

Lecture 1: Basics of Geometric Algebra

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Contents: GA Course I, Session 1

- The **geometric product**: and how it relates to the **inner** and **outer** products.
- The mathematical framework: versors and multivectors; reversion; inversion; reflections and rotations .
- Rotations in more detail – the GA concept of a **rotor**.
- Reciprocal frames and how they are used.

The contents follow the notation and ordering of *Geometric Algebra for Physicists* [C.J.L. Doran and A.N. Lasenby] and the corresponding course the book was based on.

Notation

- We will see, as the course goes on, that we will be dealing with many sorts of **geometric objects**, not just **scalars** and **vectors**.
- Therefore, we will not, in general, use **bold** for vectors or any other objects (though sometimes there are exceptions).
- Use lower case roman letters for **vectors**, and generally lower case greek letters for **scalars**.

The Inner Product

To start with, let us assume a Euclidean space (all basis vectors square to +1). The **inner** or **dot** product between two vectors a and b is written as $a \cdot b$. If $a, b \neq 0$

$$a \cdot a = a^2 > 0 \quad \text{and} \quad b \cdot b = b^2 > 0$$

...the inner product can then be used to define the **angle** (θ) between a and b :

$$a \cdot b = |a||b| \cos \theta$$

In any space, we define an **inner product** via its basis vectors (for now assume they are orthogonal)

$$a \cdot b = a_i b_i$$

[repeated indices mean sum: \sum_i in this case]

The Cross Product

For two vectors a and b the cross product of the two is written as $a \times b$ and only exists in 3-d space.

$$a \times b = |a||b| \sin \theta \hat{n}$$

where \hat{n} is a unit vector perpendicular to the plane containing a and b .

For a **right handed** orthonormal set of basis vectors $\{e_1, e_2, e_3\}$, we have

$$e_3 = e_1 \times e_2, \quad e_2 = e_3 \times e_1, \quad e_1 = e_2 \times e_3$$

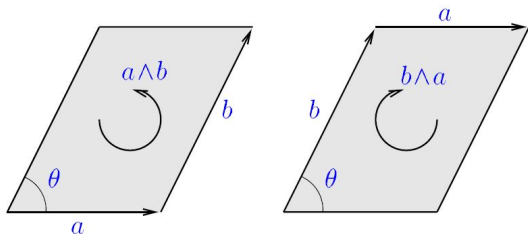
The Exterior, Outer or Wedge Product

The **cross product** fails in higher dimensions as there is no longer the concept of a unique **vector perpendicular to the plane**. It therefore seems sensible to geometrically encode **the plane itself**.

We write the **wedge** product between two vectors a and b as

$$a \wedge b$$

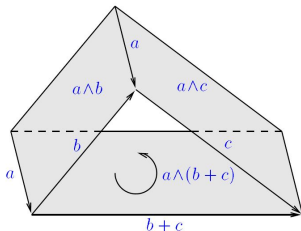
.....an **oriented plane** – we call this a **bivector**



Properties of the Wedge Product

- $a \wedge b = -b \wedge a$, so the product is **antisymmetric**.
- $a \wedge a = 0$ as there is no plane swept out.
- The wedge product is **distributive over addition**

$$a \wedge (b + c) = a \wedge b + a \wedge c$$



We will see how the wedge and cross products are connected (in 3d) later.

The Geometric Product

Clifford's amazing idea was to combine the **inner** and **outer** product into a new **geometric product**. For two vectors a and b , we write the geometric product as ab

$$ab = a \cdot b + a \wedge b$$

...the sum of a **scalar** and a **bivector**.

The **geometric product** is non-commutative since

$$ba = b \cdot a + b \wedge a \equiv a \cdot b - a \wedge b$$

...recall, **complex numbers** also involve the addition of two fundamentally different quantities.

Inner and Outer Products from the Geometric Product

Since $ab = a \cdot b + a \wedge b$ and $ba = a \cdot b - a \wedge b$, we can write

$$a \cdot b = \frac{1}{2} (ab + ba) \quad \{\text{symmetric}\}$$

and

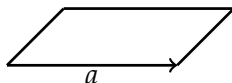
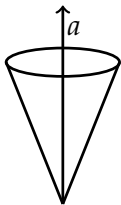
$$a \wedge b = \frac{1}{2} (ab - ba) \quad \{\text{antisymmetric}\}$$

In an **axiomatic** approach to GA, we can start with the **geometric** product and define the **inner** and **outer** products from this.

The Geometric Product is Invertible

Suppose we are given $c = a \cdot b$. If we are then given a , we cannot recover b uniquely.

Similarly, suppose we are given $c = a \wedge b$. If we are then given a , we cannot recover b uniquely.



However, suppose we are given $c = ab$. If we are then given a , we can recover b uniquely:

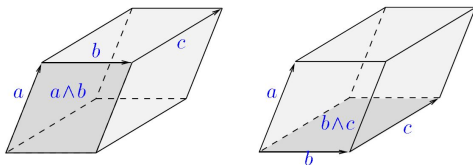
$$b = \frac{1}{a^2}ac$$

This **invertibility** is the key to much of the power of GA.

Higher Order Objects

In 2d, the highest order element we can have is a **plane** [or **bivector**].

In 3d, imagine sweeping a bivector $b \wedge c$ along a vector a to form a **volume**, $a \wedge (b \wedge c)$



..the same as sweeping bivector $a \wedge b$ along the vector c

Thus the volume or **trivector** formed is

$$a \wedge b \wedge c = (a \wedge b) \wedge c = a \wedge (b \wedge c)$$

An Algebra of Geometric Objects

In an n -d space, we therefore have scalars, vectors, bivectors, trivectors,....., n -vectors.

A general linear combination of these objects is called a multivector:

$$M = \langle M \rangle_0 + \langle M \rangle_1 + \langle M \rangle_2 + \dots \langle M \rangle_n$$

where we use the notation $\langle M \rangle_r$ to mean the r -vector part of the multivector M .

A product of vectors is called a versor:

$$a_1 a_2 a_3 \dots a_m$$

The highest grade object in a space, the n -vector, is unique up to scale - the 'unit' n -vector is called the Pseudoscalar and written as I_n .

Manipulating Multivectors

We can add, subtract and multiply multivectors using the **geometric product**.

Before we look more at this, we need to distinguish between an **r -vector** and an **r -blade**.

An **r -blade**, which we will call A_r , is something which can be written as the **wedge product of r vectors**:

$$A_r = a_1 \wedge a_2 \wedge \dots \wedge a_r$$

An **r -vector**, which we will call M_r , is something which can be written as a **linear combination of r blades**:

$$M_r = \alpha_1 A_{1r} + \alpha_2 A_{2r} + \dots + \alpha_m A_{mr}$$

Multiplying Multivectors

The **geometric product** is distributive over addition, so we can reduce the product of two multivectors to a sum of the **products of blades**, e.g.

$$P = a + (b \wedge c) \quad Q = d + (e \wedge f)$$

$$PQ = ad + a(e \wedge f) + (b \wedge c)d + (b \wedge c)(e \wedge f)$$

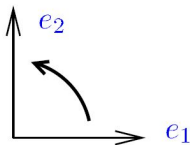
..note the order matters due to the **non-commutativity**.

Therefore, if we understand how to **multiply blades**, we can multiply multivectors.

The Geometric Algebra of 2d Euclidean Space

Consider a plane spanned by 2 orthonormal vectors e_1 , e_2 , such that

$$e_1^2 = e_2^2 = 1 \quad \text{and} \quad e_1 \cdot e_2 = 0$$



The **pseudoscalar** in this 2d algebra is the bivector $e_1 \wedge e_2$ – it is a **directed 'volume' element**.

We call this full algebra \mathcal{G}_2 (sometimes written as $\mathcal{G}_{(2,0,0)}$); it has $2^2 = 4$ elements:

$$\begin{array}{l} 1 \quad \{e_1, e_2\} \quad e_1 \wedge e_2 \\ 1 \text{ scalar} \quad 2 \text{ vectors} \quad 1 \text{ bivector} \end{array}$$

The Geometric Algebra of 2d Euclidean Space cont....

Note that, as $e_1 \cdot e_2 = 0$:

$$e_1 e_2 = e_1 \cdot e_2 + e_1 \wedge e_2 = e_1 \wedge e_2$$

and

$$e_2 e_1 = e_2 \cdot e_1 + e_2 \wedge e_1 = e_2 \wedge e_1 = -e_1 e_2$$

..an example of the property that **orthogonal vectors anticommute**.

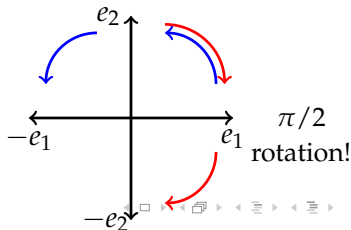
Now see what effect multiplying by $I_2 = e_1 \wedge e_2 = e_1 e_2$ has on vectors:

Left $(e_1 e_2) e_1 = -e_1 e_1 e_2 = -e_2$

$$(e_1 e_2) e_2 = e_1 e_2 e_2 = e_1$$

Right $e_1 (e_1 e_2) = e_1 e_1 e_2 = e_2$

$$e_2 (e_1 e_2) = -e_2 e_2 e_1 = -e_1$$



The Bivector $e_1 \wedge e_2$ in 2d

Note:

$$I_2^2 = (e_1 e_2)(e_1 e_2) = -e_1 e_2 e_2 e_1 = -1$$

We therefore have a **real** object, the *unit* bivector, that:

- rotates by **90° clockwise** via **left multiplication**
- rotates by **90° anticlockwise** via **right multiplication**
- **squares to -1**

Complex Numbers and the the 2d Geometric Algebra

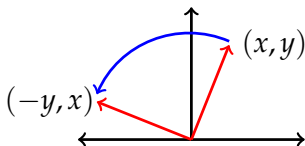
Recall that the **unit imaginary**, i , of complex numbers, **squares to -1** and **performs 90° rotations** of points in the Argand plane

$$i(x + iy) = -y + ix \quad \text{so that} \quad (x, y) \longrightarrow (-y, x)$$

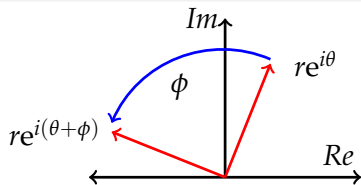
So, in \mathcal{G}_2 , our position vector is $p = xe_1 + ye_2$ which we can write as:

$$p = e_1(x + e_1e_2y) = e_1(x + I_2y) \quad \implies \quad e_1p = x + I_2y$$

So multiplication on the left by e_1 [which picks out the **real axis**] maps our position vector onto something which is analogous to the complex numbers!



Rotations in 2d



To **rotate** a complex number $Z = re^{i\theta}$ anticlockwise through an angle ϕ in the Argand plane we take

$$Z = re^{i\theta} \longrightarrow Z' = re^{i(\theta+\phi)} = e^{i\phi}Z$$

Now look at analogously taking $p = e_1Z \rightarrow e_1Z'$

$$p' = e_1e^{i\phi}Z = e^{-I\phi}e_1Z = e^{-I\phi}p$$

since I anticommutes with vectors [Exercise]. Giving us

$$p' = e^{-I\phi}p \equiv pe^{I\phi} \equiv e^{-I\phi/2}pe^{I\phi/2}$$

We will see that this final form is the most **general** – ie extends to higher dimensions.

The Geometric Algebra of 3d Euclidean Space

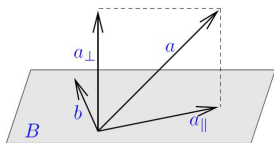
Now let our orthonormal basis vectors be e_1, e_2, e_3 . Our 3d geometric algebra, \mathcal{G}_3 , now has $2^3 = 8$ elements (with $i, j = 1, 2, 3, i \neq j$):

$$\begin{array}{cccc} 1 & \{e_i\} & \{e_i \wedge e_j\} & e_1 \wedge e_2 \wedge e_3 \\ 1 \text{ scalar} & 3 \text{ vectors} & 3 \text{ bivectors} & 1 \text{ trivector} \end{array}$$

The sizes of the sets of elements are given by the **binomial coefficients**.

Vectors and Bivectors in 3d

Basis bivectors are $\{e_1e_2, e_2e_3, e_3e_1\}$ – all square to -1 and generate 90° rotations in their plane.



Now consider the product aB , with a a vector and B a bivector.

$$aB = (a_{\perp} + a_{\parallel})B$$

Now write $B = a_{\parallel} \wedge b$, with b in the B plane and orthogonal to a_{\parallel} , so that

$$a_{\parallel}B = a_{\parallel}(a_{\parallel} \wedge b) = a_{\parallel}(a_{\parallel}b) = a_{\parallel}^2b$$

$$a_{\perp}B = a_{\perp}(a_{\parallel} \wedge b) = a_{\perp} \wedge a_{\parallel} \wedge b$$

Vectors and Bivectors in 3d cont....

...we can write this as

$$aB = a \cdot B + a \wedge B$$

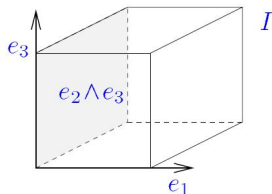
with **dot** and **wedge** now meaning the **lowest** and **highest** grade parts of the geometric product.

We therefore see that $a \cdot B$ projects onto the components of a in the plane, rotates by 90° and dilates by $|B|$.

..and that $a \wedge B$ projects onto the perpendicular component of a and forms a trivector.

The Pseudoscalar in 3d

The highest grade element is $I_3 = e_1 e_2 e_3$ [right handed set] – let us just use I here. It is easy to show that $I^2 = -1$.



Now take $e_i I$:

$$e_1 I = e_1 e_1 e_2 e_3 = e_2 e_3$$

Similarly, $e_2 I = e_3 e_1$, $e_3 I = e_1 e_2$.

This is an example of a **duality** transformation: multiplication by I maps an r -vector onto an $(n - r)$ -vector [here $r = 1$, $n = 3$].

Check that I commutes with all elements of our 3d algebra.

Cross Product vs Wedge Product

We are now able to see the connection between $a \times b$ and $a \wedge b$. Consider the product of a **basis bivector** and the **3d pseudoscalar, I** , eg

$$I(e_1 \wedge e_2) = e_1 e_2 e_3 e_1 e_2 = -e_3$$

...ie **minus the vector perpendicular to the $e_1 \wedge e_2$ plane.**

We can easily generalise this to give:

$$a \times b = -I(a \wedge b)$$

We can see, therefore, that the conventional concept of **axial vector or pseudovector** is encoding the fact that you are actually dealing with a **bivector**.

Reversion

Reversion is an important operation – it reverses the order of vectors in any product.

We denote the reverse of A via a tilde, eg \tilde{A} .

While this operation can be performed in an algebra of any dimension, in 3d we have

$$(e_1e_2)^\sim = e_2e_1 = -e_1e_2$$

$$\tilde{I} = (e_1e_2e_3)^\sim = e_3e_2e_1 = -e_1e_2e_3 = -I$$

Since **scalars** and **vectors** remain unchanged under reversion, we have, for a general 3d multivector M

$$M = \alpha + a + B + \beta I$$

$$\tilde{M} = \alpha + a - B - \beta I$$

Rotations in 3d

We would like a 3d version of the rotation formulae in the plane (recall that **Hamilton** spent many years of his life looking for such a thing – he finally came up with the **quaternions!**).

Recall that to rotate a 2d vector a through θ in the e_1e_2 plane to a' , we take (double-sided form shown)

$$a' = e^{-e_1e_2\theta/2} a e^{e_1e_2\theta/2}$$

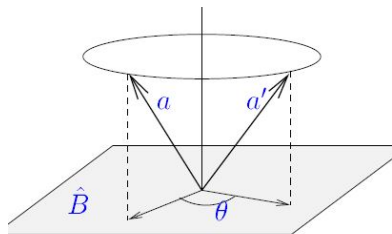
..in 3d, this works for any a in the e_1e_2 plane and additionally leaves e_3 unchanged.

Note: e_3 commutes with $e^{-e_1e_2\theta/2}$

[Exercise]

This is why we need the two-sided formula.

Rotations in 3d cont....



Let us now rotate a general vector a through θ in the \hat{B} plane (such that $\hat{B}^2 = -1$). First let $a = a_{\parallel} + a_{\perp}$:

$$e^{-\hat{B}\theta/2} (a_{\parallel} + a_{\perp}) e^{\hat{B}\theta/2} = a'_{\parallel} + a_{\perp} = a'$$

Let $R = e^{-\hat{B}\theta/2}$, then we can write our **3d rotation** as

$$a' = Ra\tilde{R}$$

We call this **exponentiation of a bivector**, a **rotor**.

Note: $R\tilde{R} = e^{-\hat{B}\theta/2} e^{\hat{B}\theta/2} = 1$

Rotors in 3d

A **rotor** is the exponential of a bivector and rotates vectors via a double-sided formula:

$$a' = Ra\tilde{R}$$

In 3d $R = e^{-\hat{B}\theta/2}$ is a scalar + bivector:

$$e^{-\hat{B}\theta/2} = \cos \frac{\theta}{2} - \sin \frac{\theta}{2} \hat{B}$$

Can we also rotate **bivectors(planes)** in a similar way? Let $B = a \wedge b$

$$\begin{aligned} B' &= a' \wedge b' = Ra\tilde{R} \wedge Rb\tilde{R} \\ &= \frac{1}{2} (Ra\tilde{R}Rb\tilde{R} - Rb\tilde{R}Ra\tilde{R}) \\ &= \frac{1}{2} R(ab - ba)\tilde{R} = R(a \wedge b)\tilde{R} \end{aligned}$$

In fact, we can rotate any multivector via **this formula!**

Rotors in Euclidean GAs

In fact, this formula of

Rotor = exponential of bivector

performs rotations in any dimension and of any object in the algebra.

We will see in future sessions, that if we do not have a euclidean space, these rotors always form transformations of a fundamental nature.

Much of the power of GA lies in its ability to nicely deal with rotations.

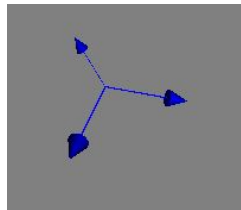
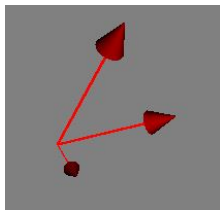
Reciprocal Frames

Many problems in mathematics, physics and engineering require a treatment of **non-orthonormal frames**.

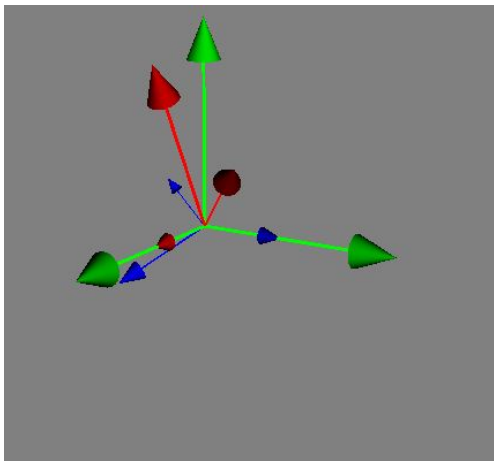
Take a set of n **linearly independent** vectors $\{f_k\}$; these are not necessarily orthogonal nor of unit length.

Can we find a second set of vectors (in the same space), call these $\{f^k\}$, such that

$$f^i \cdot f_j = \delta_j^i$$



Reciprocal Frames



Reciprocal Frames cont....

We call such a frame a **reciprocal frame**. Note that since any vector a can be written as $a = a^k f_k \equiv \sum a^k f_k$ (ie we are adopting the convention that **repeated indices are summed over**), we have

$$f^k \cdot a = f^k \cdot (a^j f_j) = a^j (f^k \cdot f_j) = a^j \delta_j^k = a^k$$

Similarly, since we can also write $a = a_k f^k \equiv \sum a_k f^k$

$$f_k \cdot a = f_k \cdot (a_j f^j) = a_j (f_k \cdot f^j) = a_j \delta_k^j = a_k$$

Thus we can recover the components of a given vector in a similar way to that used for orthonormal frames.

So how do we find a **reciprocal frame**?

Finding a Reciprocal Frame

To illustrate the process, we will find the reciprocal frame in 3d for a non-orthonormal set of basis vectors $\{f_1, f_2, f_3\}$.

Consider the quantity $f^1 = \alpha(f_2 \wedge f_3)I$:

$$f_1 \cdot f^1 = \alpha f_1 \cdot (f_2 \wedge f_3 I) = \alpha (f_1 \wedge f_2 \wedge f_3) I = \alpha E_3 I$$

(this uses a useful GA relation $a \cdot (BI) = (a \wedge B)I$) where

$$E_3 = f_1 \wedge f_2 \wedge f_3$$

Since $E_3 = \beta I$, we see that $\alpha = -1/\beta$, with $E_3^2 = -\beta^2$:

$$f^1 = -\frac{1}{|E_3|} (f_2 \wedge f_3) I$$

and similarly for f^2, f^3 .

Example: Recovering a Rotor in 3-d

As an example of using **reciprocal frames**, consider the problem of recovering the **rotor** which rotates between two 3-d non-orthonormal frames $\{f_k\}$ and $\{f'_k\}$, ie find R such that

$$f'_k = R f_k \tilde{R}$$

It is not too hard to show that R can be written as

$$R = \beta(1 + f'_k f^k)$$

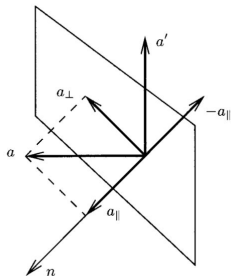
where the constant β ensures that $R\tilde{R} = 1$.

A **very easy way** of recovering rotations.

Reflections

Take a vector a and a unit vector n ($n^2 = 1$) – to resolve a into parts perpendicular and parallel to n we do the following:

$$\begin{aligned} a &= n^2 a = n(na) = n(n \cdot a + n \wedge a) \\ &= (n \cdot a)n + n(n \wedge a) \equiv a_{\parallel} + a_{\perp} \end{aligned}$$



If we reflect a in the plane orthogonal to n we get a' given by

$$\begin{aligned} a' &= a_{\perp} - a_{\parallel} \\ &= -n(a \wedge n) - (a \cdot n)n \\ &= -n(a \cdot n + a \wedge n) = -nan \end{aligned}$$

$a' = -nan$ is a very compact formula, afforded by the **geometric product**. We will see later that **sandwiching** like this is a very general formula for **reflecting one object in another**.

Generalising the Geometric Product

It can be shown (in a more general treatment) that the geometric product of an r -blade, A_r and an s -blade, B_s is given by:

$$A_r B_s = \langle A_r B_s \rangle_{|r-s|} + \langle A_r B_s \rangle_{|r-s|+2} + \dots + \langle A_r B_s \rangle_{r+s}$$

We then use the **dot** and **wedge** to mean the **lowest** and **highest** grades terms in this expansion:

$$\begin{aligned} A_r \cdot B_s &= \langle A_r B_s \rangle_{|r-s|} \\ A_r \wedge B_s &= \langle A_r B_s \rangle_{r+s} \end{aligned}$$

Using the above, can make many identities very easy to prove.

Geometric Algebra on Azure Notebooks

- ① Sign up for an **Azure Notebook account** if you don't have one (note, sometimes it does not like it if you logon with an institutional email, if your institution already has accounts with Azure – I sign on with gmail).
- ② go to <https://notebooks.azure.com/hugohadfield/libraries/azure-clifford> and 'clone' the azure-clifford library (there is a 'clone' button).
- ③ go back to your Azure page and you should now see the azure-clifford library. Open [clifford_example.ipynb](#)
- ④ try running these examples.
- ⑤ these notebooks use the clifford package – for info on syntax, conventions etc, see

<https://clifford.readthedocs.io/en/latest/index.html>

Exercises 1

- ① Set up two vectors a, b , form $c = a \times b$, the cross product. Now form $B = a \wedge b$ and its dual IB , and show that $c = -IB$.
- ② Consider the bivector $B = a \wedge b$. By writing

$$a \wedge b = ab - a \cdot b \quad \text{and} \quad a \wedge b = -b \wedge a = -(ba - b \cdot a)$$

show that B^2 is always positive.

- ③ For $\{f_1, f_2, f_3\} = \{e_1, e_1 + 2e_3, e_1 + e_2 + e_3\}$ show, using the given formulae, that the reciprocal frame is given by

$$\{f^1, f^2, f^3\} = \left\{ e_1 - \frac{1}{2}(e_2 + e_3), \frac{1}{2}(e_3 - e_2), e_2 \right\}$$

Exercises 2

- ① The **quaternion algebra** of Hamilton (1805-1865) has three 'unit imaginaries', i, j, k , which satisfy the following equations:

$$i^2 = j^2 = k^2 = -1 \quad \text{and} \quad ijk = -1$$

Show that if we equate the quaternion imaginaries with unit bivectors as follows:

$$i = e_2e_3 \quad j = -e_3e_1 \quad k = e_1e_2$$

the above relations are satisfied.

- ② Using the Taylor expansion, show that a rotor of the form $R = e^{\hat{B}\theta/2}$ (where \hat{B} is a bivector which squares to -1) can be written as

$$R = \cos \theta/2 + \hat{B} \sin \theta/2$$

Exercises 3

- ① By considering the fact that any bivectors in 3d which are not the same, must have a common line of intersection, show that **all bivectors in 3d are blades**.
- ② In a **4d Euclidean space**, give an example of a bivector which **cannot be written as a blade**.
- ③ We define the exponentiation of a multivector via its Taylor series and the geometric product, ie

$$e^M = 1 + \frac{M}{1!} + \frac{M^2}{2!} + \dots$$

Using this, verify the 2d identity used earlier,
 $e_1 e^{I\phi} = e^{-I\phi} e_1$

Exercises 4

- ① Show that $a \cdot (BI) = (a \wedge B)I$, with a a vector and B a bivector.
- ② Now show that $A_r \cdot (B_s I) = (A_r \wedge B_s)I$.

[Hint: make use of the fact that $A_r \cdot (B_s I_n) = \langle A_r B_s I_n \rangle_{|r-(n-s)|}$].