# GA-Unity: A Production-Ready Unity Package for Seamless Integration of Geometric Algebra in Networked Collaborative Applications

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Abstract. This paper introduces GA-Unity, the first Unity package specifically designed for seamless integration of Geometric Algebra (GA) into collaborative networked applications. Indeed, in such contexts, it has been demonstrated [18] that using multivectors for interpolation between transmitted poses reduces runtime by 16% and bandwidth usage by an average of 50% compared to traditional representation forms (vectors and quaternions); we demonstrate that GA-Unity further enhances runtime performance. Tailored for 3D Conformal Geometric Algebra, GA-Unity also offers an intuitive interface within the Unity game engine, simplifying GA integration for researchers and programmers. By eliminating the need for users to develop GA functionalities from scratch, GA-Unity expedites GA experimentation and implementation processes. Its seamless integration enables easy representation of transformation properties using multivectors, facilitating deformations and interpolations without necessitating modifications to the rendering pipeline. Furthermore, its graphical interface establishes a GA playground for developers within the familiar confines of a modern game engine. In summary, GA-Unity represents a significant advancement in GA accessibility and usability, particularly in collaborative networked environments, empowering innovation and facilitating widespread adoption across various research and programming domains while upholding high-performance standards.

Keywords: Conformal Geometric Algebra · Unity Game Engine · Networked Collaborative Environments · Visualization Tools · Production Ready

# 1 Introduction

Geometric Algebra (GA) has garnered significant attention across various scientific disciplines [16, 15], particularly within the realm of Computer Graphics (CG). In the domain of CG, Modern Game Engines (MGEs) have emerged as pivotal platforms for application development [17]. Among these, Unity stands as a preeminent and widely adopted MGE, notably in educational and research contexts [10, 6].

Higher-dimensional algebras, such as dual quaternions and Geometric Algebra—specifically, 3D Projective and 3D Conformal Geometric Algebra (3D PGA and 3D CGA) have demonstrated profound efficacy in CG applications, particularly in rendering, animation and deformations [12, 8], especially in networked environments, as multivector representation of object poses leads to more efficient bandwidth usage and better runtime performance [18].

Despite CG experts' proficiency in Euclidean Geometry and Quaternions, incorporating advanced representations into applications remains challenging. Key concerns revolve around the scarcity of readily available, production-ready tools suitable for integration into MGE environments where applications are developed. Of particular hindrance is the necessity to construct a Geometric Algebra (GA) framework from scratch, considering the specialized functionality required. This includes tasks such as transforming all points to their GA equivalent multivector form, applying deformations (e.g., translations, rotations, and dilations), and determining multivector types. The demand for such GA frameworks is particularly critical in Computer Graphics, especially in the emerging trend of collaborative, shared virtual environments [28, 31]. Applications falling into this category can greatly benefit from the utilization of multivectors instead of standard representations (matrix and quaternion algebras). Indeed, authors in [18] demonstrated a 16% runtime improvement and an average 50% reduction in bandwidth usage for performing object interpolations among users collaborating remotely in the same scene. This highlights the instrumental role that GA can play if adopted by Unity developers. However, various challenges make this adoption difficult (see Section 2.2).

In response to these challenges, we present GA-Unity. Engineered to bridge the gap between advanced geometric representations and practical application development within Unity, GA-Unity offers a comprehensive solution for CG experts aiming to leverage the power of Geometric Algebra in their research and development endeavors, especially in collaborative networked environments. GA-Unity's feature set includes a pipeline capable of efficiently handling object transformations in GA forms, both for applying deformations and interpolating between objects, suitable for real-time visualization. Significantly, GA-Unity is a production-ready implementation that addresses performance bottlenecks identified in earlier studies, ensuring efficiency and scalability in practical networked applications without compromising compatibility with other networking pipelines.

The remainder of this paper is structured as follows. In Section 2, we provide an overview of previous work and identify the limitations of existing tools. Section 3 introduces the basic concepts of Geometric Algebra, laying the foundation for understanding its applications. Section 4 details the design and architecture of GA-Unity, highlighting its key components. We then delve into the features of GA-Unity in Section 5, discussing how GA-Unity can be used for networked collaborative applications, how objects are interpolated using GA, and presenting the graphical interface of the package. Section 6 evaluates the performance of GA-Unity, presenting benchmarking results, comparing it with existing approaches for networked environments. Lastly, in Section 7, we present case studies and applications of GA-Unity in research environments, game development, and education.

# 2 Related Work

Previous research has explored diverse approaches to integrating Geometric Algebra (GA) into programming environments, particularly focusing on applications in CG and related fields.

Various Geometric Algebra textbooks, such as those by Hildenbrand et al. [12] and Dorst et al. [8], offer introductory insights into Geometric Algebra, presenting it as a geometrically intuitive framework within the context of CG. At their core, these texts present Geometric Algebra as a unified language that facilitates intuitive object representation and kinematic computation across various mathematical systems in CG.

In addition to providing a valuable representation, GA implementations also offer efficiency gains. For instance, Papagiannakis et al. [25] demonstrated the efficiency of GA in real-time character animation blending compared to standard quaternion geometry implementations. In their study, GA rotors exhibited faster performance and superior visual quality in real-time character animation blending scenarios, outperforming traditional quaternion geometry implementations.

In [24], authors provided a CGA-GPU inclusive skinning algorithm that provides smooth and more efficient results than standard quaternions, linear algebra matrices, and dual-quaternions blending and skinning algorithms. Moreover, their approach avoided conversion between different mathematical representations, suggesting the implementation of an all-in-one framework based only in multivectors.

In the same context, Kamarianakis et al. [19] used CGA to perform realistic cuts and tears in rigged character simulation, enabling new applications in medical surgical simulation. Their work was further improved in [20], where they also used particles to simulate elasticity of the cut/torn model, for increased realism.

## 2.1 Previous Approaches to GA Integrations

CLICAL [21] (1982) was one of the earliest tools for computations involving complex numbers, quaternions, octonions, vectors, and multivectors, enabling geometric, wedge, and dot products. Gaigen 2 [9] efficiently generates Geometric Algebra (GA) code from high-level algebra specifications, converting them into low-level coordinate-based implementations in various target languages, adapting to program requirements for high performance. GABLE [22] and the Clifford multivector toolbox for MATLAB [32] offer educational tools for GA in Euclidean 3D-space, supporting Clifford algebras and matrix computations of multivectors. Garamon [5], a  $C_{++}$  library, and Clifford [11], a Python module, provide efficient implementations of GA for mixed-grade multivectors, with Garamon employing a prefix tree approach for higher dimensions. The Python module kingdon [30] extends this by supporting multivectors over numpy arrays, PyTorch tensors, or SymPy symbolic expressions with visualization features. GAALOP [13, 14] optimizes geometric algebra files for high-performance parallel computing on platforms like FPGA and CUDA. It integrates with CLU-Calc software for interactive GA handling and supports output in formats like C++, OpenCL, CUDA, CLUCalc, or LaTeX. GAALOPWeb [3], a Mathematica tool, and another Mathematica package by Aragon et al. [4], enhance the manipulation, testing, and visualization of GA algorithms, providing user-friendly interfaces for *n*-dimensional vector space calculations. Klein [23], a  $C_{++}$  library for 3D Projective Geometric Algebra, targets high-throughput applications like animation libraries and kinematic solvers, leveraging SSE for competitive performance without generalizing the space's metric or dimensionality.

# 2.2 Challenges in Adopting Existing Solutions in Modern Game Engines



Fig. 1. Incorporating GA-Unity within a networked collaborative Unity project. User A sends transformation information to User B over the network in multivector form. GA-Unity is useful for both users: for User A, it streamlines the conversion from typical representation forms (such as vectors, quaternions and scale factors) to GA, while for User B, it aids in decoding and interpolating it. The benefits of this approach is a gain of 50% in terms of bandwidth [18] and 25% in terms of running performance for the receiving user B, as shown in Section 6.

Integrating existing implementations of GA into MGEs presents several challenges:

Language Limitations: MGEs typically support scripting languages like C,  $C \#$ , or  $C++$ , excluding the native execution of scripts in languages such as Python. This limitation restricts the availability of readily usable code for application and game developers, hindering the adoption of GA solutions.

**Limited Functionality in C# Packages:** Existing  $C#$  packages, like those provided generated via Ganja.js [7], offer only basic multivector functionality. While they provide essential operations such as geometric, inner, and outer products, conjugation, and scalar multiplication, they lack comprehensive support for tasks like defining objects and applying transformations. This forces developers,

including newcomers to GA, to create such functionalities from scratch, which can be challenging even for experts.

Difficulty in Porting Efficient  $C++$  Packages: Although packages like Klein, Versor [2], written in  $C++$ , offer efficiency in terms of performance, porting them to Unity's  $C#$  environment presents significant challenges. While it's possible to create a  $C++$ -to- $C#$  wrapper, this approach introduces complexities such as performance overhead, maintenance requirements, memory management issues, and limited access to C++ class interfaces and methods. Moreover, Klein's limitation to 3D Projective GA precludes the representation of scalings or round objects like spheres or circles, unlike the more versatile 3D CGA.

# 3 Geometric Algebra Primer

#### 3.1 Fundamentals of Geometric Algebra

Geometric algebra is a mathematical framework that unifies and extends many algebraic systems, including vector algebra, complex numbers, and quaternions, by introducing the concept of multivectors. Unlike traditional approaches, which treat scalars, vectors, and higher-dimensional entities separately, geometric algebra provides a cohesive framework to represent and manipulate these entities seamlessly. At the heart of geometric algebra is the concept of the geometric product, which generalizes the dot product and the cross product in Euclidean spaces. Additionally, as all products can be defined using only the geometric one, we need only use the latter one along with addition, scalar multiplication, and conjugation to perform any multivector manipulation.

#### 3.2 The 3D Conformal Geometric Algebra

In the context of this work we will be employing the so-called 3D Conformal Geometric Algebra (CGA), a 32-dimensional extension of dual-quaternions [33], CGA is a rich mathematical framework that enables the representation of 3D round elements, such as spheres and circle, as multivectors within the algebraic structure of CGA. Essentially, CGA serves as the minimal extension where such representation becomes feasible. In the notation of the following sections, we will be using the typical basis of CGA, which involves the elements  $\{e_i : i =$ 1, 2, 3, 4, 5} as well as all 32 potential geometric products of up to 5 of them. For convenience, we define  $e_o$  and  $e_{\infty}$  as  $\frac{1}{2}(e_5 - e_4)$  and  $e_4 + e_5$ . The inner and outer (or wedge or cross) product of multivectors are denoted by  $\vert$  and  $\wedge$  respectively. More information on the Projective Geometric Algebra (PGA) and CGA can be found in standard GA textbooks or notes, such as [8, 29, 12].

## 3.3 Geometric Transformations in Conformal Geometric Algebra

In CGA, translations, rotations and dilations, i.e., uniform scalings with respect to origin, can be expressed in multivectors, as shown in Table 1.

Type	Translation	Rotation	Dilation
<b>Notes</b>	By $(t_1, t_2, t_3)$	Equivalent to quaternion	Uniform scale
		$q = a - di + cj - bk$	by $d$ wrt. origin
		$R =$	$S =$
	Multivector $ 1 - 0.5(t_1e_1 + t_2e_2 + t_3e_3)e_{\infty} $	$a + be_{12} + ce_{13} + de_{23}$	$1 + \frac{1-d}{1+d}e_4e_5$
Inverse	$T^{-1} =$	$R^{-1} =$	$S^{-1}$ –
	Multivector $1 + 0.5(t_1e_1 + t_2e_2 + t_3e_3)e_{\infty}$ $a - be_{12} - ce_{13} - de_{23}$		$\frac{(1+d)^2}{4d} + \frac{d^2-1}{4d}e_4e_5$

Multivector  $1 + 0.5(t_1e_1 + t_2e_2 + t_3e_3)e_\infty$   $a - be_{12} - ce_{13} - de_{23}$   $\frac{(1+a)^2}{4d} + \frac{a^2 - 1}{4d}e_4e_5$ <br> **Table 1.** Multivector forms of translations, rotations and dilations in 3D CGA, as well as their inverses.

To apply transformations  $M_1, M_2, \ldots, M_n$  (in this order) to an object O, we define the multivector  $M := M_n M_{n-1} \cdots M_1$ , where all intermediate products are geometric. The resulting object  $O'$  after all transformations are applied is given by:

$$
O' = MOM^{-1}
$$
 (1)

This represents the final form of O after all transformations have been applied. Notice that we standard GA textbooks also use the reverse  $\tilde{M}$  instead of the inverse  $M^{-1}$  in the equation above, which essentially results in the same object  $O'$  potentially multiplied by a non-zero scalar; as we are in a projective space, this essentially amounts to the same object.

# 4 Design driven by modern needs

The core objective of GA-Unity is to empower Unity developers, regardless of their prior experience with Geometric Algebra (GA), to seamlessly integrate GA into their applications without sacrificing performance. The design and features of the proposed package revolve around this central idea.

One of the key features of the GA-Unity package is its native support for CGA multivectors to represent geometric relationships between parent and child objects within the Unity Game Engine. The implementation is crafted to facilitate developers' rapid comprehension of GA concepts and immediate visualization of results. Object transformations can be provided directly in multivector form or generated as multivectors from mainstream formats such as translation vectors, unit quaternions, and scale factors. These multivectors can be manipulated and subsequently utilized by the Unity engine to apply the corresponding local-toworld transformations to objects.

As previously highlighted in [18], multivectors are particularly suited for interpolating objects. GA-Unity offers the capability to interpolate an object between two poses stored in multivector form (see Section 5.2). The intermediate transformation multivector obtained through interpolation is seamlessly applied to the object with increased performance compared to unoptimized implementations (see Section 6).

Additional features of GA-Unity include the ability to add objects in multivector form and instantly visualize them (or their duals). Real-time editing of each coordinate of an object facilitates a deeper understanding of the geometric implications of coordinate adjustments. Moreover, GA-Unity supports the creation of more complex objects using the wedge product for specific object combinations. For example, the wedge product of two points with the point at infinity  $e_{\infty}$  represents a line passing through these points. Similarly, the wedge product of two dual spheres (or planes) corresponds to their intersection, which is a circle (or a line, respectively).

## 4.1 The GA-Unity Package

The proposed GA-Unity package essentially consists of  $4 \text{ C#}$  Unity scripts, described below:

- 1. R410.cs: Originally generated by Ganja.js, contains basic multivector class for CGA, along with basic methods such as scalar multiplication, conjugate, and geometric/inner/outer product. Also includes basic functions to extract transformation information from translators, rotors and dilators, as well as perform linear multivector interpolation.
- 2. R410\_Helper.cs: Used to increase performance by exposing basis elements outside R410, as a single reference object. Contains functions that constructs commonly used multivectors such as translators, rotors and dilations as well as objects such as points or spheres.
- 3. R410\_pool.cs: Creates a single reference object that is used to allocate an extensible pool of multivectors that are used throughout the interpolation phase. Using multivectors from the pool, and returning them back once no longer needed, allows avoiding dynamic allocation of memory and increases performance.
- 4. MultivectorLerp.cs: Contains all the interpolation pipeline, as described in Section 5.2.
- 5. GUI.cs: Contains everything related to the Graphical User Interface (see Section 5.4).

A complete Unity project incorporating GA-enabled deformations and interpolations only needs this Unity package, along with a scene containing the objects intended for visualization and/or interpolation. You can find a minimal open-source working example of such a project in the GitHub repository (https://github.com/papagiannakis/GA-Unity), along with the necessary documentation. The full closed-source implementation, which improves the proposed interpolation mechanism for networked collaborative Unity applications to achieve faster interpolations, has already been integrated into the MAGES SDK [34], available for free.

# 5 GA-Unity Features

# 5.1 Simplified Incorporation of GA in Networked Collaborative Applications

In [18], the authors demonstrated the significant benefits of using multivector forms to transmit deformation data in the context of networked collaborative applications. They showed that employing GA forms leads to a 16% reduction in runtime and an average 50% reduction in bandwidth usage compared to using mainstream formats such as vectors, quaternions, and scale factors. This reduction in data transfer across the network between users is crucial for user immersion, as jittery interpolations can disrupt it. In collaborative scenarios, such issues can even compromise application functionality, as objects' positions may not be updated in time for users to interact with them, leading to situations like missing hitting a moving ball in a tennis application or failing to grab an object passed by another user.

While previous works demonstrate the methodology for using multivectors to alleviate these issues, two major bottlenecks hinder the adoption of this approach. Developers were required to implement everything from scratch to incorporate this functionality into their applications, and an unoptimized implementation could result in performance hindrances due to continuous memory allocation for 32-dimensional float arrays representing multivectors. GA-Unity addresses both of these issues, as it can be directly incorporated into the workflow of a networked application (see Figure 1). Furthermore, its design mitigates dynamic yet constant memory allocation that causes performance overhead using a suitable pooling mechanism (refer to Sections 4 and 6). Finally, the proposed workflow remains compatible with existing networking frameworks and pipelines such as  $Photon<sup>1</sup>$  or Riptide<sup>2</sup>.

## 5.2 Interpolating Objects in Unity using CGA

Consider the task of interpolating an object between two distinct poses denoted as  $P_1$  and  $P_2$ . These poses are characterized by translation, rotation, and dilation multivectors  $(T_i, R_i, D_i)$  for  $i = 1, 2$ , respectively. The interpolation factor  $\alpha \in$ [0, 1] signifies the extent of transition between the poses. At  $\alpha = 0$ , the object aligns with pose  $P_1$ , gradually transitioning towards pose  $P_2$  as  $\alpha$  progresses towards 1. Given that objects within MGEs are typically represented as meshes comprising interconnected points, determining the transformed coordinates of each point x within this mesh necessitates consideration of  $P_1$ ,  $P_2$ , and  $\alpha$ . This transformed point, expressed in multivector form, is denoted as  $x(P_1, P_2; \alpha)$  or simply  $x(\alpha)$ .

To compute  $x(\alpha)$ , we apply the requisite transformations  $(T(\alpha), R(\alpha), D(\alpha))$ to x, facilitating the interpolation between poses  $P_1$  and  $P_2$  by the factor  $\alpha$ .

 $\frac{1}{1}$  https://www.photonengine.com/

 $2 \text{ https://riptide.tomweiland.net/}$ 

Mathematically, this computation is articulated as:

$$
x(\alpha) := MxM^{-1} \text{ where } M := T(\alpha)R(\alpha)D(\alpha). \tag{2}
$$

The acquisition of these transformations follows a methodology similar to that elucidated in [18]. Specifically, given the multivectors  $M_i = T_i R_i D_i$  for  $i \in$ 1, 2, we extract  $D_i$  via the corresponding scale factor  $s_i$  using the methodology described in Section 5.3, and evaluate the multivectors  $TR_i := M_i D_i^{-1} = T_i R_i$ . We can now perform linear interpolation with factor  $\alpha$  to calculate  $TR := (1 \alpha$ )TR<sub>1</sub> +  $\alpha$ TR<sub>2</sub> = T( $\alpha$ )R( $\alpha$ ) and again use Section 5.3 to extract T( $\alpha$ ) and R( $\alpha$ ).  $D(\alpha)$  is calculated as the dilator corresponding to scale factor  $(1-\alpha)s_1 + \alpha s$ )s<sub>2</sub>. Finally, Unity applies the evaluated transformations within its typical pipeline to visualize the object interpolated. A summary of the proposed pipeline is depicted in Figure 2.



Fig. 2. An overview of the proposed pipeline for interpolating between two poses is provided. A pose can be inputted as a single multivector  $M$ , or as three multivectors T, R, D, or via its typical representation form, consisting of a vector, a quaternion, and a scale factor. Following a "preprocess" step to extract the  $TR$  and scale factor of each pose (if necessary), corresponding vectors, quaternions, and scales can be obtained for each  $\alpha$  (alpha factor), which are natively used by Unity. Dashed boxes indicate multivector forms.

While the resulting interpolation transformations differ from those obtained using matrix/quaternion representations such as vectors and quaternions, prior research [18] has shown that the resulting interpolated animations closely match standard outcomes, especially when the poses are closely situated.

Moreover, one might question why we don't directly evaluate the interpolated  $M := (1 - \alpha)M_1 + \alpha M_2$  and utilize it to derive  $T(\alpha)$ ,  $R(\alpha)$ , and  $D(\alpha)$ . It can be demonstrated that even a simple interpolation of two dilators does not align with the linear interpolation of the corresponding scaling factors while involving more complex multivectors tends to produce highly non-linear results.

#### 5.3 Ability to extract transformation from a multivector product

A common mathematical problem that occurs in such applications regards the extraction of translation  $T$ , rotation  $R$  and dilation  $D$  from a scaling motor,

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i.e., a multivector product  $M = TRD$ . To solve this problem, we apply M to a unit sphere C, centered at origin. The obtained sphere  $C' = MCM^{-1}$  is a sphere centered at  $t$  with radius  $d$ , that correspond to the translation vector of  $T$  and the scale factor of  $D$  respectively. Since we obtained  $T$  and  $D$ , we can then identify  $R := T^{-1}MD^{-1}$  and extract the unit quaternion using the equivalence in Table 1.

Extracting the center and radius of a sphere in multivector form is quite straightforward, provided we know how it is represented in CGA. Indeed, a sphere s centered at  $x = (x_1, x_2, x_3)$  with radius r amounts to the CGA multivector

$$
S = x_1e_1 + x_2e_2 + x_3e_3 + \frac{1}{2}(x_1^2 + x_2^2 + x_3^2 - r^2)e_\infty + e_o
$$
  
=  $x_1e_1 + x_2e_2 + x_3e_3 + \frac{1}{2}(x_1^2 + x_2^2 + x_3^2 - r^2 - 1)e_4$   
+  $\frac{1}{2}(x_1^2 + x_2^2 + x_3^2 - r^2 + 1)e_5.$  (3)

Notice that (a) setting  $r = 0$  would yield the respective multivector for the point x and that (b) given S we can extract both x and r. Indeed, if  $S[e_i]$ denotes the coefficient of  $e_i$  of a sphere multivector then, provided that the sphere is normalized, i.e.,  $S[e_5] - S[e_4] = 1$ , we can extract the radius of r of S by evaluating

$$
r := \sqrt{S[e_1]^2 + S[e_2]^2 + S[e_3]^2 - 2(S[e_4] + S[e_5])},\tag{4}
$$

and its center  $x$  as it holds that

$$
x := (x_1, x_2, x_3) = (S[e_1], S[e_2], S[e_3]).
$$
\n
$$
(5)
$$

If the sphere  $S$  is not normalized, we can normalized it by dividing  $S$  with the quantity  $S[e_5] - S[e_4]$ . The extraction of x, r can also be done using GA operations (see eq. 4.75 in [29]).

## 5.4 A friendly Graphical User Interface for Multivector Manipulation

To further enhance GA adoption among Unity developers, we have developed a simple yet powerful Graphical User Interface (GUI) inspired by tools like Geogebra [1]. This GUI, streamlines the process of adding multivector objects such as lines, circles, and planes, while also enabling the creation of new objects through combinations (e.g., intersections or unions) of existing ones. Users can effortlessly add an object (along with its dual [12]), which is stored in multivector form and visualized using Unity. The object's coordinates can be edited in real-time, providing an additional educational layer as users gain a better understanding of the geometric properties associated with each coefficient.

Creating objects via intersections, joins, or meets of other objects allows users to grasp the geometric power inherent in CGA. For instance, users can define a line in CGA by joining two points or a circle by joining three points. Additionally, users have the option to deform objects or interpolate them between two poses, utilizing the methodologies described in Sections 3.3 and 5.2.

Regardless of their actions, the related multivectors are always displayed and stored, ready to be reused. We anticipate that this comprehensive approach will greatly enhance the accessibility of GA, providing an educational playground for GA within the familiar environment of an MGE like Unity.

# 6 Performance Evaluation in Networked Environments

	Objects Previous		$\vert$ Our $\vert$ Improvement $\vert$	Improvement: Ours VS
	Used   Method <sup>[18]</sup>  Method		$[18]$	$\vert$ Ours VS vectors & quaternions $\vert$
50	$1,33$ ms	$ 0.97 \text{ ms} $	$27\%$	$20\%$
100	$2.65$ ms	$ 1,00 \text{ ms} $	62%	26%
150	$3,90$ ms	$ 1,13 \text{ ms} $	71%	27\%
200	$5.27$ ms	$ 1.19 \text{ ms} $	77%	28%
250	$6.44$ ms	$ 2.62 \text{ ms} $	59%	25%

Table 2. (Columns 1-4) Performance comparison between our GA implementation and the previous GA implementation [18]. The metrics indicate the time required to perform the interpolation of a set of objects, each with varying cardinality. Our implementation demonstrates a performance boost of over 20% as the number of interpolated objects increases. Results were obtained using only CPU operations in a Windows 10, Intel Core i5-8500 3.00 GHz machine. (Column 5) Comparison performance of our method compared to typical pipeline using vectors for transformation and quaternions for rotations. The 16% increased performance demonstrated between the typical pipeline and the method proposed in [18] is further enhanced by the percentages in column 4. Notice that the performance boost was obtained by sending less information per objects per second in multivector form.

The previously proposed implementation for networked applications [18] required the creation of new multivectors at each interpolation state, leading to frequent memory allocations for 32-dimensional vectors, often occurring multiple times per second to generate frames. As transformation multivectors only use at most 16 floats, 16-dimensional arrays were used instead. However, even with this optimization, the memory allocation process posed a performance bottleneck, which we addressed by implementing a pooling mechanism approach. Table 2 illustrates that our approach resulted in an average decrease of more than 50% in the time required to perform the necessary interpolations for a set of objects with varying cardinality. It is evident that as more objects are interpolated, the performance gain becomes more pronounced, up to a certain point. This gain occurs for each user that receives and interpolates a multivector, as illustrated by User B in Figure 1. Notably, this gain is on top of the previously reported 16% benefit that occurred simply by replacing traditional with GA-based forms

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[18] and sending less transformation information per frame to achieve the same visual result. In conclusion, in networking collaborative applications, GA-Unity may provide an average improvement of more than 25% compared to traditional approaches, regarding runtime.

To assess the performance of the interpolation, we conducted the following steps. Initially, we determined the scene's initial frame rate. For example, if we measured 250 FPS, it implies that we required 4 (1000/250) milliseconds (ms) to execute the necessary operations for each frame. Subsequently, we evaluated the frame rate of the same scene while continuously interpolating a given number of cubes (50,100, 150, 200 or 250) over an average duration of 10 seconds. Again, we identified the required time to evaluate its frame using the recorded FPS. Finally, we computed the difference in time required for each frame, which represents the time needed to calculate the objects' interpolation.

As a final remark, the preliminary performance analysis presented aims to demonstrate the improvements over previous implementations, rather than offering a comprehensive benchmark of the tool, which falls outside the scope of this paper.

# 7 Case Studies and Applications

#### 7.1 Use Cases in Research Environments

MGEs such as Unity are commonly utilized in research settings to emulate complex environments, apply diverse physics laws, and simulate scenarios based on user-defined parameters. This widespread adoption stems from the need for realistic visualization of experiments and work, coupled with the ability to efficiently solve or approximate complex equation systems.

GA-Unity seamlessly integrates into such projects without apparent rendering performance. Moreover, it can complement various physics calculations, leveraging the effectiveness of GA in diverse scientific domains [15]. The ease of incorporating GA into Unity-based projects could further accelerate its adoption, making it more prevalent within the research community.

# 7.2 Using GA for game development & industrial large-scale projects

Visualization tools such as Ganja.js and CLUCalc offer representations of deformations or objects using Geometric Algebra (GA). However, these options lack the capability to visualize complex scenes realistically. They fall short in providing features like shadows, lighting options, or automatic object animation. Additionally, they struggle to scale up and integrate seamlessly into MGEs, limiting their usefulness in game development and/or large-scale projects tailored to industry demands.

GA-Unity addresses these limitations by enabling the integration of GA into production-ready applications and large-scale products, leveraging the extensive usage of Unity in their development. This package facilitates the swift adoption of multivector representation forms, thereby introducing GA to a rapidly expanding market, akin to the widespread adoption of quaternions in the past.

One of the key advantages of GA-Unity is its seamless integration with Unity's native support for animations. It replaces typically used transformation representation forms with GA equivalents, allowing for efficient interpolations. This transition is particularly beneficial in collaborative networked Virtual Reality (serious) games and applications, where constant exchange and interpolation of transformations among users are essential [18].

### 7.3 Educational Implementations

Unity is widely recognized for its use in undergraduate and graduate CG curricula worldwide. Typically, computer scientists in these courses are introduced to fundamental representation forms such as transformation matrices and quaternions. However, apart from a few exceptions [27, 26], they seldom delve deeper into advanced geometric forms like geometric algebra and/or dual-quaternions. One major reason for this gap is that the Unity platform used for development lacks native support for such forms, making it challenging, if not impossible, for students to understand and integrate GA seamlessly. GA-Unity addresses this limitation by enabling the early adoption of GA in CG educational curricula, thereby significantly impacting the proliferation of GA knowledge.

For example, using GA-Unity in a undergraduate CG course at University of Crete, students were able to easily perform a simple task of cube interpolation between two poses using GA, where they better understood the power of using alternative representation forms.

# 8 Conclusions, Future Work and Acknowledgements

The incorporation of Geometric Algebra (GA) into the Unity Game Engine via the open-source GA-Unity package, available at https://github.com/papagiannakis/GA-Unity, marks a significant milestone in the realm of CG and simulation.In the context of collaborative networked applications, utilizing GA for representing, exchanging, and interpolating transformation data offers advantages in both bandwidth utilization and runtime performance. In this study, we've showcased that runtime performance can be further enhanced from the previously reported 16% [18] to over 25%, while the bandwidth benefits remain consistent at an average of 50%. Furthermore, by designing GA-Unity to seamlessly integrate with the Unity pipeline and releasing it as an open-source tool, we aim to democratize GA for developers and help them explore the benefits of GA within the familiar environment of the Unity game engine.

In our future work, we aim to enhance performance by introducing GPU or parallel computations as well as incorporate production-ready C++ framework such as Klein. We will investigate the benefits of using various GA's such as 3D PGA or  $G_{6,3}$  as well as alternative interpolation techniques such as logarithmic 14 M. Kamarianakis, N. Lydatakis, G. Papagiannakis

multivector blending. Lastly, we envision adapting GA-Unity to various MGEs beyond Unity, such as  $Goodot<sup>3</sup>$  or even custom-made game engines.

This work is partially supported by the OMEN-E project (PFSA22-240), that have received funding from the Innosuisse Accelerator programme.

# References

- 1. GeoGebra the world's favorite, free math tools used by over 100 million students and teachers. https://www.geogebra.org
- 2. Versor: A (fast) c++ template library for euclidean, conformal, and arbitrary geometric algebras. https://wolftype.github.io/versor/devel/html/
- 3. Alves, R., Hildenbrand, D., Steinmetz, C., Uftring, P.: Efficient development of competitive mathematica solutions based on geometric algebra with gaalopweb. Advances in Applied Clifford Algebras 30, 1–18 (2020)
- 4. Aragon-Camarasa, G., Aragon-Gonzalez, G., Aragon, J., Rodriguez-Andrade, M.: Clifford algebra with mathematica. arXiv preprint arXiv:0810.2412 (2008)
- 5. Breuils, S., Nozick, V., Fuchs, L.: Garamon: a geometric algebra library generator. Advances in Applied Clifford Algebras 29, 1–41 (2019)
- 6. Buyuksalih, I., Bayburt, S., Buyuksalih, G., Baskaraca, A., Karim, H., Rahman, A.A.: 3d modelling and visualization based on the unity game engine–advantages and challenges. ISPRS Annals of the Photogrammetry, Remote Sensing and Spatial Information Sciences 4, 161–166 (2017)
- 7. De Keninck, S.: ganja.js (2020), https://zenodo.org/record/3635774
- 8. Dorst, L., Fontijne, D., Mann, S.: Geometric algebra for computer science (revised edition): An object-oriented approach to geometry. Morgan Kaufmann (2009)
- 9. Fontijne, D.: Gaigen 2: a geometric algebra implementation generator. In: Proceedings of the 5th international conference on Generative programming and component engineering. pp. 141–150 (2006)
- 10. Foxman, M.: United we stand: Platforms, tools and innovation with the unity game engine. Social Media+ Society 5(4), 2056305119880177 (2019)
- 11. Hadfield, H., Wieser, E., Arsenovic, A., Kern, R., The Pygae Team: pygae/clifford, https://doi.org/10.5281/zenodo.1453978
- 12. Hildenbrand, D., Perwass, C., Dorst, L., Fontijne, D.: Geometric algebra and its application to computer graphics. In: Eurographics (Tutorials) (2004)
- 13. Hildenbrand, D., Pitt, J., Koch, A.: Gaalop—high performance parallel computing based on conformal geometric algebra. Geometric Algebra Computing: in Engineering and Computer Science pp. 477–494 (2010)
- 14. Hildenbrand, D., Steinmetz, C., Tichỳ, R.: Gaalopweb for matlab: An easy to handle solution for industrial geometric algebra implementations. Advances in Applied Clifford Algebras 30, 1–18 (2020)
- 15. Hitzer, E., Kamarianakis, M., Papagiannakis, G., Vašík, P.: Survey of new applications of geometric algebra. Mathematical Methods in the Applied Sciences (2023)
- 16. Hitzer, E., Lavor, C., Hildenbrand, D.: Current survey of clifford geometric algebra applications. Mathematical Methods in the Applied Sciences  $47(3)$ , 1331–1361 (2024)
- 17. Jungherr, A., Schlarb, D.: The extended reach of game engine companies: How companies like epic games and unity technologies provide platforms for extended reality applications and the metaverse. Social Media  $+$  Society 8 (2022)

 $\overline{3}$  https://godotengine.org/

- 18. Kamarianakis, M., Chrysovergis, I., Lydatakis, N., Kentros, M., Papagiannakis, G.: Less is more: Efficient networked vr transformation handling using geometric algebra. Advances in Applied Clifford Algebras 33(1), 6 (2023)
- 19. Kamarianakis, M., Papagiannakis, G.: An all-in-one geometric algorithm for cutting, tearing, and drilling deformable models. Advances in Applied Clifford Algebras 31(3), 58 (2021)
- 20. Kamarianakis, M., Protopsaltis, A., Angelis, D., Tamiolakis, M., Papagiannakis, G.: Progressive Tearing and Cutting of Soft-bodies in High-performance Virtual Reality. In: Uchiyama, H., Normand, J.M. (eds.) ICAT-EGVE 2022 - International Conference on Artificial Reality and Telexistence and Eurographics Symposium on Virtual Environments. The Eurographics Association (2022). https://doi.org/10.2312/egve.20221275
- 21. Lounesto, P., Mikkola, R., Vierros, V.: Clical user manual: Complex number. Vector Space and Clifford Algebra Calculator for MS-DOS Personal Computers, Institute of Mathematics, Helsinki University of Technology (1987)
- 22. Mann, S., Dorst, L., Bouma, T.: The making of gable: A geometric algebra learning environment in matlab. Geometric Algebra with Applications in Science and Engineering pp. 491–511 (2001)
- 23. Ong, J.: Klein. http://https://www.jeremyong.com/klein/ (2020), [Online; accessed 07-May-2024]
- 24. Papaefthymiou, M., Hildenbrand, D., Papagiannakis, G.: An inclusive conformal geometric algebra gpu animation interpolation and deformation algorithm. The Visual Computer 32, 751 – 759 (2016)
- 25. Papagiannakis, G.: Geometric algebra rotors for skinned character animation blending. In: SIGGRAPH Asia 2013 Technical Briefs. SA '13, Association for Computing Machinery, New York, NY, USA (2013)
- 26. Papagiannakis, G., Kamarianakis, M., Protopsaltis, A., Angelis, D., Zikas, P.: Project Elements: A Computational Entity-component-system in a Scene-graph Pythonic Framework, for a Neural, Geometric Computer Graphics Curriculum. In: Eurographics 2023 - Education Papers. The Eurographics Association (2023)
- 27. Papagiannakis, G., Papanikolaou, P., Greassidou, E., Trahanias, P.E.: glga: an opengl geometric application framework for a modern, shader-based computer graphics curriculum. In: Eurographics (Education Papers). pp. 9–16 (2014)
- 28. Papagiannakis, G., Singh, G., Magnenat-Thalmann, N.: A survey of mobile and wireless technologies for augmented reality systems. Computer Animation and Virtual Worlds 19(1), 3–22 (2008)
- 29. Perwass, C.: Learning geometric algebra with clucalc. Geometric Algebra with Applications in Engineering pp. 25–48 (2009)
- 30. Roelfs, M.: Kingdon, https://github.com/tBuLi/kingdon
- 31. Ruan, J., Xie, D.: Networked vr: State of the art, solutions, and challenges. Electronics  $10(2)$ , 166 (2021)
- 32. Sangwine, S.J., Hitzer, E.: Clifford multivector toolbox (for matlab). Advances in Applied Clifford Algebras  $27(1)$ , 539–558 (2017)
- 33. Vince, J.: Geometric Algebra for Computer Graphics. Springer London, London (2008). https://doi.org/10.1007/978-1-84628-997-2
- 34. Zikas, P., Protopsaltis, A., Lydatakis, N., Kentros, M., Geronikolakis, S., Kateros, S., Kamarianakis, M., Evangelou, G., Filippidis, A., Grigoriou, E., Angelis, D., Tamiolakis, M., Dodis, M., Kokiadis, G., Petropoulos, J., Pateraki, M., Papagiannakis, G.: Mages 4.0: Accelerating the world's transition to vr training and democratizing the authoring of the medical metaverse. IEEE Computer Graphics and Applications 43(2), 43–56 (2023). https://doi.org/10.1109/MCG.2023.3242686