

# GPU-Based Volume Ray-Casting with Advanced Illumination

Timo Ropinski\*  
Visualization and Computer  
Graphics Research Group,  
University of Münster

Christof Rezk-Salama†  
Computer Graphics Group,  
University of Siegen

Markus Hadwiger‡  
VRVis Research Center for  
Virtual Reality and  
Visualization

Patric Ljung§  
Department of Imaging and  
Visualization, Siemens  
Corporate Research

## ABSTRACT

GPU-based ray-casting techniques are becoming more and more important for the visualization of volume data in medicine and engineering. Thanks to their flexibility and accuracy, they will likely replace existing slice-based techniques in the near future. This tutorial targets the growing number of developers and scientific researchers who work with specialized volume visualization algorithms on state-of-the-art graphics hardware.

Starting with a brief introduction to the concepts behind GPU-based ray-casting, we will review existing techniques capable to accelerate the rendering performance. These acceleration techniques are the key issue for supporting advanced illumination models, since these models usually consume more rendering time. In contrast to commonly used local illumination models, advanced illumination models allow to incorporate the light interactions between neighboring structures. Such effects include soft and hard shadows as well as translucency and multiple scattering. The tutorial focuses strongly upon those effects, which support improved spatial comprehension and are thus relevant for scientific visualization from a perceptual point of view, but it also covers topics more related to visual arts.

**Index Terms:** I.3.7 [Computer Graphics]: Three-Dimensional Graphics and Realism—Subjects: Color, shading, shadowing, and texture

## 1 TUTORIAL DURATION

1/2 day tutorial.

## 2 LEVEL OF THE TUTORIAL

**Intermediate to advanced.** The tutorial is aimed at scientific researchers and developers of visualization tools. Course participants should have basic programming skills and should be familiar with graphics hardware and shading languages. We will assume a basic knowledge regarding volume data as well as interactive volume rendering techniques. Furthermore, a basic understanding of GPU-based rendering techniques is required.

## 3 TUTORIAL WEBSITE

Updated versions of the slides and the tutorial notes can be found at the following website: <http://www.voreen.org/vis08-tutorial>

## 4 TUTORIAL DESCRIPTION

We will present an in-depth tutorial on GPU-based ray-casting approaches to volume visualization, including acceleration techniques, efficient memory management and advanced illumination

models. Participants will learn how to leverage the new features of modern commodity graphics hardware to implement advanced illumination techniques for high-quality volume rendering applications supporting improved spatial comprehension. Thus they should be able to target new research directions towards visualization techniques exploiting novel shading models as well as to improve the existing advanced shading models.

The tutorial starts with an introduction to the basic principles of GPU-based volume ray-casting, including useful optimization techniques highly beneficial for advanced illumination models. After these areas have been covered existing interactive illumination models for GPU-based volume ray-casting are explained in detail, by considering their contribution to the image understanding process.

Thus, besides the basic implementation details, the following topics are covered:

- Memory Management,
- Space Leaping and Early Ray Termination,
- Soft and Hard Shadows, Semi-Transparent Shadows,
- Diffuse and Specular Light Interactions,
- Translucency and Multiple Scattering Effects, and
- Monte-Carlo based Illumination Techniques.

Participants are provided with implementation details often omitted in scientific publications and should thus be able to conduct their own research in this area in the near future. We feel that it is important to also demonstrate these ideas since the reality of implementation can be quite different from the theory presented in the scientific literature. Since the content of the tutorial can be quite challenging, we intend to answer questions on the fly.

## 5 INSTRUCTORS BACKGROUND AND CONTACT INFORMATION

### Markus Hadwiger

VRVis Research Center for Virtual Reality and Visualization  
Donau-City-Straße 1  
A-1220 Vienna, Austria  
Email: [msh@vrvis.at](mailto:msh@vrvis.at)

**Markus Hadwiger** is a senior researcher at the VRVis Research Center in Vienna, Austria. He received his Ph.D. in computer science from the Vienna University of Technology in 2004, and has been a researcher at VRVis since 2000, working in the Basic Research on Visualization group and the Medical Visualization group (since 2004). He has been involved in several courses and tutorials about volume rendering and visualization at ACM SIGGRAPH, IEEE Visualization, and Eurographics. He is a co-author of the book *Real-Time Volume Graphics* published by A K Peters.

\*e-mail: [ropinski@math.uni-muenster.de](mailto:ropinski@math.uni-muenster.de)

†e-mail: [rezk@fb12.uni-siegen.de](mailto:rezk@fb12.uni-siegen.de)

‡e-mail: [msh@vrvis.at](mailto:msh@vrvis.at)

§e-mail: [patric.ljung@siemens.com](mailto:patric.ljung@siemens.com)

**Christof Rezk-Salama**

Computer Graphics Group  
University of Siegen  
Hoelderlinstr. 3  
57066 Siegen, Germany  
Email: rezk@fb12.uni-siegen.de

**Christof Rezk-Salama** has received a PhD from the University of Erlangen-Nuremberg as a scholarship holder of the graduate college *3D Image Analysis and Synthesis*. He has worked as a research engineer for the R&D department of Siemens Medical Solutions. Since October 2003 he is working as an assistant professor at the Computer Graphics Group of the University of Siegen, Germany.

The results of his research have been presented at international conferences, including ACM SIGGRAPH, IEEE Visualization, Eurographics, MICCAI and Graphics Hardware. He is regularly holding lectures, courses and seminars on computer graphics, scientific visualization, character animation and graphics programming.

He has gained practical experience in applying computer graphics to several scientific projects in medicine, geology and archaeology. Christof Rezk-Salama has released the award winning open-source project *OpenQVis* and is a co-author of the book *Real-Time Volume Graphics*.

**Timo Ropinski**

Visualization and Computer Graphics Research Group (VisCG)  
University of Münster  
Einsteinstr. 62  
48149 Münster, Germany  
Email: ropinski@math.uni-muenster.de

**Timo Ropinski** is a postdoctoral researcher working in the field of medical volume visualization. After receiving his PhD in 2004 from the University of Münster, he became a project leader within the collaborative research center SFB 656, a cooperation between researchers from medicine, mathematics, chemistry, physics and computer science. His research is focused on interactive aspects in medical volume visualization with the goal to make these techniques more accessible. He is regularly holding lectures and seminars on computer graphics and scientific visualization, and is the initiator of the *Voreen* open source project, in which a flexible volume rendering framework is developed. The results of his scientific work have been published in various international conferences including Eurographics, IEEE VR, VMV and others.

**Patric Ljung**

Department of Imaging and Visualization  
Siemens Corporate Research  
755 College Road East  
Princeton, NJ 08540, U.S.A.  
Email: patric.ljung@siemens.com

**Patric Ljung** joined in 2007 Siemens Corporate Research in Princeton, NJ, where he works as a Research Scientist in the Imaging Architectures group. He received 2006 his PhD in Scientific Visualization from Linköping University, Sweden and graduated with honors in 2000 his MS in Information Technology from Linköping University. Between 1989 and 1995 he worked as a software engineer with embedded and telecom systems involving software architectures, graphical user interfaces, voice-mail systems, communication protocols, network and interprocess communication, compilers.

Dr. Ljung has published several papers in international conferences and journals including IEEE Visualization, Eurographics conferences, IEEE TVCG and others, on volume rendering of large

medical data sets, GPU-based ray-casting of multiresolution data sets. One important focus area has been Virtual Autopsies for forensic pathology. His current research interest is in advanced illumination and shading techniques, software architectures for extensible graphics, and management and rendering of large medical data sets.

**6 CONTENTS AND SCHEDULE**

The half-day tutorial will consist of four blocks, each of about 45 minute length. From a didactic point of view, each block will loosely build upon the information provided in previous blocks with growing complexity and increasing level of difficulty. **8:30 –**

**9.15: Introduction and Basics**

*Speaker: Markus Hadwiger*

- Application Areas for Volume Rendering
- Benefits and Drawbacks of Ray-Casting
- GPU-based Volume Ray-Casting
- Space Leaping and Early Ray Termination
- Memory Management
- Multiresolution LOD and Adaptive sampling

GPU-based ray-casting is a direct volume rendering technique with a steadily growing popularity in scientific visualization. The first part of the tutorial gives an introduction to GPU-based ray-casting discussing the benefits and drawbacks compared to previous real-time volume rendering approaches like 3D texture slicing. After this introductory part, the attendees should have a thorough understanding of how GPU-based ray-casting approaches work, and how they must be employed in practice to achieve optimal performance. This section covers optimization techniques such as empty space leaping, level-of-detail and adaptive sampling. The implementation of spatial partitioning techniques, hierarchical data structures and memory management strategies for the handling of large volumes are explained in detail.

**9:15 – 10:00: Light Interaction**

*Speaker: Timo Ropinski*

- Light Transport and Illumination Models
- Local Volume Illumination
- Specular Reflections through Ray-Tracing
- Soft vs. Hard Shadows
- Semi-Transparent Shadows with Deep Shadow Maps
- Simulation of Color Bleeding

The second part gives an overview to physically-based light transport introducing the phase function as a volumetric equivalent to the bidirectional reflectance distribution function (BRDF) known from surface lighting. This part covers basic local illumination techniques with respect to GPU-based ray-casting, including run-time gradient estimation, as well as more advanced local illumination techniques for volume data and isosurfaces. For scientific visualization, the inclusion of shadows into volume rendering systems significantly increases the perception of spatial structures and depth relationships. This part covers state-of-the art techniques for shadow computation in semi-transparent volume renditions, including soft and hard shadows. We will show how hard shadows can be

computed interactively using efficient GPU-based approaches, such as deep shadow maps.

## 10:30 – 11:15: Ambient Occlusion

Speaker: Patric Ljung

- Ambient Occlusion for Isosurfaces
- Local Ambient Occlusion (DVR)
- Dynamic Ambient Occlusion (DVR)

Light interactions may be also approximated using ambient occlusion techniques for semi-transparent volumes and dynamic illumination scenarios.

## 11:15 – 12:00: Scattering

Speaker: Christof Rezk-Salama

- Monte-Carlo Integration
- Single versus Multiple Scattering
- Color Bleeding
- Translucency
- Monte-Carlo Scattering
- First-order Multiple Scattering
- Scattering with Deep Shadow Maps

Scattering effects account for photons which are reflected multiple times before they reach the eye. For volumetric data, scattering effects are usually included to capture the visual appearance of participating media. Such effects are important for modeling of natural phenomena such as smoke and clouds in visual arts. For scientific visualization, volume scattering may be used to convey tissue properties in a more realistic way. Translucency is an important visual property of soft tissue. This part of the tutorial covers interactive implementations of both single and multiple scattering effects in volumes. Compared to visual arts, where the optical properties inside the volume are mostly assumed homogeneous, in order to implement scattering and translucency in scientific data, e. g., tomographic scans, slightly different approaches must be chosen to optimally convey the structures. Several state-of-the-art approaches to achieve multiple scattering effects including color bleeding and translucency for interactive volume graphics are explained.

## REFERENCES

- [1] K. M. Beason, J. Grant, D. C. Banks, B. Futch, and M. Y. Hussaini. Pre-computed illumination for isosurfaces. In *VDA '94: Proceedings of the conference on Visualization and Data Analysis '06 (SPIE Vol. 6060)*, pages 1–11, 2006.
- [2] U. Behrens and R. Ratering. Adding shadows to a texture-based volume renderer. In *VVS '98: Proceedings of the 1998 IEEE symposium on Volume visualization*, pages 39–46. ACM Press, 1998.
- [3] I. Boada, I. Navazo, and R. Scopigno. Multiresolution volume visualization with a texture-based octree. *The Visual Computer*, 17:185–197, 2001.
- [4] P. Desgranges and K. Engel. US patent application 2007/0013696 A1: Fast ambient occlusion for direct volume rendering, 2007.
- [5] P. Desgranges, K. Engel, and G. Paladini. Gradient-free shading: A new method for realistic interactive volume rendering. In *VMV '05: Proceedings of the international fall workshop on Vision, Modeling, and Visualization*, pages 209–216, 2005.
- [6] K. Engel, M. Hadwiger, J. Kniss, C. Rezk-Salama, and D. Weiskopf. *Real-Time Volume Graphics*. AK Peters, 2006.
- [7] S. Guthe and W. Strasser. Advanced techniques for high quality multiresolution volume rendering. In *Computers & Graphics*, volume 28, pages 51–58. Elsevier Science, February 2004.
- [8] S. Guthe, M. Wand, J. Gonser, and W. Straer. Interactive rendering of large volume data sets. In *Proceedings IEEE Visualization 2002*, pages 53–60, 2002.
- [9] M. Hadwiger, A. Kratz, C. Sigg, and K. Bühler. Gpu-accelerated deep shadow maps for direct volume rendering. In *GH '06: Proceedings of the 21st ACM SIGGRAPH/Eurographics symposium on Graphics hardware*, pages 49–52, New York, NY, USA, 2006. ACM Press.
- [10] F. Hernell, P. Ljung, and A. Ynnerman. Efficient ambient and emissive tissue illumination using local occlusion in multiresolution volume rendering. In *Proceedings Eurographics/IEEE Workshop on Volume Graphics 2007*, pages 1–8, 129. IEEE, 2007.
- [11] R. Khler, J. Wise, T. Abel, and H.-C. Hege. Gpu-assisted raycasting for cosmological adaptive mesg refinement simulations. In *Proceedings Eurographics/IEEE Workshop on Volume Graphics 2006*, pages 103–110, 144, 2006.
- [12] T. Klein, M. Strengert, S. Stegmaier, and T. Ertl. Exploiting frame-to-frame coherence for accelerating high-quality volume raycasting on graphics hardware. In *Proceedings IEEE Visualization 2005*, pages 223–230, 2005.
- [13] J. Kniss, S. Premoze, C. Hansen, and D. Ebert. Interactive translucent volume rendering and procedural modeling. In *VIS '02: Proceedings of the conference on Visualization '02*, pages 109–116. IEEE Computer Society, 2002.
- [14] J. Kniss, S. Premoze, C. Hansen, P. Shirley, and A. McPherson. A model for volume lighting and modeling. *IEEE Transactions on Visualization and Computer Graphics*, 9(2):150–162, 2003.
- [15] J. Krüger and R. Westermann. Acceleration techniques for GPU-based volume rendering. In *Proceedings IEEE Visualization 2003*, 2003.
- [16] E. C. LaMar, B. Hamann, and K. I. Joy. Multiresolution techniques for interactive texture-based volume visualization. In *Proceedings IEEE Visualization 1999*, pages 355–362, 1999.
- [17] M. S. Langer and H. H. Bülthoff. Depth discrimination from shading under diffuse lighting. *Perception*, 29(6):649–660, 2000.
- [18] P. Ljung. Adaptive sampling in single pass, GPU-based raycasting of multiresolution volumes. In *Proceedings Eurographics/IEEE Workshop on Volume Graphics 2006*, pages 39–46, 134, 2006.
- [19] P. Ljung, C. Lundström, and A. Ynnerman. Multiresolution interblock interpolation in direct volume rendering. In *Proceedings Eurographics/IEEE Symposium on Visualization 2006*, pages 259–266, 2006.
- [20] P. Ljung, C. Lundström, A. Ynnerman, and K. Museth. Transfer function based adaptive decompression for volume rendering of large medical data sets. In *Proceedings IEEE Volume Visualization and Graphics Symposium 2004*, pages 25–32, 2004.
- [21] P. Ljung, C. Winskog, A. Persson, C. Lundström, and A. Ynnerman. Full body virtual autopsies using a state-of-the-art volume rendering pipeline. *IEEE Transactions on Visualization and Computer Graphics (Proceedings Visualization/Information Visualization 2006)*, 12:869–876, 2006.
- [22] T. Lokovic and E. Veach. Deep shadow maps. In *SIGGRAPH '00: Proceedings of the 27th annual conference on Computer graphics and interactive techniques*, pages 385–392, New York, NY, USA, 2000. ACM Press/Addison-Wesley Publishing Co.
- [23] G. Marmitt, H. Friedrich, and P. Slusallek. Interactive Volume Rendering with Ray Tracing. In *Eurographics State of the Art Reports*, 2006.
- [24] N. Max. Optical models for direct volume rendering. *IEEE Transactions on Visualization and Computer Graphics*, 1(2):99–108, 1995.
- [25] S. Parker, M. Parker, Y. Livnat, P.-P. Sloan, C. Hansen, and P. Shirley. Interactive ray tracing for volume visualization. *IEEE Transactions on Visualization and Computer Graphics*, 5(3):238–250, 1999.
- [26] S. Roettger, S. Guthe, D. Weiskopf, and T. Ertl. Smart hardware-accelerated volume rendering. In *Proceedings of EG/IEEE TCVG Symposium on Visualization VisSym '03*, pages 231–238, 2003.
- [27] T. Ropinski, J. Kasten, and K. H. Hinrichs. Efficient Shadows for GPU-based Volume Raycasting. In *Proceedings of the 16th International Conference in Central Europe on Computer Graphics, Visualization (WSCG08)*, pages 17–24, 2008. (Annahmequote: 29.6%).

- [28] T. Ropinski, J. Meyer-Spradow, S. Diepenbrock, J. Mensmann, and K. H. Hinrichs. Interactive Volume Rendering with Dynamic Ambient Occlusion and Color Bleeding. *Computer Graphics Forum (Eurographics 2008)*, 27(2):567–576, 2008. (Annahmequote: 19.3%).
- [29] C. R. Salama. GPU-Based Monte-Carlo Volume Raycasting. In *Proc. Pacific Graphics*, 2007.
- [30] M. Sattler, R. Sarlette, T. Mücken, and R. Klein. Exploitation of human shadow perception for fast shadow rendering. In *APGV '05: Proceedings of the 2nd symposium on Applied perception in graphics and visualization*, pages 131–134. ACM Press, 2005.
- [31] L. M. Sobierajski and A. E. Kaufman. Volumetric ray tracing. In *VVS '94: Proceedings of the 1994 symposium on Volume Visualization '94*, pages 11–18. ACM Press, 1994.
- [32] S. Stegmaier, M. Strengert, T. Klein, and T. Ertl. A simple and flexible volume rendering framework for graphics-hardware-based raycasting. In *Eurographics/IEEE Volume Graphics Symposium*. Eurographics, 2005.
- [33] A. J. Stewart. Vicinity shading for enhanced perception of volumetric data. In *VIS '03: Proceedings of the 14th IEEE Visualization 2003 (VIS'03)*, page 47. IEEE Computer Society, 2003.
- [34] J. E. Vollrath, T. Schafhitzel, and T. Ertl. Employing complex GPU data structures for the interactive visualization of adaptive mesh refinement data. In *Proceedings Eurographics/IEEE Workshop on Volume Graphics 2006*, pages 55–58, 136, 2006.
- [35] M. Weiler, R. Westermann, C. Hansen, K. Zimmerman, and T. Ertl. Level-of-detail volume rendering via 3d textures. In *Proceedings IEEE Volume Visualization and Graphics Symposium 2000*, pages 7–13. ACM Press, 2000.
- [36] C. Wyman, S. Parker, C. Hansen, and P. Shirley. Interactive display of isosurfaces with global illumination. *IEEE Transactions on Visualization and Computer Graphics*, 12(2):186–196, 2006.
- [37] C. Zhang and R. Crawfis. Shadows and soft shadows with participating media using splatting. *IEEE Transactions on Visualization and Computer Graphics*, 9(2):139–149, 2003.





---

# Advanced Illumination Techniques for GPU-Based Volume Raycasting

---

Markus Hadwiger  
VR VIS Research Center  
Vienna, Austria



Patric Ljung  
Siemens Corporate Research  
Princeton, NJ, USA



Christof Rezk Salama  
Computer Graphics Group  
Institute for Vision and Graphics  
University of Siegen, Germany



Timo Ropinski  
Visualization and Computer  
Graphics Research Group,  
University of Münster, Germany



---

# Ray-Casting Basics

---

Markus Hadwiger  
VR VIS Research Center  
Vienna, Austria



Patric Ljung  
Siemens Corporate Research  
Princeton, NJ, USA



Christof Rezk Salama  
Computer Graphics Group  
Institute for Vision and Graphics  
University of Siegen, Germany

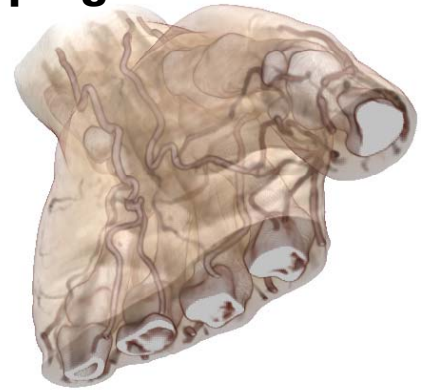


Timo Ropinski  
Visualization and Computer  
Graphics Research Group,  
University of Münster, Germany



# Talk Outline

- **Why use ray-casting instead of slicing?**
- **Ray-casting of rectilinear (structured) grids**
  - Basic approaches on GPUs
  - Basic acceleration methods
  - Object-order empty space skipping
  - Isosurface ray-casting
  - Endoscopic ray-casting
- **Memory management**
- **LOD selection**

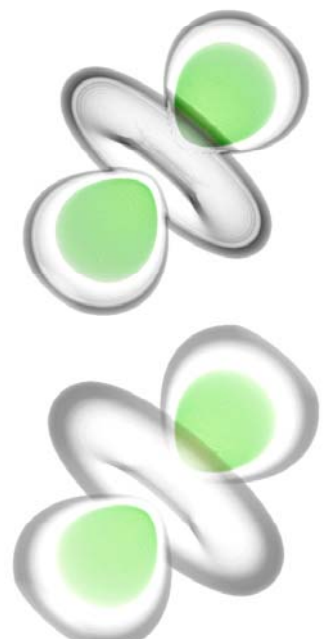
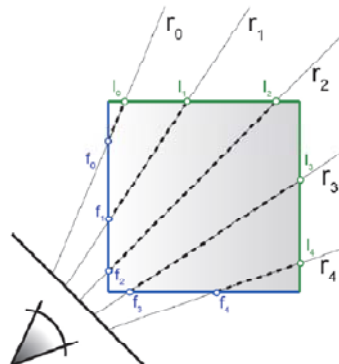


MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Why Ray-Casting on GPUs?

- **Most GPU rendering is object-order (rasterization)**
- **Image-order is more “CPU-like”**
  - Recent fragment shader advances
  - Simpler to implement
  - Very flexible (e.g., adaptive sampling)
  - Correct perspective projection
  - Can be implemented in single pass!
  - Native 32-bit compositing

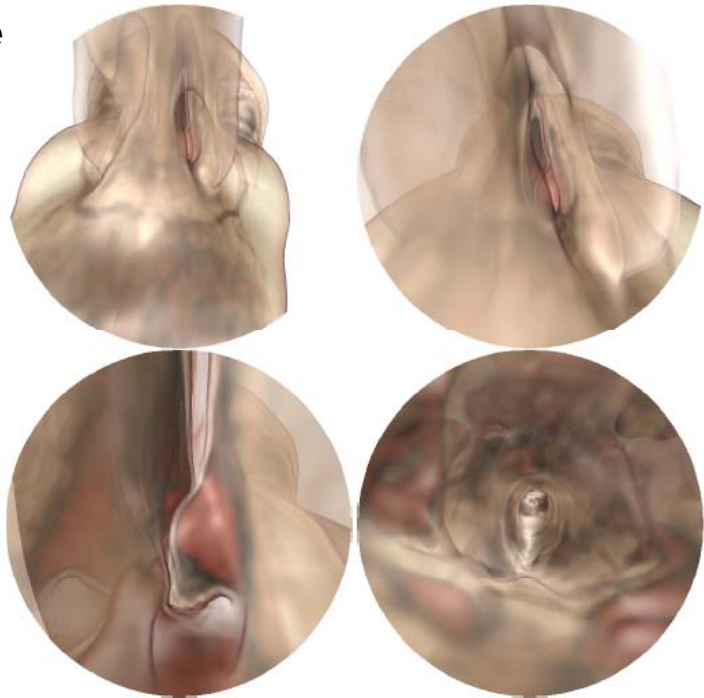


MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Correct Perspective

- Entering the volume
- Wide field of view
- Fly-throughs
- Virtual endoscopy
- Integration into perspective scenes, e.g., games

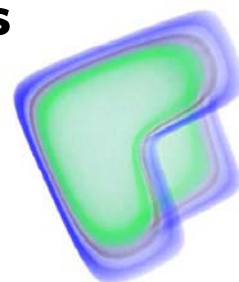
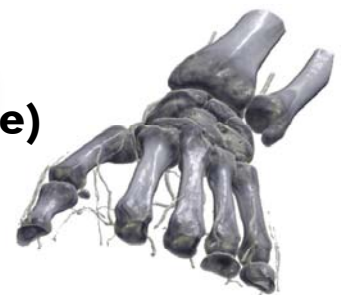


MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Recent GPU Approaches

- Rectilinear grids
  - [Krüger and Westermann, 2003]
  - [Röttger et al., 2003]
  - [Green, 2004] (NVIDIA SDK Example)
  - [Stegmaier et al., 2005]
  - [Scharsach et al., 2006]
- Unstructured (tetrahedral) grids
  - [Weiler et al., 2002, 2003, 2004]
  - [Bernardon, 2004]

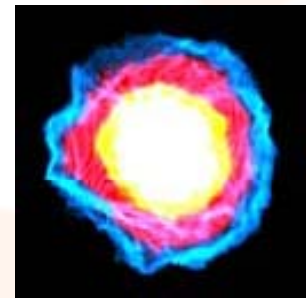


MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



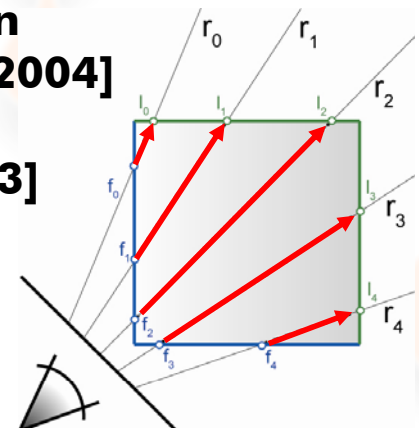
# Single-Pass Ray-Casting

- Enabled by conditional loops in fragment shaders (Shader Model 3; e.g., Geforce 8800, ATI X2800)
- Substitute multiple passes and early-z testing by single loop and early loop exit
- No compositing buffer: full 32-bit precision!
- NVIDIA example: compute ray intersections with bounding box, march along rays and composite



## Basic Ray Setup / Termination

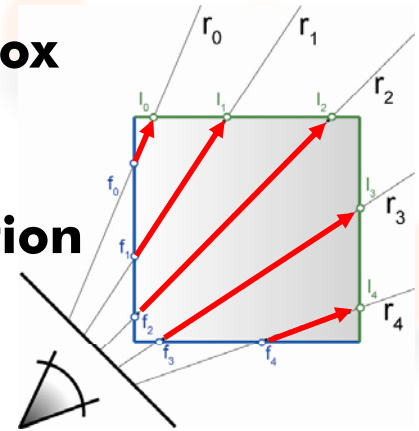
- Two main approaches:
  - Procedural ray/box intersection [Röttger et al., 2003], [Green, 2004]
  - Rasterize bounding box [Krüger and Westermann, 2003]



- Some possibilities
  - Ray start position and exit check
  - Ray start position and exit position
  - Ray start position and direction vector

# Procedural Ray Setup/Term.

- Everything handled in the fragment shader
- Procedural ray / bounding box intersection
- Ray is given by camera position and volume entry position
- Exit criterion needed
- Pro: simple and self-contained
- Con: full load on the fragment shader



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Fragment Shader

- Rasterize front faces of volume bounding box
- Texcoords are volume position in [0,1]
- Subtract camera position
- Repeatedly check for exit of bounding box

```
// Cg fragment shader code for single-pass ray casting
float4 main(VS_OUTPUT IN, float4 TexCoord0 : TEXCOORD0,
            uniform sampler3D SamplerDataVolume,
            uniform sampler1D SamplerTransferFunction,
            uniform float3 camera,
            uniform float stepsize,
            uniform float3 volExtentMin,
            uniform float3 volExtentMax
            ) : COLOR
{
    float4 value;
    float scalar;
    // Initialize accumulated color and opacity
    float4 dst = float4(0,0,0,0);
    // Determine volume entry position
    float3 position = TexCoord0.xyz;
    // Compute ray direction
    float3 direction = TexCoord0.xyz - camera;
    direction = normalize(direction);
    // Loop for ray traversal
    for (int i = 0; i < 200; i++) // Some large number
    {
        // Data access to scalar value in 3D volume texture
        value = tex3D(SamplerDataVolume, position);
        scalar = value.a;
        // Apply transfer function
        float4 src = tex1D(SamplerTransferFunction, scalar);
        // Front-to-back compositing
        dst = (1.0-dst.a) * src + dst;
        // Advance ray position along ray direction
        position = position + direction * stepsize;
        // Ray termination: Test if outside volume ...
        float3 temp1 = sign(position - volExtentMin);
        float3 temp2 = sign(volExtentMax - position);
        float inside = dot(temp1, temp2);
        // ... and exit loop
        if (inside < 3.0)
            break;
    }
    return dst;
}
```

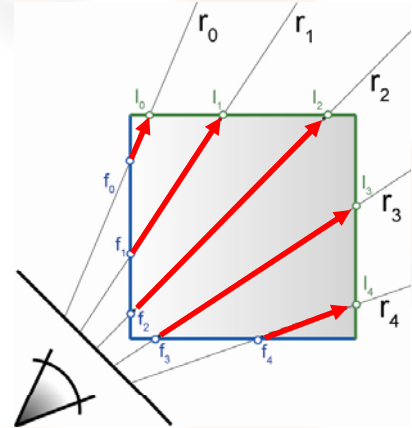
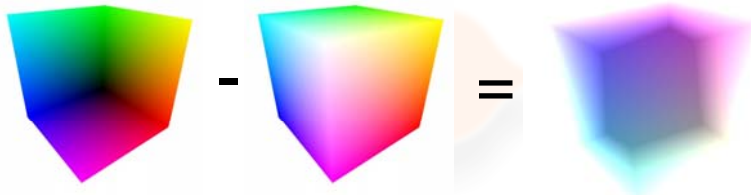


MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# "Image-Based" Ray Setup/Term.

- **Rasterize bounding box front faces and back faces**  
[Krüger and Westermann, 2003]
- **Ray start position: front faces**
- **Direction vector: back-front faces**



- **Independent of projection (orthogonal/perspective)**



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Standard Ray-Casting Opt. (1)

### Early ray termination

- **Isosurfaces: stop when surface hit**
- **Direct volume rendering: stop when opacity  $\geq$  threshold**
- **Several possibilities**
  - **Older GPUs: multi-pass rendering with early-z test**
  - **Shader model 3: break out of ray-casting loop**
  - **Current GPUs: early loop exit not optimal but good**



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Standard Ray-Casting Opt. (2)

## Empty space skipping

- Skip transparent samples
  - Depends on transfer function
  - Start casting close to first hit
- Several possibilities
    - Per-sample check of opacity (expensive)
    - Traverse hierarchy (e.g., octree) or regular grid
  - These are image-order: what about object-order?

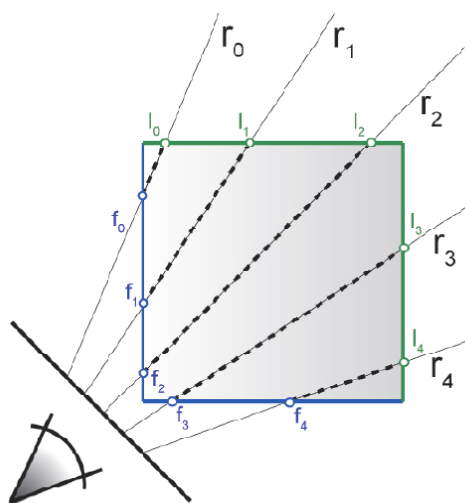


MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

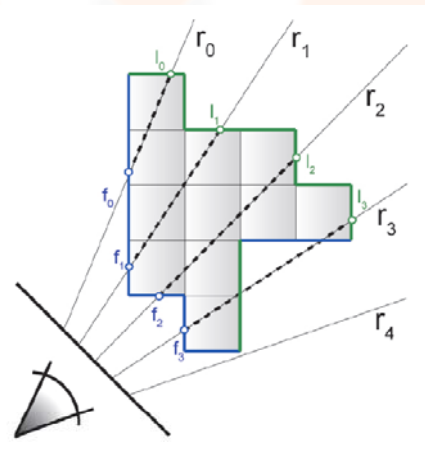


# Object-Order Empty Space Skip. (1)

- Modify initial rasterization step



rasterize bounding box



rasterize "tight" bounding geometry

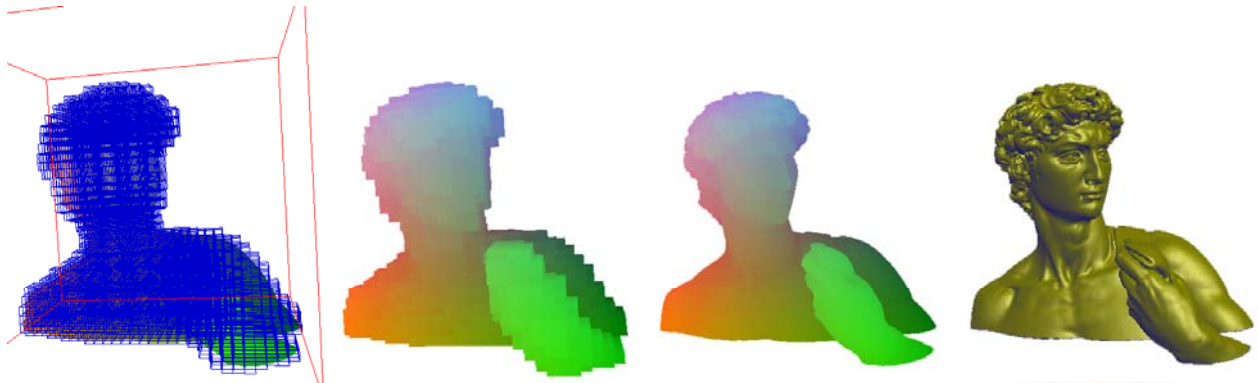


MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Object-Order Empty Space Skip. (2)

- Store min-max values of volume bricks
- Cull bricks against isovalue or transfer function
- Rasterize front and back faces of active bricks

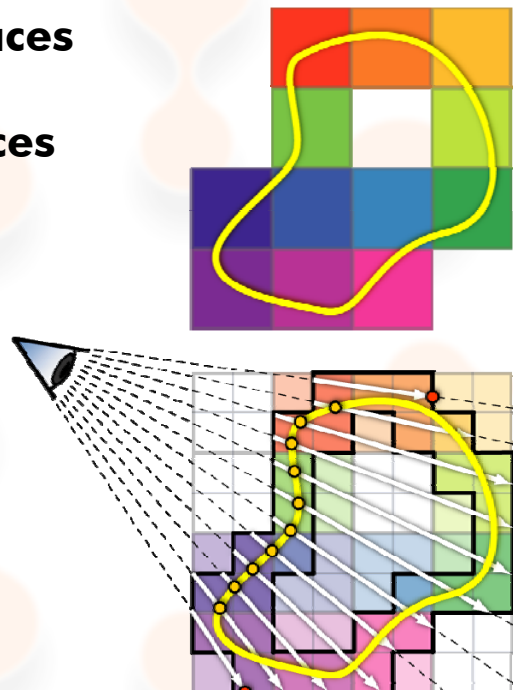


MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Object-Order Empty Space Skip. (3)

- Rasterize front and back faces of active min-max bricks
- Start rays on brick front faces
- Terminate when
  - Full opacity reached, or
  - Back face reached



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

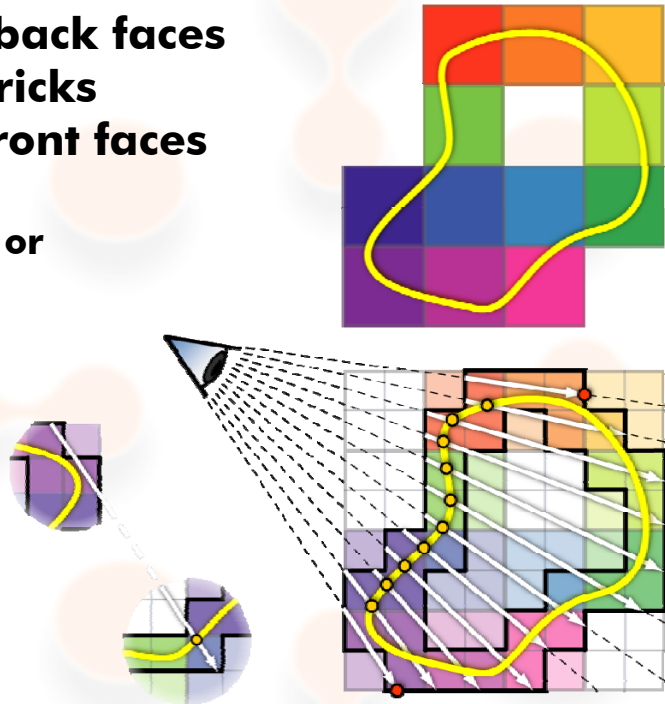




# Object-Order Empty Space Skip. (3)

- **Rasterize front and back faces of active min-max bricks**
- **Start rays on brick front faces**
- **Terminate when**
  - Full opacity reached, or
  - Back face reached

- **Not all empty space is skipped**



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Isosurface Ray-Casting

- **Isosurfaces/Level Sets**
  - scanned data
  - distance fields
  - CSG operations
  - level sets: surface editing, simulation, segmentation, ...



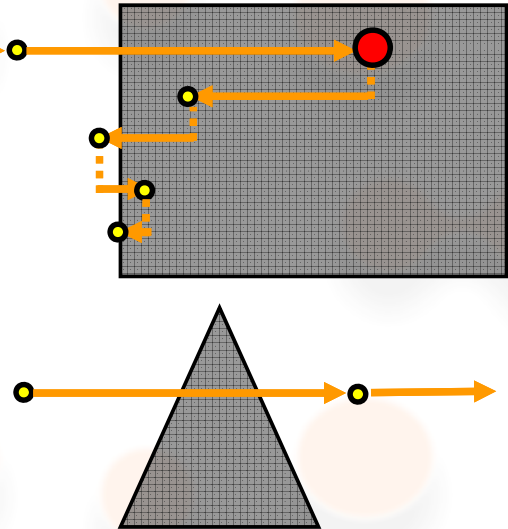
MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Intersection Refinement (1)

- Fixed number of bisection or binary search steps
- Virtually no impact on performance

- Refine already detected intersection
- Handle problems with small features / at silhouettes with adaptive sampling



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Intersection Refinement (2)

without refinement



with refinement



sampling rate 1/5 voxel (no adaptive sampling)



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Intersection Refinement (3)



Sampling distance 1.0, 24 fps



Sampling distance 5.0, 66 fps



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Deferred Isosurface Shading

- **Shading is expensive**
  - Gradient computation; conditional execution not free
- **Ray-casting step computes only intersection image**



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

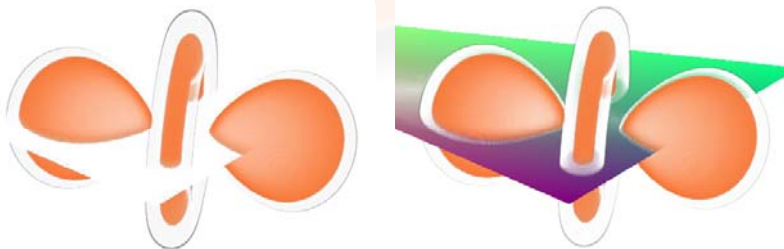


# Enhancements (1)

- Build on image-based ray setup
- Allow viewpoint inside the volume



- Intersect polygonal geometry



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Enhancements (2)

## 1. Starting position computation

⇒ Ray start position image

## 2. Ray length computation

⇒ Ray length image

## 3. Render polygonal geometry

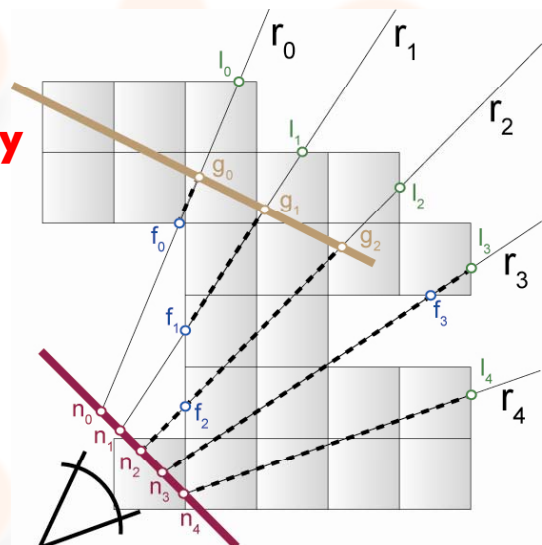
⇒ Modified ray length image

## 4. Raycasting

⇒ Compositing buffer

## 5. Blending

⇒ Final image



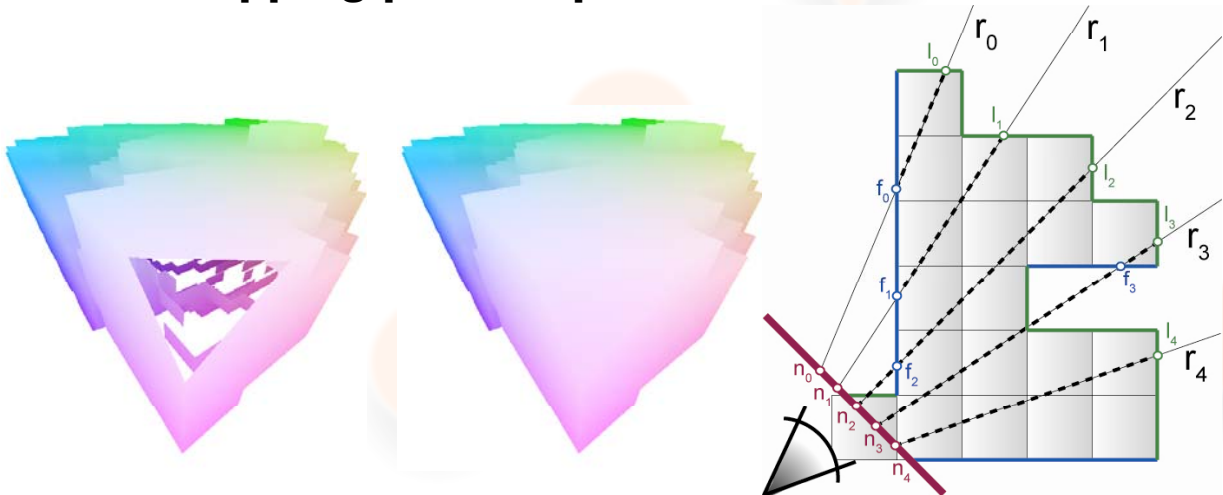
MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





# Moving Into The Volume (1)

- Near clipping plane clips into front faces



- Fill in holes with near clipping plane
- Can use depth buffer [Scharsach et al., 2006]



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Moving Into The Volume (2)

## 1. Rasterize near clipping plane

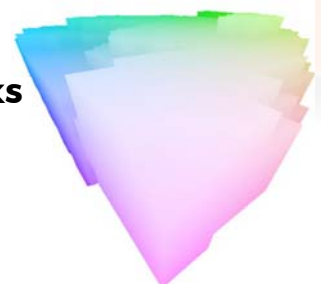
- Disable depth buffer, enable color buffer
- Rasterize entire near clipping plane

## 2. Rasterize nearest back faces

- Enable depth buffer, disable color buffer
- Rasterize *nearest back faces* of active bricks

## 3. Rasterize nearest front faces

- Enable depth buffer, enable color buffer
- Rasterize *nearest front faces* of active bricks



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Virtual Endoscopy

- Viewpoint inside the volume with wide field of view
- E.g.: virtual colonoscopy
- Hybrid isosurface rendering / direct volume rendering
- E.g.: colon wall and structures behind

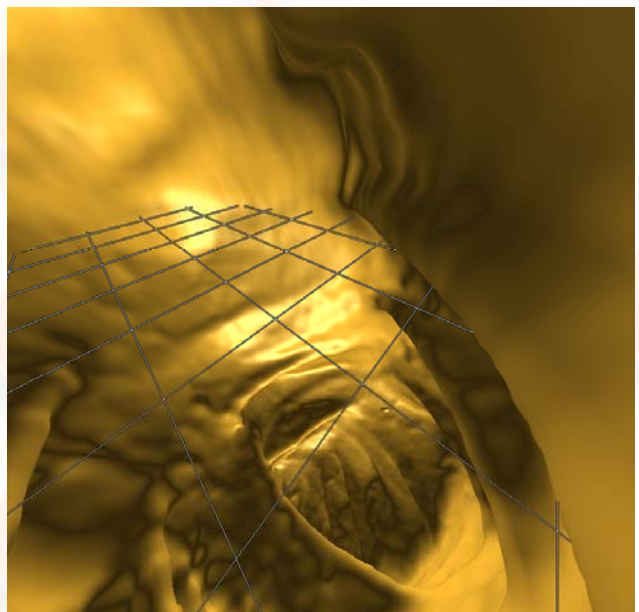
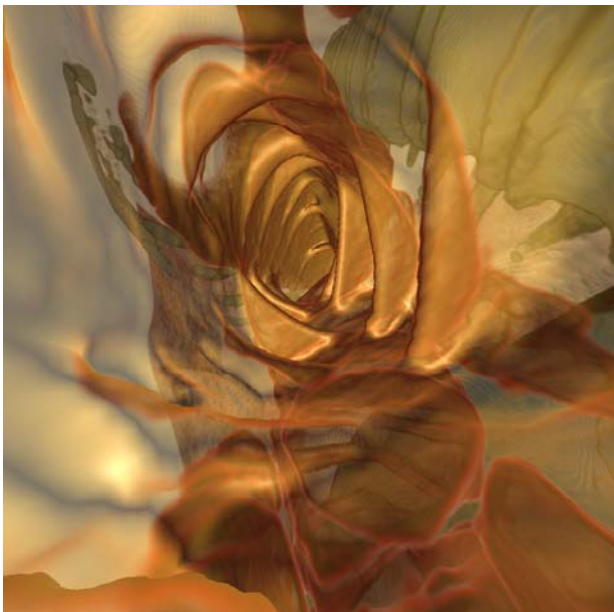


MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Virtual Colonoscopy

- First find isosurface; then continue with DVR

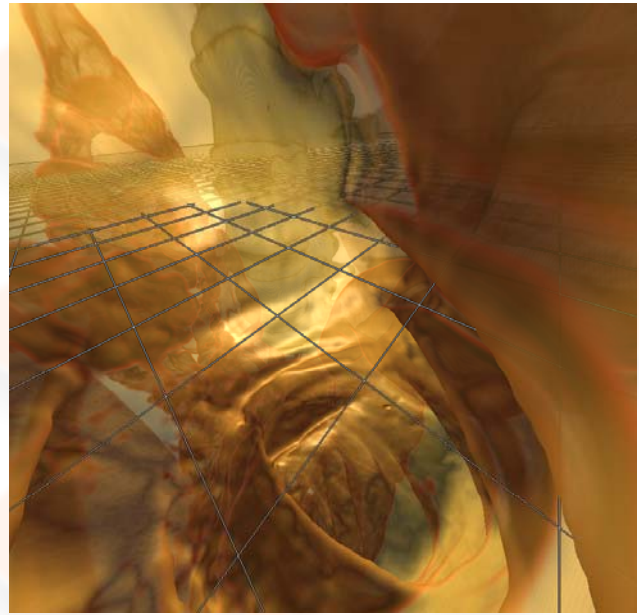
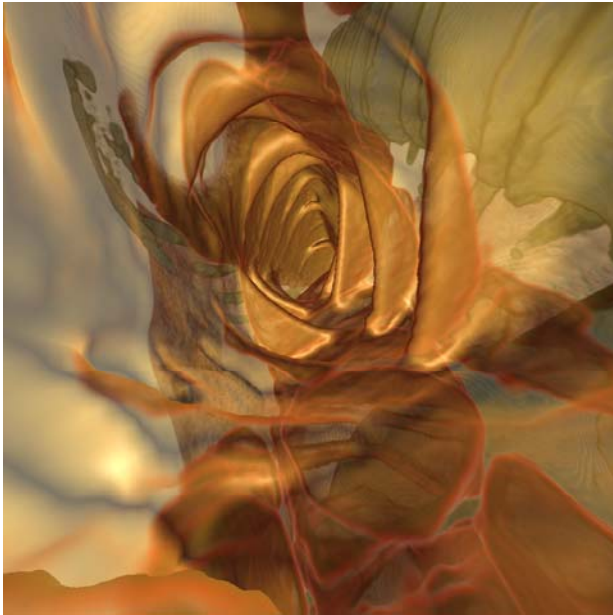


MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Virtual Colonoscopy

- First find isosurface; then continue with DVR



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Hybrid Ray-Casting (1)

- **Isosurface rendering**
  - Find isosurface first
  - Semi-transparent shading provides surface information
- **Additional unshaded DVR**
  - Render volume behind the surface with unshaded DVR
  - Isosurface is starting position
  - Start with ( 1.0-iso\_opacity )



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Hybrid Ray-Casting (2)

- Hiding sampling artifacts (similar to interleaved sampling, [Heidrich and Keller, 2001])

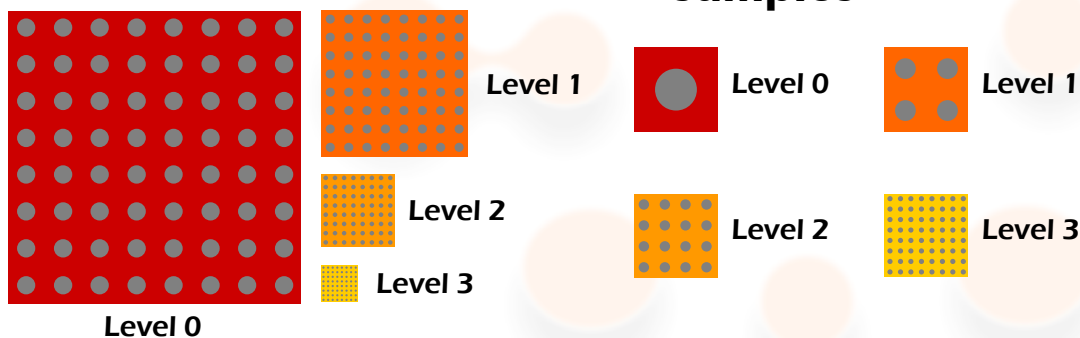


MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Multiresolution Volumes

- **Hierarchical blocking**
  - Constant data size
  - Lower resolution blocks cover increasing spatial size
- **Flat blocking structure**
  - Constant spatial size
  - Lower resolution blocks have fewer samples

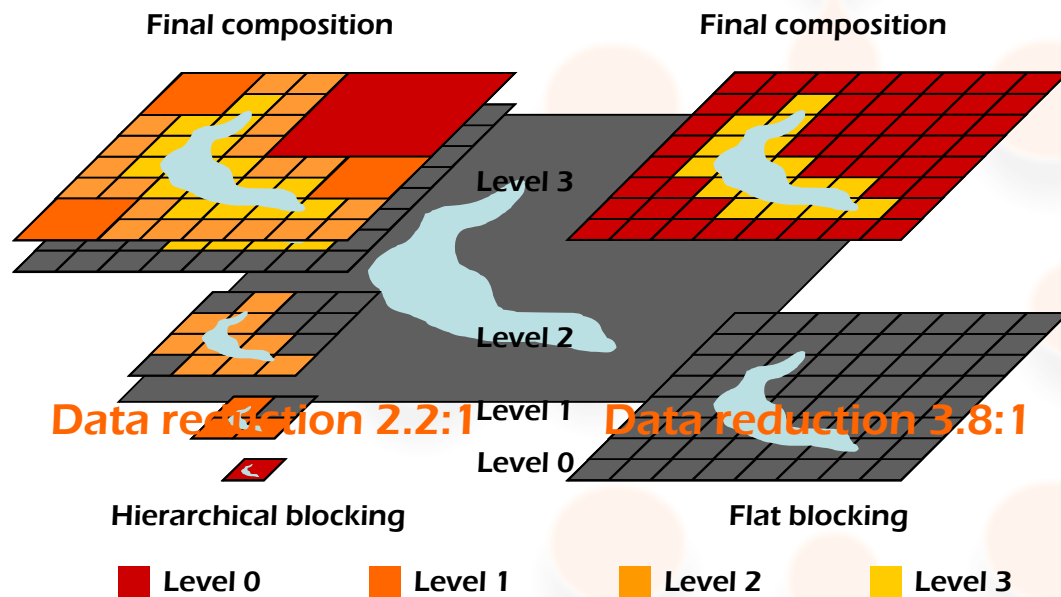


MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





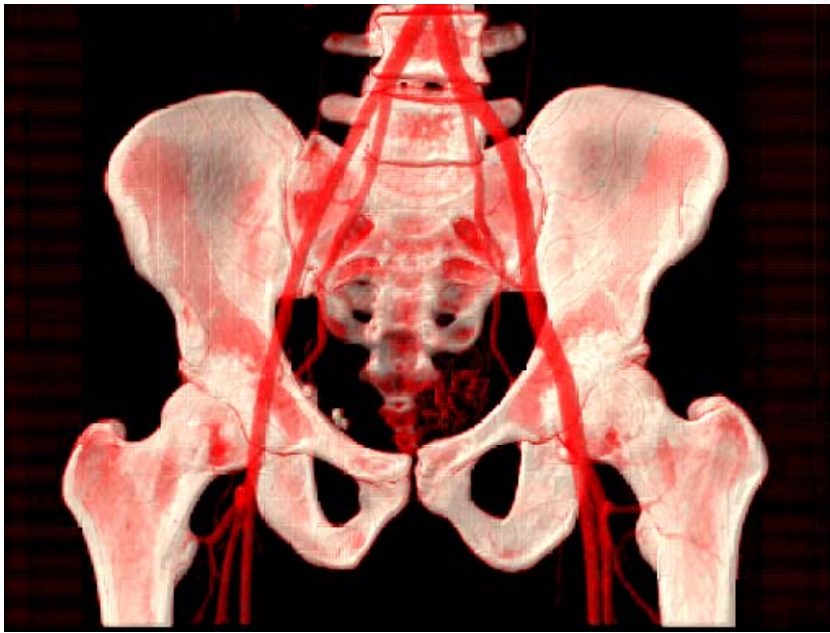
# Hierarchical vs Flat Blocking



## TF Based Level-of-Detail

- **Block resolution derived by TF content**
  - Content of a block in the current TF domain
  - **Empty:** All voxels are transparent
  - **Homogeneous:** Non-transparent voxels, similar color
  - **Varying:** Varying transparency, varying color
- **Block significance based on visual error**
  - Color difference from CIE  $L^*u^*v^*$ ,  $\Delta E$
  - Perceptually uniform
- **Optimize LOD to minimize visual error for a given memory limit**

# TF Based LOD Data Reduction



**144 MB, 512x512x384**



CIE L\*u\*v\*  $\Delta E$  error

Data Reduction:

**64:1**

**1.6 % (2.25 MB)**



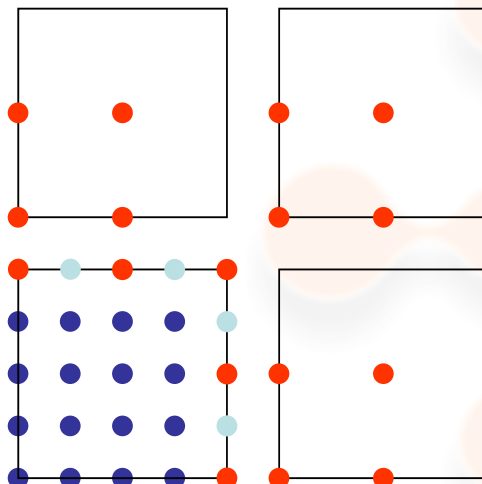
MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Sample replication and interpolation

### ● Single sided replication

#### ● Weiler et al. '00, Guthe et al. '02



Four-block neighborhood

Replicate samples from neighbors

Interpolate missing samples

Each block is self-contained,  
with varied overhead  
[Kraus & Ertl '02]

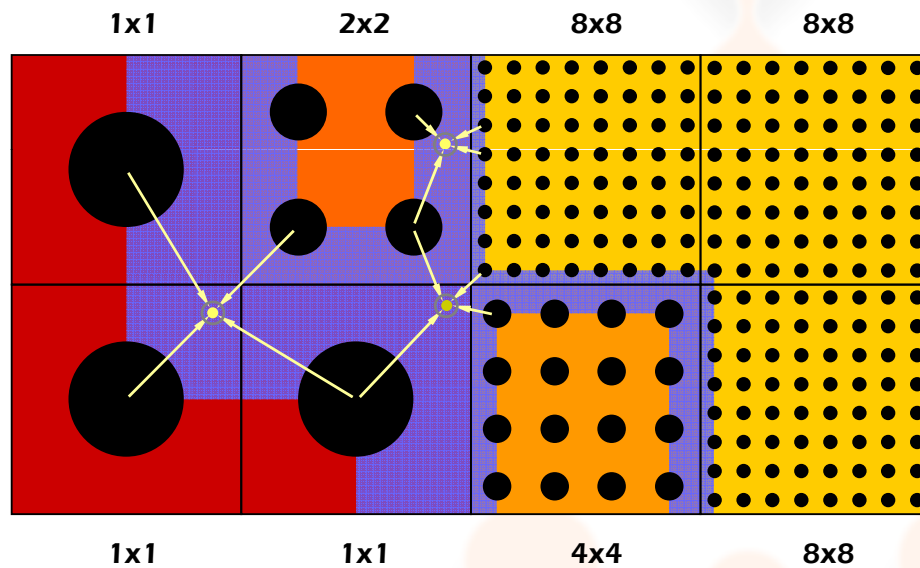
Double sided replication for  
improved continuity support  
[Weiler et al. '00]



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

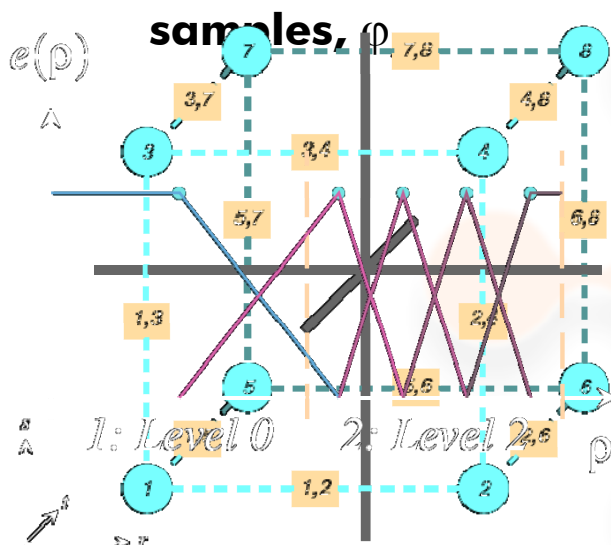


# Multiresolution Interblock Interpolation



## Interblock interpolation

### ● A normalized sum, $\phi$ , of bounded block

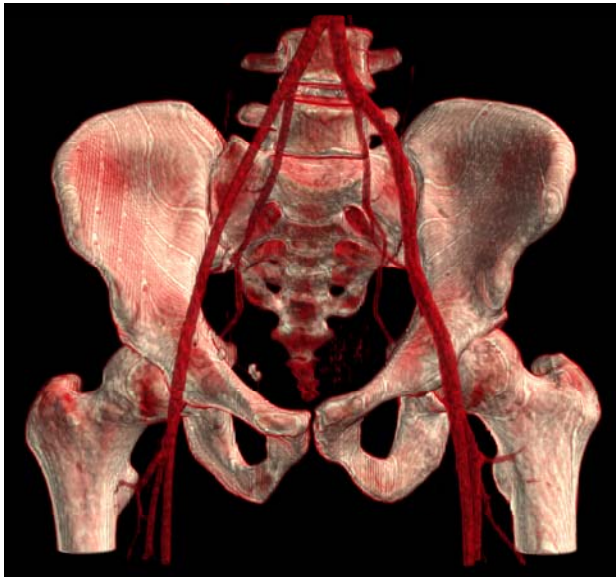


$$\begin{aligned}\omega_1 &= (1 - e_{1,2}) \cdot (1 - e_{1,3}) \cdot (1 - e_{1,5}) \\ \omega_2 &= e_{1,2} \cdot (1 - e_{2,4}) \cdot (1 - e_{2,6}) \\ \omega_3 &= (1 - e_{3,4}) \cdot e_{1,3} \cdot (1 - e_{3,7}) \\ \omega_4 &= e_{3,4} \cdot e_{2,4} \cdot (1 - e_{4,8}) \\ \omega_5 &= (1 - e_{5,6}) \cdot (1 - e_{5,7}) \cdot e_{1,5} \\ \omega_6 &= e_{5,6} \cdot (1 - e_{6,8}) \cdot e_{2,6} \\ \omega_7 &= (1 - e_{7,8}) \cdot e_{5,7} \cdot e_{3,7} \\ \omega_8 &= e_{7,8} \cdot e_{6,8} \cdot e_{4,8}\end{aligned}$$

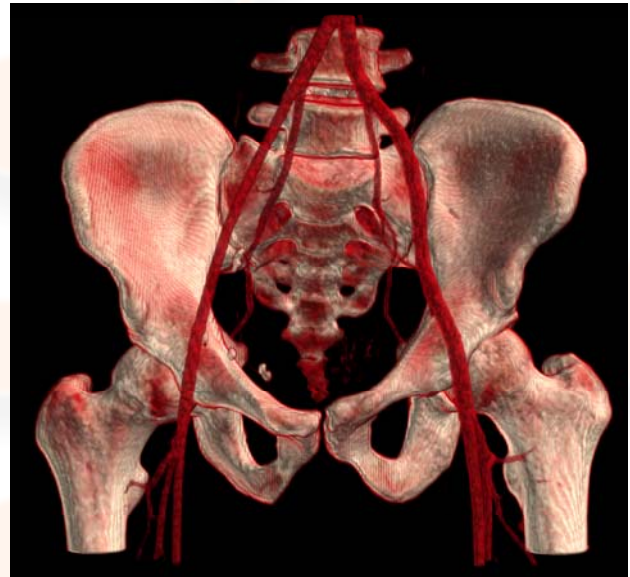
$$\phi = \frac{\sum_{b=1}^8 \omega_b \phi_b}{\sum_{b=1}^8 \omega_b}$$

# Interblock Interpolation

Data reduction 80:1 (1.25% of original data size)



Without Interblock Interpolation



With Interblock Interpolation



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Interblock Interpolation

Data reduction 40:1 (2% of original data size)



Data reduction 50:1 (2% of original data size)



Without Interblock Interpolation

With Interblock Interpolation

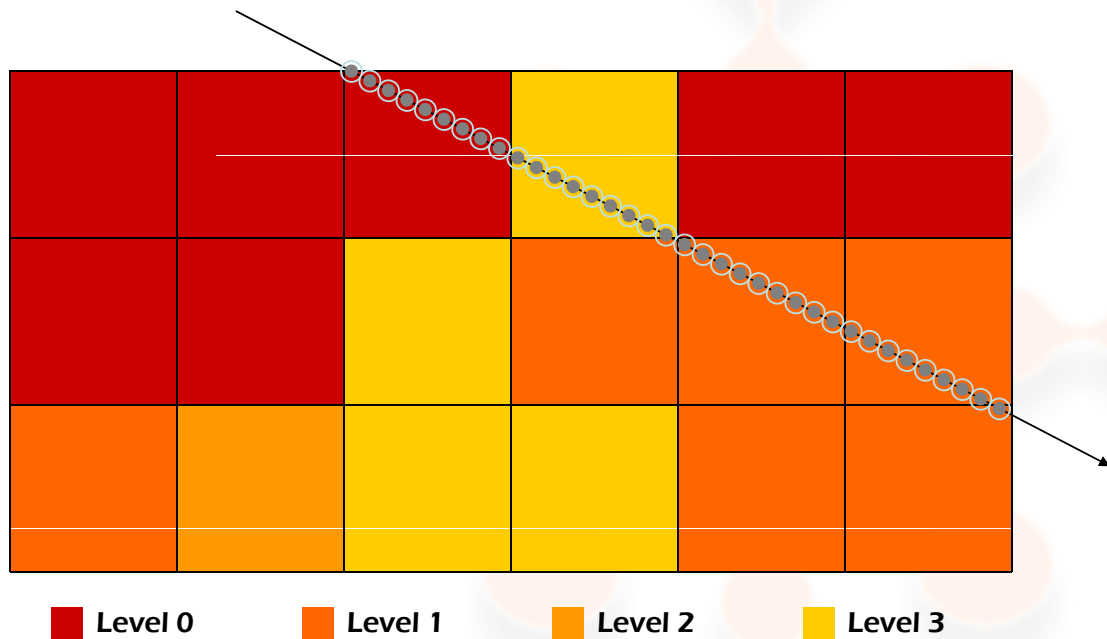


MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





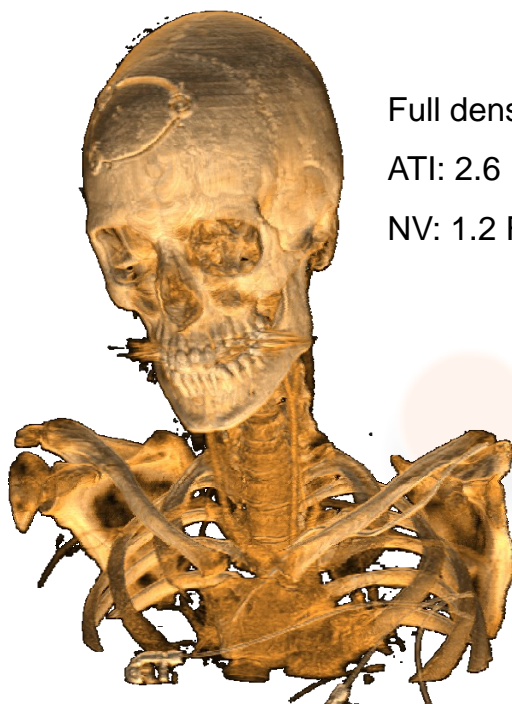
# Adaptive Volume Sampling



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Adaptive Volume Sampling



Full density

ATI: 2.6 FPS

NV: 1.2 FPS

- ATI X1800 XT 512MB

- NV GF7800 GTX 256MB

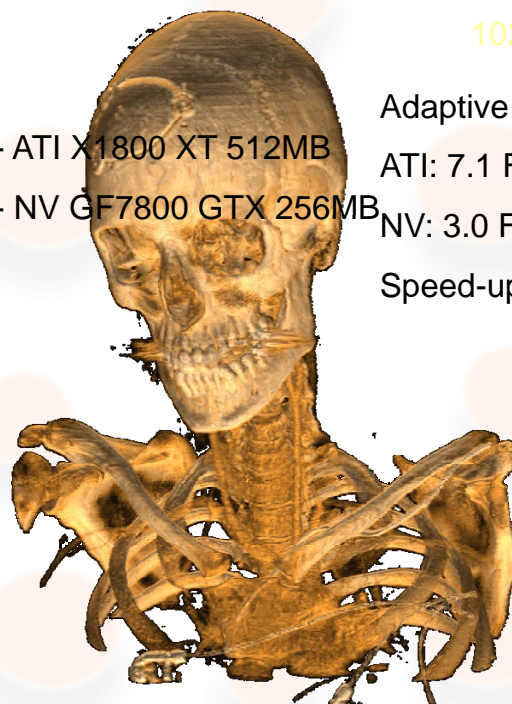
1024x1024

Adaptive density

ATI: 7.1 FPS

NV: 3.0 FPS

Speed-up: 2.6-2.8



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Out-of-Core Data Management

- **Disk performance**
  - Data transfer rates, about 60 MB/s
  - **Access density performance is still poor!!!**
  - Random access of many small blocks is bad
- **Group of blocks – GOBs**
  - Large pages: 24 – 192 kb
  - Spatial coherence
  - Minimizes disk read requests
- **Uncompressed storage**
- **Precomputed gradients**



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Out-of-Core Data Management

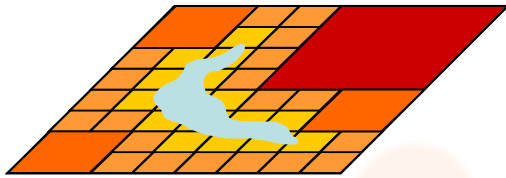


MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



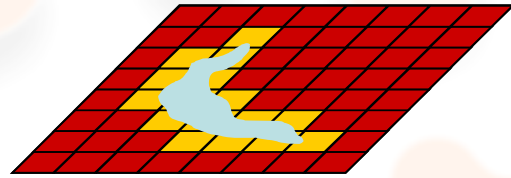
# Hierarchical vs Flat Blocking

## Hierarchical blocking



Final composition

## Flat blocking



Final composition

Data reduction 2.2:1

Data reduction 3.8:1

■ Level 0

■ Level 1

■ Level 2

■ Level 3



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

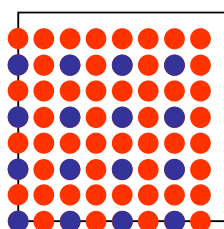


Multiresolution volume sampling : Intrablock sampling

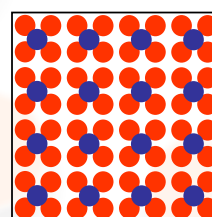
## Intrablock sampling

### Algorithm outline

- Determine closest block (nearest block sampling)
- Lookup block size and location in index texture
- Clamp sampling position to the block's sample boundary
- Lookup interpolated sample in the packed texture



Boundary aligned  
Sample replication  
Nearest neighbor  
downsampling



Centered  
Average value  
downsampling  
Wavelets



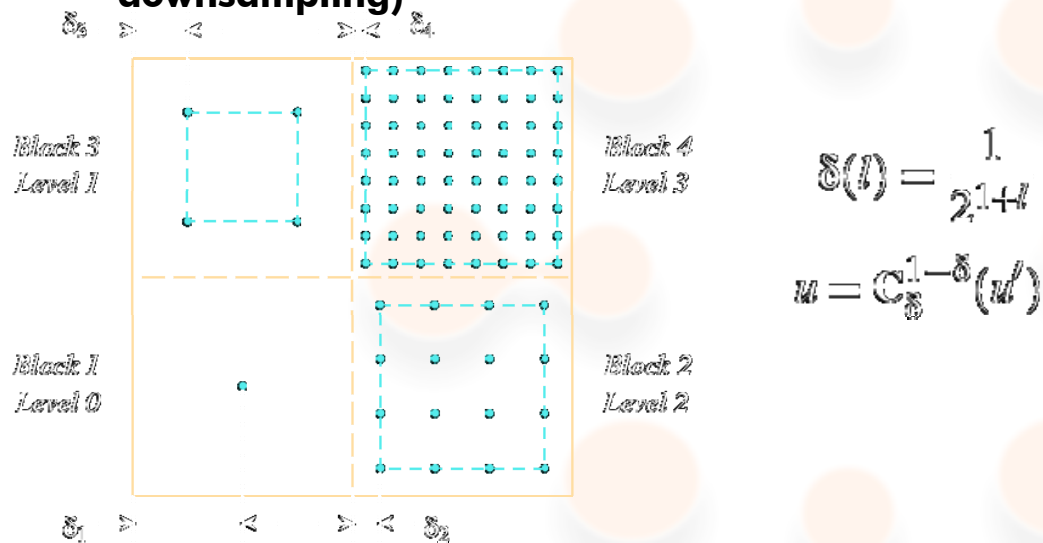
MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



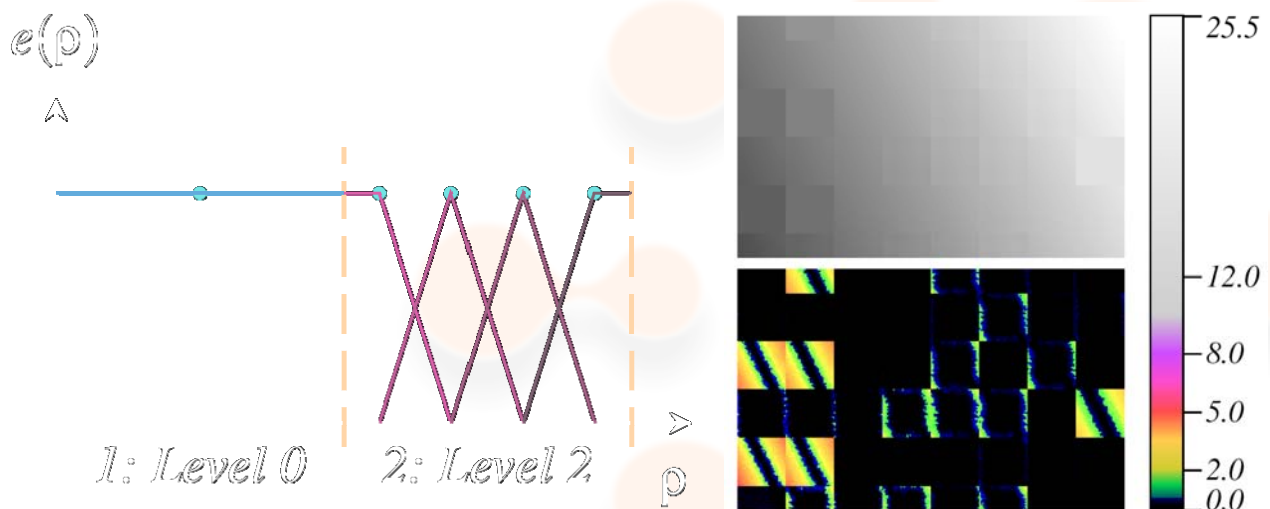
# Nearest block sampling

## Block sample boundary

- An inset,  $\delta$ , from block boundary (mean-value downsampling)

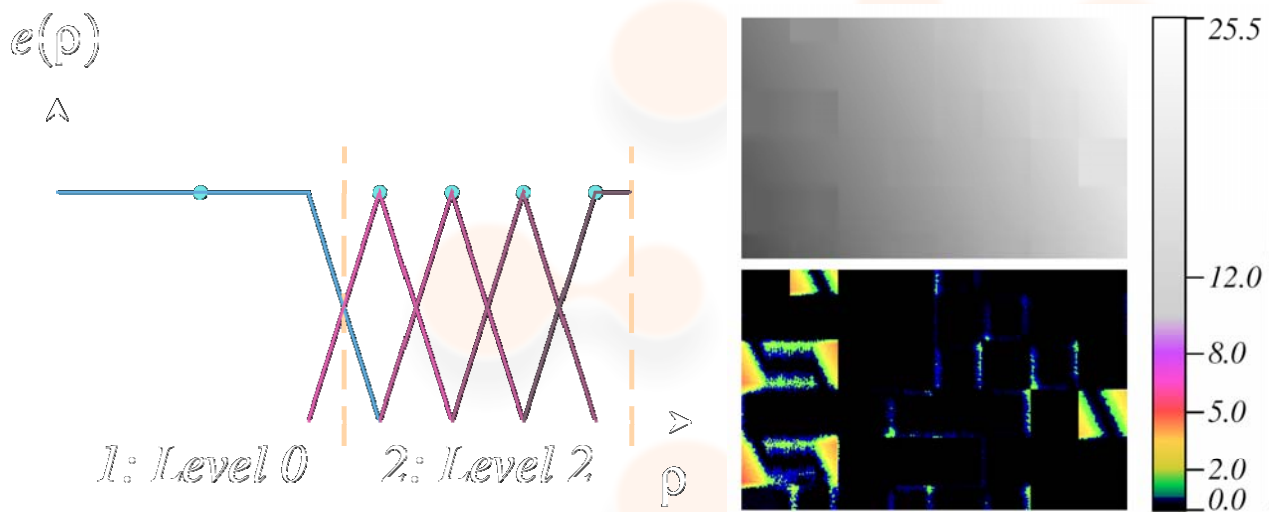


# No block interpolation

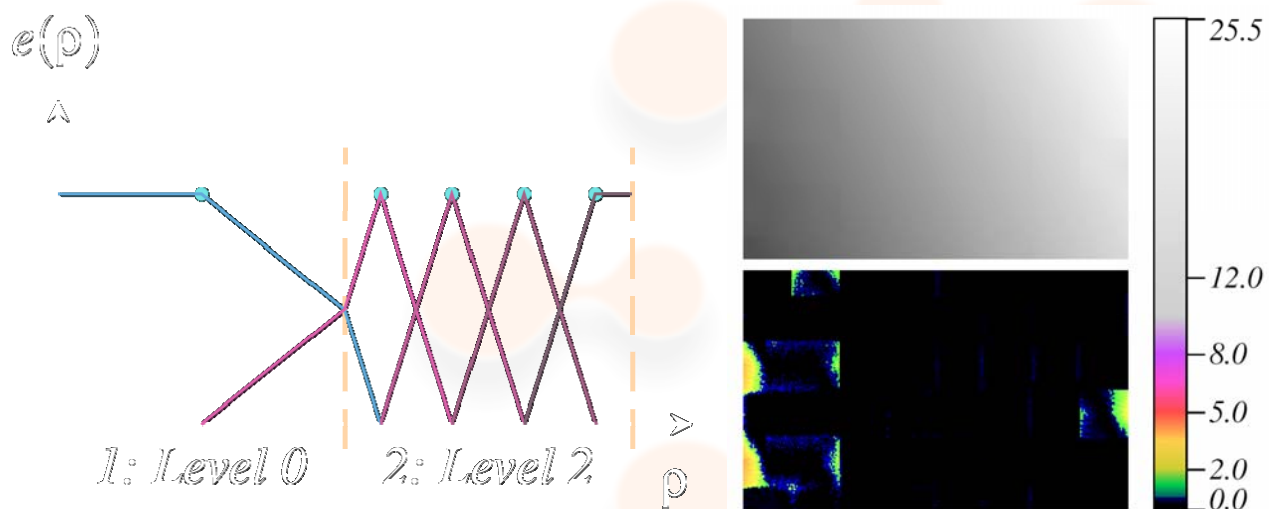




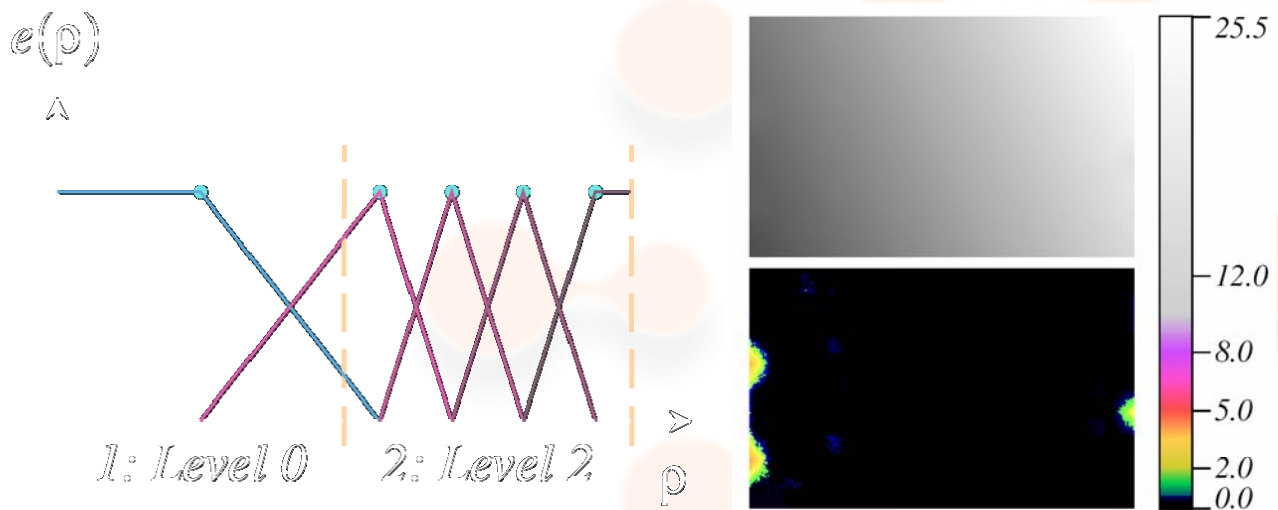
# Minimum distance edge weight



# Boundary split edge weight



# Maximum distance edge weight



## Conclusions

- **GPU ray-casting is an attractive alternative**
- **Very flexible and easy to implement**
- **Fragment shader conditionals are very powerful; performance pitfalls very likely to go away**
- **Mixing image-order and object-order well suited to GPUs (vertex and fragment processing!)**
- **Deferred shading allows complex filtering and shading at high frame rates**

# Thank You!

---



## Acknowledgments

- **Patric Ljung, Henning Scharsach, Christian Sigg, Daniel Weiskopf**



MARKUS HADWIGER, VRVIS RESEARCH CENTER, VIENNA, AUSTRIA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





## Light Interactions

**Markus Hadwiger**  
VR VIS Research Center  
Vienna, Austria



**Patric Ljung**  
Siemens Corporate Research  
Princeton, NJ, USA



**Christof Rezk Salama**  
Computer Graphics Group  
Institute for Vision and Graphics  
University of Siegen, Germany



**Timo Ropinski**  
Visualization and Computer  
Graphics Research Group,  
University of Münster, Germany



## Specular Reflections Through Ray-Tracing

**Markus Hadwiger**  
VR VIS Research Center  
Vienna, Austria



**Patric Ljung**  
Siemens Corporate Research  
Princeton, NJ, USA



**Christof Rezk Salama**  
Computer Graphics Group  
Institute for Vision and Graphics  
University of Siegen, Germany

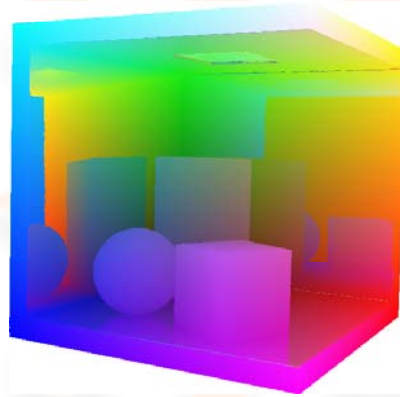


**Timo Ropinski**  
Visualization and Computer  
Graphics Research Group,  
University of Münster, Germany



## Higher Order Rays

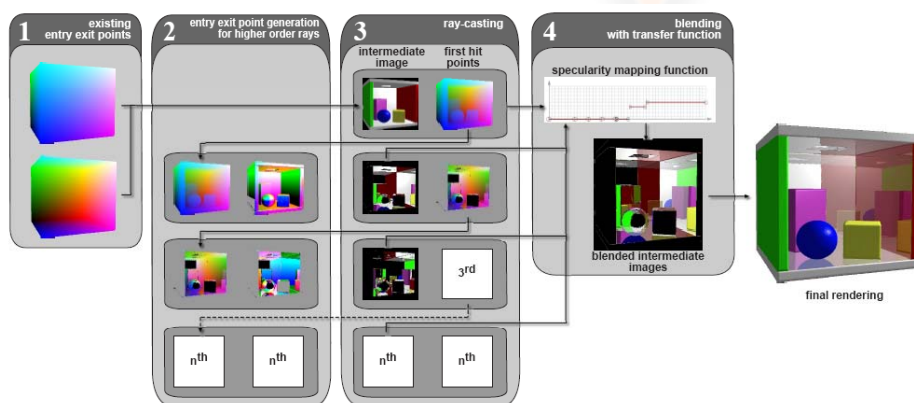
- Entry parameter texture can be modified for tracing higher order rays



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Higher Order Rays

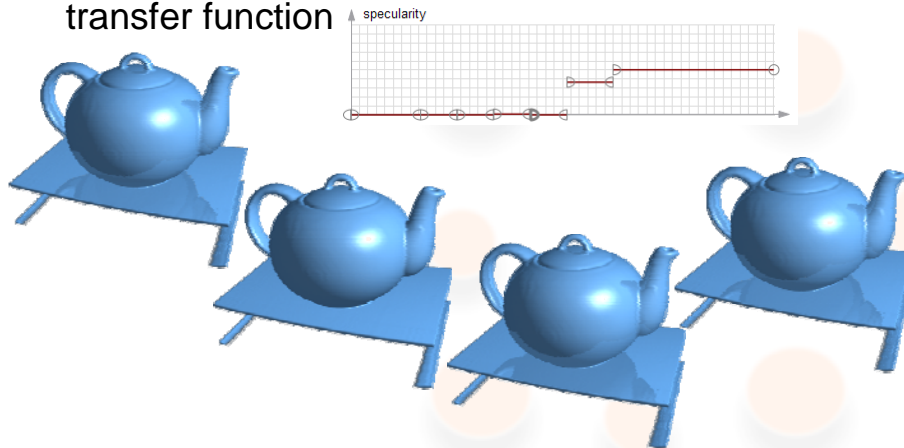


TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Specular Reflections

- Degree of specularity can be controlled with a transfer function



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Soft vs. Hard Shadows

Markus Hadwiger  
VR VIS Research Center  
Vienna, Austria



Patric Ljung  
Siemens Corporate Research  
Princeton, NJ, USA



Christof Rezk Salama  
Computer Graphics Group  
Institute for Vision and Graphics  
University of Siegen, Germany



Timo Ropinski  
Visualization and Computer  
Graphics Research Group,  
University of Münster, Germany



## Why adding Shadows?

- Adding interactive shadows to volume graphics supports spatial comprehension
- Focus on shadow algorithms integrationable into GPU-based raycasters



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Object- vs. Image-Based

- Object-based
  - object-based shadow algorithms like Crow's shadow volumes
  - require polygonal representation of rendered objects
- Image-based
  - representation of shadows in an image
  - shadow mapping by Williams (1978)
  - opacity shadow maps
  - deep shadow maps (allow transparent objects)

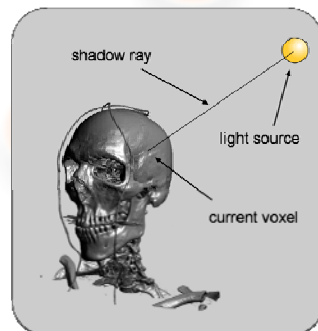


TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Shadow Rays

- similar to shadow rays in raytracing
  - opaque occluders (similar to first hit raycasting)
  - alpha raycasting
  - 3D-textures can be used for caching results

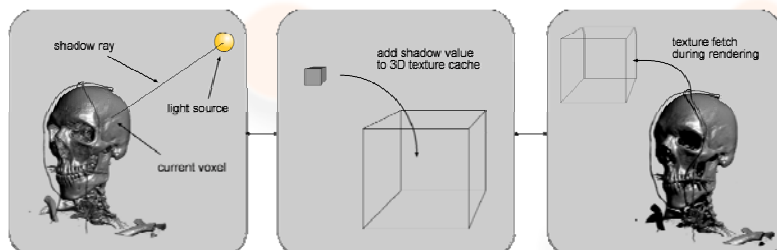


TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## 3D Texture Caching

- Shadows can be cached in 3D Textures to gain performance
  - 3D-texture for shadow lookup
  - preprocessing shadow feelers
  - needs to be recomputed on light source or transfer function change



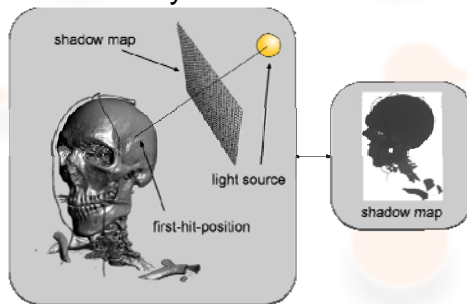
TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





## Shadow Mapping

- Shadow map saves depth values of first hit points as seen from the light source
  - depth comparison during rendering gives binary decision for shadowing
  - shadow threshold marks intensity limit
  - supports opaque occluders only

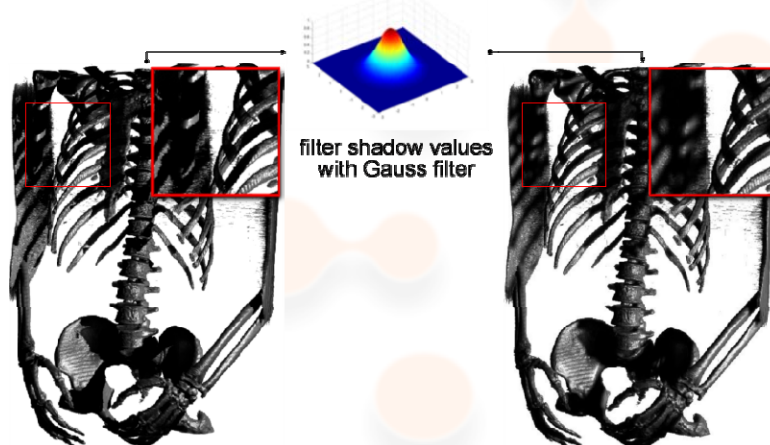


TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Shadow Mapping

- Filtering of shadow map reduces artifacts



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





## Semi-Transparent Shadows

Markus Hadwiger  
VR VIS Research Center  
Vienna, Austria



Patric Ljung  
Siemens Corporate Research  
Princeton, NJ, USA



Christof Rezk Salama  
Computer Graphics Group  
Institute for Vision and Graphics  
University of Siegen, Germany

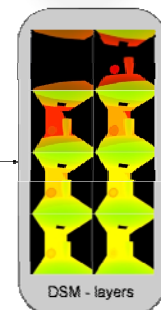
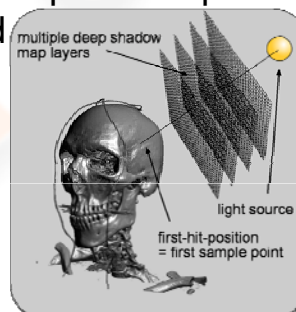
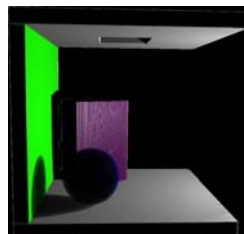


Timo Ropinski  
Visualization and Computer  
Graphics Research Group,  
University of Münster, Germany



## Deep Shadow Maps

- Support semi-transparent occluders by incorporating multiple layers
- Each layer is a pair of depth and transparency
- For each pixel control points of piecewise linear functions are saved

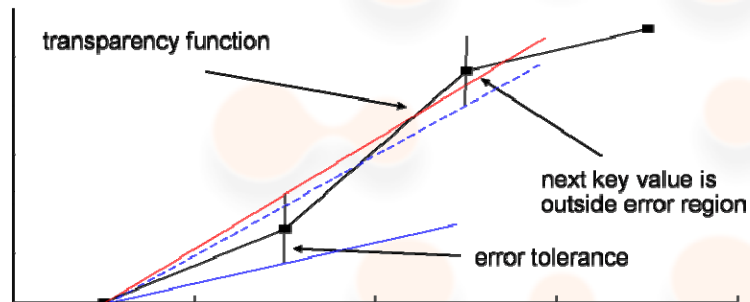


TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Deep Shadow Maps

- Shadow map construction
  - At the first hit point, the first key value is saved
  - Based on a error function, further key values are saved

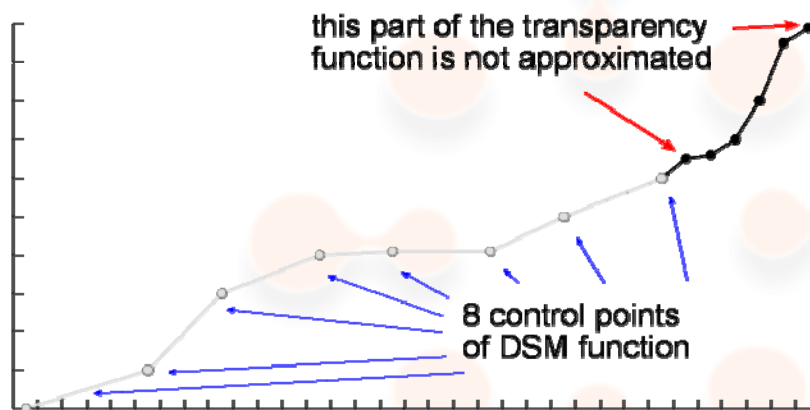


TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Deep Shadow Maps

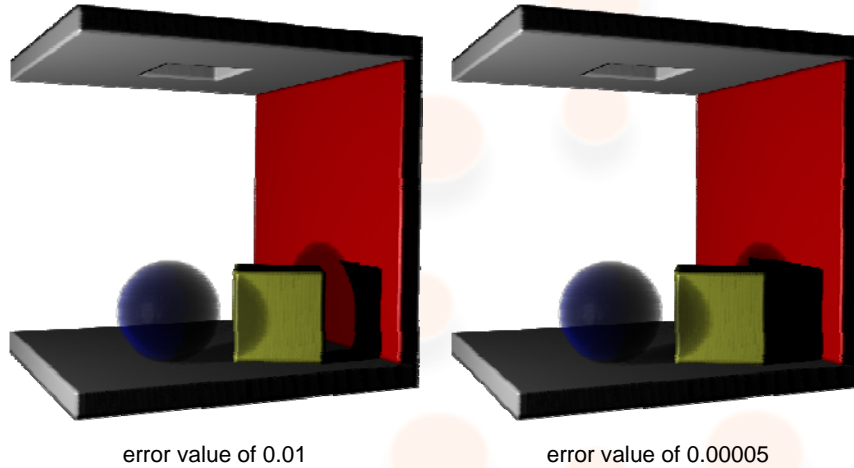
- Original function differs by the chosen error value



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Approximation Artifacts



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## DSM Performance

Shadow Mode	RC	without RC
ShadowRay (B)	10.03	10.03
ShadowRay (A)	10.0	10.0
ShadowRay (B + PP)	5.59	46.0
ShadowMap (B)	29.08	45.5
DeepShadowMap (A)	15.76	34.5
DeepShadowMap (A + PP)	13.06	45.2

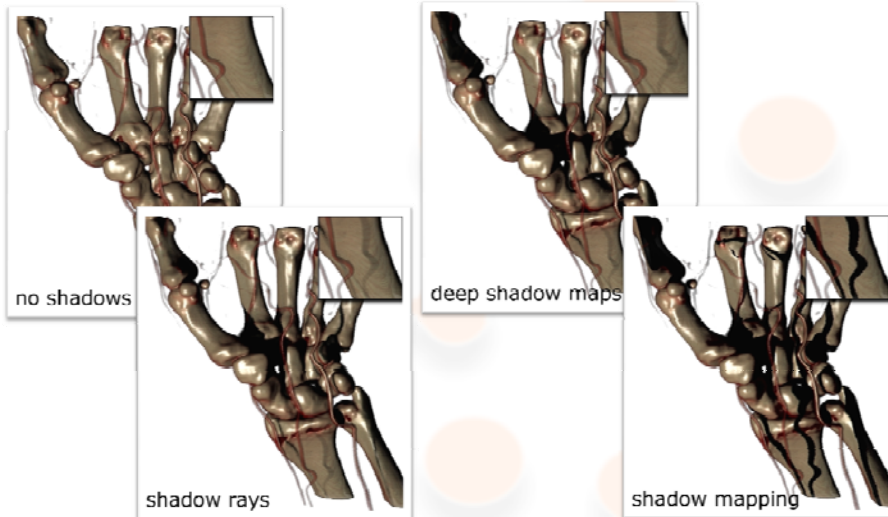
- Intel Core2 6600 (2.4GHz), 2GB RAM and an nVidia GeForce 8800GTX



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Results



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Simulation of Color Bleeding

Markus Hadwiger  
VR VIS Research Center  
Vienna, Austria



Patric Ljung  
Siemens Corporate Research  
Princeton, NJ, USA



Christof Rezk Salama  
Computer Graphics Group  
Institute for Vision and Graphics  
University of Siegen, Germany

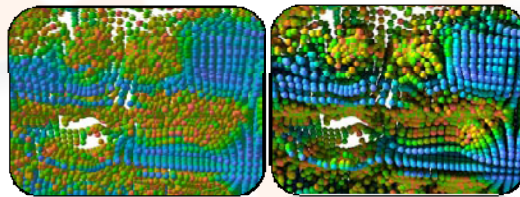


Timo Ropinski  
Visualization and Computer  
Graphics Research Group,  
University of Münster, Germany



## Indirect Illumination

- Langer, Bühlhoff: *Depth Discrimination from Shading under Diffuse Lighting* [Perception 00]:  
 „... depth discrimination under *diffuse lighting is superior* to that predicted by a classical sunny day model, ...“
- Gribble, Parker: *Enhancing Interactive Particle Visualization with Advanced Shading Models* [APGV06]



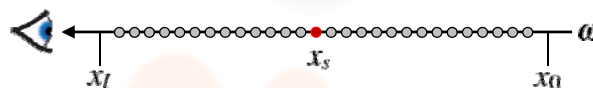
TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
 ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Motivation

- Standard volume rendering integral
  - Captures *emission and absorption* only

$$I(x_l, \omega) = T(0, l) \cdot I(x_0, \omega) + \int_0^l T(s, l) \cdot E(x_s) ds$$



- *No diffuse interreflection (as well as scattering) can be captured*



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
 ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Motivation

- Transfer functions influence displayed structures and therefore light interactions  
 ⇒ Precomputation with surface-based techniques not possible

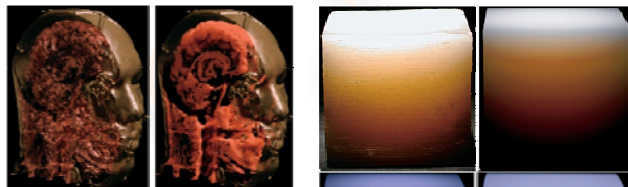


TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
 ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

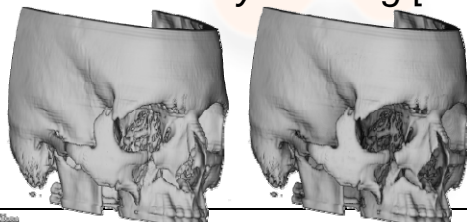


## Related Work

- Kniss et al.: *Global Volume Illumination* [TVCG03]



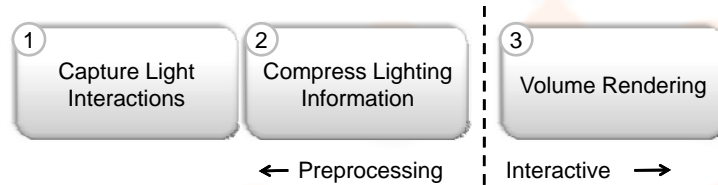
- Stewart: *Vicinity Shading* [Vis03]



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
 ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



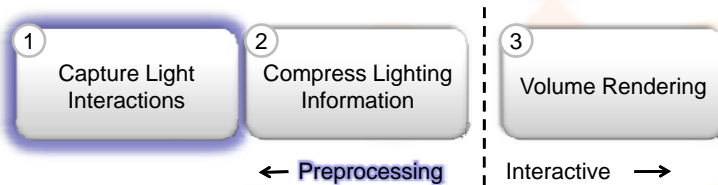
## Workflow



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Workflow



- Light interactions
  - ... are captured for the **vicinity** only
  - ... are expressed by using a **local histogram**

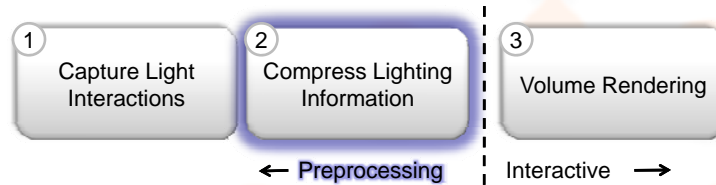


TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





## Workflow



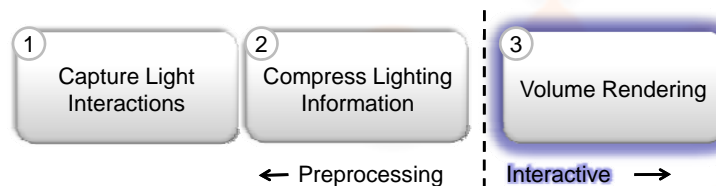
- One local histogram for each voxel results in **unmanageable data sizes**
- Light information is **clustered** to handle it interactively during rendering



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Workflow



- Rendering parameters are **changed frequently**
- Representative local histograms can be **modulated interactively**
- Volume rendering requires only **two additional texture fetches**



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Workflow



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

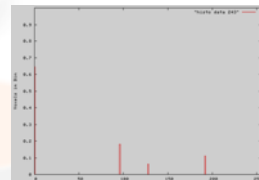
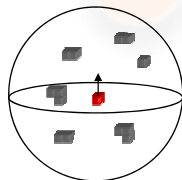


## Histogram Generation

- Analyze vicinity of each voxel
- Compute a **normalized local histogram** w  $n = 2^b$  bins

$$LH(x) = (LH_0(x), \dots, LH_{n-1}(x))$$

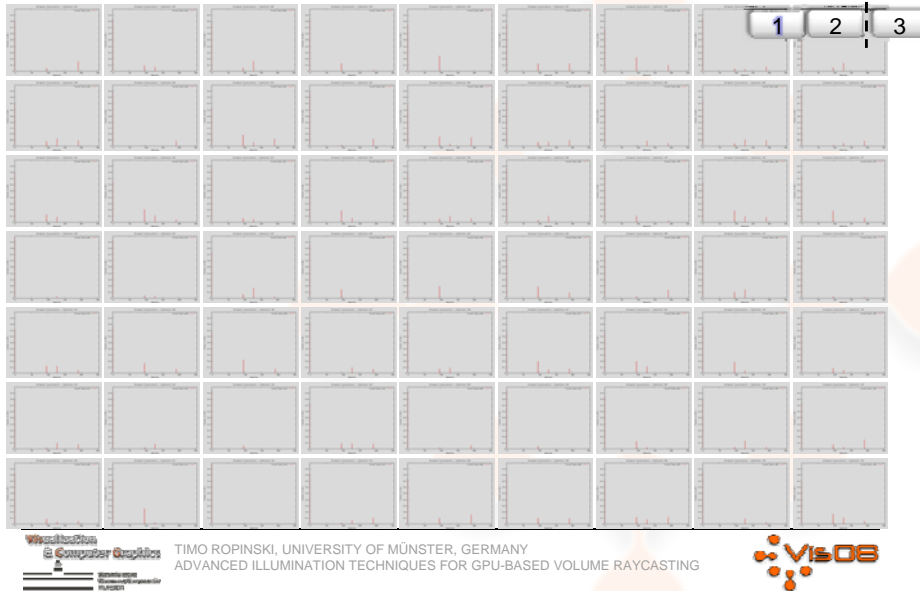
$$LH_k(x) = \sum_{\substack{\tilde{x} \in S_f(x) \\ \tilde{x} \neq x}} f_{dist} \left( \frac{|x - \tilde{x}|}{d_{min}} \right) \cdot g(f(\tilde{x}), k)$$



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

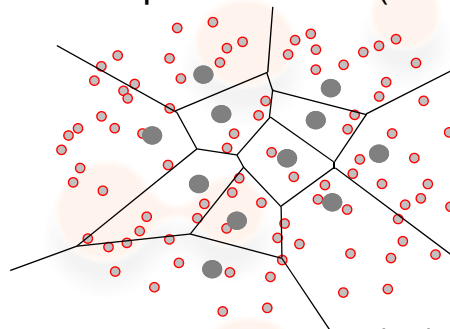


## Histogram Generation



## Histogram Clustering

- **Given:**  $n$  local histograms (vectors)
- **Desired:**  $m \ll n$  representatives (*code book*)

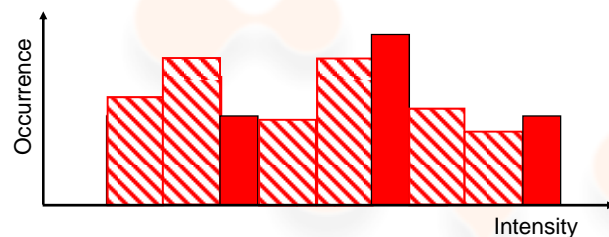


- We exploit a **vector quantization** (vq) for the clustering

## Histogram Compression

- Goal: generate a packed histogram with  $j \ll i$  bins ( $i$  = initial number of bins)
- *Iterative splitting* is used to reduce histogram dimensionality

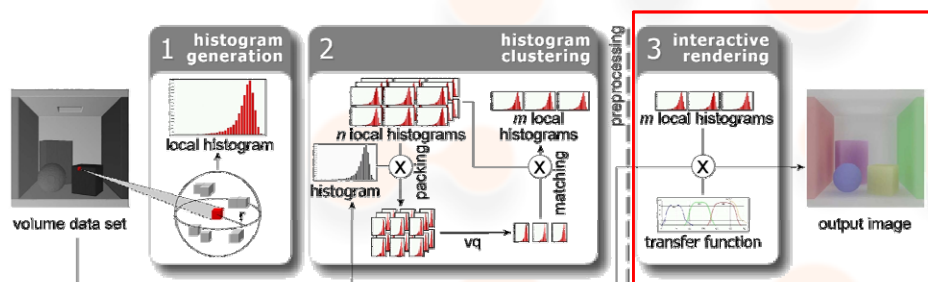
- Example:  $i = 12, j = 9$



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Detailed Workflow

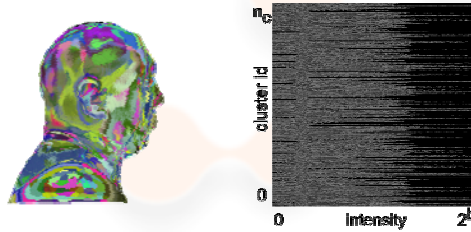


TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Interactive Rendering

- Two additional texture fetches required
  1. Obtain the cluster ID of the current sample  $x$
  2. Fetch the current environment color  $E_{env}(x)$



- $E_{env}(x)$  is computed by considering the current transfer function



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Isosurface Shading

- Combination with the transfer function

$$O_{env}(x, \nabla \tau(f(x))) = \frac{1}{\frac{2}{3}\pi r^3} \sum_{0 \leq j < 2^b} \tau_{\alpha}(j) \cdot LH_j(x)$$



- Apply **Phong shading** by using

$$I_a(x) = 1.0 - O_{env}(x, \nabla \tau(f(x))) \cdot Col_{iso}$$



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



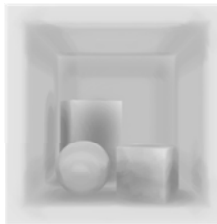


## Isosurface Shading

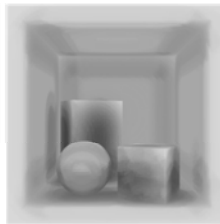
- Occlusion term can be weighted

1 2 3

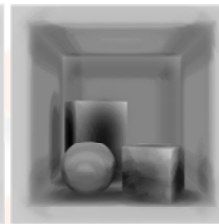
$$I_a(x) = 1.0 - O_{env}(x, \nabla \tau(f(x))) \cdot Col_{iso} \cdot \underline{g}$$



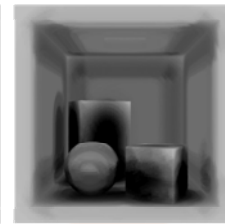
$g=0.75$



$g=1.0$



$g=1.25$



$g=1.5$

$n_c=512$

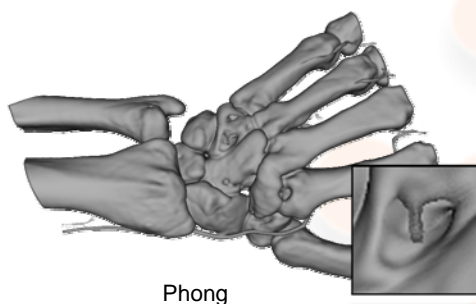


TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

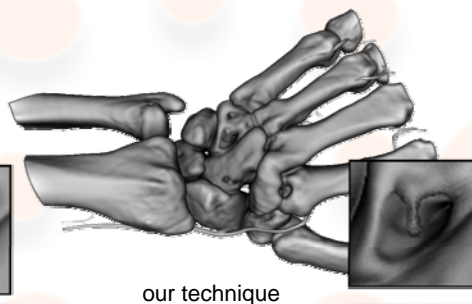


## Isosurface Shading

1 2 3



Phong



our technique

$n_c=2048$



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Demonstration Video I

1 2 3



$n_c=2048$



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Direct Volume Rendering

1 2 3

### Challenges

- More than one hue is present
- Areas with participating media may occur

### Combination with the transfer function

$$E_{env}(x, \nabla \tau(f(x))) = \frac{1}{\frac{2}{3}\pi r^3} \sum_{0 \leq j < 2^b} \tau_\alpha(j) \cdot \tau_{rgb}(j) \cdot LH_j(x)$$



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

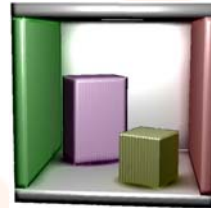
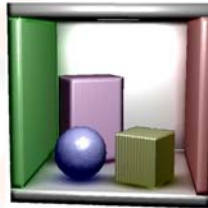


## Direct Volume Rendering

- Rendering is done in **YUV color space**
- **Color**: Interpolate between  $E_{env}$  and  $\tau_{rgb}(x)$ 
  - $O_{env}$  is used as the interpolation factor
- **Luminance**: minimum of  $1.0 - O_{env}$  and  $\nabla \tau(f(x)) \cdot L$
- **Specular highlights** can be added



$E_{env}$  only



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

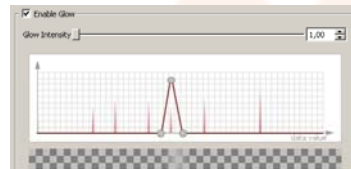


## Rendering – 3D Glow

- Volumetric glow can be realized by exploiting an additional texture fetch

$$E_{env}(x, \nabla \tau(f(x))) = \frac{1}{\frac{2}{3}\pi r^3} \sum_{0 \leq j < 2^b} \tau_{\alpha}(f(x)) \cdot \tau_{rgb}(f(x)) \cdot LH_j(x) \cdot \underline{h(f(x))}$$

- Exploiting a glow mapping function

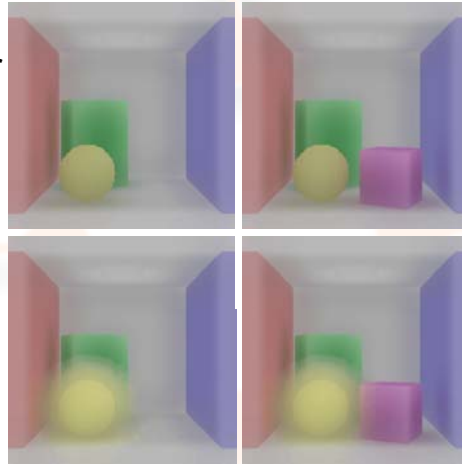


TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Rendering Wrapup

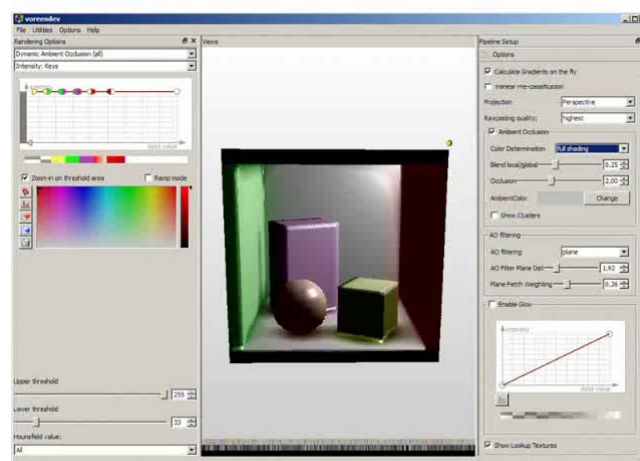
- Indirect illumination can be captured independently of the currently set transfer function



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



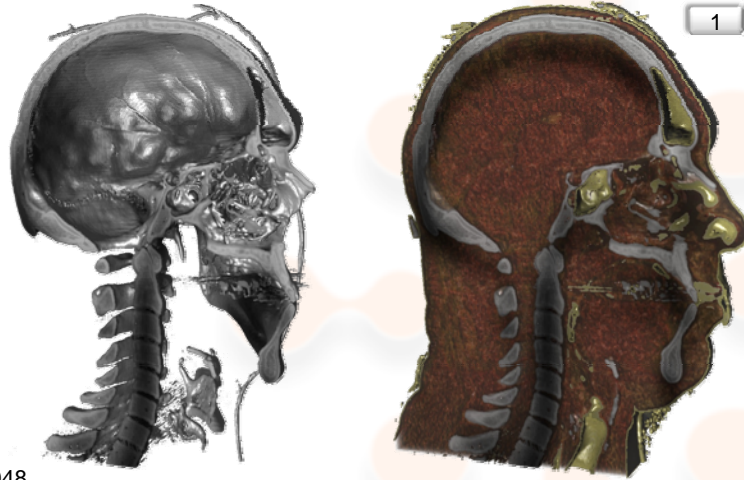
## Demonstration Video II



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Application Example - DVR



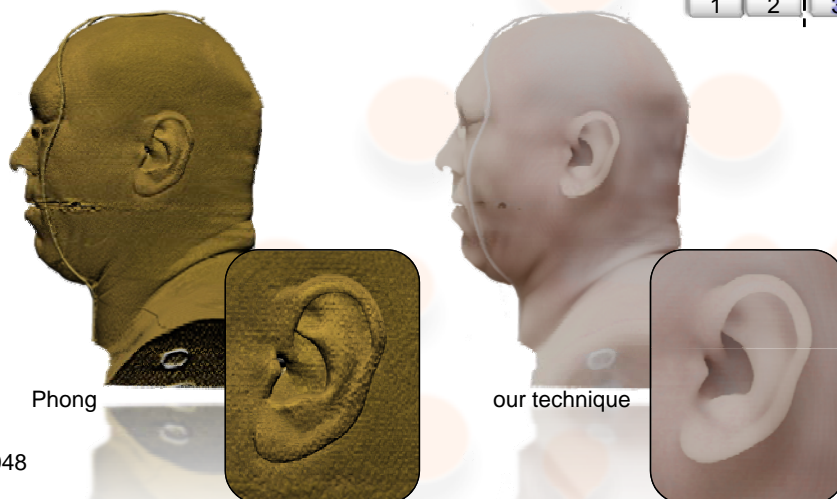
$n_c=2048$



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Application Example - DVR



Phong

our technique

$n_c=2048$

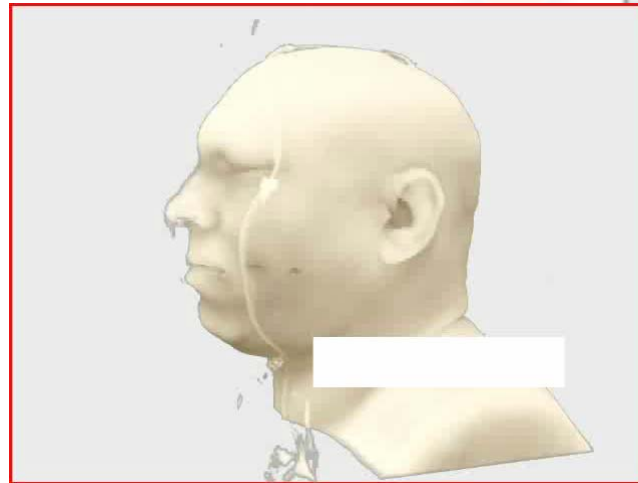


TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





## Demonstration Video III



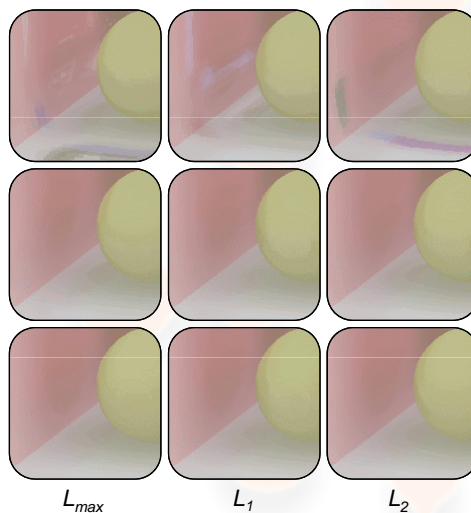
$n_c=2048$



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Varying Distance Metrics



$n_c=256$

$n_c=512$

$n_c=1024$

$L_{max}$

$L_1$

$L_2$



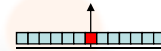
TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Surface Filtering

- Too few clusters lead to **quantization artifacts**
- A **surface filter** is used to reduce artifacts

1 2 3



$n_c=512$



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Performance

1 2 3

data set	size (voxel <sup>3</sup> )	sphere size (radius)	hist. gen. (min.)	training parameters (codewords/packed dim)	training (min.)	local histo- gram size	codebook size
Cornell box	128 × 128 × 128	32	236.03	256/16 512/16 1024/16	2.10 7.08 21.90	2048 MB	0.01 MB
Visible Human head	192 × 192 × 110	12 16 24	16.63 38.71 132.40	2048/64	528.58 484.31 510.01	3960 MB	0.5 MB
	256 × 256 × 147	16	101.60	2048/64	704.21	9408 MB	0.5 MB
	512 × 512 × 294	32	3025.38		— <sup>a</sup>	75264 MB	0.5 MB
hand	244 × 124 × 257	20	514.31 <sup>b</sup>	2048/64	633.80	7593 MB	0.5 MB
feet <sup>b</sup>	128 × 64 × 128	12	15.98	2048/64	320.81	1024 MB	0.5 MB
data sets computed using pre-processing with performance improved implementation							
cloud	256 × 128 × 128	24	6.03	2048/16	5.03	4096 MB	0.5 MB
Visible Human head	256 × 256 × 147	16	10.26	2048/64	61.60	9408 MB	0.5 MB

<sup>a</sup> not calculated. <sup>b</sup> calculated on a machine with 4 × Xeon 2.8.



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Implementation

## ● Preprocessing

- Realized in C++
- Parallelization with OpenMP
- 8 processor cluster system  
(AMD Opteron 852, 2.6 GHz)



## ● Rendering

- OpenGL in combination with GLSL
- GPU-based ray-casting [Roettger et al. 2003]



TIMO ROPINSKI, UNIVERSITY OF MÜNSTER, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





---

# Advanced Illumination Techniques for GPU-Based Volume Raycasting

---

Markus Hadwiger  
VR VIS Research Center  
Vienna, Austria



Patric Ljung  
Siemens Corporate Research  
Princeton, NJ, USA



Christof Rezk Salama  
Computer Graphics Group  
Institute for Vision and Graphics  
University of Siegen, Germany



Timo Ropinski  
Visualization and Computer  
Graphics Research Group,  
University of Münster, Germany



---

# Local Ambient Occlusion in DVR

---

Markus Hadwiger  
VR VIS Research Center  
Vienna, Austria



Patric Ljung  
Siemens Corporate Research  
Princeton, NJ, USA



Christof Rezk Salama  
Computer Graphics Group  
Institute for Vision and Graphics  
University of Siegen, Germany

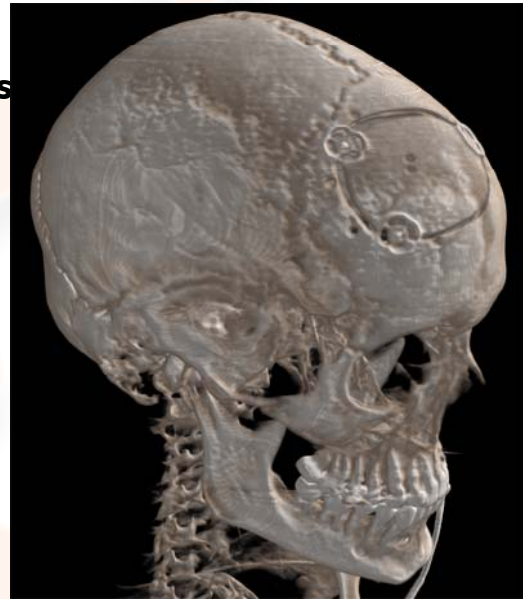


Timo Ropinski  
Visualization and Computer  
Graphics Research Group,  
University of Münster, Germany



# Motivation

- **Improve medical diagnosis**
  - Perception of shapes, densities and depth
- **Diffuse (surface) illumination not suitable for**
  - Noisy data sets
  - Volumetric data
- **Hernell et al. 2007, Ljung et al. 2004, 2006**

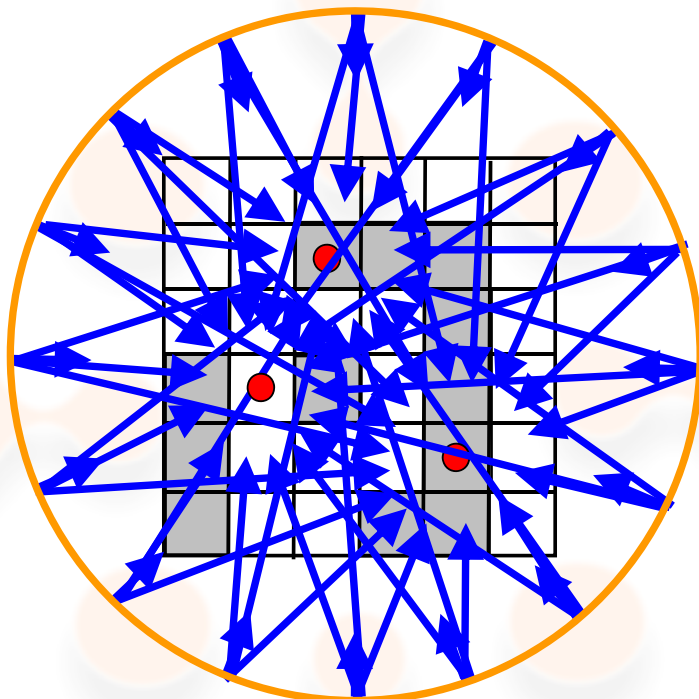


Diffuse illumination

# Motivation

## Global Illumination

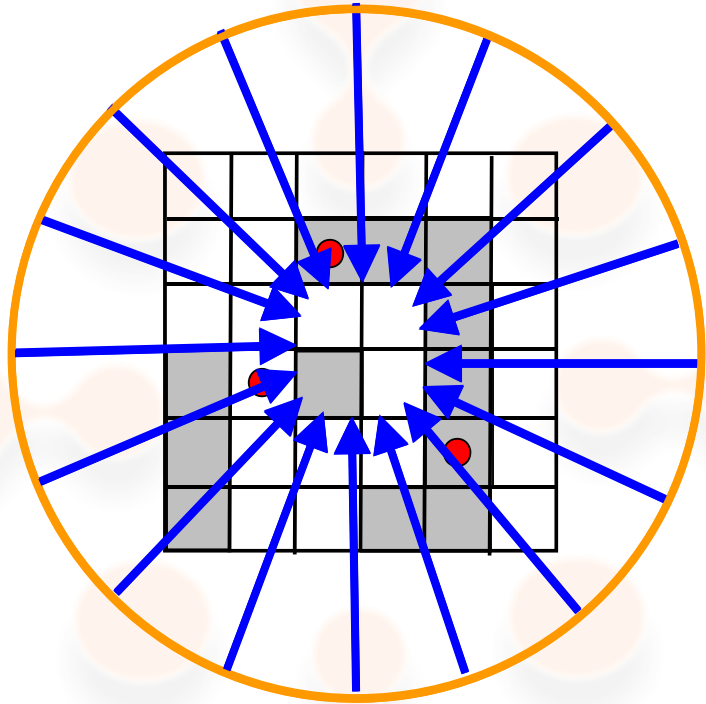
- **Higher realism**
- **Computationally demanding**
- **Occludes too much?**





# Concept of Local Ambient Occlusion

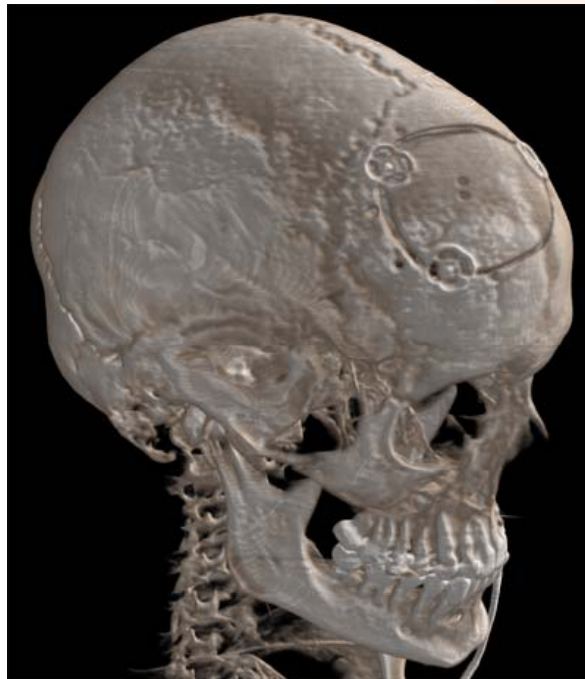
- Compute light contribution for each voxel
- Local spheres



**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Concept of Local Ambient Occlusion



Diffuse illumination + Metric Ambient Occlusion

**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Advantages

---

- **Efficient local occlusion method for DVR**
  - **Supports Multiresolution Data**
- **Interactive TF-based emission**
  - **Highlight user-specified data ranges**

## LAO – single direction



# LAO – multiple directions



**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Local Ambient Occlusion Equations

- Integration of incoming light from one direction

- $$I_k(x) = \int_a^{R_\Omega} \frac{1}{R_\Omega - a} \exp\left(-\int_a^s \tau(u) du\right) ds$$

- $$I_k(x) = \sum_{m=0}^M \frac{1}{M} \prod_{i=0}^{m-1} (1 - \alpha_i)$$
 **n K number of directions**

$$I(x) = I_{\text{bias}} + \frac{1}{K} \sum_k^K w_k I_k(x)$$

**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Light Contribution

$$I_k(x) = \sum_{m=0}^M \frac{1}{M} \prod_{i=0}^{m-1} (1 - \alpha_i)$$



Light is contributed only at the boundary



Light is contributed at each sample point

# LAO with Emission

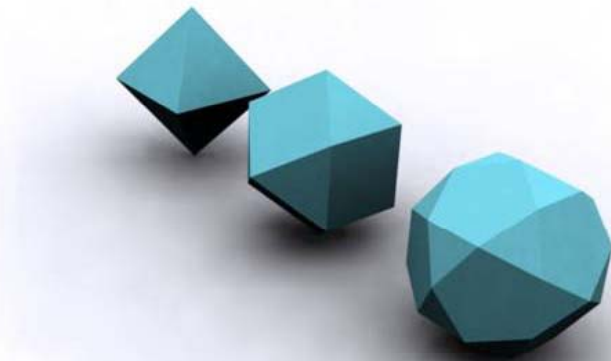


- Affect intensity and color of  $x$
- Emissive component in the TF
- Add  $C_E$  (color light emission) to the integral

$$I_k(x) = \int_a^{R_\Omega} \frac{1 + c_E(s)}{R_\Omega - a} \exp\left(-\int_a^s \tau(u) du\right) ds$$

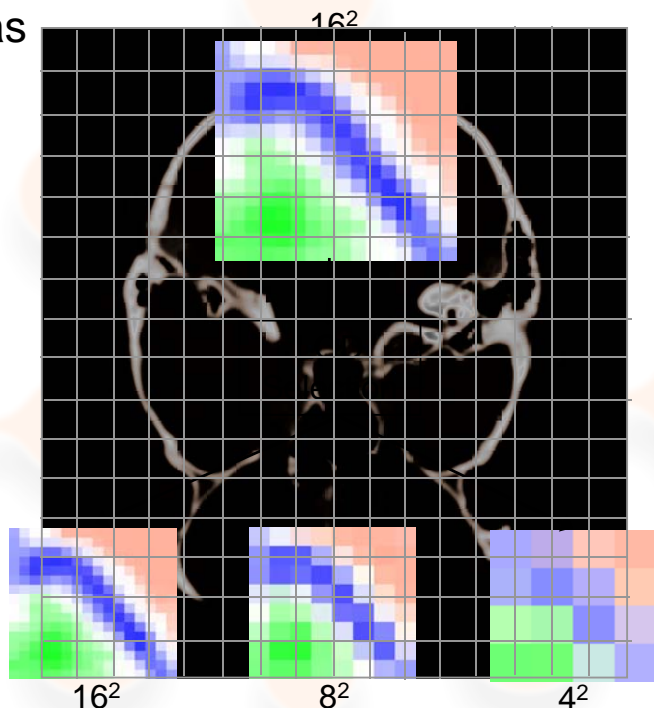
# Ray directions

- **Dynamically configured**
- **Subdividing a tetrahedron, isocahedron or octahedron**

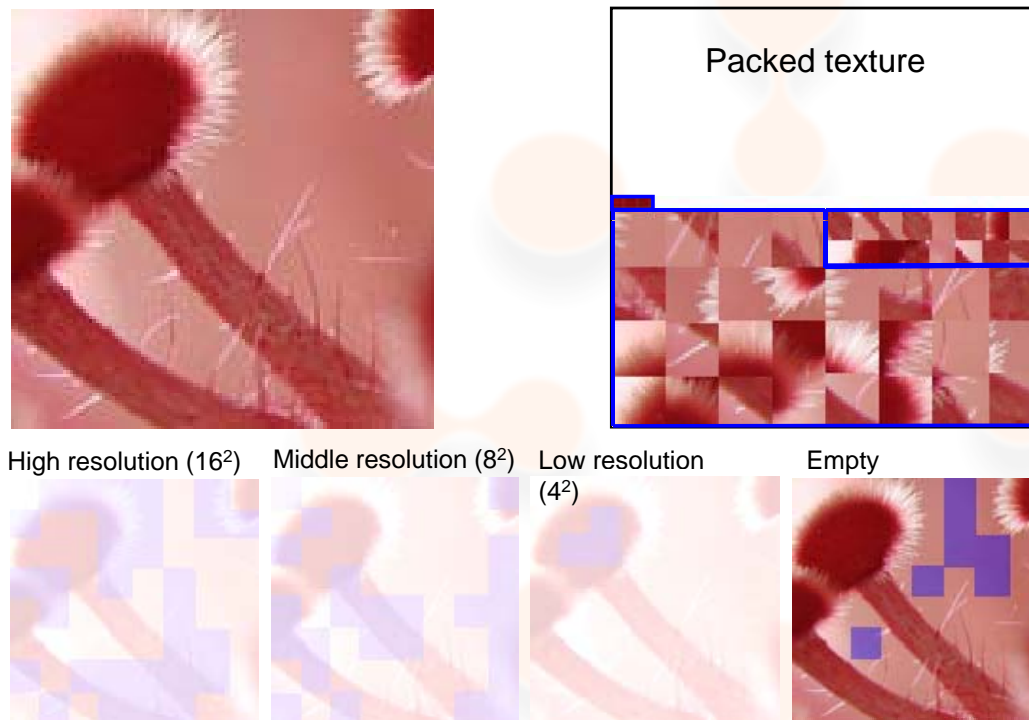


# Multiresolution volume

- Superfluous sampling in areas of low occlusion contribution
- Flat Multiresolution Blocking (Ljung et al. '04)
- Preprocessing stage
  - $16^3$  voxels are organized into a multiresolution representation
- TF based LOD selection
  - Optimizing the resulting image quality



# Multiresolution volume



**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Multiresolution LAO

- **Compute LAO directly in packed coordinates**
- **Reduce the number of voxels to compute**
  - Empty space skipping (Volume block  $< 4^3$ )
- **Increase the sampling distance for low resolution blocks**

**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

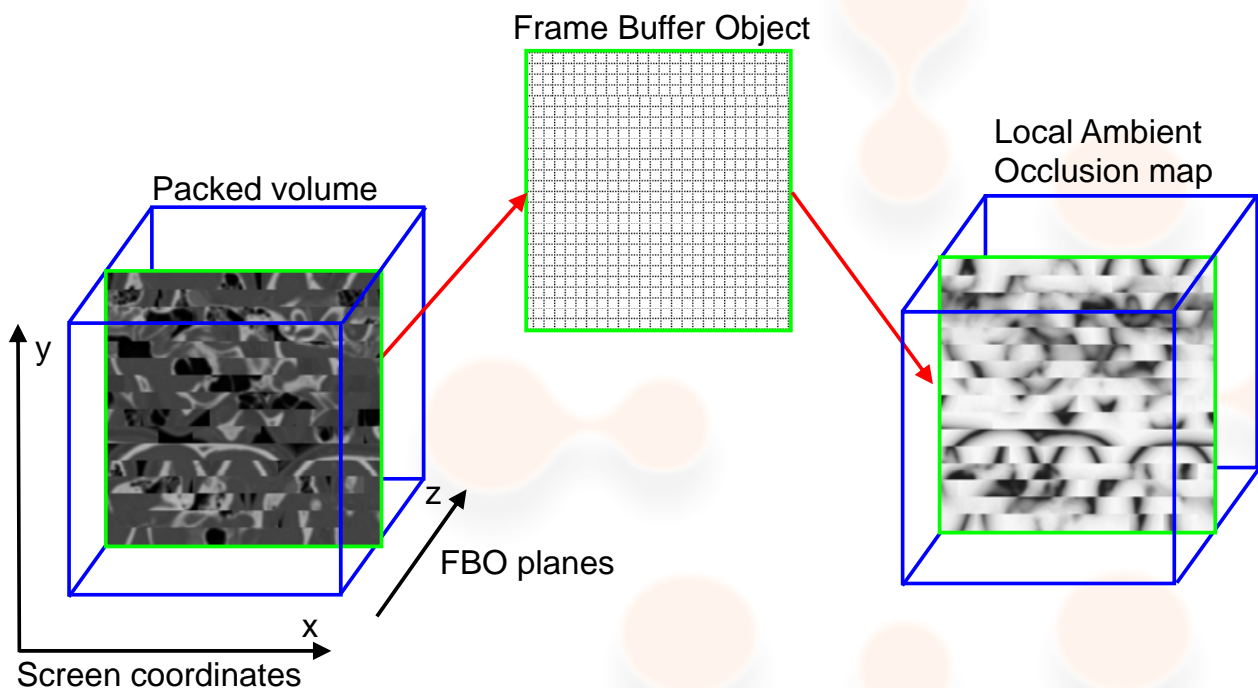




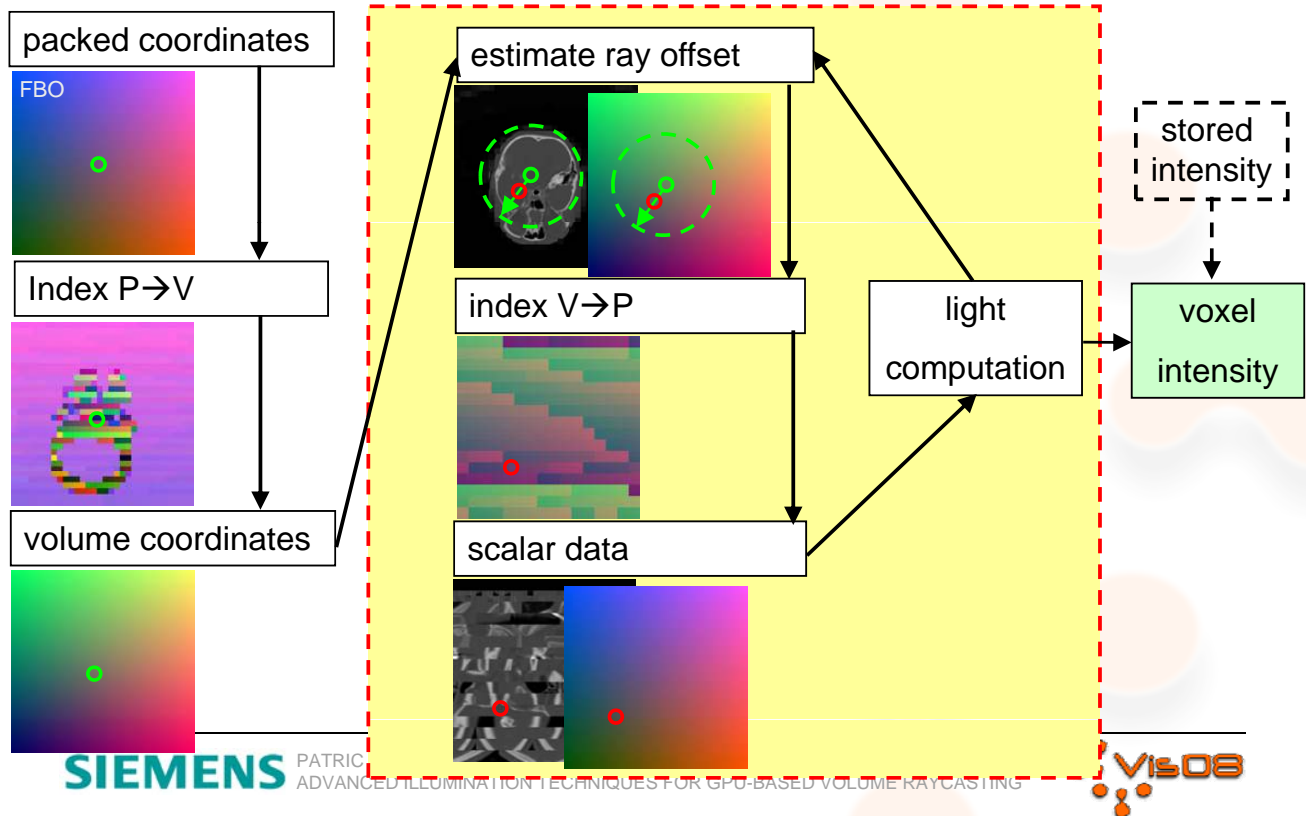
# Local Ambient Occlusion Pipeline

1. LAO computation → LAO map
2. Ray casting with LAO look up

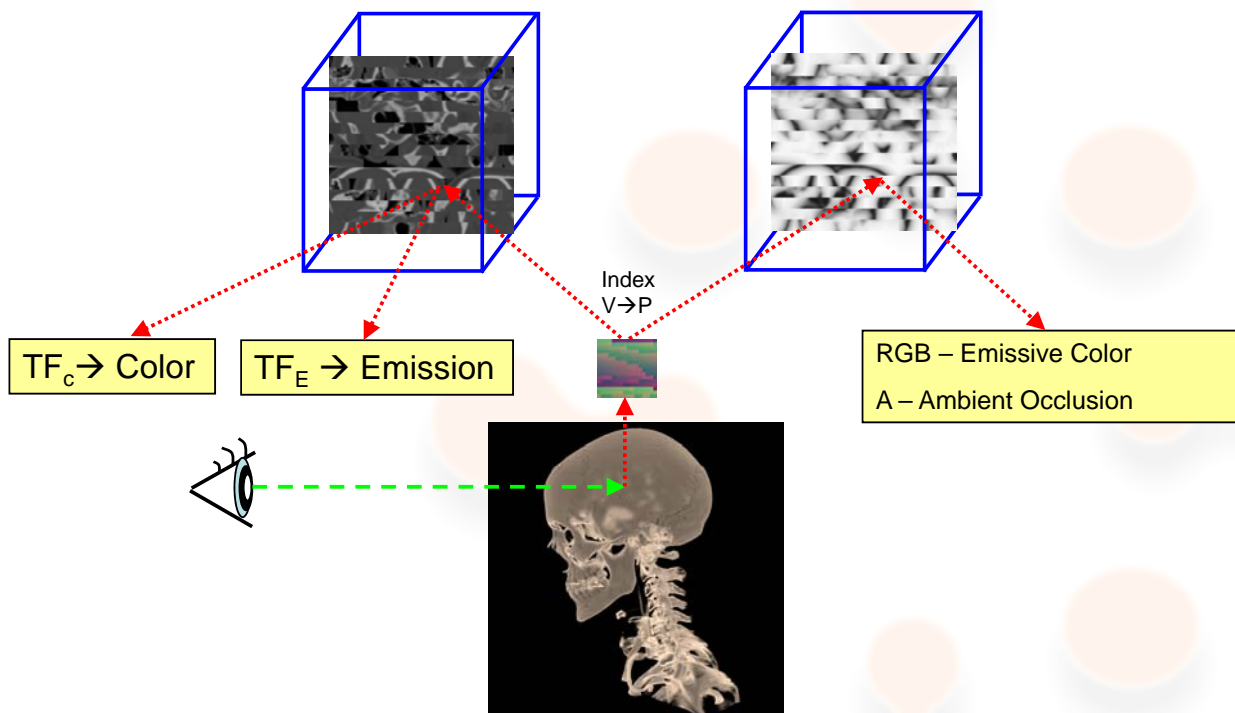
## LAO Computation



# Per-fragment Pipeline



# Final Ray Casting



# Results



Diffuse Illumination



LAO with 1 direction

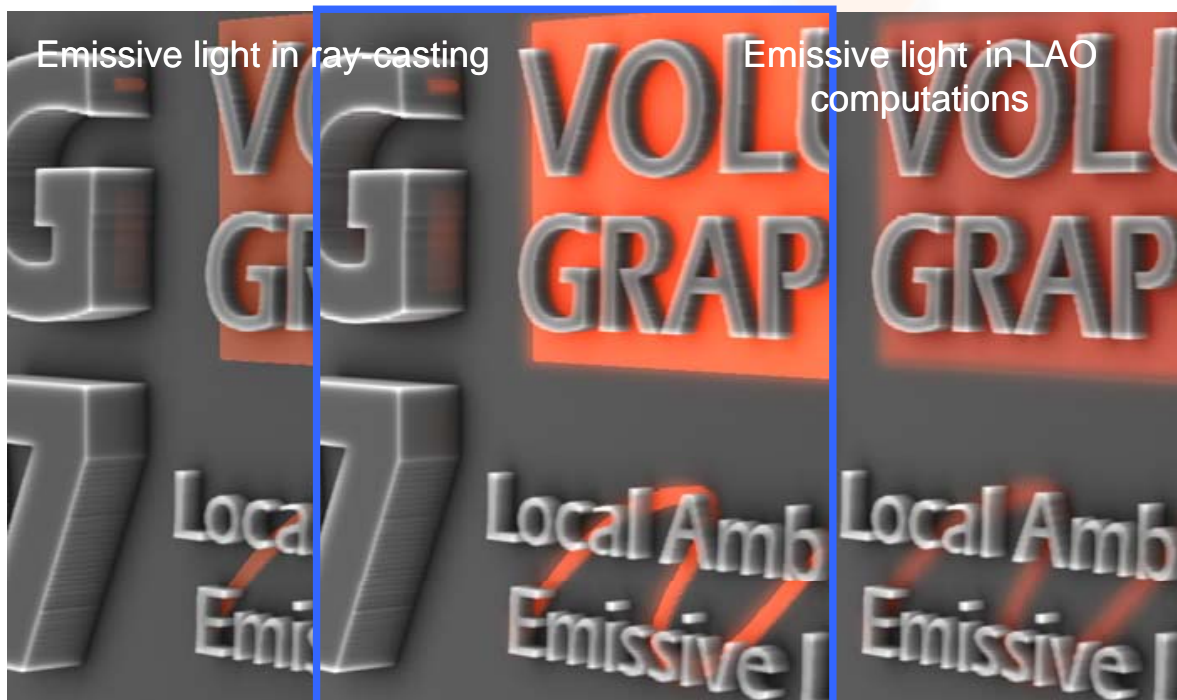


LAO with 8 directions

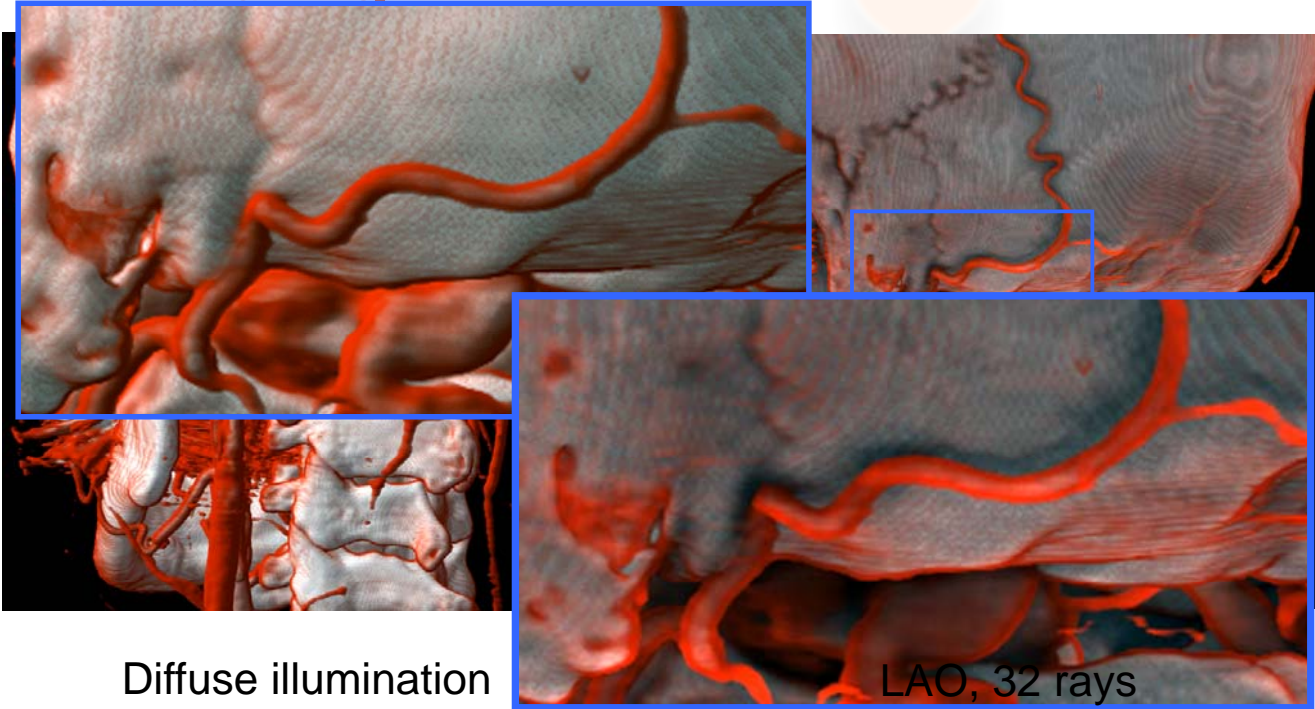
- NVIDIA GF8800 Ultra
- 768 MB of graphics texture memory
- 51 ms/frame to update one ray in the LAO map
- 27 FPS



# Results



# Comparison w/ Diffuse Shading



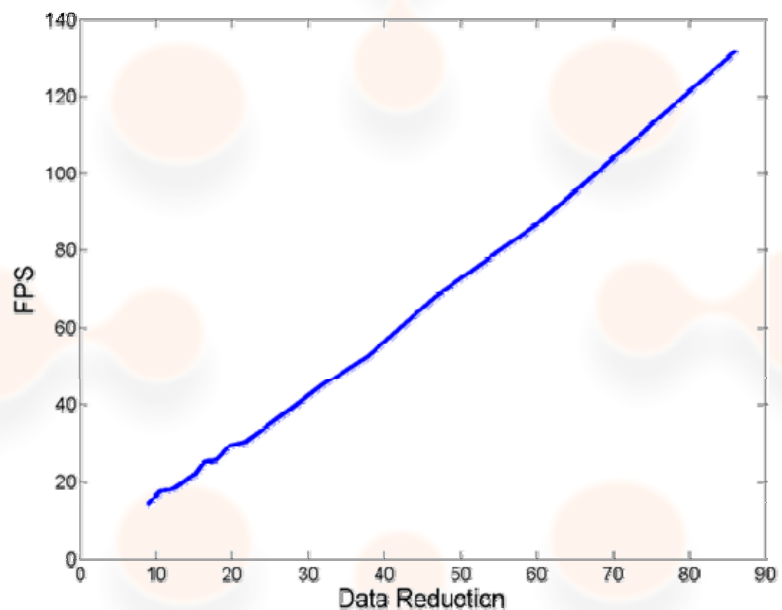
**SIEMENS**

PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Multiresolution Speed-up

- Volume of  $512^3$  voxels
- Super-linear performance increase
  - Less voxels to compute
  - Increased step length for low resolution blocks



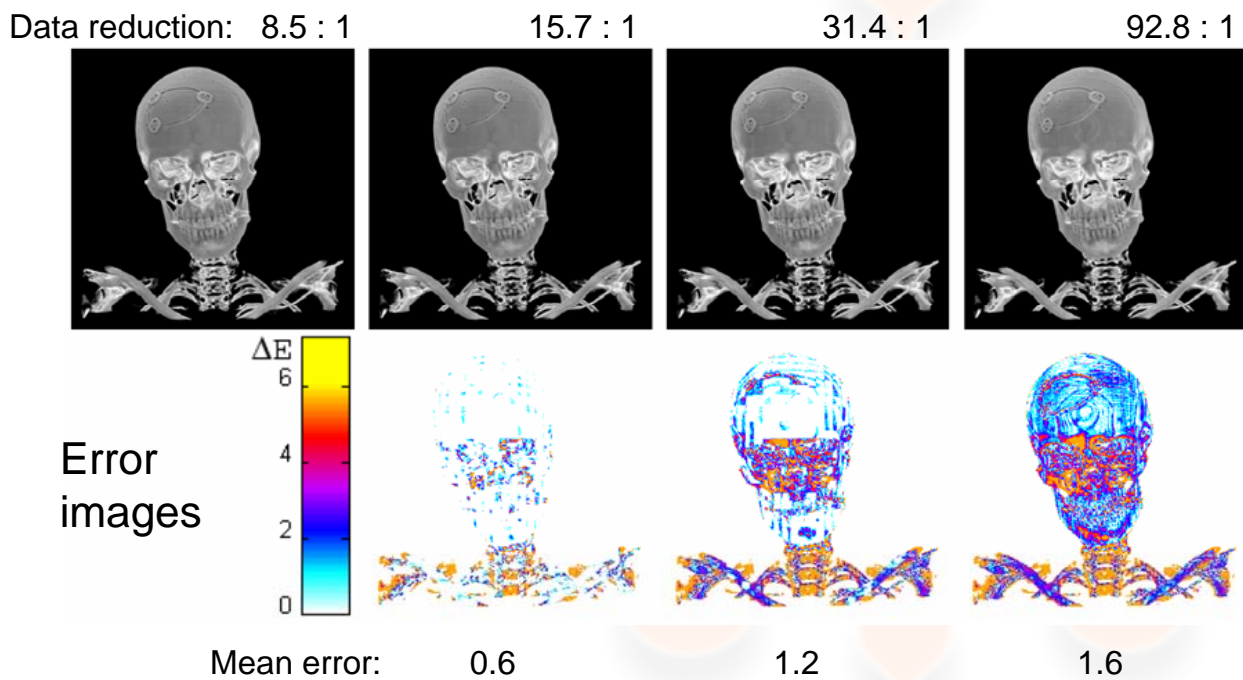
**SIEMENS**

PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





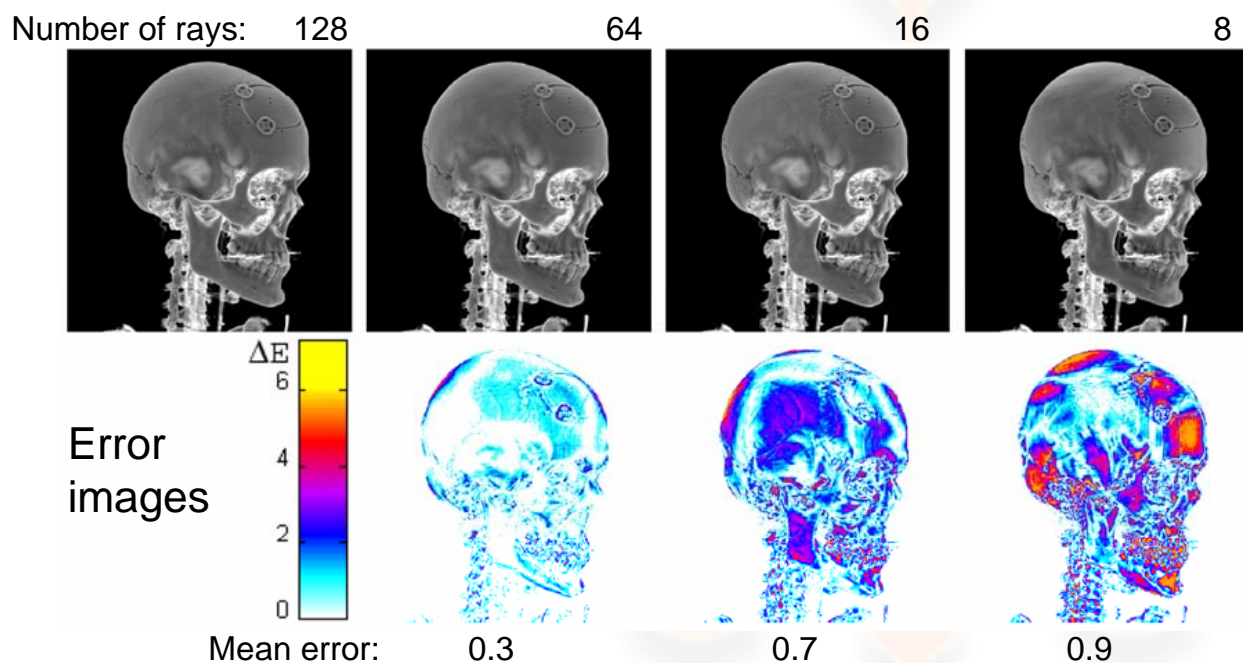
## Results - Multiresolution



**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



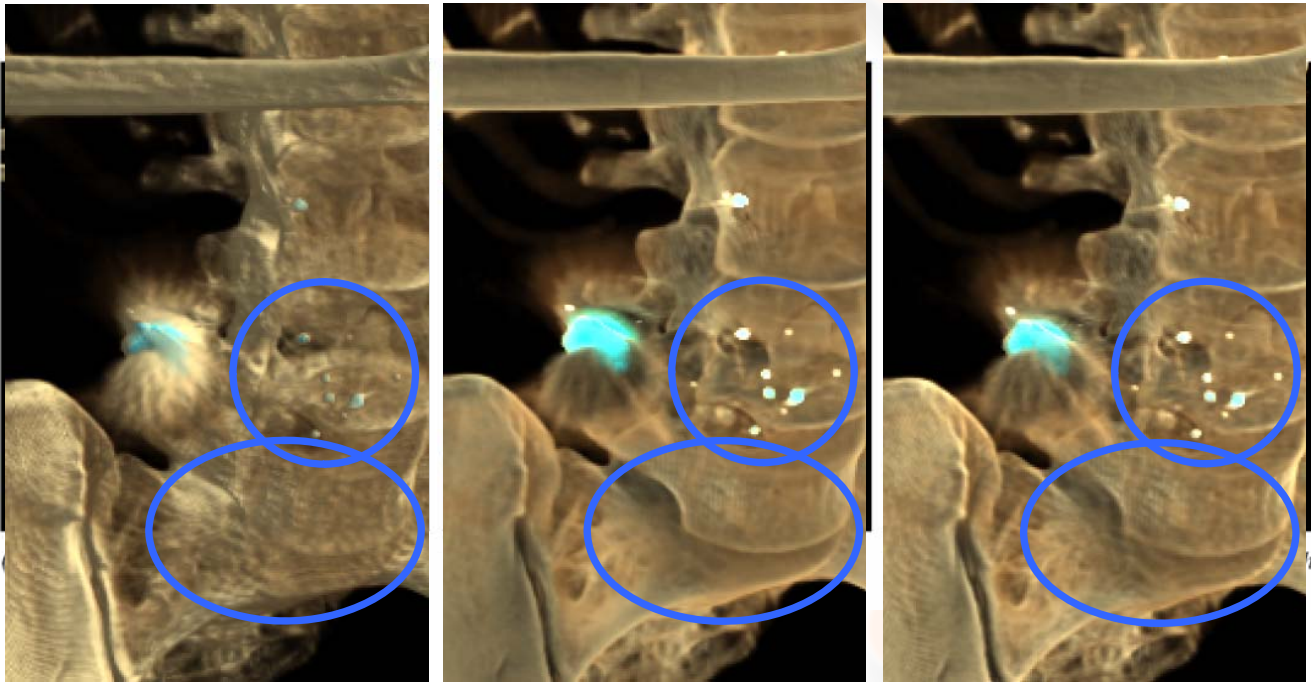
## Varying Number of LAO Rays



**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Application to Virtual Autopsy Case



**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Global Light Propagation

Markus Hadwiger  
VR VIS Research Center  
Vienna, Austria



Patric Ljung  
Siemens Corporate Research  
Princeton, NJ, USA

**SIEMENS**

Christof Rezk Salama  
Computer Graphics Group  
Institute for Vision and Graphics  
University of Siegen, Germany



Timo Ropinski  
Visualization and Computer  
Graphics Research Group,  
University of Münster, Germany

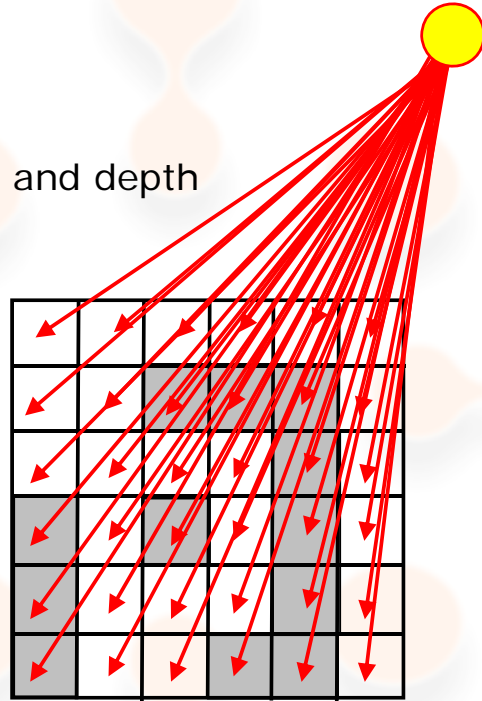




# Motivation

---

- Improved medical diagnosis
  - Perception of shapes, densities and depth
- Correct global integration
  - Computationally demanding
- Need for real-time performance of global lighting in DVR



## Motivation 2

---

- **Multiresolution data sets**
  - **Exploit Data Reduction to speed-up Global Lighting.**
- **Existing Techniques has limited applicability for Raycasting**
  - **Adaptive ray-space sampling**
  - **Multiresolution rendering**

# Main Advantages

---

- **An efficient approximation of volumetric light propagation from a point light source**
- **A fast approach for refinements of locally in-scattered light contribution in high resolution**
- **Support for interactive and arbitrary positioning of the light source**

# Theory: DVR Integral

---

**The direct volume rendering integral**

$$I(D) = I_0 \cdot e^{-\int_0^D \tau(t) dt} + \int_0^D g(s) \cdot e^{-\int_s^D \tau(t) dt} ds$$

**where**

$$g(s) = c(s) \cdot \alpha(s)$$

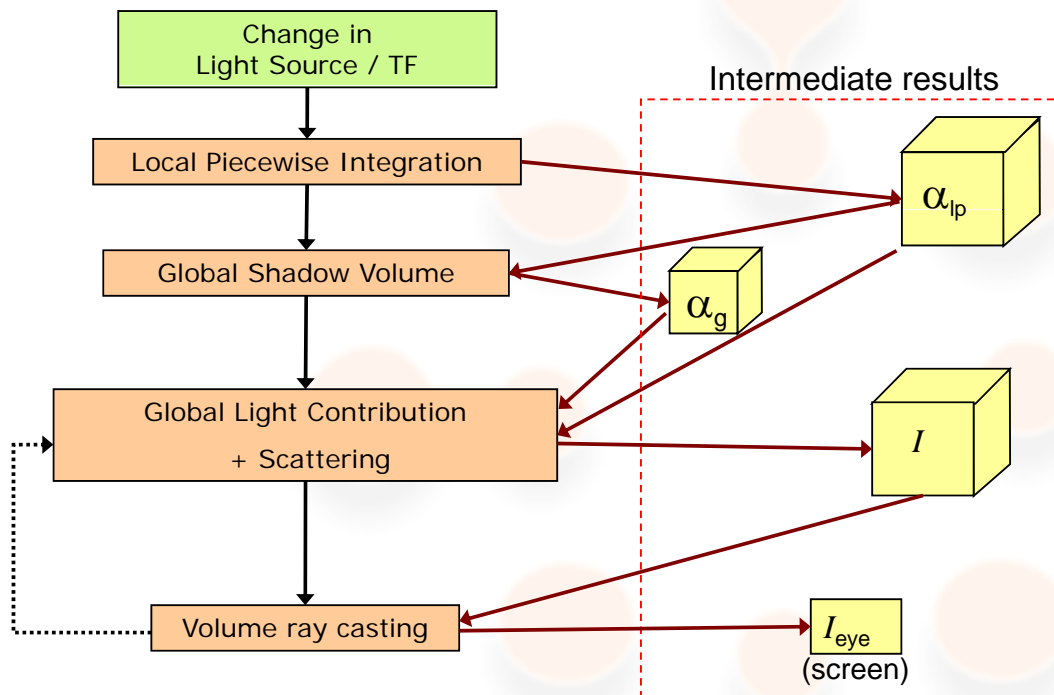
**for an unshaded rendering.  $c(s)$  is the color and  $\alpha(s)$  is the opacity at each sample point,  $s$ .**

**More advanced illumination:**

$$g(s) = I(s) \cdot c(s) \cdot \alpha(s)$$

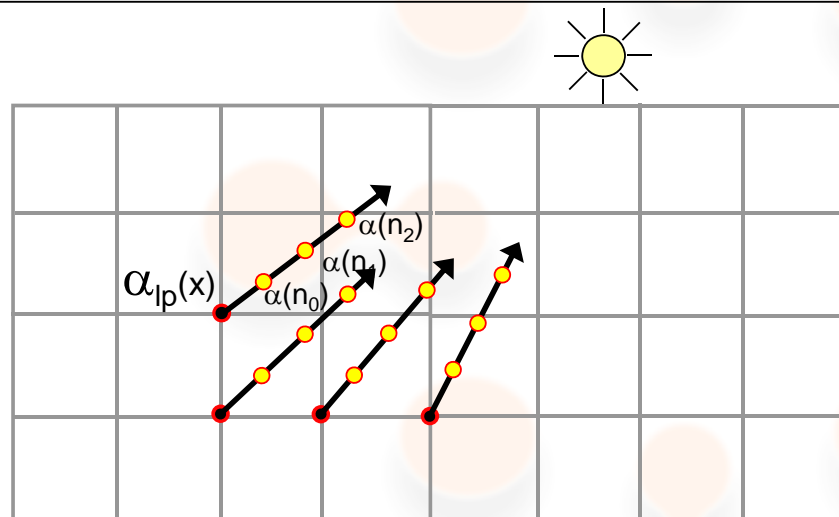
**where  $I(s)$  is a combination of direct and in-scattered intensities.**

# Pipeline: Algorithm Outline



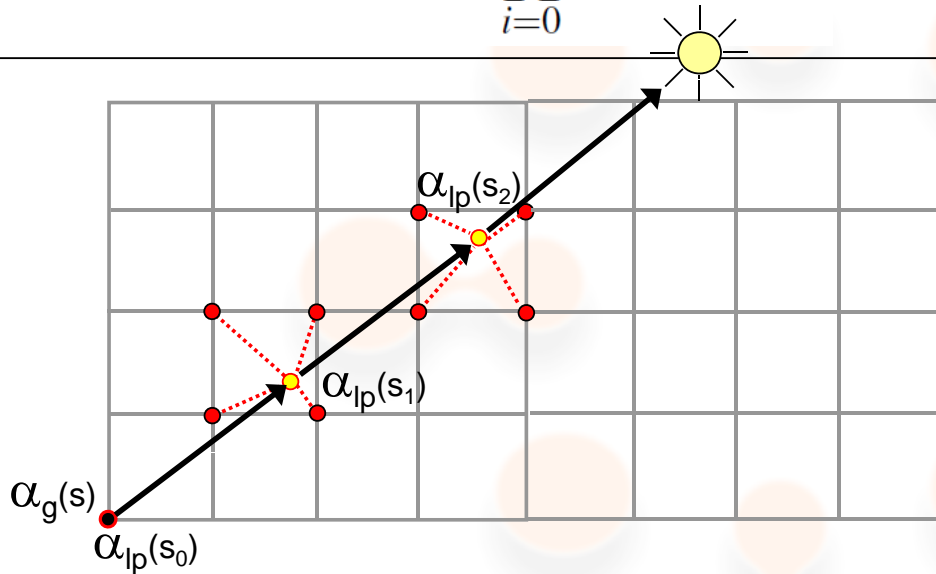
## Piecewise Integration

$$T_{lp}(x) = e^{-\int_0^x \alpha_{lp}(u) du} = 1 - \prod_{n=0}^M (1 - \alpha(n))$$

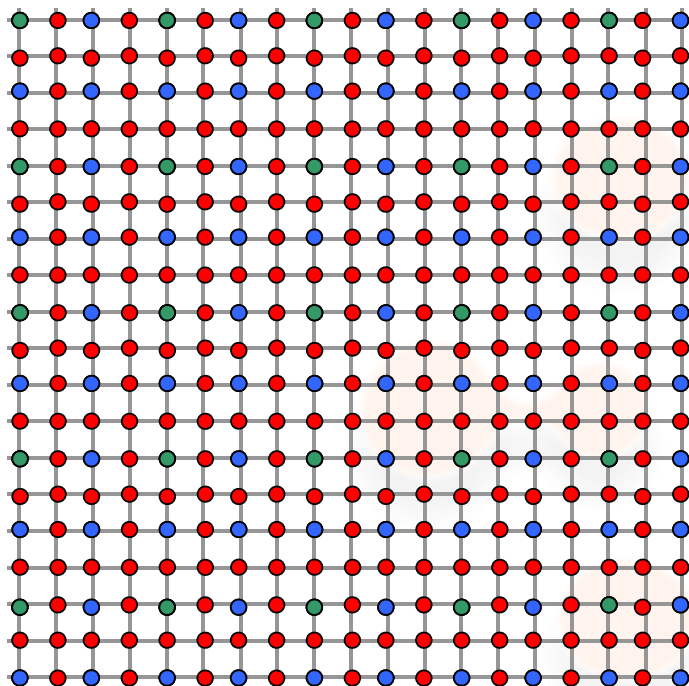


# Piecewise Integration

$$\alpha_g(s_0) = 1 - \prod_{i=0}^k (1 - \alpha_{lp}(s_i))$$



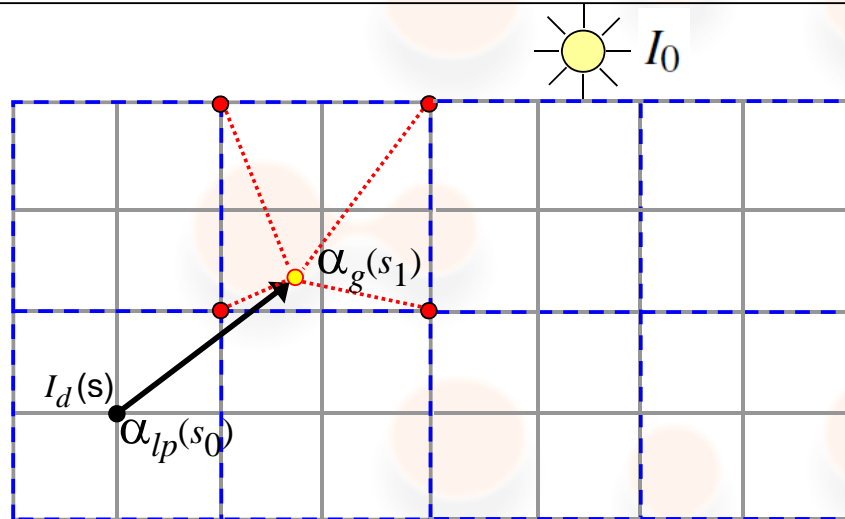
## Speed-up of global integration



- Opacity is computed for each local segment originating at red points
- Global integration using the pre-computed piecewise integration can be computed for fewer points
- Leading to a Shadow Volume Representation (SVR)
- Note that the integration for each point still is at high resolution

# Improving Accuracy of Direct Light

$$I_d(s_0) = I_0 \cdot (1 - \alpha_g(s_1)) \cdot (1 - \alpha_{lp}(s_0))$$



**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



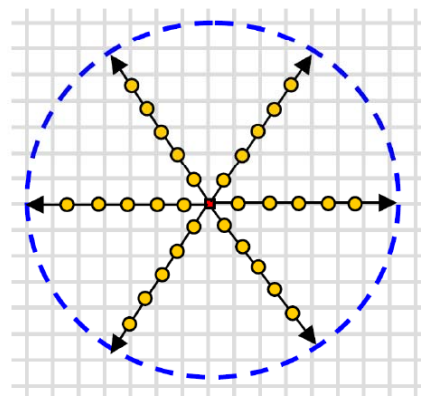
## In-scattering

$$I_e(s_0) = \int_{s_0}^{R_\Omega} q(s) e^{-\int_{s_0}^r \tau(t) dt} dr$$

- **Emittance integral**

$$I_d(s_0) = I_0 \cdot (1 - \alpha_g(s_1)) \cdot (1 - \alpha_{lp}(s_0))$$

- **Similar to Local Ambient Occlusion (LAO) as described earlier**



**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# In-scattering

$$I_s(s_0) = \int_{\Omega} \varphi(\omega) \int_{s_0}^{R_{\Omega}} I_d(r) \cdot e^{-\int_{s_0}^r \tau(t) dt} dr d\omega$$

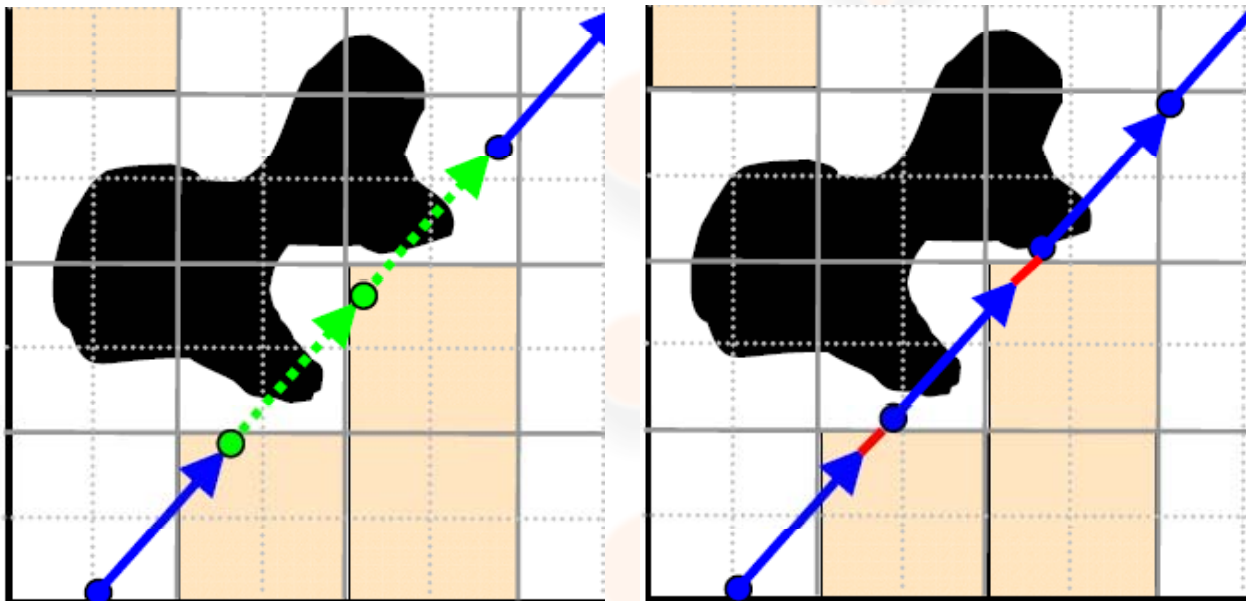
- **Discretized, compositing scheme**

$$I_s = \sum_{j=0}^J \varphi_j \sum_{m=0}^M I_d(s_m) \prod_{i=0}^{m-1} (1 - \alpha(s_i))$$

- **Progressive refinement, 1 direction per pass**

$$I_{blended} = \frac{1}{j} \cdot I_{final} + \left(1 - \frac{1}{j}\right) \cdot I_{stored}$$

# Empty Space Handling





# Rendering Pass

---

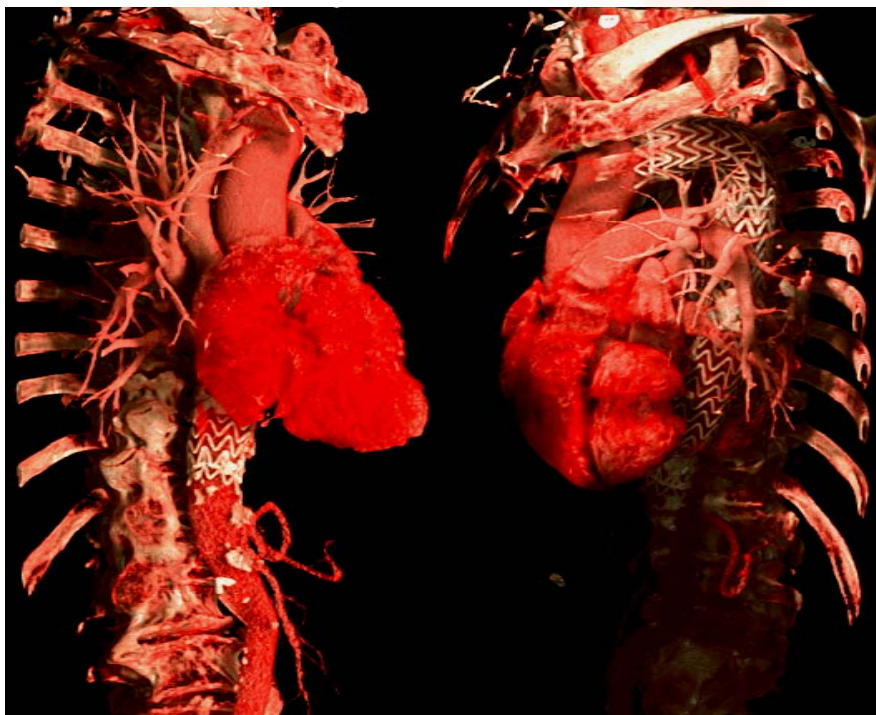
$$I_{eye} = \sum_{k=0}^n g_k \prod_{p=0}^{k-1} (1 - \alpha(s_p))$$

$$g_k = \underbrace{I_{bias} + (1 - I_{bias}) \cdot I_s(s_k) \cdot c(s_k) \cdot \alpha(s_k)}_{I_{final}}$$

- $I_{bias}$  allows for setting the minimum light for a volume sample

## Final Result: Global+LAO

---



# Compare w/ Diffuse Surface

Gradient  
based  
local  
lighting



Novel  
global +  
ambient  
lighting



**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Results: Translucency Effects



$$R_{\Omega} = 16, I_{bias} = 0$$

$$R_{\Omega} = 48, I_{bias} = 0$$



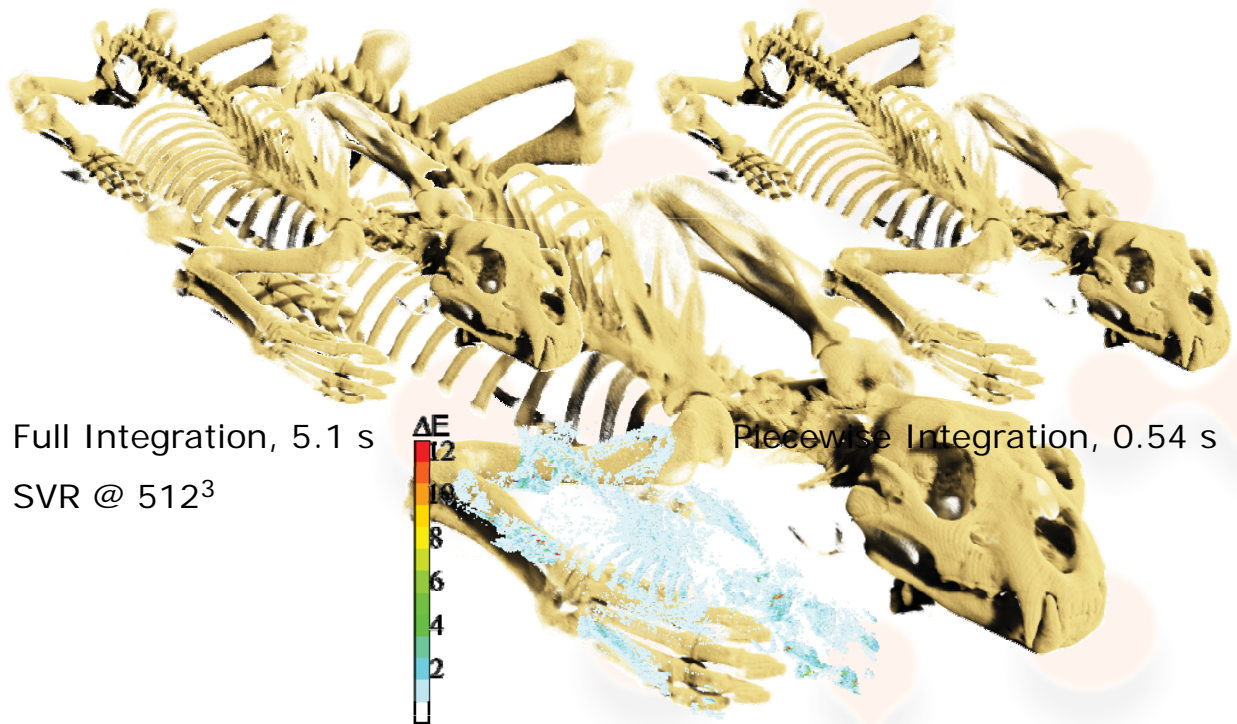
$$R_{\Omega} = 16, I_{bias} = 0.2$$

$$R_{\Omega} = 48, I_{bias} = 0.2$$

**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



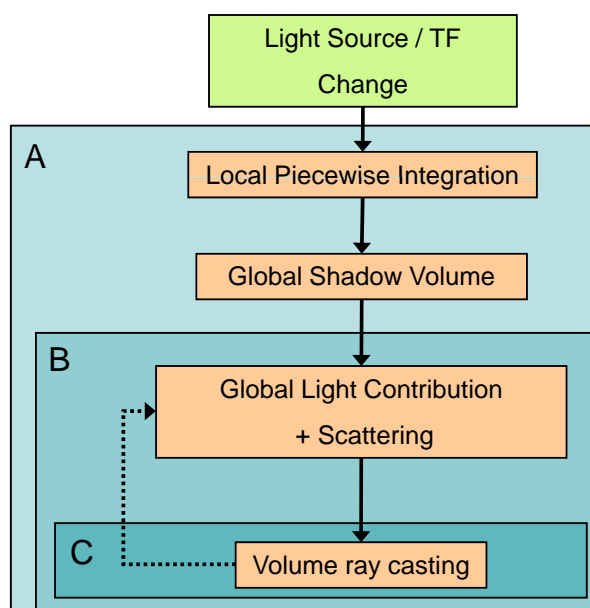
# Comparison: Full integration



**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Performance Timing



Piecewise segment length (voxels)	32 <sup>3</sup>	64 <sup>3</sup>	128 <sup>3</sup>	256 <sup>3</sup>
4	261	267	439	1428
8	284	297	373	552
16	331	339	380	641
32	436	439	463	862

milliseconds

Data reduction	32 <sup>3</sup>	256 <sup>3</sup>	B	C
8.9:1	284	552	233	68
14.8:1	178	515	145	68
22.1:1	121	403	96	48
35.2:1	81	365	62	46

milliseconds

Original volume: 512<sup>3</sup> voxels  
Data reduction: 8.9:1  
Segment Length: 16  
Viewport: 1024x1024

**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

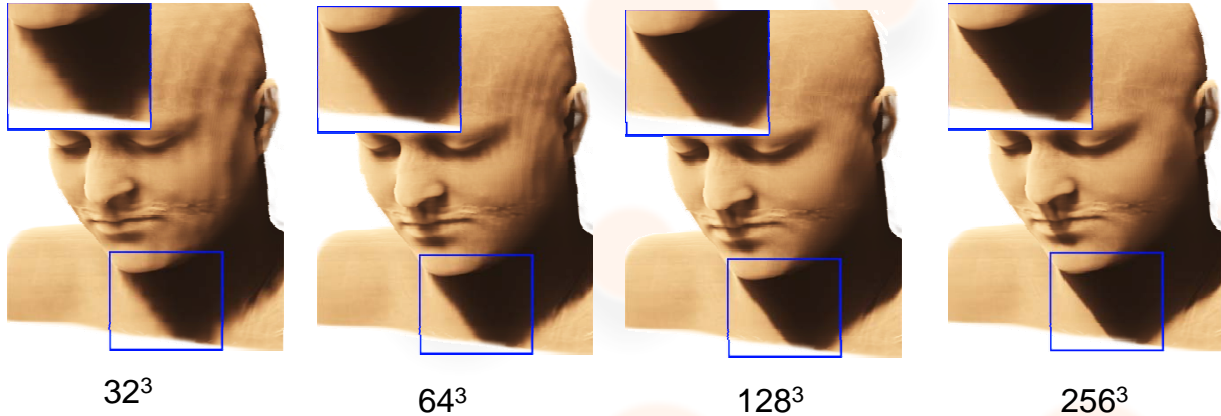




# Shadow Volume Sensitivity

---

Original volume:  $512^3$  voxels, Data reduction: 8.9:1, Segment Length: 16 voxels



---

**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Summary

---

- **Efficient computations, adapting to data reduction**
  - Interactive frame rates
- **Volumetric Global Lighting and Ambient Occlusion**
- **Improved perception of local features, depth, and 3D structures**
- **Can handle color-bleeding and emissive tissues**
- **Gradient Free Shading**
  - Good for noisy data sets

---

**SIEMENS** PATRIC LJUNG, SIEMENS CORPORATE RESEARCH, PRINCETON, USA  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# References

---

- Frida Hernell, Patric Ljung, and Anders Ynnerman. Efficient Ambient and Emissive Tissue Illumination using Local Occlusion in Multiresolution Volume Rendering. In *Proc. Of Eurographics/IEEE Volume Graphics 2007*.
- Frida Hernell, Patric Ljung, and Anders Ynnerman. Interactive Global Light Propagation in Direct Volume Rendering using Local Piecewise Integration. In *Proc. Of Eurographics/IEEE Volume Graphics 2008*.
- Patric Ljung, Claes Lundström, Ken Museth, and Anders Ynnerman. Transfer Function Based Adaptive Decompression for Volume Rendering of Large Medical Data Sets. In *Proc. of IEEE Volume Visualization and Graphics 2004*.
- Patric Ljung, Claes Lundström, and Anders Ynnerman. Multiresolution Interblock Interpolation in Direct Volume Rendering. In *Proc. of Eurographics/IEEE Symposium on Visualization 2006*.
- Patric Ljung. Adaptive Sampling in Single Pass, GPU-based Raycasting of Multiresolution Volumes. In *Proc. of Eurographics/IEEE Volume Graphics 2006*.

SIEMENS

PATRIC LJUNG, SIEMENS CORPORATION, RESEARCH, PRINCETON, USA  
DYNAMIC ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Scattering Effects

Markus Hadwiger  
VR VIS Research Center  
Vienna, Austria



Patric Ljung  
Siemens Corporate Research  
Princeton, NJ, USA



Christof Rezk Salama  
Computer Graphics Group  
Institute for Vision and Graphics  
University of Siegen, Germany



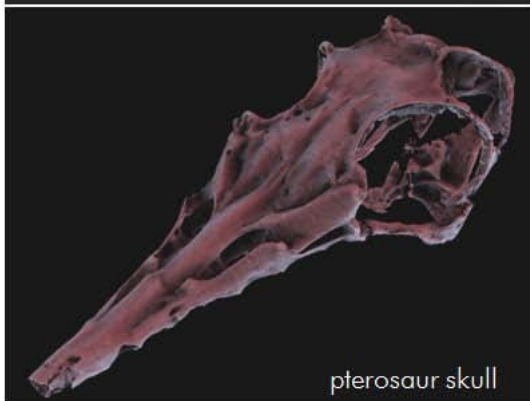
Timo Ropinski  
Visualization and Computer  
Graphics Research Group,  
University of Münster, Germany



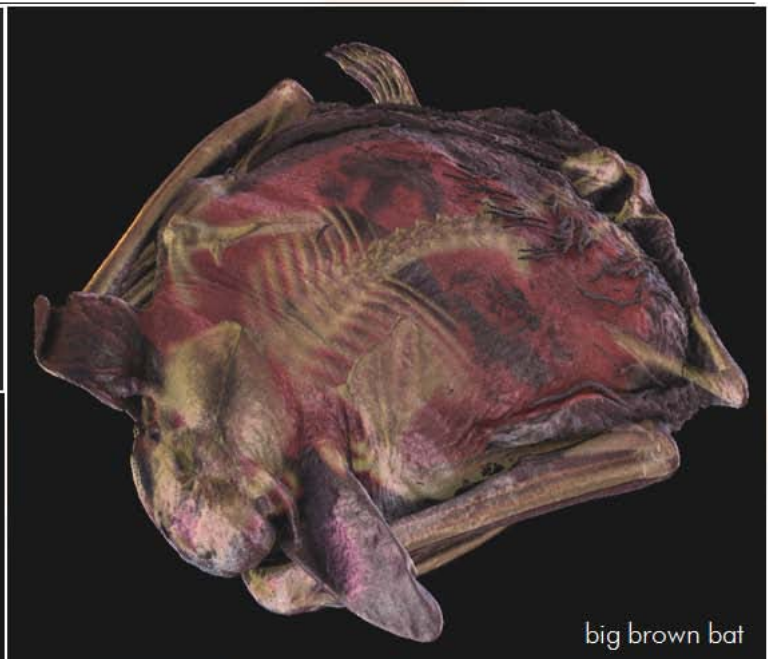
## Advanced Illumination



cheetah skull



pterosaur skull

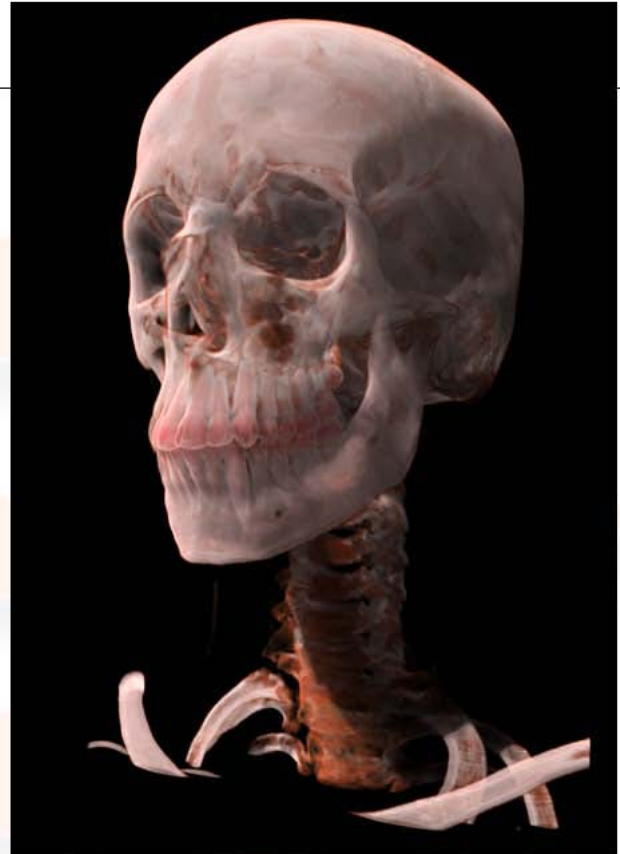
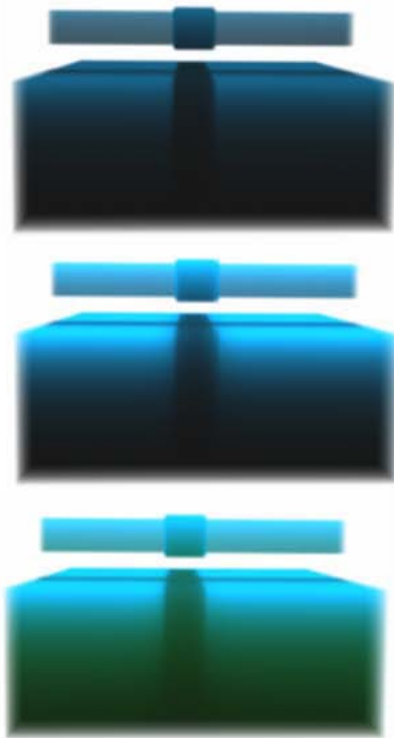


big brown bat

Data sets available at the  
UTCT data archive, DIGIMORPH  
<http://utct.tacc.utexas.edu>



# Translucency



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Light Transport

## Wave-Particle Duality

### ● Photons

- Quantum of light (the smallest possible packet of light at a given wavelength)
- Photoelectric effect (van Lenard, 1902)

### ● Wave Theory (Maxwell)

- Electro-magnetic wave characteristics of light
- Effects such as interference and diffraction

### ● Quantum Mechanics (Einstein)

- *Universal theory of light transport*
- *probabilistic* characteristics of the motions of atoms and photons (quantum optics)



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Light Transport

## Wave-Particle Duality

### ● Photons

- Quantum of light (the smallest possible packet of light at a given wavelength)
- Photoelectric effect (van Lenard, 1902)

### ● Wave Theory (Maxwell)

- Electro-magnetic wave characteristics of light
- Effects such as interference and diffraction

### ● Quantum Mechanics (Einstein)

- *Universal theory of light transport*
- *probabilistic* characteristics of the motions of atoms and photons (quantum optics)



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Scattering Effects

## Single and Multiple Scattering

Markus Hadwiger  
VR VIS Research Center  
Vienna, Austria



Patric Ljung  
Siemens Corporate Research  
Princeton, NJ, USA



Christof Rezk Salama  
Computer Graphics Group  
Institute for Vision and Graphics  
University of Siegen, Germany



Timo Ropinski  
Visualization and Computer  
Graphics Research Group,  
University of Münster, Germany

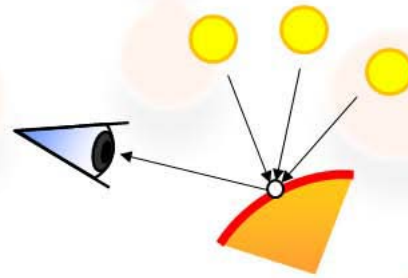


# Scattering Effects

When a photon hits a surface, it changes both direction and energy

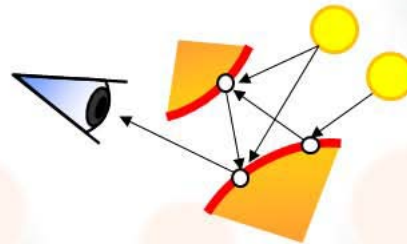
- **Single Scattering:**

- Light is scattered **once** before it reaches the eye
- Local illumination model



- **Multiple Scattering**

- Soft shadows
- Translucency
- Color bleeding

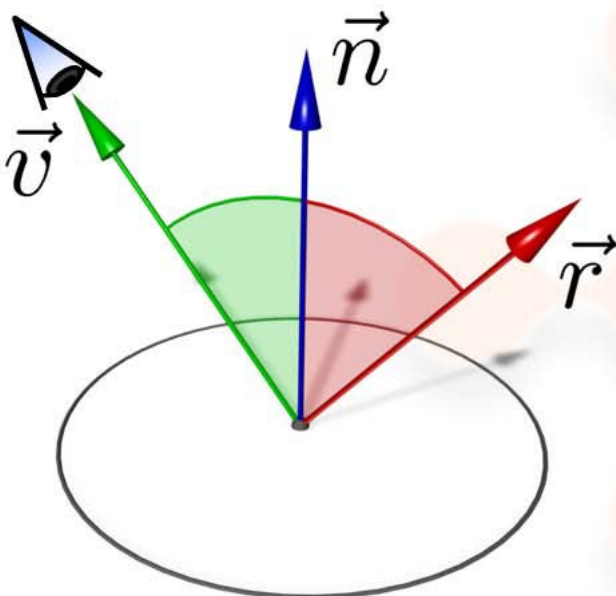


CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Single Scattering

*Phong illumination with point light sources*



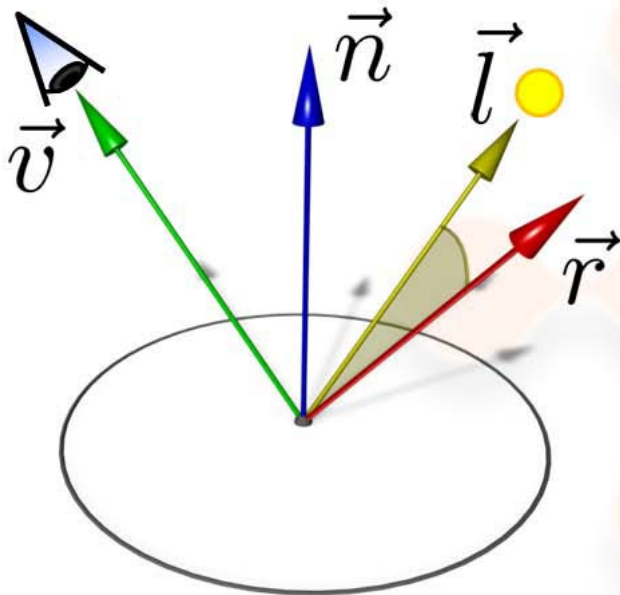
CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





# Single Scattering

Phong illumination with point light sources

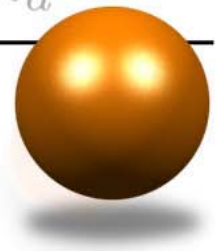


$$I_{\text{Lambert}} = L_d k_d (\vec{l} \cdot \vec{n})$$

$$I_{\text{Specular}} = L_s k_s (\vec{l} \cdot \vec{r})^s$$

$$I_{\text{Ambient}} = L_a k_a$$

$$I_{\text{Phong}}$$

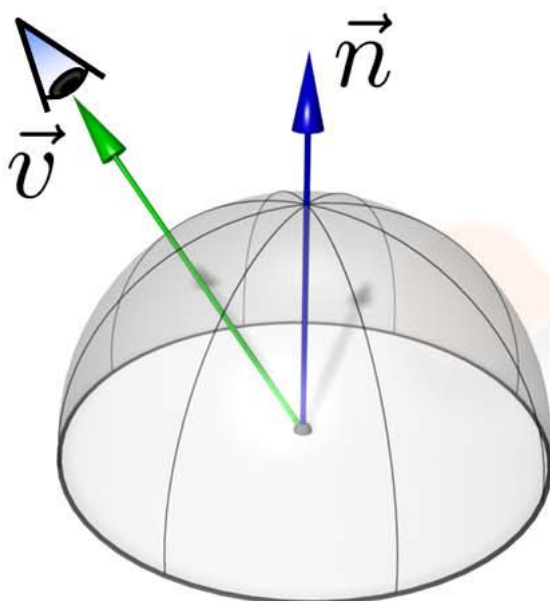


CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Single Scattering

Environment Light



$I_{\text{Lambert}}$   
Irradiance Map

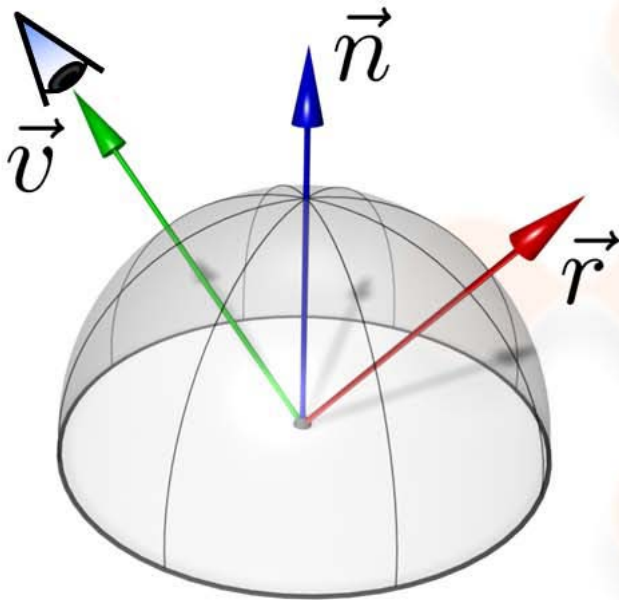


CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Single Scattering

## Environment Light



$I_{\text{Lambert}}$   
Irradiance Map

$I_{\text{Reflect}}$   
Environment Map

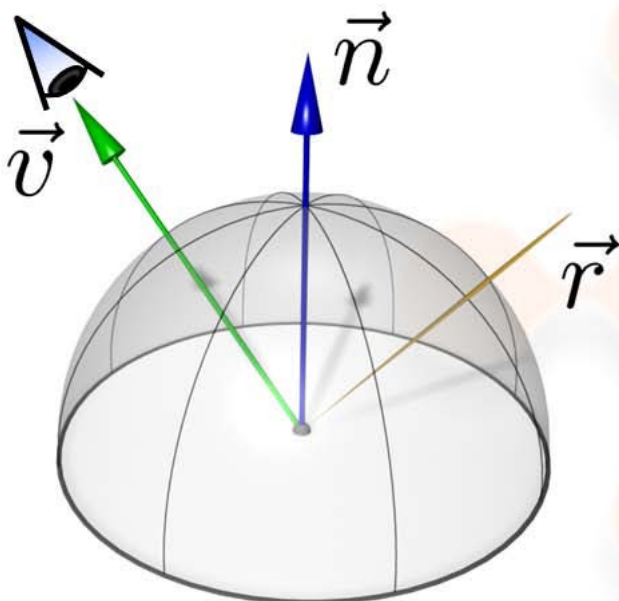


CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Single Scattering

## Environment Light



$I_{\text{Lambert}}$   
Irradiance Map

$I_{\text{Reflect}}$   
Environment Map

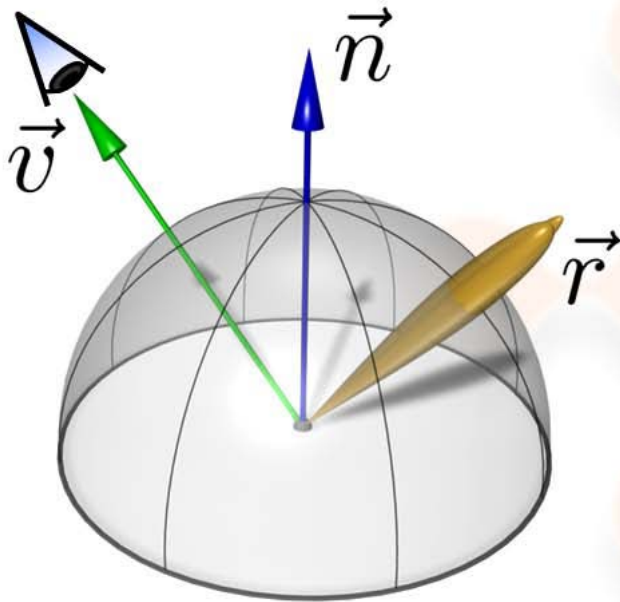


CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Single Scattering

Environment Light



$I_{\text{Lambert}}$   
Irradiance Map

$I_{\text{Specular}}$   
Reflection Map

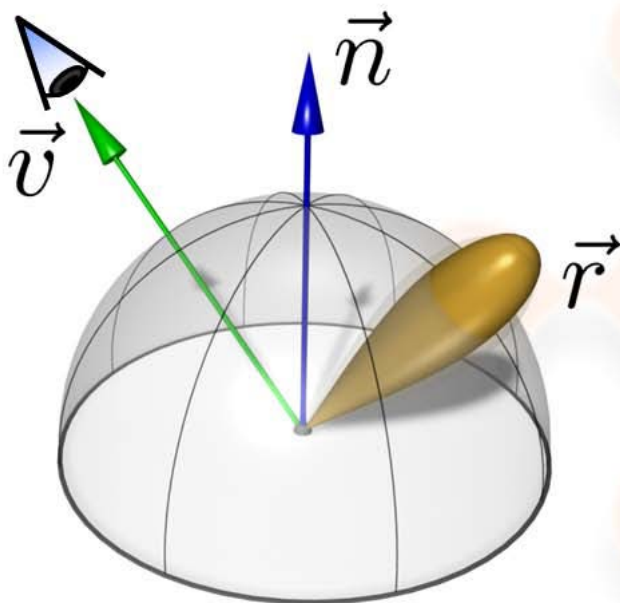


CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Single Scattering

Environment Light



$I_{\text{Lambert}}$   
Irradiance Map

$I_{\text{Specular}}$   
Reflection Map



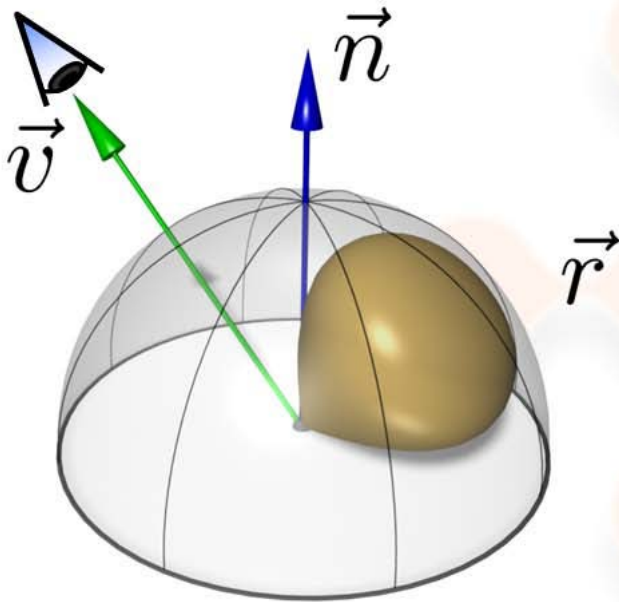
CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





# Single Scattering

Environment Light



$I_{\text{Lambert}}$   
Irradiance Map

$I_{\text{Specular}}$   
Reflection Map



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Math Notation

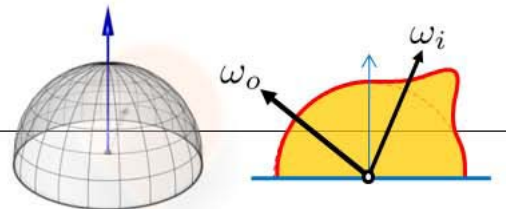
### ● Surface Illumination

$$L(\mathbf{x}, \omega_o) = \int_{\Omega^+} f(\mathbf{x}, \omega_o \rightarrow \omega_i) \cos \theta_i d\omega_i$$

Hemisphere

BRDF

Elevation Angle

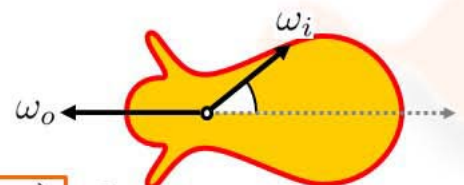


### ● Volume Illumination

$$L(\mathbf{x}, \omega_o) = \int_{\Omega} p(\mathbf{x}, \omega_o \rightarrow \omega_i) d\omega_i$$

Sphere

Phase Function



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Scattering Effects

## Monte-Carlo Methods

Markus Hadwiger  
VR VIS Research Center  
Vienna, Austria



Patric Ljung  
Siemens Corporate Research  
Princeton, NJ, USA



Christof Rezk Salama  
Computer Graphics Group  
Institute for Vision and Graphics  
University of Siegen, Germany



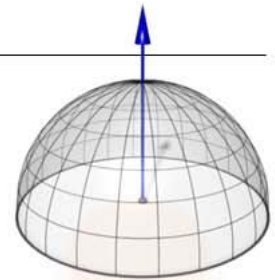
Timo Ropinski  
Visualization and Computer  
Graphics Research Group,  
University of Münster, Germany



## Math Notation

### Mathematical Model

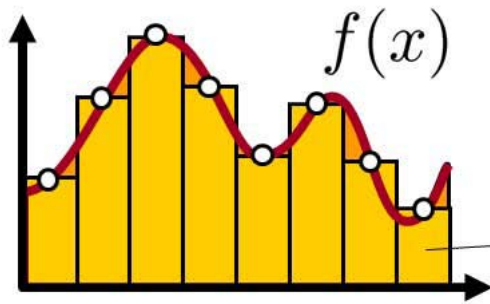
$$L(\mathbf{x}, \omega_o) = \int_{\Omega} p(\mathbf{x}, \omega_o \rightarrow \omega_i) L(\mathbf{x}, \omega_i) d\omega_i$$



integrates over the entire sphere/hemisphere

- Integral must be solved for every intersection point
- *Fredholm Equation* (cannot be solved analytically)

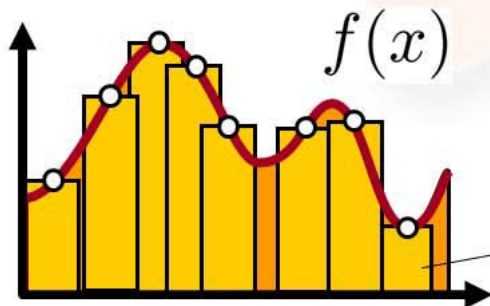
# Numerical Integration



## Equidistant Sampling

- Approximation integral by a Riemann sum

$$\int_a^b f(x) dx \approx \sum_{i=0}^N f(x_i) \frac{b-a}{N}$$



## Stochastic Sampling

- Uniformly distributed samples
- Approximation by sum

$$\int_a^b f(x) dx \approx \sum_{i=0}^N f(x_i) \frac{b-a}{N}$$



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



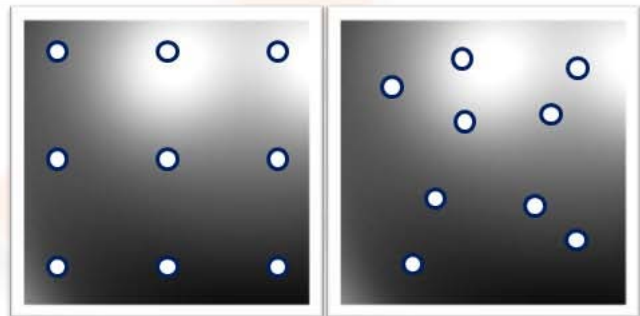
# Stochastic Sampling

## Cons:

- Slower convergence than Riemann sum

## Pros:

- Better Scalability for multidimensional functions: increase number of samples in arbitrary steps



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





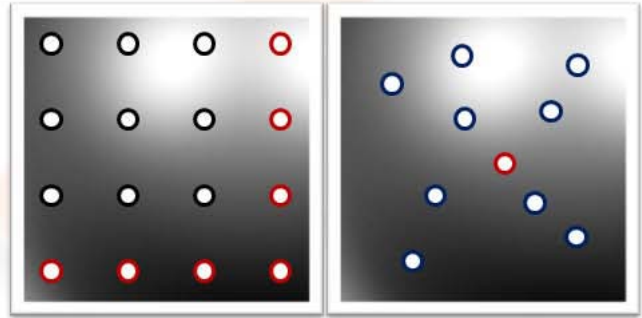
# Stochastic Sampling

## Cons:

- Slower convergence than Riemann sum

## Pros:

- *Better Scalability for multidimensional functions:*  
increase number of samples in arbitrary steps



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



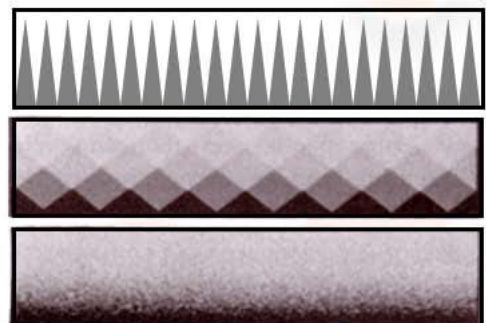
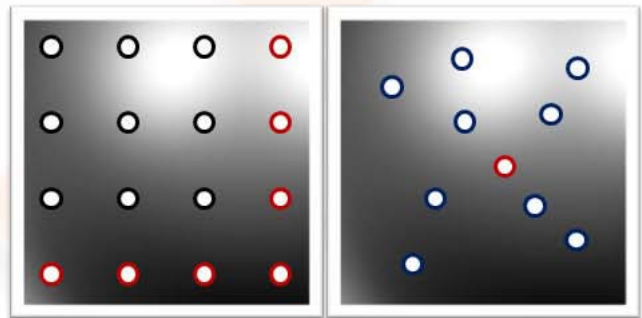
# Stochastic Sampling

## Cons:

- Slower convergence than Riemann sum

## Pros:

- *Better Scalability for multidimensional functions:*  
increase number of samples in arbitrary steps
- *Noise instead of Aliasing*



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



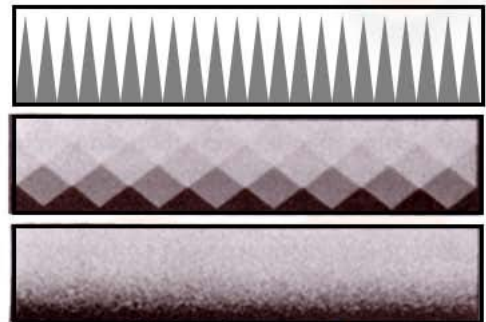
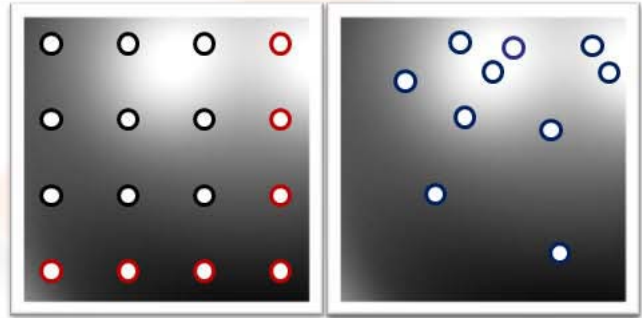
# Stochastic Sampling

## Cons:

- Slower convergence than Riemann sum

## Pros:

- *Better Scalability for multidimensional functions:*  
increase number of samples in arbitrary steps
- *Noise* instead of Aliasing
- *Independent of sampling grid:*  
Clever placement of samples will improve the convergence!



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Blind Monte-Carlo Sampling

## ● Example: Filtering an Environment Map

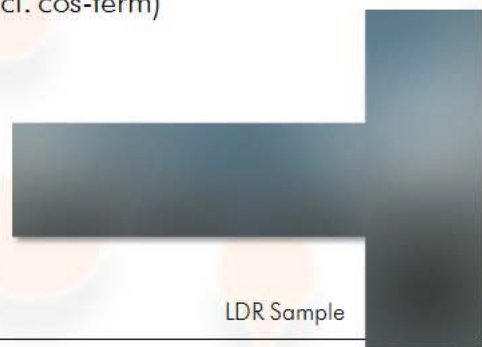
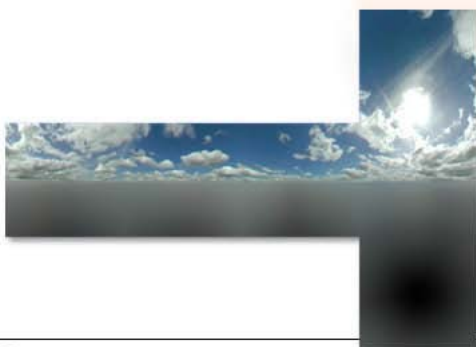
### Given an Environment Map

(i.e. photograph: fisheye or mirror ball)

### Calculate an Irradiance Map

For each pixel of the irradiance map:

- Determine  $n$  random directions on the hemisphere
- Sample the Environment Map and
- Average the results (incl. cos-term)



LDR Sample

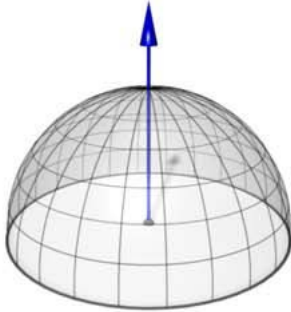


CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Rendering

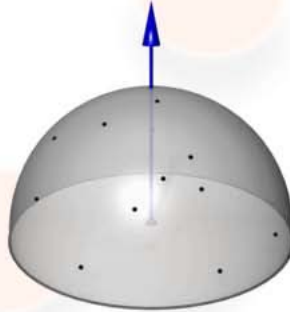
- Calculate the radiance from a point
  - depending on the incoming light on the sphere/hemisphere



## *Deterministic*

Uniform sampling of the sphere/hemisphere.

High computational load  
good approximation



## *Blind Monte-Carlo*

Randomized sampling of the sphere/hemisphere.

Visually better images for  
fewer samples, slow convergence

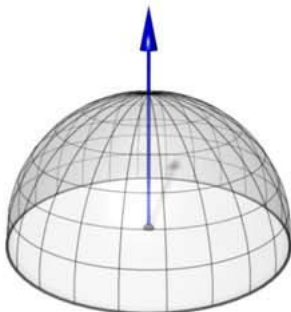


CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Rendering

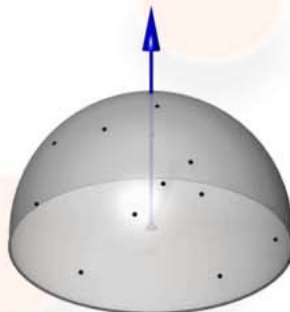
- Calculate the radiance from a point
  - depending on the incoming light on the sphere/hemisphere
  - depending on the phase function/BRDF



## *Deterministic*

Uniform sampling of the sphere/hemisphere.

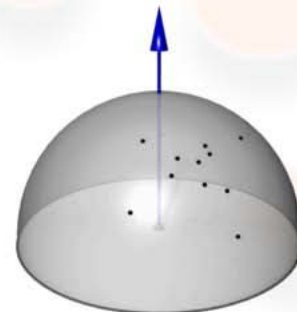
High computational load  
good approximation



## *Blind Monte-Carlo*

Randomized sampling of the sphere/hemisphere.

Visually better images for  
fewer samples, slow convergence



## *Importance Sampling*

Place samples where  
contribution is high

Faster!

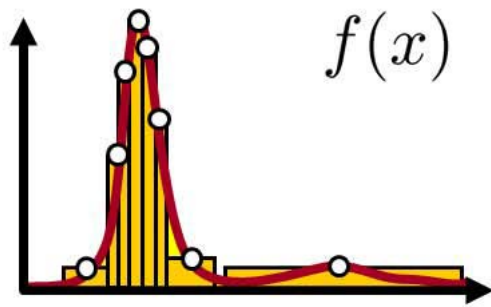


CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





# Importance Sampling



## Stochastic Sampling

- Non-uniformly distributed samples
- Approximation by sum

$$\int_a^b f(x)dx \approx \sum_{i=0}^N \frac{f(x_i)}{p(x_i)}$$

## Clever placement of samples

- Many samples where function is high
- Few samples where function is low

Probability  
Distribution  
Function (PDF)



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



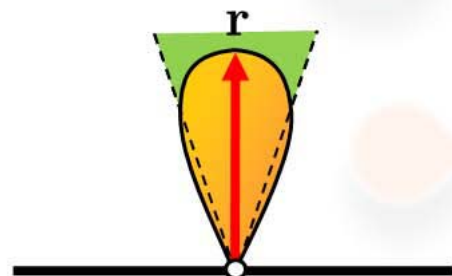
# Sampling a Specular Lobe

## ● Simple Approach

Specular term  $f(\varphi) = \cos^s(\varphi) = (\mathbf{r} \cdot \mathbf{v})^s$

Non-optimal, but easy to implement

*Idea:* uniform distribution of directions restricted to a cone



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Sampling a Specular Lobe

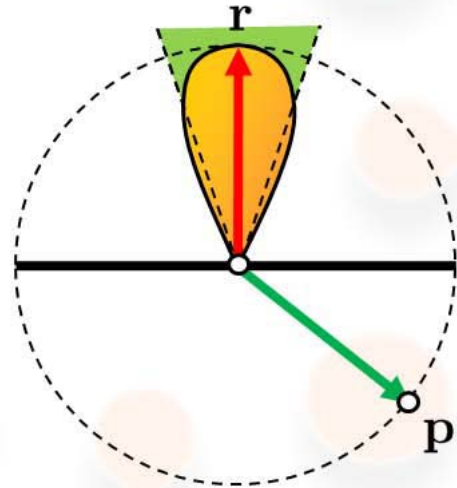
## ● Simple Approach

Specular term  $f(\varphi) = \cos^s(\varphi) = (\mathbf{r} \cdot \mathbf{v})^s$

Non-optimal, but easy to implement

*Idea:* uniform distribution of directions restricted to a cone

- Precompute random unit vectors with uniform PDF
- Randomly pick one vector  $\mathbf{p}$



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Sampling a Specular Lobe

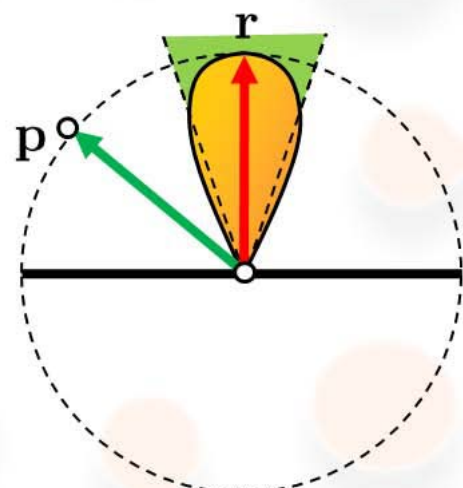
## ● Simple Approach

Specular term  $f(\varphi) = \cos^s(\varphi) = (\mathbf{r} \cdot \mathbf{v})^s$

Non-optimal, but easy to implement

*Idea:* uniform distribution of directions restricted to a cone

- Precompute random unit vectors with uniform PDF
- Randomly pick one vector  $\mathbf{p}$
- Negate vector, if  $(\mathbf{r} \cdot \mathbf{p}) < 0$



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Sampling a Specular Lobe

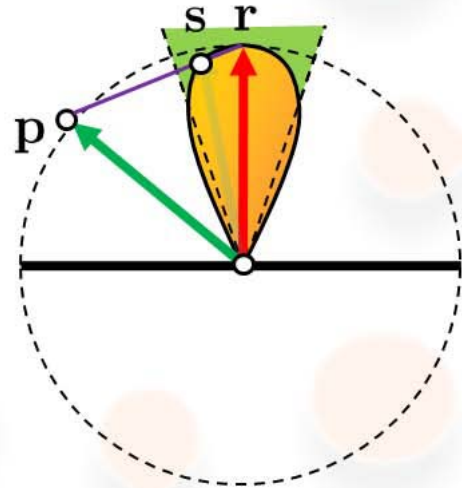
## ● Simple Approach

Specular term  $f(\varphi) = \cos^s(\varphi) = (\mathbf{r} \cdot \mathbf{v})^s$

Non-optimal, but easy to implement

*Idea:* uniform distribution of directions restricted to a cone

- Precompute random unit vectors with uniform PDF
- Randomly pick one vector  $\mathbf{p}$
- Negate vector, if  $(\mathbf{r} \cdot \mathbf{p}) < 0$
- Blend with vector  $\mathbf{r}$  and normalize
$$\mathbf{s} = \alpha \mathbf{r} + (1 - \alpha) \mathbf{p}$$



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Sampling a Specular Lobe

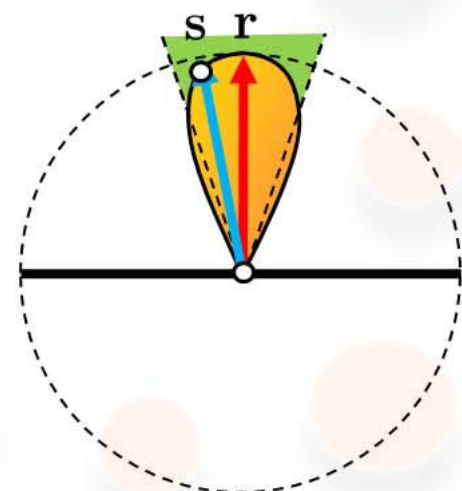
## ● Simple Approach

Specular term  $f(\varphi) = \cos^s(\varphi) = (\mathbf{r} \cdot \mathbf{v})^s$

Non-optimal, but easy to implement

*Idea:* uniform distribution of directions restricted to a cone

- Precompute random unit vectors with uniform PDF
- Randomly pick one vector  $\mathbf{p}$
- Negate vector, if  $(\mathbf{r} \cdot \mathbf{p}) < 0$
- Blend with vector  $\mathbf{r}$  and normalize
$$\mathbf{s} = \alpha \mathbf{r} + (1 - \alpha) \mathbf{p}$$
- Blend weight  $\alpha$  controls the size of the specular highlight and can be calculated from shininess  $s$



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





# Stochastic Sampling

$$\int_a^b f(x) dx \approx \sum_{i=0}^N \frac{f(x_i)}{p(x_i)}$$

- What is the *ideal* PDF for sampling a given function  $f(x)$ ?
- Variance is minimal, if

$$p(x) = \lambda \cdot f(x)$$

- $\lambda$  must be chosen to normalize the distribution
- Problem:

$$\int_a^b p(x) dx = 1 \quad \Rightarrow \quad p(x) = \frac{f(x)}{\int_a^b f(x) dx}$$

- The ideal PDF requires knowing the integral beforehand!



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Stochastic Sampling

$$L(\mathbf{x}, \omega_o) = \int_{\Omega} f(\mathbf{x}, \omega_i \rightarrow \omega_o) L(\mathbf{x}, \omega_i) \cos \theta_i d\omega_i$$

Diagram: A box labeled "unknown" is positioned above the integral sign in the equation. Two lines extend from the "unknown" box, one to the left and one to the right, pointing towards the  $L(\mathbf{x}, \omega_o)$  and  $L(\mathbf{x}, \omega_i)$  terms respectively, indicating that the integral is unknown.

Although we do not know the integral completely,  
we still know parts of it



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Stochastic Sampling

$$L(\mathbf{x}, \omega_o) = \int_{\Omega} \overset{\text{unknown}}{f(\mathbf{x}, \omega_i \rightarrow \omega_o)} \overset{\text{known}}{L(\mathbf{x}, \omega_i)} \cos \theta_i d\omega_i$$

Although we do not know the integral completely, we still know parts of it

$$\hat{p}(\omega_i) = f(\mathbf{x}, \omega_i \rightarrow \omega_o) \cos \theta_i$$

$$p(\omega_i) = \frac{\hat{p}(\omega_i)}{\int_{\Omega} \hat{p}(\omega) d\omega}$$



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Solid Angle

$$A_{\text{Hemisphere}} = \int_{\Omega^+} 1 d\omega = 2\pi$$

$$du = r d\theta$$

$$dv = r \sin \theta d\phi$$

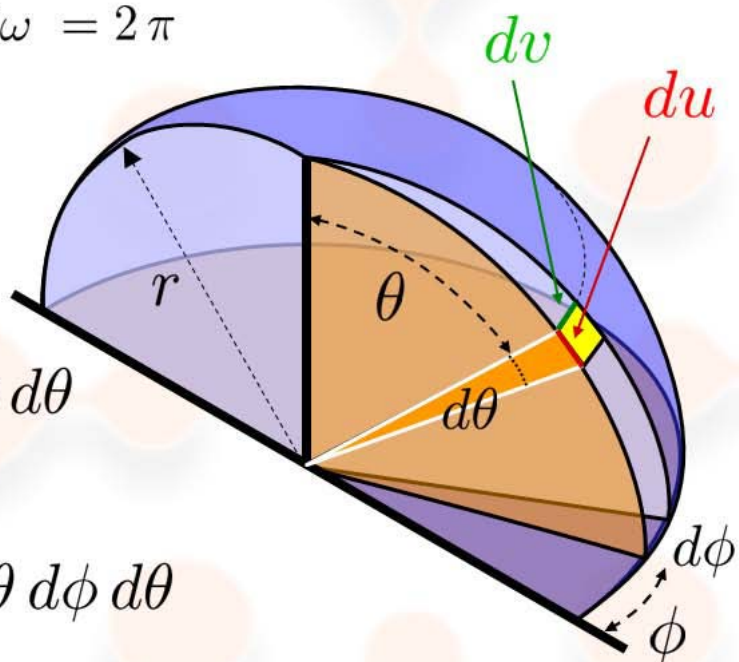
Area (yellow):

$$dA = r^2 \sin \theta d\phi d\theta$$

Solid Angle:

$$d\omega = \frac{dA}{r^2} = \sin \theta d\phi d\theta$$

Unit of solid angle: Steradian [sr]



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Sampling a Specular Lobe

## ● Ideal Sampling

$$f(\omega_i) = \cos^n(\theta_i) \qquad p(\omega_i) = \frac{f(\omega_i)}{\int_{\Omega^+} f(\omega_i) d\omega}$$

$$\int_{\Omega^+} \cos^n(\theta) d\omega = \int_0^{2\pi} \int_0^{\pi/2} \cos^n(\theta) \sin(\theta) d\theta d\phi = \frac{2\pi}{(n+1)}$$



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Sampling a Specular Lobe

## ● Ideal Sampling

$$f(\omega_i) = \cos^n(\theta_i) \qquad p(\omega_i) = \frac{f(\omega_i)}{\int_{\Omega^+} f(\omega_i) d\omega}$$

$$p(\theta_i, \phi_i) = \frac{(n+1)}{2\pi} \cos^n \theta_i \sin \theta_i$$



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





# Sampling a Specular Lobe

## ● Ideal Sampling

$$f(\omega_i) = \cos^n(\theta_i) \qquad p(\omega_i) = \frac{f(\omega_i)}{\int_{\Omega^+} f(\omega_i) d\omega}$$

$$p(\theta_i, \phi_i) = \frac{(n+1)}{2\pi} \cos^n \theta_i \sin \theta_i$$

$$p(\theta_i) = (n+1) \cos^n \theta_i \sin \theta_i$$

$$p(\phi_i | \theta_i) = \frac{1}{2\pi}$$

## ● Convert to CDF and invert

$$\theta_i = \cos^{-1} \xi_1^{\left(\frac{1}{n+1}\right)}$$

$$\phi_i = 2\pi \xi_2$$



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Importance Sampling

## Literature:

- M. Pharr, G. Humphries: **Physically Based Rendering**, Morgan Kauffman (Elsevier), 2004
- M. Colbert, J. Křivánek, **GPU-Based Importance Sampling** in *H.Nguyen (edt.): GPU Gems 3*, Addison-Wesley, 2008



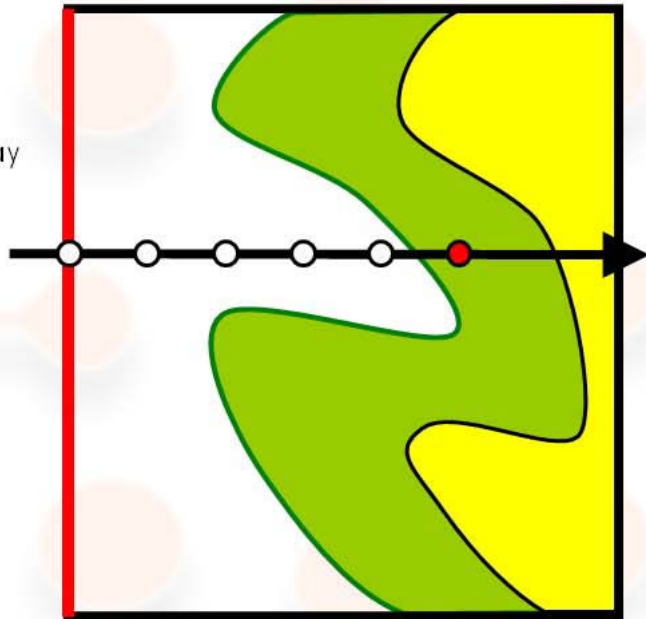
CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# GPU Ray-Casting

## ● Calculate First Intersection with Isosurface

- Rasterize the front faces of the bounding box
- For each fragment, cast a ray
- Find first intersection point with isosurface by sampling along the ray



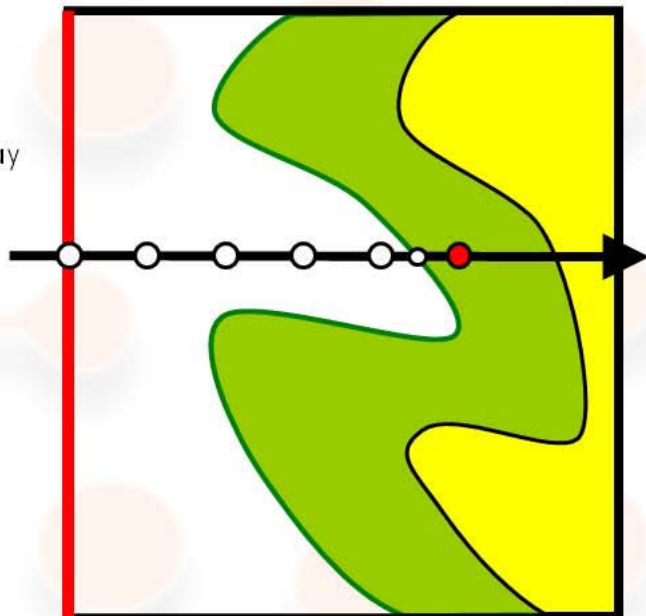
CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# GPU Ray-Casting

## ● Calculate First Intersection with Isosurface

- Rasterize the front faces of the bounding box
- For each fragment, cast a ray
- Find first intersection point with isosurface by sampling along the ray
  - interval bisection



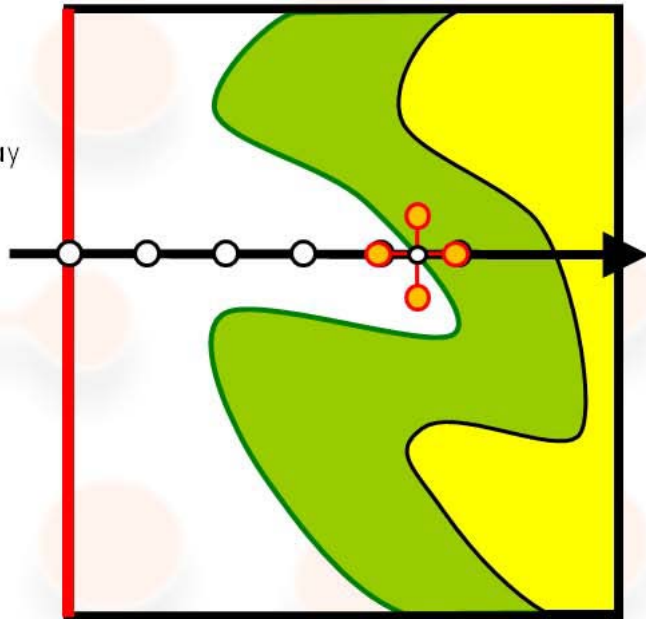
CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# GPU Ray-Casting

## ● Calculate First Intersection with Isosurface

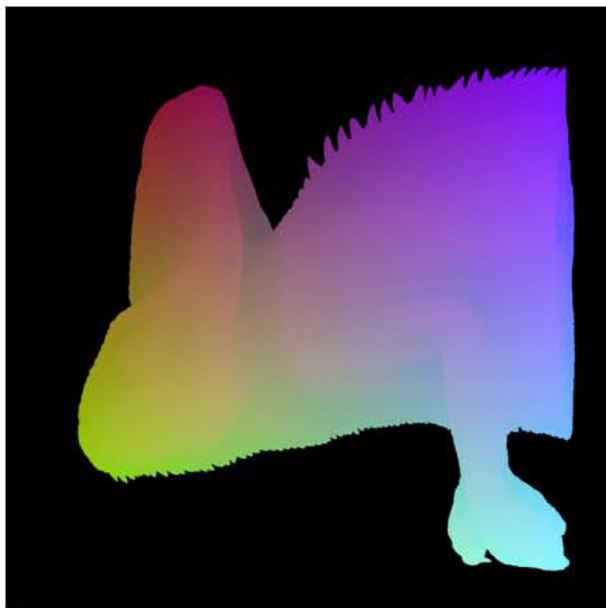
- Rasterize the front faces of the bounding box
- For each fragment, cast a ray
- Find first intersection point with isosurface by sampling along the ray
  - interval bisection
- Store the intersection point in render target 0
- Estimate the gradient vector using central differences
- Store the gradient vector in render target 1



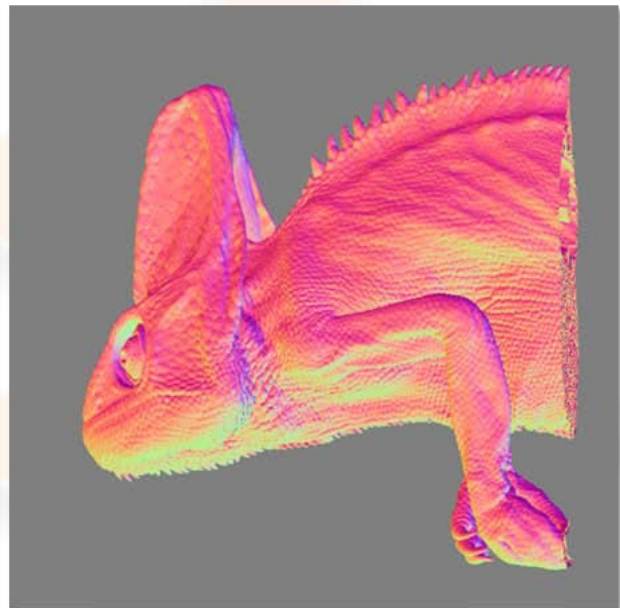
CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## First Render Pass



MRT0: xyz-coordinates of first intersection point with isosurface



MRT1: xyz-components of gradient vector (color coded)



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

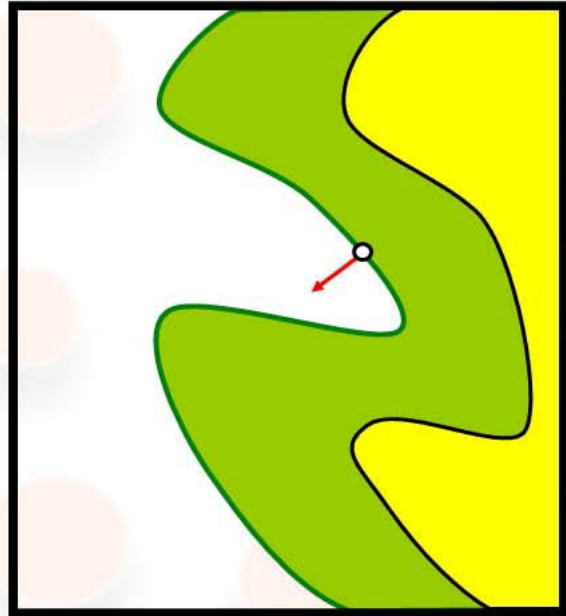




# Deferred Shading

Single Scattering (no shadows)

- Diffuse term:
  - Sample irradiance cube using gradient direction



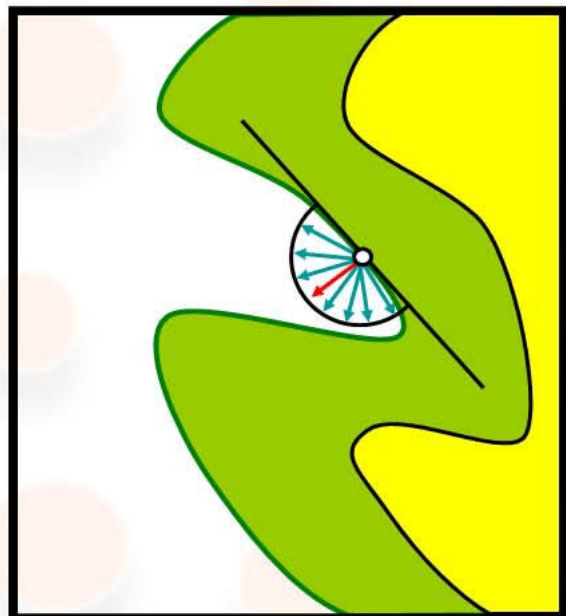
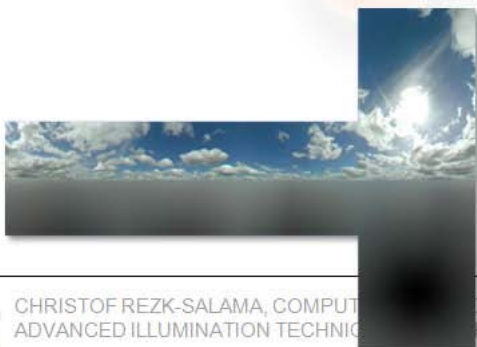
CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Deferred Shading

Single Scattering (no shadows)

- Diffuse term:
  - Sample irradiance cube using gradient direction
- Specular term:
  - Calculate random directions on the specular lobe
  - Sample environment cube



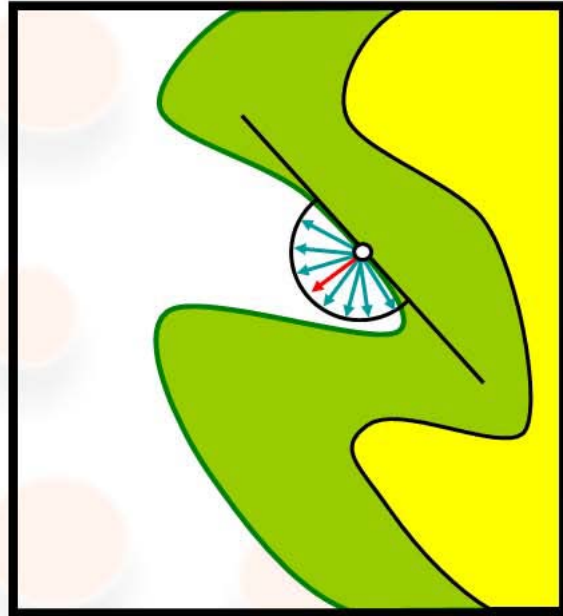
CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Deferred Shading

Single Scattering (no shadows)

- Diffuse term:
  - Sample irradiance cube using gradient direction
- Specular term:
  - Calculate random directions on the specular lobe
  - Sample environment cube
  - Weight each sample with its BRDF/phase function and its probability distribution



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# High Quality Isosurface



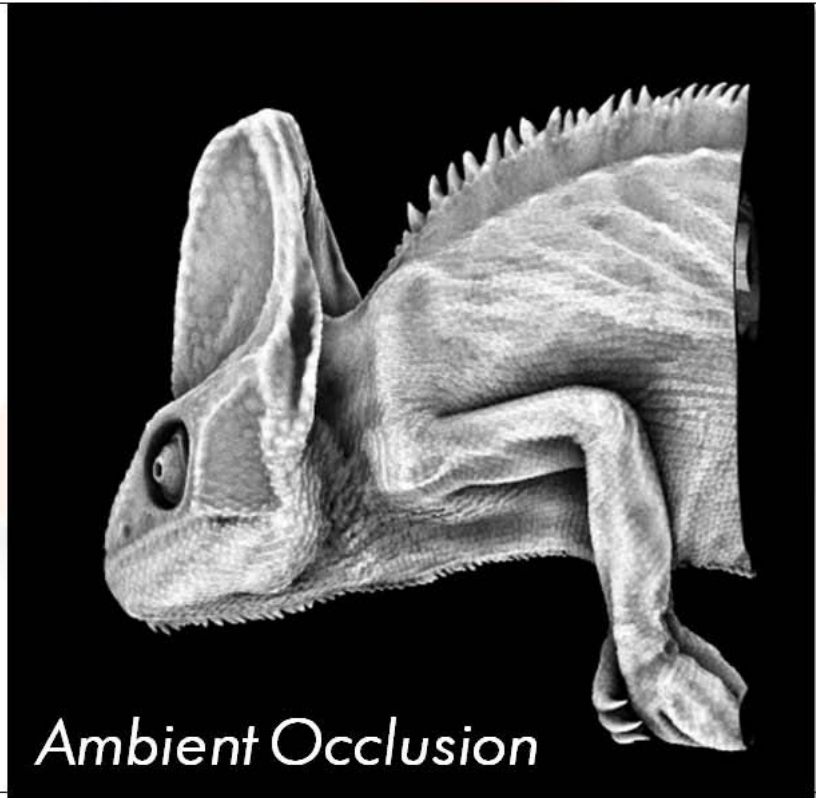
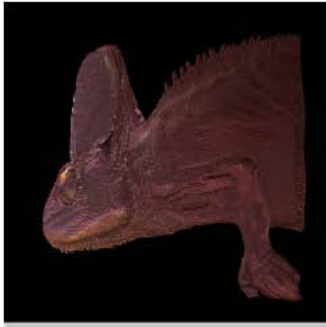
Single Scattering



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



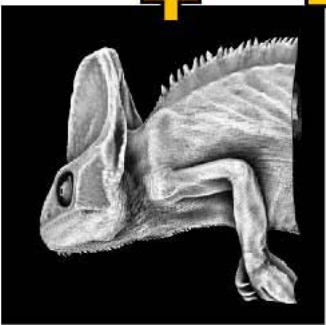
# High Quality Isosurface



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# High Quality Isosurface



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





# Our First Implementation

Why not use a pre-filtered environment map?

You can, but

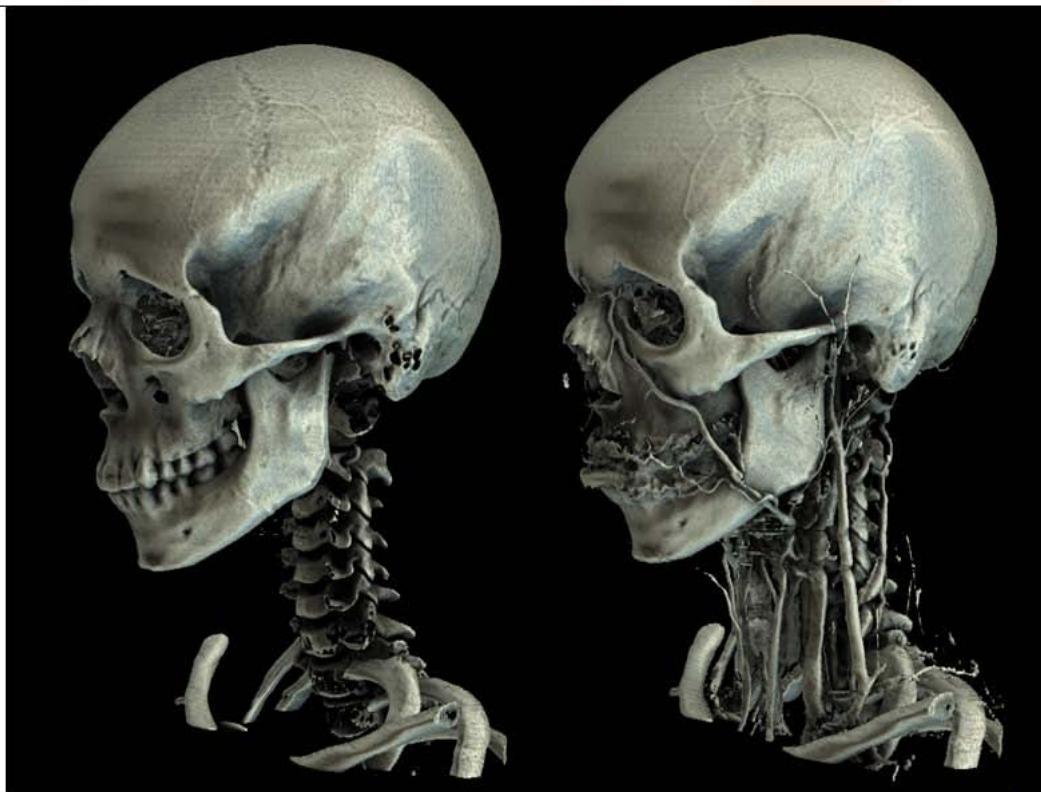
- it only works for **one** specular exponent per object
- Variable shininess may be used to *visualize additional surface properties* (e.g. gradient magnitude)



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



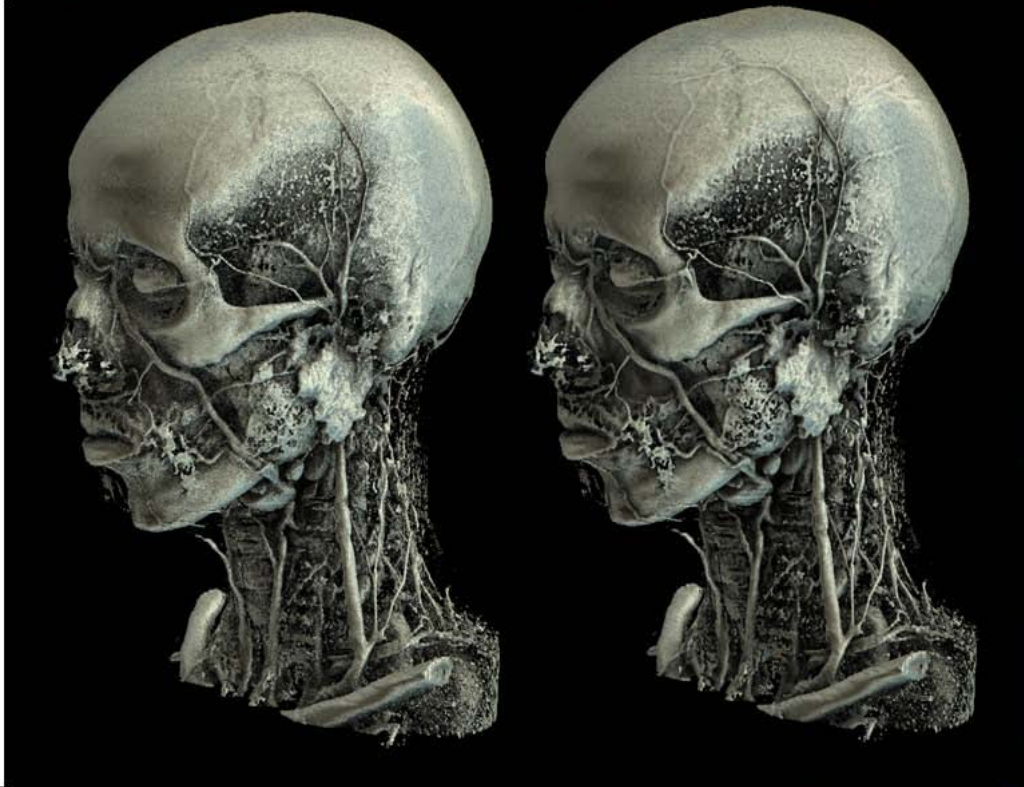
# Single Scattering Example



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Single Scattering Example



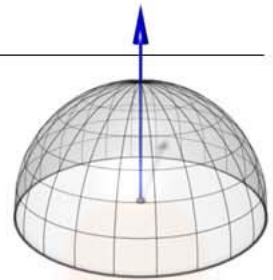
CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Multiple Scattering

### Mathematical Model

$$L(\mathbf{x}, \omega_o) = \int_{\Omega} p(\mathbf{x}, \omega_o \rightarrow \omega_i) L(\mathbf{x}, \omega_i) d\omega_i$$

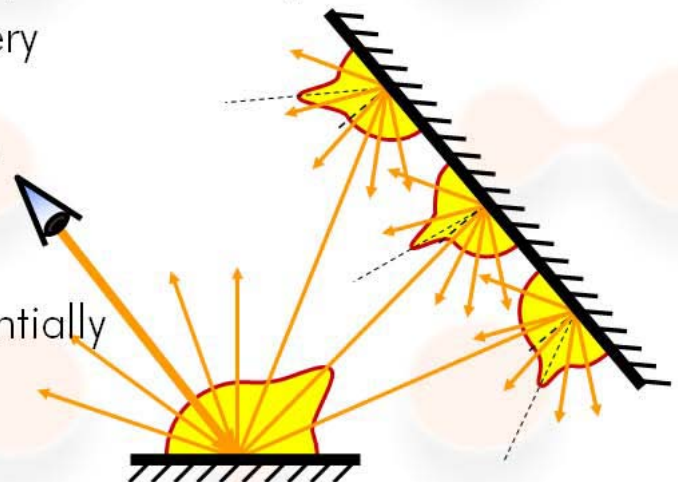


integrates over the entire sphere/hemisphere

- Integral must be solved for every intersection point
- *Fredholm Equation* (cannot be solved analytically)

### Numerical Solution:

- Number of rays grows exponentially
- Much workload spent for little contribution



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



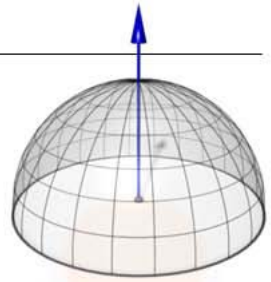


# Multiple Scattering

## Mathematical Model

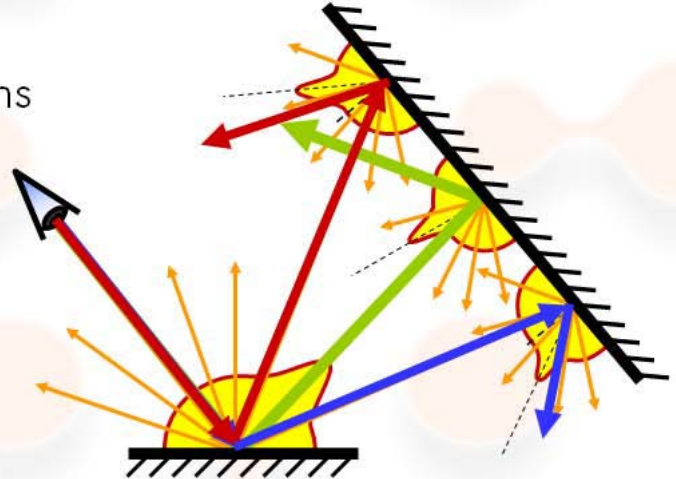
$$L(\mathbf{x}, \omega_o) = \int_{\Omega} p(\mathbf{x}, \omega_o \rightarrow \omega_i) L(\mathbf{x}, \omega_i) d\omega_i$$

integrates over the entire sphere/hemisphere



## Quantum Optics

- Trace the path of single photons
- Photons are scattered randomly
- Probability of scattering direction given by BRDF/phase function
- *Monte Carlo path tracing*

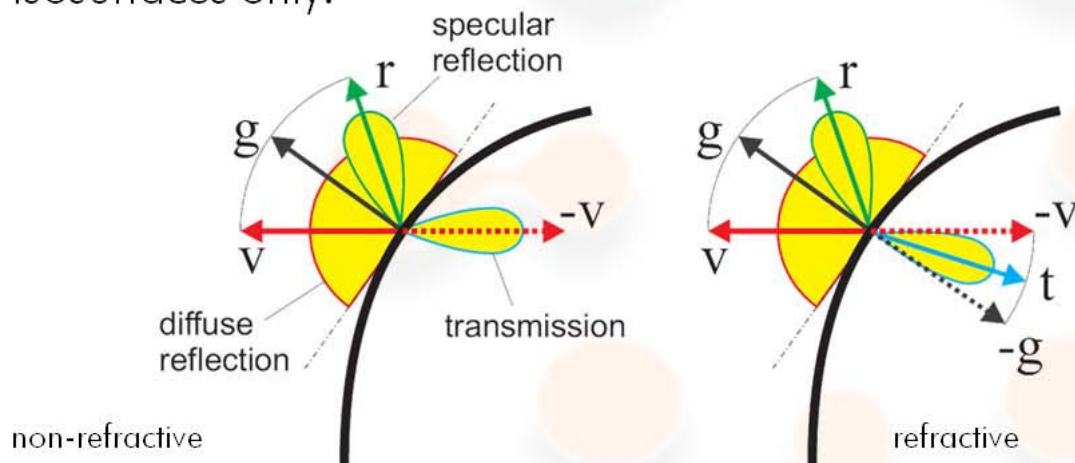


CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Phase Function Model

- Scattering of light at every point inside the volume
  - Too expensive (extremely slow convergence)
  - Not practicable. Controlling the visual appearance is difficult
- *Idea:* Restrict scattering events to a fixed number of isosurfaces only.



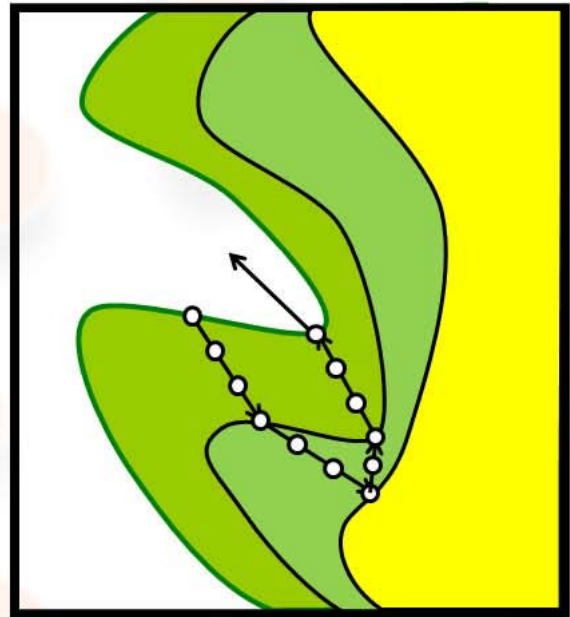
CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# GPU Ray-Casting

## Scattering Pass

- Start at first isosurface and trace inwards
- Account for absorption along the rays
- Proceed until next isosurface
- Calculate scattering event
- Sample the environment on exit



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

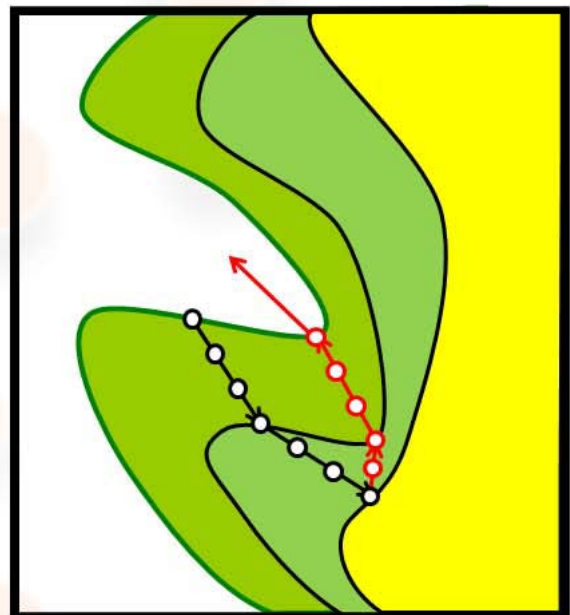


# GPU Ray-Casting

## Scattering Pass

### *Simplifying Assumption:*

- Absorption on the „way in“ is same as on the „way out“
- Abort the ray inside the volume square the absorption and sample irradiance map
- *Not very accurate but good visual results*



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





# Scattering Pass



preview in real-time



final version in 1/2-1 seconds



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Final Composite



Multiply



Blend  
using  
Fresnel term



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





# Path Tracing

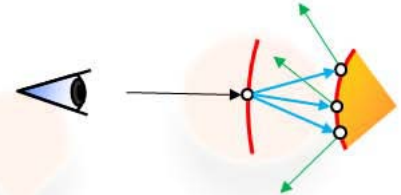
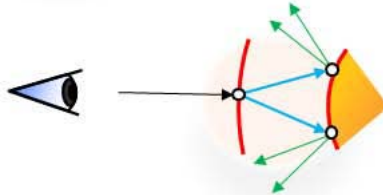
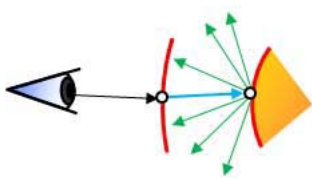
Primary rays: 1  
Secondary rays: 64



Primary rays: 8  
Secondary rays: 8



Primary rays: 64  
Secondary rays: 1

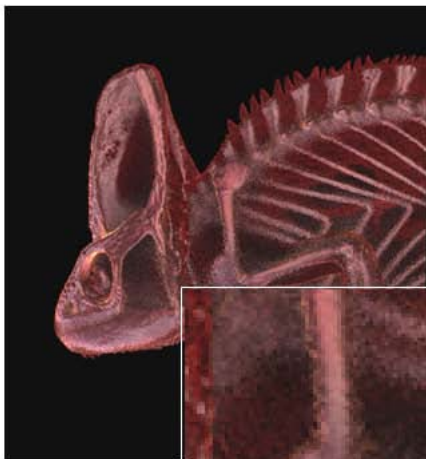


CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

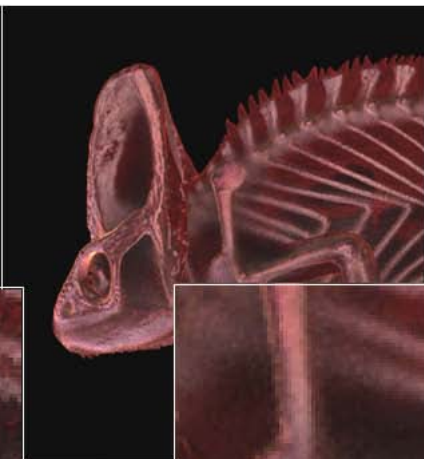


# Path Tracing

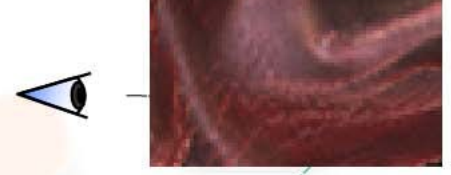
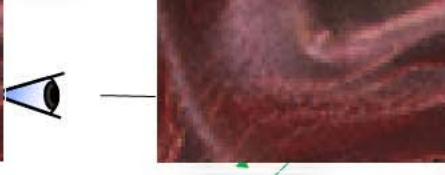
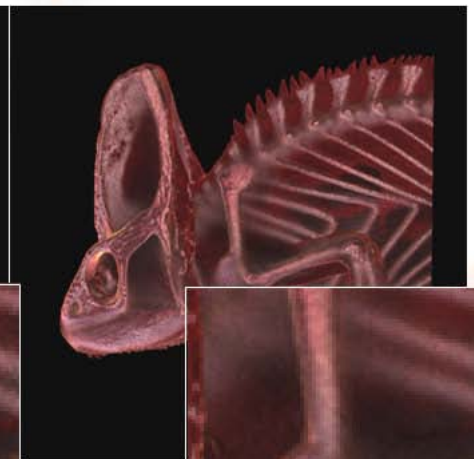
Primary rays: 1  
Secondary rays: 64



Primary rays: 8  
Secondary rays: 8



Primary rays: 64  
Secondary rays: 1

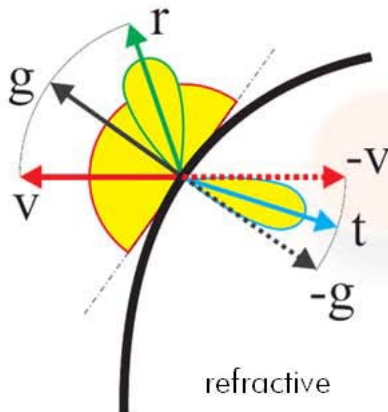


CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Examples

Different scattering cone angles for the „inward-looking“ (transmissive) Phong-lobe



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Scattering Effects Light Map Approaches

Markus Hadwiger  
VR VIS Research Center  
Vienna, Austria



Patric Ljung  
Siemens Corporate Research  
Princeton, NJ, USA



Christof Rezk Salama  
Computer Graphics Group  
Institute for Vision and Graphics  
University of Siegen, Germany

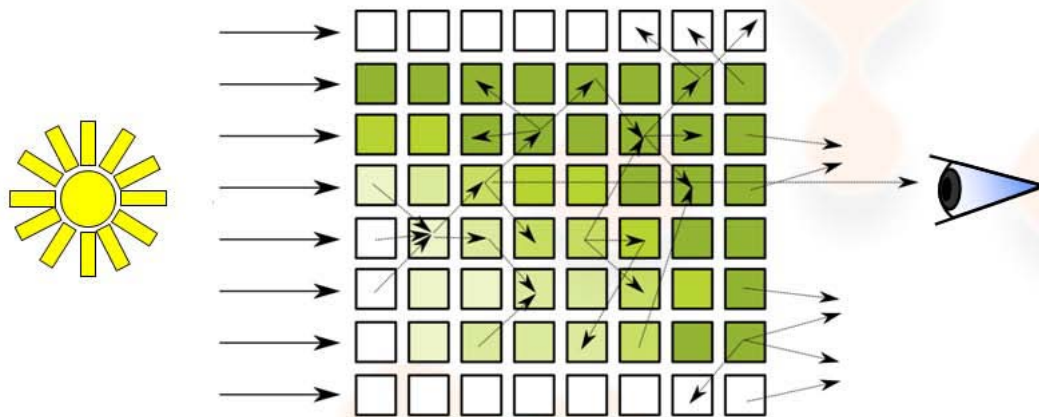


Timo Ropinski  
Visualization and Computer  
Graphics Research Group,  
University of Münster, Germany





# 3D Light Map



- Direct light by shadow volume or deep shadow map
- Consider the *exchange of radiant energy between neighbouring voxels*
- Approximate by blur operation (like [Kniss, 2002])



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Generate a 3D Light Map

- **Based on Shadow Volume**
- Calculate shadow volume for direct light as in
  - U. Behrens and R. Ratering. **Adding Shadows to a Texture-Based Volume Renderer**. In Proc. IEEE Symposium on Volume Visualization, 1998, p.39–46.
- Blur the direct light slice by slice



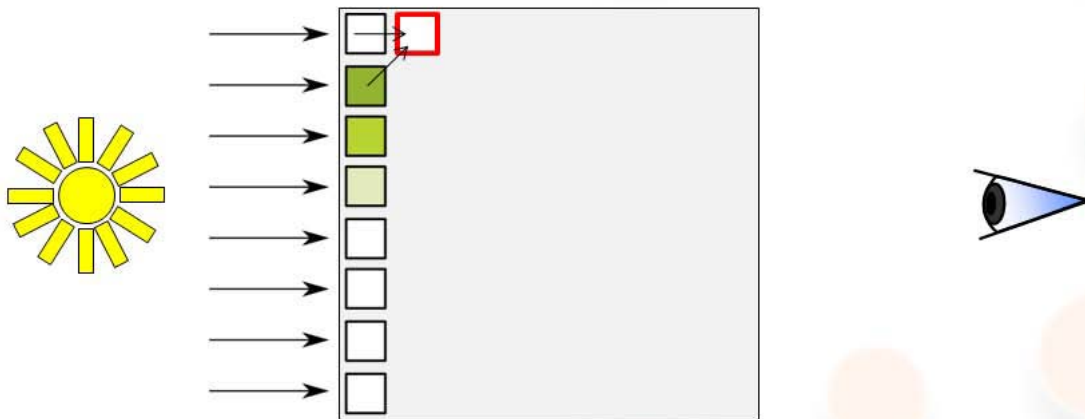
CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Generate a 3D Light Map

- **Based on Shadow Volume**

- Calculate shadow volume for direct light as in
  - U. Behrens and R. Ratering. **Adding Shadows to a Texture-Based Volume Renderer**. In Proc. IEEE Symposium on Volume Visualization, 1998, p.39–46.
- Blur the direct light slice by slice



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Generate a 3D Light Map

- **Based on Shadow Volume**

- Calculate shadow volume for direct light as in
  - U. Behrens and R. Ratering. **Adding Shadows to a Texture-Based Volume Renderer**. In Proc. IEEE Symposium on Volume Visualization, 1998, p.39–46.
- Blur the direct light slice by slice



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Generate a 3D Light Map

- **Based on Shadow Volume**

- Calculate shadow volume for direct light as in
  - U. Behrens and R. Ratering. **Adding Shadows to a Texture-Based Volume Renderer**. In Proc. IEEE Symposium on Volume Visualization, 1998, p.39–46.
- Blur the direct light slice by slice



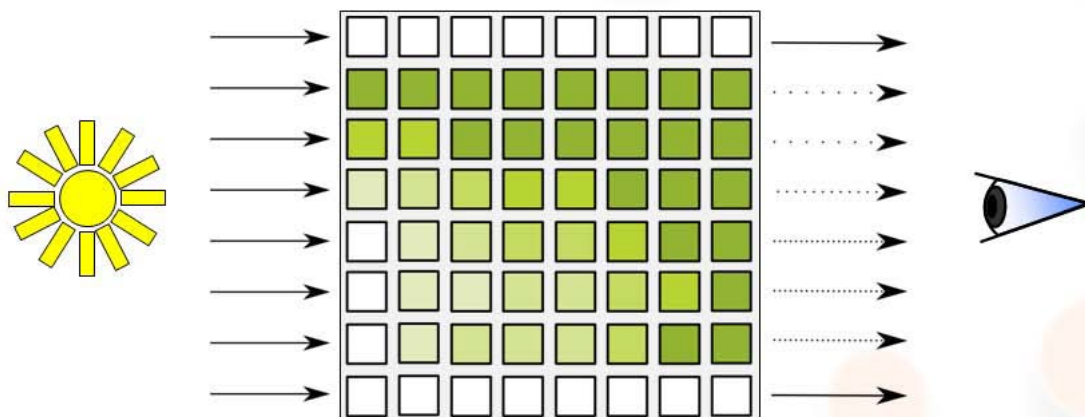
CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Generate a 3D Light Map

- **Based on Shadow Volume**

- Calculate shadow volume for direct light as in
  - U. Behrens and R. Ratering. **Adding Shadows to a Texture-Based Volume Renderer**. In Proc. IEEE Symposium on Volume Visualization, 1998, p.39–46.
- Blur the direct light slice by slice



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





# Scattering 3D Light Map

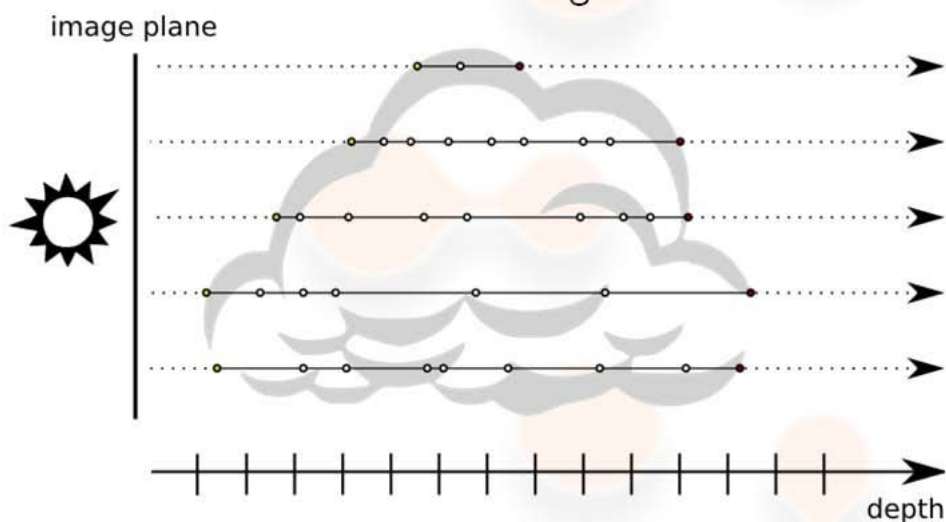


CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



## Calculate a 3D Light Map

- Based on Deep Shadow Map
- Resample the deep shadow map on a *uniform voxel grid*
- *Coarse grid resolution* is sufficient due to the low-frequency nature of volumetric scattering

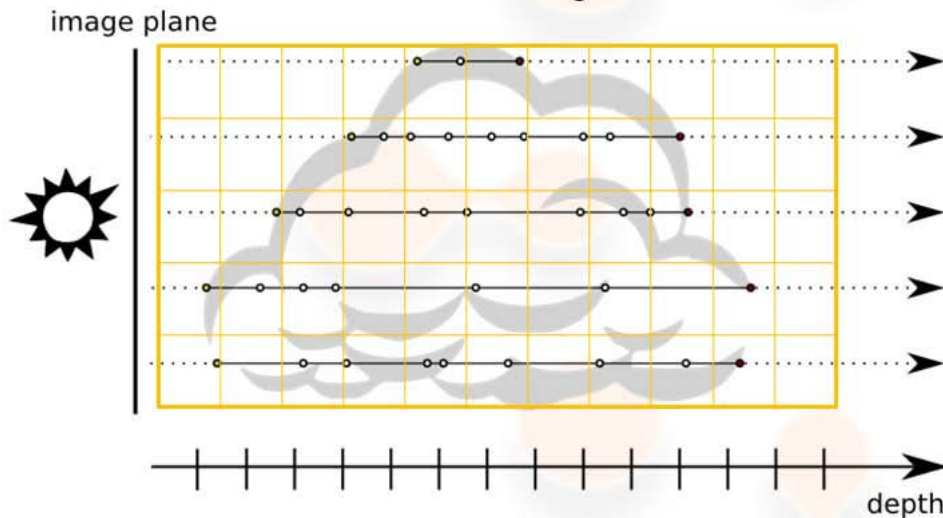


CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Calculate a 3D Light Map

- Based on Deep Shadow Map
- Resample the deep shadow map on a *uniform voxel grid*
- *Coarse grid resolution* is sufficient due to the low-frequency nature of volumetric scattering



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Scattering Deep Shadow Map

Direct  
light



Direct plus  
indirect light



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING





# Light Map Approaches

## Shadow Volume Approach

- Calculated in Model Space
  - Limited by Resolution of Shadow Volume
- High Memory Requirements

## Deep Shadow Map Approach

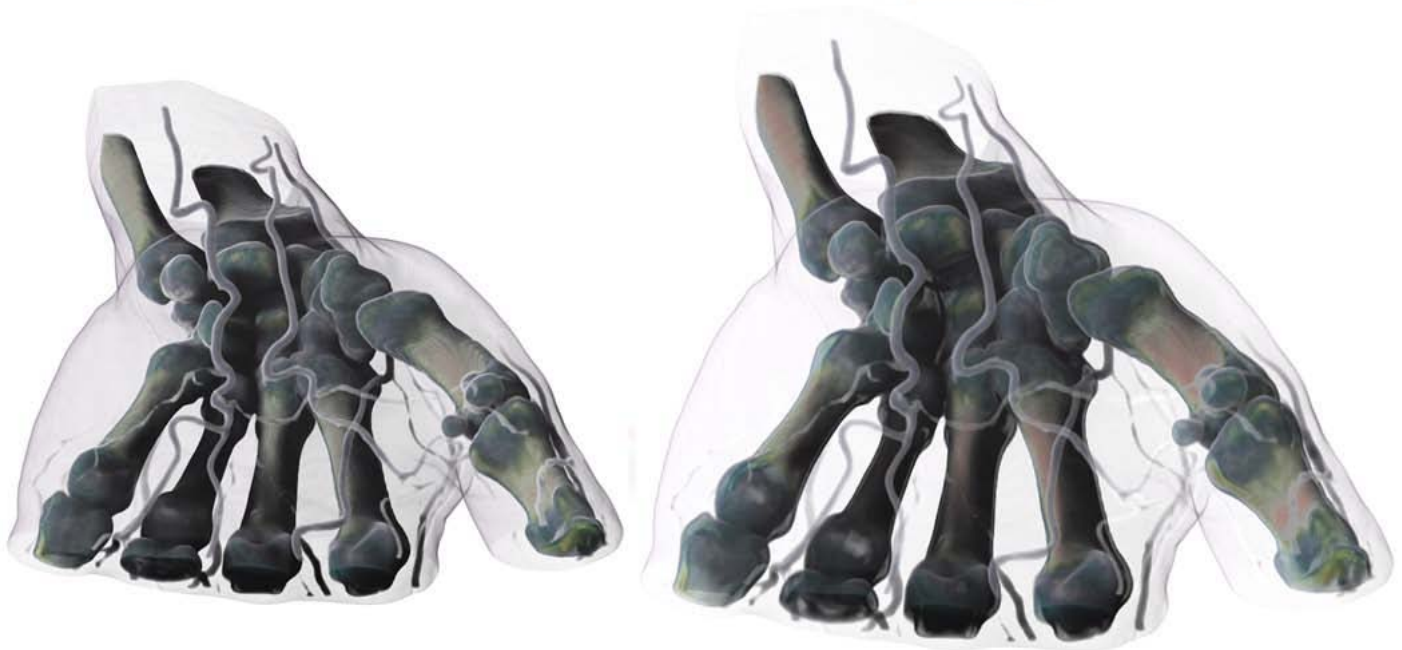
- Calculated in Screen Space
  - Limited by Resolution of Shadow Volume
- Reduced Memory Requirements
- High Precision



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# High Dynamic Range



Direct light and shadows

Direct light, shadows and translucency



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING



# Summary

## Scattering Effects

### ● Single Scattering

- *Filtered Environment Maps*
- *Monte-Carlo Integration*

### ● Multiple Scattering

- *Monte-Carlo Integration*
- *3D Light Maps*  
(*Shadow Volume/Deep Shadow Map*)



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

08

# Acknowledgements

- Images and Slides on Deep Shadow Maps:  
*Andrea Kratz, Zuse Institute, Berlin*  
*Markus Hadwiger, VRVis, Vienna*
- Volume Data Sets:
  - Medical data sets courtesy of *Agfa Vienna and Dept. Of Neurosurgery, Medical University Vienna*
  - Chameleon, Cheetah, Bat, Pterosaur  
courtesy of *UTCT data archive, University of Texas at Austin*
  - Carp Data set courtesy of *Univ. of Erlangen-Nuremberg*



CHRISTOF REZK-SALAMA, COMPUTER GRAPHICS GROUP, UNIVERSITY OF SIEGEN, GERMANY  
ADVANCED ILLUMINATION TECHNIQUES FOR GPU-BASED VOLUME RAYCASTING

