FAST GPU GENERATION OF DISTANCE FIELDS FROM A VOXEL GRID

by

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I declare that this dissertation is my own work and that the work of others is acknowledged and indicated by explicit references.
Nicolas Fedor May 2025



Abstract

Write a summary of the work presented in your dissertation. Introduce the topic and highlight your main contributions and results. The abstract should be comprehensible on its own, and should no contain any references. As far as possible, limit the use of jargon and abbreviations, to make the abstract readable by non-specialists in your area. Do not exceed 300 words.

Acknowledgements

Write any personal words of thanks here. Typically, this space is used to thank your supervisor for their guidance, as well as anyone else who has supported the completion of this dissertation, for example by discussing results and their interpretation or reviewing write ups. It is also usual to acknowledge any financial support received in relation to this work.

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Glossary

P Placeholder

Abbreviations

SVO Sparse Voxel Octree

JFA Jump Flooding Algorithm

CPU Central Processing Unit

GPU Graphics Processing Unit

DAG Directed Acyclic Graphs

SVDAG Sparse Voxel Directed Acyclic Graph

FPS Frames Per Second

DDA Digital Differential Analyzer

Chapter 1

Introduction

In recent years, real-time computer graphics applications have increasingly adopted distance fields as a fundamental representation for rendering and physics simulations (Jones & Satherley 2001). Distance fields, which encode the minimum distance from any point to the nearest surface, provide an elegant solution for various graphics operations including collision detection (Fuhrmann, Sobotka & Groß 2003), soft shadows (Tan, Chua, Koh & Bhojan 2022), and ambient occlusion (Wright 2015). While techniques exist for generating distance fields in real-time from a triangle mesh (Kramer 2015), techniques covering distance field generation from discrete voxel data are uncommon.

1.1 Problem Statement

Current approaches to distance field generation from voxel grids present various tradeoffs that limit their effectiveness in dynamic scenes. The Jump Flooding Algorithm (JFA) (Rong & Tan 2006, Rong & Tan 2007, Wang, Ino & Ke 2023), while efficient for parallel computation, introduces accuracy issues particularly at larger distances from surfaces and near feature edges. Scan, or prefix sum-based, approaches (Erleben & Dohlmann 2008) provide accurate results but suffer from inherent sequential dependencies that limit GPU parallelization. Wavefront propagation methods can efficiently update local regions but may struggle with concurrent updates in complex scenes (Teodoro, Pan, Kurc, Kong, Cooper & Saltz 2013).

Common optimization strategies, such as spatial partitioning into smaller chunks for localized updates (Naylor 1992), introduce their own challenges including boundary artifacts and increased

memory management overhead. While these techniques work well in isolation for specific use cases, there remains a fundamental gap in solutions that can handle arbitrary dynamic scene modifications while maintaining both accuracy and performance. This research investigates whether a novel hybrid approach—combining elements of existing techniques or developing new algorithmic patterns—could better address these challenges.

1.2 Aims and Objectives

This research aims to develop and evaluate novel GPU-based techniques for rapid distance field generation from voxel grid representations. The primary objectives are:

- To analyze and classify existing approaches to distance field generation, with particular focus on GPU-accelerated methods.
- To develop new algorithms that optimize the conversion process from voxel grids to distance fields.
- To implement and validate these algorithms on modern GPU architectures.
- To establish a comprehensive comparison framework for evaluating different distance field generation techniques.

1.2.1 Performance Metrics

The evaluation of the proposed methods will be conducted against sparse voxel octree implementations, which currently represent the state-of-the-art in many graphics applications. Key performance metrics include:

- 1. Computation time for initial distance field generation.
- 2. Memory consumption during generation and storage.
- 3. Update latency for localized geometric changes.
- 4. Scalability with increasing voxel grid resolution.
- 5. Accuracy of distance field values compared to analytical solutions.
- 6. GPU resource utilization, including memory bandwidth and compute occupancy.

1.3 Scope and Limitations

While this research addresses the core challenge of distance field generation, several related aspects fall outside its scope:

- The optimization of ray marching techniques for distance field rendering.
- The development of new compression methods for distance field storage.
- The optimization of the underlying renderer, which will include features like:
 - Memory management between the CPU and GPU.
 - Sychronization with the windowing framework.
 - Optimizing presentation of ray marching output image.

The focus remains specifically on the GPU-based generation process and its performance characteristics in dynamic scenarios. The research assumes access to modern GPU hardware and primarily targets real-time graphics applications where frequent distance field updates are required.

A sample "Falling Sand" graphics application will be implemented that will serve as a demo and benchmark for real-time performance of the distance field regeneration. The simulation itself will not be optimized and include a bare minimum of sand and water voxels that can fall and spread out in the world.

Chapter 2

Literature Review

Traditional real-time rendering has predominantly relied on triangle meshes as the fundamental primitive, with modern graphics hardware specifically optimized for rasterizing triangles efficiently (Akenine-Moller, Haines & Hoffman 2019).

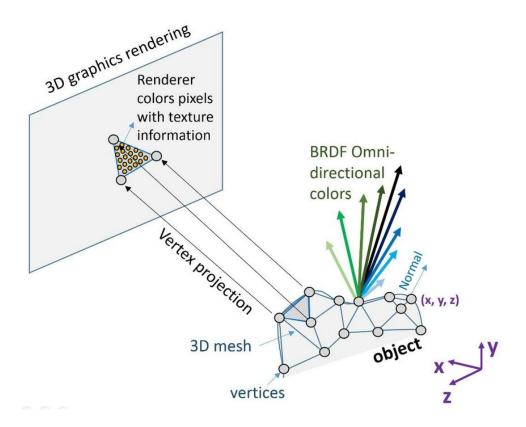


Figure 2.1: Illustration of how a collection of triangles get rasterized onto a screen as demonstrated by Lafruit et. al 2016

While this approach remains widespread, recent advances in hardware-accelerated ray tracing, particularly with NVIDIA's RTX series (2018) and AMD's RDNA2 architecture (2020), have enabled real-time ray tracing in commercial applications. Games like "Cyberpunk 2077" and "Metro Exodus Enhanced Edition" demonstrate that hybrid approaches combining rasterization and ray tracing can achieve photorealistic effects such as global illumination and accurate reflections at interactive framerates (Keller, Viitanen, Barré-Brisebois, Schied & McGuire 2019). However, both rasterization and ray tracing face similar challenges when representing highly detailed or volumetric content, leading to the exploration of alternative representations.

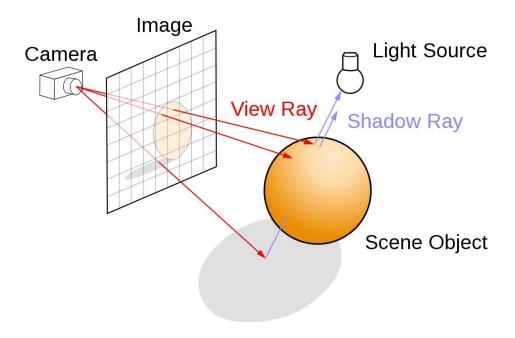


Figure 2.2: Visualisation of how ray-casting is used to rasterize a 3D world. Source: Wikipedia

2.1 Voxel-Based Representations and Optimization

2.1.1 Sparse Voxel Octrees

Sparse Voxel Octrees (SVOs) have emerged as a powerful solution for managing large-scale voxel worlds (Crassin, Neyret, Lefebvre & Eisemann 2009). Crassin et al. (2009) introduced GigaVoxels, a groundbreaking approach that demonstrated efficient rendering of highly detailed voxel scenes through hierarchical structure and streaming. Their work showed that SVOs could effectively compress empty space while maintaining quick traversal times for ray casting. Building

on this foundation, Laine and Karras (2010) developed an efficient sparse voxel octree (Laine & Karras 2010) implementation that improved upon previous approaches by introducing a novel node structure and traversal algorithm. Their method significantly reduced memory requirements while maintaining high rendering performance, making it particularly suitable for static scenes with complex geometry.

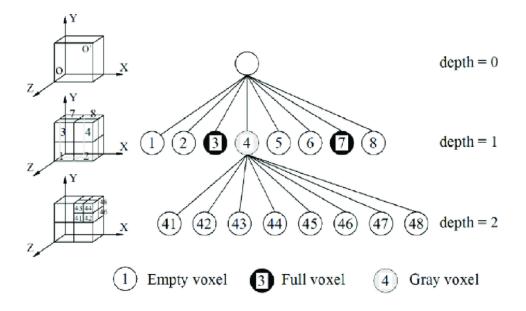


Figure 2.3: Illustration of the structure of a Sparse Voxel Octree, nodes with more details have additional subdivisions. (Truong-Hong & Laefer 2014)

2.1.2 Compression and Optimization Techniques

Several researchers have explored various compression techniques to further optimize voxel storage. Kämpe et al. (2013) introduced directed acyclic graphs (DAGs) for voxel scenes (Kämpe, Sintorn & Assarsson 2013), achieving compression ratios of up to 50:1 compared to standard SVOs while maintaining real-time rendering capabilities. This approach proved particularly effective for architectural and synthetic scenes with repeated structures.

2.1.3 Challenges in Dynamic Scenes

The primary challenge in dynamic voxel environments lies in maintaining data structures that can efficiently support modifications. Updating traditional SVOs in real-time presents significant

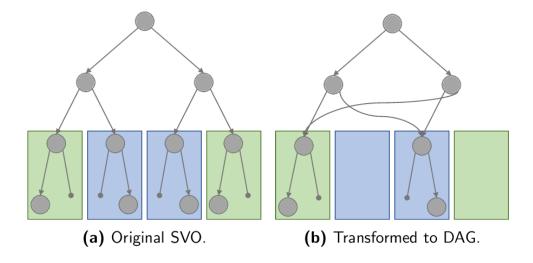


Figure 2.4: Comparison of a octree versus the compressed format of a SVDAG, illustrated as a quad tree for brevity. (Dolonius 2018)

computational overhead, as changes often require rebuilding portions of the tree structure. Pan (2021) explored a novel technique for merging SVOs and dynamically creating nodes where updates are needed (Pan 2021), while this showcases SVOs have the potential to support large dynamic scenes, the results show that real-time updates, such as in a video game application, are hard to achieve.

2.2 Distance Fields as an Alternative Representation

Distance fields have gained attention as an alternative to direct voxel storage, offering several advantages for both rendering and collision detection. Several recent works have demonstrated the advantages of using distance fields for real-time rendering of implicit surfaces (Hadji-Kyriacou & Arandjelović 2021) and function grids (Söderlund, Evans & Akenine-Möller 2022).

2.2.1 Real-Time Generation and Updates

The challenge of generating and updating distance fields in real-time remains an active area of research. Techniques such as Jump Flooding (Rong and Tan, 2006) provide fast approximate solutions but suffer from accuracy issues (Rong & Tan 2006, Rong & Tan 2007); improvements to Jump Flooding are being researched that allow for it to be used in dynamic contexts where recalculation of distance fields is needed (Stevenson & Navarro 2022).

84.8	54.6	24.4	-5.8	-17.0	8.2	33.4	58.2	69.2	80.3	91.7	116.5
49.3	14.8	-15.4	-45.7	-60.2	-35.0	-9.8	9.4	20.5	31.6	46.2	85.5
39.2	-10.3	-55.3	-85.5	-103.4	-78.2	-53.0	-39.4	-28.3	-17.2	21.3	68.6
32.3	-17.2	-66.7	-116.3	-146.6	-121.4	-99.3	-88.1	-77.0	-42.3	5.0	52.3
25.4	-24.1	-73.7	-104.2	-132.7	-161.8	-148.0	-136.9	-105.8	-58.6	-11.3	36.0
24.3	6.1	-34.6	-63.1	-91.7	-127.3	-170.1	-169.4	-120.5	-71.2	-22.0	27.2
63.5	35.0	6.4	-22.1	-58.4	-102.0	-133.5	-129.2	-111.8	-62.6	-13.3	35.9
104.6	76.0	47.5	9.7	-33.9	-77.5	-83.6	-80.1	-70.2	-53.9	-4.7	44.6
145.6	117.1	77.8	34.2	-9.4	-31.1	-33.6	-31.1	-21.2	-11.3	4.0	53.2
186.7	145.9	102.3	58.7	21.9	18.9	16.3	17.9	27.8	37.7	47.6	72.4
214.0	170.4	127.3	90.2	71.4	68.8	66.2	66.9	76.8	86.7	96.6	111.9

Figure 2.5: Illustration of a discrete signed distance field grid. Negatives values indicate a cell inside the shape, positive values indicate a cell outside of the shape.

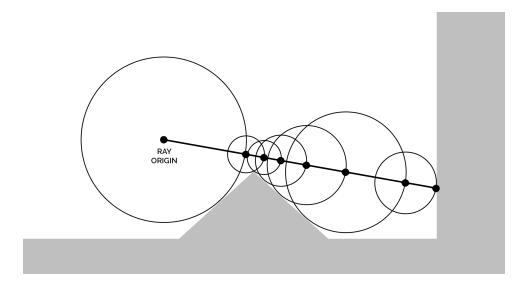


Figure 2.6: Example of a ray marching from a camera using sphere ray marching and a signed distance function. The ray will query the function for the distance to the nearest object, and advance by that amount.

Chapter 3

Methodology

The research methodology focuses on developing a dynamic distance field generation system using Vulkan, a low-level graphics API that provides precise control over GPU resources and computation. The system is designed to address the challenges of efficient distance field generation and rendering in dynamic voxel-based environments.

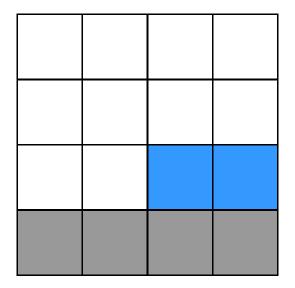
3.1 World Representation

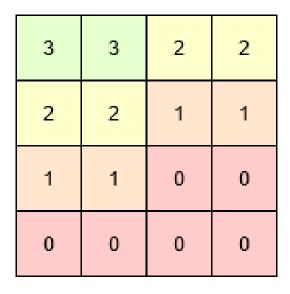
The world is stored in a GPU buffer with host and device accessibility. This design choice prioritizes flexibility in world modification while minimizing performance overhead. Unlike traditional rendering approaches, the world buffer is not directly rendered, which mitigates potential performance penalties associated with host-visible memory. The choice of host-visible memory means that the host is able to update the world buffer as needed and the updates will be visible to the device as well reducing complexity in staging buffers.

The world buffer will be stored in an uncompressed and dense format; this means each voxel in the world will be present in the world buffer with all of it's associated data. In this case a voxel will be a 32-bit unsigned integer, a value of 0 indicates an "air" voxel that should not be visible when rendered, while all other values indicate some form of solid voxel.

3.2 Distance Field Computation

The computation of a distance field, given a voxel grid, is the primary focus of this paper. To accomplish this a compute shader is implemented that will output a buffer containing the discrete distance field grid for a corresponding input voxel grid. This implementation is what will change throughout this paper as new algorithms and optimizations are added. The distance field will contain the Manhattan distance to the nearest solid voxel, this is important for accurate ray marching of the distance field 3.3.





- (a) A 2D representation of the world. Empty voxels (b) The Manhattan discrete distance field represenare indicated by white cells.
 - tation of the world in 3.1a.

Figure 3.1: Illustration of the relation between a raw representation of a world, and its corresponding discrete distance field.

The computation of a distance field should not occur every frame as that would negatively impact the frame rate of an application. Instead, the CPU will update the world state to "dirty" to indicate that the distance field needs to be re-generated to reflect the newest state of the world. The workflow for this can be seen in 3.2

To facilitate voxels having colors, colour information is encoded into the distance field. The distance field buffer will be a 1-dimensional unsigned integer array. The highest 8 bits define the distance to the nearest solid voxel using the Manhattan distance, the lowest 8 bits define



Figure 3.2: Illustration of the computational workflow required in deciding when to update the discrete distance field of a world.

the colour of the voxel in a compressed RGB332 format; voxel colours are hard-coded into the distance field as can be seen in 3.3.

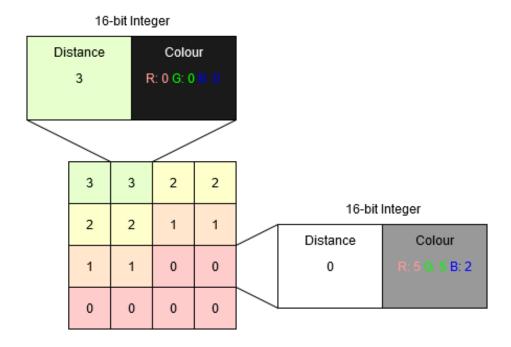


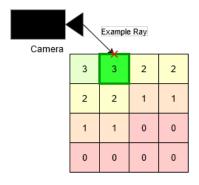
Figure 3.3: Based on the same distance field as in 3.1b, the underlying integer of an empty and solid voxel are shown.

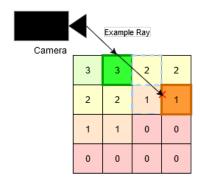
3.3 Rendering and Ray Marching

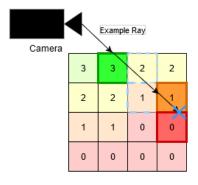
The rendering is handled by a ray marching compute shader; the distance field is the only input to this shader. The ray marcher utilizes a digital differential analyzer to traverse through a voxel grid quickly (Amanatides et al. 1987). This approach ensures a ray traversing the distance field grid will traverse each voxel along the ray, as other methods like sphere marching could result in artifacts due to a ray "missing" a voxel, when using the Manhattan distance; the steps a ray takes through the world can be seen in 3.4.

The ray marching compute shader will use a 3D perspective camera, that can move around the world. A ray can:

- 1. Miss the world entirely, this should result in a sky color being output at that pixel.
- 2. Hit the world, but not hit any solid voxels. A solid voxel is determined as a distance of 0. This will also result in a sky color being output at that pixel.
- 3. Hit the world, and hit a solid voxel. This will result in the color at that voxel being output to the pixel.







(a) A ray is initially shot from the camera, hitting an outermost voxel of the world; a distance of "3" is read from the distance field.

(b) The ray advances 3 voxels 1987), before reading the distance field again. A distance of "1" is found, so the ray should continue marching through the world.

(c) The ray advances the final disusing DDA (Amanatides et al. tance, as per the previous step, finally hitting a voxel with a distance of "0". This marks the end of the ray marching, and a colour can be read from the distance field for it to be rendered.

Figure 3.4: Example of a ray marching through a discrete distance field using DDA (Amanatides et al. 1987).

Demonstration Application: Falling Sand Simulation 3.4

A "Falling Sand" simulation (Castro & Chernick n.d.) will be implemented, this will be used in determining whether distance field updates are a viable approach for a dynamic voxel-based world. In our version of the falling sand simulation, an additional water particle will be implemented that can also move horizontally in addition to downwards like sand.

This simulation will be used to determine the performance of rendering the distance field per the defined frame performance metrics 3.5.1. In addition to this, the high amount of updates will be useful in collecting a large data set of distance field computation metrics 3.5.2.

The simulation will have a variable update frequency allowing control over the number of updates run per second. Additionally, the world will have a variable size to allow for testing the performance at different sizes. SVO implementations typically see upwards of 10 voxel levels (Laine & Karras 2010) resulting in a world size of at least 1024³, all the way to worlds of sizes 65536³. The simulation will be run at different world sizes but will be limited by memory consumption due to the uncompressed nature of the world representation and distance field.

The process for rendering will be:

- 1. Run an iteration of the falling sand simulation on the world buffer.
- 2. Recompute distance field if the world buffer has been modified.
- 3. Render the distance field to the screen.

3.5 Performance Evaluation

As part of the evaluation of the distance field generation in a dynamic environment, several performance metrics need to be gathered.

The performance test will be run multiple times with the same parameters to ensure accurate metrics are gathered; for each implementation of the distance field computation, the demonstration application will be run using differing world sizes, this may vary from implementation to implementation depending on their specific limitations. Results between implementations will also be evaluated.

3.5.1 Frame Performance Metrics

Frame performance metrics will help in determining whether the application can run in real-time in a "playable" speed. The minimum required frame rate for a game to be deemed playable is a heavily debated topic; however, player performance typically hits a plateau above 60 frame-per-second (FPS) (Claypool & Claypool 2007), with 30 FPS being a solid starting point. For this paper, a minimum target of 30 FPS will be set with the falling sand simulation; this should take into account the efficiency which the distance field computation is carried out and the effect it has on rendering.

3.5.2 Distance Field Computation Metrics

The primary metric used here will be the execution time. Assuming a 30 FPS target, the frame time is 33.33ms, this means for any given frame all application operations must take less than 33.33ms to achieve the target FPS; the upper limit for the distance field execution time is 33.33ms which would assume all other factors like simulation update and rendering take no time in a frame.

3.6 Limitations and Considerations

The performance of the distance field computation, and the rendering, is highly hardware dependent; factors such as:

- 1. GPU specifications
- 2. Memory configuration
- 3. Driver versions

With this in mind the performance testing for this paper is carried out on a laptop:

 $\ensuremath{\textit{CPU:}}$ AMD Ryzen 9 5900HS with Radeon Graphics @ 3.3GHz

 $\boldsymbol{GPU:}$ NVIDIA GeForce RTX 3070 Laptop GPU

 $\it RAM: 16384 {
m MB} @ 3200 {
m MT/s}$

Chapter 4

Implementation

This chapter will focus on the implementation of various methods for generating a discrete distance field. It will start with a basic brute-force approach before delving into optimizations and other algorithms. Each implementation will include a short performance test for comparison between different implementations.

4.1 Brute-force Approach

A brute-force implementation for calculating the discrete distance field given a voxel grid is the most straight-forward to implement but will suffer from performance; especially as world sizes get larger.

To compute the distance field for a voxel grid using a brute-force approach, we consider a voxel, V at (x, y, z). The algorithm starts iterating from the origin of the world (0, 0, 0) and progresses incrementally along each axis of the grid. For every voxel in the grid, the Manhattan distance is calculated to V. This exhaustive method, while producing an accurate distance field, must explore every other possible coordinate within the grid; this can be seen in Algorithm 1.

In the worst-case scenario, the algorithm must evaluate the distance for all N^3 , where N is the size of one axis and the grid has uniform dimensions. This, the worst-case complexity is $O(N^3)$. In the best-case, when the voxel V is located near the origin a complexity of O(1) can be achieved, but this is highly unlikely.

```
Algorithm 1 Brute Force Distance Field Calculation
```

```
1: Input: Voxel grid size N, Voxel location (x, y, z)
 2: Output: Distance field grid D
 3: Initialize D[i][j][k] \leftarrow N for all i, j, k \in [0, N-1]
 4: for i = 0 to N - 1 do
      for j = 0 to N - 1 do
 5:
        for k = 0 to N - 1 do
 6:
          d \leftarrow |i-x| + |j-y| + |x-z| {Manhattan distance calculation, this will be common
 7:
          to all implementations.
          if d < D[i][j][k] then
 8:
             D[i][j][k] \leftarrow d {Write only the shortest distance to the output.}
           end if
10:
        end for
11:
12:
      end for
13: end for
14: Return: D
```

4.1.1 Performance Results

At very small world sizes, the performance of the brute-force algorithm is sufficient; however the performance gets exponentially worse the larger the world becomes. At a world size above 256³, the amount of work required by each warp on the GPU becomes too large resulting in the application crashing, as such the testing for this only went to a world size of 128³.

World Size	83	16^{3}	32^{3}	64^{3}	128^{3}
Avg. FPS	142.22890	142.335887	129.15436	2.26601	0.03938

Table 4.1: Frame rate of the brute-force algorithm at varying world sizes with a simulation speed of 10 updates/sec.

The results in Table 4.2 highlight how a brute-force approach is unsuitable for large dynamic worlds. A common optimization is chunking to split a large world into smaller "chunks" as described in 4.2.

World Size	83	16^{3}	32^{3}	64^{3}	128^{3}
Avg. Time (ms)	0.24165356	1.3928156	10.199081	387.77307	27297.08
Std. Deviation (ms)	0.024596296	0.26439393	0.45690483	35.218475	63.497536
Confidence Interval (ms)	(0.1586, 0.26592)	(1.3709755, 1.416557)	(10.172742, 10.225421)	(381.69547, 393.85068)	(27262.563, 27331.598)

Table 4.2: Distance field compute shader execution time using the brute-force algorithm.

4.2 Splitting a World into Chunks

Now we are talking.

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