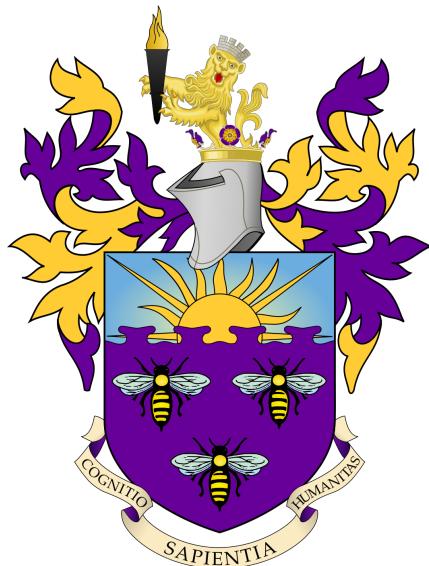


The University of Manchester

## Building a Ray-Traced Rendering Engine on Sparse Voxel Grids



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# Abstract

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## Acknowledgements

Thanks!

# Part I

## Introduction

### 1 Motivation

### 2 Objectives

1. Develop advanced ray tracing algorithms that take full advantage of modern hardware.
2. Explore acceleration structures that optimize ray casting performance.
3. Develop a voxel rendering engine that integrates these advanced algorithms and structures.
4. Design the engine architecture to take full advantage of the algorithms and technology it is built on, ensuring robustness, efficiency, and rendering performance.
5. Compare and test these algorithms against each other to validate improvements in speed and quality.

### 3 Aims

1. *Performance*: Optimize the rendering engine to handle complex scenes with high levels of detail and dynamic changes efficiently, striving for enhancements in both speed and graphical output.
2. *Safety*: Make sure the system is reliable, minimize memory leaks and undefined behaviours
3. *Cross-Platform*: Ensure the engine is not tied to a specific platform, operating system or graphics backend
4. *Futre-Proofing*: Build the engine on a forward-looking graphics API, designed to be efficient, powerful, and broadly supported.

### 4 Report structure

The report is comprised of 5 parts:

- Part I gives an introduction to the project and the report
- Part II details the project background, literature review and related work
- Part III presents a detailed walkthrough of the designing and development of the project
- Part IV shows the results and experiments of the project
- Part V presents the project conclusions

## Part II

# Background and Literature Review

## 5 Rendering engines

Graphics engines serve as the core software components responsible for rendering visual content in applications ranging from video games to scientific simulations and visual effects in movies. Engines abstract the complexities of rendering by providing developers with high-level tools and interfaces to represent digital environments.

Rendering engines have evolved from the simple wire-frame models of the 1960s to today's complex 3D systems, driven by advancements in computational power and graphical standards[1] like OpenGL introduced in the early 1990s.

### 5.1 Primitives

At the heart of any graphical engine is the concept of primitives, the simplest forms of graphical objects that the engine can process and render. Primitives are building blocks from which more complex shapes and scenes can be constructed.

**Polygons**, particularly triangles, are the most commonly used primitives in 3D graphics. This is owed to their simplicity and flexibility, allowing the construction of virtually any 3D shape through *tesselation*. Polygonal meshes define the surfaces of objects in a scene, with each vertex of a polygon typically associated with additional information such as color, texture coordinates, and normal vectors for lighting calculations.

**Voxels** represent a different approach to defining 3D shapes, they are essentially three-dimensional pixels. Where polygons define surfaces, voxels establish volume, with each voxel being able to contain color and density information. This characteristic makes voxels particularly well-suited for rendering scenes with materials that have intricate internal structures, such as fog, smoke, fire and fluids.

### 5.2 Ray-tracing vs. Rasterization

Rendering engines can utilise two main rendering techniques for rendering scenes: ray tracing and rasterization, both having their advantages and trade-offs.

**Rasterization** is the most widespread technique used in real-time applications. It converts the 3D scene into a 2D image by projecting vertices onto the screen, filling in pixels that make up polygons, and applying textures and lighting. Over the development of the industry of graphics programming, graphics hardware has become extremely efficient at performing rasterization, making it the standard for video games and interactive applications.

**Ray-Tracing**, in contrast, simulates the path of light as rays travelling through a scene to produce images with realistic lighting, shadows, reflections, and refractions. Ray tracing is computationally intensive but yields higher-quality images, making it favored for applications where visual fidelity is critical. However, recent advancements in hardware have begun to bring real-time ray tracing to interactive applications.

Ray tracing, conceptualized by Arthur Appel in 1968<sup>[2]</sup>, offers photorealistic images by simulating light paths, but its computational intensity limited early use to non-real-time applications. Rasterization, popularized in the 1970s and optimized by GPU advancements, became the standard for real-time graphics, though *recent* hardware innovations are now enabling real-time ray tracing.

## 6 Representing voxels

To efficiently represent and manipualte voxels in program memory, various data structures can be employed. Each method entails trade-offs between memory usage, access speed and complexity of implementation. Access speed refers to the time complexity of querying the datastructure at an arbitray point in space to retrieve a potential voxel.

### 6.1 Voxel grids

A voxel grid is the most straightforwad and intuitive approach to representing volumetric data. The 3D space is divided into a regular grid of voxels, each holding information such as color, material properties, or density. This method provides direct  $O(1)$  access to voxel data.

However, this simplicity comes at a signficant disatvantage: memory consumption. As the bounding volume or the level of detail of the of the scene increases, the memory required to store the voxel grows by  $O(N^3)$ . Additionally, empty space can occupy a majority of the memory space. For example, consider a scene with two voxels that are a million units appart in all axes. A voxel grid would have to store all the empty voxels inbetween;  $10^{18}$  memory units reserved, 2 of which carry usefull data. This limitation makes the naive voxel grids impractical for large or highly detailed scenes.

### 6.2 Hierarchical voxel grids (N-trees)

To mitigate this issues, hierarchical grids, such as octrees, are employed. An octree is a tree data structure where each node represents a cubic portion of 3D space and has up to eight children. This division continues recursively, allowing for varying levels of detail within the scene: larger volumes are represented by higher-level nodes, while finer details are captured in lowere levels.

The primary advantage of using an octree is spatial efficiency. Regions of the space that are empty or contain uniform data can be represented by a single node, significantly reducing the memory footprint. Furthermore, octrees facilitate efficient querying operations, such as collision detection and ray tracing, by allowing the algorithm to quickly discard large empty or irrelevant regions of space.

Hierarchical grids introduce complexity in terms of implementation and management. Operations such as updating the structure or balancing the tree to ensure efficient access can be more challenging compared to uniform grids. Another sacrifice is access-time, as querying an arbitrary region of space can entail walking down the tree for several levels. Nonetheless, for applications requiring large, detailed scenes with a mix of dense and sparse regions, the benefits of hierarchical representations often outweigh these drawbacks. This is why N-trees are frequently used in voxel engines.

The concept of octrees was introduced by Donald Meagher in 1980<sup>[3]</sup> as a means to efficiently manage spatial data in 3D computer graphics. This technique quickly became integral in applications like 3D rendering and geometric modeling, where it revolutionized spatial data optimization by balancing detailed representation with computational efficiency.

### 6.3 VDB

**VDB** was introduced in 2013 by Ken Museth<sup>[4]</sup> from the DreamWorks Animation team.

It is a Volumetric, Dynamic grid that shares several characteristics with B+-trees. It exploits spatial coherency of time-varying data to separately and compactly encode data values and grid topology. VDB models a virtually infinite 3D index space that allows for cache-coherent and fast data access into sparse volumes of high resolution.

At its core, VDB functions as a shallow N-tree with a fixed depth, where nodes at different levels vary in size. The top level of this tree structure is managed through a hash map, enabling VDB

models to cover extensive index spaces with minimal memory overhead. This design achieves  $O(1)$  access performance and can effectively store tiled data across vast spatial regions.

The VDB data structure was introduced along with several algorithms that make full use of the data structures features, offering significant improvements in techniques for efficiently rendering volumetric data. These are some of the benefits VDB have, as detailed in the original paper.

1. *Dynamic.* Unlike most sparse volumetric data structures, VDB is developed for both dynamic topology and dynamic values typical of time-dependent numerical simulations and animated volumes.
2. *Memory efficient.* The dynamic and hierarchical allocation of compact nodes leads to a memory-efficient sparse data structure that allows for extreme grid resolution.
3. *Fast random and sequential data access.* VDB supports fast constant-time random data lookup, insertion, and deletion.
4. *Virtually infinite.* VDB in concept models an unbounded grid in the sense that the accessible coordinate space is only limited by the bit-precision of the signed coordinates.
5. *Efficient hierarchical algorithms.* The **B+tree** structure offers the benefits of cache coherency, inherent bounding-volume acceleration, and fast per-branch (versus per-voxel) operations.

These benefits make VDB a very compelling data structure to serve as the building block of voxel-based rendering engine.

## 7 Ray tracing

In order to render a scene using ray tracing, camera rays are shot through the view frustum and into the scene. At each object intersection, part of a ray will get absorbed, reflected and refracted. In order to achieve realistic results, a rendering engine needs to model as many of these light interactions as possible in each frame's time budget.

This section delves into the integration of ray tracing within the graphics pipeline and the methods used to implement it, focusing on casting a ray through a scene.

### 7.1 Graphics pipeline

The graphics pipeline of a rendering engine is the underlying system of a rendering engine that transforms a 3D scene into a 2D representation that is presented on a screen. While rasterization transforms 3D objects into 2D images through a series of stages (vertex processing, shape assembly, geometry shading, rasterization, and fragment processing), the ray tracing pipelines introduce a paradigm shift. It primarily involves calculating the path of rays from the eye (camera) through pixels in a image plane and into the scene, potentially bouncing off surfaces or passing through transparent materials before contributing to the color of a pixel.

This step of calculating a ray's path is central in ray tracing, and as such, the performance of the algorithm that does this calculation is critical.

### 7.2 Casting a ray

Ray casting techniques vary depending on the representation of the 3D world within the rendering engine. This section introduces basic ray casting techniques, while subsequent discussions will cover methods specific to voxel-based environments.

#### Ray marching

A straightforward way to represent a 3D environment would be a mathematical function of sorts. It would take as input the coordinates point and return the properties of a material at that point (provided there is an object at there).

The first algorithm one might develop when trying to cast a ray through an unknown scene is ray marching. It involves incrementally stepping along a ray, sampling the scene for collisions at each step. The chosen step size needs to be sufficiently small to ensure no detail is missed.

While simple, ray marching is not without its drawbacks, especially in terms of performance. Considering the need to process millions of pixels per frame within the time constraints of high frame rates, it becomes apparent that iterating a ray tens of thousands of times for every pixel is impractical for modern engines.

This requires the exploration of more advanced techniques to meet the goal of visual realism and performance.

## Ray casting

A 3D environment could also be represented as a collection of polygons that form meshes.

Ray casting finds the intersection of rays with geometric primitives like (e.g. triangles, circles). This method skips stepping along the ray entirely by making use of the underlying mathematics of intersecting lines with polygons.

The fundamental issue with this approach is that rays must be checked for an intersection with all the primitives in the scene. Thus computing a single ray intersection has linear complexity in the number of polygons in the scene.

## SDF

Signed distance fields (**SDF**) are a different way of representing the environment. An SDF provides the minimum distance from a point in space to the closest surface, allowing the ray marching algorithm to efficiently skip empty space and accurately determine surface intersections. With the distance to the nearest surface known, ray marching can be performed by stepping along the ray with that distance, drastically reducing the number of steps needed to cast a ray.

Combining SDF with ray marching offers a powerful method for rendering complex scenes, including soft shadows, ambient occlusion, and volumetric effects. This combination is highly flexible and can create highly detailed and intricate visual effects, particularly in procedural rendering and visual effects.

SDFs are not without drawbacks, they can be difficult to maintain, and computationally expensive to generate or update. In practice, distance data can't be of arbitrary size, as that distance information comes at the cost of program memory.

SDFs have been used in real-time rendering, usually in a raymarching context, starting in the mid 2000s. In 2007, Valve was using SDFs to render large pixel-size smooth fonts on the GPU in its games<sup>[5]</sup>.

### 7.3 Casting a ray on a voxel grid

The ray casting methods presented so far do not take advantage of the discrete grid of voxel that this rendering engine is based on. In this section, efficient algorithms that can use the underlying representation of hierarchical voxel grid are presented.

## DDA

On a discrete voxel grid, basic ray marching can be improved by stepping from voxel to voxel. Because the voxels are the smallest unit of space, a ray can safely step from one to the next, knowing there is nothing else inbetween.

The Digital Differential Analyzer (**DDA**) line drawing algorithm does precisely that, it marches along a ray from voxel to voxel, skipping all space in between.

DDA works by breaking down the minimum distance a ray has to travel to intersect a grid line on each axis. At each iteration, it steps to the closest grid intersection along the ray.

## HDDA

On a hierarchical grid the DDA algorithm can take advantage of the topology of the data structure by stepping through empty larger chunks. A ray casted using **HDDA**, essentially performs DDA at the level in the tree it is currently at.

A version of the HDDA algorithm for the VDB data structure was introduced by Ken Museth in 2014<sup>[6]</sup>. This algorithm can be highly efficient, large empty areas can be skipped in a single step, drastically reducing the required steps to march a ray.

## 8 Summary of similar systems

### 8.1 OpenVDB<sup>[7]</sup>

“OpenVDB is an Academy Award-winning open-source C++ library comprising a novel hierarchical data structure and a suite of tools for the efficient storage and manipulation of sparse volumetric data discretized on three-dimensional grids. It was developed by DreamWorks Animation for use in volumetric applications typically encountered in feature film production and is now maintained by the Academy Software Foundation (ASWF).”

This is the original library developed by the authors of the VDB paper. It is very well integrated with a range of rendering engines like Blender, Maya and Houdini. OpenVDB is more of a library to interact with the VDB data structure than a rendering engine. It implements highly optimized algorithms for VDB data (e.g. CUDA HDDA).

### 8.2 All is Cubes<sup>[8]</sup>

“This project is a game engine for worlds made of cubical blocks (“blocky voxels”). The particular features of this engine are that each ordinary block is itself made out of blocks, and all game mechanics are defined by data within the world that can be interactively edited.”

This is a voxel rendering engine made on the same backend as this project, Rust and wgpu, however it employs a more standard approach of rendering, generating triangle meshes from voxel data and performing rasterization.

### 8.3 Unique Contribution of this Project

To the best of my knowledge, there is currently no fully operational voxel rendering engine built solely on the VDB data structure. This project aims to fill that gap by developing a comprehensive rendering engine based entirely on VDB, leveraging its capabilities to handle complex and detailed volumetric data efficiently. Unlike other systems, which may integrate VDB as one of many components or use it for specific functions, this engine is designed to utilize VDB as the core framework for all rendering tasks. This distinction sets the project apart, offering a new perspective and opportunities to explore novel ray-tracing techniques.

## Part III

# Methodology

This section outlines the implementation details of the voxel rendering engine, starting from the selection of programming languages and libraries, going over the architecture of the engine, and diving deep into the data structures and algorithms employed, particularly focusing on VDB for voxel representation and the optimization of ray casting algorithms. Finally, this section will discuss the extension of these algorithms to full-fledged ray tracing, allowing for dynamic lightning and glossy material support.

## 9 Language and framework

The voxel rendering engine is built using **Rust**, a programming language known for its focus on safety, speed, and concurrency<sup>[9]</sup>. Rust's design emphasizes memory safety without sacrificing performance, making it an excellent choice for high-performance applications like a rendering engine. The language's powerful type system and ownership model prevent a wide class of bugs, making it ideal for managing the complex data structures and concurrency challenges inherent in rendering engines. Thanks to this no memory leak or null pointer was ever encountered throughout the development of this project.

For the graphical backend, the engine utilizes **wgpu**<sup>[10]</sup>, a Rust library that serves as a safe and portable graphics API. wgpu is designed to run on top of various backends, including Vulkan, Metal, DirectX 12, and WebGL, ensuring cross-platform compatibility. This API provides a modern, low-level interface for GPU programming, allowing for fine-grained control over graphics and compute operations. wgpu is aligned with the WebGPU specification<sup>[11]</sup>, aiming for broad support across both native and web platforms, using the WebGPU shading language (wgsl)<sup>[12]</sup>. This choice ensures that the engine can leverage the latest advancements in graphics technology while maintaining portability and performance.

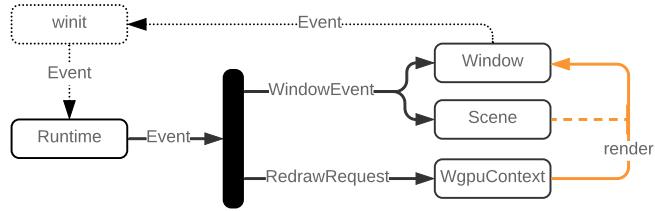
The combination of Rust and wgpu offers several advantages for the development of a rendering engine:

1. *Safety and Performance*: Rust's focus on safety, coupled with wgpu's design, minimizes the risk of memory leaks and undefined behaviors, common issues in high-performance graphics programming. This is thanks to Rust's idea of zero-cost abstractions.
2. *Cross-Platform Compatibility*: With wgpu, the engine is not tied to a specific platform or graphics API, enhancing its usability across different operating systems and devices.
3. *Future-Proofing*: wgpu's adherence to the WebGPU specification ensures that the engine is built on a forward-looking graphics API, designed to be efficient, powerful, and broadly supported. It also allows the future option of supporting web platforms, once browsers adopt WebGPU more thoroughly.
4. *Concurrency*: Rust's advanced concurrency features enable the engine to efficiently utilize multi-core processors, crucial for the heavy computational demands of rendering pipelines.

These technical choices form the foundation upon which the voxel rendering engine is constructed. Following this, the engine's architecture is designed to take full advantage of Rust's performance and safety features and wgpu's flexible, low-level graphics capabilities, setting the stage for the implementation of advanced voxel representation techniques and optimized ray tracing algorithms.

## 10 Engine architecture

The engine's operation is centered around an event-driven main loop that blocks the main thread. This loop processes various events, ranging from keyboard inputs to redraw requests, and updates the window, context, and scene accordingly, routing each event to its corresponding handler.



**Fig. 1.** Engine event-loop diagram. Dotted arrows are implemented in `winit` crate. Black lines represent the flow of events. The arrow line represents the main render function called on the GPU context on the scene for the window.

### 10.1 Runtime

At the engine's core, sits `Runtime` structure, which manages the interaction between its main components:

- The `Window` is a handler to the engine's graphical window. It is used in filtering `OS` events that relevant to engine, grabbing the cursor and other boilerplate.
- The `Wgpu Context` holds the creation and application of the rendering pipeline.
- The `Scene` contains information about the camera and environment as well as a container voxel data structure.

```
pub struct Runtime {  
    context: WgpuContext,  
    window: Window,  
    scene: Scene,  
}  
  
impl Runtime {  
    ...  
    pub fn main_loop(&mut self, event: Event, ...) {  
        match event {  
            ...  
        }  
    };  
}
```

**Listing 1.** Runtime definition

For example, window events (e.g. keyboard & mouse input) generally modify the scene, like the camera position, and therefore are routed to the `Scene` struct.

Another key event is the `RedrawRequested` event, which signals that a new frame should be rendered. This is routed to the `wgpu` context to start the rendering pipeline.

The `RedrawRequested` event is actually emitted in `Runtime`, when it receives the `MainEventsCleared` event, it schedules the window for a redraw.

## 10.2 Window

The **Window** data structure, included in the **winit**<sup>[13]</sup> crate, handles window creation and management, and provides an interface to the GUI window through an event loop. This event loop is what **Runtime**'s main loop is mounted on.

The interaction between the **Window** and the **Runtime** forms an event-driven workflow. The window emits events and the runtime manages and distributes these events accordingly, forming a sort of feedback loop.

## 10.3 Scene

The **Scene** data structure holds information about the environment that is being rendered, this includes the model, camera, and engine state.

```
pub struct Scene {  
    pub state: State,  
    pub camera: Camera,  
    pub model: VDB,  
}
```

**Listing 2.** Scene definition

In this section, the camera and satte implementation is covered, the model will be covered in later [add link] when discussing the **VDB** implementation.

**State** handles information about the engine state such as cursor state and time synchronising to decouple engine events from the **FPS** (e.g. camera movement shouldn't be slower at lower FPS).

**Camera** describes all the elements needed to control and represent a camera:

1. *Eye*: The camera's position in the 3D space, acting as the point from which the scene is observed.
2. *Target*: The point in space the camera is looking at, determining the direction the camera is pointed in.
3. *Field of View (FOV)*: An angle representing the range that is in view. In the implementation, this refers to the FOV on the Y (vertical) axis.
4. *Aspect ratio*: The ratio between the width and height of the viewport. It ensures that the rendered scene maintains the correct proportions.

The eye and target are updated when moving the camera through a **CameraController** struct that handles keyboard and mouse input. Th FOV and aspect ratio are set based on the window proportions, to avoid distortion. The way in which this camera information is used will be detailed in the primitives section [add link] where we dive into what information is actually sent to the GPU in compute shaders.

## 10.4 WgpuContext

The **WgpuContext** structure is the backbone of the rendering pipeline in the voxel rendering engine. It contains the necessary components for interfacing with the GPU using the wgpu API, managing resources such as textures, shaders, and buffers, and executing rendering commands.

Broadly, **WgpuContext** has the following responsibilities:

1. *Initialization*: The constructor sets up the wgpu instance, device, queue, and surface. It also configures the surface with the desired format and dimensions, preparing the context for rendering.
2. *Resource Setup*: The constructor prepares various resources such as textures for the atlas representation of VDB data, uniform buffers for rendering state, and bind groups for shader inputs. It also dynamically reads VDB files, processes the data, and updates GPU resources accordingly.
3. *Rendering*: The render method handles updating the window surface. It triggers compute shaders for voxel data processing, manages texture and buffer updates, and executes the render pipeline. Additionally, it manages shader hot-reloading, renders the developer GUI and handles screen capture for recording.

## 10.5 Graphics Pipeline

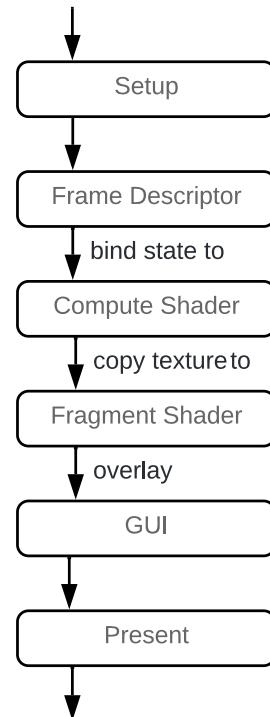
This section provides an overview of the graphics pipeline that is initiated at a `RedrawRequest` event.

When the `WgpuContext`'s render method is invoked, it starts by obtaining a reference to the output texture and creates a corresponding view. Following this, a command encoder is initialized to record GPU commands.

Next, it uses the `FrameDescriptor`, a structure designed to transform scene information (including the model, camera, and engine state), stored on the CPU, into GPU-compatible bindings. This step prepares all necessary bindings for the compute shaders, which then execute the ray-tracing algorithm across distributed workgroups, with the results written to a texture.

Once computation is complete, the texture containing the rendered image is prepared for display. This involves creating a vertex shader to generate a full-screen rectangle, onto which the texture is rasterized using fragment shaders, effectively transferring the rendered image to the output texture.

The final phase involves adding the GUI layer over the rendered scene before presenting the completed output texture on the screen.



## 10.6 GPU Types

This section covers the `FrameDescriptor` data structure and how it generates GPU bindings from the data in `Scene` which is stored on the CPU.

Virtually the entire ray-tracing algorithm is run in compute shaders. This means all the information about the model, camera, lights, and metadata has to be passed through.

The statically sized data i.e. the camera, sunlight and metadata is passed in an uniform buffer. This buffer is assembled inside the `FrameDescriptor` which wraps `ComputeState`.

```

#[repr(C)]
pub struct ComputeState {
    view_projection: [[f32; 4]; 4],
    camera_to_world: [[f32; 4]; 4],
    eye: [f32; 4],
    u: [f32; 4],
}
  
```

```

mv: [f32; 4],
wp: [f32; 4],
render_mode: [u32; 4],
show_345: [u32; 4],
sun_dir: [f32; 4],
sun_color: [f32; 4],
}

```

The GPU's uniform binding system has strict requirements regarding the types and sizes of data that can be passed to shaders. Therefore, information must be packed into memory-aligned bytes. This is facilitated by the [repr(C)] attribute, which organizes the struct's layout to match that of a C struct. The data also needs to be padded to fit the alignment options, for that reason all fields are 16 bytes, even if they carry less information.

```

impl ComputeState {
    ...
    pub fn build(
        c: &Camera,
        resolution_width: f32,
        render_mode: RenderMode,
        show_grid: [bool; 3],
        sun_dir3: [f32; 3],
        sun_color3: [f32; 3],
        sun_intensity: f32,
    ) -> Self;
}

```

**Listing 3.** `ComputeState` build method that transforms CPU data into GPU-ready data

The role of `ComputeState` is to translate high level CPU structures onto these low level GPU types. In future sections the function of the structures fields will be detailed thoroughly.

## 10.7 Camera

This section explains how the 3D ray-casting camera is implemented. The role of a camera in a ray-tracing engine is to cast rays from the eye of the camera through the middle of the pixels and into the scene.

Fundamentally the role of the camera is to convert points from world space into screen space. To that end, a view projection matrix can be constructed from the cameras properties (eye, target, FOV, aspect ratio) that takes any point in world space and projects it onto camera space.

In order to cast a ray in world space from the eye of the camera through the middle of the pixel and into the scene we need to bring the pixel from screen space into world space. This is the inverse operation to projection, and hence the inverse matrix of the projection matrix is the camera-to-world matrix.

$$\mathbf{d}_s = \begin{bmatrix} \frac{x - \text{width}}{2} \\ \frac{\text{height}}{2} - y \\ -\frac{h}{2} \tan^{-1} \frac{\text{fov}}{2} \end{bmatrix}, \quad \text{C2W} = \begin{bmatrix} u_x & v_x & w_x \\ u_y & v_y & w_y \\ u_z & v_z & w_z \end{bmatrix} \quad (1)$$

Multypling gives the pixel coordinates in world space

$$\mathbf{d}_w = \begin{bmatrix} x - \frac{\text{width}}{2} \\ \frac{\text{height}}{2} - y \\ -\frac{h}{2} \tan^{-1} \frac{\text{fov}}{2} \end{bmatrix} \begin{bmatrix} u_x & v_x & w_x \\ u_y & v_y & w_y \\ u_z & v_z & w_z \end{bmatrix} = \begin{bmatrix} (x - \frac{\text{width}}{2})u_x + (\frac{\text{height}}{2} - y)v_x - w_x \frac{h}{2} \tan^{-1} \frac{\text{fov}}{2} \\ (x - \frac{\text{width}}{2})u_y + (\frac{\text{height}}{2} - y)v_y - w_y \frac{h}{2} \tan^{-1} \frac{\text{fov}}{2} \\ (x - \frac{\text{width}}{2})u_z + (\frac{\text{height}}{2} - y)v_z - w_z \frac{h}{2} \tan^{-1} \frac{\text{fov}}{2} \end{bmatrix} \quad (2)$$

Which can be re-written by factoring constant terms into  $\mathbf{w}'$ :

$$\mathbf{d}_s = x\mathbf{u} + y * (-\mathbf{v}) + \mathbf{w}' \quad (3)$$

$$\mathbf{w}' = -\mathbf{u} \frac{\text{width}}{2} + \mathbf{v} \frac{\text{height}}{2} - \mathbf{w} \frac{h}{2} \tan^{-1} \frac{\text{fov}}{2} \quad (4)$$

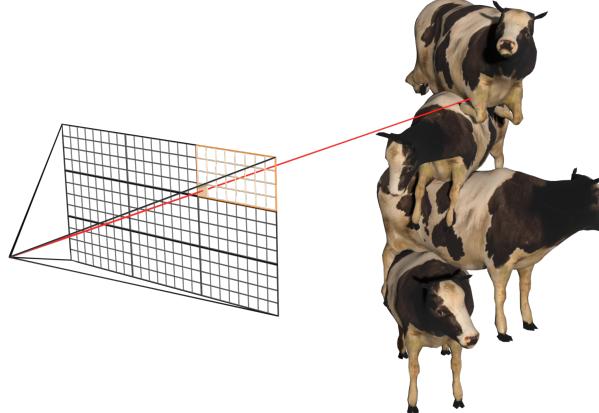
This form of the ray direction equation is very useful since the vectors  $\mathbf{u}$ ,  $\mathbf{v}$  and  $\mathbf{w}'$  can all be computed once per frame, then the equation is applied in compute shaders per pixel. This method is explained in more detail in this article<sup>[14]</sup>.

In the implementation, the calculation of these constant vectors is the responsibility of the `ComputeState` data structure; the `build` method (lst. 3) takes in a `Camera` specified by its eye, target, `FOV` and aspect ratio, and computes the view projection matrix, inverts it to get the camera to world matrix, extracts  $\mathbf{u}$ ,  $\mathbf{v}$  and  $\mathbf{w}$ , then uses the screen's resolution to calculate  $\mathbf{w}'$ . It then packs these vectors into 16 byte arrays.

## 10.8 Shaders

In this section the role of the three shader stages in the implementation is explained.

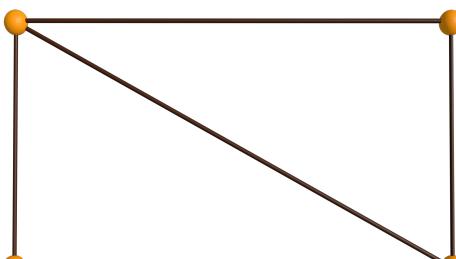
**Compute Shaders** are the first in the pipeline. They are responsible for performing the entire ray-tracing algorihtm. The Compute shader distributes computational power to work groups, which can be thought as independent units of execution that handle different parts of the calculation in parallel. Each work group is made up of multiple threads that can execute concurrently, significantly speeding up the process by allowing multiple computations to occur at the same time. The Compute Shader casts rays from the camera eye through the pixels, intersections with the model determine to a pixels's color based on material properties, and record these results on a 2D texture.

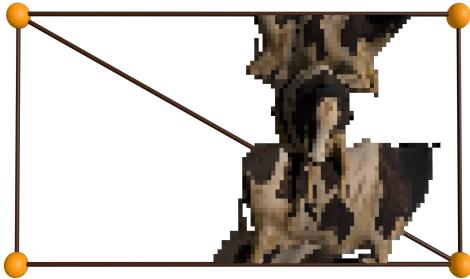


**Fig. 2.** Compute shader worker casting a camera ray through a pixel. Work groups of size  $8 \times 4 \times 1$  have split up the screen.

**Vertex Shaders** follow Compute Shaders in the graphics pipeline. Their main role is to define the vertices of a screen-sized rectangle, which serves as the canvas for overlaying the texture computed in the Compute Shader stage.

**Fragment Shaders** are the last shaders in the pipeline. The Fragment Shaders' role is to rasterize the texture onto the full-screen rectangle prepared by the Vertex Shader. This step effectively transfers the texture onto the display window.





**Fig. 4.** Fragment shader rasterizing the compute shader texture onto the output surface

## 10.9 GUI

This section covers the implementation of the **GUI** that allows the scene to active model to be changed, lighting to be modified, but also provides usefull developer metrics like ms/frame and other benchmarks.

The GUI is managed using the `egui` crate<sup>[15]</sup>. `egui` is an immediate<sup>[16]</sup> mode GUI library, which contrasts with traditional retained mode GUI frameworks<sup>[17]</sup>.

In immediate mode, GUI elements are redrawn every frame and only exist while the code that declares them is running. This approach makes `egui` flexible and responsive, as it allows for quick updates and changes without needing to manage a complex state or object hierarchy.

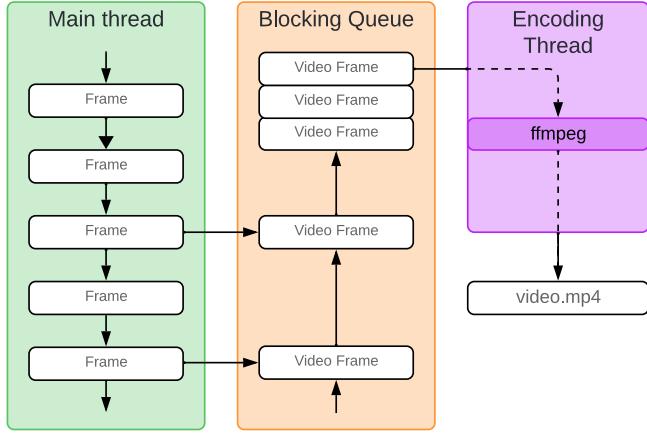
The GUI code is run as part of the graphics pipeline in the following steps:

1. *Start Frame:* Each frame begins with a start-up phase where `egui` prepares to receive the definition of the GUI elements. This setup includes handling events from the previous frame, resetting state as necessary, and preparing to collect new user inputs.
2. *Define GUI Elements:* The application defines its GUI elements by calling functions on an `egui` context object. These functions create widgets such as buttons, sliders, and text fields dynamically, based on the current state and user interactions. This step is where the immediate mode shines, as changes to the GUI's state are made directly in response to user actions, without requiring a separate update phase.
3. *End Frame:* After all GUI elements are defined, the frame ends with `egui` rendering all the GUI components onto the screen. During this phase, `egui` computes the final positions and appearances of all elements based on interactions and the layout rules provided.
4. *Integration with Graphics Pipeline:* The GUI is overlaid on the application using a texture that `egui` outputs. This texture is then drawn over the application window using a simple full-screen quad as in the previous section.

[maybe add screen shot?]

## 10.10 Recording

The engine includes an integrated screen recorder designed to efficiently capture screen footage without compromising the frame rate. Unlike external tools such as OBS, which must capture screen output externally and can be slow due to their inability to access application internals, this engine captures the output texture directly before it is displayed on the screen. This method significantly reduces the time required for capture, giving smoother results, and keeping the frame rate high.



**Fig. 5.** Producer-Consumer pattern of screen recording implementation

The key aspect of this process is to ensure that texture transfer and video encoding are handled asynchronously on a separate thread. This is done using a Producer-Consumer pattern, where the main thread acts as the producer. It periodically places frames into a blocking queue. From this queue, an encoding thread, acting as the consumer, retrieves and processes the frames. This includes encoding the frames into PNG format and subsequently feeding them into `ffmpeg`, a video encoding utility. This approach ensures background processing, minimizing the impact on the engine's performance.

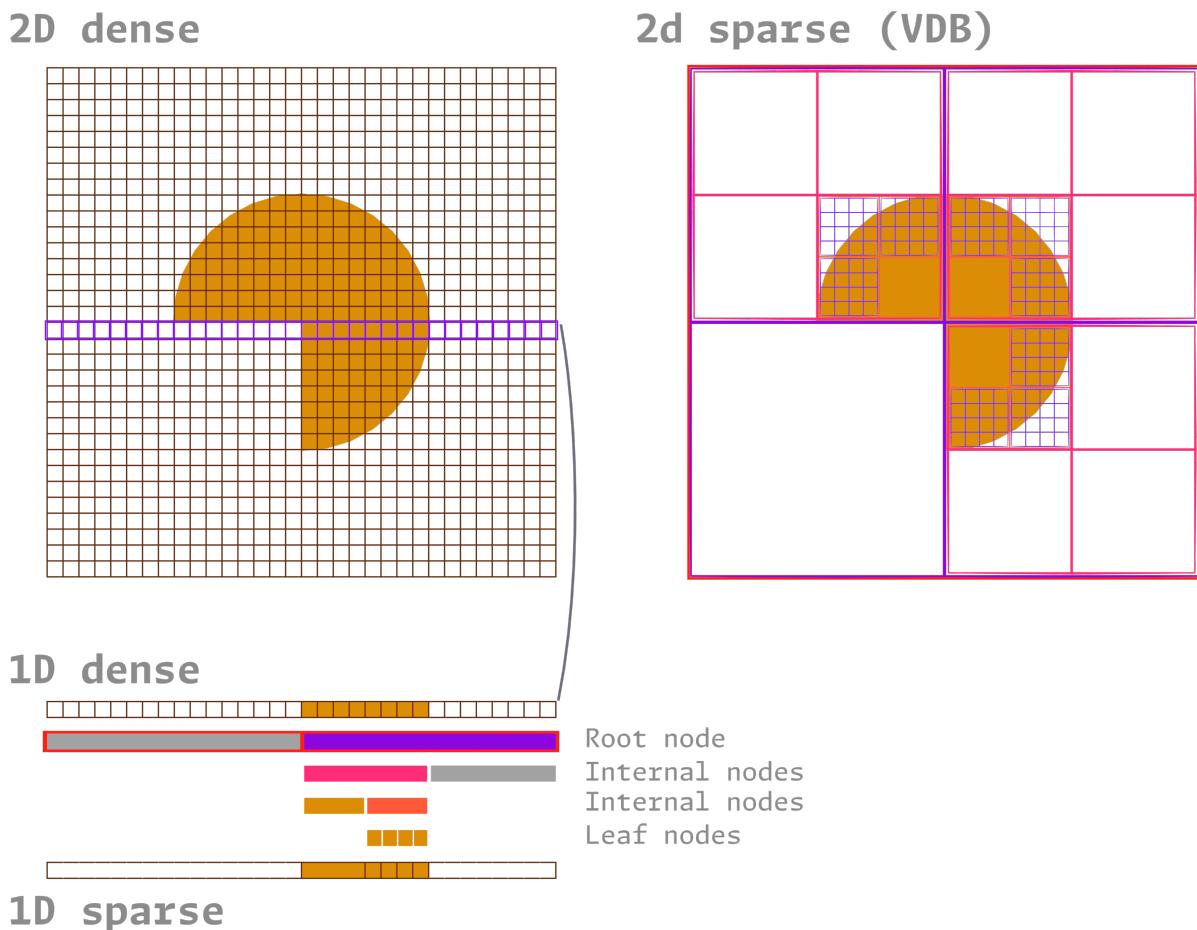
## 11 VDB Implementation

In this section the theory and implementation the VDB data structure is covered.

The VDB (Volumetric Dynamic B-tree) is an advanced data structure designed for efficient and flexible representation of sparse volumetric data. It is organized hierarchically, consisting of root nodes, internal nodes, and leaf nodes, each serving distinct purposes within the structure. This section begins by explaining in detail how VDB is structured, and it continues by going through the implementation of the data structure in the rendering engine.

### 11.1 Data Structure

VDBs are sparse, shallow trees with a fixed depth but expandable breadth, capable of covering an virtually infinite spatial domain. This design enables the VDB to efficiently manage large and complex datasets by adjusting the level of detail dynamically and minimizing memory usage.



**Fig. 6.** 2D & 1D slices of the VDB data structure representing three quarters of a circle. Top left: 2D dense representation of the circle. Top right: 2D sparse representation of the VDB. Bottom left: Sparse representation of the 1D vdb. Usually, VDB nodes have many more child nodes, which would make it harder to visualise, hence a smaller version of VDB is shown. This figure is an augmented version of the one in the original paper<sup>[4]</sup>

At the heart of the data structure are its three types of nodes, internal root and leaf. The VDB data

structure is inherently general, each of the nodes' sizes can be modified depending on the application. However, in practice only one specialization of the VDB structure is used, that is the VDB543. This is because the authors of the original paper<sup>[4]</sup> analyzed a suite of possible shapes and sizes, and this configuration of VDB the most balanced between performance and memory footprint for most practical applications [TODO: what applications?]

**Leaf Nodes** They are the lowest level in the tree structure. They store a 3D cubed grid of side length  $2^{\log_2 D}$  (i.e. only powers of 2). An leaf value in the grid can be a voxel's data, other associated data for empty values (such as SDF information), or an empty value. Leaf nodes also store a value mask. This is a bit-array meant to compactly determine if value at a specific coordinate in the 3D grid is voxel data or an empty value.

In the implementation the trait `Node` is defined which gives some associated data and methods leaf and internal nodes have.

```
pub trait Node {
    /// LOG2_D of side length
    /// LOG2_D = 3 => '512 = 8 * 8 * 8' values
    const LOG2_D: u64;
    /// Total conceptual LOG2_D node
    const TOTAL_LOG2_D: u64;
    /// Total conceptual LOG2_D of child node
    const CHILD_TOTAL_LOG2_D: u64 = Self::TOTAL_LOG2_D - Self::LOG2_D;
    /// Side length
    const DIM: u64 = 1 << Self::LOG2_D;
    /// Total conceptual dimension
    const TOTAL_DIM: u64 = 1 << Self::TOTAL_LOG2_D;
    /// Size of this node (i.e. length of data array)
    const SIZE: usize = 1 << (Self::LOG2_D * 3);
    /// Total conceptual size of node, including child size
    const TOTAL_SIZE: u64 = 1 << (Self::TOTAL_LOG2_D * 3);
}
```

**Listing 4.** Node trait definition

In lst. 4, `TOTAL_LOG2_D` represents the  $\log_2$  of the total dimension of the node, meaning how much actual space the node occupies. Leaf nodes are at the bottom of the tree and don't have children so this is the same as  $\log_2 D$ , but this value will be relevant for internal nodes. All other attributes are determined at compile-time depending on the size of the node  $\log_2 D$ .

**Sidenote on Coordinate Systems** It is very convenient for side lengths to be powers of two because of the way integers are stored in memory, as binary values. To get the global coordinate of a node with `TOTAL_LOG2_D = 3` that contains a point in global coordinates, the 3 least significant bits of each coordinate have to be masked out. This can essentially be done in a single CPU instruction for each coordinate.

```
/// Give global origin of Node coordinates from 'global' point
fn global_to_node(global: GlobalCoordinates) -> GlobalCoordinates {
    global.map(|c| (c >> Self::TOTAL_LOG2_D) << Self::TOTAL_LOG2_D)
}
```

Simillary, to get the relative coordinates of a global point within the node are precisely the `TOTAL_LOG2_D` least significant bits.

```
/// Give local coordinates relative to the Node containing 'global' position
fn global_to_relative(global: GlobalCoordinates) -> LocalCoordinates {
```

```

        global.map(|c| (c & ((1 << Self::TOTAL_LOG2_D) - 1)))
    }
}

```

This pattern of a few bit-wise operations can achieve any conversion from between coordinate systems one might need, and all of these through operations are extremely fast to compute on modern CPUs.

Lst. 5 shows a simplified definition of the leaf node data structure in the implementation. It has two fields: data which is an array representing the 3D cube grid of values, and value mask which is a the bit-mask carrying information on what each value represents, a voxel or empty space. the data array has  $2^{3\log_2 D}$  entries(e.g. for  $\log_2 D = 3 \Rightarrow D = 8$  the leaf node has  $8 \times 8 \times 8 = 512 = 2^9$  values). The value mask has the same number of bit entries, but it is stored as an array of unsined 64 bit integers, hence there are  $\frac{D^3}{64}$  of them.

```

pub struct LeafNode<ValueType, const LOG2_D: u64>
{
    pub data: [LeafData<ValueType>; (1 << (LOG2_D * 3))],
    pub value_mask: [u64; ((1 << (LOG2_D * 3)) / 64)],
}

pub enum LeafData<ValueType> {
    Tile(usize),
    Value(ValueType),
}

impl<ValueType, const LOG2_D: u64> Node for LeafNode<ValueType, LOG2_D>
{
    const LOG2_D: u64 = LOG2_D;
    const TOTAL_LOG2_D: u64 = LOG2_D;
}

```

**Listing 5.** `LeafNode` definition. In the original paper<sup>[4]</sup> node data is set as a union instead of a enum, in order to save on memory space, only using the masks to determine the type of a particular values. In this implementation a enum is used strictly for *ergonomics*, as the extra 1 byte of memory per value is generally not expensive on heap allocated memory. The value mask will still be crucial for the GPU version of VDB where there is more need for effective memory management and shading languages do not have enum support. In the `Node` trait implementation, since these nodes are the bottom level in the hierarchy (meaning they have no children), their in-memory dimensions are the same as their world space dimensions.

The implemenetation is general both in the type of value that is stored at the voxel level, `ValueType`, and in the dimension of the Node, `LOG2_D`. This makes use of Rust's generic const expresions feature<sup>[18]</sup> that is only available on the nightly toolchain. These work in a way akin to C++ templates allowing to define types of static size chosen by the user of the data structure that are resolved at compile time. This approach effectively allows to costumize the tree breadth and depth at compile time with no run-time overhead.

**Internal Nodes** They sit between the root node and the leaf nodes, forming the middle layer of the tree structure. They also store a 3D cubed grid of side length  $2^D$  of values. An internal value can either be a pointer to a child node (leaf or internal), or a tile value, which is a value that is the same for the whole space that would be covered by a child node in that position. Internal nodes also store a value mask and child mask. These determine if value at a specific coordinate in the 3D grid is child pointer, value type or empty value.

```

pub struct InternalNode<ValueType, ChildType: Node, const LOG2_D: u64>
{
    pub data: [InternalData<ChildType>; (1 << (LOG2_D * 3))],
}

```

```

    pub value_mask: [u64; ((1 << (LOG2_D * 3)) / 64)],
    pub child_mask: [u64; ((1 << (LOG2_D * 3)) / 64)],
}

pub enum InternalData<ChildType> {
    Node(Box<ChildType>),
    Tile(u32),
}

impl<ValueType, ChildType: Node, const LOG2_D: u64> Node
for InternalNode<ValueType, ChildType, LOG2_D>
{
    const LOG2_D: u64 = LOG2_D;
    const TOTAL_LOG2_D: u64 = LOG2_D + ChildType::TOTAL_LOG2_D;
}

```

**Listing 6.** InternalNode definition. Internal nodes have an extra field, the child mask that is the same size of the value mask. Additionally the internal data enum now has variants for a child pointer or 4 bytes of memory.

When implementing the `Node` the `TOTAL_LOG2_D` is calculated by adding this nodes  $\log_2 D$  with the child node's total  $\log_2 D$ . For example, for an internal node with  $\log_2 D = 4$  with children that are leaf nodes of  $\log_2 D' = 3$ , the internal node's  $\log_2 D_{total}$  will be 7. This means that the internal node has  $16 \times 16 \times 16$  children that each have  $8 \times 8 \times 8$  voxels; the total number of voxels one of these internal nodes is  $128 \times 128 \times 128$  or  $2^7 \times 2^7 \times 2^7$ .

It is important to note that all children of an internal node must be of the same type, which means each level in the tree only has one type of node, this ensure consistency in the coordinate system discussed previously.

**Root Node** The root node is a single node at the top of the VDB hierarchy. Unlike typical nodes in a tree data structure, the root node in a VDB does not store data directly but instead serves as an entry point to the tree. It contains a hash map indexed by global coordinates, linking to all its child nodes. This setup allows for quick access and updates, as the root node acts as a guide to more detailed data stored deeper in the hierarchy. Because its children nodes are stored by a hash map, it only stores information about space that has information to be stored(unlike an octree where empty top level nodes are frequent). The root node's primary role is to organize and provide access to internal nodes.

```

pub struct RootNode<ValueType, ChildType: Node>
{
    pub map: HashMap<GlobalCoordinates, RootData<ChildType>>,
}

pub enum RootData<ChildType> {
    Node(Box<ChildType>),
    Tile(u32),
}

```

**Listing 7.** RootNode definition. RootData is either a pointer to a child or a 4 bytes of data for a tile value.

Finally, a VDB simply consists of a root node and some metadata associated with the volume, stored in the `grid_descriptor` field. This metadata is generally only important when reading and writing `.vdb` files.

```

pub struct VDB<ValueType, ChildType: Node>
{

```

```

    pub root: RootNode<ValueType, ChildType>,
    pub grid_descriptor: GridDescriptor,
}

```

**Listing 8.** VDB definition

## 11.2 VDB543

VDB543 is the most widely used configuration of the VDB data structure, because gives a good balance of performance and memory footprint for most applications.

To refer to different shapes of the VDB data structure, by convention, they are named as VDB[a<sub>0</sub>, a<sub>1</sub>, ..., a<sub>n</sub>], n layers of internal nodes with  $\log_2 D_i = a_i$  followed by a layer of leaf nodes with  $\log_2 D_n = a_n$ . VDB543 therefore has a layer of leaf nodes with  $\log_2 D_{n3} = 3$  and two layers of internal nodes, one with  $\log_2 D_{n4} = 4$  and the other with  $\log_2 D_{n5} = 5$ .

To implement this type of VDB new type name for each type of node is created as show in lst. 9, chaining them up the tree. This section will refer to these nodes as **Node3s**, **Node4s** and **Node5s** respectively.

```

pub type N3<ValueType> = LeafNode<ValueType, 3>;
pub type N4<ValueType> = InternalNode<ValueType, N3<ValueType>, 4>;
pub type N5<ValueType> = InternalNode<ValueType, N4<ValueType>, 5>;
pub type VDB543<ValueType> = VDB<ValueType, N5<ValueType>>;

```

**Listing 9.** VDB543 definition

To calculate how much the in-memory size, in bytes, of each node the follwing calculation can be done, by taking into account the size of the 3D grid together with the masks:

For leaf nodes:	$M = D^3(v + 1) + \frac{D^3}{8}$
For internal nodes (2 masks):	$M = D^3(v + 1) + 2\frac{D^3}{8}$
Where:	$D$ = dimension of node (side-length)
	$v$ = number bytes the value type occupies (min. of 4)

Simillarly to find out how many voxels each node covers in world space:

<b>Node3:</b>	$D = 2^3 = 8$
	$S = D^3 = 8 \times 8 \times 8 = 512$
<b>Node4:</b>	$D = 2^4 = 16$
	$D_t = 2^{4+3} = 128$
	$S = D_t^3 = 128 \times 128 \times 128 = 2,097,152$
<b>Node5:</b>	$D = 2^5 = 32$
	$D_t = 2^{5+4+3} = 4096$
	$S = D_t^3 = 4096 \times 4096 \times 4096 = 68,719,476,736$

A single Node5 represent 4069<sup>3</sup> voxels in space, just under 69 billion. This is where the power of the VDB data structure can be seen; models can have multiple Node5s covering trillions of voxels in total all of which can be accessed in  $O(1)$  time, by going three layers down the tree.

### 11.3 Reading .vdb files

VDB was introduced along with an associated file format `.vdb` which gives a compact representation of the data structure. This section covers the part of the implementation that reads VDB files and stores them into memory.

Unfortunately, there is no official documentation of the format used to encode `.vdb` files. The only “official” resource available is the OpenVDB codebase<sup>[7]</sup>. This article<sup>[19]</sup> goes over a file format reversed engineered from the OpenVDB codebase and the bytecode of `.vdb` files. The implementation uses this latter, reversed engineered format, which only supports `.vdb` from version 218 onwards.

The following is an overview of the contents of a vdb file, as described in [19].

#### 1. Header

- (a) Magic number spelling out “ BDV” (8 bytes)
- (b) File version (u32)
- (c) Library major and minor versions (2 u32s)
- (d) Grid offsets to follow flag (u8)
- (e) **UUID** (128-bit)
- (f) Metadata entries, length-based list
- (g) Number of grids (u32)

Since multiple grids can be stored in a single file the following steps are repeated for all grids.

#### 2. VDB Grid

Grids are composed of a grid metadata and a tree. In the engine’s implementation they are just called VDB, as seen in lst. 8.

- (a) Name of the grid (length-based string)
- (b) Grid type (length-based string)  
e.g. `Tree_float_5_4_3` refers to a `VDB543f32` in the implementation. This type  $T$  will determine the size of the data when reading the tree data later on.
- (c) Instance parent (u32)
- (d) Byte offset to grid descriptor (u64)
- (e) Start and end location of grid data (2 u64)
- (f) Compression flags (u32)
- (g) Grid metadata, length-based list of metadata entries  
An entry consists of entry name as length-based string, entry type as length-based list, and actual data
- (h) Transform matrices to apply to voxels coordinates to convert from index space to world space (4x4 f64s )

#### 3. VDB Tree

.vdb files can have multiple trees associated with grid, hence after this step can be repeated for all trees in a grid.

- (a) the number 1 (u32)
- (b) background value of root node ( $T$ )

- (c) Number of tile values in root node (u32)
- (d) Number of children of the root node (u32)
- (e) Descend down the tree depth-first describing its *topology*. For each internal node, starting from the top layer. The idea is to first describe the tree topology, the hierarchy of nodes, and then in a second pass in item 3f to give the actual voxel data.
  - i. The origin of the node, only for top level nodes (three i32)
  - ii. The child mask, only for internal nodes ( $D^3$  bits)
  - iii. The value mask ( $D^3$  bits)
  - iv. Compression flags
  - v. Values, only for internal nodes ( $D^3 \times T$ )
  - vi. Repeat item 3e for every child in order of the mask
- (f) Leaf Node data as value mask + values ( $D^3$  bits +  $D^3$ )

The LeafNodes are given in the same order they were covered in item 3e

In the implementation of VDB file handling within the rendering engine, a specialized streaming reader, termed **VdbReader**, is designed to manage the reading process efficiently. This approach optimizes memory usage by processing the file's content incrementally, rather than loading the entire file into memory at once. This method is particularly beneficial since VDB files can have hundreds of megabytes.

The **VdbReader** is structured to sequentially process sections of the VDB file, creating nodes as it reads and assembles them into the complete VDB data structure shown in section 11.1.

**VdbReader** reads from the VDB file according to the grid descriptors, constructing nodes from the data, ensuring each node is placed within the VDB hierarchy. This process involves interpreting the file's byte stream according to the VDB format specifications, converting this data into a usable form within the rendering engine.

```
pub struct VdbReader<R: Read + Seek> {
    reader: R,
    pub grid_descriptors: HashMap<String, GridDescriptor>,
}

impl<R: Read + Seek> VdbReader<R> {
    ...
    pub fn read_vdb_grid<T: VdbValueType>(&mut self, name: &str) -> Result<VDB<T>> {
        let grid_descriptor = self.grid_descriptors.get(name).cloned()
            .ok_or_else(|| ErrorKind::InvalidGridName(name.to_owned()))?;
        grid_descriptor.seek_to_grid(&mut self.reader)?;

        if self.header.file_version >= OPENVDB_FILE_VERSION_NODE_MASK_COMPRESSION {
            let _: Compression = self.reader.read_u32::<LittleEndian>()?.try_into()?;
        }
        let _ = Self::read_metadata(&mut self.reader)?;

        let mut vdb = self.read_tree_topology::<T>(&grid_descriptor)?;
        self.read_tree_data::<T>(&grid_descriptor, &mut vdb)?;

        Ok(vdb)
    }
}
```

---

**Listing 10.** `VdbReader` definition: `reader` is file stream handler, `grid_descriptors` hold the metadata given in item 2g. `VdbReader` implementation: The method `read_vdb_grid` is shown, which is called after the file header is handled, and returns a VDB if the file contents matched the expectations from the header, if not it returns an error.

With this reader implemented any .vdb file can be brought into the rendering engine, which will provide a series of models from the internet to use during testing and in the the results section. Additionally, thanks to the widespread adoption of VDB in modern 3D modelling tools like Blender and Maya any 3D model can be converted to VDB, essentially enabling any mesh to be pulled into the engine, albeit by stepping out of the engine first.

## 11.4 GPU VDB

The next step is desining a version of VDB that can be passed to the GPU in compute shaders. The authors of OpenVDB created a version of the VDB data structure, NanoVDB<sup>[20]</sup> that can use CUDA instructions to GPU acceleration on the data structure. NanoVDB is explained very well by the authors in this article on the Nvidia blog [21].

At this point this implementation diverges with what the OpenVDB library. The goal of this project is to optimize performance while supporting as many platforms as possible, and CUDA instructions are only supported on Nvidia hardware.

In this section a custom implementation for a GPU compatibale, read-only version of VDB543 is presented. This version splits VDBs into two sperate components:

**(a) Mask group** This is a collection of 5 bindings, each an array of u32s that stores the masks for all nodes: 2 mask arrays for each internal node layer (Node5 and Node4) and 1 mask array for the leaf layer (Node3). Each array has length  $N \frac{D^3}{32}$ , where  $N$  is the number of nodes it refers to. These 5 buffers are passed two the gpu in a storage buffer group each in a separate binding.

```
pub struct MaskUniform {
    kids5: Vec<Node5Mask>,
    vals5: Vec<Node5Mask>,
    kids4: Vec<Node4Mask>,
    vals4: Vec<Node4Mask>,
    vals3: Vec<Node3Mask>,
    origins: Vec<[i32; 4]>,
}

impl MaskUniform {
    pub fn bind(&self, device: &Device) ->
        ([Buffer; 6], [Vec<u8>; 6], BindGroup, BindGroupLayout) {
        let buffer_contents = self.get_contents();
        let buffers = self.create_buffers(device, &buffer_contents);
        let layout = self.create_bind_group_layout(device);
        let bind_group = self.create_bind_group(&buffers, &layout, device);

        (buffers, buffer_contents, bind_group, layout)
    }
    ...
    fn create_bind_group_layout(&self, device: &Device) -> BindGroupLayout {
        let entries = &(0..=5)
            .map(|binding| wgpu::BindGroupLayoutEntry {
                binding,
                visibility: wgpu::ShaderStages::COMPUTE,
                ty: wgpu::BindingType::Buffer {
```

```

        ty: wgpu::BufferBindingType::Storage { read_only: true },
        has_dynamic_offset: false,
        min_binding_size: None,
    },
    count: None,
})
.collect::<Vec<_>>()[..];
}

device.create_bind_group_layout(&wgpu::BindGroupLayoutDescriptor {
    entries,
    label: Some("MaskBindGroupLayout"),
})
}
}

```

**Listing 11.** `MaskUniform` defintion: Each type of mask list is a separate binding. And additional binding created to store the origins of the top leval Node5 nodes. `MaskUniform` implementation: The `bind` method generates all data needed to pass the mask group to compute shaders. The `create_bind_group_layout` function is the crtical part of this process, each binding is a storage buffer type with read-only access.

With the bind group created and integrated in the pipline compute shaders can now acess the topology of the datastructure

```

struct Node5Mask { m: array<u32, 1024>, }; // 32^3/32
struct Node4Mask { m: array<u32, 128>, }; // 16^3/32
struct Node3Mask { m: array<u32, 16>, }; // 8^3/32

@group(3) @binding(0)
var<storage, read> kids5: array<Node5Mask>;
@group(3) @binding(1)
var<storage, read> vals5: array<Node5Mask>;
@group(3) @binding(2)
var<storage, read> kids4: array<Node4Mask>;
@group(3) @binding(3)
var<storage, read> vals4: array<Node4Mask>;
@group(3) @binding(4)
var<storage, read> vals3: array<Node3Mask>;
@group(3) @binding(5)
var<storage, read> origins: array<vec3<i32>>;

```

**Listing 12.** wgsl version of the mask arrays. Each buffer is divided into parts based on the size of the node it tackles. This enables getting all the masks of a node with a particular index by simply indexinf into the ray. For example, `kids5[0]` would gives the first child mask for the Node5 at index 0.

A key part of this representation is the order in which node masks are given in each particular binding, meaning what how is the index of a Node in the value mask related to that same node in the CPU based data structure. The approach is the same as when reading .vdb files: a depth-first descent of the tree topology. This means the order nodes are in the GPU VDB representation is the same as the order they are given in the file.

**(b) Atlas group** This is the bind group that stores all the voxel and child “pointer” in packed into atlases as 3D textures. This data type is the perfect storage type for 3D grids. This gives the ability to retain relative coordinates within the nodes while packing next to each other in memory. This technique was inspired by two articles [22], [23]. The latter presents a packing termed  $N^3$ -tree which presents a method to serialize octree nodes in an array of textures and store indicies in that same array to represent children nodes. This idea isn’t directly applicable to VDB since nodes at different depths have different sizes so a lot of space would be wasted since the majoirty of the nodes are

much smaller than the top level Node5 nodes. This can, however, be expanded by using a different texture atlas for every different type of node and cross referencing between each layer. For VDB543 This entails having three different atlases, with the first two's values Node5 and Node4 indexing into the Node4 and Node3 atlases.

```

pub struct NodeAtlas {
    size5: [u32; 3],
    size4: [u32; 3],
    size3: [u32; 3],
}

impl NodeAtlas {
    pub fn bind(&self, device: &Device)
        -> ([Texture; 3], BindGroup, BindGroupLayout) {
        let textures = self.create_textures(device);
        let views = textures.iter()
            .map(|texture| self.create_texture_view(&texture))
            .collect::<Vec<_>>().try_into().unwrap();
        let bind_group_layout = self.create_bind_group_layout(device);
        let bind_group = self.create_bind_group(device, &bind_group_layout, &views);

        (textures, bind_group, bind_group_layout)
    }

    fn create_textures(&self, device: &Device) -> [Texture; 3] {
        [self.size5, self.size4, self.size3].map(|[w, h, d]| {
            device.create_texture(&wgpu::TextureDescriptor {
                size: wgpu::Extent3d {
                    width: w,
                    height: h,
                    depth_or_array_layers: d,
                },
                mip_level_count: 1,
                sample_count: 1,
                dimension: wgpu::TextureDimension::D3,
                format: wgpu::TextureFormat::R32UInt,
                usage: wgpu::TextureUsages::TEXTURE_BINDING | wgpu::TextureUsages::COPY_DST,
                label: Some("Atlas_Texture"),
                view_formats: &[],
            })
        })
    }
}

fn create_bind_group_layout(&self, device: &Device) -> BindGroupLayout {
    device.create_bind_group_layout(&wgpu::BindGroupLayoutDescriptor {
        label: Some("Atlas_Texture_Bind_Group_Layout"),
        entries: &[0, 1, 2].map(|binding| wgpu::BindGroupLayoutEntry {
            binding,
            visibility: wgpu::ShaderStages::COMPUTE,
            ty: wgpu::BindingType::Texture {
                sample_type: wgpu::TextureSampleType::UInt,
                view_dimension: wgpu::TextureViewDimension::D3,
                multisampled: false,
            }
        })
    })
}
...

```

```
        },
        count: None,
    },
    },
)
}
}
```

**Listing 13.** NodeAtlas definition: The three fields in are the sizes of each atlas. The `create_textures` creates 3 textures, sets the correct dimensions and sets value type to `R32UInt` represent a 4 byte single channel which can be used depending on what the value represents. The `create_bind_group_layout` prepares the binding for compute shaders, setting the sample type to `Uint` to give ease of access to the atlases; data.

With the bindings implemented it is possible to fetch these in the shader code, finally bringing or VDB data to the GPU

```
@group(2) @binding(0)
var node5s: texture_3d<u32>;
@group(2) @binding(1)
var node4s: texture_3d<u32>;
@group(2) @binding(2)
var node3s: texture_3d<u32>;
```

**Listing 14.** wgsl atlas bindings, to get a value in the atlas at point  $(x, y, z)$ , `textureLoad(x, y, z).r` is called since all the data is stored on the red channel

Since, these are 3D textures a way of converting the indexing in the mask buffers to these texture atlases is needed. To that end, atlases are cube shaped, and nodes are packed in it by stacking them next to one another with coordinate priority  $x > y > z$  in the same depth-first order as discussed previously. This idea yields a very simple transformation between the indexes of the mask buffers and the coordinates in the texture atlas, shown in lst. 15

```
fn atlas_origin_from_idx(idx: u32, dim: u32) -> vec3<u32> {
    return vec3(idx \% dim, (idx / dim) \% dim, idx / (dim * dim));
}
```

**Listing 15.** wgs1 transformation from index of node to coordinate in atlas

The two types of VDB where covered GPU and CPU-based. To convert from the CPU-based structure to the GPU-based structure one simply recursively descends the tree in depth-first order, adding nodes to their corresponding atlases one by one, stacking them in the 3D texture.

## 11.5 SDF for VDB

This section outlines what distance field data is injected into empty VDB tiles and how this information can be computed from a normal VDB.

In a standard grid, **SDFs** encode the Manhattan or Chebyshev distance<sup>[24]</sup> to the nearest voxel. Extending this to hierarchical grids can be done by splitting up the SDF calculation at each level of the hierarchy. Empty nodes on the higher level of the heirarchy will store the nearest distance to another node that is not an empty (meaning it is either a tile value or it is subdivided into children).

## Computing the SDF

To calculate the distance field information, a generalised (3D) version of the Chamfer Distance Transform algorithm<sup>[25]</sup> is used. It is essentially a two-pass method.

1. *Forward Pass:* Starting from the top-left corner of the grid, this pass iterates through each cell. It calculates the minimum distance to the nearest feature by considering the already processed neighbors (typically the cells immediately above and to the left of the current cell). For each cell, it updates the distance based on a comparison between its current value and the computed values from these neighbors, typically using predefined weights for horizontal/vertical and diagonal steps.
2. *Backward Pass:* Beginning from the bottom-right corner, this pass iterates back through the grid. It now considers the cells that were not accessible in the forward pass (typically the cells immediately below and to the right of the current cell). Again, it updates the distances in each cell by considering the shortest computed distances from these neighbors.

This algorithm has a straight forawrd 3D generalisation, starting at the top-left-near corner in the first pass, and at the bottom-right-far corner in the second pass. [maybe add graphic?]

One major optimisation which can be done is based on the fact that for hierarchical data structures, SDF data is virtually independet inbetween levels of the hierarchy. This allows the computation to be run on a separate thread for each layer in the hierarchy.

## 12 Ray tracing

With the structure of the rendering engine and the primary data structure covered, it is now time to bring everything together construct an image. For this a ray tracing algorithm is required, which first needs an algorithm to cast a ray. In this section, casting rays and ray-tracing algorithms will be covered, and how these integrate with the VDB data structure to optimize performance.

### 12.1 Casting a ray

The background section glossed over a suite of ray casting algorithms. In this section, the implementation of three such algorithms all building on top of each other will be detailed: DDA, HDDA and HDDA+SDF.

#### 12.1.1 DDA

works by ray marching from grid intersection to grid intersection, making sure each voxel is only polled once. The starting values are a source point and a normalized direction vector.

1. Initial Position (ipos): The starting position of the ray within the voxel grid, calculated by flooring the source vector. This gives the indices of the voxel grid where the ray starts.
2. Delta Distance (deltaDist): This calculates how far the ray must travel in each axis to cross a voxel boundary. It is computed by dividing the length of the direction vector (dir) by each component of the direction vector. This gives the distance the ray travels in each axis per step.
3. Step (step): A vector that determines the direction to step through the grid in each axis (i.e., whether to increment or decrement the index in each dimension). It is determined by the sign of the direction vector components.
4. Side Distance (sideDist): This vector stores the distance the ray needs to travel to hit the next side of a voxel. It starts with the distance to the first boundary from the source position, adjusted by half a voxel size in the direction of travel to ensure the calculation centers within a voxel.

The core idea of the algorithm is that it precomputes the amount one unit of movement on either axis causes the ray to progress (deltaDist). It then maintains a record of how far the ray has progressed on for each axis, and selects the one for which the ray has moved the least, i.e. the closest boundary intersection.

```
const MAX_RAY_STEPS: i32 = 64;
fn cast_ray_dda(src: vec3<f32>, dir: vec3<f32>) -> vec3<f32> {
    var ipos = vec3<i32>(floor(src));
    let deltaDist = abs(vec3<f32>(length(dir)) / dir);
    let step = vec3<i32>(sign(dir));
    var sideDist = (sign(dir) * (vec3<f32>(ipos) - src) + (sign(dir) * 0.5) + 0.5)
        * deltaDist;
    var mask = vec3<bool>(false);

    for (var i: i32 = 0; i < MAX_RAY_STEPS; i++) {
        let val = getVoxel(ipos);
        if (val.hit) {
            return val.color + dot(vec3<f32>(mask) * vec3(0.01, 0.02, 0.03), vec3(1.0));
        }
    }
}
```

```

var b1 = sideDist.xyz <= sideDist.yzx;
var b2 = sideDist.xyz <= sideDist.zxy;
mask = b1 & b2;

sideDist += vec3<f32>(mask) * deltaDist;
ipos += vec3<i32>(mask) * step;
}

return vec3<f32>(dir);
}

```

**Listing 16.** DDA algorithm

Specifically at each iteration of the ray marching loop three steps operations are performed:

1. Voxel Check: At each step, the algorithm checks whether the current voxel (ipos) is occupied by using the getVoxel(ipos) function. If this function returns true, indicating a hit, the loop exits as the ray has intersected a voxel, and its color, adjusted to distinguish between the face on which the ray hit, is returned.
2. Boundary Calculation: Determines which voxel boundary (x, y, or z) will be hit next by comparing the distances in sideDist. The logic here involves comparing each component of sideDist against the others to find the smallest value. This is done using vector comparisons b1 and b2, which yield boolean vectors.
3. Update sideDist and ipos: Updates the current side distance and position based on which boundary will be hit next. If the smallest distance is in the x-direction, then the x-component of sideDist and ipos are updated, and similarly for y and z.

With this algorithm implemented it is finally possible to visualize our first voxels. [add image]

### 12.1.2 HDDA

This section covers the Hierarchical DDA specifically tailored for traversing volumetric data represented in a VDB, using the data structure at last. This method is much more effective in handling large and sparse volumetric datasets due to its hierarchical traversal mechanism, which significantly enhances computational efficiency and scalability.

The key idea is to calculate the step at each iteration the ray the lowest level of detail at that point. For example, if at a point in an empty Node4, there is no reason not to step directly the side length of a Node4 along an axis, since it is guaranteed that there is no voxel data in that node.

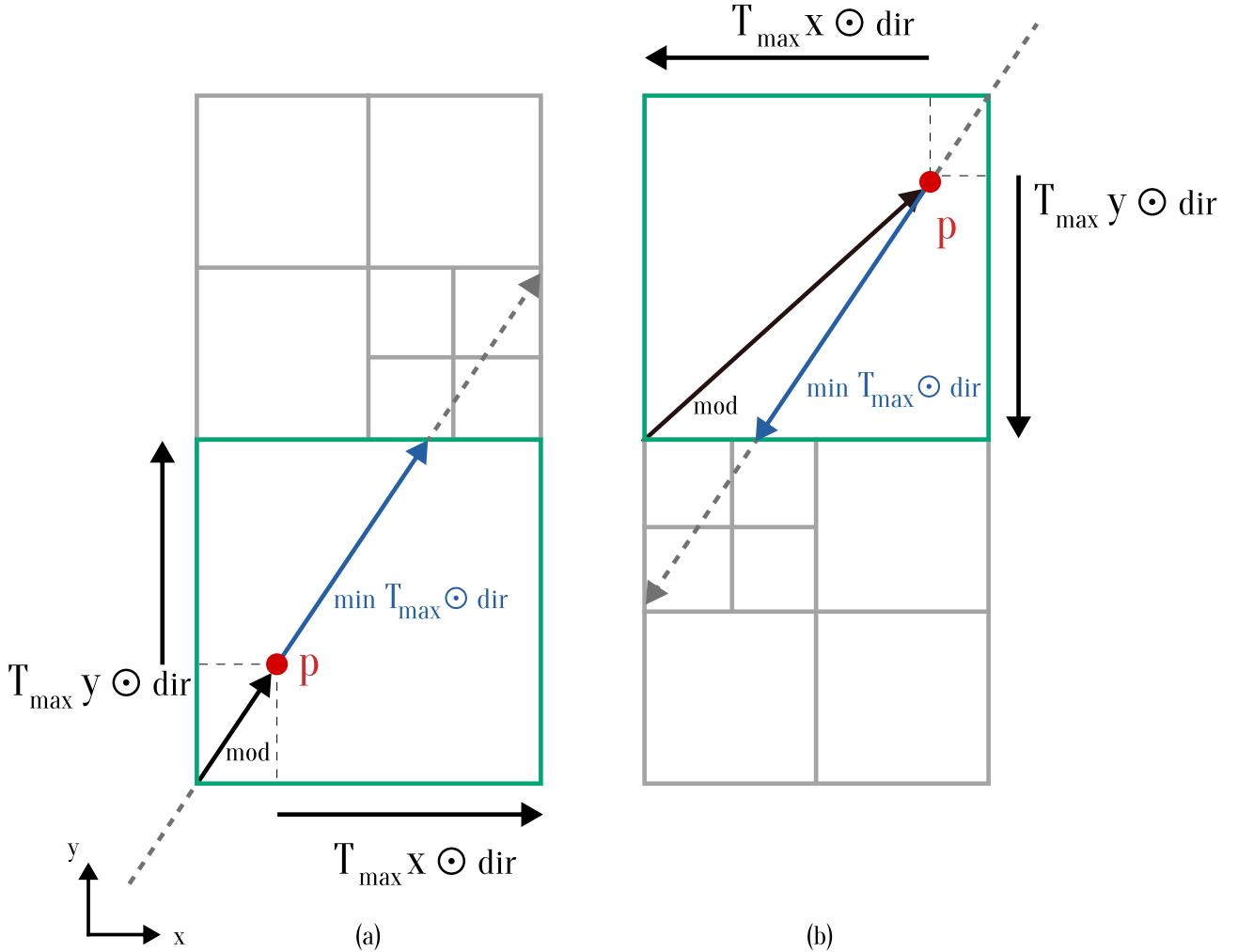
The following is a breakdown of the algorithm in lst. 17:

#### Initialiation

1. The ray's initial position  $p$  is set to the source point  $src$ .
2. The  $step$  vector determines the traversal direction in the grid is the non-zero sign of the ray.
3. The  $step01$  vector is used as a flag to ensure determine whether the size on a given axis should be added when calculating step candidates. It essentially discriminates between the cases shown in fig. 7.
4. The  $idir$  vector represents the inverse of the directional vector. It is precomputed to not have to do element-wise division in the body of the loop, since multiplication is faster than division on FPU.

- The mask has the same role as in standard DDA, it will be used to decide which increment produced the smallest step on the ray.

With this initial information the ray can start marching along the VDB.



**Fig. 7. HDDA iteration.** (a): Ray positive in both axes. When a ray direction has a positive component, because of the directionality of the modulo operation, it must be subtracted from the size of the node to maintain the ray direction. (b): Ray negative both axes. When a ray has a negative component, the modulo must simply be inverted since the size is already accounted for.

Blue and gray vectors are candidate steps at the given iteration, each have their respective components outside the squares. The blue vector is the one that has to be selected, since it is the shorter one. The black vector represents the modulo size vector. The  $\odot$  operation denotes element wise multiplication. Small branching factor is not typical of the VDB datastructure, this was chosen purely for visual clarity.

## Loop

The ray traversal loop has the following steps:

- Query the VDB** for the value at the current position. If the value is non-empty or out of bounds return a color for the voxel
- Compute step calculations** scaled by the size of the current level. Compute candidate steps in all 3 axis, choose the minimum and step the ray in that direction
- Adjust the position** by a very small factor to make sure it will query the next cell. Since the algorithm deals with points on edges, sampling a point directly on the edge is prone to floating point issues, so the position is nudged by a small amount towards the cell in the direction that was selected at item 2.

```

const HDDA_MAX_RAY_STEPS: u32 = 1000u;
const scale = array<f32, 4>(1., 8., 128., 4096.);
fn hdda_ray(src: vec3<f32>, dir: vec3<f32>) -> vec3<f32> {
    var p: vec3<f32> = src;
    let step: vec3<f32> = sign11(dir);
    let step01: vec3<f32> = max(vec3(0.), step);
    let idir: vec3<f32> = 1. / dir;
    var mask = vec3<bool>();
    var bottom: VdbBottom;

    for(var i: u32 = 0u; i < HDDA_MAX_RAY_STEPS; i++){
        bottom = get_vdb_bot_from_bot(vec3<i32>(floor(p)), bot);

        if !bottom.empty {
            // return voxel color
        }
        if any(p < min_bound || p > max_bound) {
            // return bounding box color
        }
        let size: f32 = scale[3u - bot.num_parents];
        let tMax: vec3<f32> = idir * (size * step01 - modulo_vec3f(p, size));

        p += min(min(tMax.x, tMax.y), tMax.z) * dir;

        let b1 = tMax.xyz <= tMax.yzx;
        let b2 = tMax.xyz <= tMax.zxy;
        mask = b1 & b2;

        p += 4e-4 * step * vec3<f32>(mask);
    }
    // return maximum steps exceeded color
}

```

**Listing 17.** HDDA algorithm

**Using the VDB** At this point we can finally make use if the topology of the VDB data structure. The size of the step in HDDA is determined by the level of the lowest node at that point. This can be computed by just stepping down the tree until we get either a voxel value value or a node's tile value (a value is meant to mean empty as well here). This would work just fine but there is some potential for some further optimisation.

Since the HDDA will essintialy step throught neighbouring cells, the majority of the time these neighbouring cells have the same parent (except for cells at the border of the parent's 3D grid). When a ray passes through a Node3's, which is reprsents  $8 \times 8 \times 8$  voxels, assuming no collision, 8 voxel check are expected, at minimum (when the ray passes paralell to either axis). For each of these 8 check the lookup in the VDB structure would consist of Going from root node to a Node5 to a Node4 then to a Node3 and then index into its grid. This doesn't have to be the case, if the algorithm remembers the chain of nodes from the previous iteration it could simply check if the voxel it needs is in the Node3 it already has, and just use that, if not go up to the parent and check again. These cases are the majority of cases. For 8 voxels in a horizontal line 7 out of 8 would be in this case, all but the first which would have to go up to the Node4 to get the neighbouring Node3 and then index the voxel. This method optimizes lookups for virtually no cost, just using the topology

of the datastructure. This kind of idea wouldn't work in an octree for example, because in an octree all nodes are boundary nodes. This is where the grid-like properties of the VDB shine.

In the software implementation, the structure `VdbBottom` (lst. 18) is constructed, meant to represent the path to the bottom of a query in VDB. Along with this data structure the method `get_vdb_bot_from_bot` (used in lst. 17) is created. The method does exactly what was described above, tries get the next value using the nodes of the previous from the bottom up.

```
struct Parent {
    origin: vec3<i32>,
    idx: u32,
}

struct VdbBottom {
    color: vec3<f32>,
    empty: bool,
    num_parents: u32,
    parents: array<Parent, 3>,
}
```

**Listing 18.** `VdbBottom` definition. The structure holds the at 3 parents (or less) that the bottom value has, if the the bottom and wether the the bottom was an empty value, and the color information if it was voxel.

This HDDA algorithm is already highly efficient ([add link to results section]), and can render complex scenes with high voxel counts and dynamic lighting very well, but it is always possible to do better.

### 12.1.3 HDDA+SDF

In this section, the final improvement to the ray casting algorithm is done. This can be achieved by bringing together the HDDA algorithm described in the last part with the `SDF` data described in section 11.5. The idea is simple, at each level of the hierarchy instead of stepping by one unit in relative space, step as many as the SDF allows. With the SDF already computed, modifying the HDDA algorithm is as simple as changing a few lines of code, multiplying the size of the step by the minimum distance.

```
,
```

```
fn hdda(src: vec3<f32>, dir: vec3<f32>) -> vec3<f32> {
    ...
    let size: f32 = scale[3u - bot.num_parents] * bot.dist;
    ...
}
// in the 'VdbBottom' struct empty becomes dist
struct VdbBottom {
    ...
    dist: u32,
}
```

The simple HDDA algorithm would have satisfied the goals and objective set for this project, but this version is even better. At this point, it is time to put these algorithms to the test by adding lights and reflections.

## 12.2 Sunlight

Sunlight can be described by a direction and a color. The idea is to cast a camera rays through the scene and when a ray intersects an object, another ray is casted from that point in the direction of

the sun. If that ray intersects anything else that means the object is in shadow so sunlight doesn't contribute to its color, otherwise the sunlight hits an object and therefore contributes to its color.

An important part of this algorithm is how the contribution of the sunlight to the object's color is calculated. A straightforward way would be to add the sunlight color to the color of the object times some intensity coefficient. However, the angle at which the sunlight hits a voxel face is also a key aspect of this calculation. The dot product of the sunlight direction and the surface normal of the object can be used to determine how much sunlight falls on the face of an object.

The following model based on the Lambertian Reflectance Formula<sup>[26]</sup> is proposed:

**Ambient Lighting** represents indirect light that is scattered in the environment and illuminates all objects equally.

$$\vec{I}_{ambient} = k_a \cdot C_{ambient} \odot \vec{C}_{surface}$$

**Diffuse Lighting** represents light that comes from the sun and affects surfaces based on their orientation relative to the light source.

$$\vec{I}_{diffuse} = k_d \cdot (\vec{L} \cdot \vec{N}) \cdot \vec{C}_{sunlight} \odot \vec{C}_{surface}$$

When an object is **in shadow** it does not receive sunlight, so the  $I_{diffuse}$  component is omitted

$$\begin{aligned}\vec{C}_{total} &= \vec{I}_{ambient} \\ \vec{C}_{total} &= k_a \cdot C_{ambient} \odot \vec{C}_{surface}\end{aligned}$$

When an object is **not in shadow**  $I_{diffuse}$  is added to the ambient color

$$\begin{aligned}\vec{C}_{total} &= \vec{I}_{ambient} + I_{diffuse} \\ \vec{C}_{total} &= k_a \cdot C_{ambient} \odot \vec{C}_{surface} + k_d \cdot (\vec{L} \cdot \vec{N}) \cdot \vec{C}_{sunlight} \odot \vec{C}_{surface}\end{aligned}$$

Where:

$k_a$  = ambient reflectance coefficient

$k_d$  = diffuse reflectance coefficient

$\vec{L}$  = normalized direction vector from the surface to the light source

$\vec{N}$  = normalized surface normal

$\vec{C}_{surface}$  = color of the surface

$\vec{C}_{ambient}$  = ambient color

$\vec{C}_{sunlight}$  = sunlight color

This model has a straightforward software implementation. The function `hdda_ray` now returns a custom output type that carries information about the result of the ray cast operation such as state (hit, miss or out of steps), the render mode which will be shown in the results and experiments part [add ref], the HDDA mask which is used to determine the surface normal of the intersected voxel, and the point of intersection. The only difference from the mathematical model above is the usage of the alpha channel of the sun color to encode sunlight strength.

```
fn ray_trace(src: vec3<f32>, dir: vec3<f32>) -> vec3<f32> {
    let hit: HDDAout = hdda_ray(src, dir);
    let step: vec3<f32> = sign11(dir);
    ...
}
```

```

if hit.state == 0u {
    switch hit.render_mode {
        ...
        case 3u: {
            let N = normalize(-step * vec3<f32>(hit.mask));
            let LN = max(0.0, s.sun_color.a * dot(-s.sun_dir, N));
            let I_d = k_d * s.sun_color.xyz * hit.color * LN;
            let I_a = k_a * AMBIENT_COLOR * hit.color;

            if LN != 0.0 &&
                hdda_ray(hit.p - 4e-2 * step * vec3<f32>(hit.mask), -s.sun_dir).state == 0u {
                return I_a;
            }

            return I_a + I_d;
        }
    }
    ...
}

```

**Listing 19.** Sunlight rendering on diffuse materials

### 12.3 Glossy Materials

Adding glossy materials requires bouncing the ray off objects recursively. Unlike perfectly diffuse surfaces that scatter light in all directions, glossy surfaces cause reflections that are more directed, often leading to visible specular highlights and clear reflections of the environment.

This requires a more complex approach to ray tracing, which includes handling recursive ray bounces to accurately simulate the reflection phenomena. For glossy materials, when a ray intersects the surface, it typically generates at least two additional types of rays:

1. **Shadow Ray:** This ray is cast towards light sources shown in the previous section.
2. **Reflected Ray:** This ray simulates the reflection of light off the surface, calculated based on the angle of incidence and the normal at the point of intersection. The direction of the reflected ray is given by the formula:

$$\vec{r} = \vec{i} - 2\vec{N}(\vec{i} \cdot \vec{N}) \quad (5)$$

While recursive ray tracing provides a high degree of realism, especially for scenes involving glossy materials, its implementation on GPUs encounters significant challenges. GPUs are not well-suited to handle recursive operations due to their parallel processing architecture. Recursion requires a stack-based memory model, which is more naturally handled by CPUs. Moreover, recursive ray tracing, especially with multiple bounces (reflections), is computationally intensive. Each additional bounce increases the complexity exponentially, making real-time rendering particularly challenging.

Nonetheless “recursive” ray tracing with a very shallow depth of 2 bounces was implemented. This already brings the maximum numbers of rays that can be casted per to 6. So this will serve as more of a stress test of the engine and ray casting algorithms.

The software implementation considers of chaining the same function but with different names multiple times and setting them up to call each other in sequence. The `ray_trace` function can call the `ray_trace1` function which can call the `ray_trace2` all of which can call shadow ray functions.

The color model of this for glossy materials develops on the previous one, computing the diffuse part of the color the same way but mixing with the reflected color based on a reflectance coefficient  $k_r$

The final color returned by the function is a mix of the ambient plus diffuse lighting and the color from the reflected ray, weighted by the reflectivity. This mixing accounts for both direct illumination and the effects of reflections from other surfaces.

```
let N = normalize(-step * vec3<f32>(hit.mask));
let rdir = normalize(dir - 2.0 * N * dot(dir, N));
let rsrc = hit.p - 4e-2 * step * vec3<f32>(hit.mask);
let rcol = ray_trace1(rsrc, rdir);
let LN = max(0.0, s.sun_color.a * dot(-s.sun_dir, N));
let I_d = k_d * s.sun_color.xyz * hit.color * LN;
let I_a = k_a * AMBIENT_COLOR * hit.color;

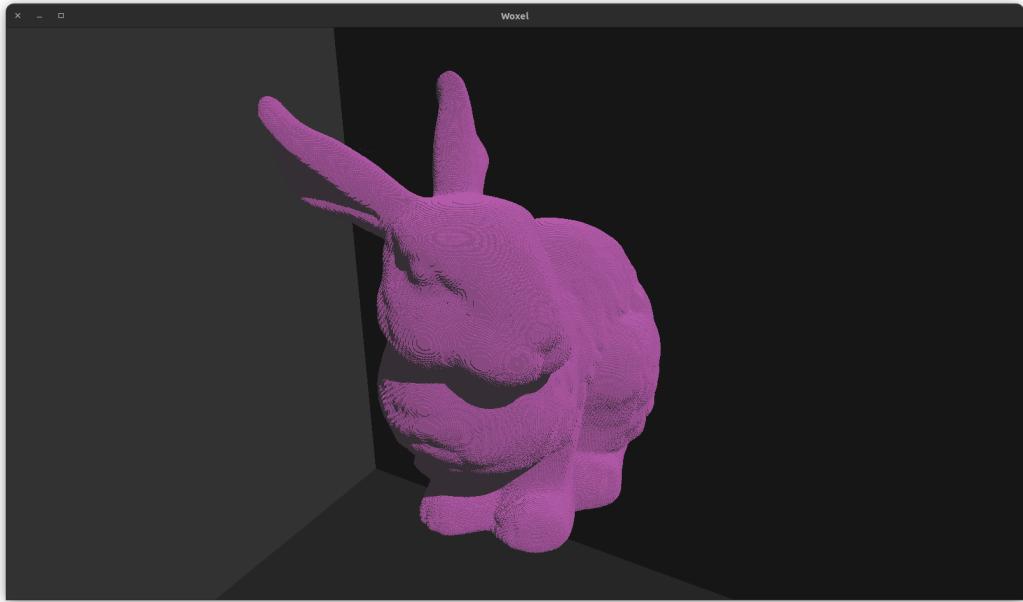
if I != 0.0 &&
hdda_ray(hit.p - 4e-2 * step * vec3<f32>(hit.mask), -s.sun_dir).state == 0u {
    return mix(I_a, rcol, k_r);
}
return mix(I_a + I_d, rcol, k_r);
```

**Listing 20.** Glossy materials color model

This concludes the methodology section.

## Part IV

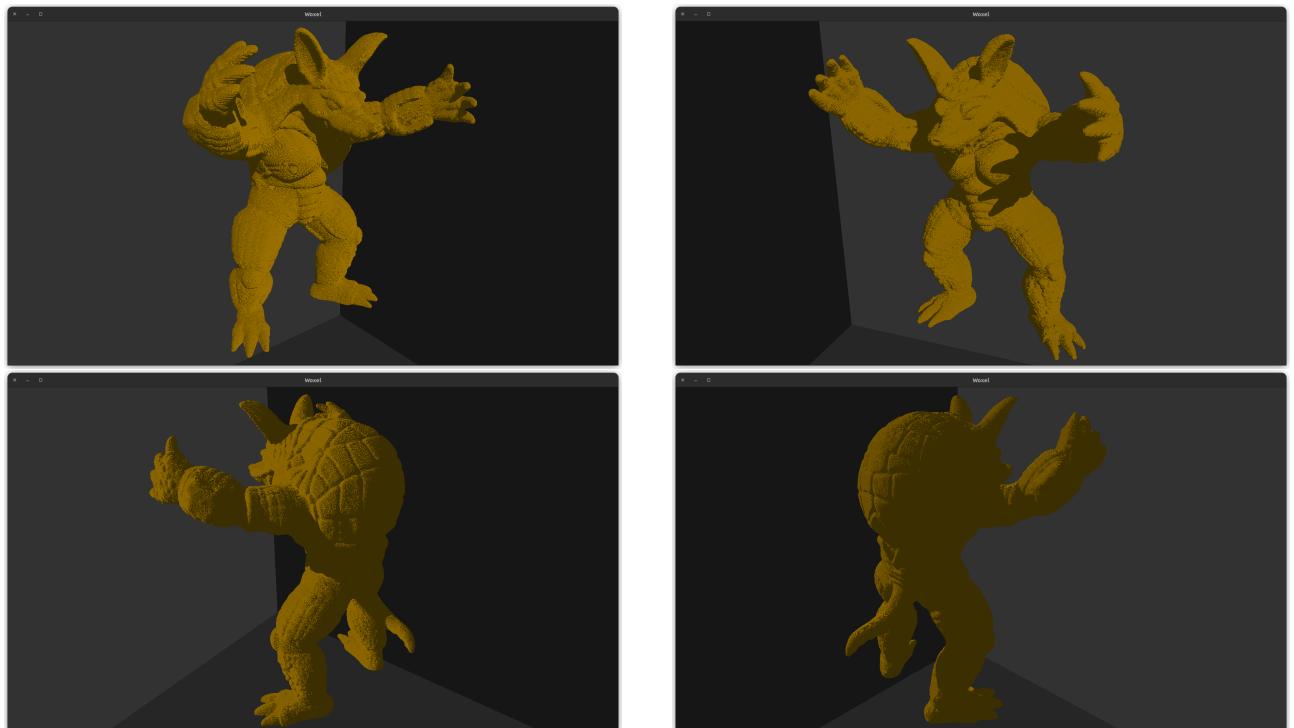
# Results and Experiments



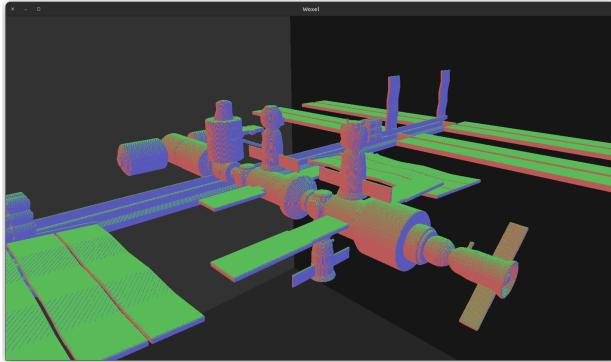
**Fig. 8.** Bunny with diffuse pink material, model voxel resolution:  $628 \times 621 \times 489$

## 13 Images

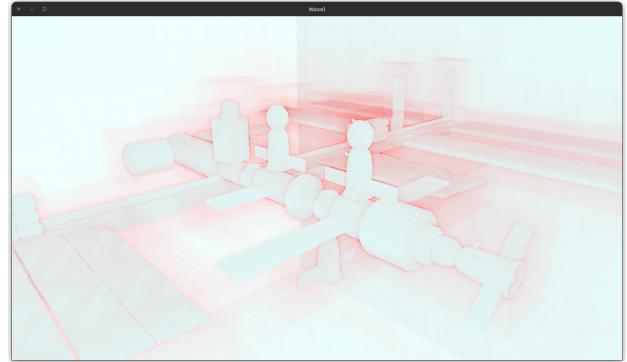
This section shows some images captured in the rendering engine. All the models used are samples from the OpenVDB website<sup>[27]</sup>. Each of the figures bellow showcase a different functionalities of the engine.



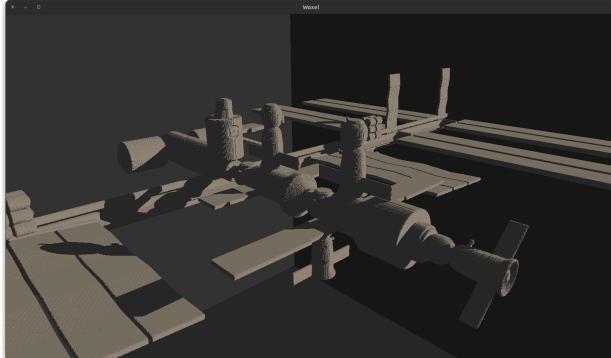
**Fig. 9.** Multiple angles of an armadillo model with a diffuse material. The voxel resolution of the model is  $1276 \times 1518 \times 116$



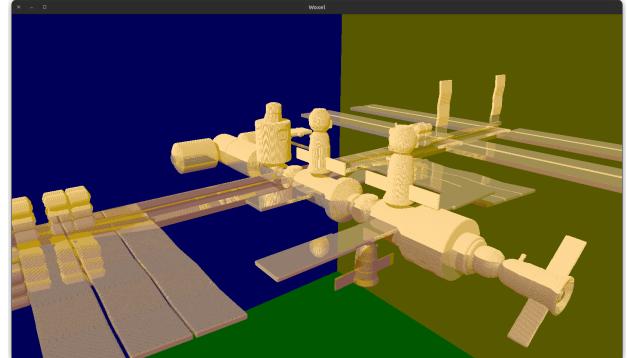
(a) RGB



(b) Ray

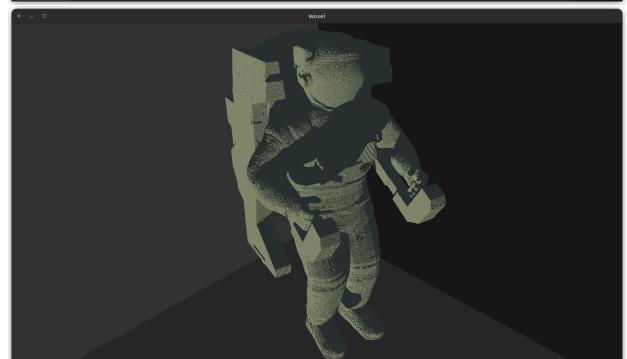
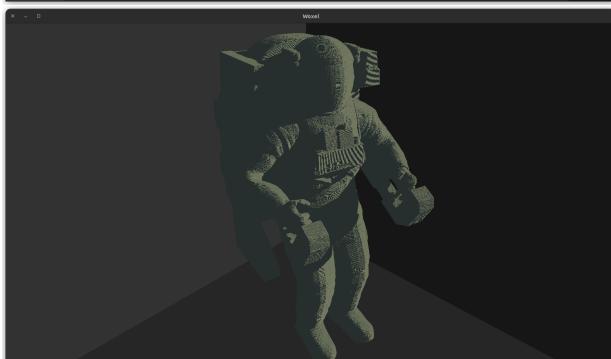


(c) Diffuse

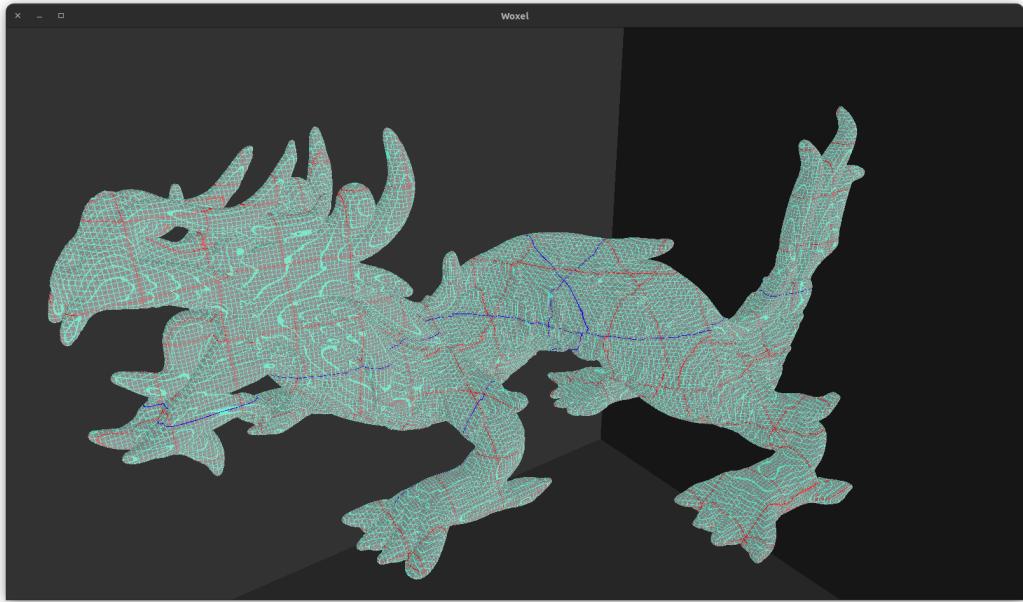


(d) Glossy

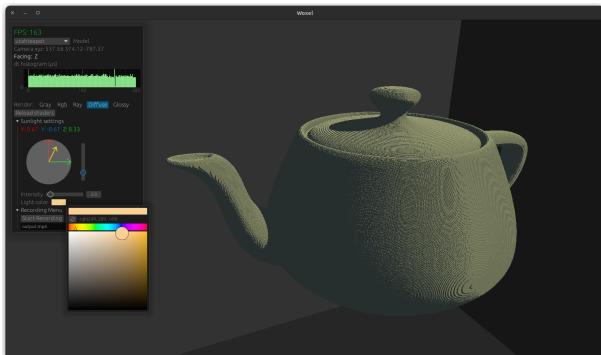
**Fig. 10.** Render modes on a ISS model with voxel resolution  $4561 \times 617 \times 2999$  (a): RGB mode colors each face based on what axis it is parallel to. (b): Ray mode colors each pixel based on how many steps the ray took. The color is interpolated between light blue and red based on how many steps the ray took to go out of bounds or intersect a voxel. Maximum (red) is 200 steps. (c): Diffuse mode shows an object with diffuse material lit by sunlight. (d): Glossy mode shows a half glossy (bottom), half diffuse (top) model lit by sunlight. The out of bounds box is colored to discriminate which face is reflected on what surface. The reflection of the middle pod with a shear on top can be seen in the solar panel in the middle. More reflections can be seen in the solar panels one the left and right.



**Fig. 11.** Dynamic Lighting on an astronaut model. The sunlight is dynamic, its direction, color and intensity can be changed through the developer GUI in real-time. The voxel resolution of the model is  $1481 \times 2609 \times 1843$



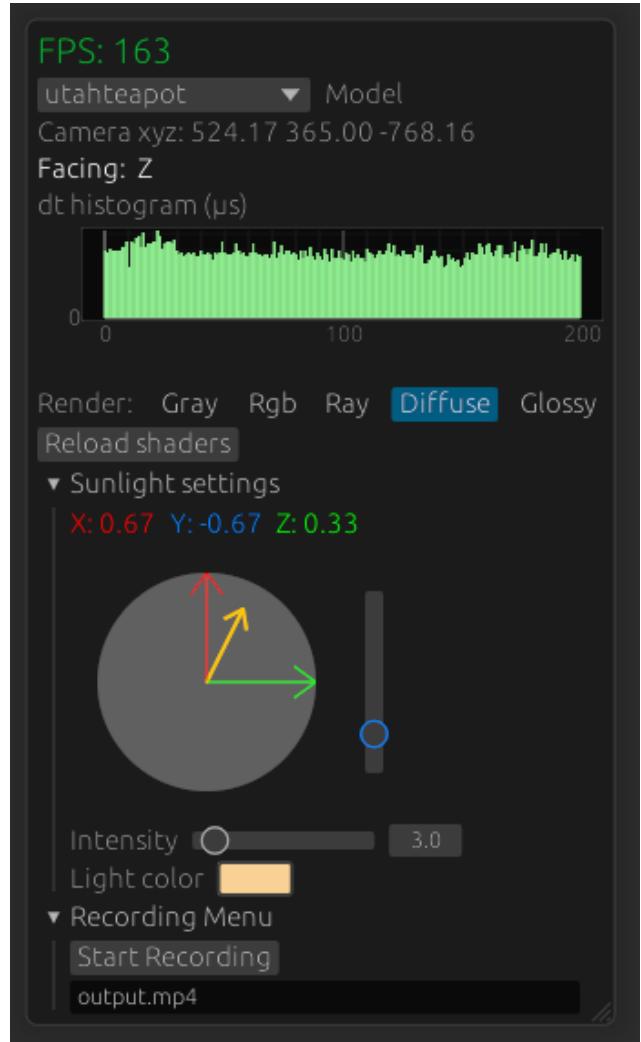
**Fig. 12. VDB highlighting:** Voxels at the boundaries of VDB nodes are highlighted on a dragon model. The grid structure of the VDB can be seen at each level in the hierarchy. Node3, Node4 and Node5 boundaries are shown in Cyan, Red and Blue respectively. The voxel resolution of the model is  $2023 \times 911 \times 1347$



**Fig. 13.** Developer GUI in engine

The developer GUI has the following uses:

1. Display current and histogram of milliseconds per frame.
2. Changing the model in the viewport through a drop down menu that scans the assets folder for available models.
3. Camera coordinates and facing direction
4. Functionality to change between the render modes presented in fig. 10
5. The option to reload the shaders while the engine is running.
6. For the diffuse and glossy render modes there is a sunlight section available.
7. The recording menu allows setting an output file and starting or ending the recording.



**Fig. 14.** Developer GUI close-up

## 14 Experiments

In this section the ray casting algorithms are compared against each other on different models and render modes.

The specifications of the machine the experiments where ran on are presented in table 1.

Experiment machine specifications	
OS	Ubuntu 22.04.3 LTS x86_64
CPU	AMD Ryzen 7 5800H with Radeon
GPU	NVIDIA GeForce RTX 3070 Mobile
RAM	8192MiB
FMA	Enabled

Table 1. Experiment machine specifications

### 14.1 Comparing DDA, HDDA and HDDA+SDF

The average milliseconds per frame are compared for the DDA, HDDA and HDDA+SDF algorithms on the teapot model (voxel resolution of  $981 \times 462 \times 617$ ), on the ray render mode, at 3 distinct distances from the model, one further a way, ore closer and one near the model. Checking at three separate distances is important because the performance of the hierarchical algorithms depends on the topology that the camer rays are going through. When the target object is fur away most camera rays are able to traverse the VDB at hiegher levels in tree since there is no detail around. Conversely, when the camera is closer to the object the rays must treverse more complex topolgoy at lower levels in the tree, and therfore the aglorithm can be slower.

	2000m	1000m	500m
DDA	100.3ms*	100.1ms*	50.4ms
HDDA	9.4ms	12.5ms	14.4ms
HDDA+SDF	6ms**	6.4ms	7.6ms

Table 2. Milliseconds per frame of rendering the teapot model using DDA, HDDA, HDDA+SDF at far, medium, and close distance. A voxel is considered  $1\text{m} \times 1\text{m} \times 1\text{m}$ . The average ms per frame is taken from a 1000 frame interval.

\*: Model doesn't show up in viewport because the algorithm exceeds the maximum step size of 1000. This time can be treated as the worst-case, casting bouncing the maximum number of times for each pixel.

\*\*: Frame rate cap is hit at 165 FPS, this is as good as the ray casting can get on this machine

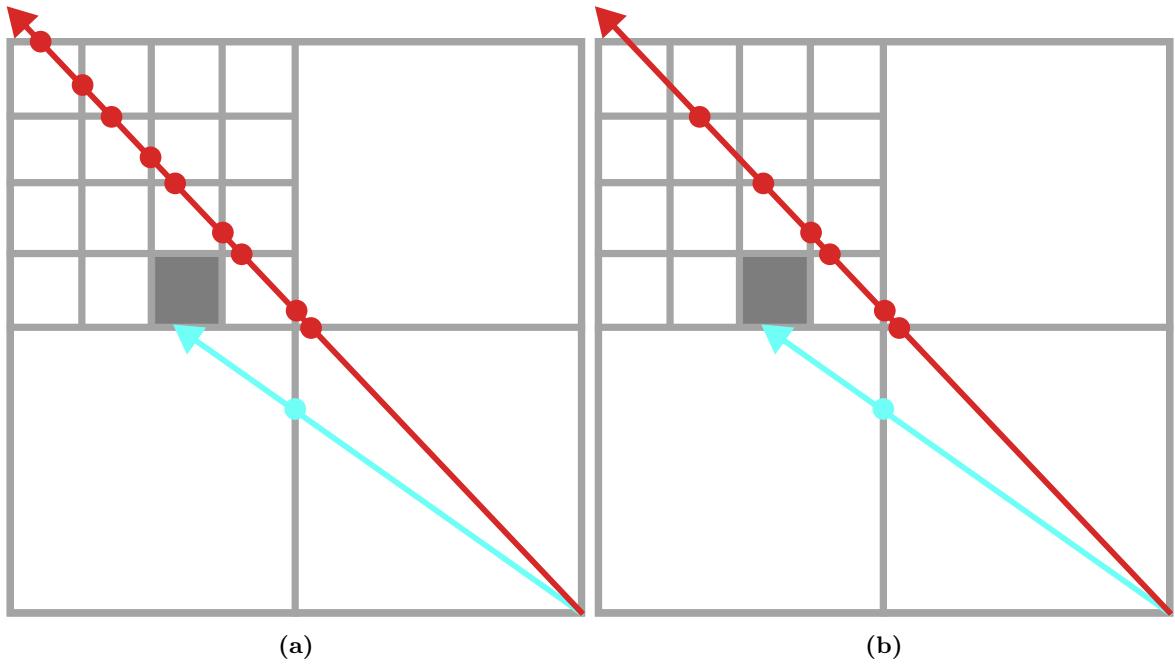


Fig. 15. Render in ray mode using (a) HDDA and (b) HDDA+SDF of the teapot model from 1000m distance. The model resolution is:  $981 \times 462 \times 617$ . As in fig. 10(b) the color of pixels is determined based on the steps the ray took to intersect the model. The maximum is 200 steps corresponding to bright red.

The DDA version cannot handle a mesh of this resolution, since rays are marched one voxel at a time. At 2000 voxels away, no ray can get to the object before it exceeds the maximum step rate

of 1000. At 500 voxels away the DDA manages to render part of the teapot at 50 milliseconds per frame (20 FPS) which is not enough for modern engines. Both the HDDA and HDDA+SDF perform very well on this model. The HDDA algorithm has a minimum FPS at the 500m point of 70 FPS. The HDDA+SDF manages to hit the frame rate cap of the GPU at 165 FPS at the 2000m point and doesn't drop below 120 FPS at the close point. Adding the SDF to the HDDA algorithm yields a performance boost of 36% at 2000m, 49% at 1000m and 47% at 500m.

It is visible in fig. 15 that the most of the improvement that the SDF offers is actually for pixels whose corresponding camera rays don't actually intersect voxels. This is because these voxels are intersected relatively quickly in the classic HDDA. The slowest raycasting operations are those that pass voxels very close by and go then off into the background, as showed in fig. 16. This is precisely where the SDF is most useful, since it can get the ray to get out of those high detail areas faster. Moreover, when the ray travelling in low detail space there is also an improvement because the further the ray gets from the object the further it will step. This allows rays to get out of bounds as much faster.



**Fig. 16.** ray that intersects voxel vs. ray that “near-misses” it. (a) HDDA algorithm; the first has 2 axis crossings, the latter has 9 (b) HDDA+SDF algorithm; the first has 2 axis crossings the latter has 6.

The same experiment setup is repeated for the ISS model because it has a lot of gaps and tight spaces in its geometry, this time only HDDA and HDDA+SDF is considered since the DDA could not handle the teapot model, which is much smaller than the ISS. Another change is the camera positions used are no longer based on the distance to the object, and are instead positioned such that increasing levels of detail and overlapping geometry is in view.

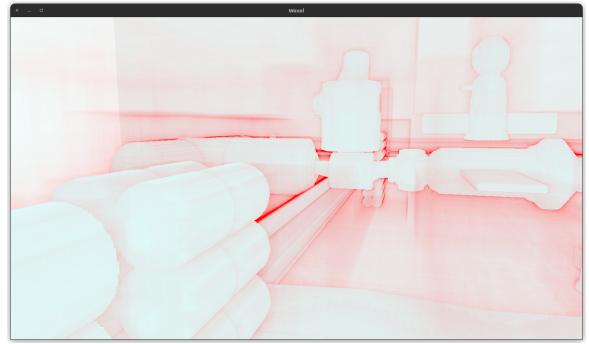
	pos. 1	pos. 2	pos. 3
HDDA	9.1ms	10.6ms	15.3ms
HDDA+SDF	6ms**	7.2ms	8.3ms
improvement	36%	32%	46%

**Table 3.** Milliseconds per frame of rendering the ISS model using HDDA, HDDA+SDF at 3 positions in space selected to be increasingly detailed. The average ms per frame is taken from a 1000 frame interval. The improvement from HDDA to HDDA+SDF is also recorded.

\*\*: Frame rate cap is hit at 165 FPS, this is as good as the ray casting can get on this machine



(a)



(b)

**Fig. 17.** Render in ray mode using (a) HDDA and (b) HDDA+SDF of the ISS model at position 3. The model resolution is:  $4561 \times 617 \times 2999$ . The color of pixels is determined analogous to fig. 15. The efficiency of the SDF method in high detail areas can be clearly seen by comparing the two images: red patches in the middle of the image get much lighter and bright red areas exist only very close to the model surface.

These two experiments prove the efficiency of the HDDA+SDF method, it gives more than 30 % speedup over HDDA in all cases, and is able to hit the frame rate cap of 165 FPS in for most conditions. The high resolution of the test scene used also proves HDDA+SDF is a robust ray-marching algorithm which is able to handle complex scenes with good performance.

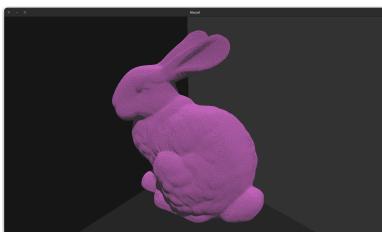
## 14.2 Performance of HDDA+SDF in ray-tracing

To test the performance of HDDA+SDF when doing ray-tracing the average milliseconds per frame will be recorded in a number of scenes for both diffuse and glossy materials.

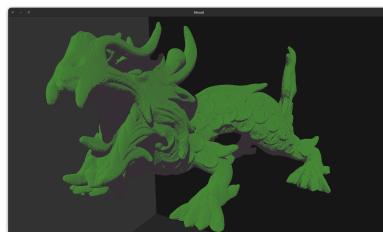
	bunny	dragon	ISS
diffuse	6ms**	6ms**	6.5ms
glossy	10.2ms	11.6ms	14ms

**Table 4.** Milliseconds per frame to render each of the models with a diffuse and a glossy material.

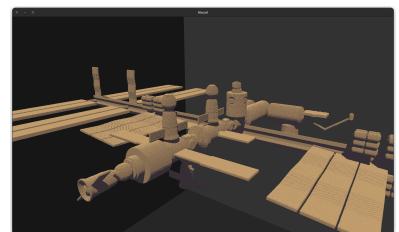
\*\*: Frame rate cap is hit at 165 FPS, this is as good as the ray casting can get on this machine



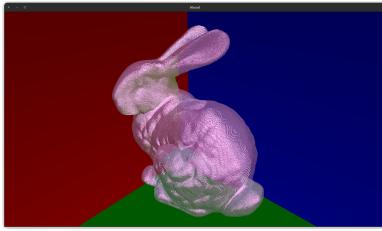
(a)



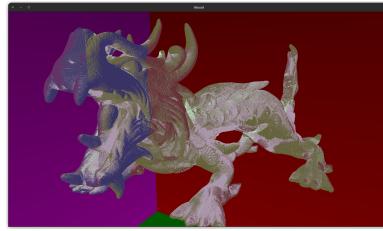
(b)



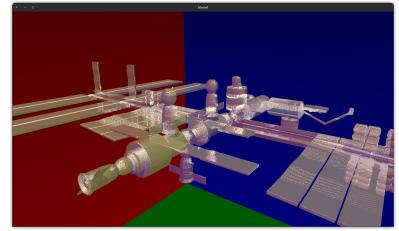
(c)



(d)



(e)



(f)

**Fig. 18.** Diffuse (a)-(c) and Glossy (d)-(f) renderings that produce the data in table 4. (a) and (d) shows the bunny model, (b)-(e) shows the dragon model, (c) and (f) show the ISS model

The diffuse rendering scheme performs really well, with a minimum FPS of 150 on the large ISS model, and capping out for the other two. The glossy material has a minimum FPS of 71 on the

largest model. This is with each ray being allowed to be reflected twice. This produces reasonably looking glossy materials, but such a small max ray reflection count can't produce photorealistic results. Since scaling up the max ray size is infeasible as the number of rays increases exponentially with it, this is the maximum the engine can handle while staying above 60 FPS.

This shows the HDDA+SDF performs very well with diffuse materials and dynamic lighting at over 150 FPS, and that it is able to accommodate a small amount of reflections off glossy materials all with around 80 FPS. This means this algorithm is a viable tool for doing real-time ray-tracing.

## Part V

# Conclusions

## 15 Summary of achievements

Referring to the aims and objectives in sections 2 and 3, the following is a summary of the achievements in this project:

1. The project successfully implemented the Hierarchical Digital Differential Analyzer (HDDA) combined with Signed Distance Fields (SDF) to enhance ray tracing efficiency. This resulted in significant performance gains over traditional HDDA, over 30% faster frame rates.
2. This algorithm was implemented on top of Volumetric Dynamic B+tree grid acceleration data structure, for which a custom GPU translation was developed.
3. The voxel rendering engine was developed with a focus on integrating these advanced algorithms, which proved to handle high-resolution scenes robustly, achieving good performance across tested scenarios often hitting the framerate cap of 165 FPS.
4. The engine was also equipped with quality of life features like benchmarking tooling, recording capabilities, .vdb file parsing, hot-reloading of shaders and dynamic lighting editing.
5. The algorithms developed were tested and compared, focusing on their performance in various scenes using different materials and scene complexities. This testing confirmed the algorithms' effectiveness and improvements in speed and quality of rendering.

## 16 Challenges and Adaptations

Various challenges were faced in developing this rendering engine, including:

1. **Debugging shaders:** Debugging the wgsl shader code proved to be particularly challenging due to the asynchronous and parallel nature of GPU operations. Traditional debugging tools are not supported on the GPU. Adapting to this meant using external tools like ShaderToy—a browser-based glsl tool—verify the correctness of shader code segments, which meant frequently translating between wgsl, used by the engine and glsl, supported by ShaderToy.
2. **GPU VDB:** Implementing the VDB data structure on the GPU (GPU VDB) involved overcoming significant technical hurdles related to memory management and data alignment. The adaptation required designing custom data structures and access patterns that optimized for GPU memory hierarchies and execution models.
3. **Data Precision:** Maintaining accuracy in GPU calculations, especially for operations prone to floating-point errors, was challenging. Strategies to address this included rearranging the order of operations to minimize rounding errors and precomputing common factors, which helped simplify calculations and preserve the integrity of compounding operations, such as ray marching.

## 17 Limitations and Future Work

Despite the achievements, there are several limitations that pave the way for future work:

1. **Material Support:** Current material modeling in the engine is somewhat limited. There is no well rounded implementation of each voxel indexing into a material list, instead materials

properties are considered global to the model and are set directly in compute shaders. Future work could add a material list that is passed into a uniform binding of the shader and in which VDB values index into.

2. **Caching and Frustum Culling:** The engine does not yet implement advanced node caching mechanisms or frustum culling, which can significantly improve performance by reducing memory usage. Future versions could integrate these features to handle larger scenes more efficiently.
3. **Loading Multiple Models in the Same Scene:** The current version has no way of loading more than one model at a time into the viewport. Future improvements could focus on adding methods that combine VDBs together in order to add them into the scene.

## 18 Conclusion

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## Acronyms

**B+tree** A m-ary tree with a variable but often large number of children per node.. 11

**CUDA** Compute Unified Device Architecture. 29

**DDA** Digital Differential Analyzer, line drawing algorithm described in section 7.3. 12

**FOV** Field of view, explained in section 10.3, item 3. 18, 19

**FPS** Frames per second. 16, 47

**FPU** Floating-Point Unit, a coprocessor for handling floating point numbers. 35

**GUI** Graphical User Interface. 20

**HDDA** Hierarchical DDA, line drawing algorithm described in section 7.3. 13

**ISS** International Space Station. 43, 46

**OS** Operating System. 15

**SDF** Signed distance fields, described in section 7.2. 12, 32, 38

**UUID** Universally Unique Identifier. 27

**VDB** Volumetric Dynamic B+tree grid data structure introduced by Ken Museth<sup>[4]</sup>. 10, 16

## **Appendices**

### **A Project outline**

Project outline as submitted at the start of the project is a required appendix.

### **B Risk assessment**

Risk assessment is a required appendix. Put here. And there as well