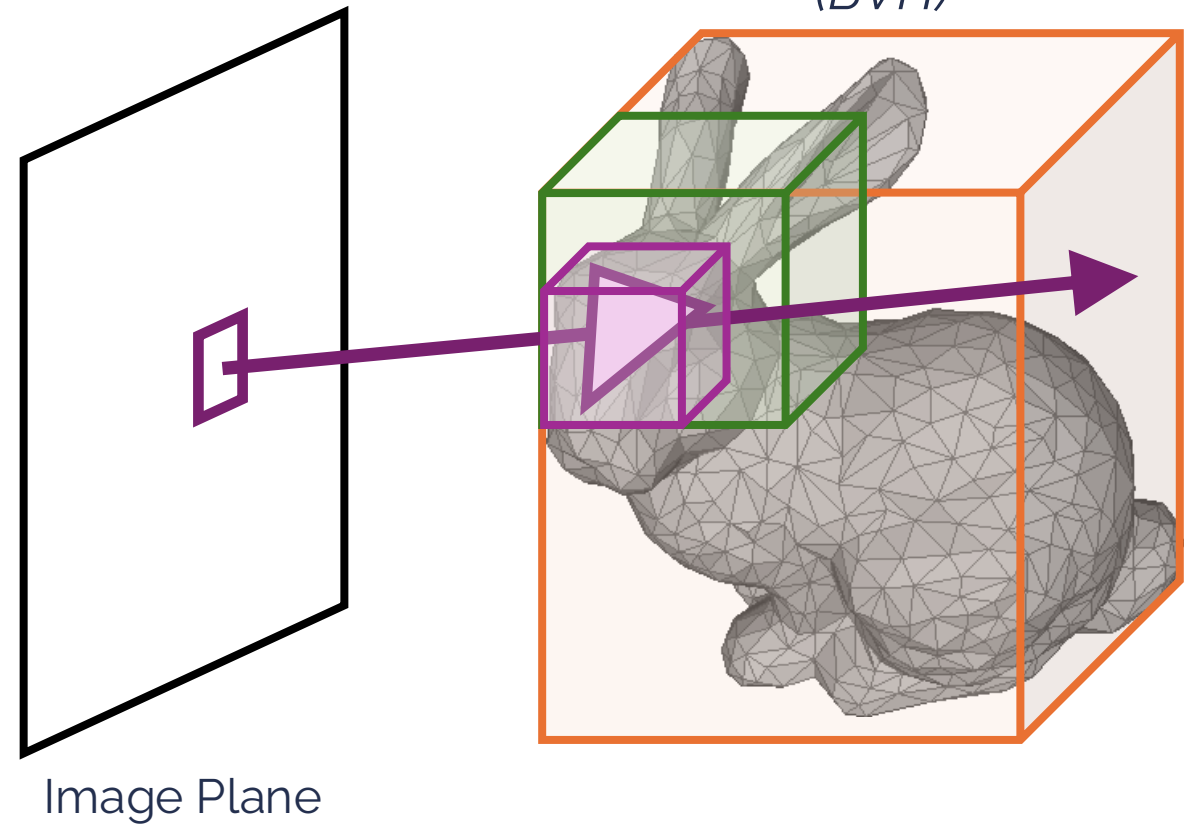
3D Gaussian-Based Rendering

Rasterization

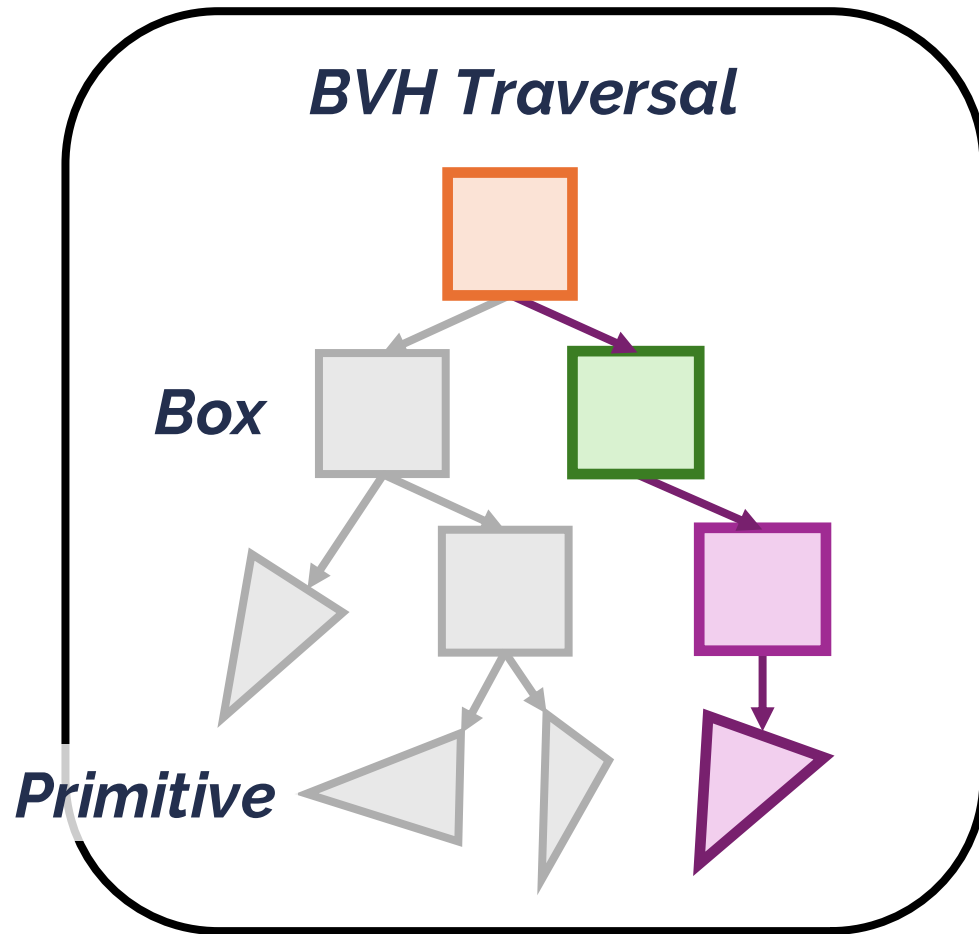


Ray-tracing

Bounding Volume Hierarchy (BVH)

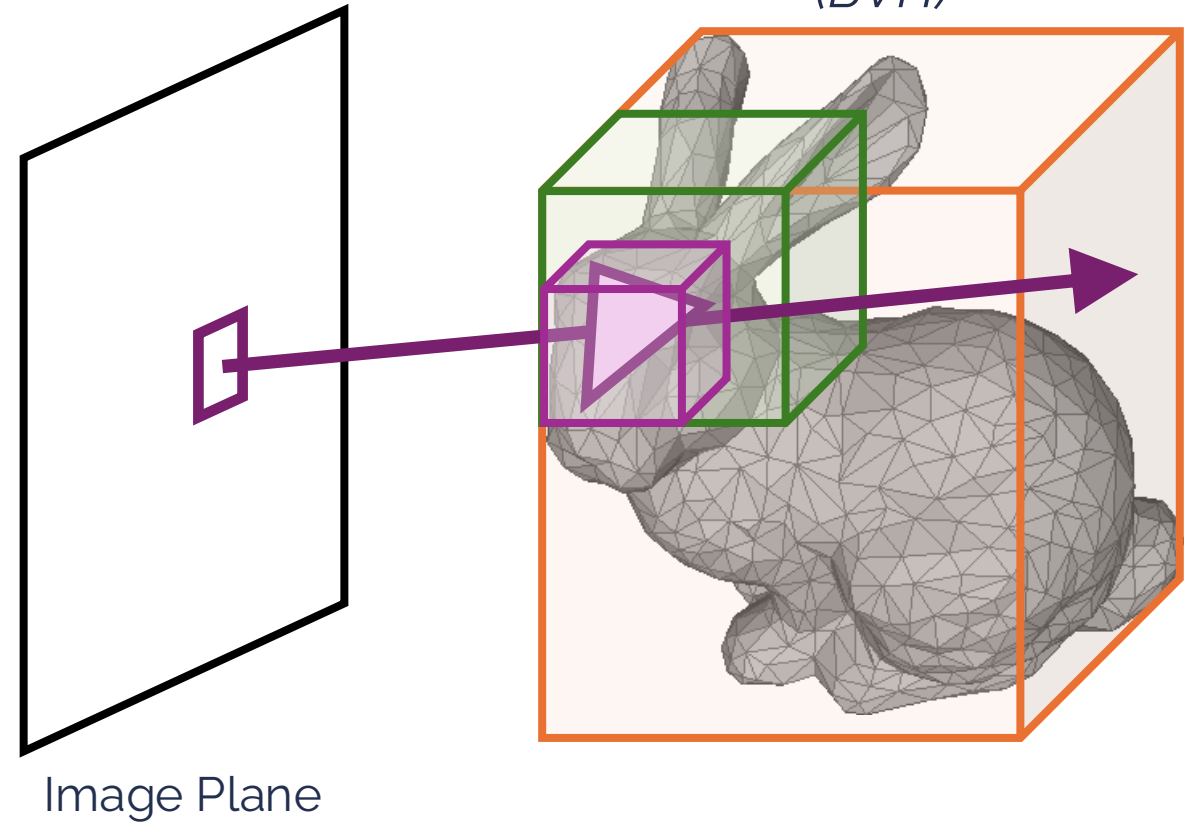


3D Gaussian-Based Rendering



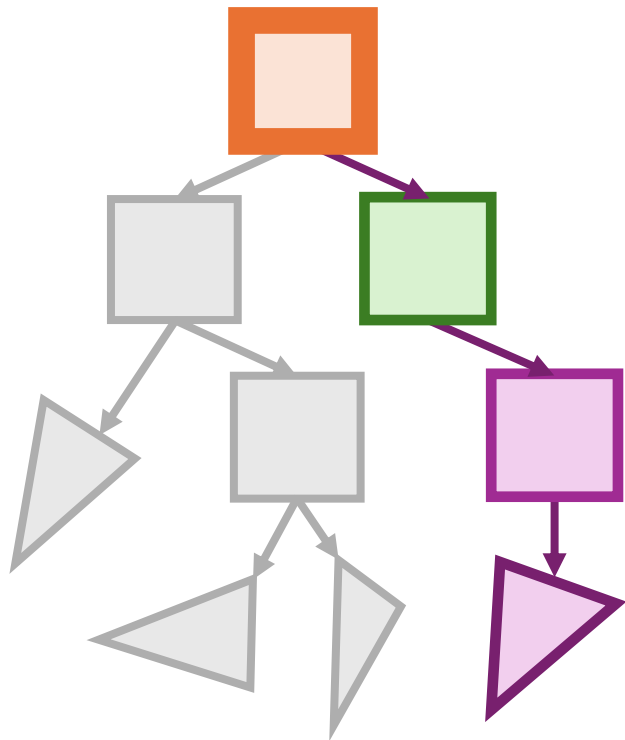
Ray-tracing

Bounding Volume Hierarchy (BVH)



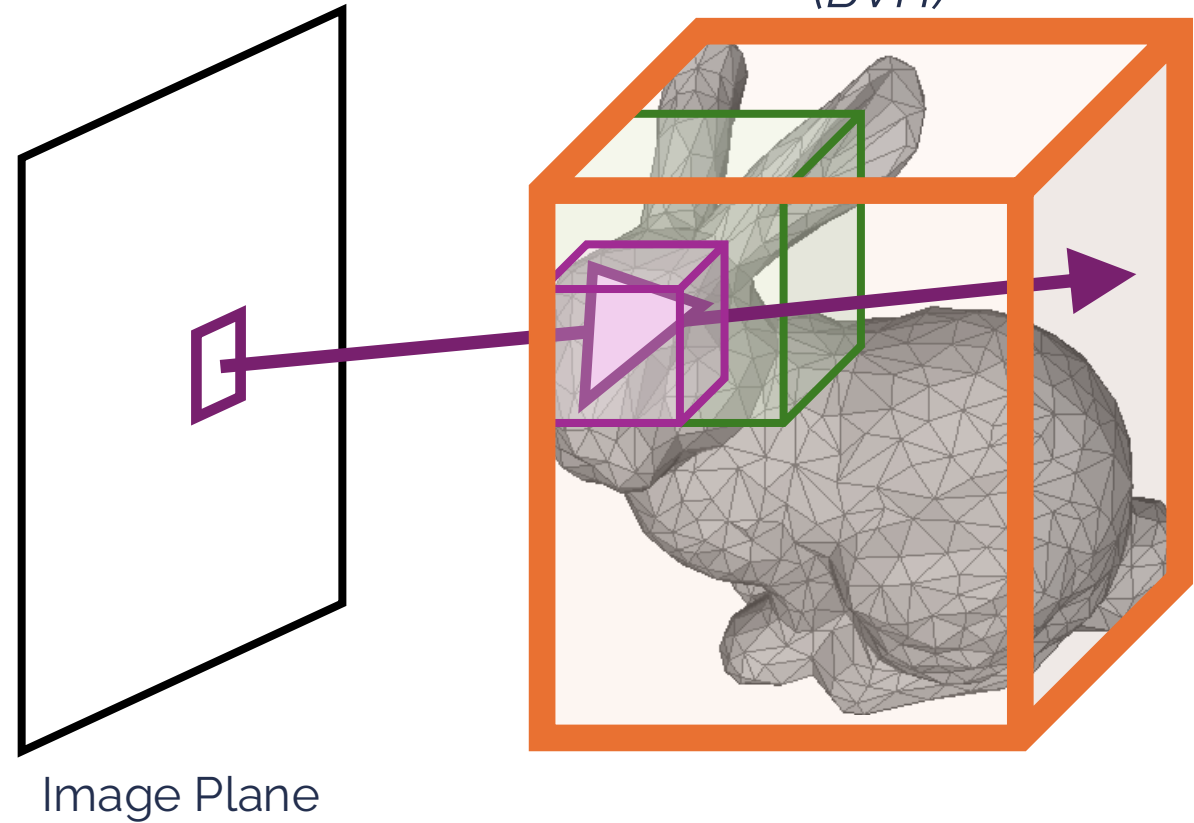
3D Gaussian-Based Rendering

BVH Traversal



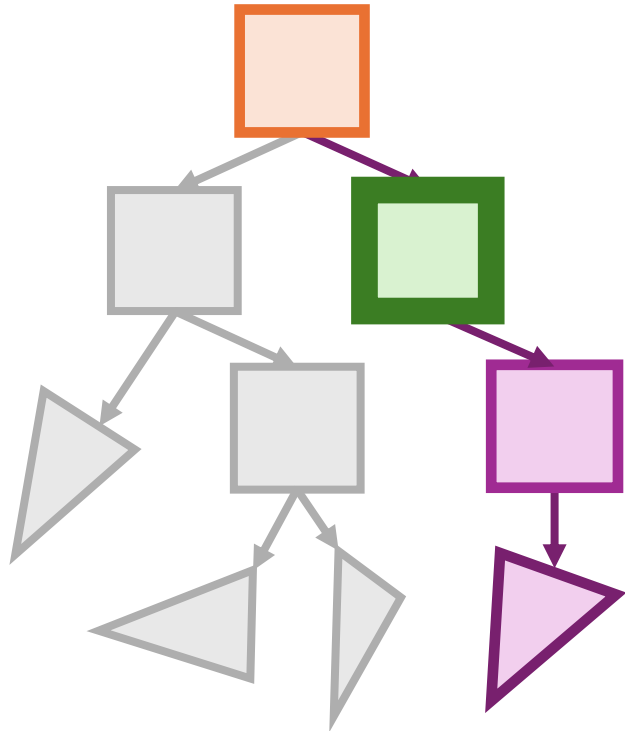
Ray-tracing

*Bounding Volume Hierarchy
(BVH)*



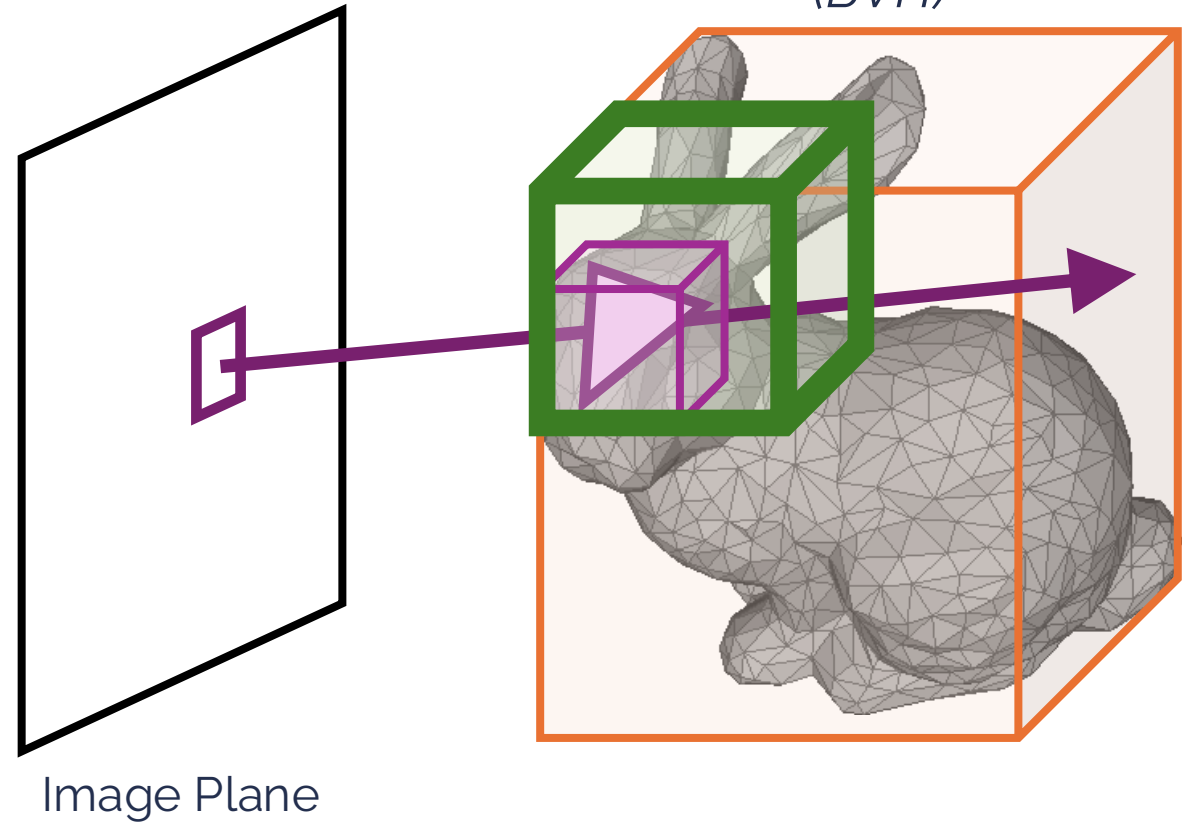
3D Gaussian-Based Rendering

BVH Traversal



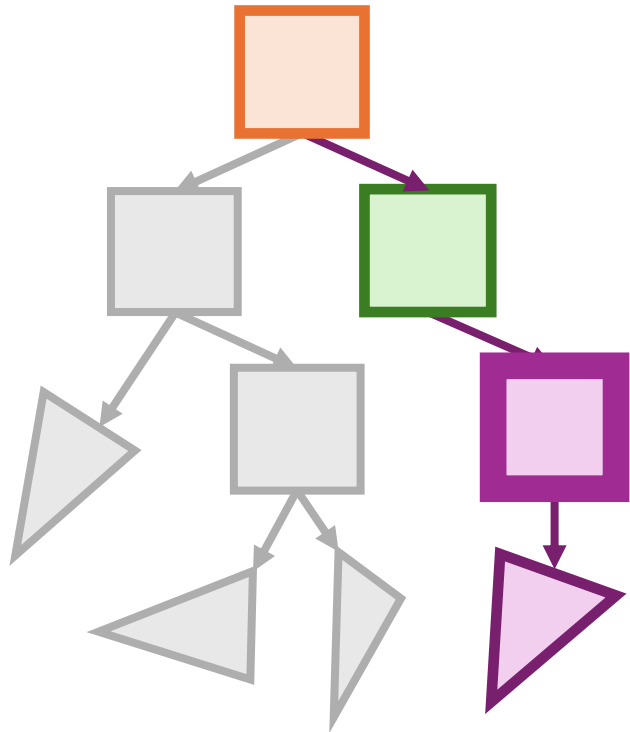
Ray-tracing

*Bounding Volume Hierarchy
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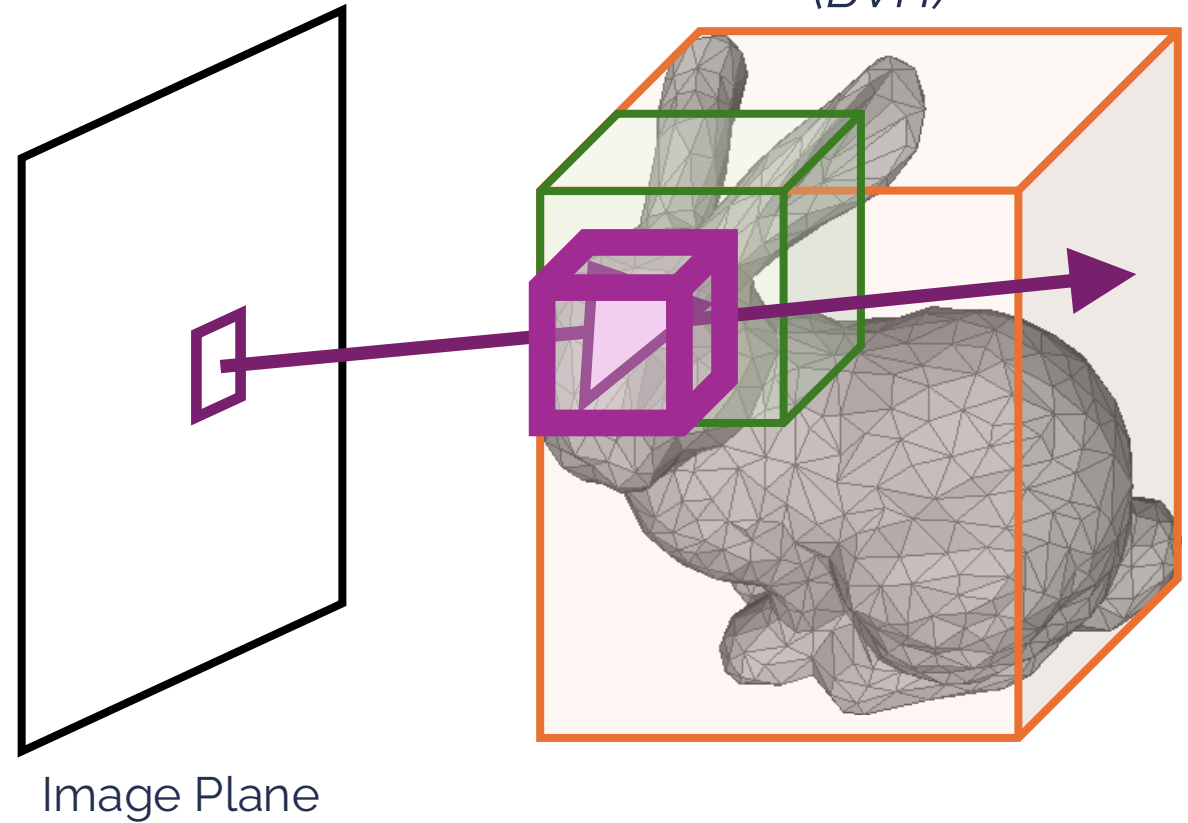
3D Gaussian-Based Rendering

BVH Traversal



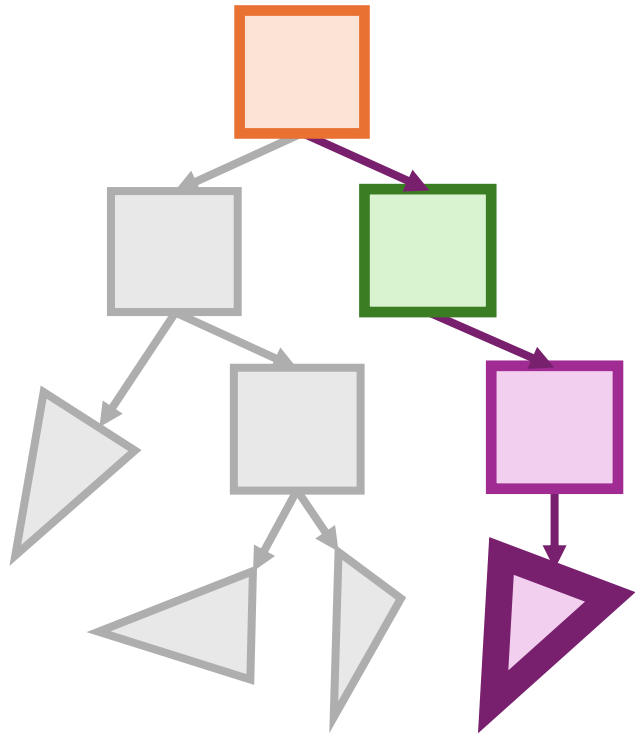
Ray-tracing

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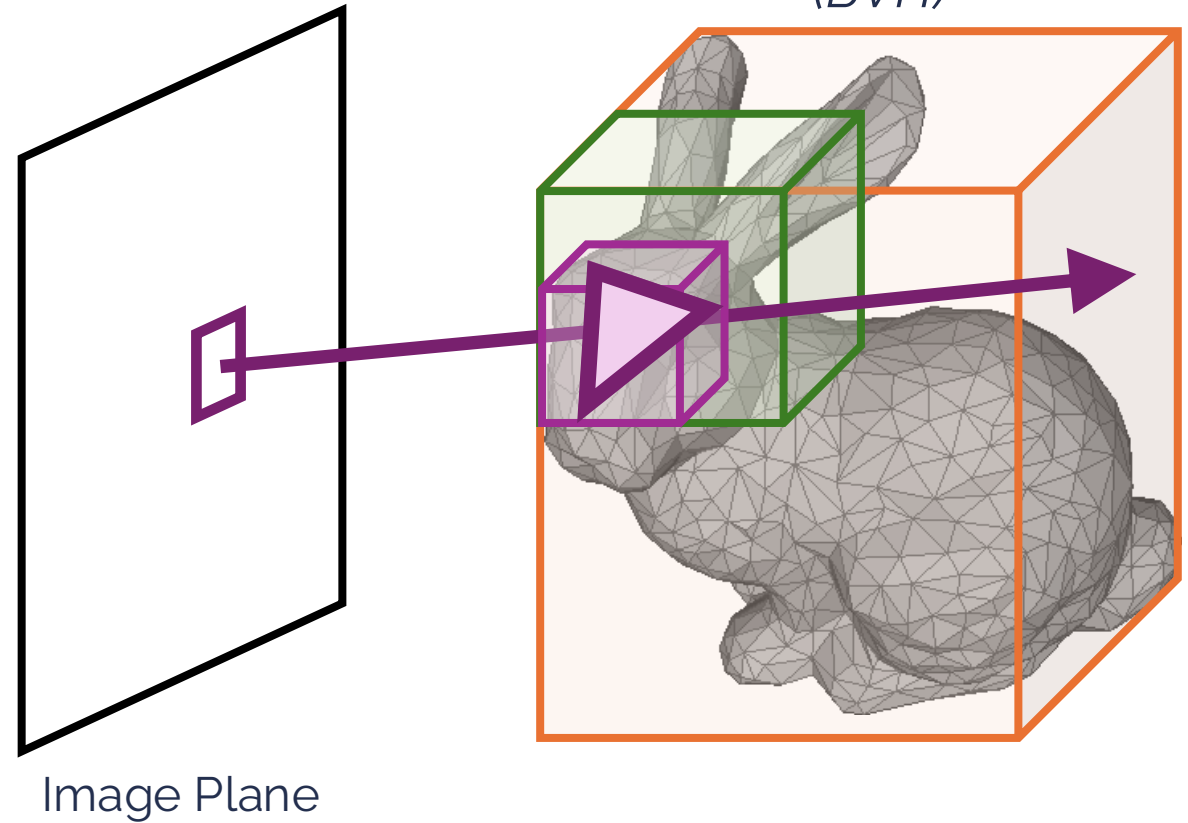
3D Gaussian-Based Rendering

BVH Traversal

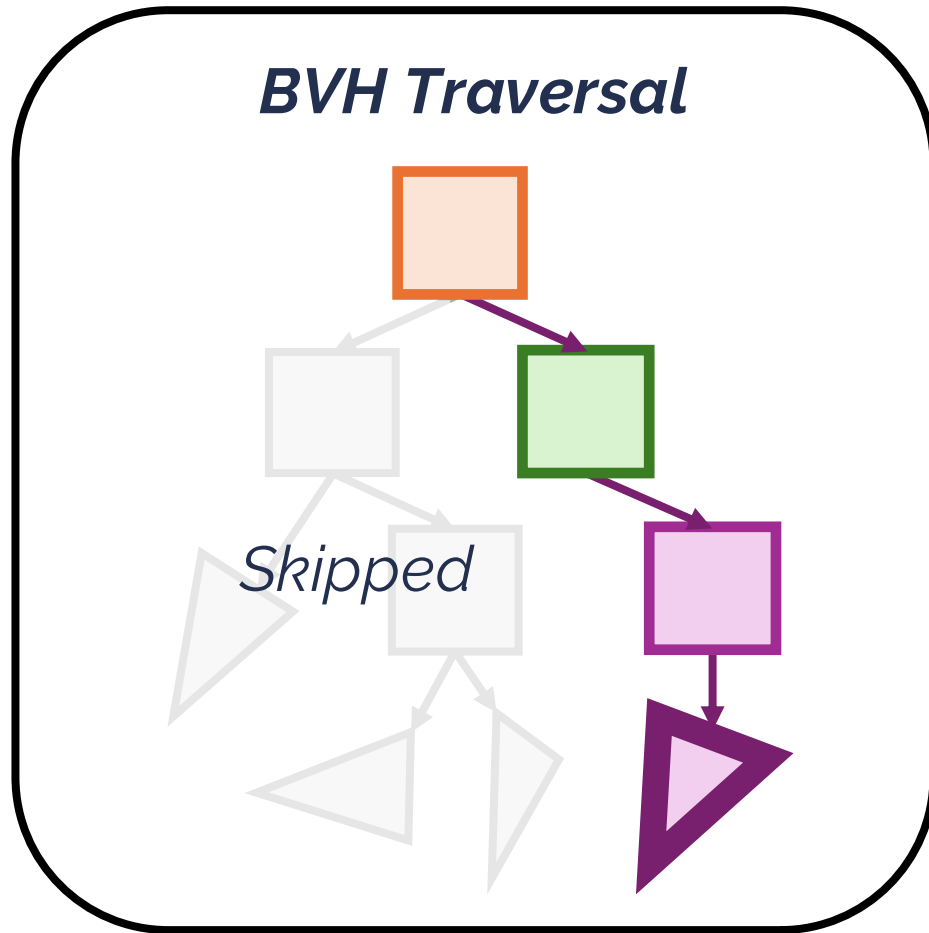


Ray-tracing

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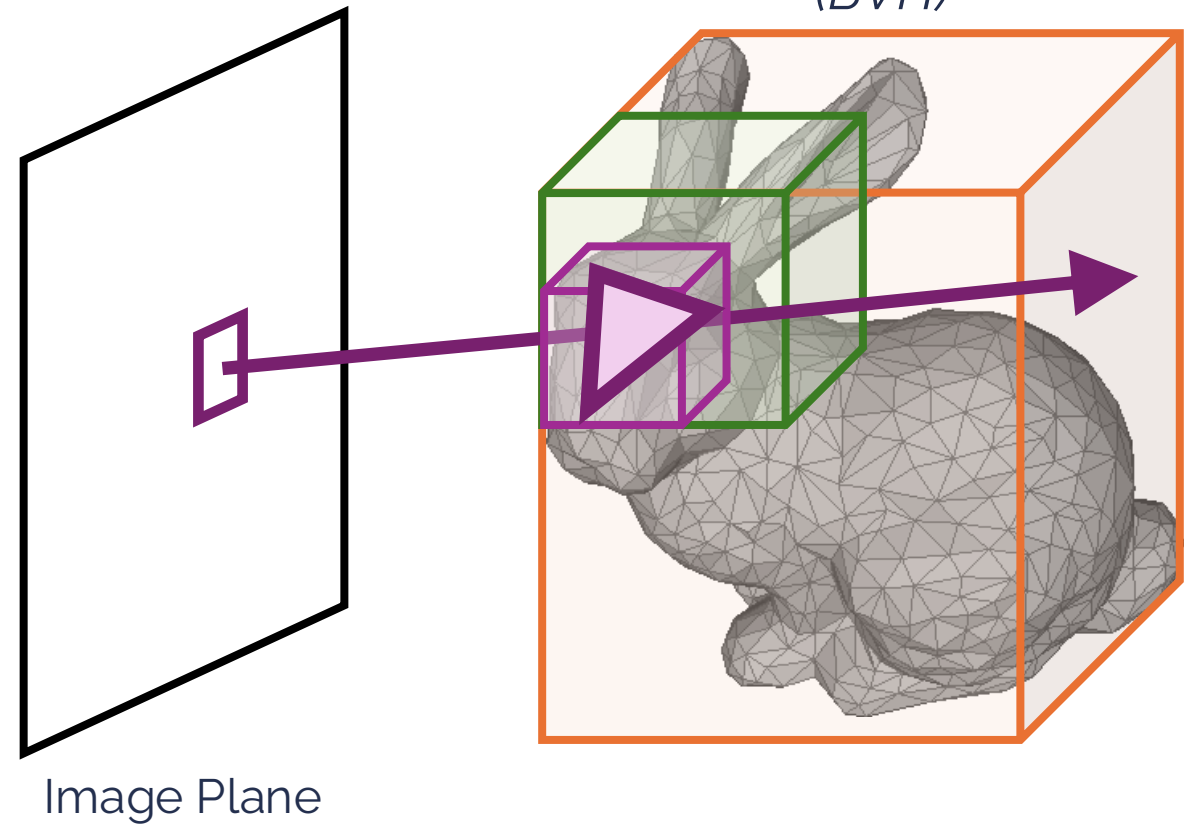


3D Gaussian-Based Rendering

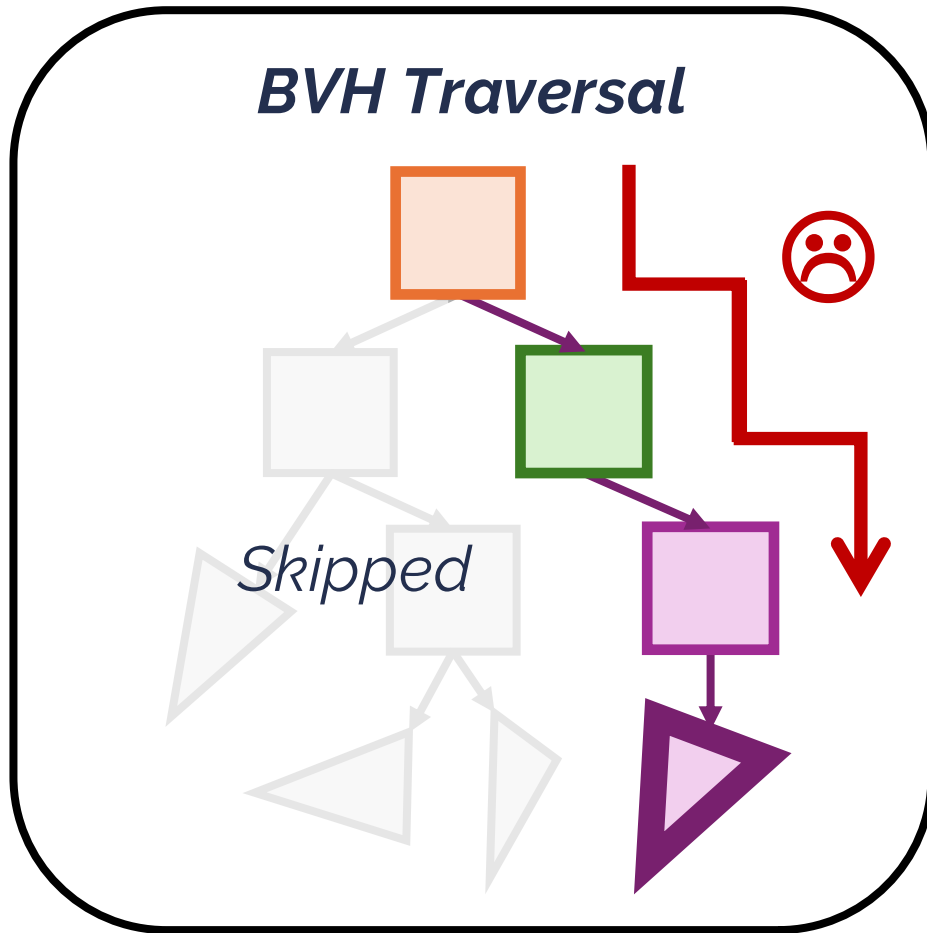


Ray-tracing

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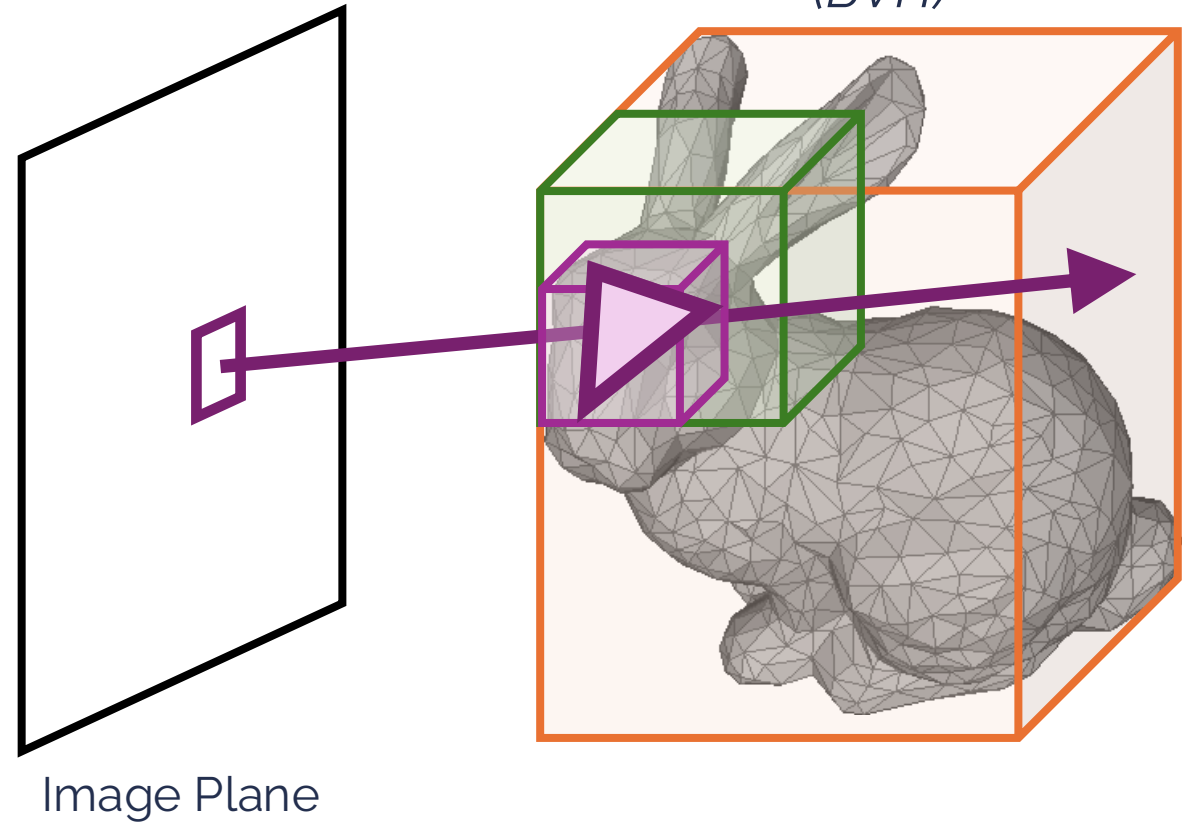


3D Gaussian-Based Rendering



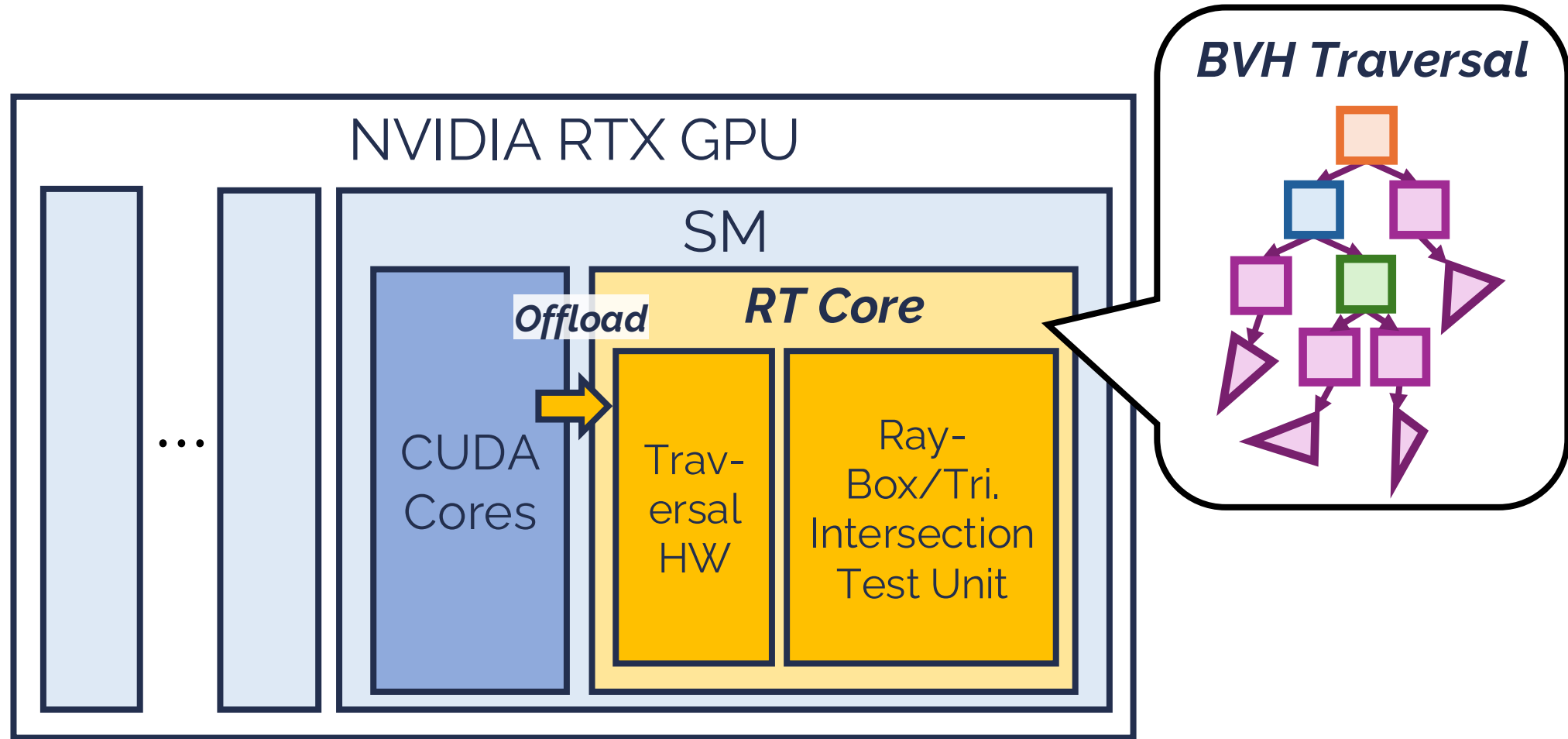
Ray-tracing

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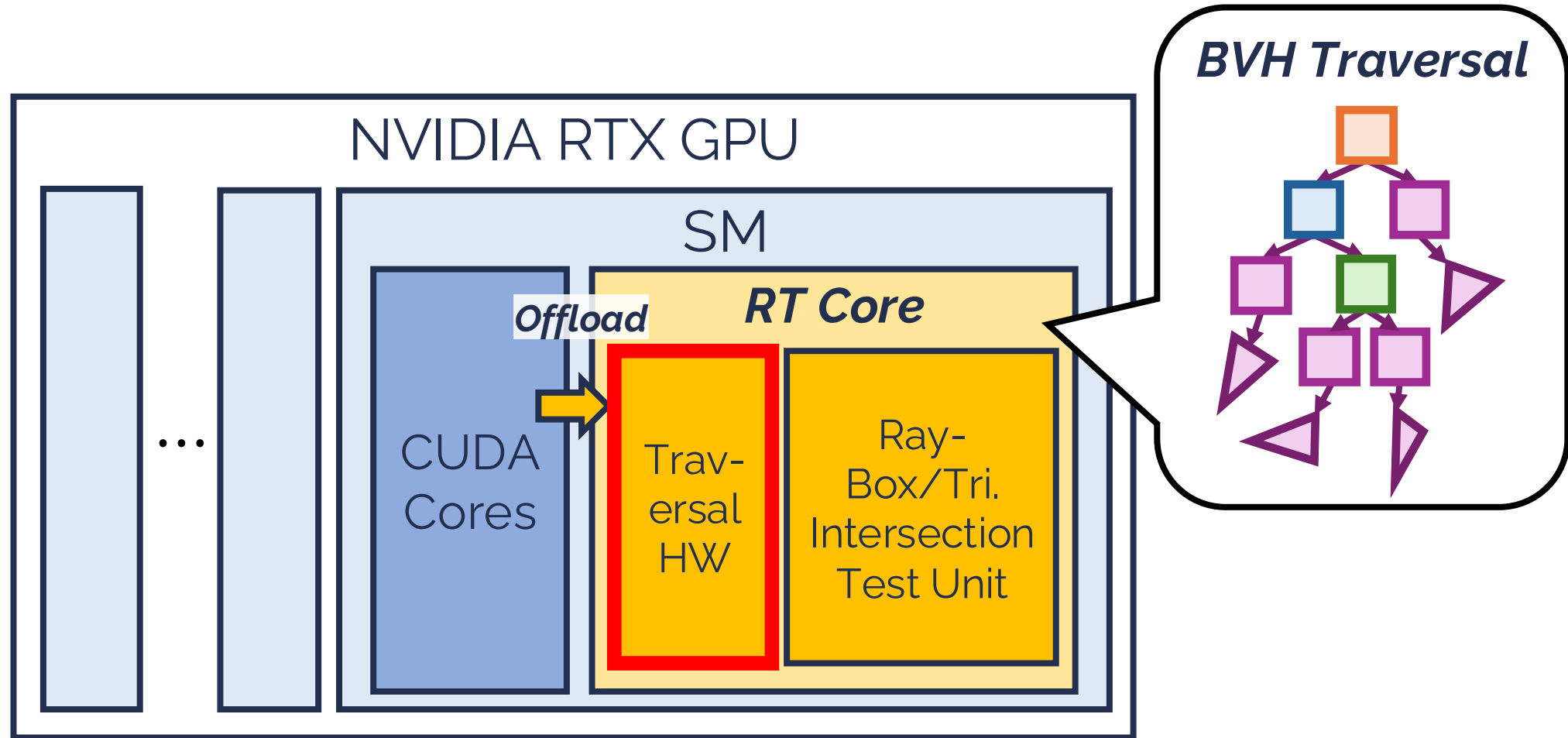


Ray Tracing Accelerators in GPUs

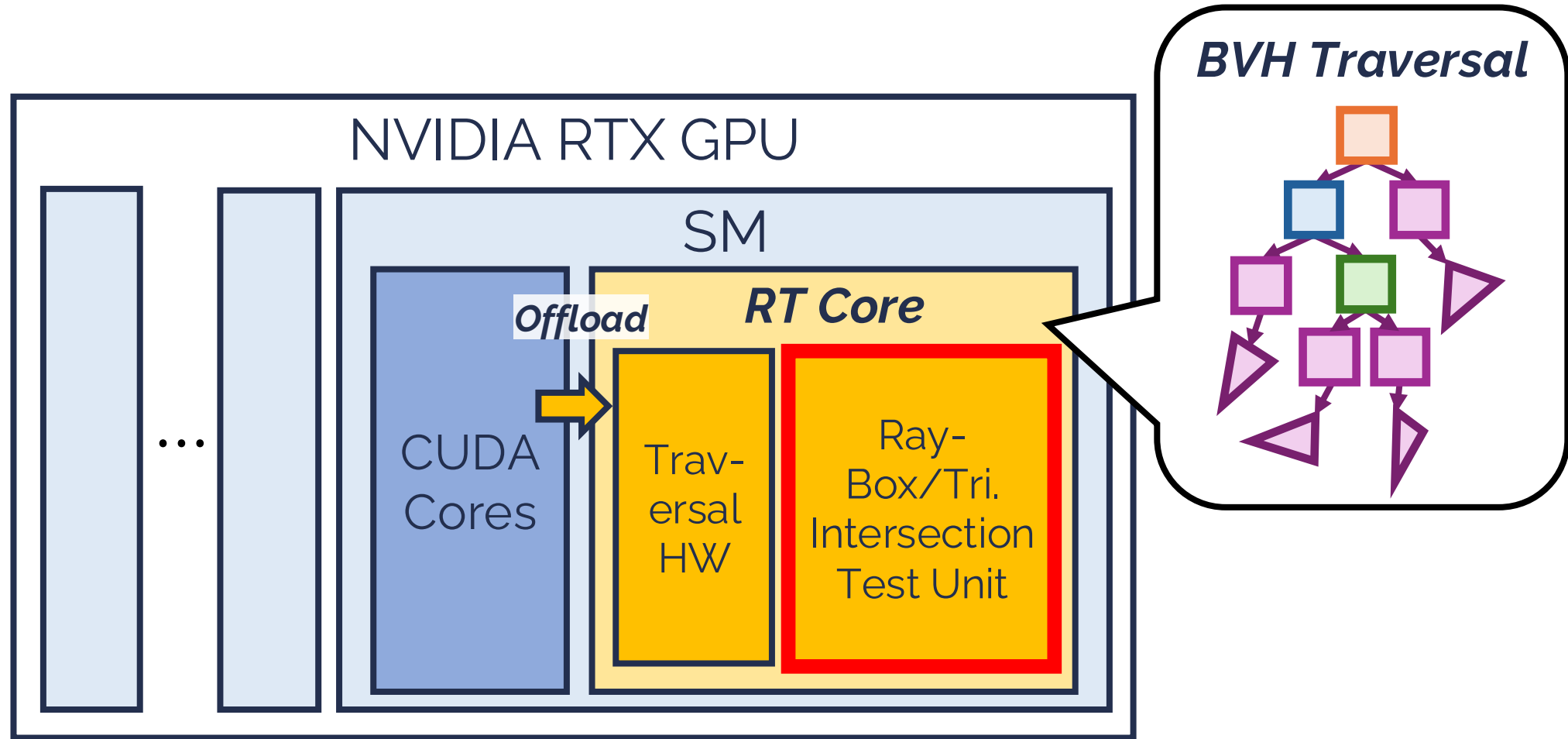
Ray Tracing Accelerators in GPUs



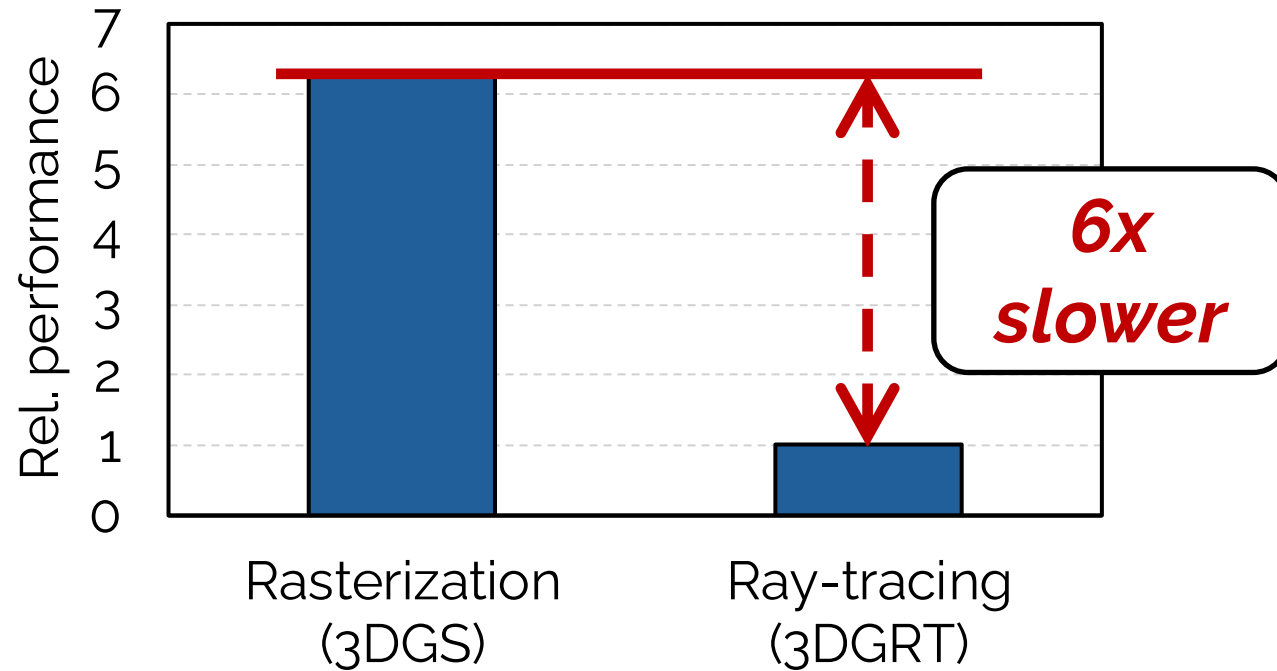
Ray Tracing Accelerators in GPUs



Ray Tracing Accelerators in GPUs



Goal of This Work



Goal

Reduce the performance gap
with **SW-HW optimizations for Gaussian ray-tracing**

Outline

- **Background**

- 3D Gaussian-based Rendering: Rasterization vs. Ray-tracing
- Ray Tracing Accelerators in Modern GPUs

- **Gaussian RT Optimizations & Limitations**

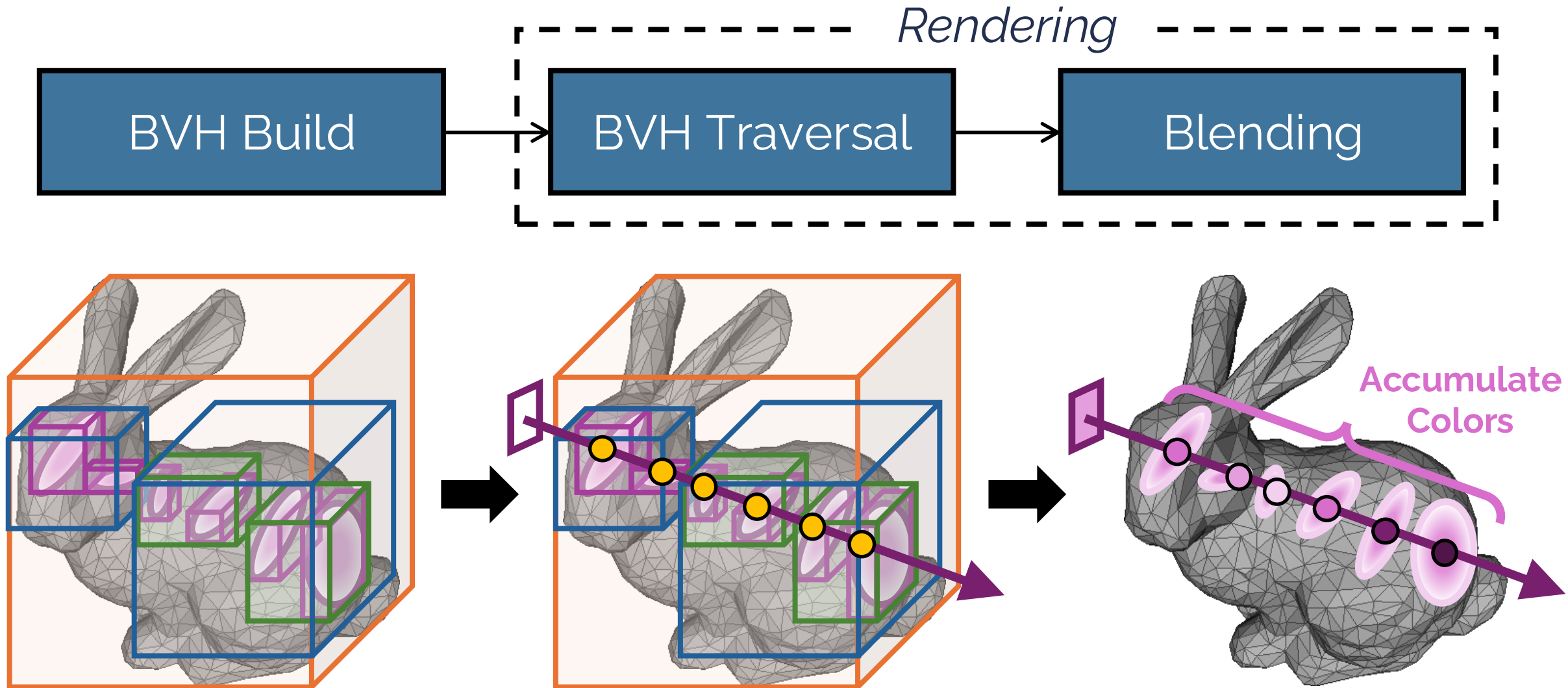
- **GRTX: SW-HW Optimizations for Gaussian Ray Tracing**

- GRTX-SW: Two-Level Acceleration Structure for Gaussian Primitives
- GRTX-HW: HW Extension for Traversal Checkpointing and Replay

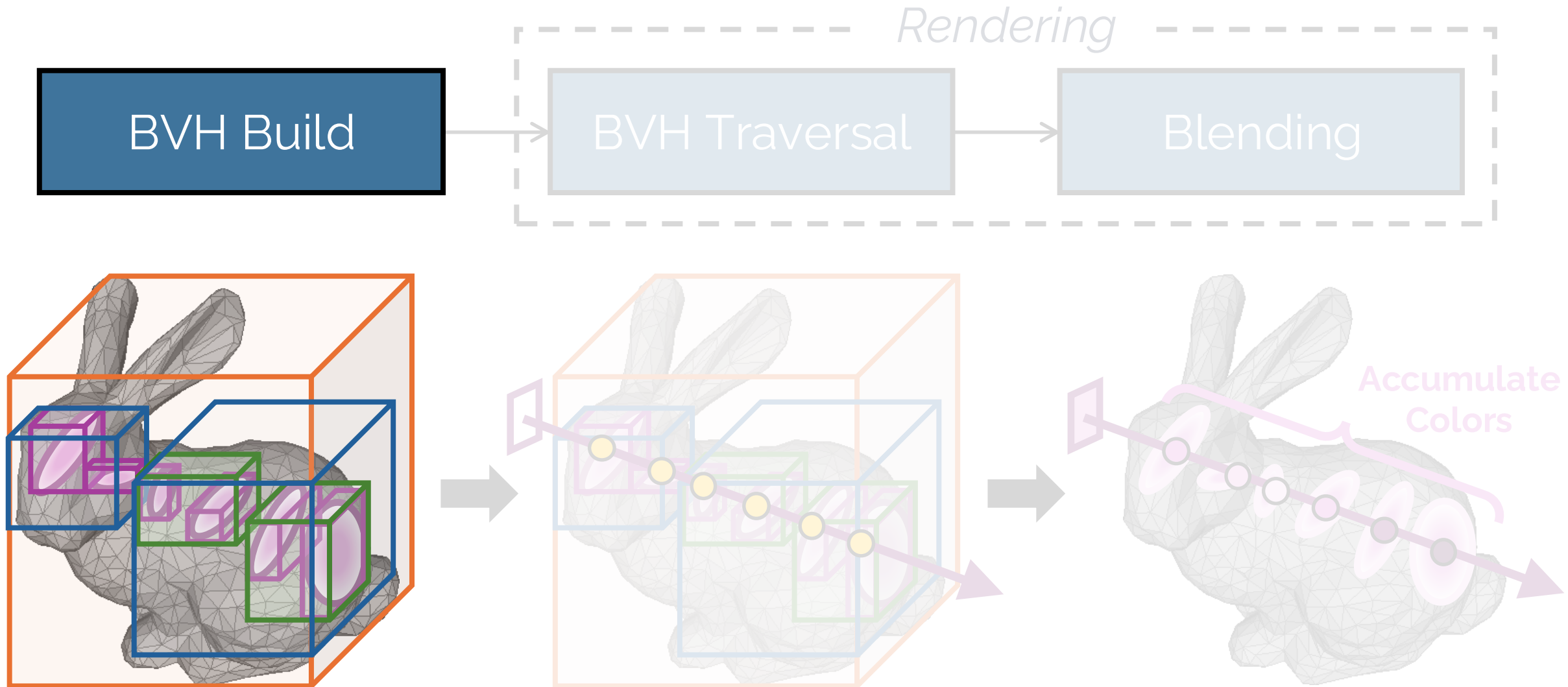
- **Evaluation**

- **Conclusion**

Overview of Gaussian Ray Tracing

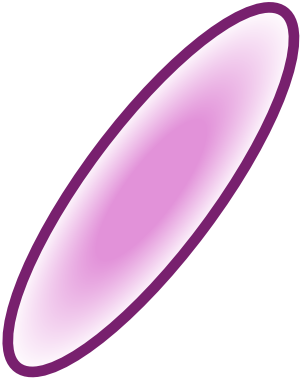



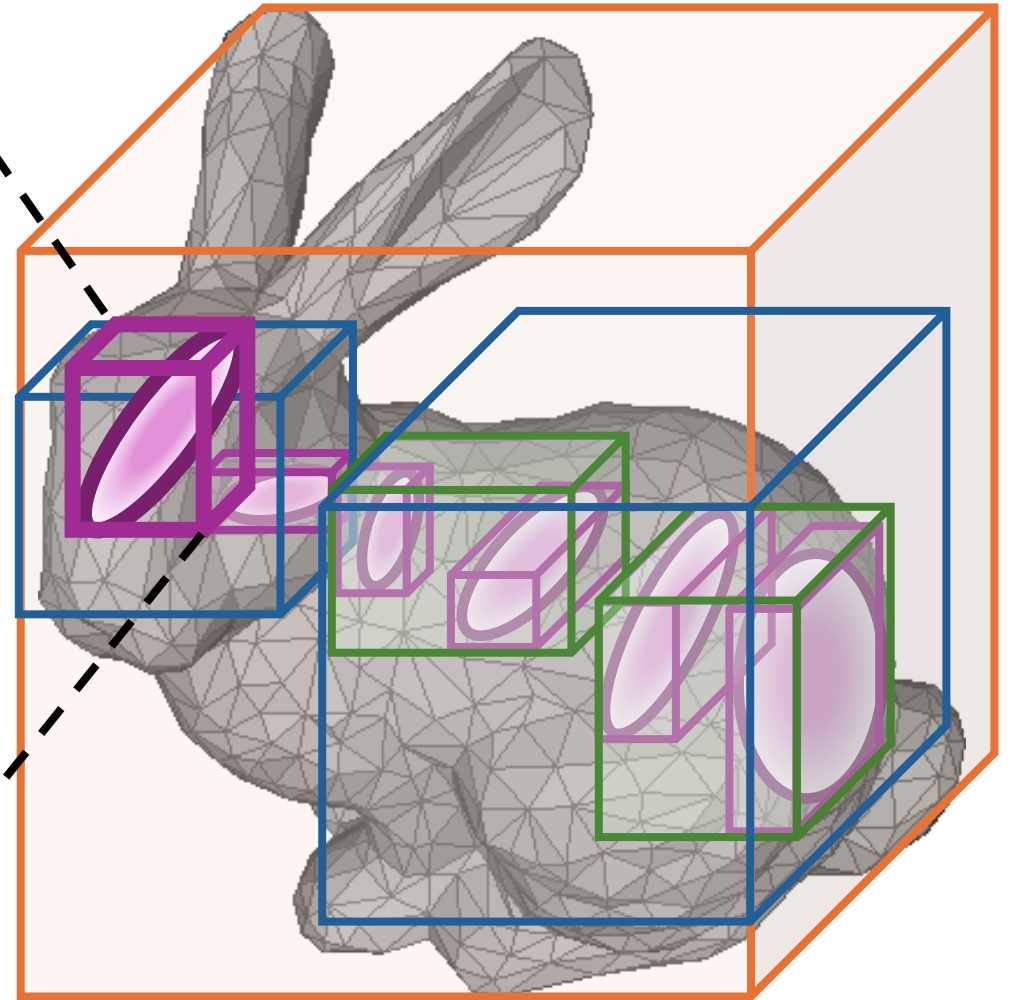
Overview of Gaussian Ray Tracing



Gaussian RT Optimizations & Limitations

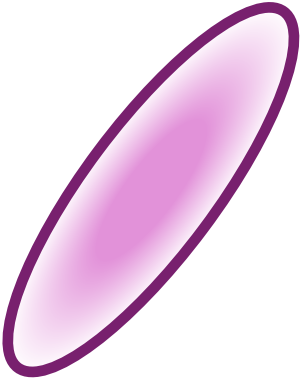
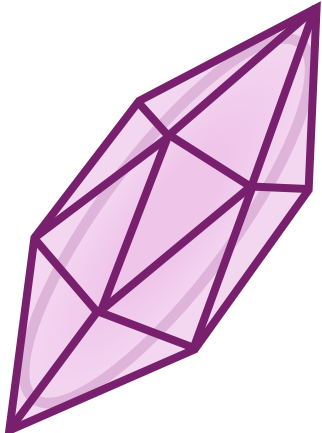
Primitive Types

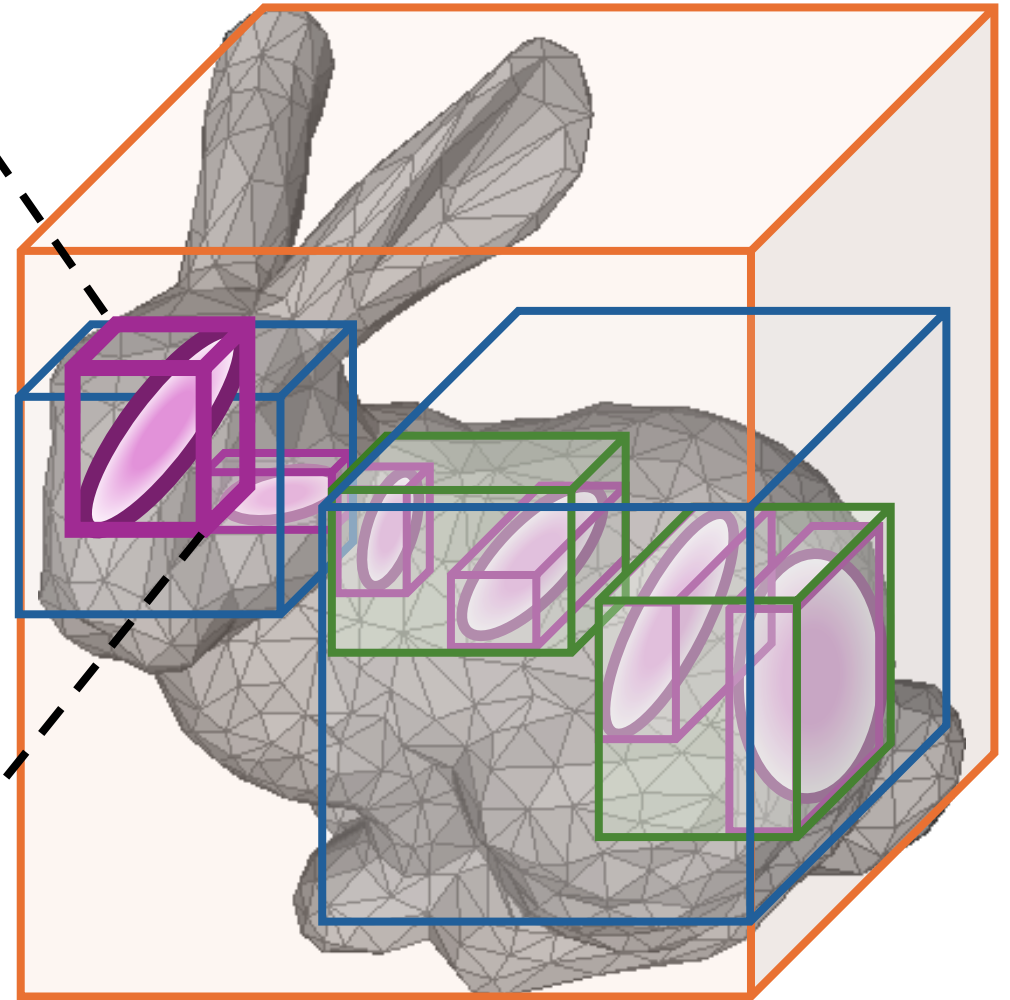
		
	Gaussian Primitive	Bounding Triangle Mesh
😊	Compact BVH (1 Gaus. = 1 Prim.)	HW-based intersection test
😞	SW-based intersection test	Large BVH (1 Gaus. = 20 Prims.)



Gaussian RT Optimizations & Limitations

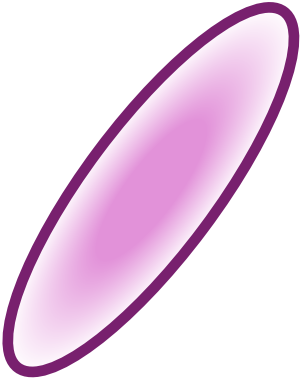
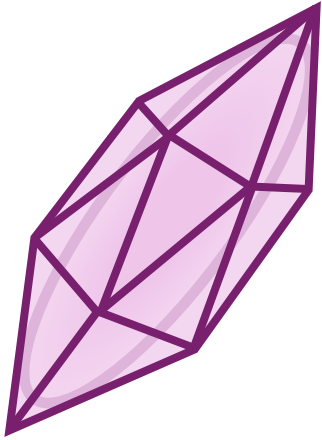
Primitive Types

		
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Gaussian RT Optimizations & Limitations

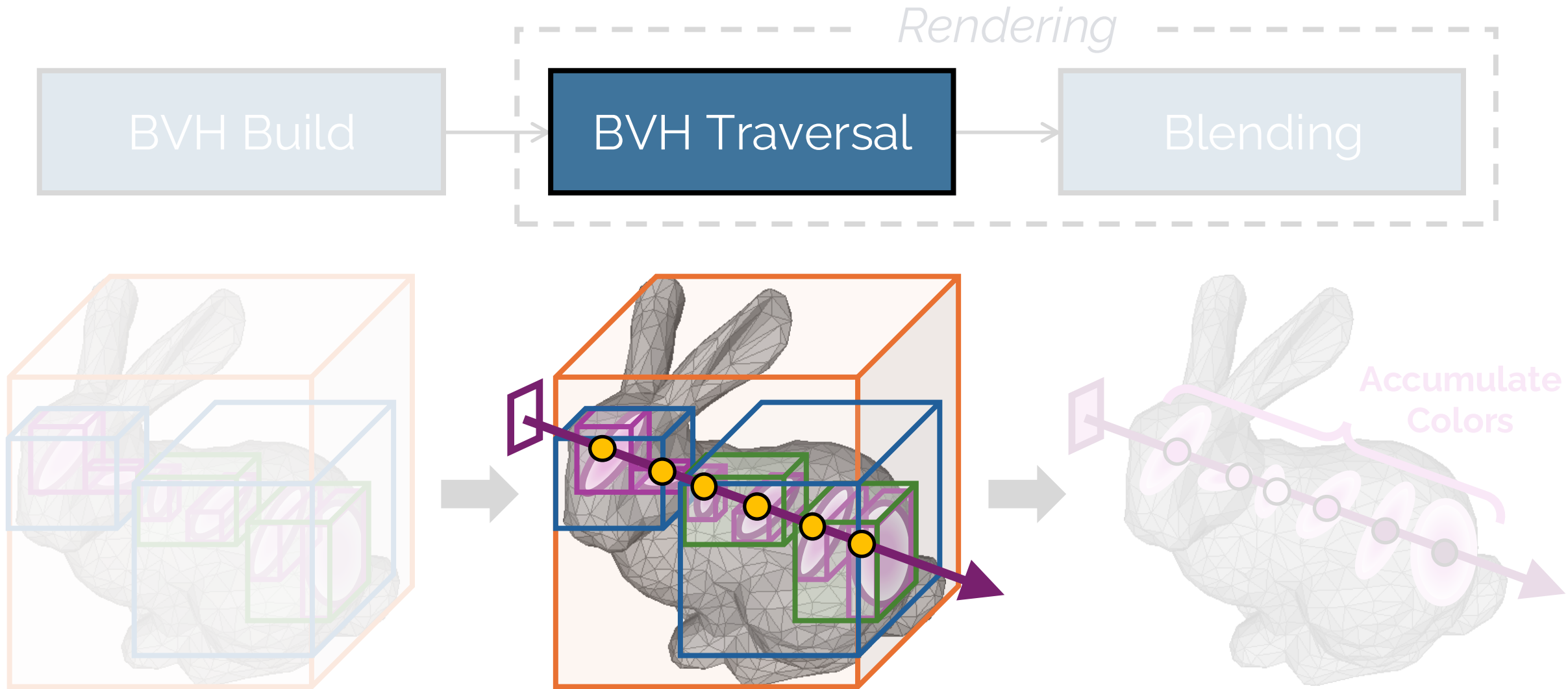
Primitive Types

		
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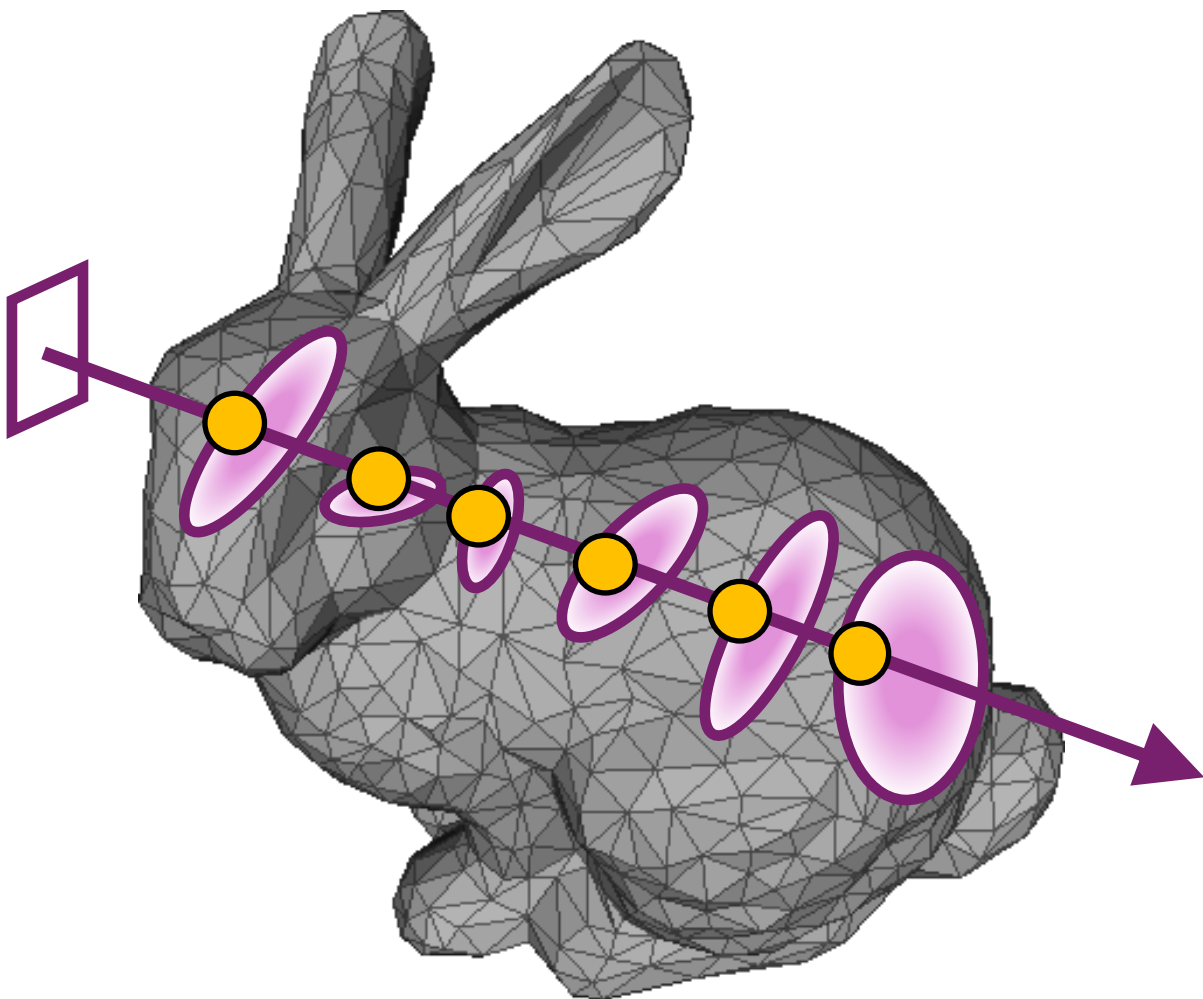
Problem 1

**Bloated BVH size and
increased memory footprint**

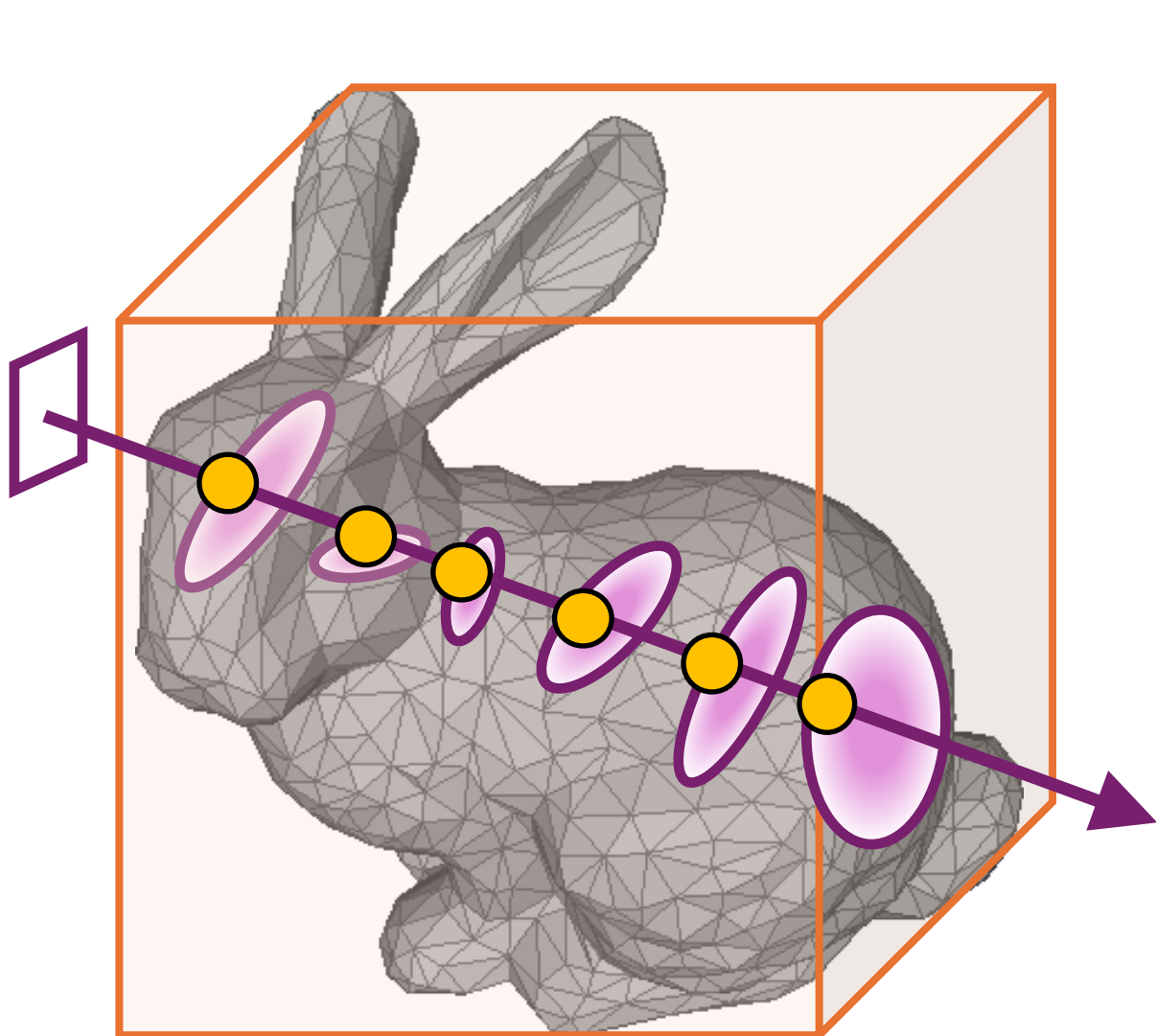
Gaussian RT Optimizations & Limitations



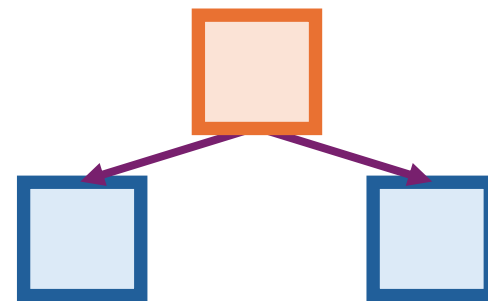
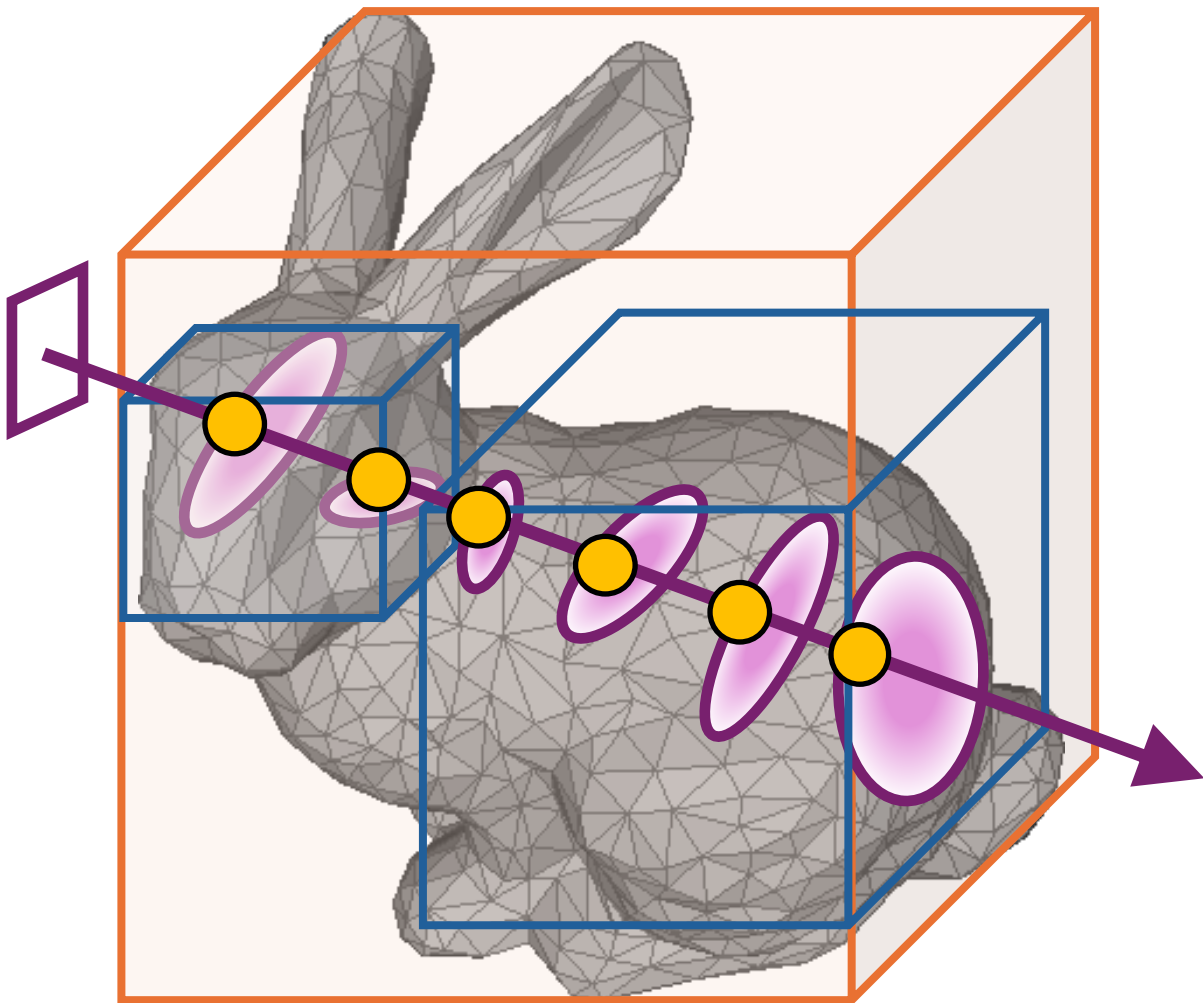
Gaussian RT Optimizations & Limitations



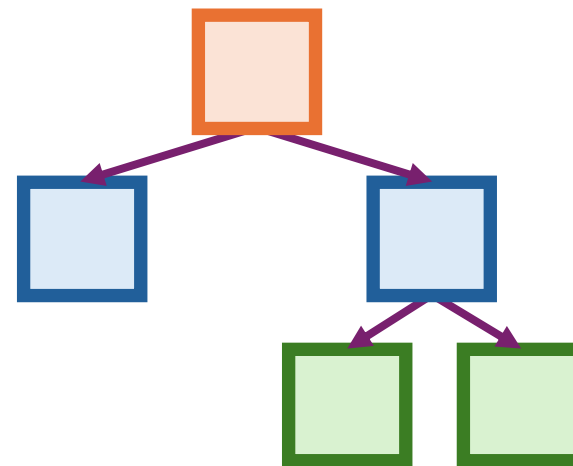
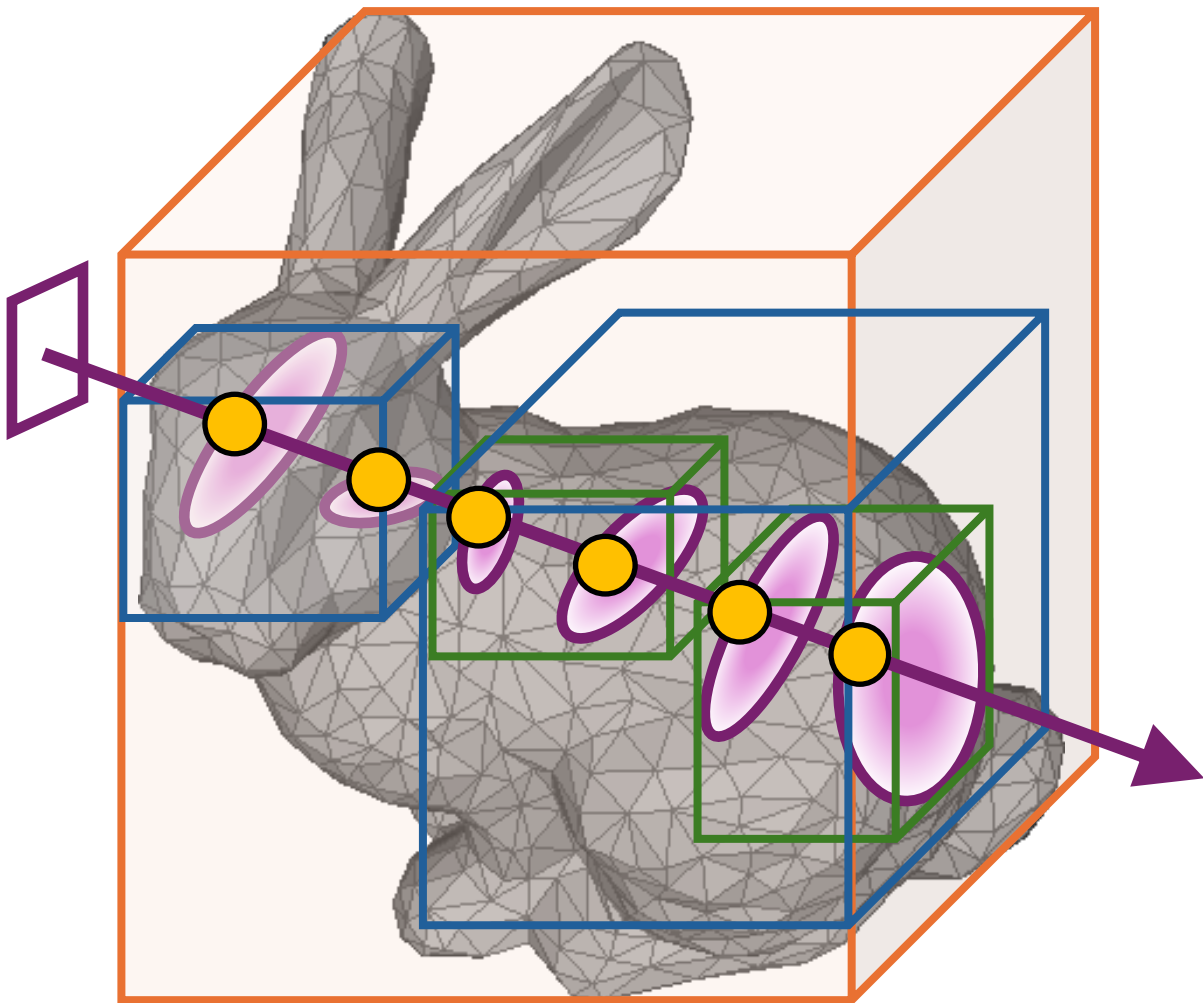
Gaussian RT Optimizations & Limitations



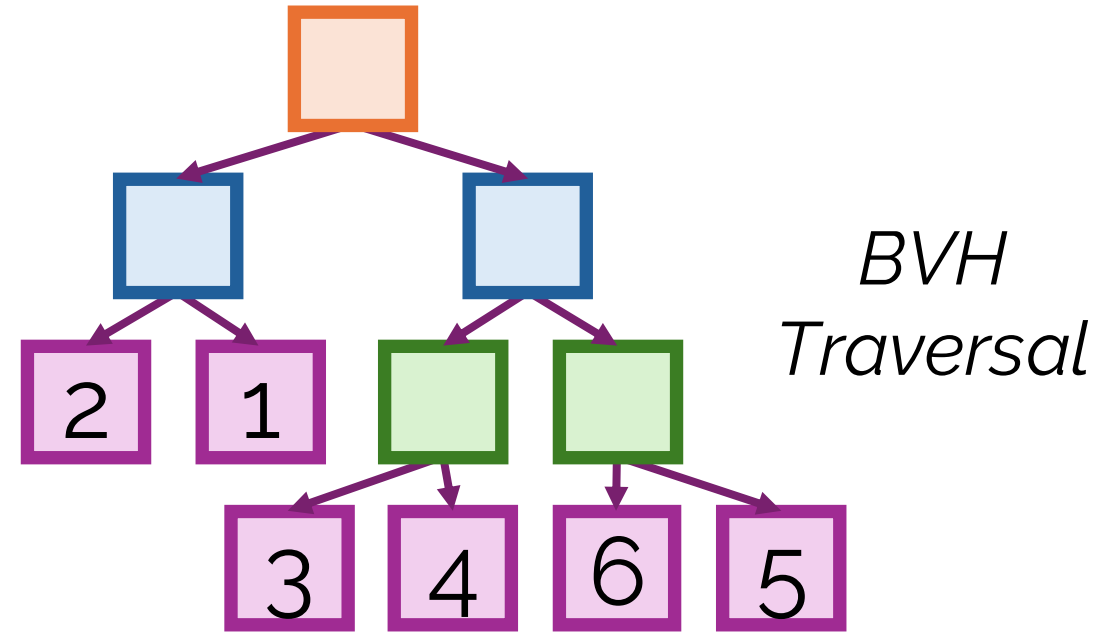
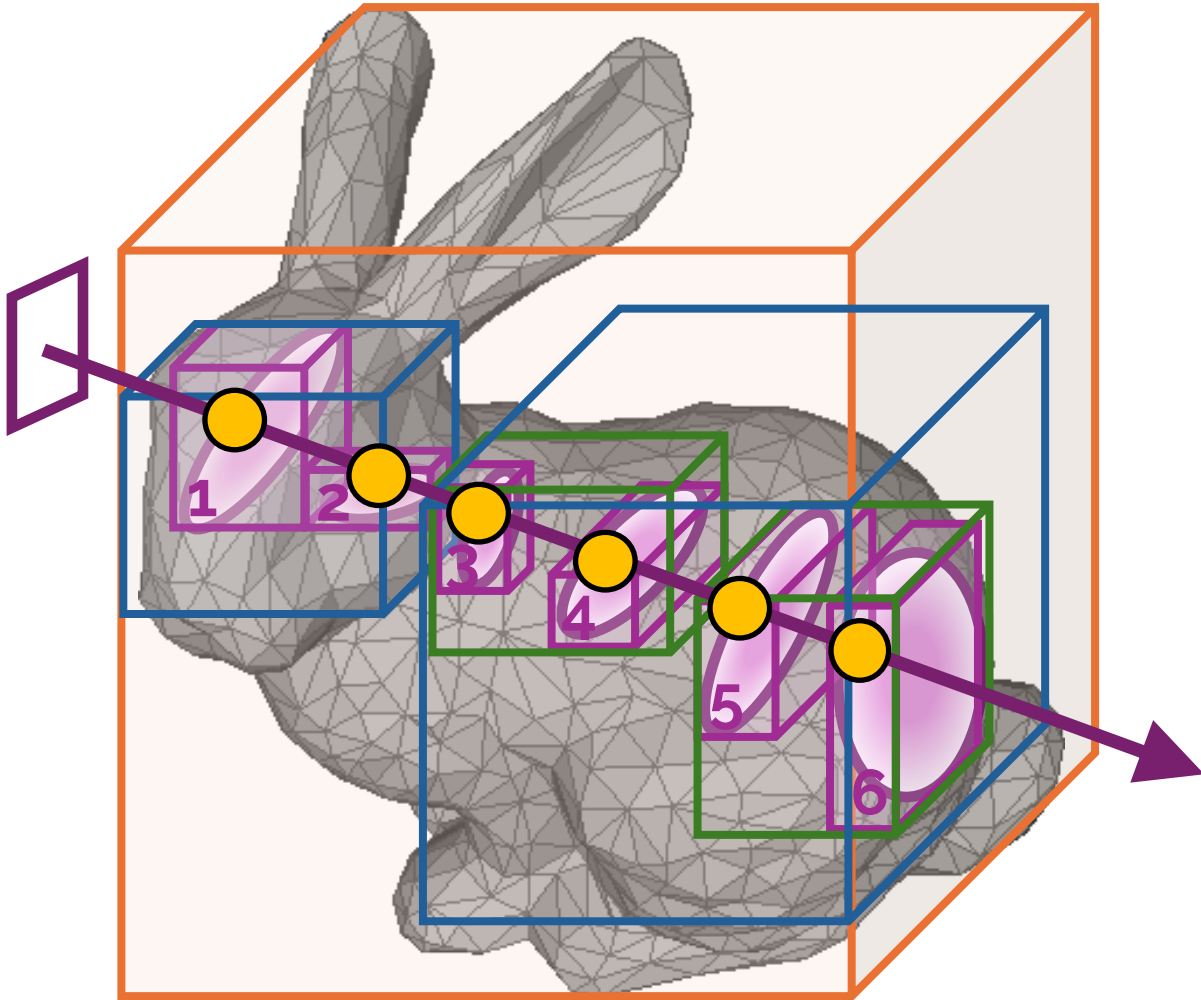
Gaussian RT Optimizations & Limitations



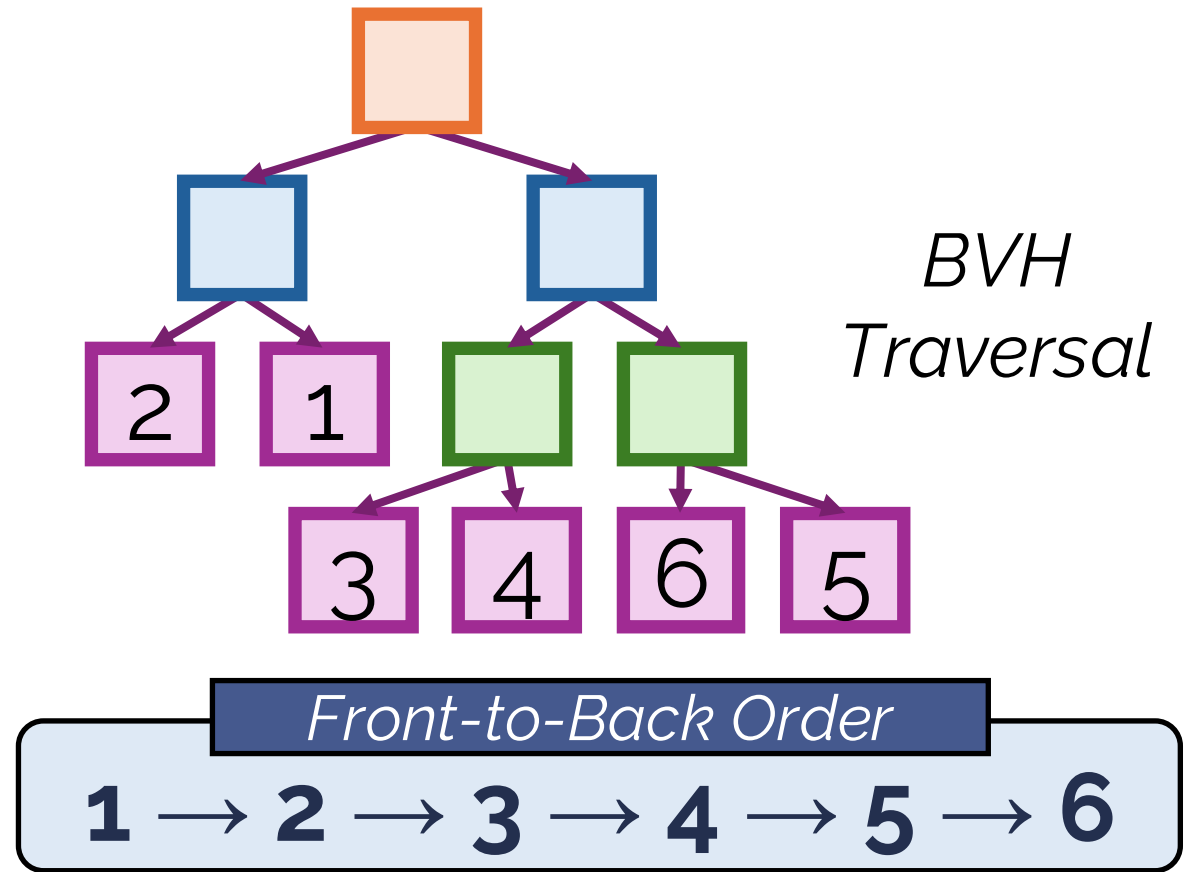
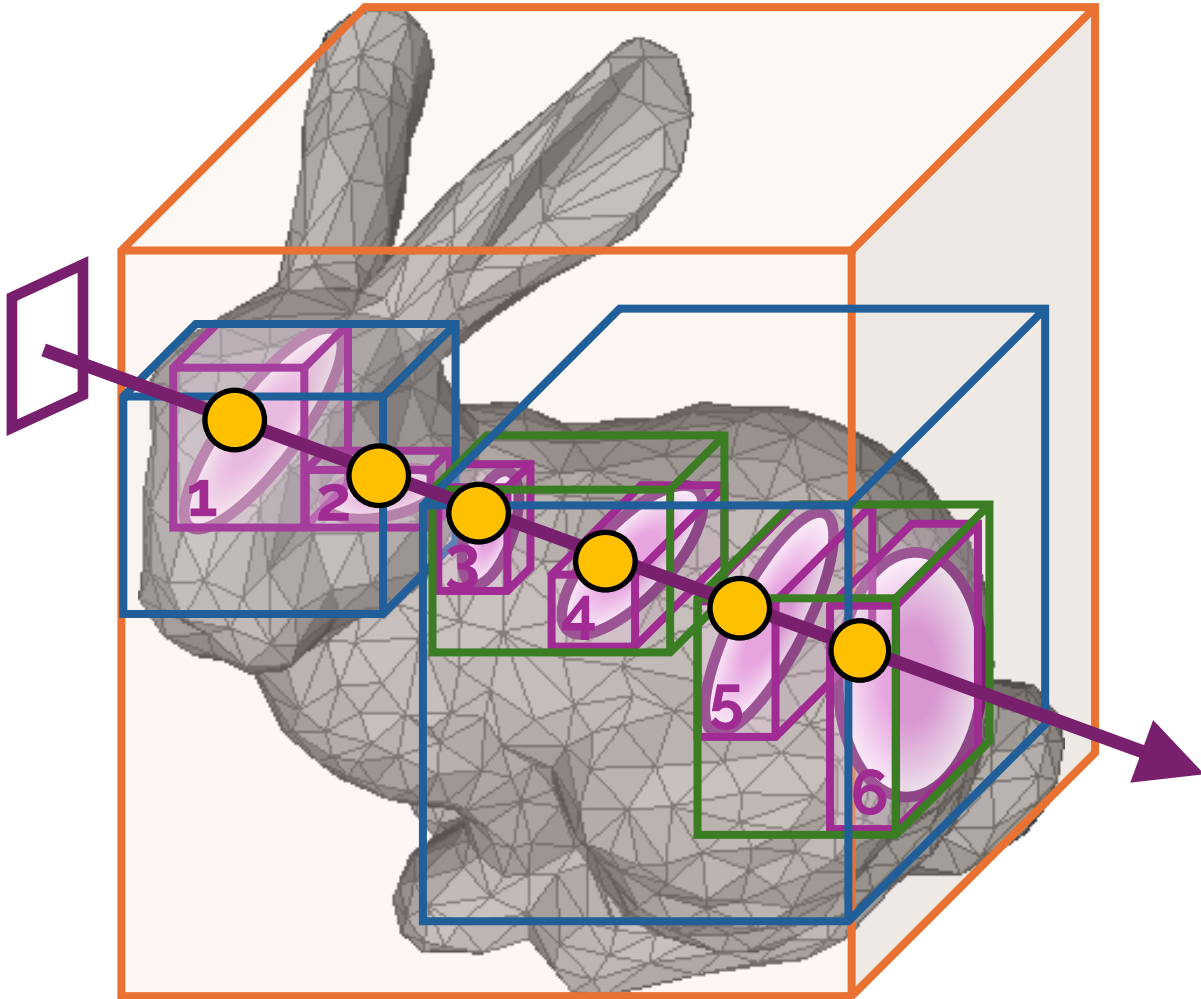
Gaussian RT Optimizations & Limitations



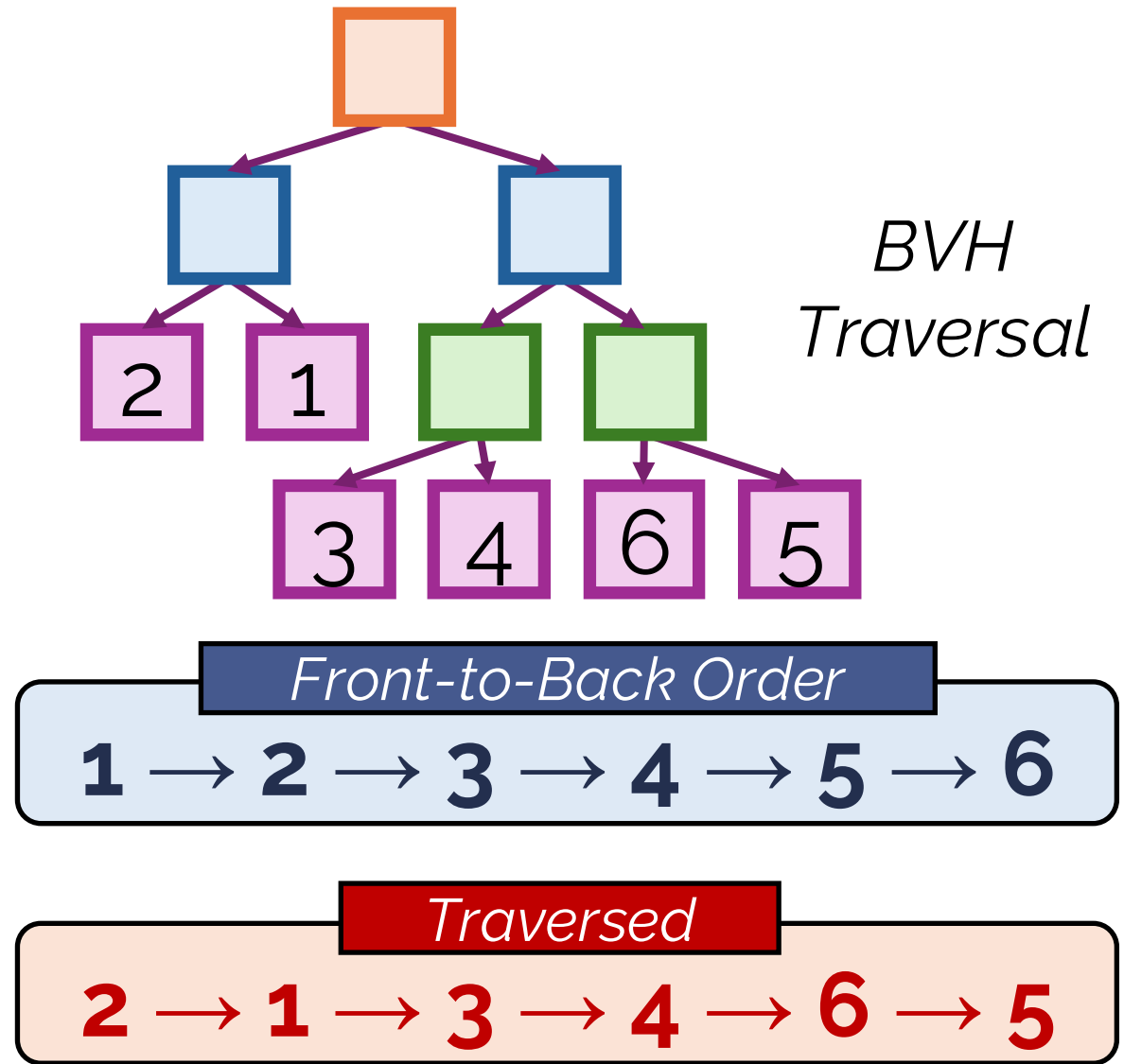
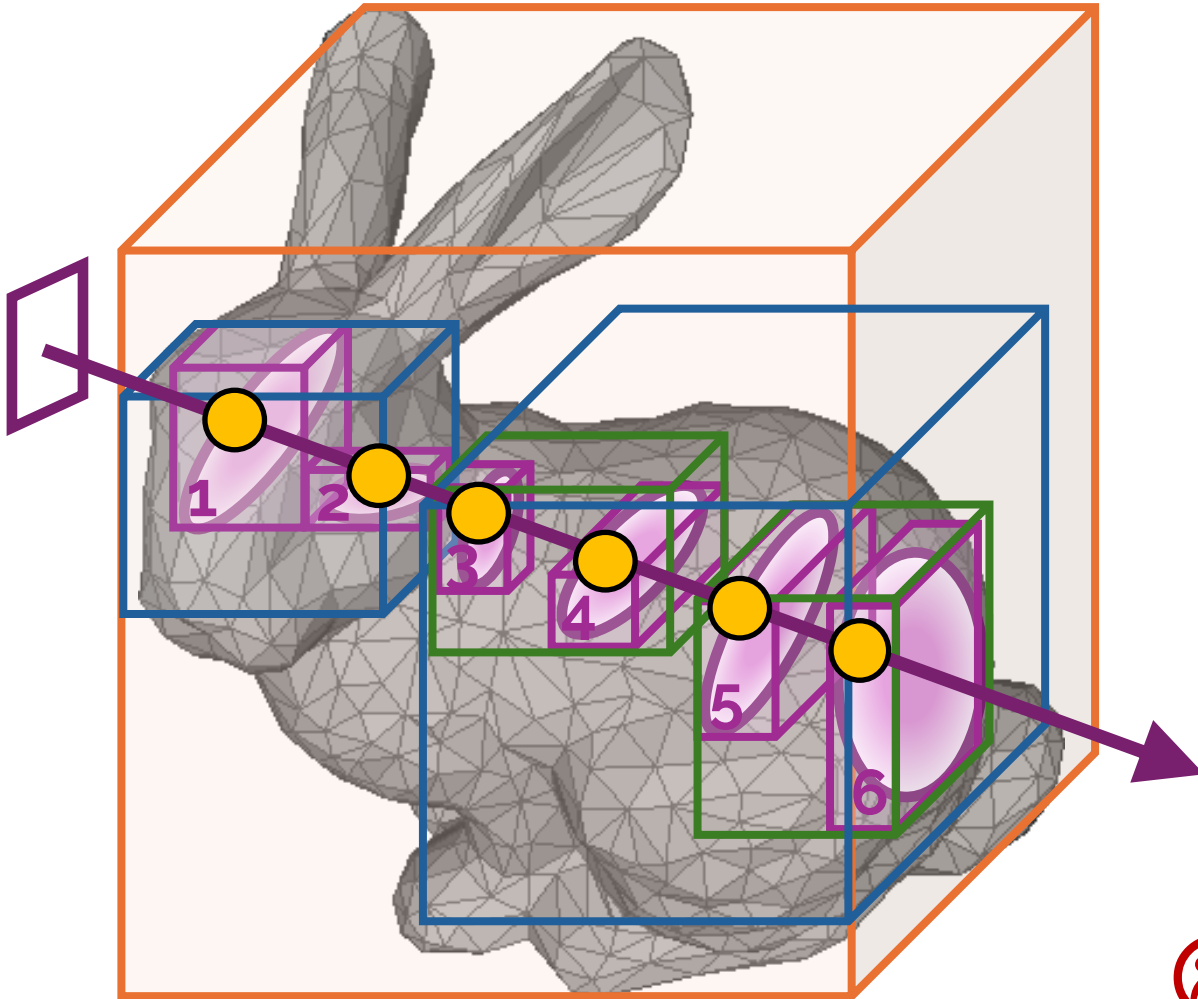
Gaussian RT Optimizations & Limitations



Gaussian RT Optimizations & Limitations

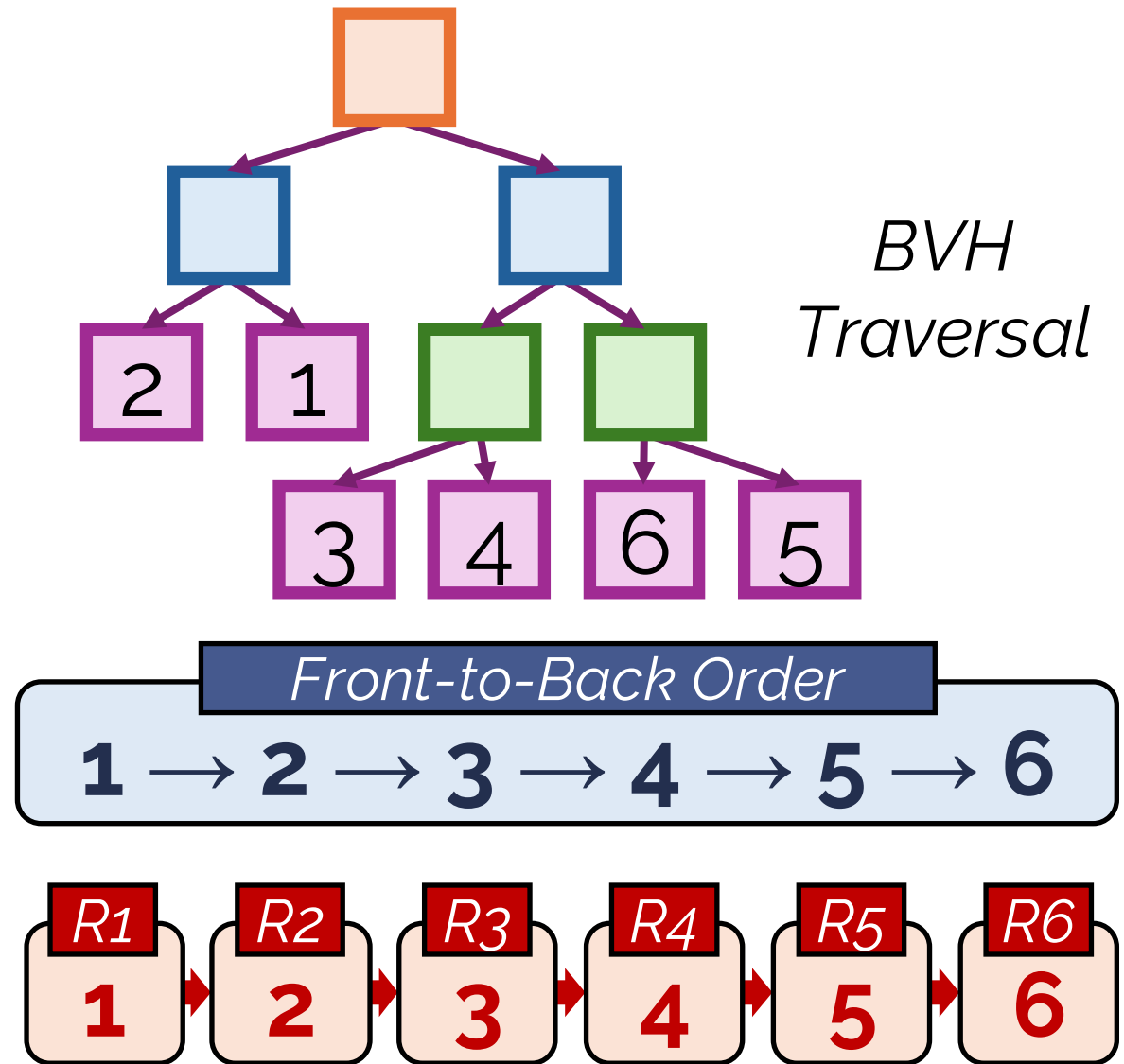


Gaussian RT Optimizations & Limitations



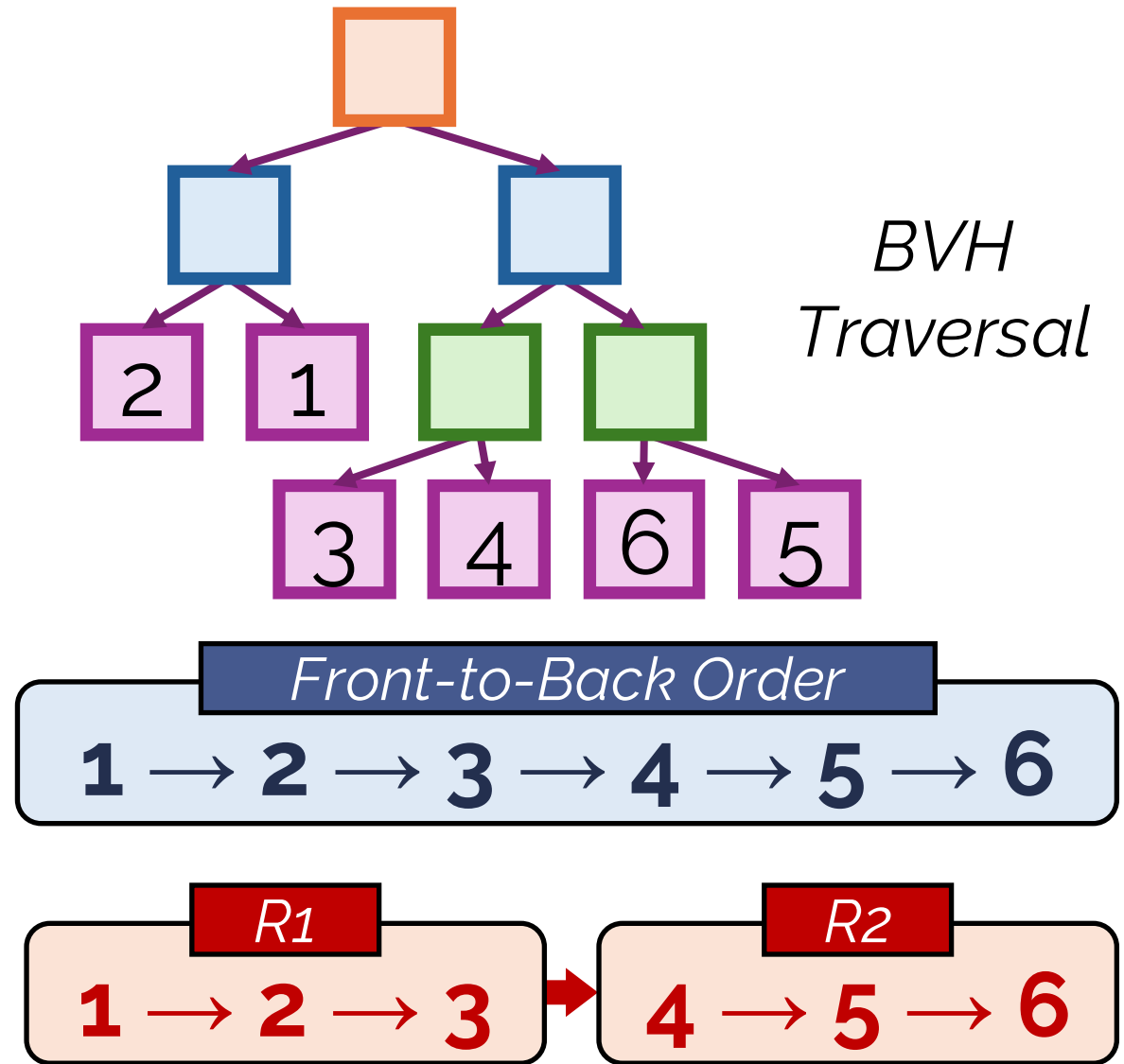
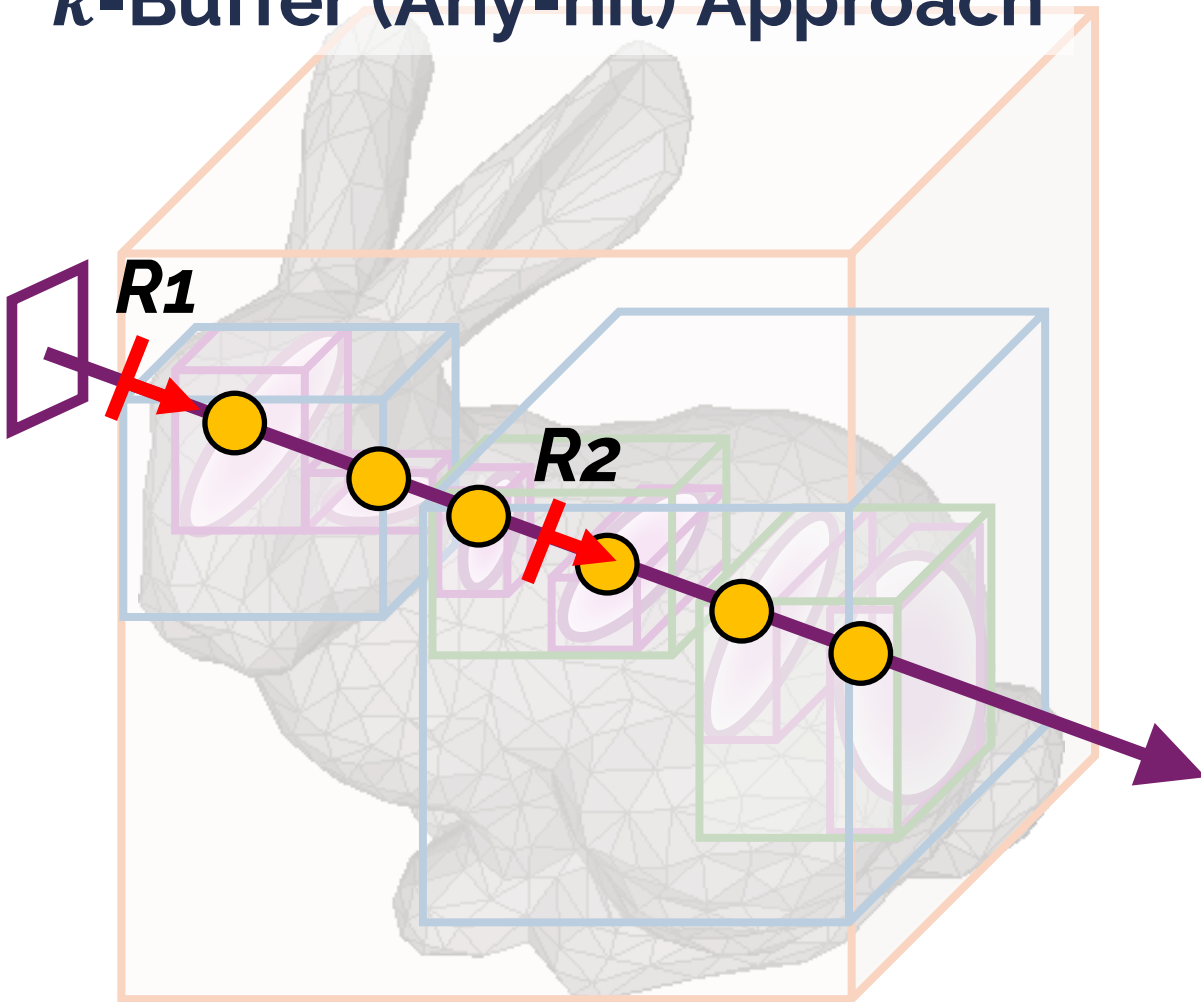
Gaussian RT Optimizations & Limitations

Closest-Hit Approach



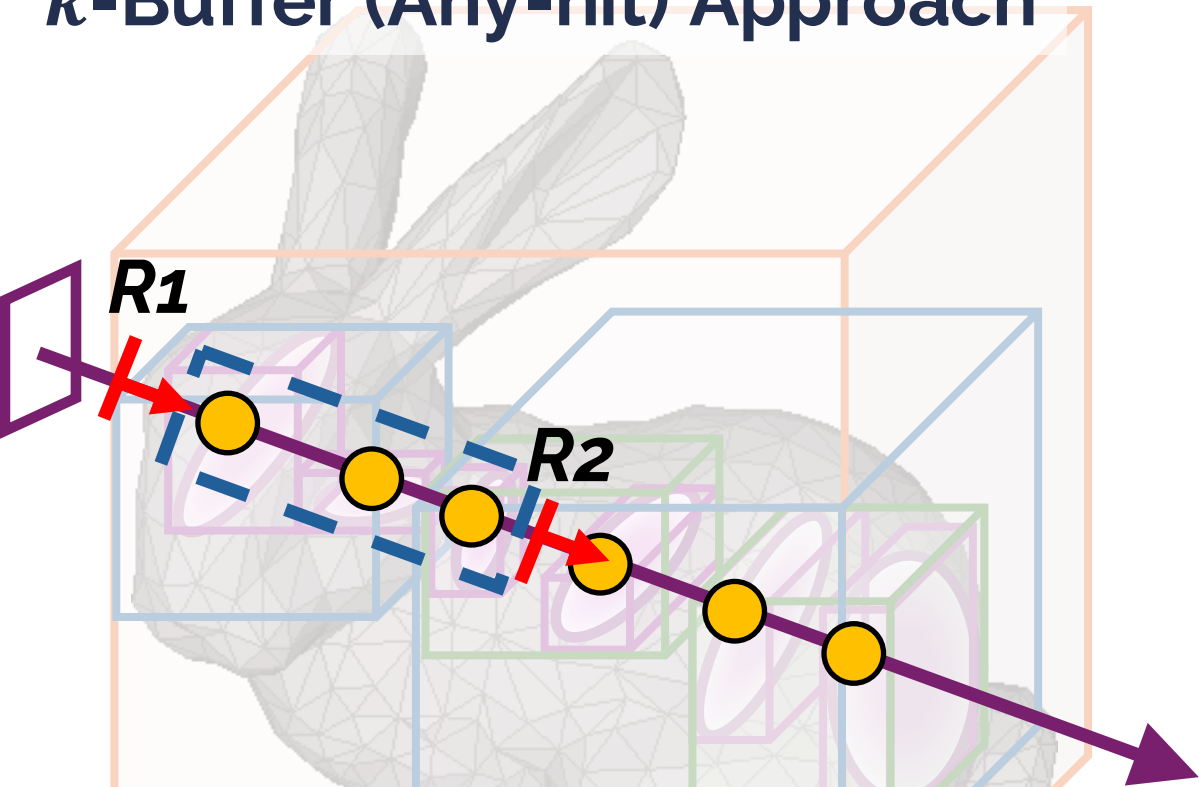
Gaussian RT Optimizations & Limitations

k-Buffer (Any-hit) Approach



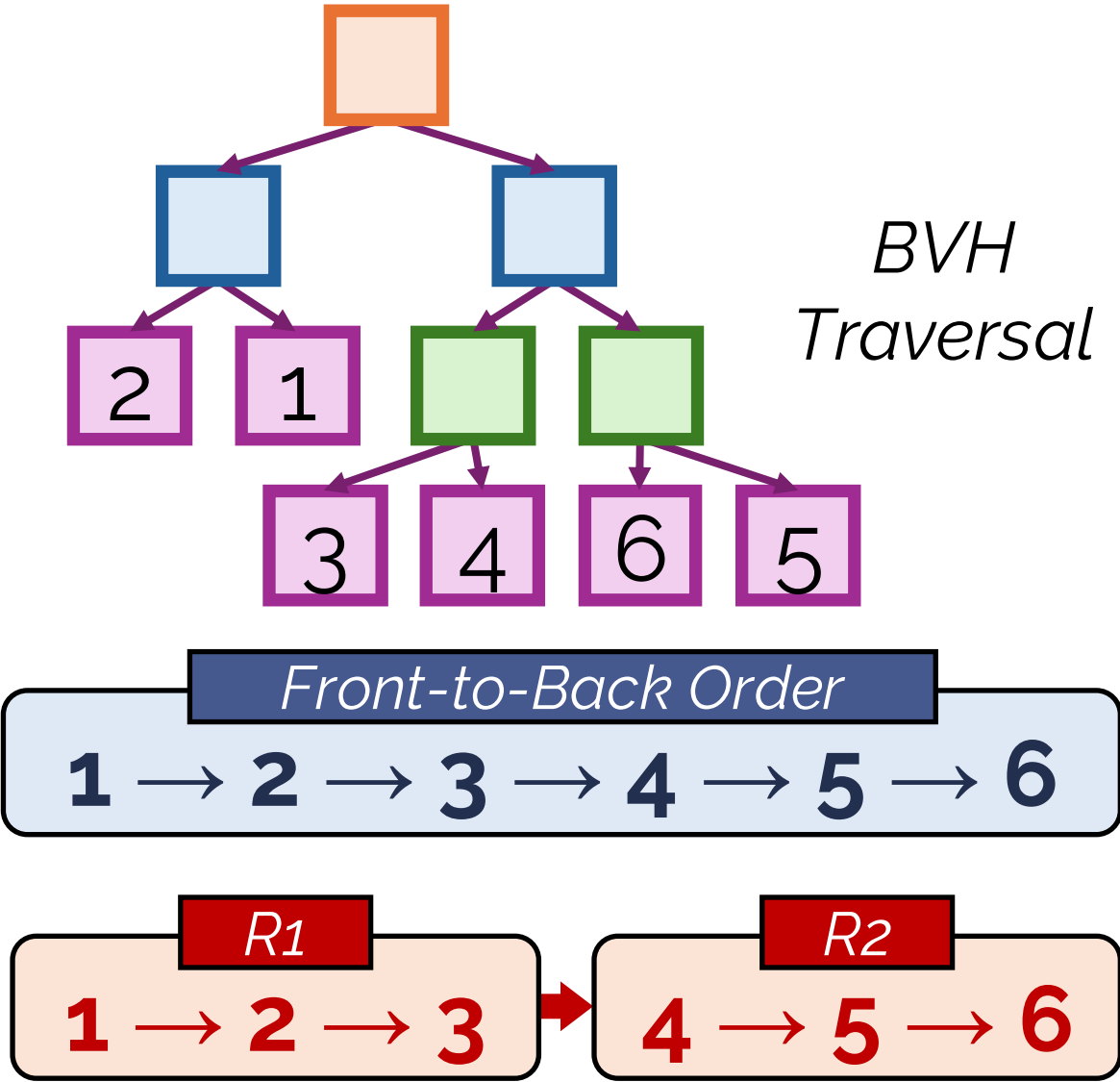
Gaussian RT Optimizations & Limitations

k-Buffer (Any-hit) Approach



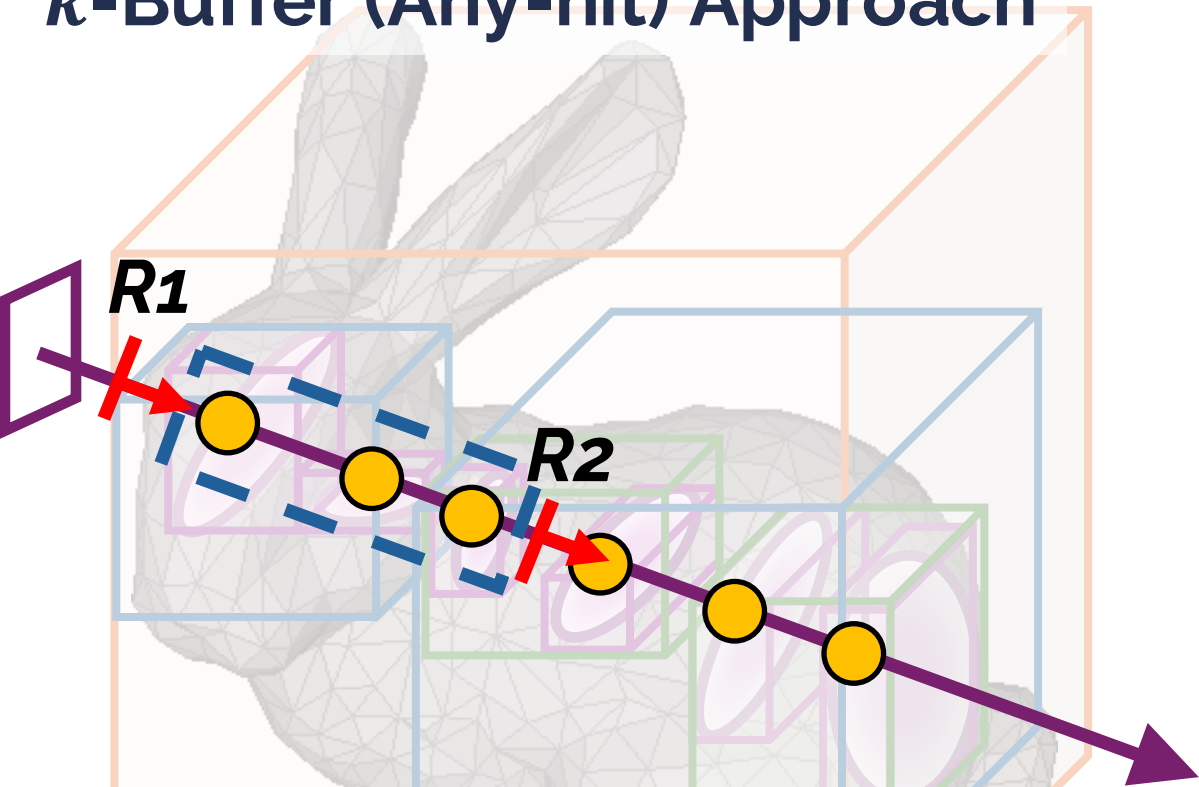
Ray 1	1	2	3
Gaus. ID			
Distance			

k-buffer ($k = 3$)



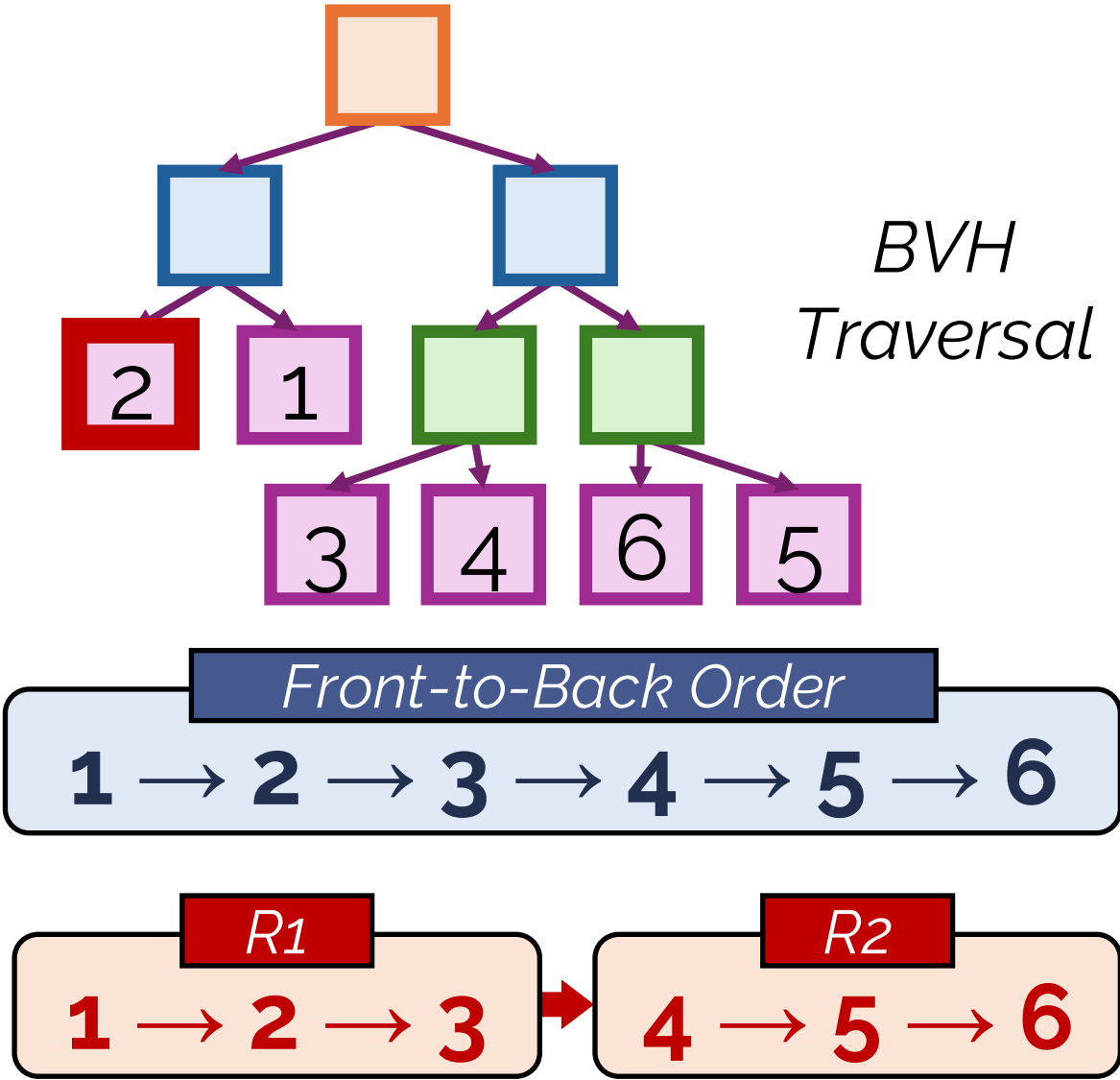
Gaussian RT Optimizations & Limitations

k-Buffer (Any-hit) Approach



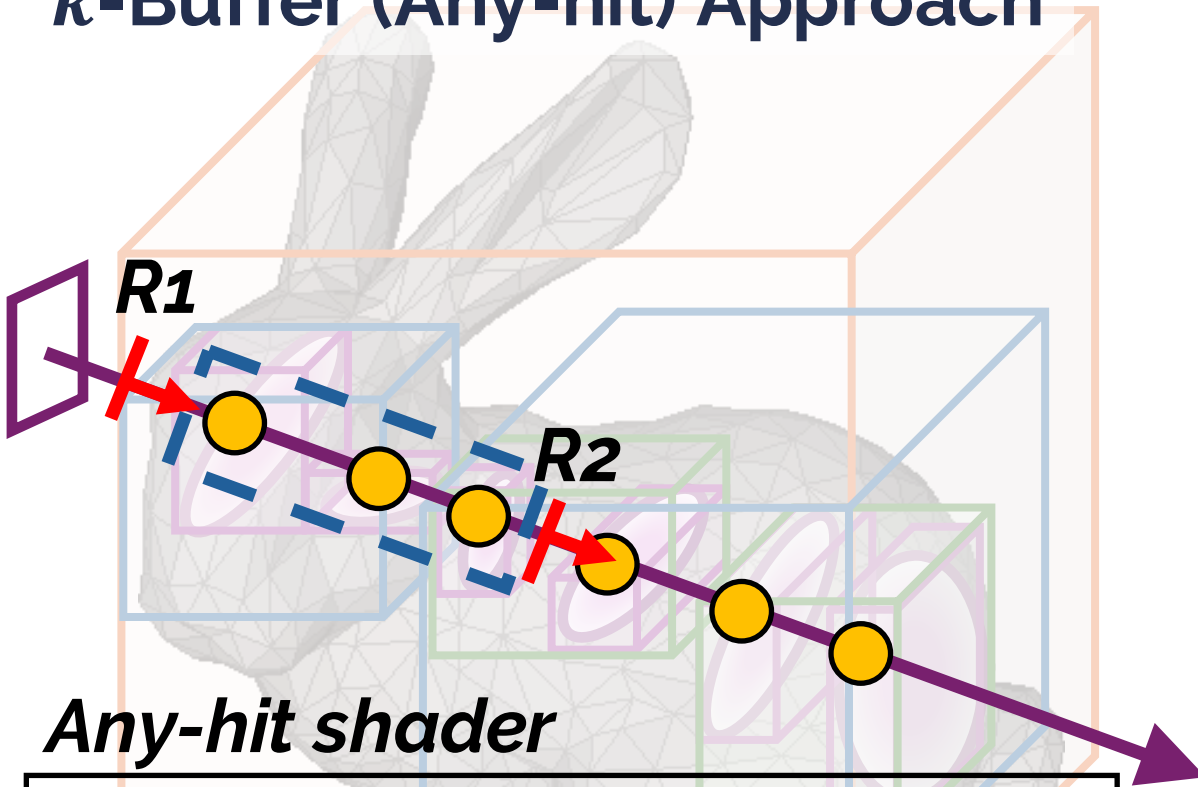
Ray 1	1	2	3
Gaus. ID			
Distance			

k-buffer ($k = 3$)



Gaussian RT Optimizations & Limitations

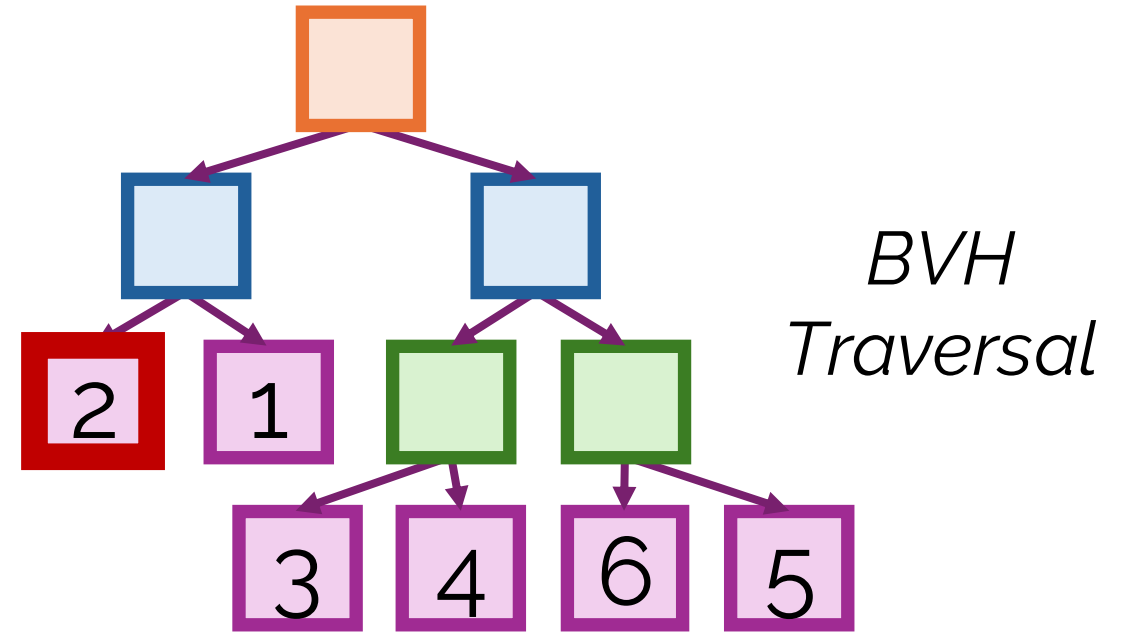
k -Buffer (Any-hit) Approach



Any-hit shader

Ray 1	1	2	3
Gaus. ID			
Distance			

k -buffer ($k = 3$)



*BVH
Traversal*

Front-to-Back Order

1 → **2** → **3** → **4** → **5** → **6**

R1

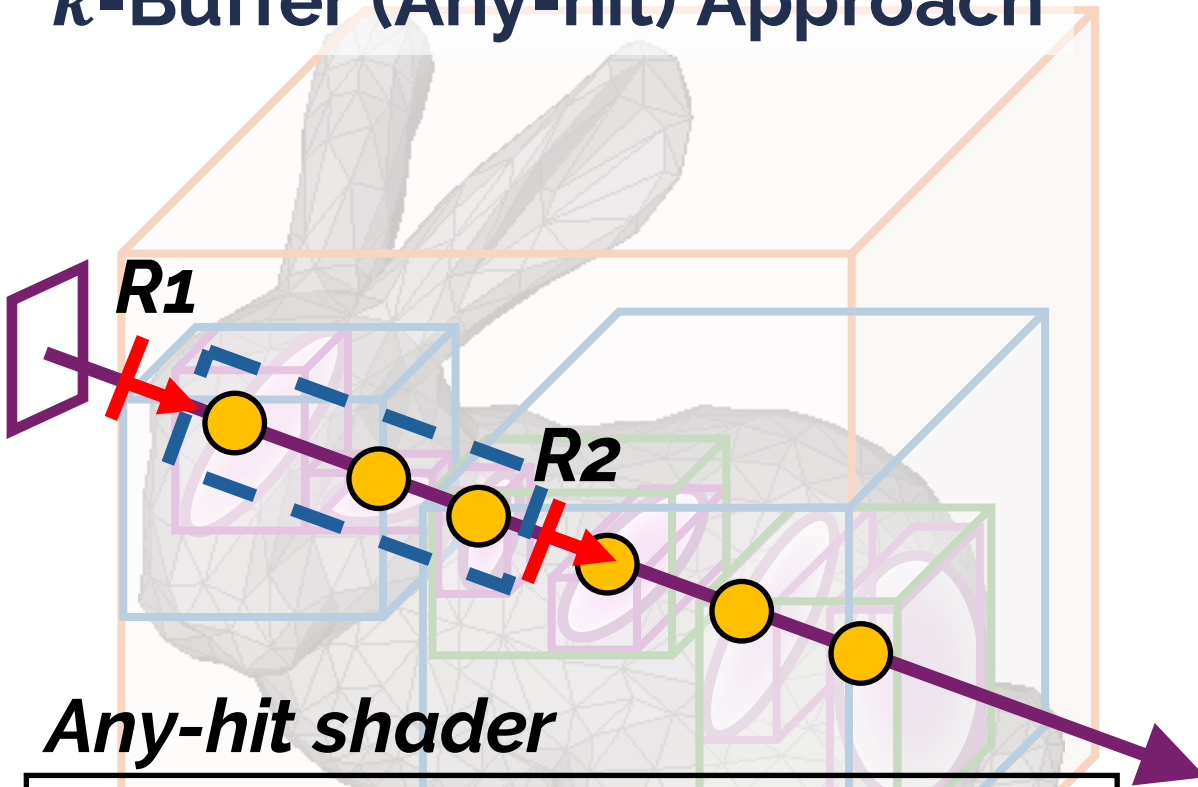
1 → **2** → **3**

R2

4 → **5** → **6**

Gaussian RT Optimizations & Limitations

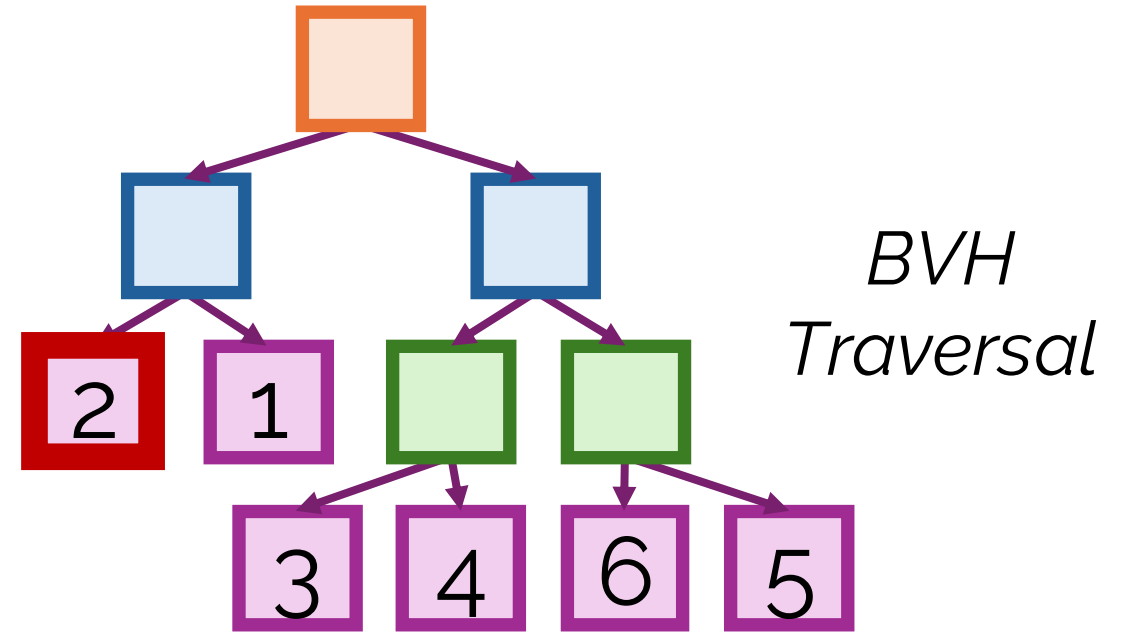
k -Buffer (Any-hit) Approach



Any-hit shader

Ray 1	1	2	3
Gaus. ID	2		
Distance	3.7		

k -buffer ($k = 3$)



BVH Traversal

Front-to-Back Order

1 → **2** → **3** → **4** → **5** → **6**

$R1$

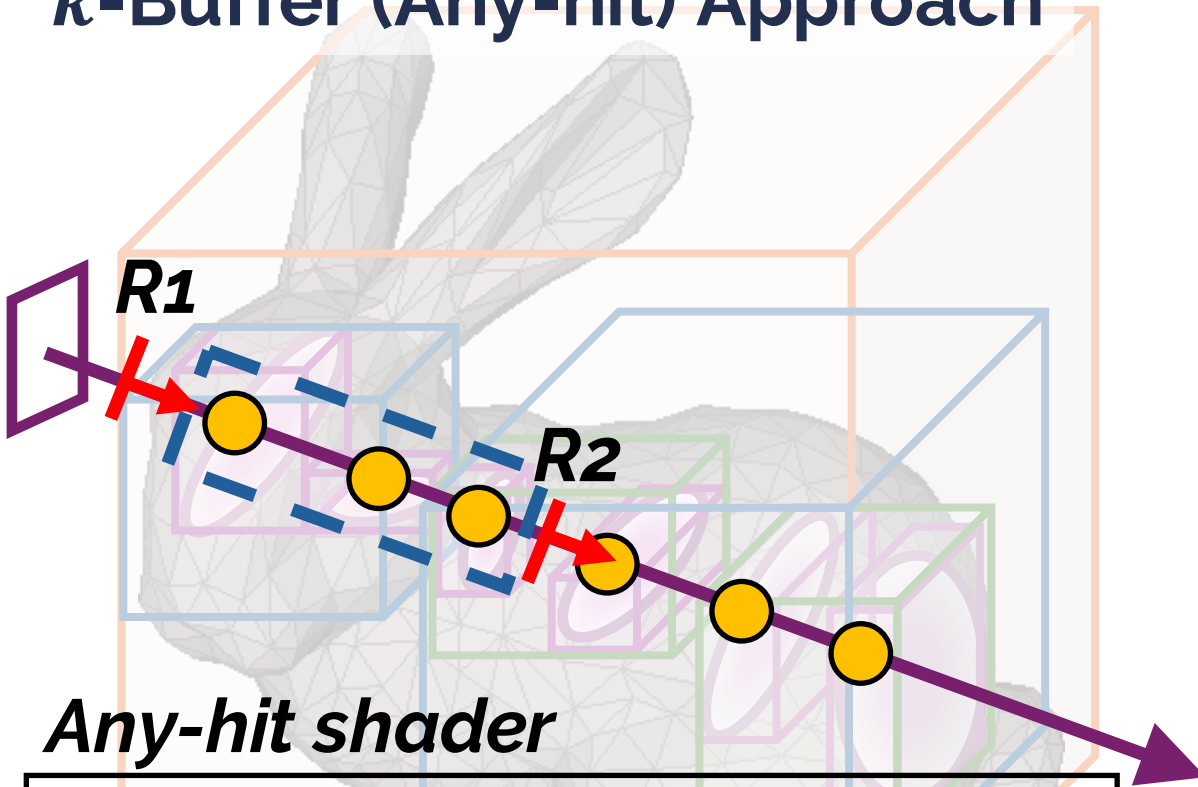
1 → **2** → **3**

$R2$

4 → **5** → **6**

Gaussian RT Optimizations & Limitations

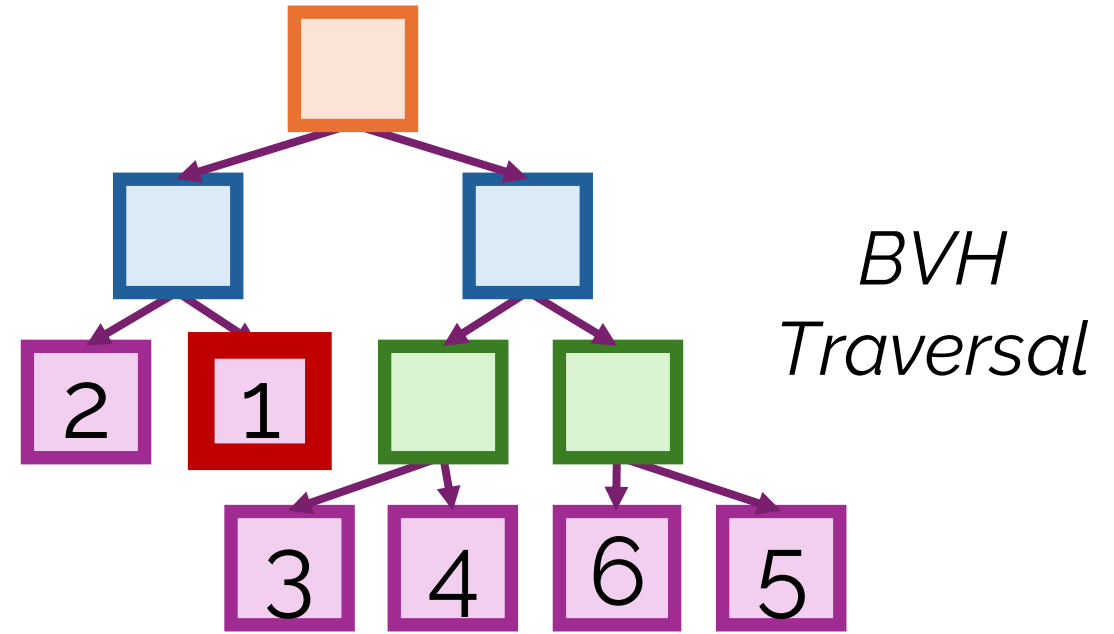
k -Buffer (Any-hit) Approach



Any-hit shader

Ray 1	1	2	3
Gaus. ID	1	2	
Distance	1.4	3.7	

k -buffer ($k = 3$)



BVH Traversal

Front-to-Back Order

1 → **2** → **3** → **4** → **5** → **6**

$R1$

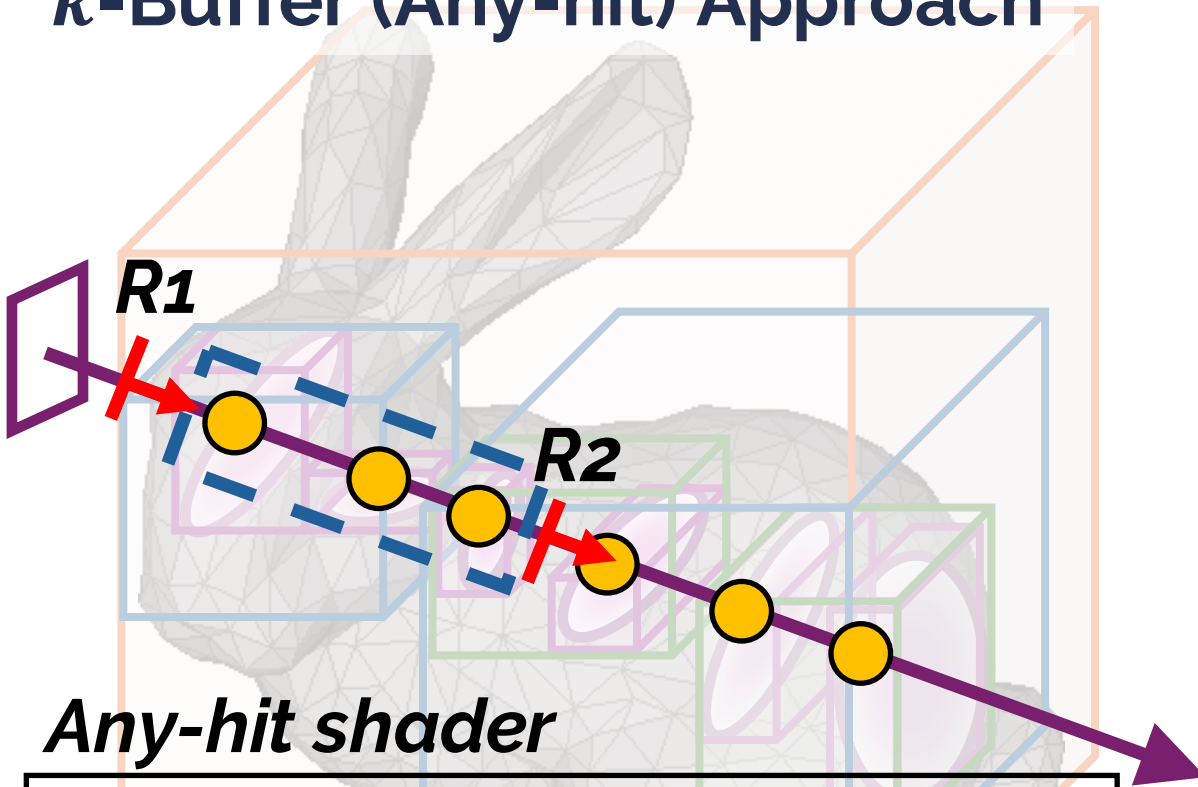
1 → **2** → **3**

$R2$

4 → **5** → **6**

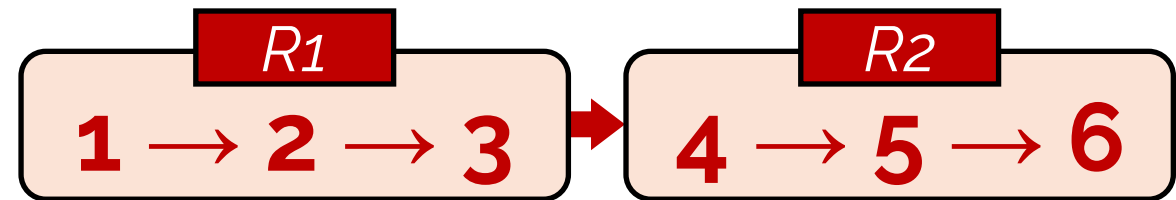
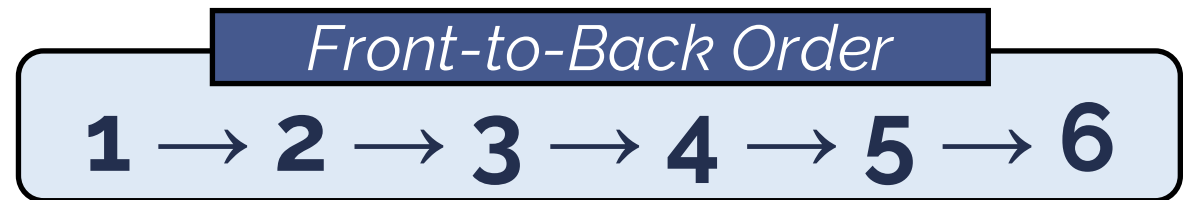
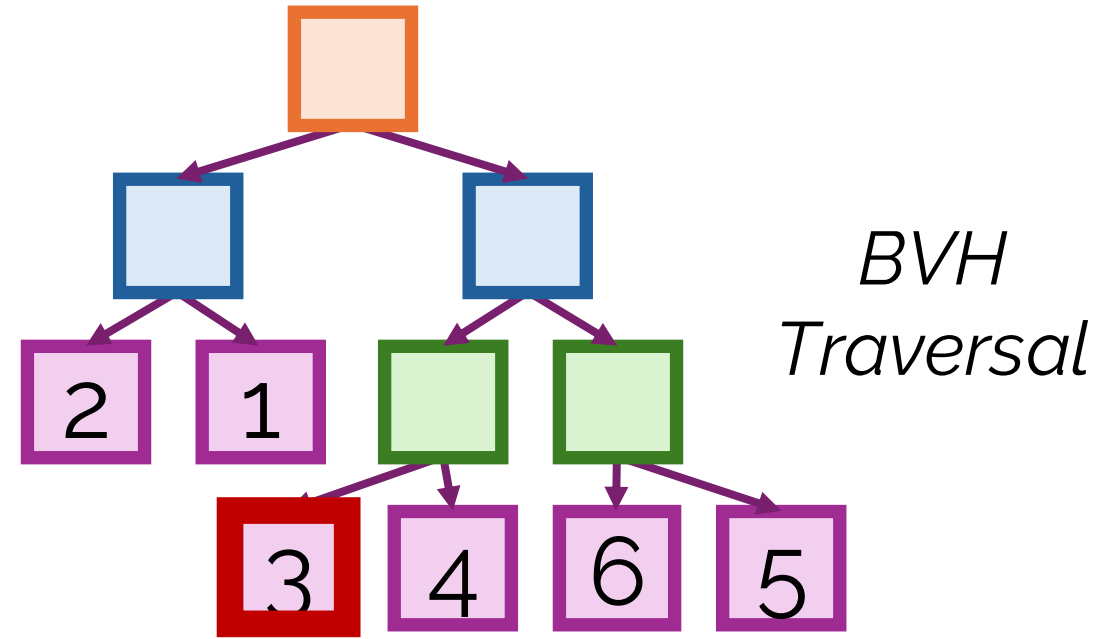
Gaussian RT Optimizations & Limitations

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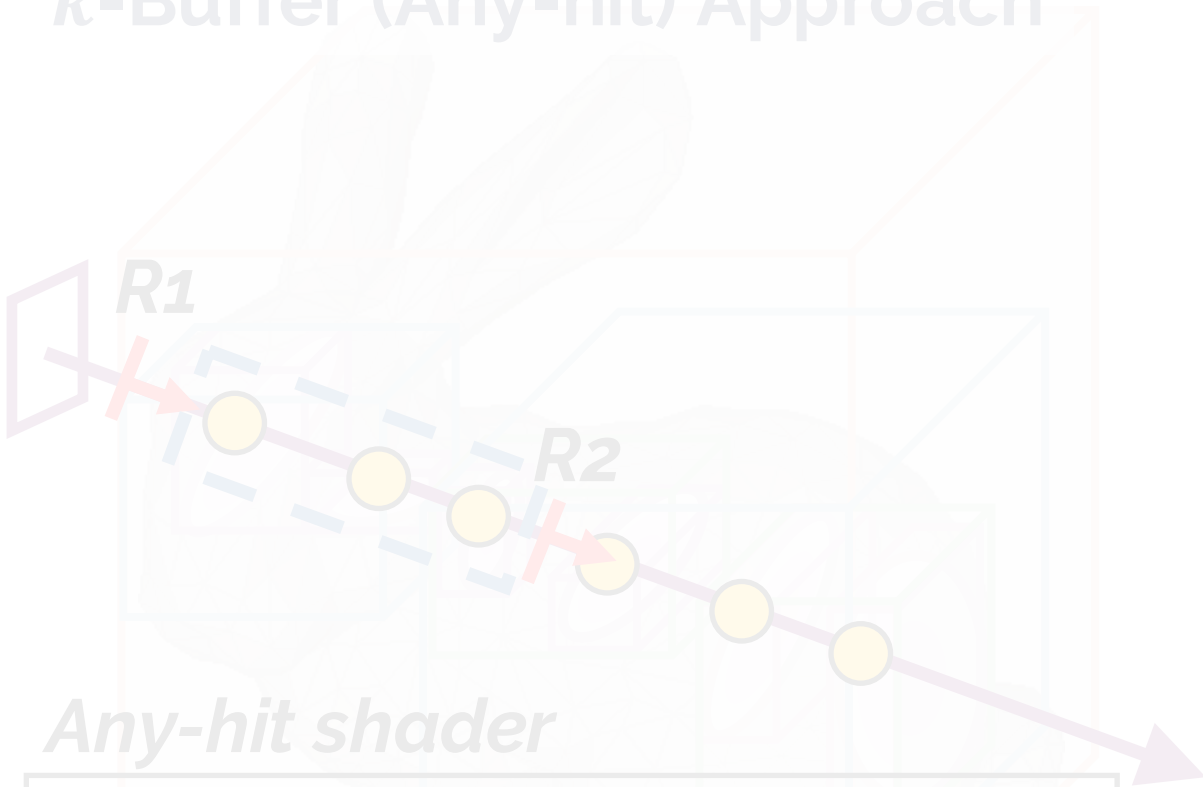
Ray 1	1	2	3
Gaus. ID	1	2	3
Distance	1.4	3.7	5.2

k -buffer ($k = 3$)



Gaussian RT Optimizations & Limitations

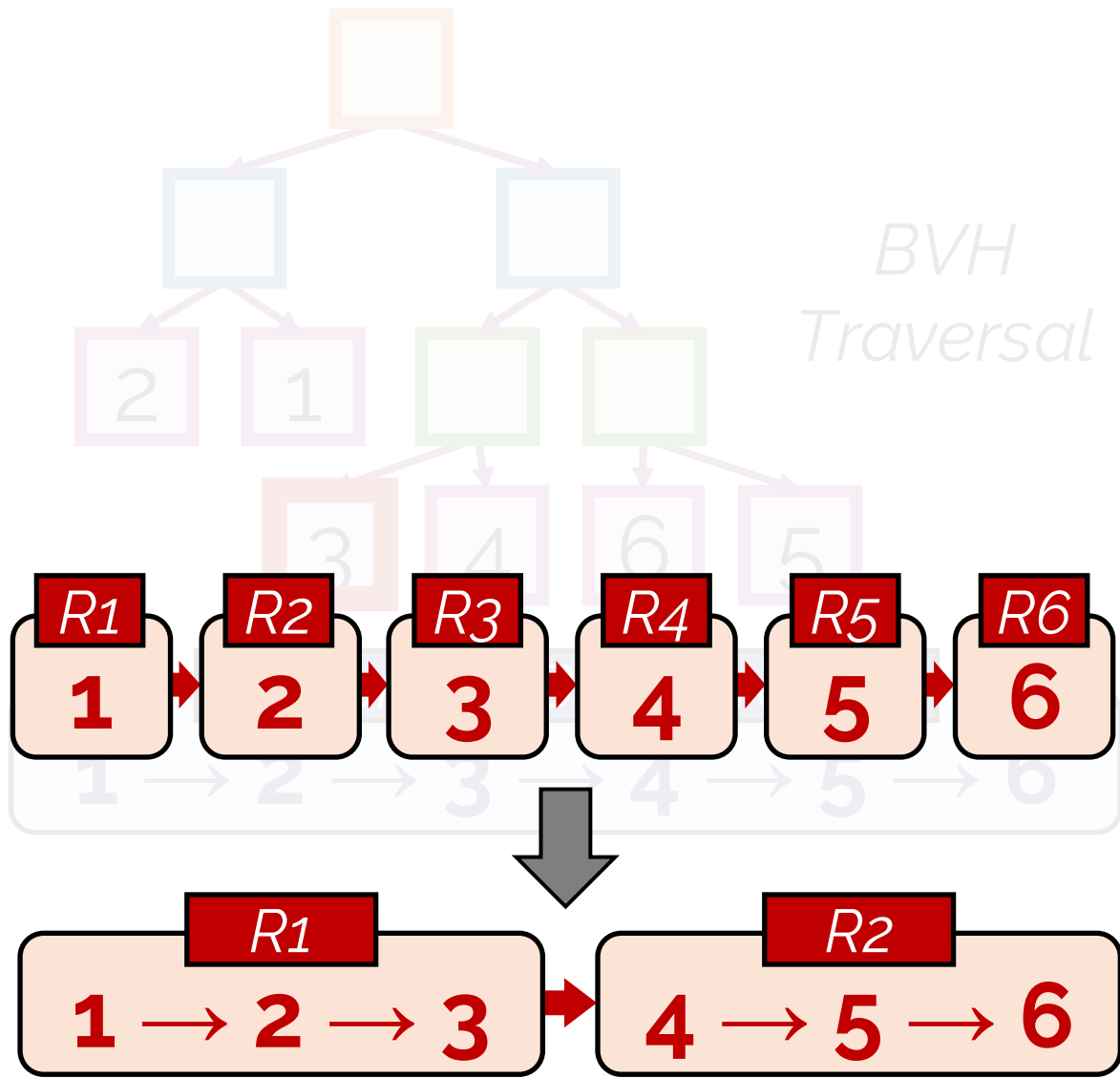
k-Buffer (Any-hit) Approach



Any-hit shader

Ray 1	1	2	3
Gaus. ID	1	2	3
Distance	1.4	3.7	5.2

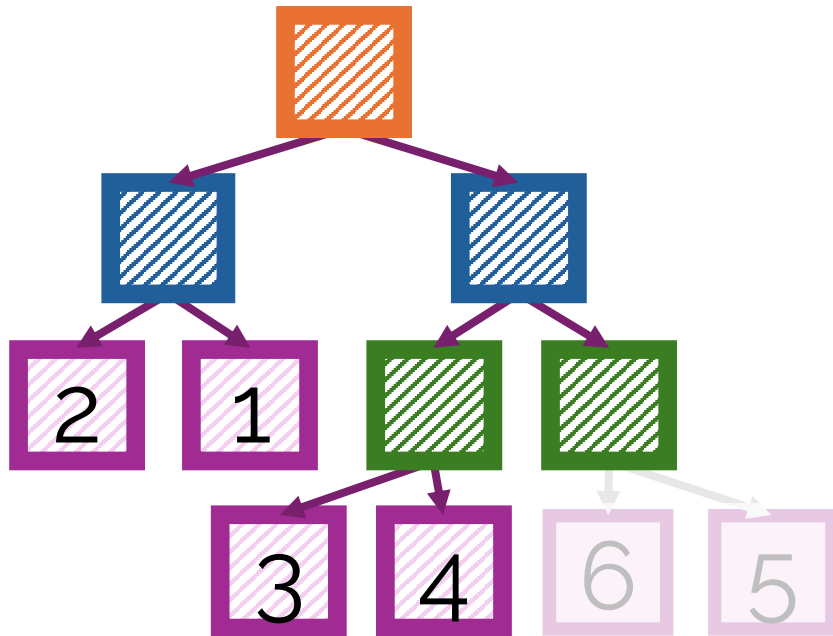
k-buffer (*k* = 3)



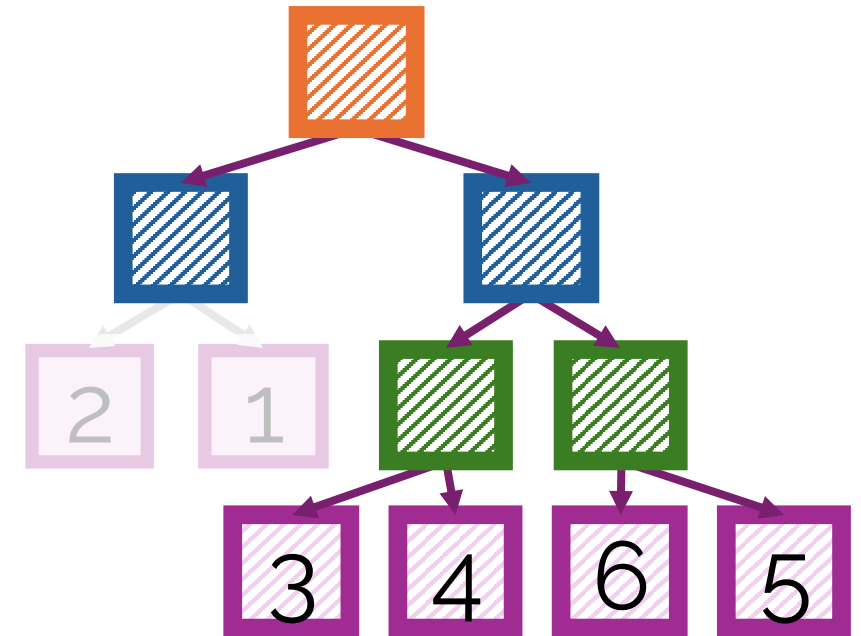
Gaussian RT Optimizations & Limitations

k -Buffer (Any-hit) Approach

Round 1

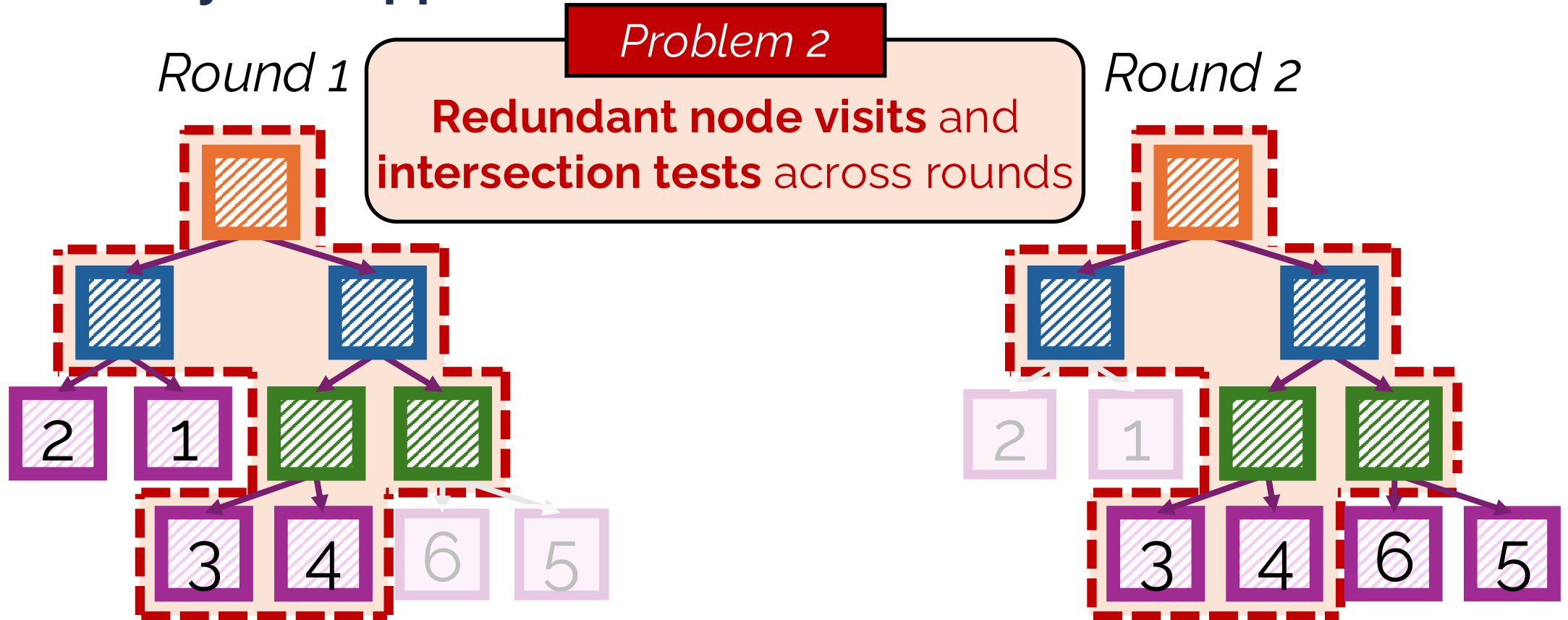


Round 2



Gaussian RT Optimizations & Limitations

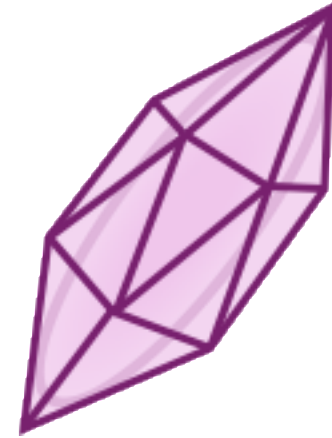
k-Buffer (Any-hit) Approach



Gaussian RT Optimizations & Limitations

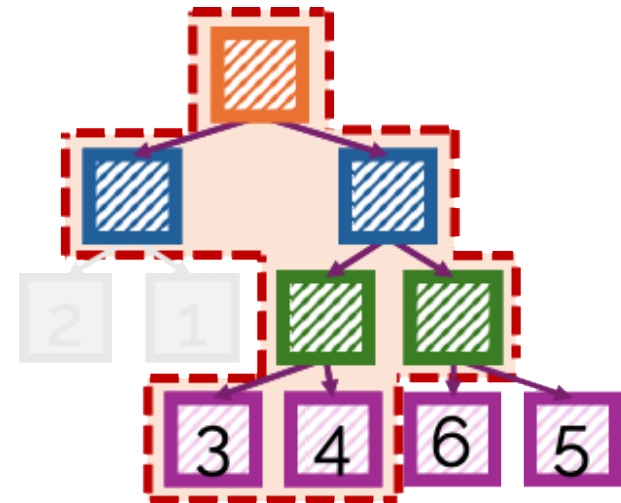
Problem 1

Bloated BVH size and increased memory footprint



Problem 2

Redundant node visit and intersection tests across rounds



Outline

- **Background**

- 3D Gaussian-based Rendering: Rasterization vs. Ray-tracing
- Ray Tracing Accelerators in Modern GPUs

- **Gaussian RT Optimizations & Limitations**

- **GRTX: SW-HW Optimizations for Gaussian Ray Tracing**

- GRTX-SW: Two-Level Acceleration Structure for Gaussian Primitives
- GRTX-HW: HW Extension for Traversal Checkpointing and Replay

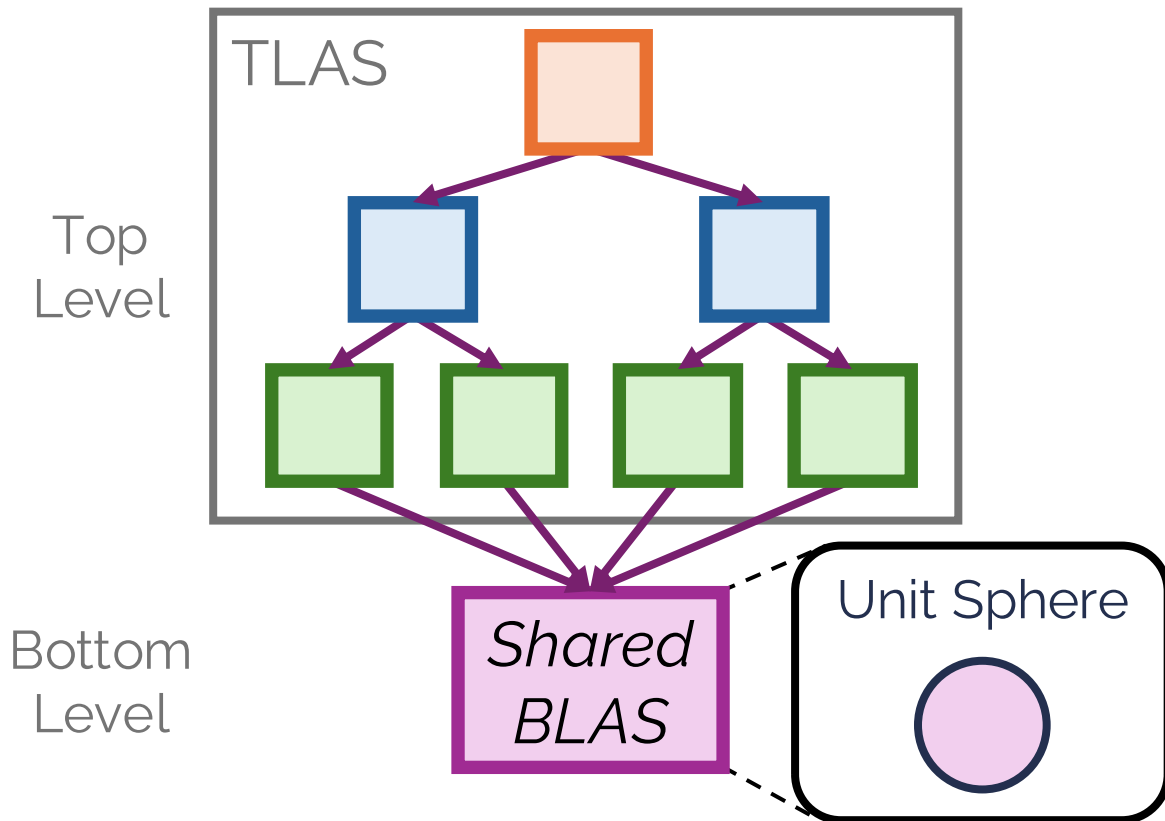
- **Evaluation**

- **Conclusion**

GRTX Overview

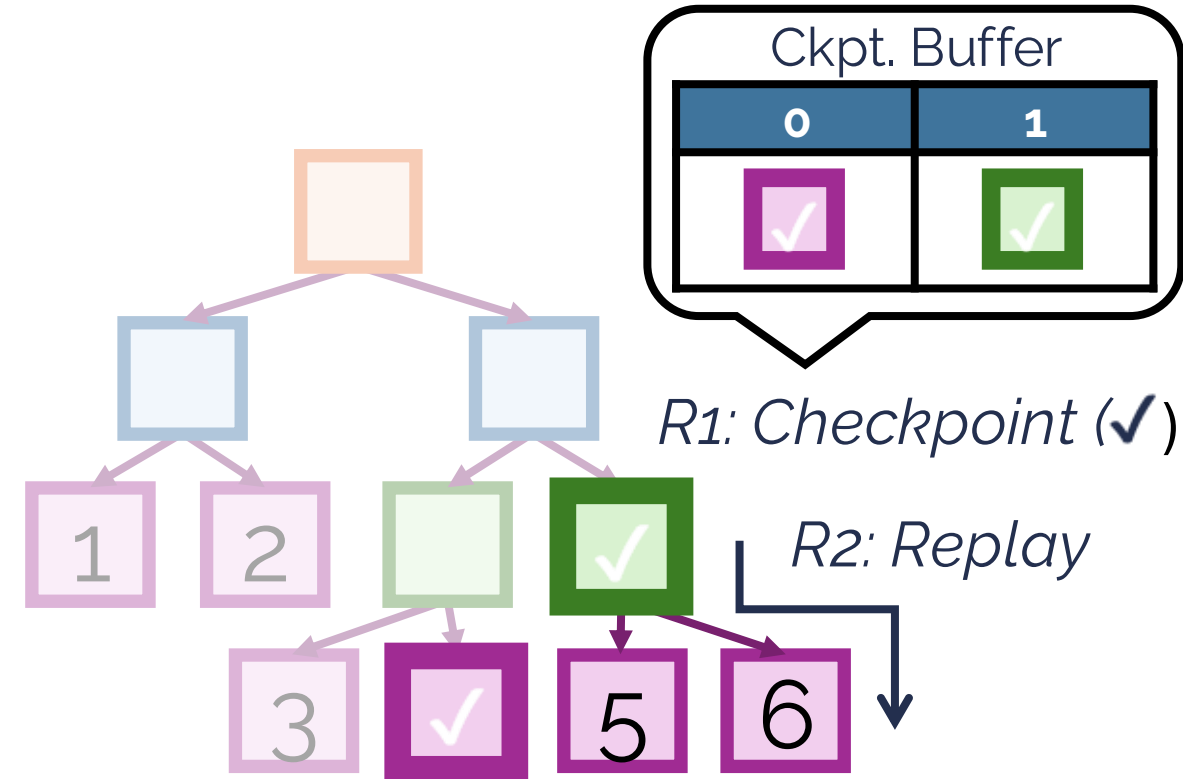
GRTX-SW

Two-level BVH with
a **single shared BLAS** for Gaussian



GRTX-HW

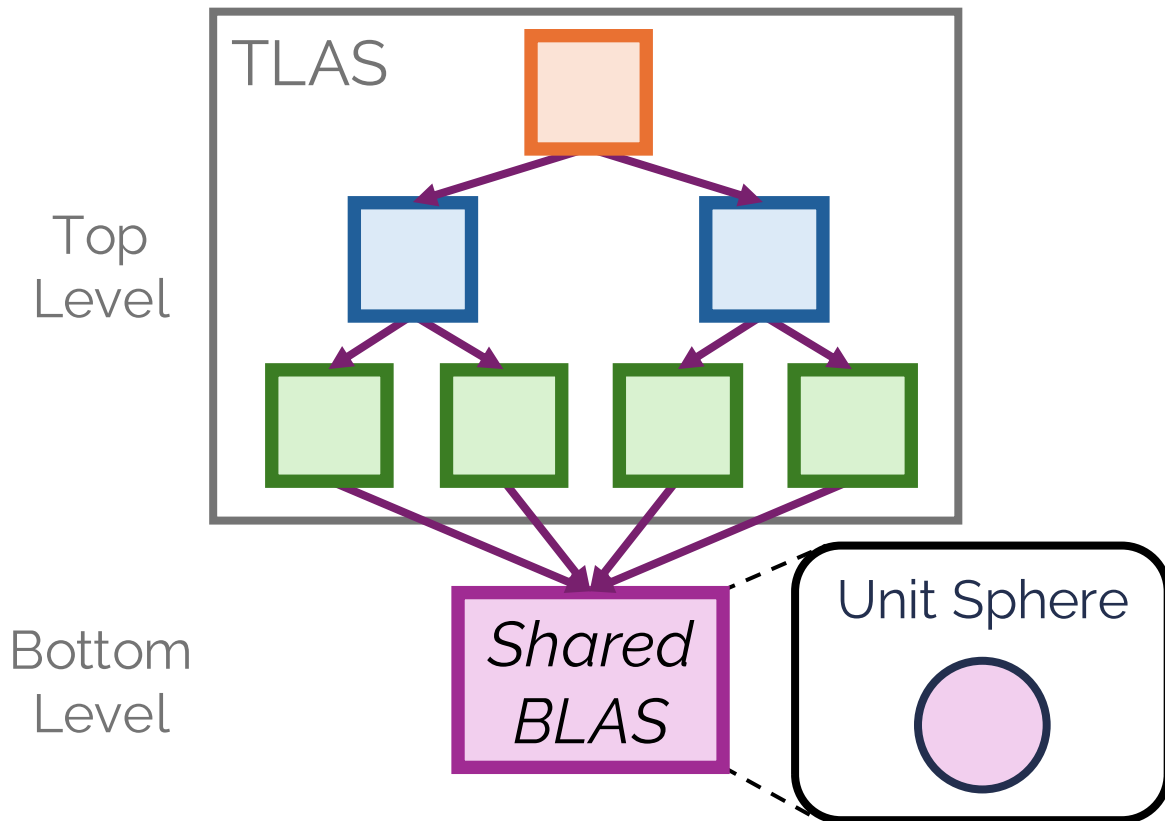
Hardware extension for
traversal checkpointing & replay



GRTX Overview

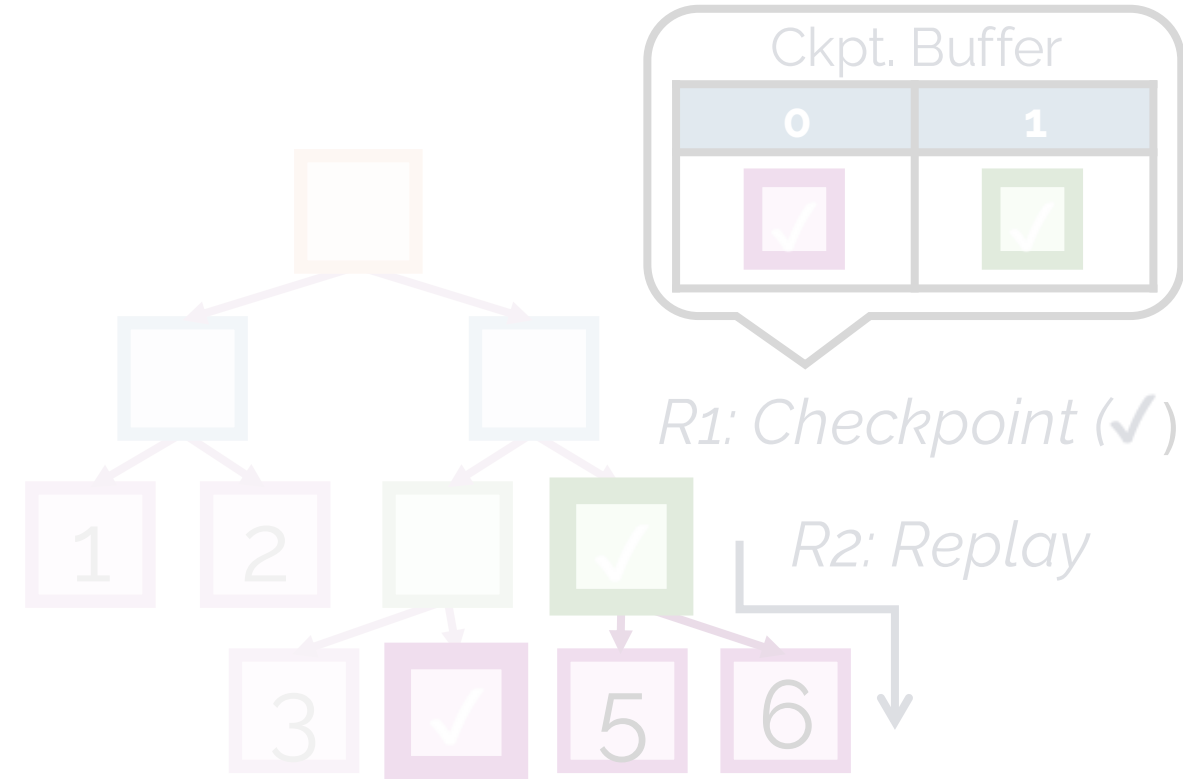
GRTX-SW

Two-level BVH with
a **single shared BLAS** for Gaussian



GRTX-HW

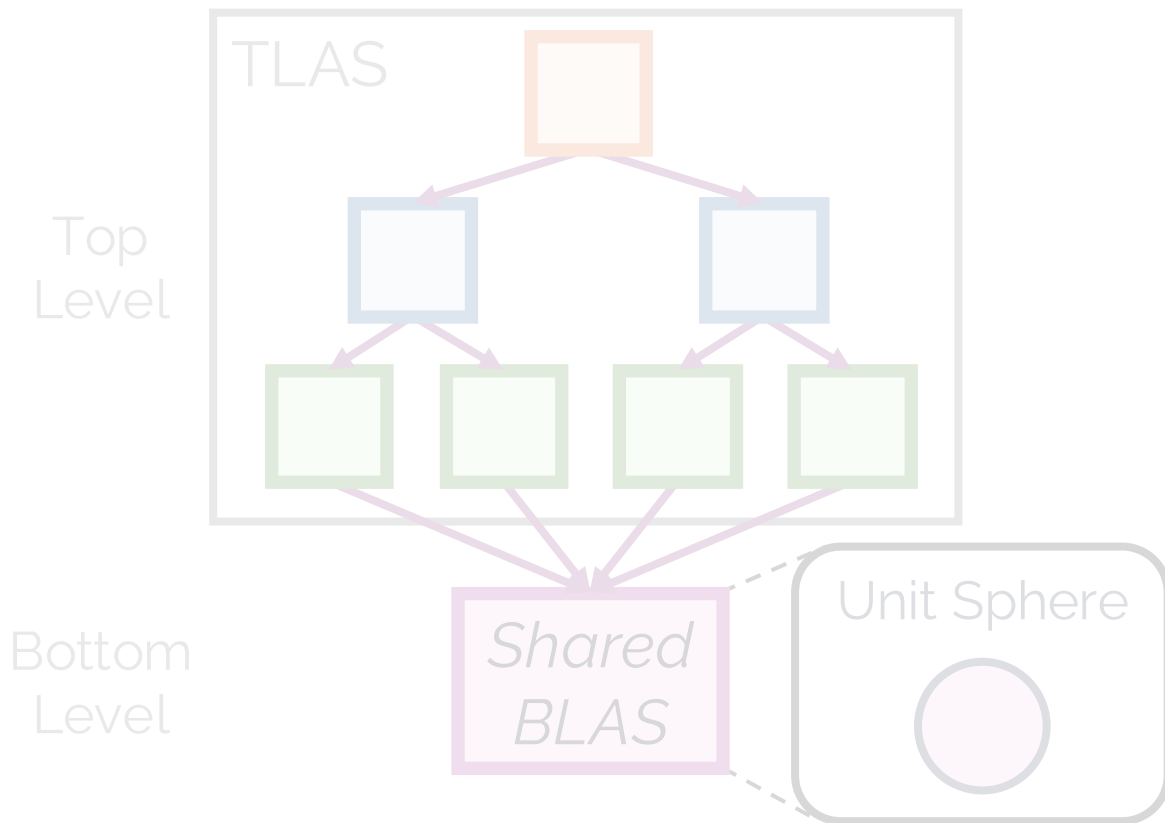
Hardware extension for
traversal checkpointing & replay



GRTX Overview

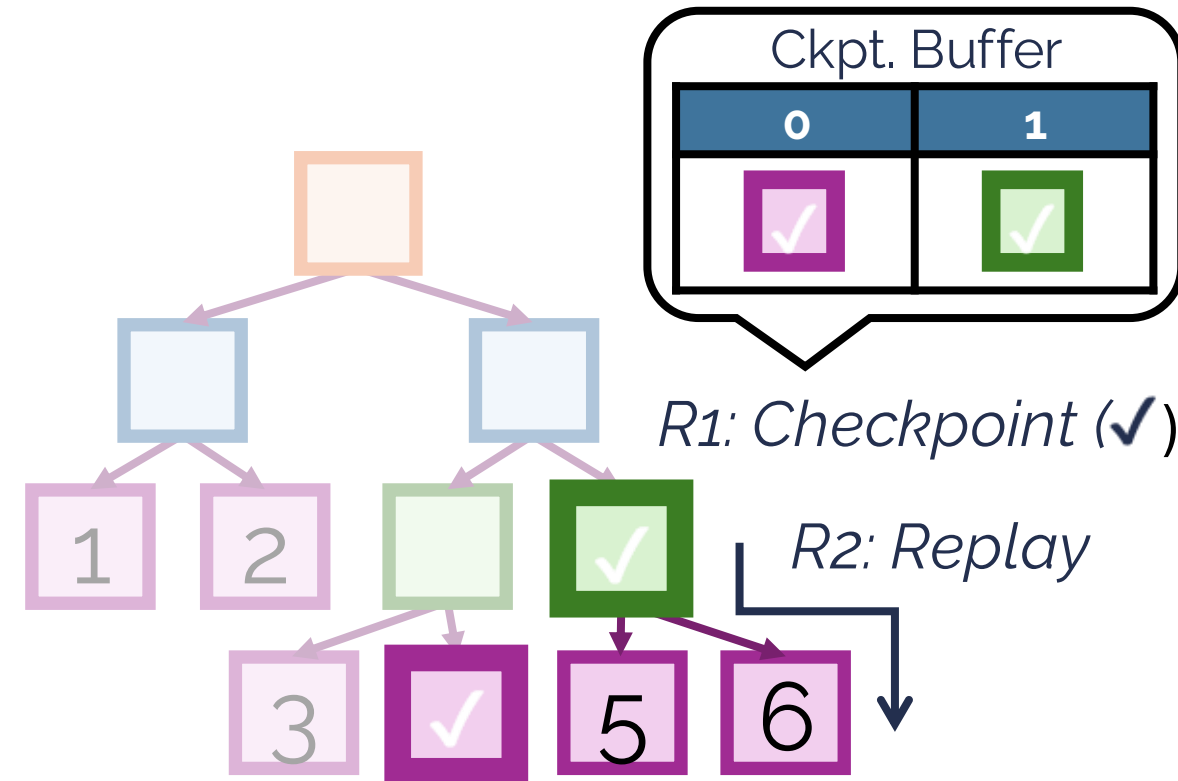
GRTX-SW

Two-level BVH with
a **single shared BLAS** for Gaussian



GRTX-HW

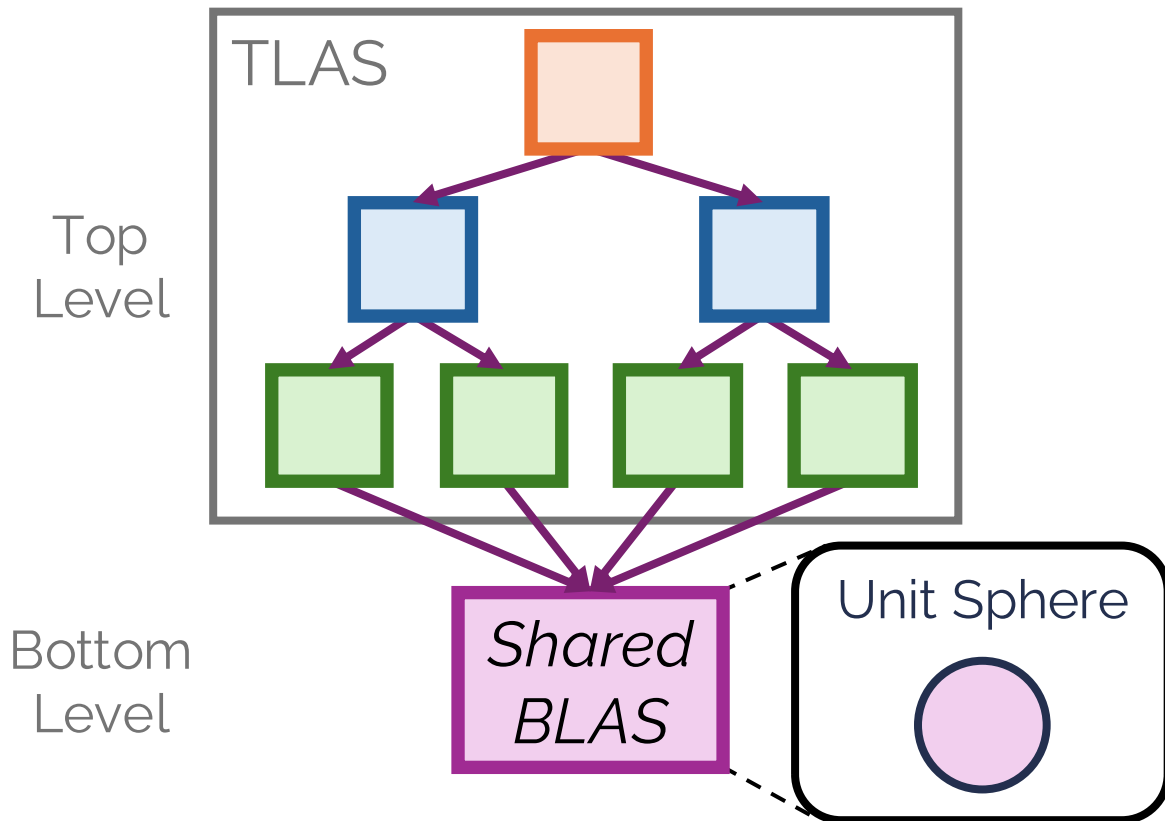
Hardware extension for
traversal checkpointing & replay



GRTX Overview

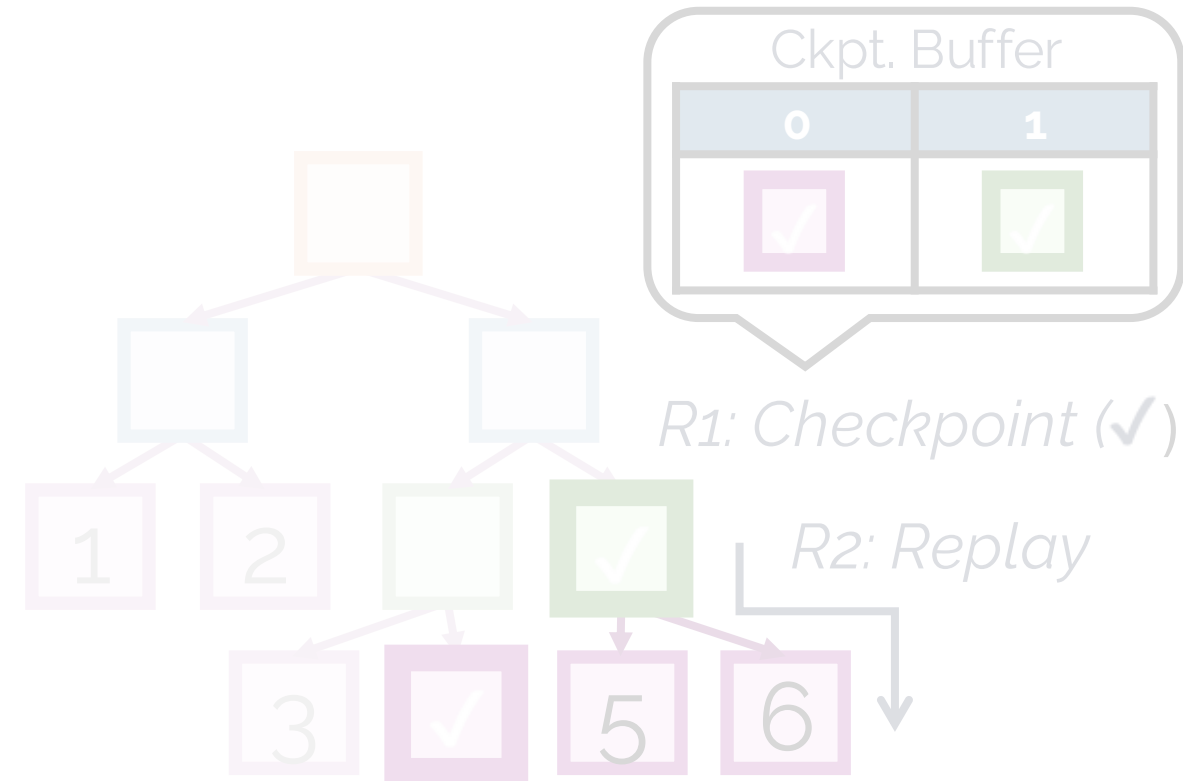
GRTX-SW

Two-level BVH with
a **single shared BLAS** for Gaussian

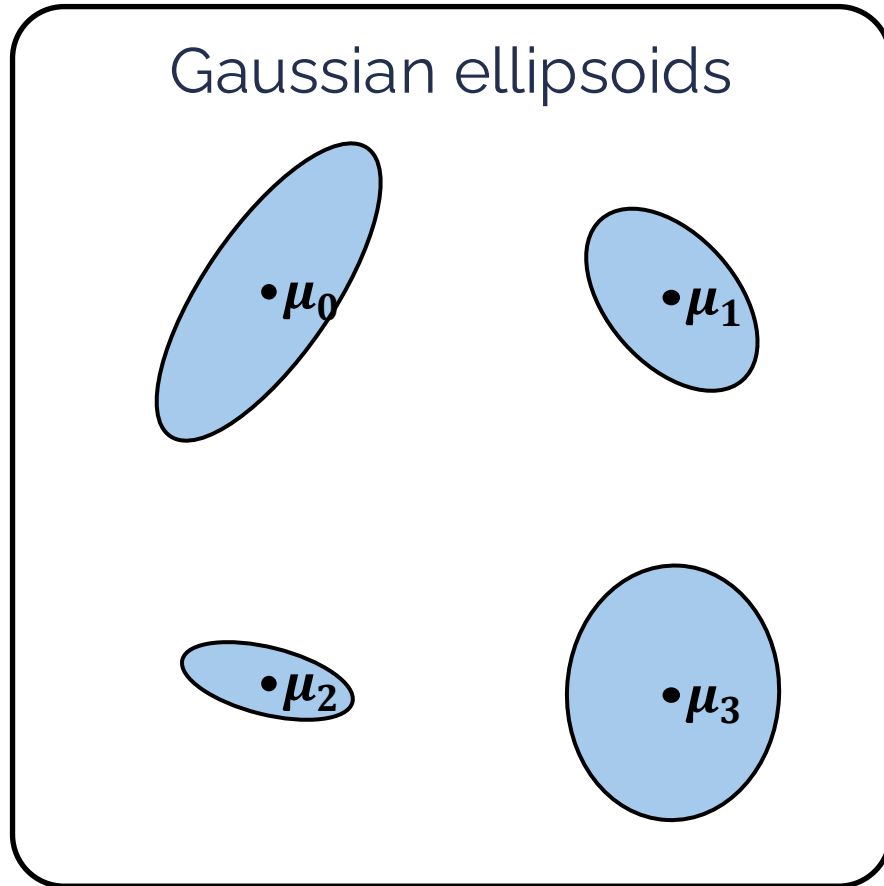


GRTX-HW

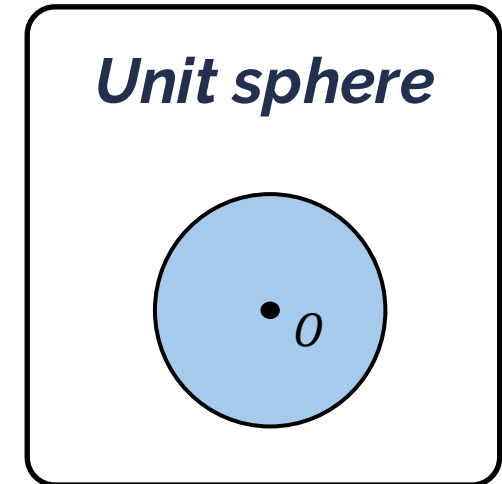
Hardware extension for
traversal checkpointing & replay



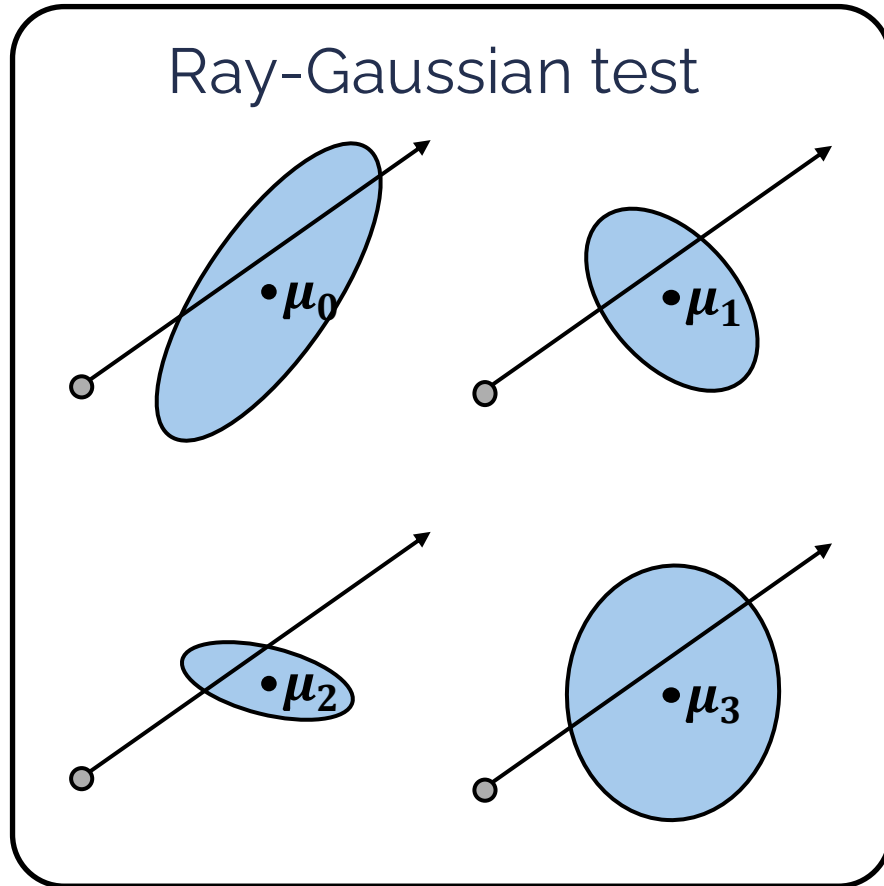
GRTX-SW: Key Insight




× Rotation R_i
× Scaling S_i



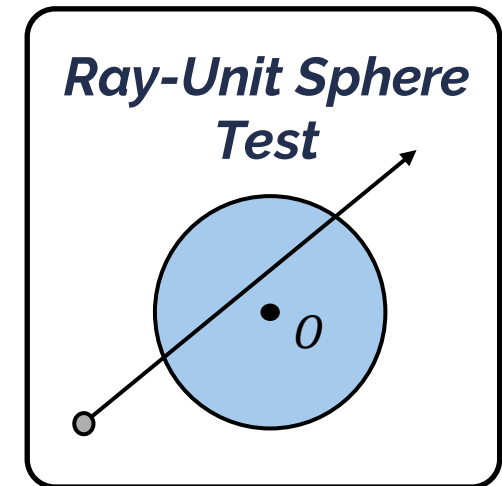
GRTX-SW: Key Insight



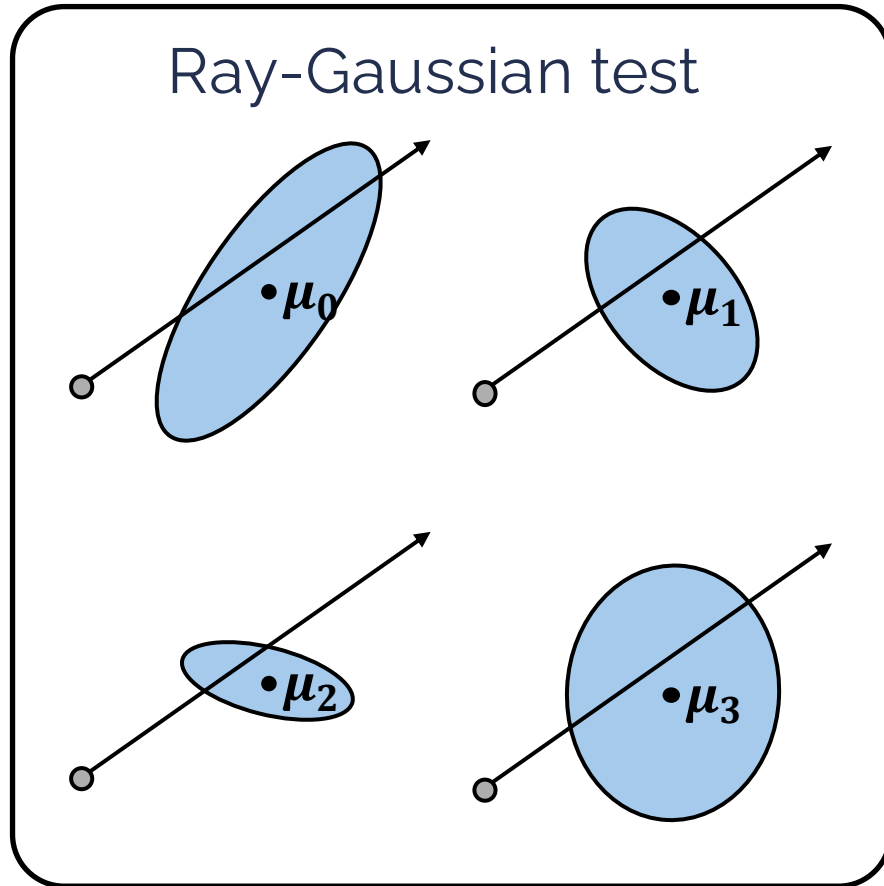
**Ray
Transforms**



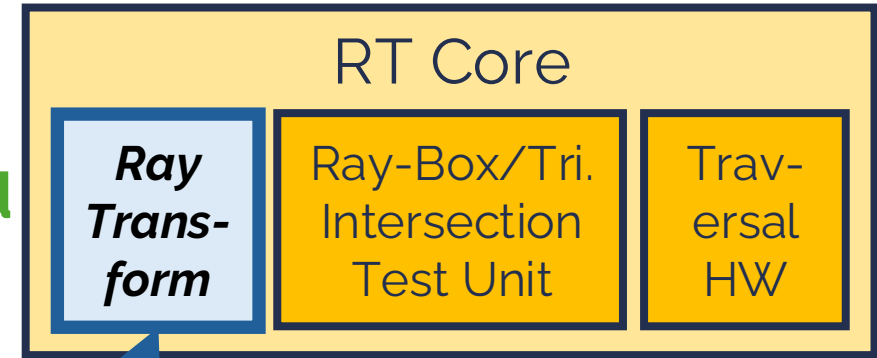
$\times (\mathbf{R}_i \cdot \mathbf{S}_i)$



GRTX-SW: Key Insight



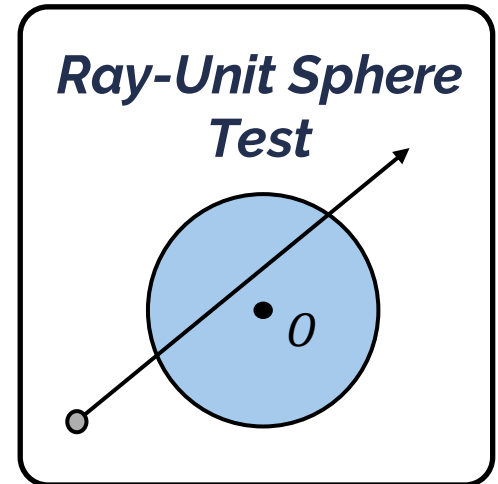
HW-Supported
😊



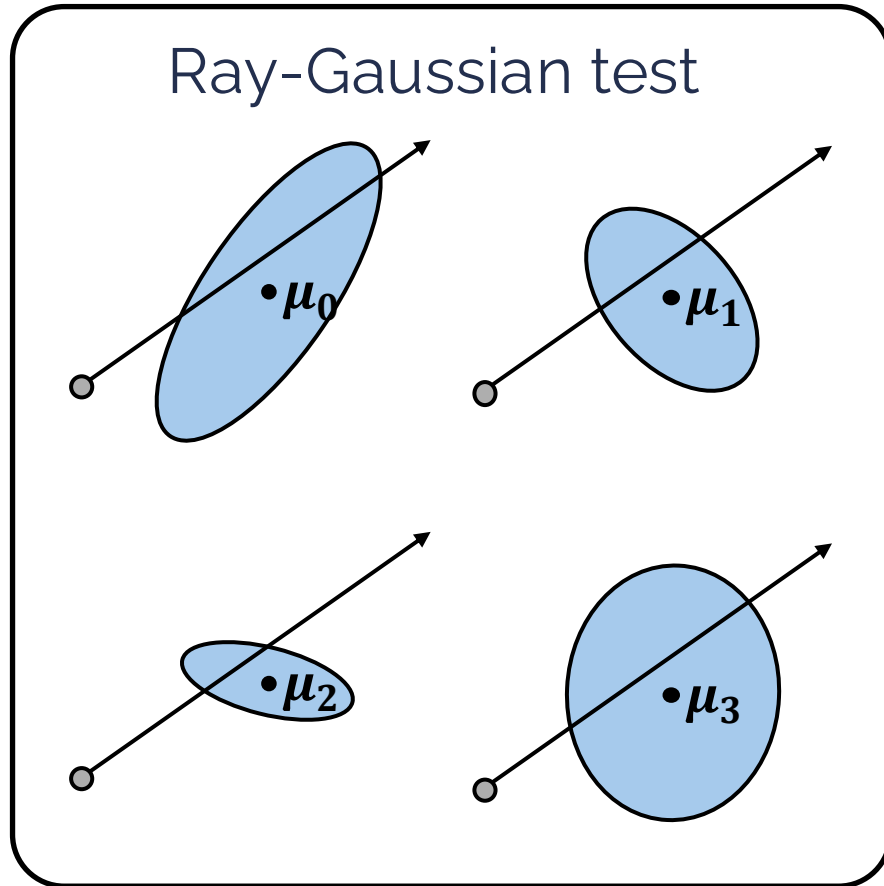
Ray
Transforms



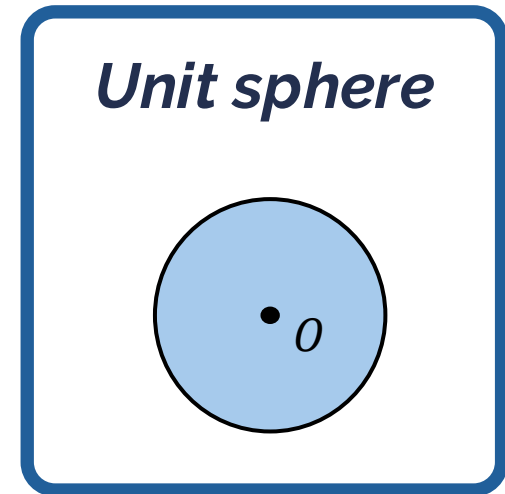
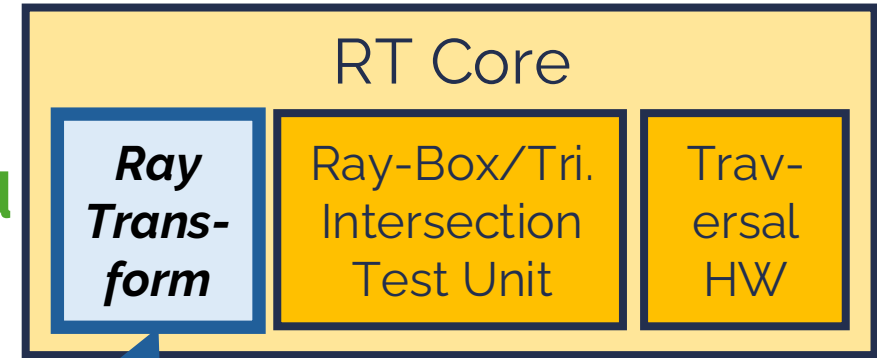
$$\times (\mathbf{R}_i \cdot \mathbf{S}_i)$$



GRTX-SW: Key Insight



HW-Supported
😊



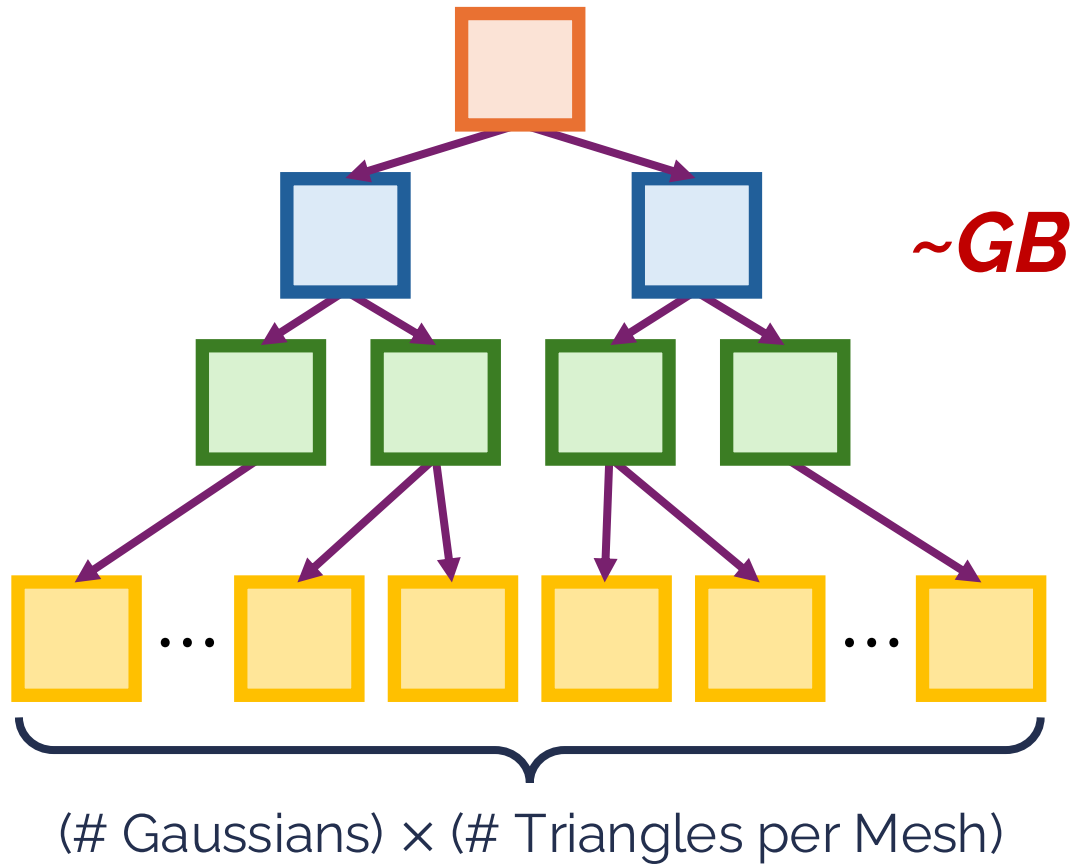
$$\times (\mathbf{R}_i \cdot \mathbf{S}_i)$$

Idea

Use only **one shared BLAS**
across all Gaussians

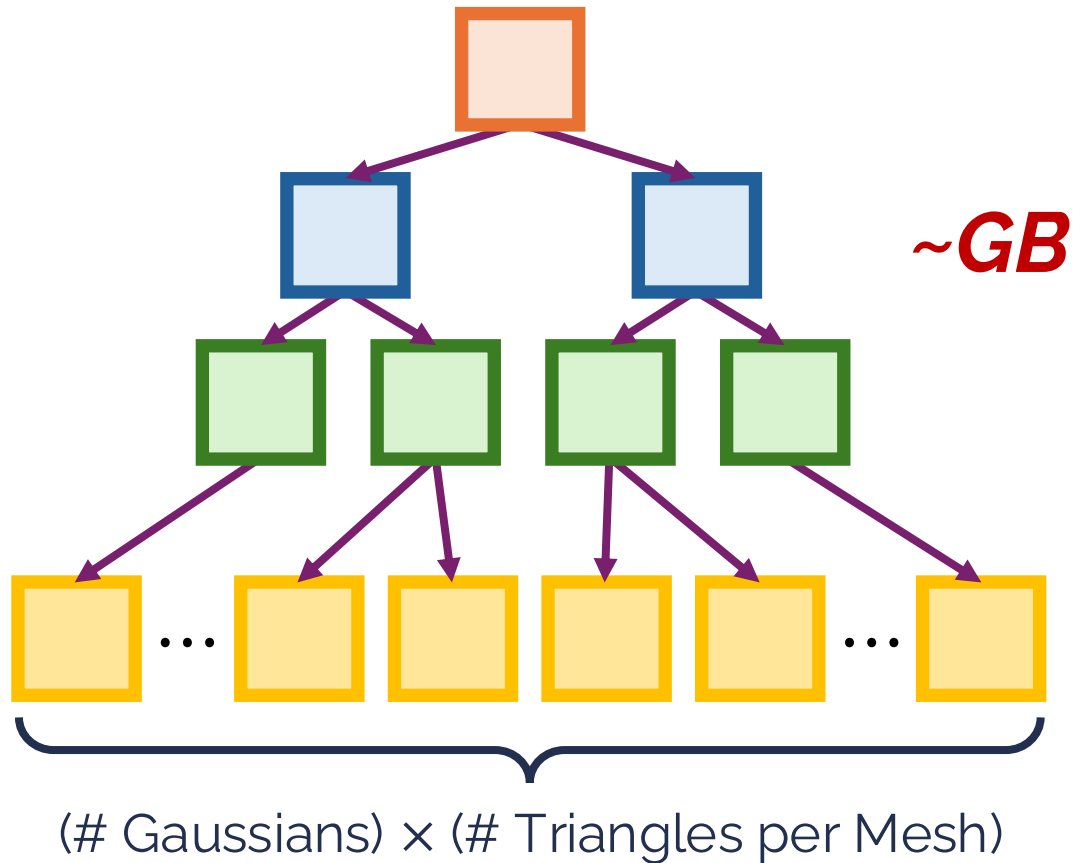
GRTX-SW: Two-Level BVH with a Shared BLAS

Prior Approaches

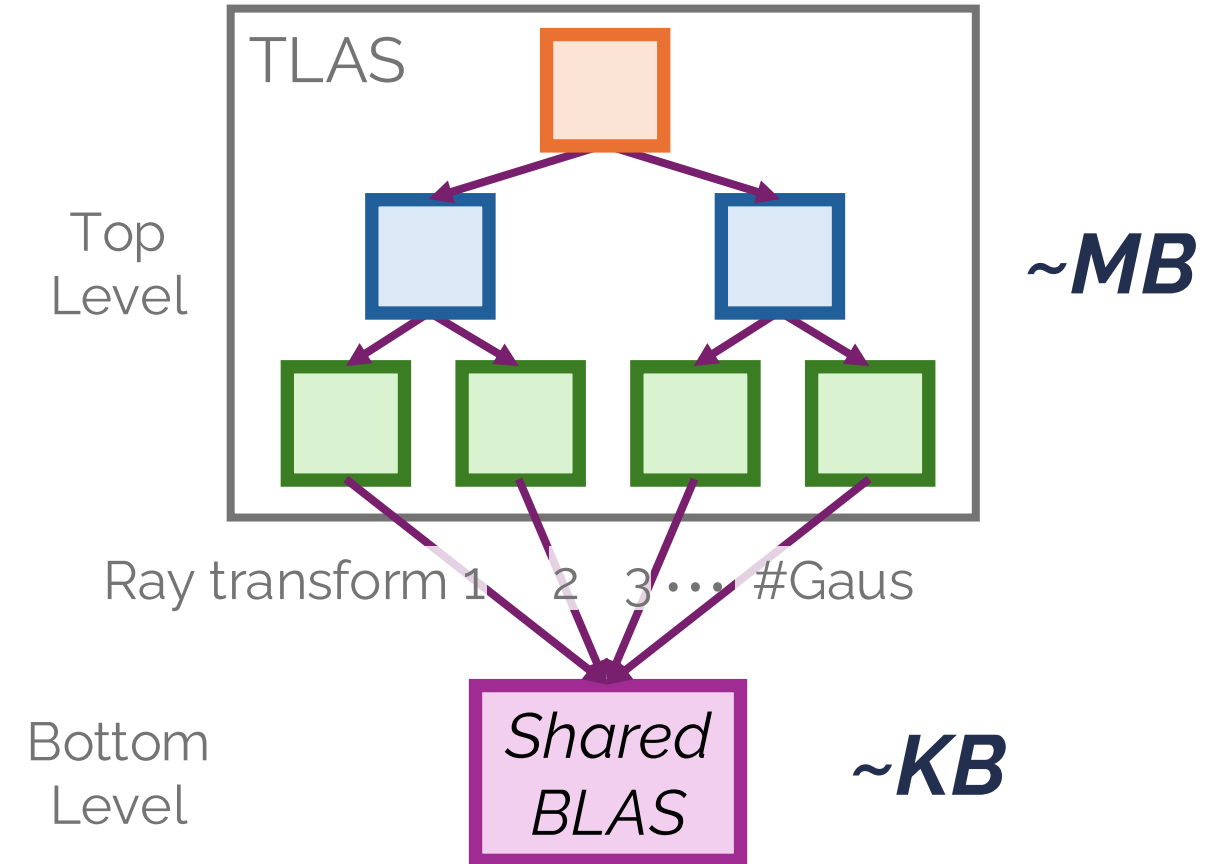


GRTX-SW: Two-Level BVH with a Shared BLAS

Prior Approaches

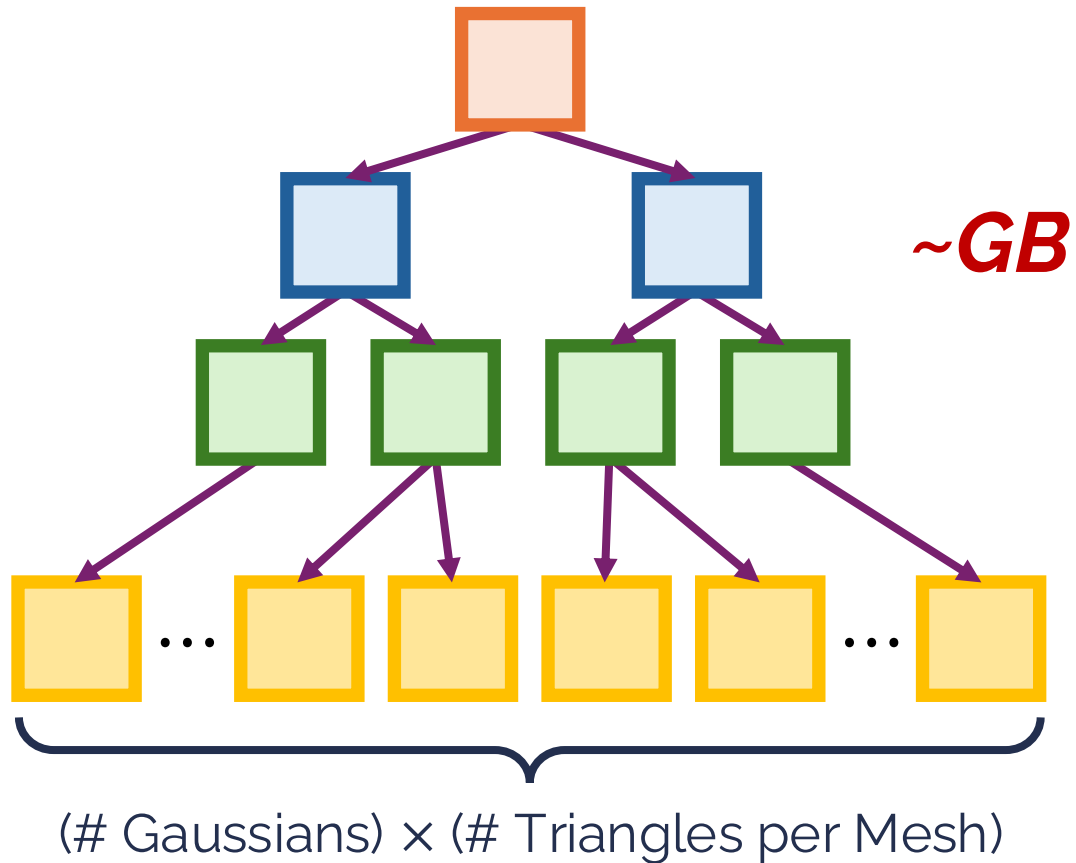


GRTX-SW

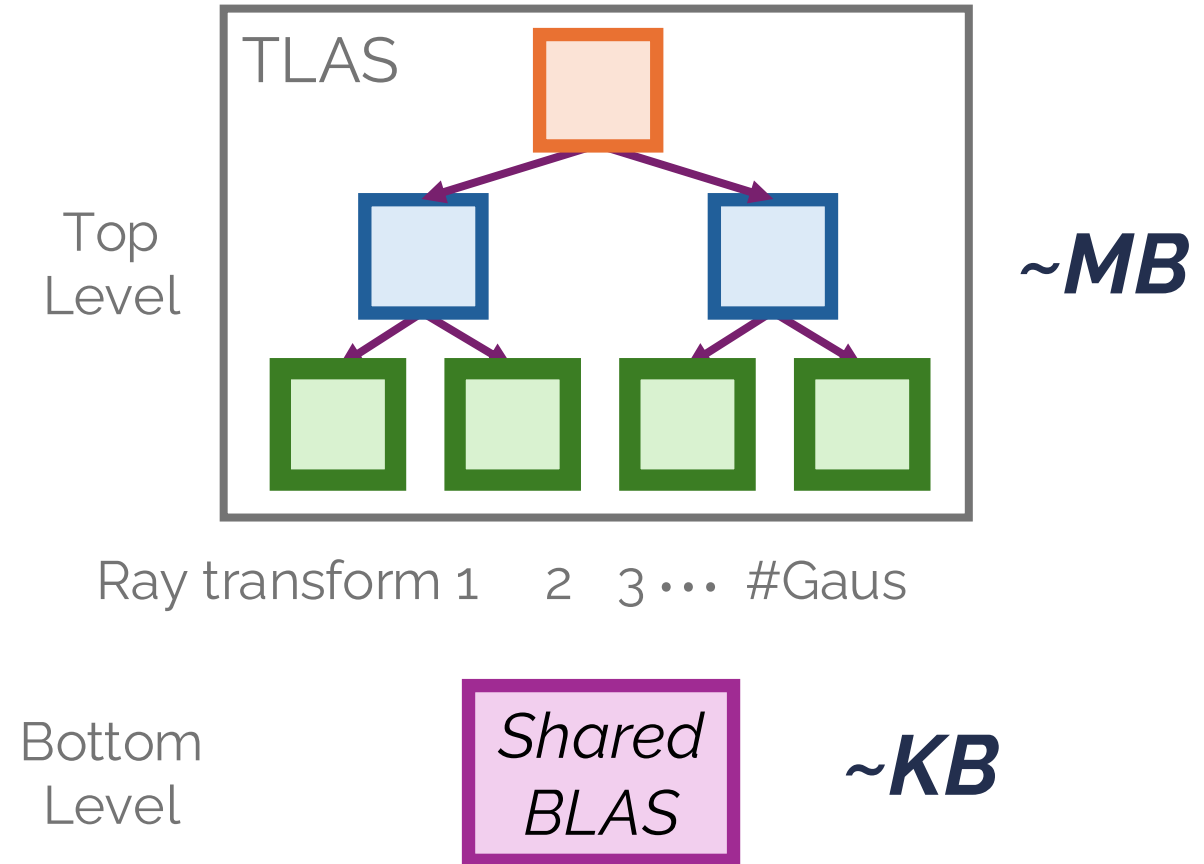


GRTX-SW: Two-Level BVH with a Shared BLAS

Prior Approaches

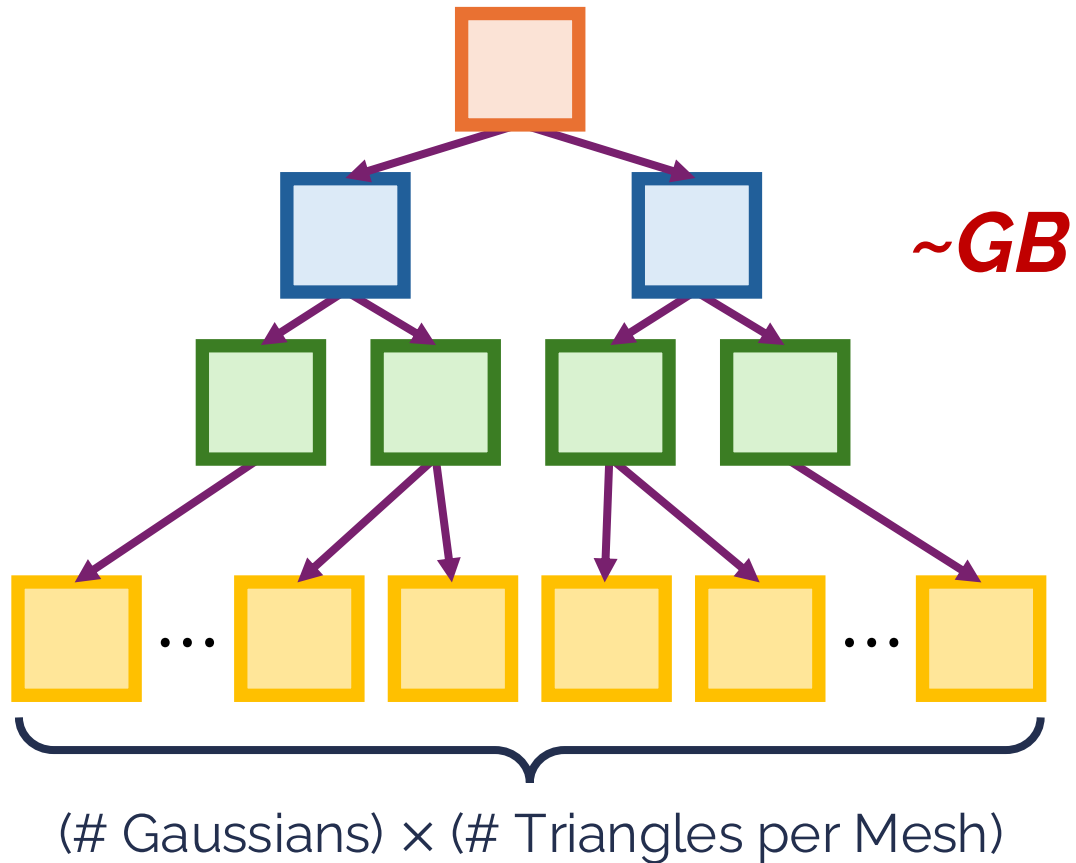


GRTX-SW

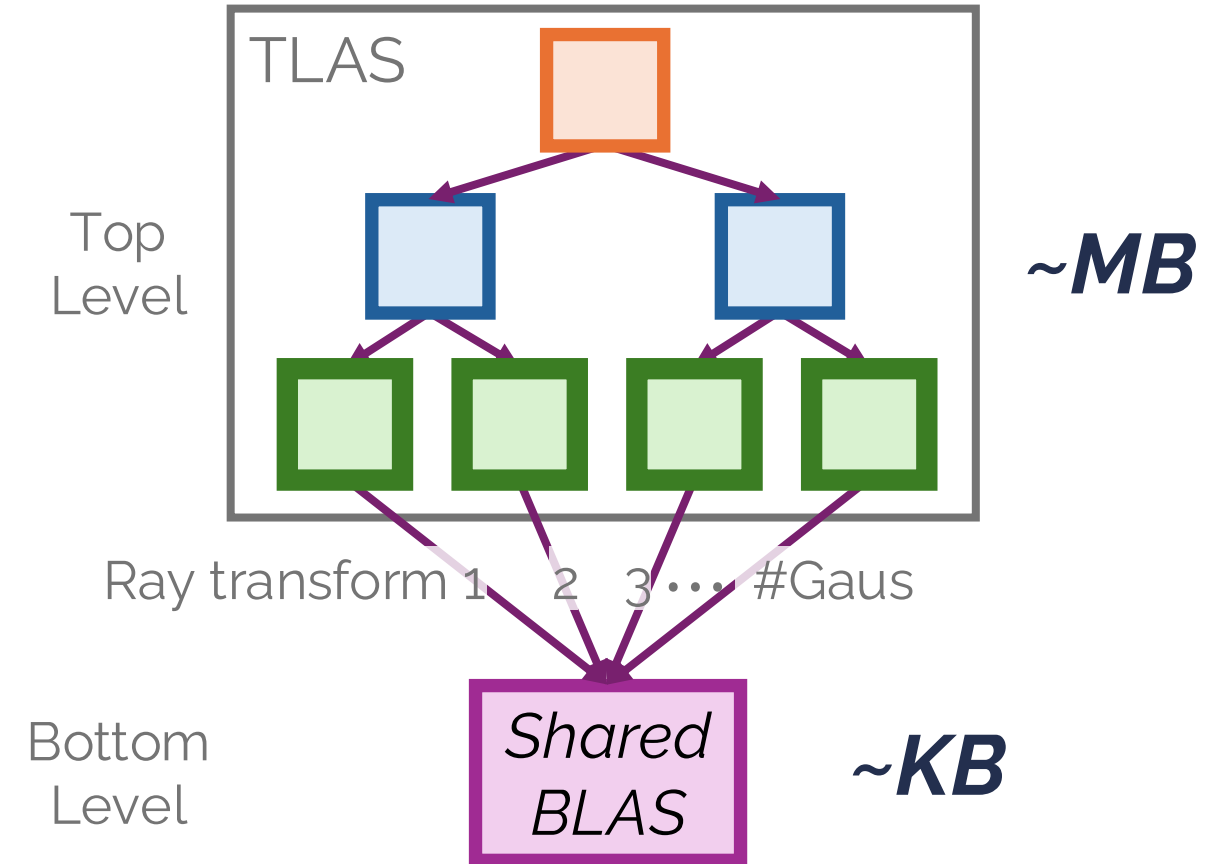


GRTX-SW: Two-Level BVH with a Shared BLAS

Prior Approaches



GRTX-SW



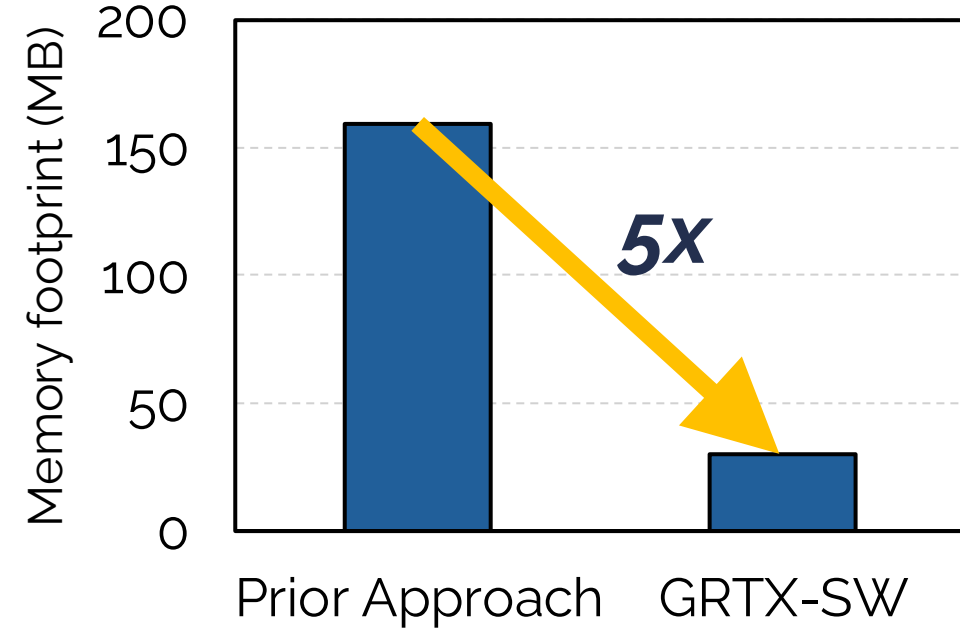
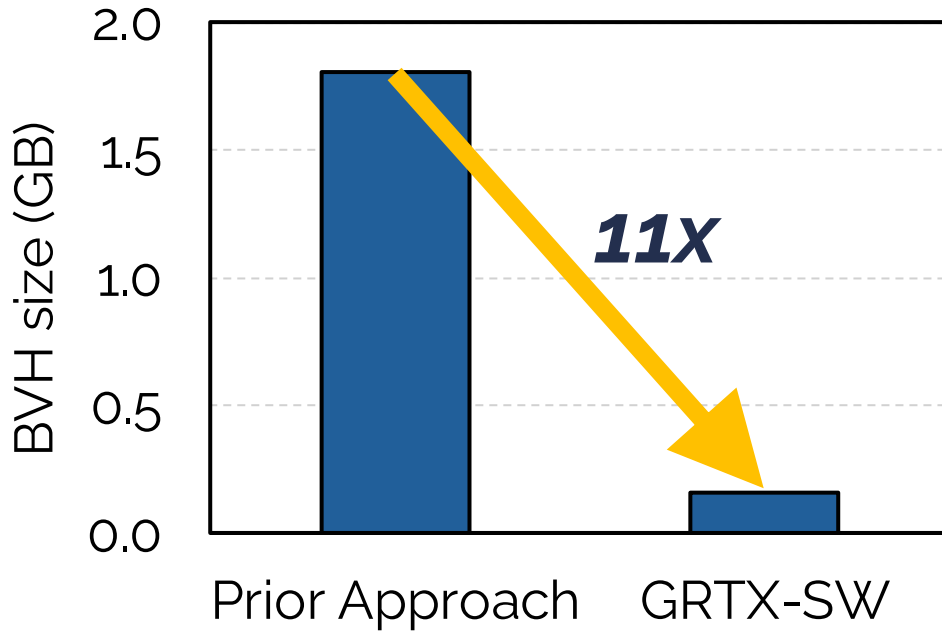
GRTX-SW: Two-Level BVH with a Shared BLAS

Prior Approaches

GRTX-SW

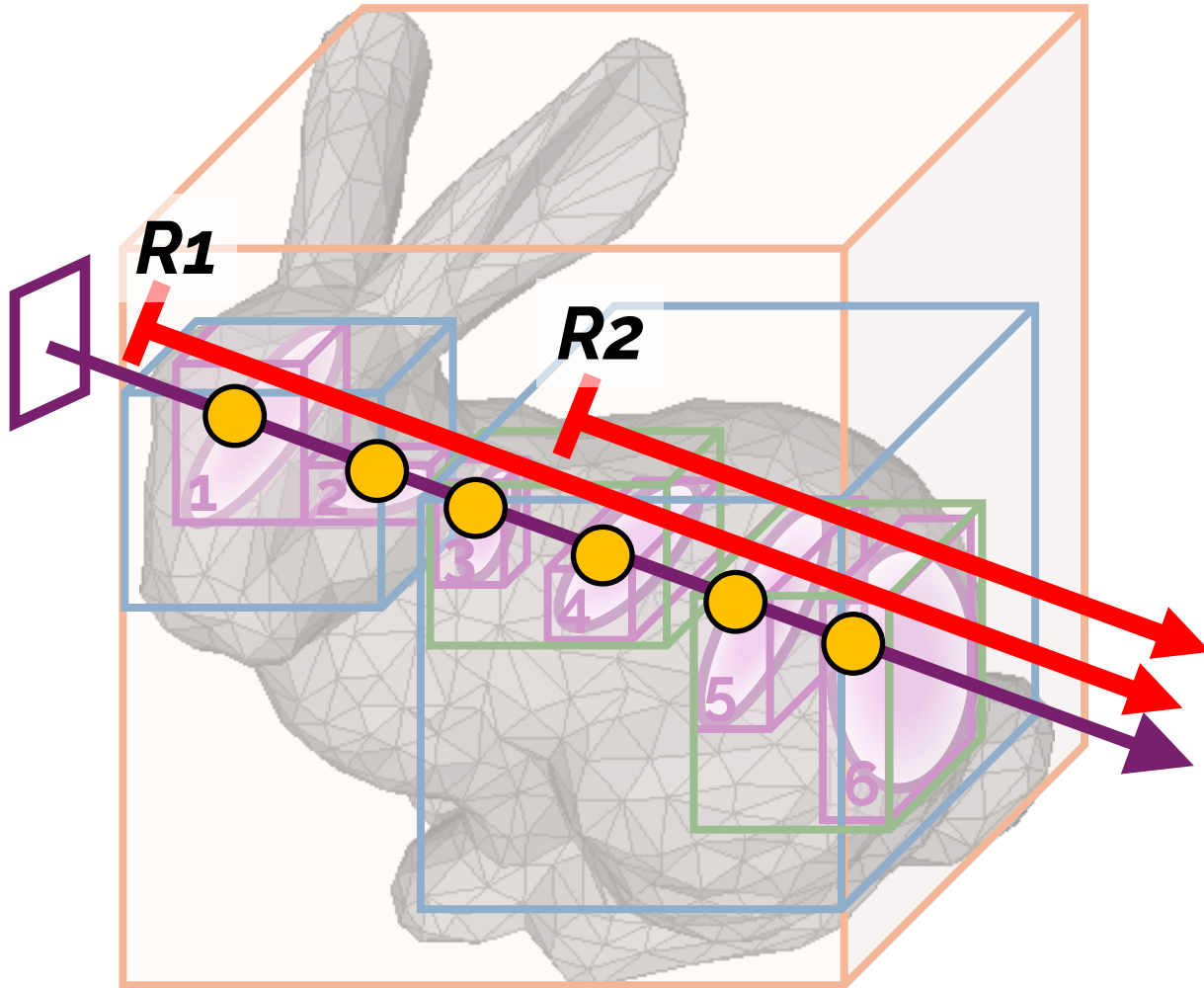
Advantage

Reduce BVH size & BVH memory footprint

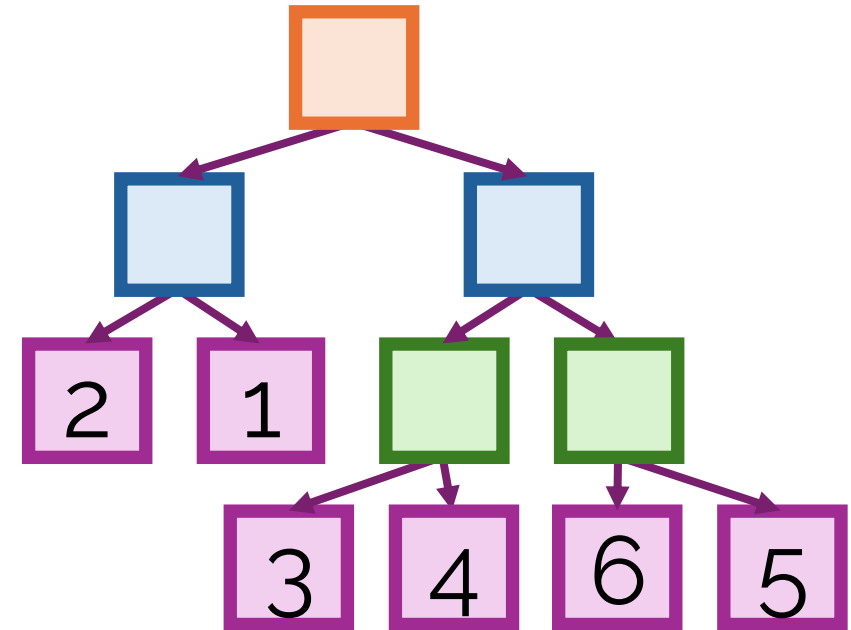


~MB

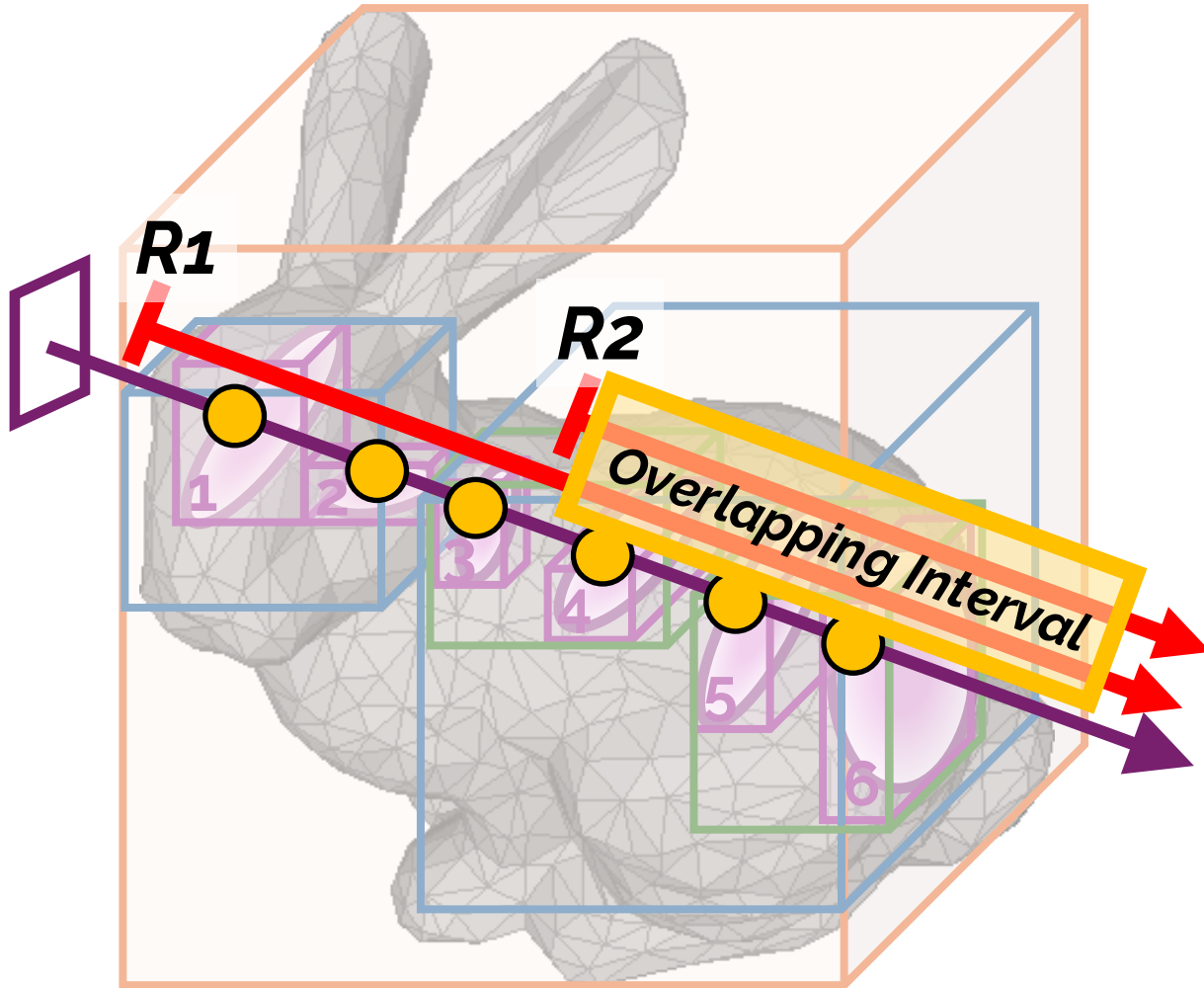
GRTX-HW: Traversal Checkpointing & Replay



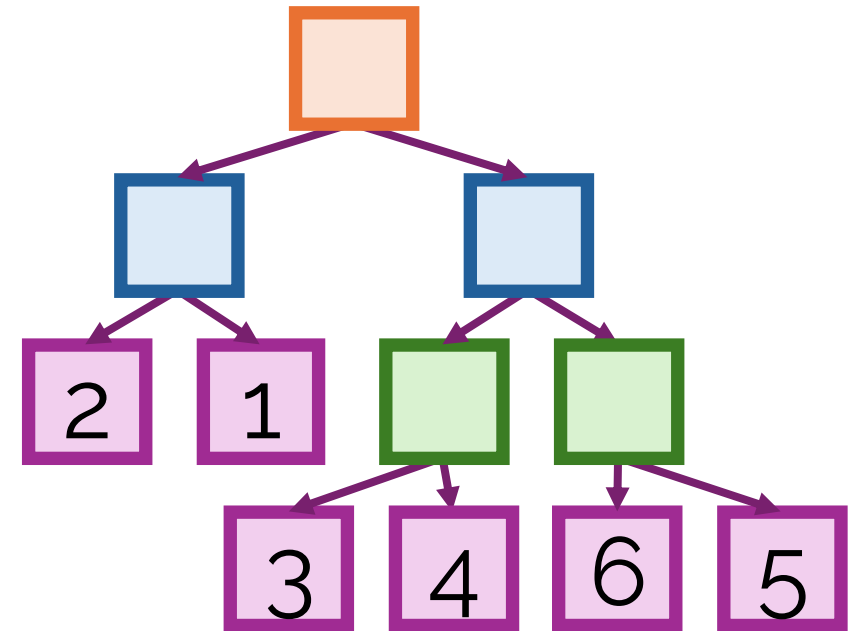
BVH traversal



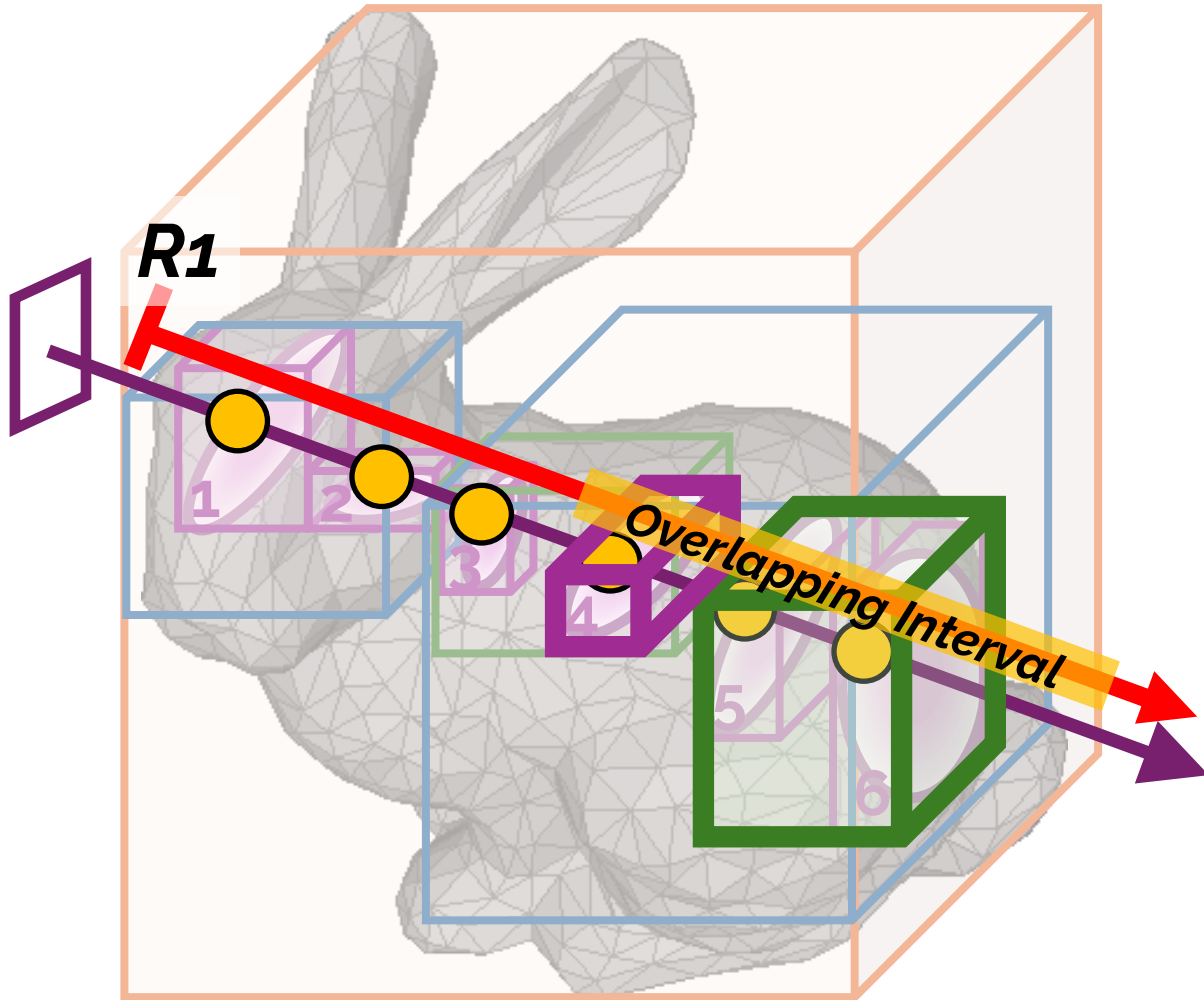
GRTX-HW: Traversal Checkpointing & Replay



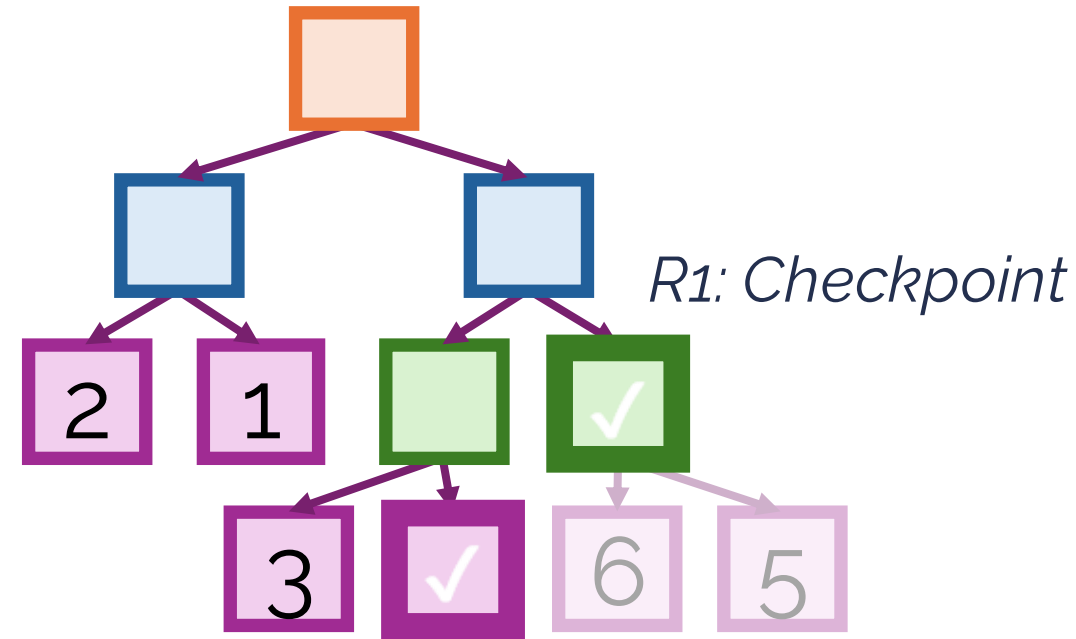
BVH traversal



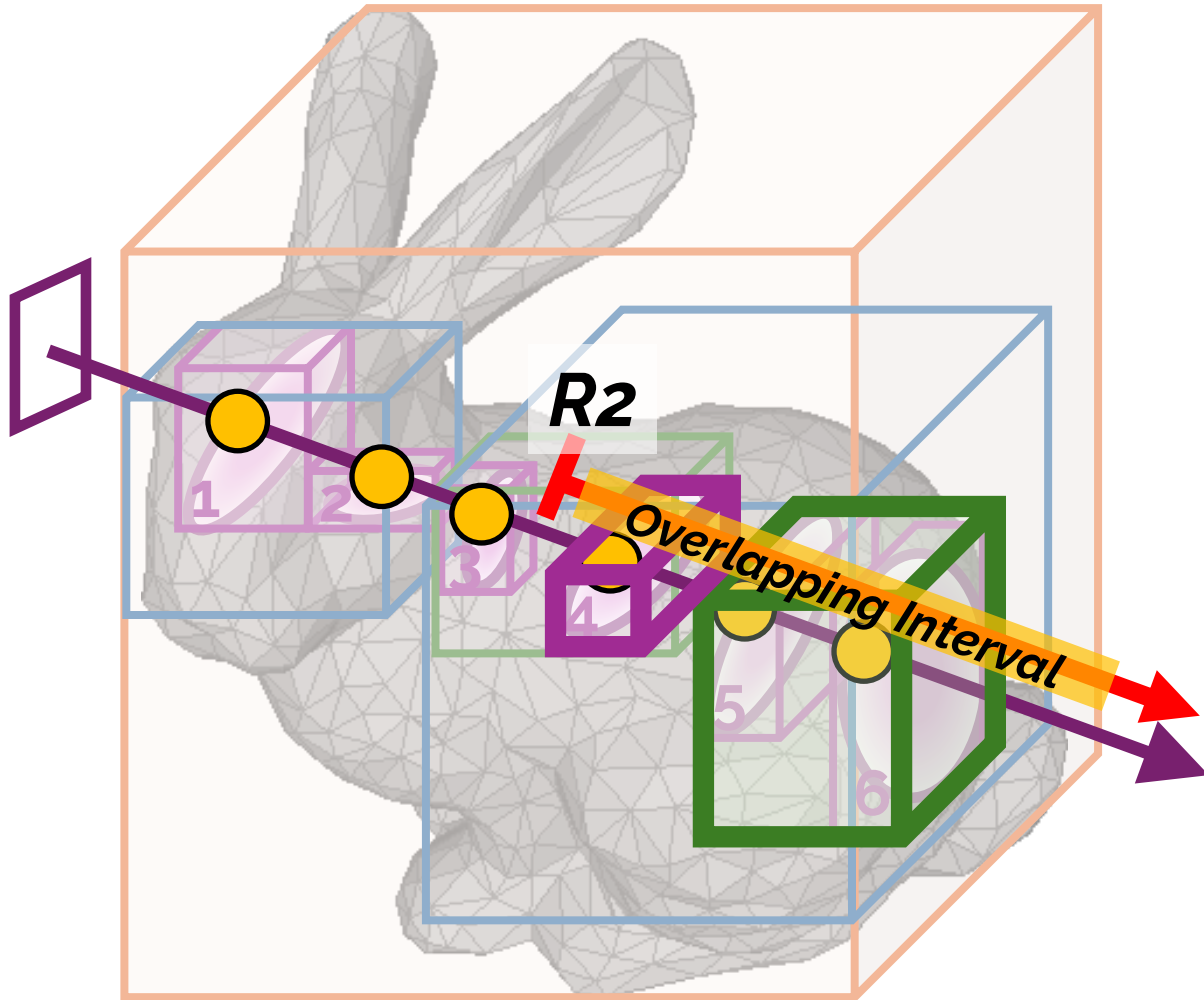
GRTX-HW: Traversal Checkpointing & Replay



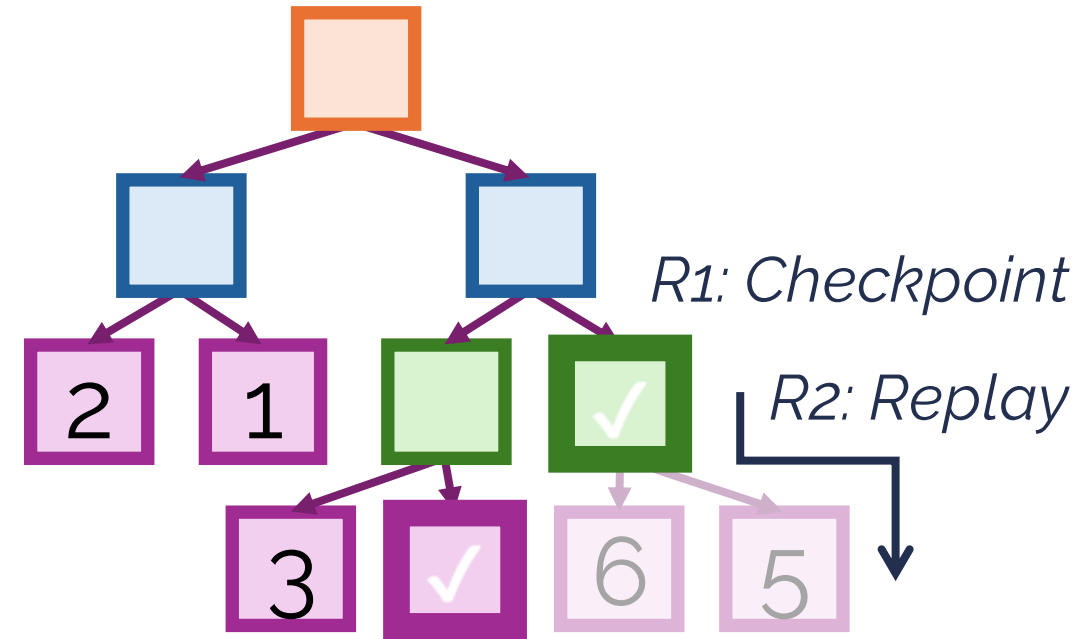
BVH traversal



GRTX-HW: Traversal Checkpointing & Replay



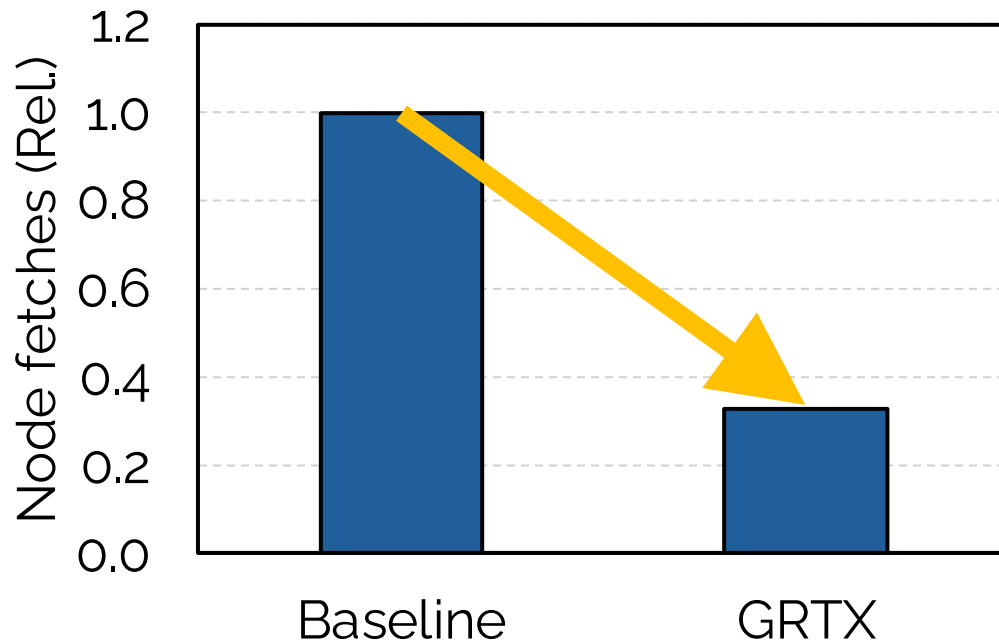
BVH traversal



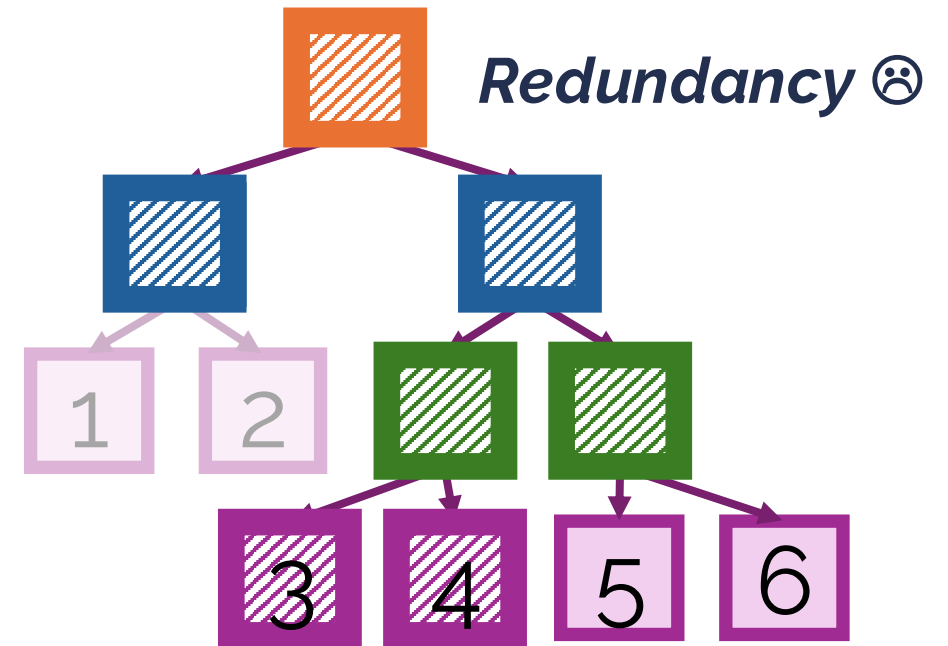
GRTX-HW: Traversal Checkpointing & Replay

Advantage

Eliminate redundant node visits
& tests across rounds



BVH traversal

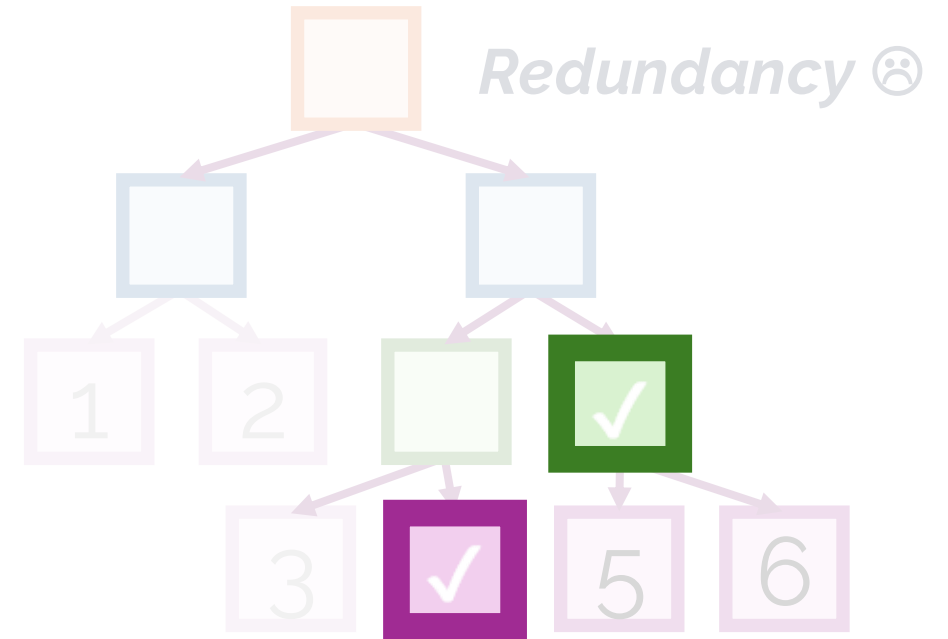


GRTX-HW: Traversal Checkpointing & Replay

Challenge

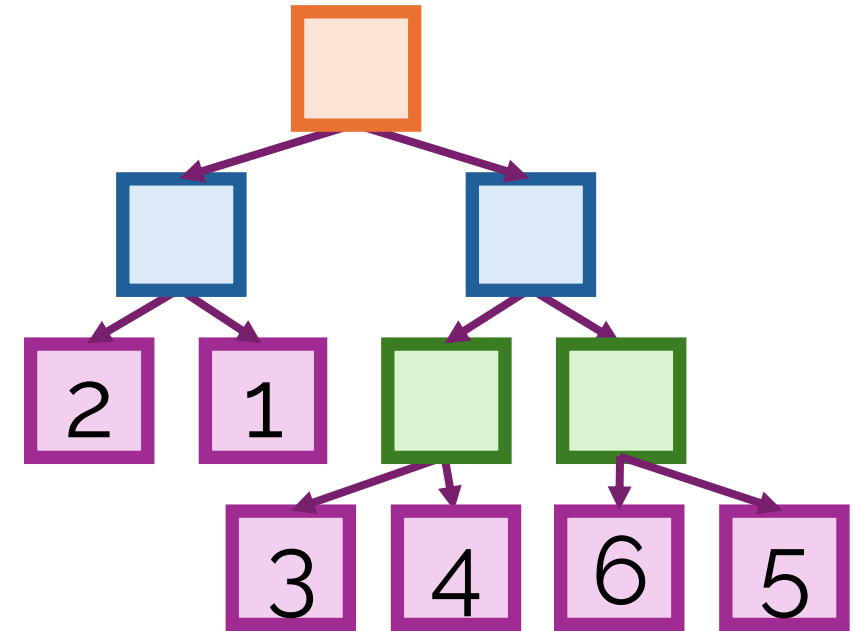
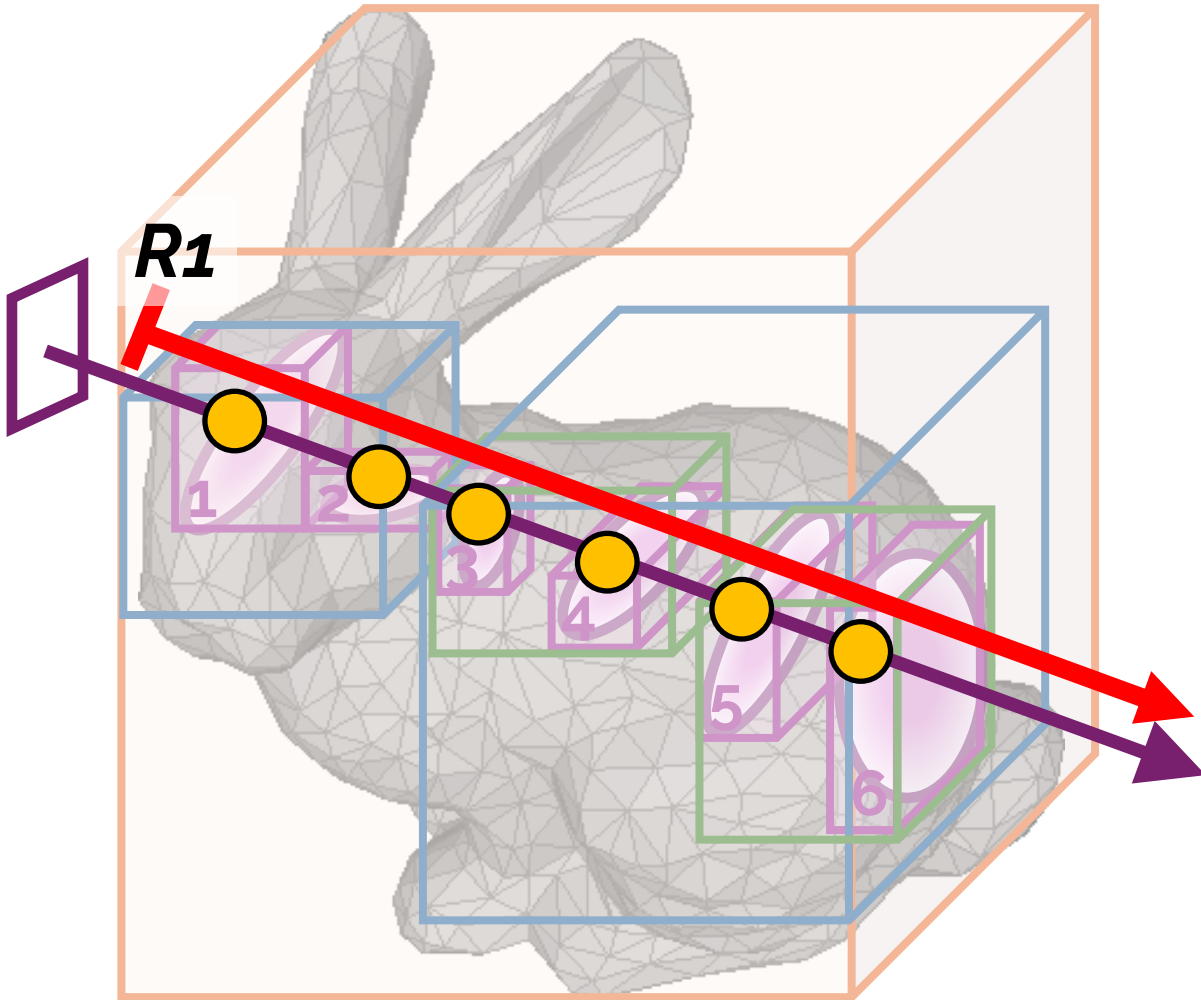
Q: How can we **pinpoint** nodes that should be **checkpointed**?

BVH traversal



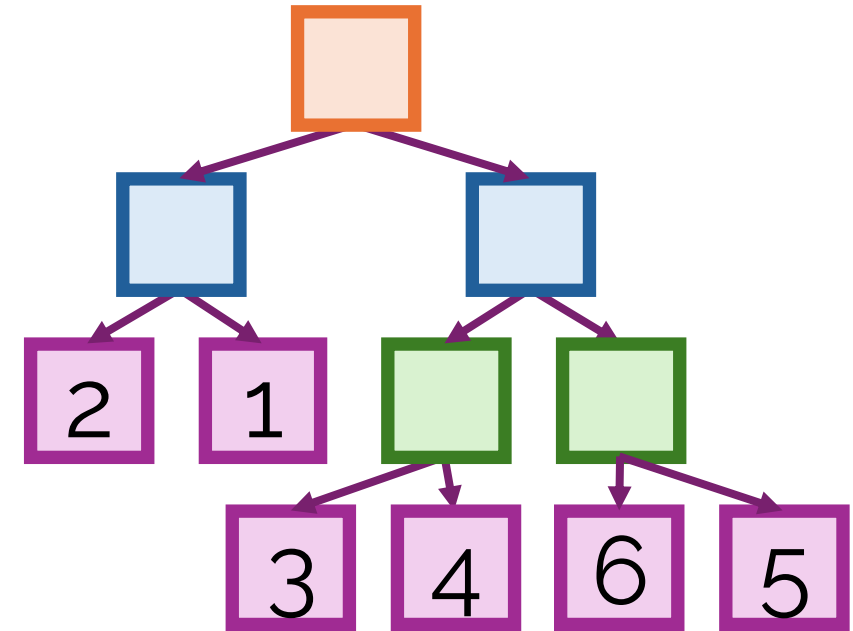
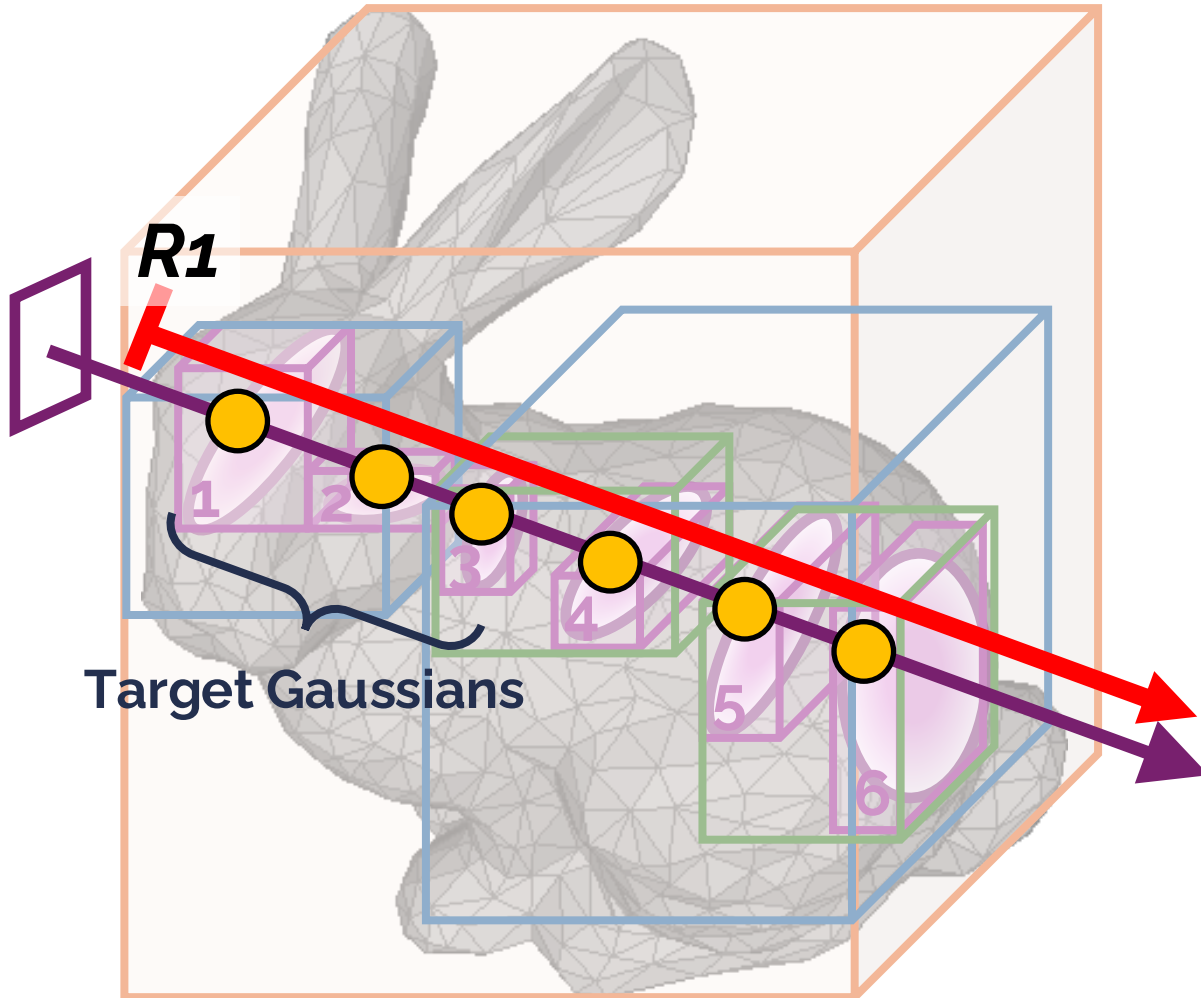
GRTX-HW: Traversal Checkpointing & Replay

Round 1



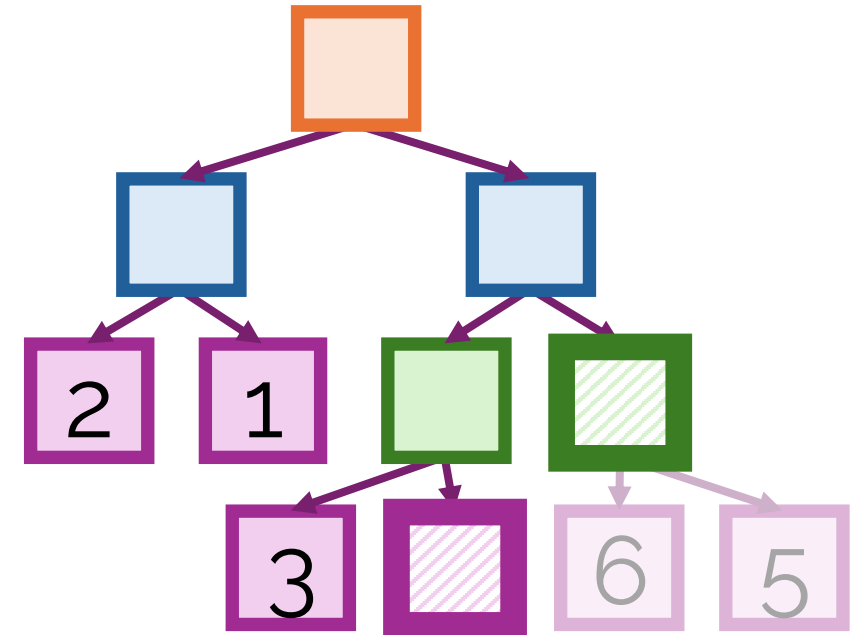
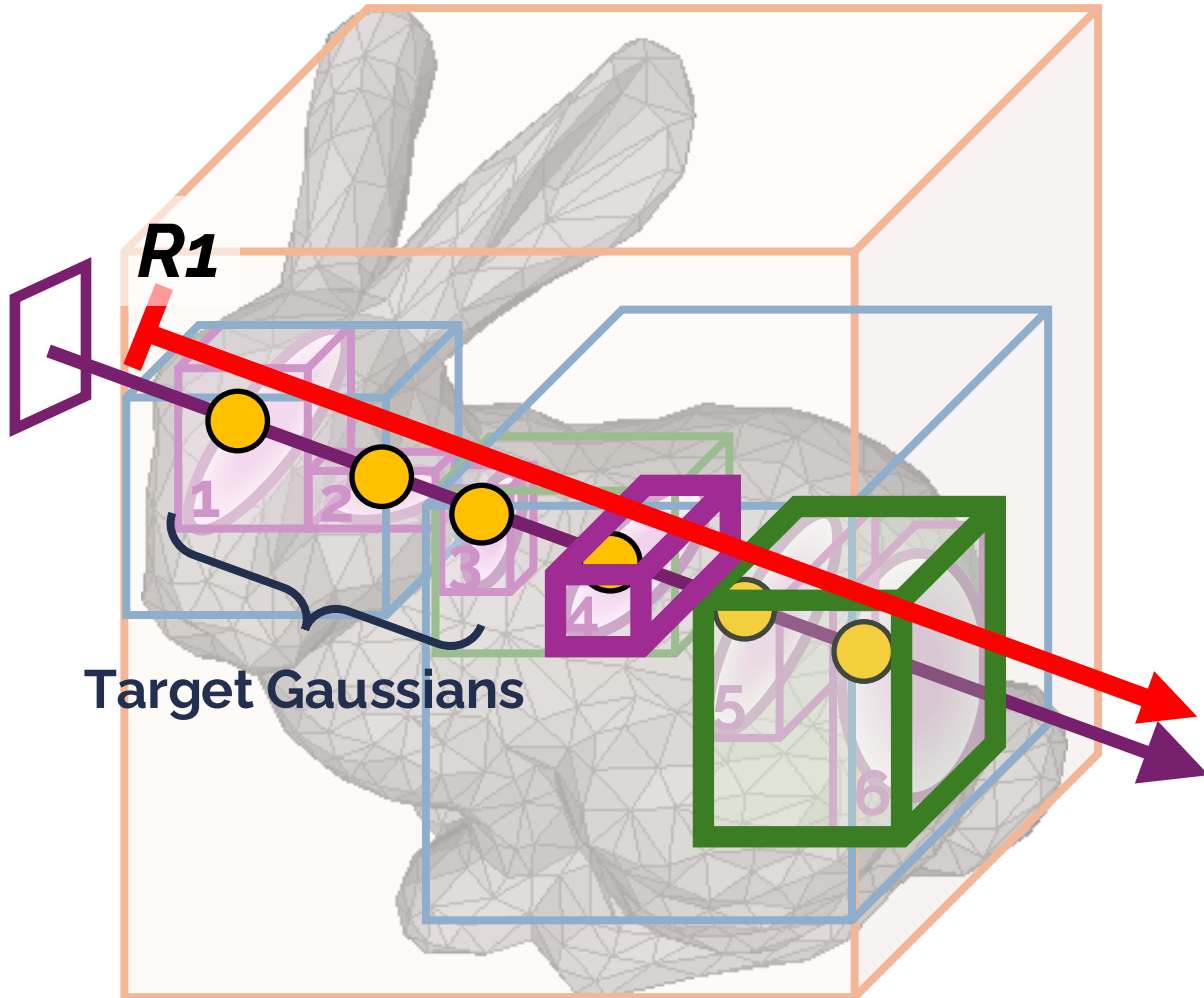
GRTX-HW: Traversal Checkpointing & Replay

Round 1

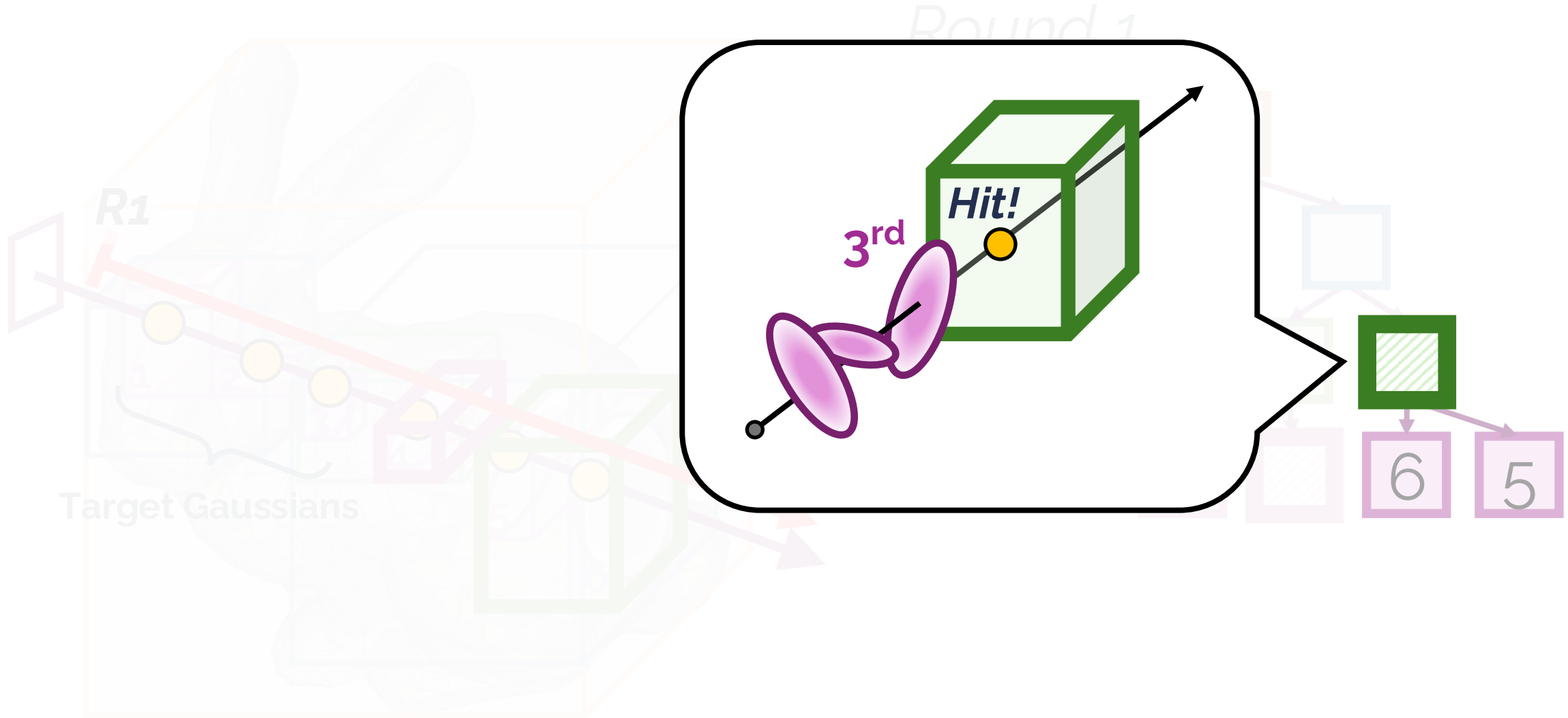


GRTX-HW: Traversal Checkpointing & Replay

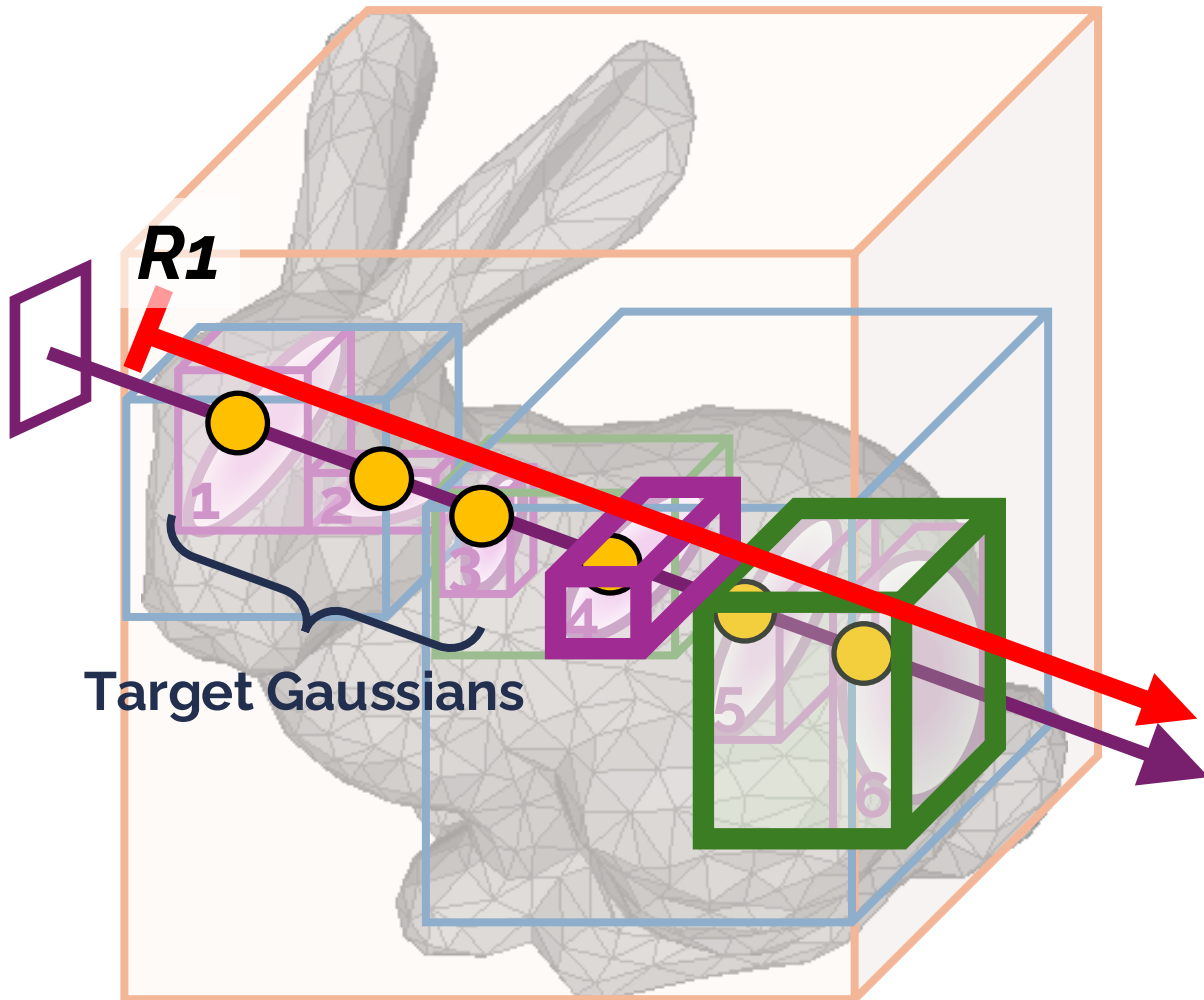
Round 1



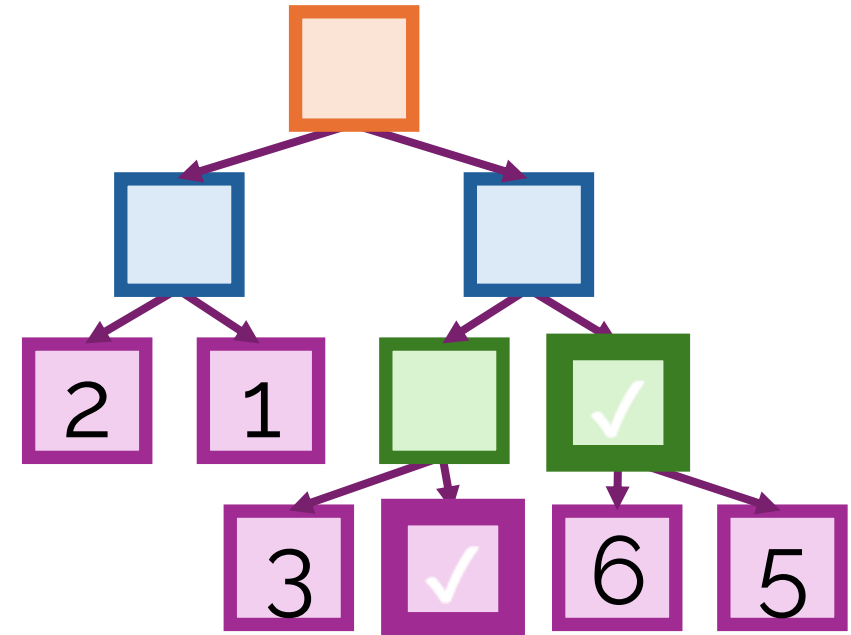
GRTX-HW: Traversal Checkpointing & Replay



GRTX-HW: Traversal Checkpointing & Replay



Round 1

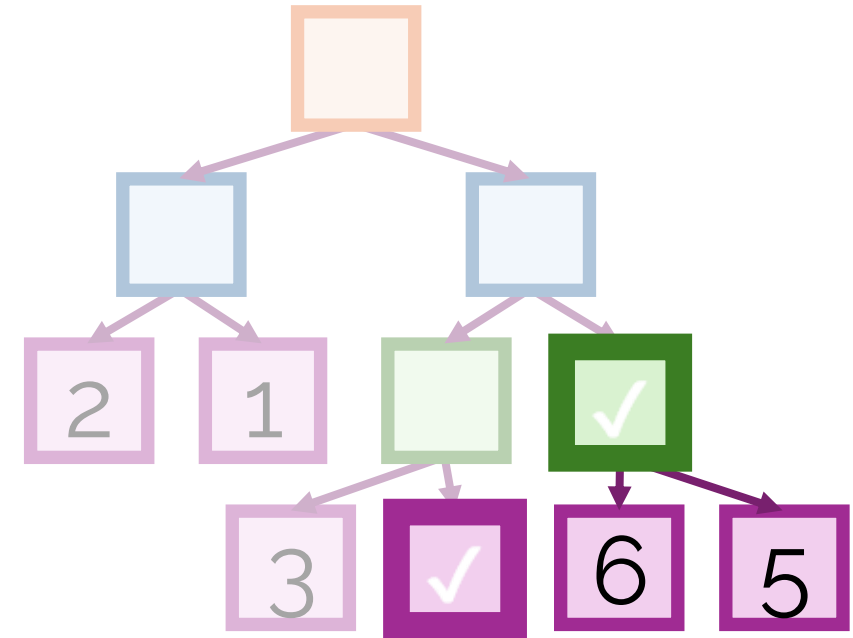
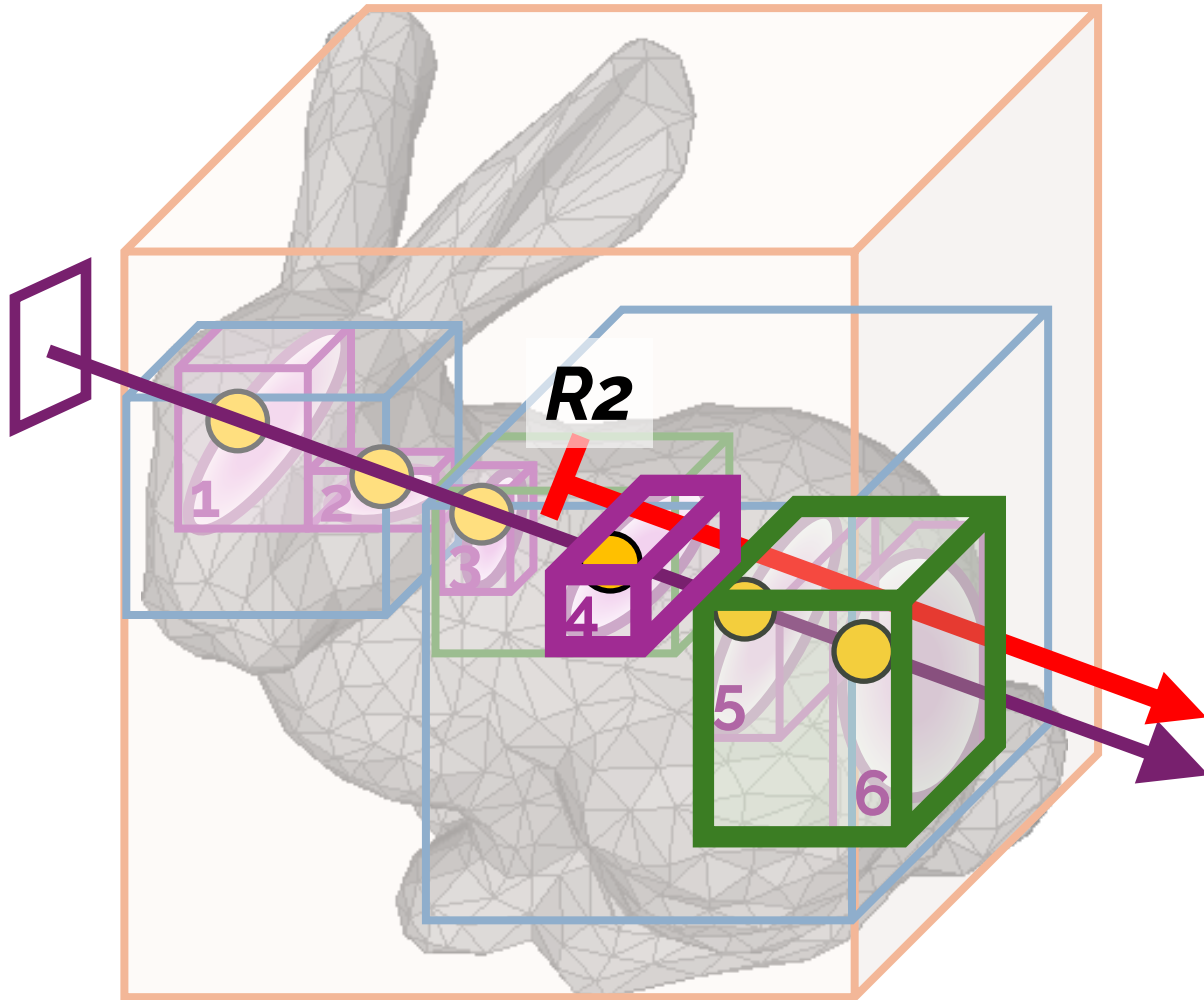


0	1	2	3

Checkpoint buffer

GRTX-HW: Traversal Checkpointing & Replay

Round 2

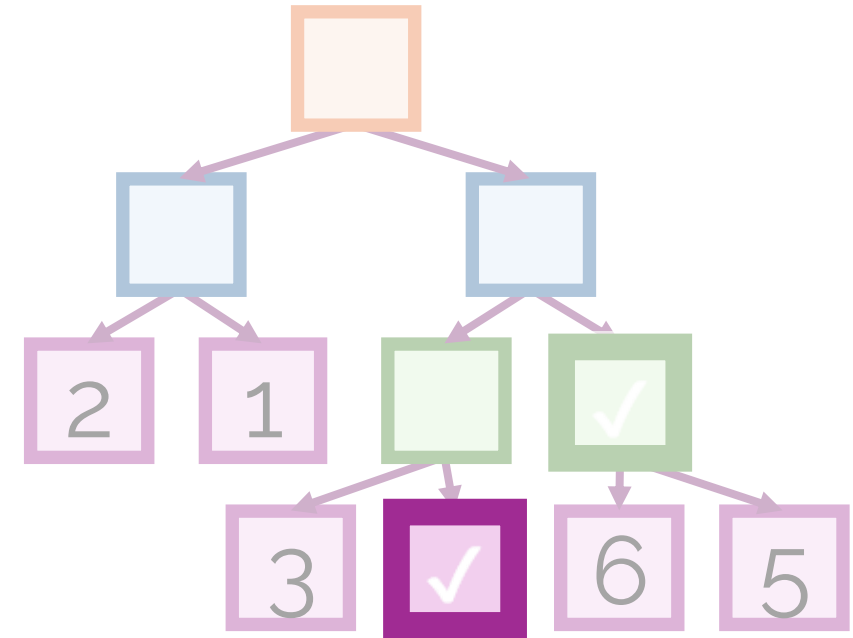
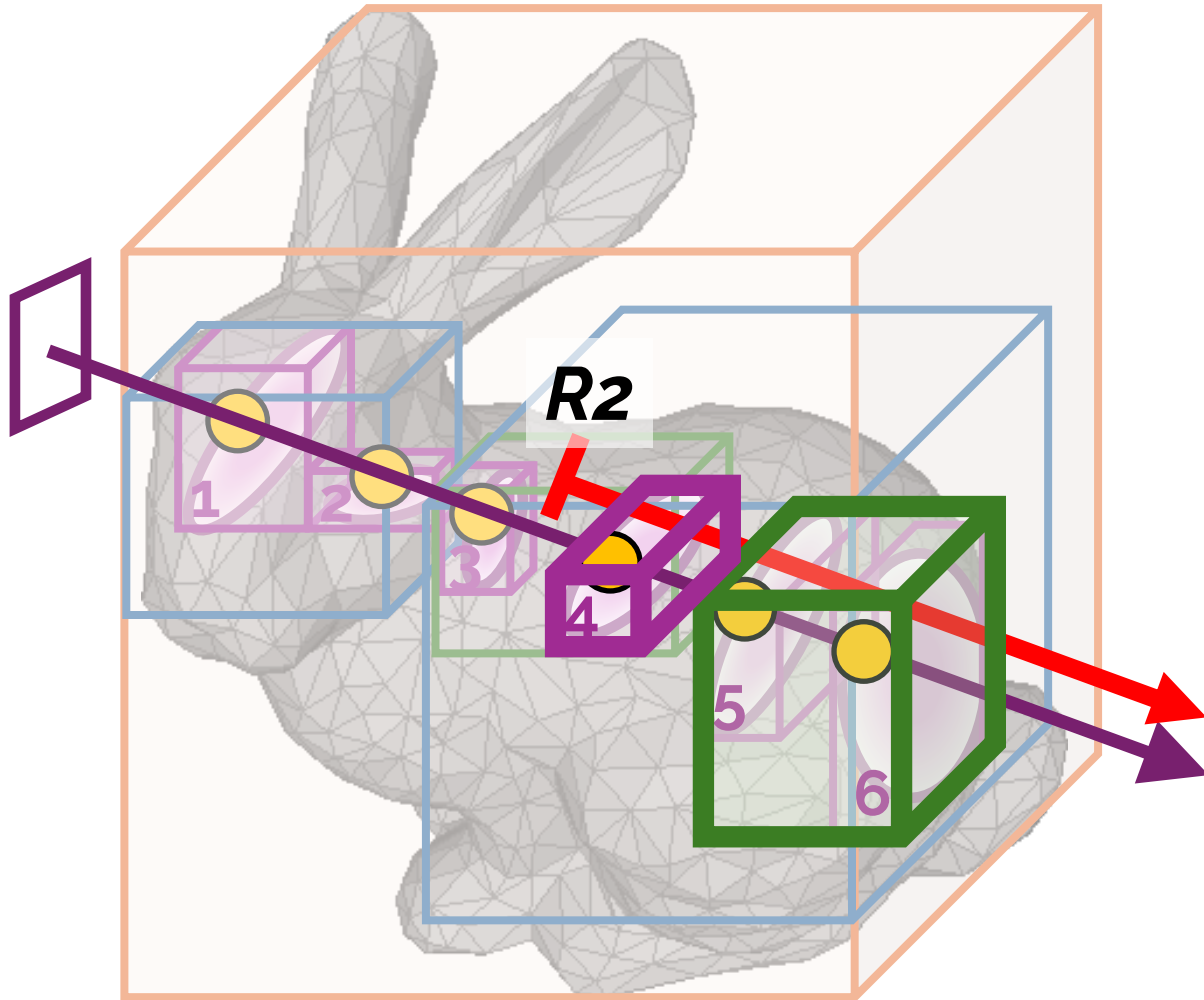


0	1	2	3

Checkpoint buffer

GRTX-HW: Traversal Checkpointing & Replay

Round 2

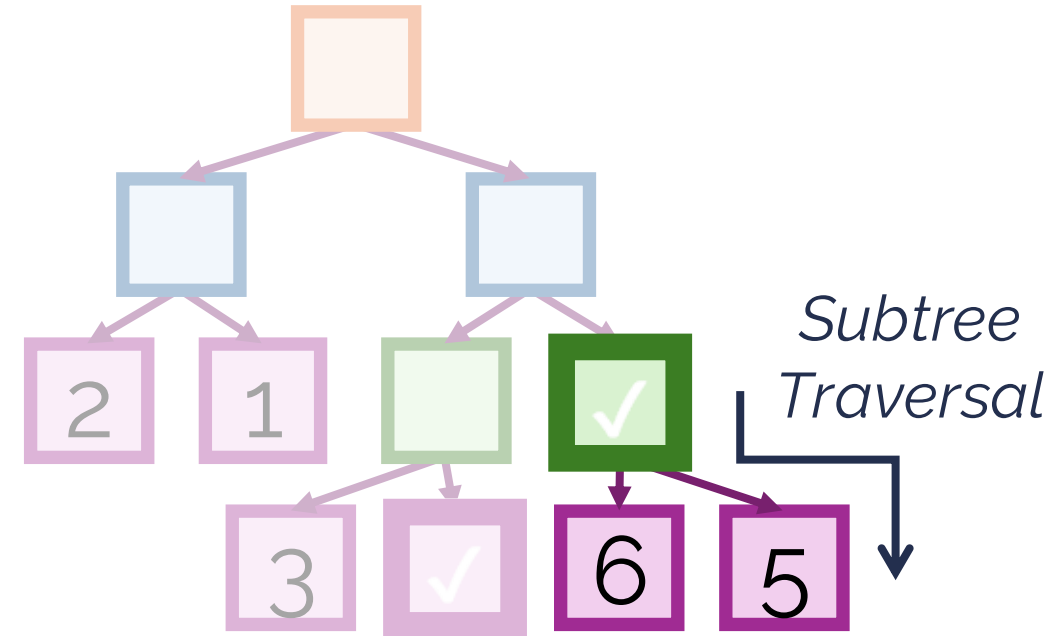
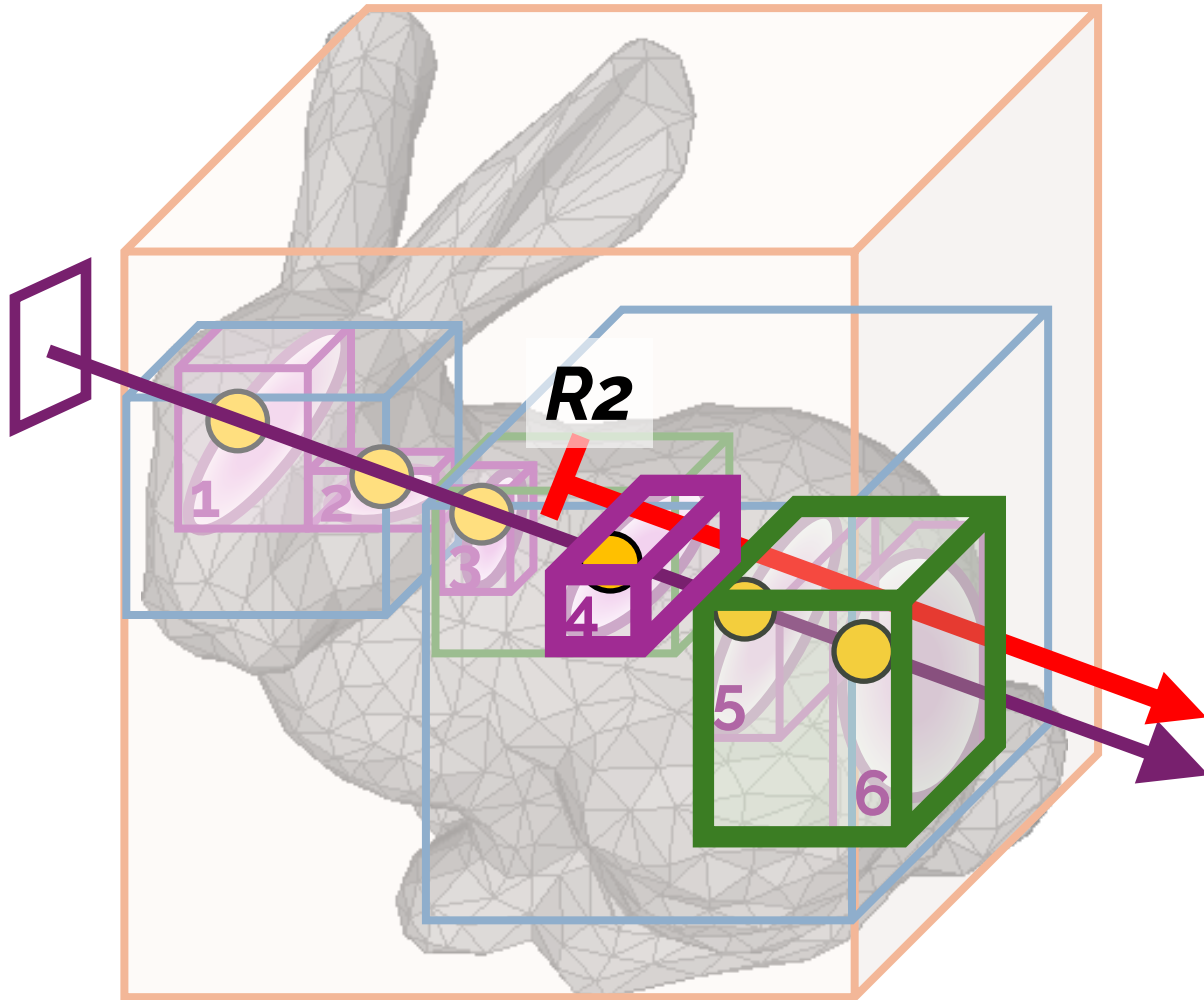


0	1	2	3

Checkpoint buffer

GRTX-HW: Traversal Checkpointing & Replay

Round 2



0	1	2	3

Checkpoint buffer

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- Ray Tracing Accelerators in Modern GPUs

- **Gaussian RT Optimizations & Limitations**

- **GRTX: SW-HW Optimizations for Gaussian Ray Tracing**

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- GRTX-HW: Traversal Checkpointing and Replay

- **Evaluation**

- **Conclusion**

Experimental Setup

Performance Evaluation

- Vulkan-Sim (MICRO'22)
 - Cycle-level GPU simulator w/ ray-tracing accelerator modeling based on GPGPU-sim
 - With our **in-house ray tracing simulator** based on real-GPU analysis

Workloads

- Tanks & Temples: Train, Truck
- Mip-NeRF 360: Bonsai, Room
- Deep Blending: Drjohnson, Playroom

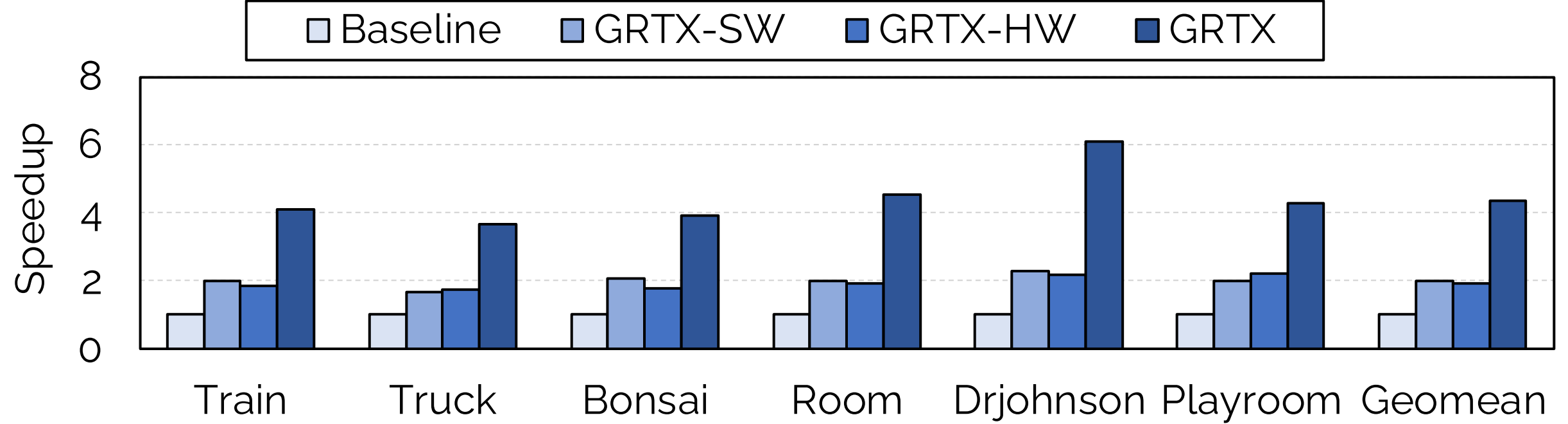
Baseline

- Monolithic BVH w/ 20-faced polyhedron used in 3DGRT (NVIDIA) [1]

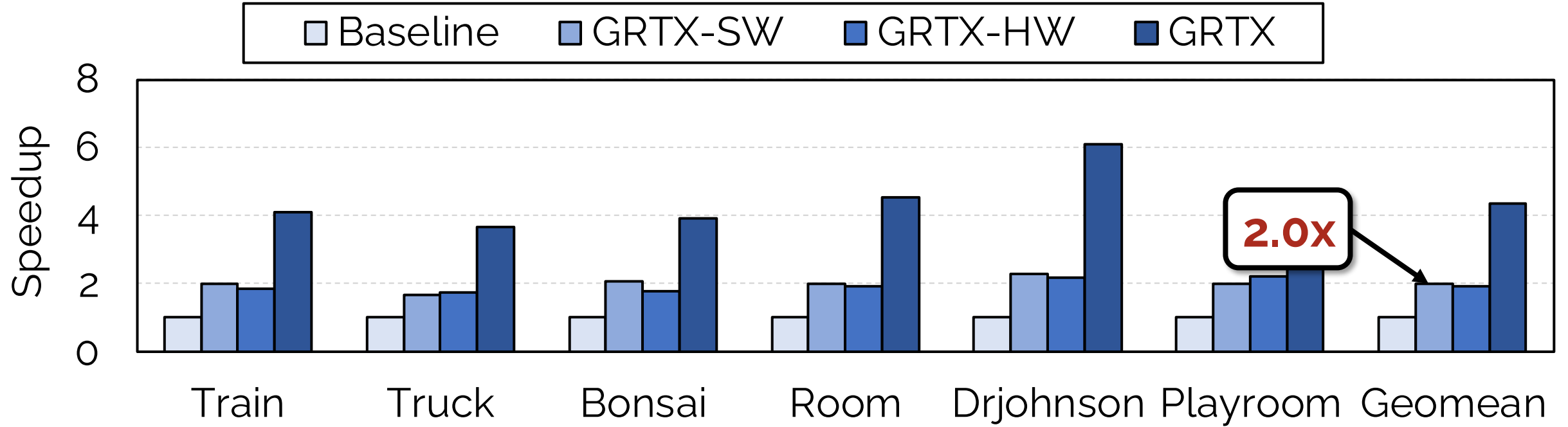
Baseline GPU Configuration

# GPC	1
# SMs	8
Core Frequency	1365 MHz
L1D Cache	128KB, 128B line (sectored)
L2 Cache	4MB, 128B line (sectored)
Memory Clock	3500MHz
# RT Units Per SM	1
Warp Buffer Size	8 (warps)

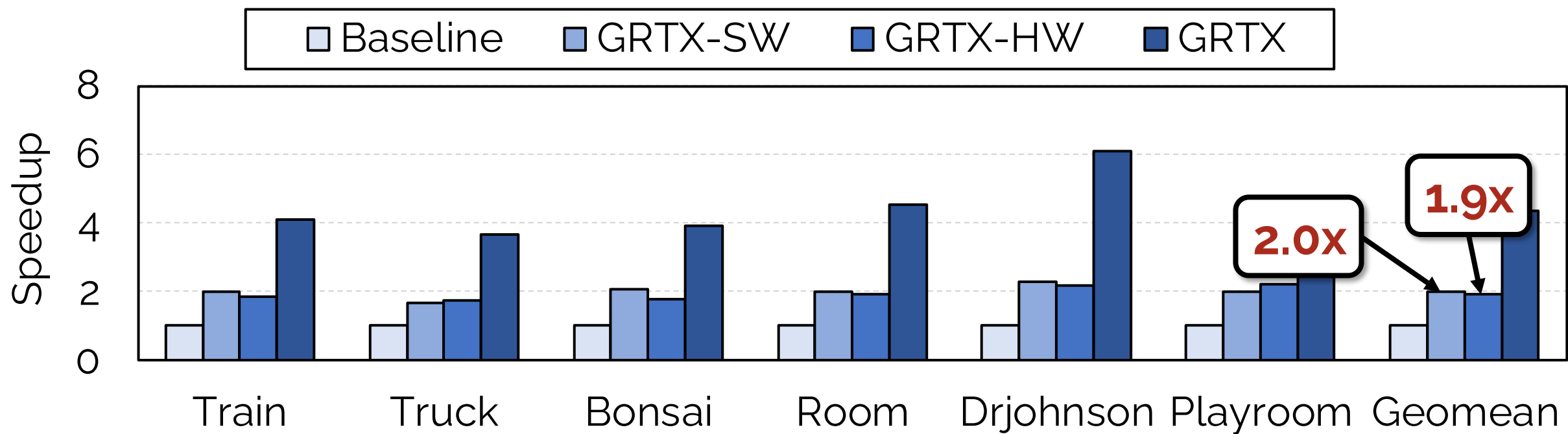
Performance



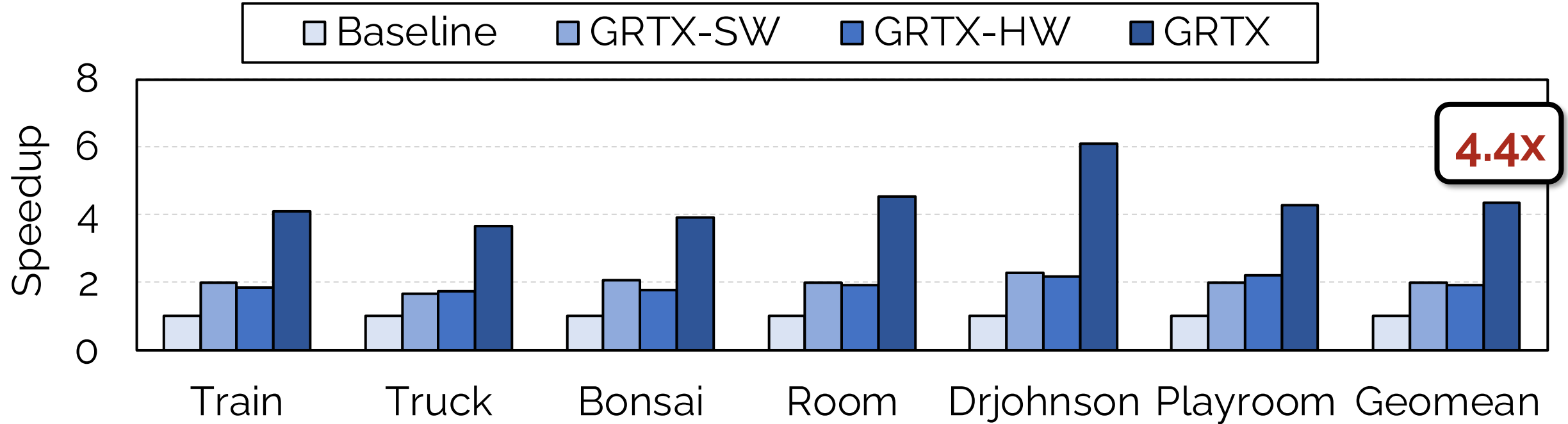
Performance



Performance



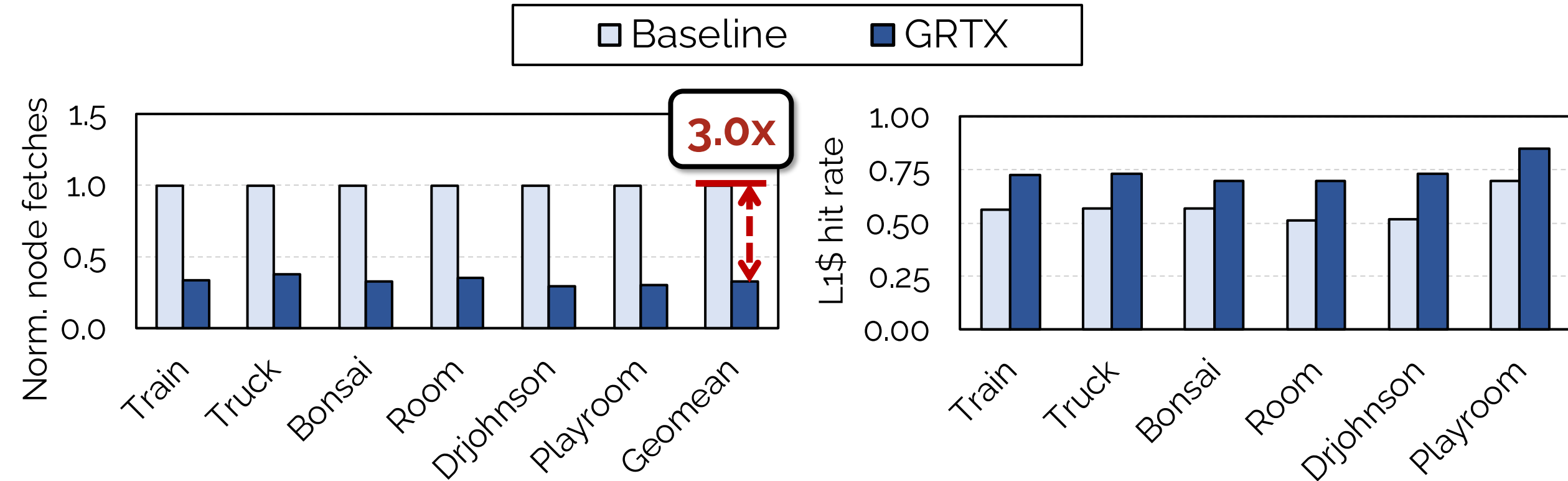
Performance



GRTX greatly improves rendering performance by 4.4x 😊

Source of Performance Gain

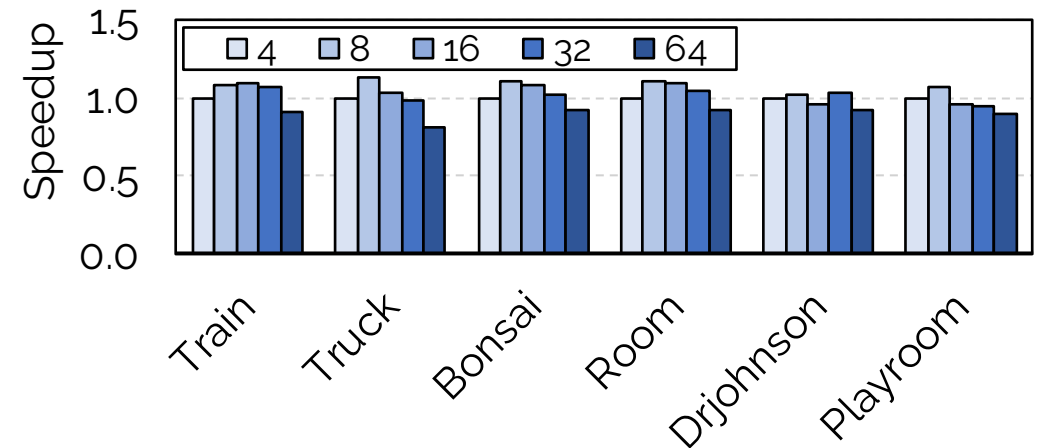
Number of Node Fetches & L1\$ Hit Rate



GRTX significantly **reduces the number of node fetches** while **increasing L1 cache hit rates**

More Details in Our Paper

- Support for dynamic and multi-object scenes
- GRTX-HW on secondary rays
- Sensitivity studies
 - k -buffer size
 - Varying resolutions and FoVs
- Cross-vendor applicability
- Others...



Conclusion

Problem

- Bloated BVH size and BVH memory footprint
- Redundant node visits and intersection tests across traversal rounds

Solution: **GRTX**, SW & HW optimizations for Gaussian ray-tracing

- **GRTX-SW**: Two-level BVH with a shared BLAS
- **GRTX-HW**: RT hardware extension with checkpointing and replay capabilities

Result

- GRTX shows **4.3x faster** ray-tracing performance over the baseline GPU with negligible hardware cost! 😊

Thank You!

GRTX

Efficient Ray Tracing for 3D Gaussian-Based Rendering

Junseo Lee

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