

Lecture 2

Math 178
Nonlinear Data Analytics
Prof. Weiqing Gu

Overview of Lecture 2

- Intro to UAV's data, cell phone's data, and other robotic data
- Their common mathematical representations
- The set of rotations and translations and the set of rigid motions
- Euler angles
- Unit Quaternions

Examples of UAV data

Often you need to remove the metadata before your algorithms access the data

Metadata is "data [information] that provides information about other data".

baro_...inHG	edens_...part	vacuum_...ratio	vacuum_...ratio	_elec_...ratio	_elec_...ratio	_AHRS_...ratio	_AHRS_...ratio
_elev,yoke1	ailrn,yoke1	ruddr,yoke1	_vect_...rst	sweep_...rst	incid_...rst	dihed_...rst	retra_...rst
water,jetts	_elev,astab	ailrn,astab	ruddr,astab	_elev_...surf	ailrn_...surf	ruddr_...surf	rwheel,steer
sweep,1,deg	sweep,2,deg	sweep,h,deg	_vect_...ratio	sweep,ratio	incid,ratio	dihed,ratio	retra,ratio
_trim,_elev	_trim,ailrn	_trim,ruddr	_flap,handl	_flap,postn	_slat,ratio	sbrok,handl	sbrok,postn
gear,.../1	wbrak...part	lbrak_...part	rbrak_...part	___M,ftlb	___L,ftlb	___N,ftlb	___Q,rad/s
____P,rad/s	____R,rad/s	pitch,...deg	roll,...deg	hdng,...true	hdng,...mag	alpha,...deg	beta,...deg
hpath_...deg	vpath_...deg	_slip,...deg	_mag,...comp	avar,...deg	_lat,...deg	_lon,...deg	_alt,ftasl
__alt,ftogl	__on,runwy	__alt,...ind	__lat,south	__lon,west	__X,...N	__Y,...N	__Z,...N
__vx,...m/s	__vy,...m/s	__vz,...m/s	_dist,...ft	_dist,...nm	lat_1,...deg	lat_2,...deg	lat_3,...deg
lat_4,...deg	lat_5,...deg	lat_6,...deg	lat_7,...deg	lat_8,...deg	lon_1,...deg	lon_2,...deg	lon_3,...deg
lon_4,...deg	lon_5,...deg	lon_6,...deg	lon_7,...deg	lon_8,...deg	alt_1,ftasl	alt_2,ftasl	alt_3,ftasl
alt_4,ftasl	alt_5,ftasl	alt_6,ftasl	alt_7,ftasl	alt_8,ftasl	throi,...part	throi,...part	model1,...0123
prop1,...set	mixti,ratio	heati,ratio	cowl1,...set	igni1,...set	stari,...sec	power,...1,hp	thrust,...1,lb
tra_1,ftlb	rpm_1,engin	rpm_1,...prop	ptchi,...deg	pwash,...kt	N1_1,...pcnt	N2_1,...pcnt	MP_1,...inhp
FF_1,...lb/h	ITT_1,...deg	EGT_1,...deg	CHT_1,...deg	OILP1,...psi	OILT1,...deg	FUEP1,...psi	genri,...omp
batti,...omp	batti,...volt	pumpi,.../1	idlei,.../1	batti,.../1	genri,.../1	invri,.../1	fadec,.../1
igni,.../1	_fuel,...1,lb	_fuel,...2,lb	_fuel,...3,lb	_fuel,...4,lb	_fuel,...5,lb	_fuel,...6,lb	_fuel,...7,lb
_fuel,...8,lb	empty,...lb	pgyld,...lb	_fuel,totlb	jetti,...lb	currnt,...lb	maxim,...lb	__cg,ftref
_lift,...lb	_drag,...lb	_side,...lb	norml,...lb	axial,...lb	_side,...lb	_gear,...lb	_gear,...lb
_gear,...lb	_gear,...rat	_gear,...rat	_gear,...rat	__L/D,ratio	__cl,total	__cd,total	__L/D,*etaP
Peff1,ratio							
54.98465	75.11517	0.81621	0.00000	1.00000	1.00000	0.14571	0.81331
0.81331	0.00000	1.19388	17.19388	399.54227	0.00000	0.00000	
0.00000	0.00000	0.00000	0.00000	1643516.00000	0.00000	-49.53482	0.36138
0.37173	0.36138	-57.00274	0.42778	0.41587	0.00055	0.00000	2.41929
-0.00000	0.00000	38.15301	25.28321	0.00707	36.05242	0.00041	0.00000
0.00000	29.87655	23.21489	23.21488	0.94585	670.77869	0.00044	32.14358
29.92000	0.94585	0.81343	0.81343	0.00000	0.00000	1.00000	1.00000
a_pappa	a_pappa	a_pappa	a_pappa	a_pappa	a_pappa	a_pappa	a_pappa

You may describe the data in a separate file, as in the H-MOG data.

Auto car data and other similar data



Auto car or auto vehicle data also contains accelerometer data and gyroscope data. They may name differently.



Vehicle Data

Deprecated, see [explanation](#)

Final Business Group Report 24 November 2014

Editors:

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Abstract

This specification defines a standard for Vehicle Data which might be available in a vehicle. It is designed to be used in conjunction with the [Vehicle API Specification](#).

https://www.w3.org/2014/automotive/data_spec.html

This link contains codes for analyzing auto vehicle data.

Examples of Cell phone data:

Left: one user's accelerometer data

Right: the same user's gyroscope data

	x	y	z	timestamp
0	-1.8520508	3.9649048	9.772293	1.5076E+15
1	-0.8470612	4.6779633	7.757538	1.5076E+15
2	-1.2873383	4.821533	5.6781616	1.5076E+15
3	-2.280365	3.7495575	6.2285156	1.5076E+15
4	-3.0149536	3.4695892	9.791428	1.5076E+15
5	-1.9214325	3.6969147	12.045471	1.5076E+15
6	-0.8566284	3.5437775	12.196213	1.5076E+15
7	-1.3184509	3.728012	10.87059	1.5076E+15
8	-1.9405823	3.620346	8.992233	1.5076E+15
9	-2.0626068	3.373886	7.1186523	1.5076E+15
10	-1.9788666	3.653839	7.154541	1.5076E+15
11	-1.3184509	4.2113647	8.571091	1.5076E+15
12	0.11245728	4.450653	9.085556	1.5076E+15
13	2.7924194	2.1248322	8.140381	1.5076E+15
14	0.4355011	3.8045807	7.7192535	1.5076E+15
15	0.08613586	3.952942	7.8556366	1.5076E+15
16	0.11724854	3.912262	8.444275	1.5076E+15
17	-0.0191498	3.9792633	8.528015	1.5076E+15
18	-0.8949127	3.8811646	9.114258	1.5076E+15
19	-1.524231	3.969696	8.951553	1.5076E+15
20	-1.6725769	4.3980103	8.2456665	1.5076E+15
21	-1.5649109	4.8430786	7.6905365	1.5076E+15
22	-1.0887299	5.027313	7.9369965	1.5076E+15
23	-1.7324066	4.8717804	9.114258	1.5076E+15
24	-1.6462555	4.689926	9.511475	1.5076E+15
25	-1.1868439	4.7401886	9.109482	1.5076E+15

	x	y	z	timestamp
0	0.11390603	-0.1478937	-0.941989	1.5089E+12
1	0.11016844	-0.186758	-0.955114	1.5089E+12
2	0.08951247	-0.1771261	-0.9596861	1.5089E+12
3	0.06113922	-0.1548789	-0.9596196	1.5089E+12
4	0.03615296	-0.1389114	-0.956291	1.5089E+12
5	0.0223047	-0.1385345	-0.9565526	1.5089E+12
6	0.01718072	-0.1503342	-0.9618695	1.5089E+12
7	0.01438952	-0.1642485	-0.9647654	1.5089E+12
8	0.01408425	-0.1700877	-0.9647263	1.5089E+12
9	0.0183536	-0.1697293	-0.965854	1.5089E+12
10	0.02105704	-0.1659252	-0.9672645	1.5089E+12
11	0.01959361	-0.1644334	-0.9668481	1.5089E+12
12	0.01783217	-0.1635982	-0.9665674	1.5089E+12
13	0.01781886	-0.1601314	-0.967697	1.5089E+12
14	0.0195245	-0.1543056	-0.9690824	1.5089E+12
15	0.02081427	-0.1493792	-0.9692894	1.5089E+12
16	0.01884452	-0.1496343	-0.9684128	1.5089E+12
17	0.01422125	-0.1514588	-0.9677539	1.5089E+12
18	0.00634989	-0.1518705	-0.9686434	1.5089E+12
19	-0.0004003	-0.1499035	-0.9693387	1.5089E+12
20	-0.0052467	-0.1497015	-0.9687631	1.5089E+12
21	-0.0053686	-0.1510176	-0.9682288	1.5089E+12
22	-0.0012975	-0.1540584	-0.9681965	1.5089E+12
23	0.00321152	-0.1593155	-0.968185	1.5089E+12
24	0.00429164	-0.1659338	-0.9681739	1.5089E+12
25	0.00188042	-0.171566	-0.9689082	1.5089E+12
26	-0.0005783	-0.1726523	-0.9708517	1.5089E+12

Key: How to find data characteristics for each user?

New geometric techniques to find characteristics of Multi-V time series

- First kind of characteristics:
- **Curvature and Torsion**
 - The trick here is that theoretic differential geometry uses continuous and differential curves parametrized by arclength to derive curvature and torsion.
 - One needs to cleverly apply them to discrete data.
 - One way to do it is to do a curve fitting. But the curves one obtains may not be parametrized by arclength.
 - Reparametrizing the curves to arclength usually is too expensive to do.
- **How to over come the challenges?**

Powerful Multi-V Time Series Features: **Curvature and Torsion Chararistics**

- What if a curve is not parametrized by arclength, how to find curvature and torsion?

The curvature of α at $t \in I$ is

$$k(t) = \frac{|\alpha' \wedge \alpha''|}{|\alpha'|^3}.$$

The torsion of α at $t \in I$ is

$$\tau(t) = -\frac{(\alpha' \wedge \alpha'') \cdot \alpha'''}{|\alpha' \wedge \alpha''|^2}.$$

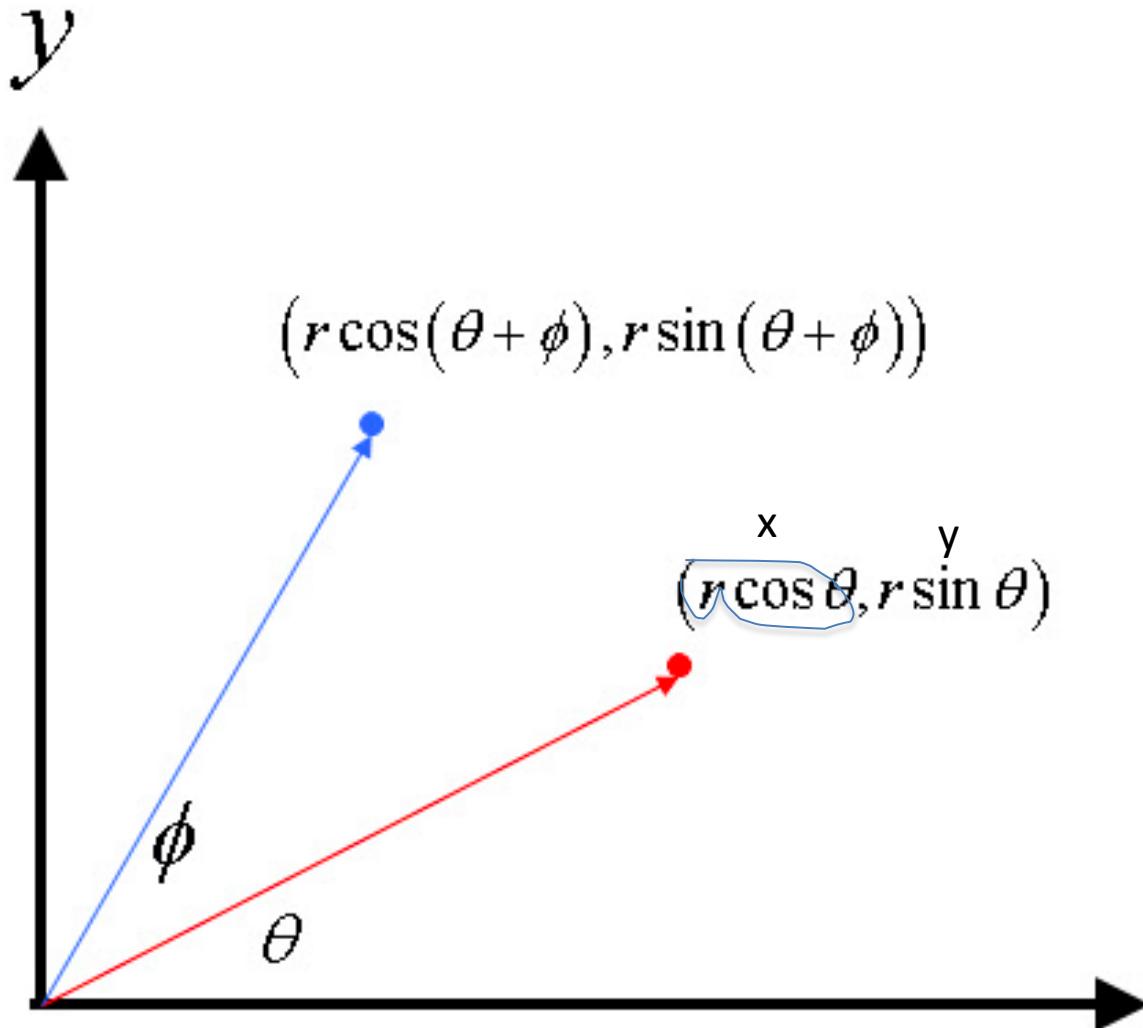
Recall: Rotation is a linear map.
What is the matrix representation of this map?
Why?

2D Rotations

$$R(\theta) = \begin{bmatrix} \cos \theta & -\sin \theta \\ \sin \theta & \cos \theta \end{bmatrix}$$

Could you imagine the math expression of the following figure someone described to you?

2D Rotations



What are some of the properties of a rotation matrix?

- 1.
- 2.
- ...

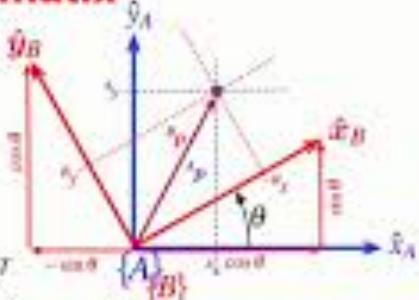
What are some of the properties of a rotation matrix?

- 1.
- 2.
- ...

Properties of the rotation matrix

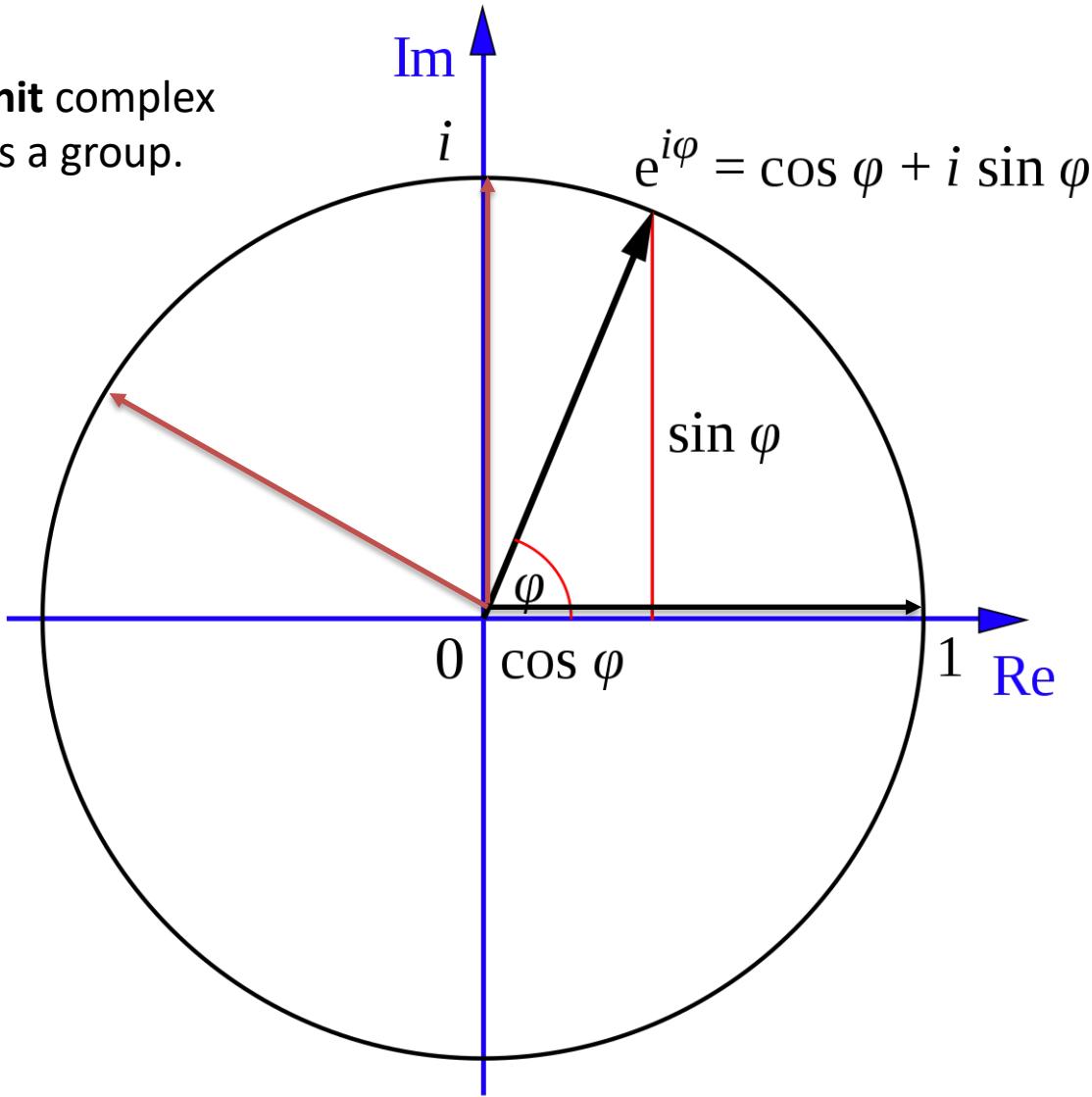
$${}^A\mathbf{R}_B = \begin{pmatrix} \cos \theta & -\sin \theta \\ \sin \theta & \cos \theta \end{pmatrix}$$

- An orthogonal (orthonormal) matrix
- Each column is a unit length vector
- Each column is orthogonal to all other columns
- The inverse is the same as the transpose $\mathbf{R}^{-1} = \mathbf{R}^T$
- The determinant is +1 $\det(\mathbf{R}) = 1$
 - the length of a vector is unchanged by rotation
- Rotation matrices belong to the Special Orthogonal group of dimension 2 $\mathbf{R} \in SO(2)$



Euler's Formula

Claim: the set of **unit** complex Numbers (S^1) forms a group.



What is a group?

Definition [edit]

A group is a [set](#), G , together with an [operation](#) \cdot (called the *group law* of G) that combines any two [elements](#) a and b to form another element, denoted $a \cdot b$ or ab . To qualify as a group, the set and operation, (G, \cdot) , must satisfy four requirements known as the *group axioms*:^[5]

Closure

For all a, b in G , the result of the operation, $a \cdot b$, is also in G .^[b]

Associativity

For all a, b and c in G , $(a \cdot b) \cdot c = a \cdot (b \cdot c)$.

Identity element

There exists an element e in G such that, for every element a in G , the equation $e \cdot a = a \cdot e = a$ holds. Such an element is unique ([see below](#)), and thus one speaks of *the* identity element.

Inverse element

For each a in G , there exists an element b in G , commonly denoted a^{-1} (or $-a$, if the operation is denoted "+"), such that $a \cdot b = b \cdot a = e$, where e is the identity element.

The axioms for a group are short and natural... Yet somehow hidden behind these axioms is the [monster simple group](#), a huge and extraordinary mathematical object, which appears to rely on numerous bizarre coincidences to exist. The axioms for groups give no obvious hint that anything like this exists.

[Richard Borcherds](#) in *Mathematicians: An Outer View of the Inner World*^[4]

3D Rotations

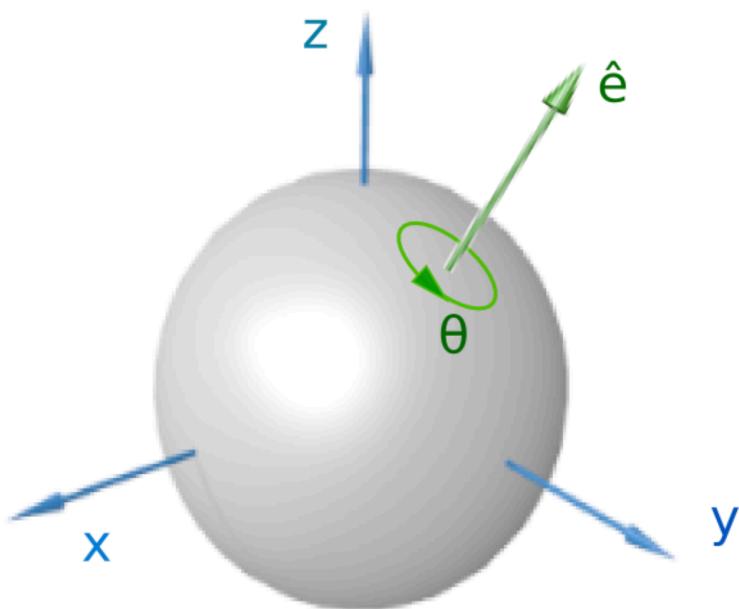
General rotations in three-dimensional space can be decomposed into three rotations about the three axes.

$$R = R_z(\alpha) R_y(\beta) R_x(\gamma)$$

$$= \begin{bmatrix} \cos \alpha \cos \beta & \cos \alpha \sin \beta \sin \gamma - \sin \alpha \cos \gamma & \cos \alpha \sin \beta \cos \gamma + \sin \alpha \sin \gamma \\ \sin \alpha \cos \beta & \sin \alpha \sin \beta \sin \gamma + \cos \alpha \cos \gamma & \sin \alpha \sin \beta \cos \gamma - \cos \alpha \sin \gamma \\ -\sin \beta & \cos \beta \sin \gamma & \cos \beta \cos \gamma \end{bmatrix}$$

Key: Euler's Rotation Theorem

Euler's rotation theorem states that, in three-dimensional space, any displacement of a rigid body such that a point on the rigid body remains fixed, is equivalent to a single rotation about some axis that runs through the fixed point.

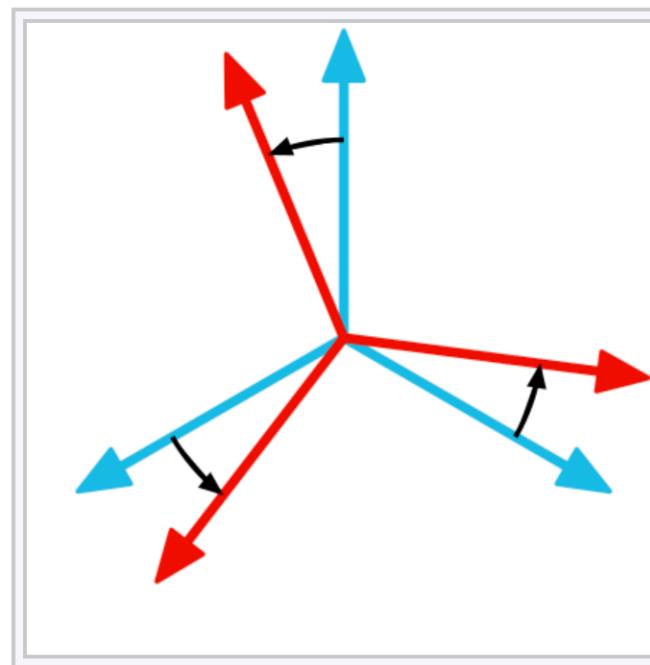


A rotation represented by an Euler axis and angle.

A **rigid body** (also known as a **rigid object** [2]) is a solid body in which deformation is zero or so small it can be neglected. The distance between any two given points on a rigid body remains constant in time regardless of external forces exerted on it. A rigid body is usually considered as a continuous distribution of mass.



The position of a rigid body is determined by the position of its center of mass and by its **attitude** (at least six parameters in total).^[1]



Changing orientation of a **rigid body** is the same as **rotating** the axes of a **reference frame** attached to it.

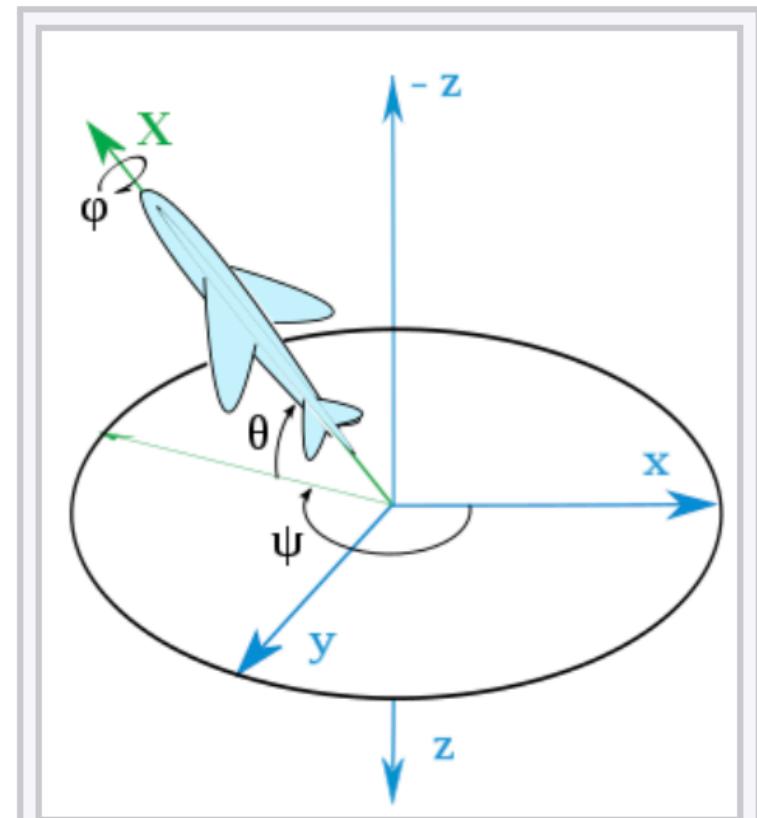
3D Rotations about Axis and Angle

The matrix of a proper rotation R by angle θ around the axis $\mathbf{u} = (u_x, u_y, u_z)$, a unit vector with $u_x^2 + u_y^2 + u_z^2 = 1$, is given by

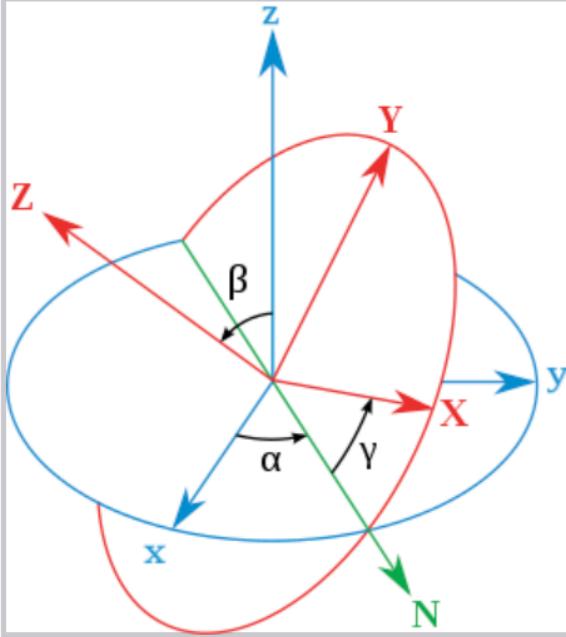
$$R = \begin{bmatrix} \cos \theta + u_x^2 (1 - \cos \theta) & u_x u_y (1 - \cos \theta) - u_z \sin \theta & u_x u_z (1 - \cos \theta) + u_y \sin \theta \\ u_y u_x (1 - \cos \theta) + u_z \sin \theta & \cos \theta + u_y^2 (1 - \cos \theta) & u_y u_z (1 - \cos \theta) - u_x \sin \theta \\ u_z u_x (1 - \cos \theta) - u_y \sin \theta & u_z u_y (1 - \cos \theta) + u_x \sin \theta & \cos \theta + u_z^2 (1 - \cos \theta) \end{bmatrix}$$

Attitude of a rigid body

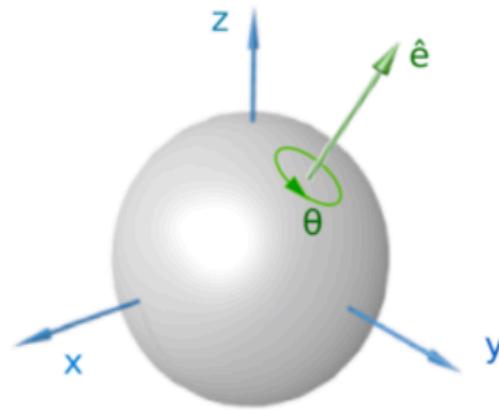
- The attitude of a rigid body is its orientation as described, for example, by the orientation of a frame fixed in the body relative to a fixed reference frame. The attitude is described by *attitude coordinates*, and consists of at least three coordinates.^[6] One scheme for orienting a rigid body is based upon body-axes rotation; successive rotations three times about the axes of the body's fixed reference frame, thereby establishing the body's Euler angles. Another is based upon roll, pitch and yaw,^[9] although these terms also refer to incremental deviations from the nominal attitude.



The orientation of a rigid body is determined by three angles



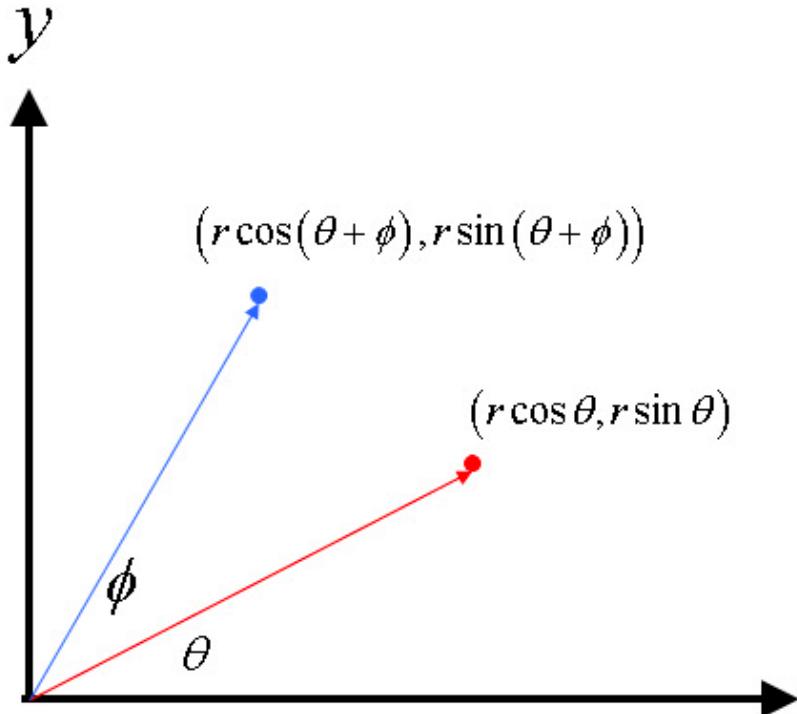
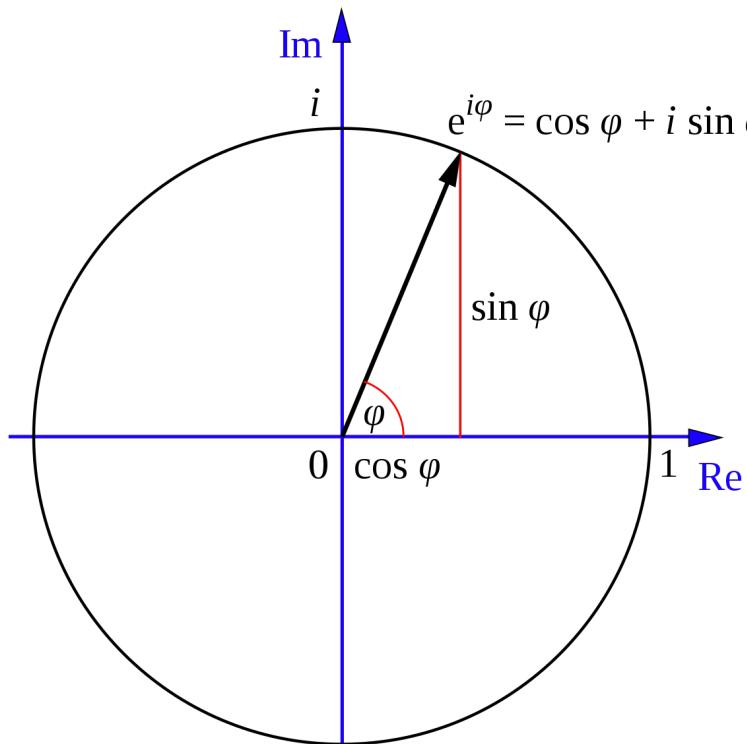
Euler angles, one of
the possible ways to
describe an orientation



A rotation represented
by an Euler axis and
angle.

Use unit quaternions to represent a 3D rotation

- Recall, we can use a unit complex number to represent a 2D rotation. Similarly, we can use unit quaternions to represent a 3D rotation.



What are quaternion numbers?

- Double 2 real numbers → complex number
- Double 2 complex numbers → quaternion number
- Double 2 quaternion numbers → Cayley number
- ...

What are quaternion numbers?

- Double 2 real numbers a and b: $(a, b) \rightarrow$
- $z = a + bi$ complex number
- Double 2 complex numbers (z, w) where $z = a + bi$ and $w = c + di \rightarrow$
- $q = a + bi + cj + dk = (a + bi) + (c + di)j$ quaternion number
- Double 2 quaternion numbers \rightarrow Cayley number
- ...

Unit Quaternions

Quaternions are generally represented in the form:

$$a + b \mathbf{i} + c \mathbf{j} + d \mathbf{k}$$

where a, b, c , and d are real numbers, and \mathbf{i}, \mathbf{j} , and \mathbf{k} are the fundamental *quaternion units*.

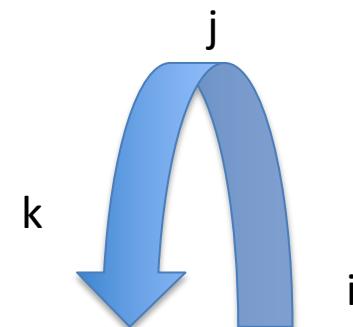
Quaternion multiplication

\times	1	i	j	k
1	1	i	j	k
i	i	-1	k	$-j$
j	j	$-k$	-1	i
k	k	j	$-i$	-1

$$\mathbf{i}^2 = \mathbf{j}^2 = \mathbf{k}^2 = \mathbf{ijk} = -1$$

$$\begin{aligned} ij &= k, & ji &= -k, \\ jk &= i, & kj &= -i, \\ ki &= j, & ik &= -j. \end{aligned}$$

\times	1	i	j	k
1	1	i	j	k
i	i	-1	k	$-j$
j	j	$-k$	-1	i
k	k	j	$-i$	-1



Hamilton describes a quaternion $q = a + b \mathbf{i} + c \mathbf{j} + d \mathbf{k}$, as consisting of a scalar part and a vector part. The quaternion $b \mathbf{i} + c \mathbf{j} + d \mathbf{k}$ is called the *vector part* (sometimes *imaginary part*) of q , and a is the *scalar part* (sometimes *real part*) of q . A quaternion that equals its real part (that is, its vector part is zero) is called a *scalar*, and is identified with the corresponding real number. That is, the real numbers are a subset of the quaternions. A quaternion that equals its vector part is called a *vector quaternion*.

Closed under Sum and Scalar Multiplication

The set of quaternions is made a 4 dimensional **vector space** over the **real numbers**, with $\{1, \mathbf{i}, \mathbf{j}, \mathbf{k}\}$ as a **basis**, by the componentwise addition

$$\begin{aligned} & (a_1 + b_1 \mathbf{i} + c_1 \mathbf{j} + d_1 \mathbf{k}) + (a_2 + b_2 \mathbf{i} + c_2 \mathbf{j} + d_2 \mathbf{k}) \\ &= (a_1 + a_2) + (b_1 + b_2) \mathbf{i} + (c_1 + c_2) \mathbf{j} + (d_1 + d_2) \mathbf{k} \end{aligned}$$

and the componentwise scalar multiplication

$$\lambda(a + b \mathbf{i} + c \mathbf{j} + d \mathbf{k}) = \lambda a + (\lambda b) \mathbf{i} + (\lambda c) \mathbf{j} + (\lambda d) \mathbf{k} .$$

Hamilton Product

For two elements $a_1 + b_1i + c_1j + d_1k$ and $a_2 + b_2i + c_2j + d_2k$, their product, called the **Hamilton product** $(a_1 + b_1i + c_1j + d_1k)(a_2 + b_2i + c_2j + d_2k)$, is determined by the products of the basis elements and the **distributive law**. The distributive law makes it possible to expand the product so that it is a sum of products of basis elements. This gives the following expression:

$$\begin{aligned} & a_1a_2 + a_1b_2i + a_1c_2j + a_1d_2k \\ & + b_1a_2i + b_1b_2i^2 + b_1c_2ij + b_1d_2ik \\ & + c_1a_2j + c_1b_2ji + c_1c_2j^2 + c_1d_2jk \\ & + d_1a_2k + d_1b_2ki + d_1c_2kj + d_1d_2k^2. \end{aligned}$$

Now the basis elements can be multiplied using the rules given above to get:^[7]

$$\begin{aligned} & a_1a_2 - b_1b_2 - c_1c_2 - d_1d_2 \\ & + (a_1b_2 + b_1a_2 + c_1d_2 - d_1c_2)i \\ & + (a_1c_2 - b_1d_2 + c_1a_2 + d_1b_2)j \\ & + (a_1d_2 + b_1c_2 - c_1b_2 + d_1a_2)k. \end{aligned}$$

So closed under the product!

The product of two rotation quaternions^[24] will be equivalent to the rotation $a_2 + b_2i + c_2j + d_2k$ followed by the rotation $a_1 + b_1i + c_1j + d_1k$.

Key theorem:

The quaternions form a division algebra.

- The real quaternion 1 is the **identity element**.
- The real quaternions commute with all other quaternions, that is $aq = qa$ for every quaternion q and every real quaternion a . In algebraic terminology this is to say that the field of real quaternions are the **center** of this quaternion algebra.
- The product is first given for the basis elements (see next subsection), and then extended to all quaternions by using the **distributive property** and the center property of the real quaternions. The Hamilton product is not **commutative**, but **associative**, thus the quaternions form an **associative algebra** over the reals.
- Additionally, every nonzero quaternion has an inverse with respect to the Hamilton product:

$$(a + b \mathbf{i} + c \mathbf{j} + d \mathbf{k})^{-1} = \frac{1}{a^2 + b^2 + c^2 + d^2} (a - b \mathbf{i} - c \mathbf{j} - d \mathbf{k}).$$

Scalar and Vector parts of quaternions

If a quaternion is divided up into a scalar part and a vector part, i.e.

$$q = (r, \vec{v}), q \in \mathbf{H}, r \in \mathbf{R}, \vec{v} \in \mathbf{R}^3$$

then the formulas for addition and multiplication are:

$$(r_1, \vec{v}_1) + (r_2, \vec{v}_2) = (r_1 + r_2, \vec{v}_1 + \vec{v}_2)$$

$$(r_1, \vec{v}_1)(r_2, \vec{v}_2) = (r_1 r_2 - \vec{v}_1 \cdot \vec{v}_2, r_1 \vec{v}_2 + r_2 \vec{v}_1 + \vec{v}_1 \times \vec{v}_2)$$

where " \cdot " is the [dot product](#) and " \times " is the [cross product](#).

Homework: Check the above holds!

Conjugation and the norm

Conjugation of quaternions is analogous to conjugation of complex numbers and to transposition (also known as reversal) of elements of Clifford algebras. To define it, let $q = a + bi + cj + dk$ be a quaternion. The **conjugate** of q is the quaternion $q^* = a - bi - cj - dk$. It is denoted by q^* , \bar{q} ,^[7] q^t , or \tilde{q} . Conjugation is an **involution**, meaning that it is its own inverse, so conjugating an element twice returns the original element. The conjugate of a product of two quaternions is the product of the conjugates *in the reverse order*. That is, if p and q are quaternions, then $(pq)^* = q^*p^*$, not p^*q^* .

The square root of the product of a quaternion with its conjugate is called its **norm**

$$\|q\| = \sqrt{qq^*} = \sqrt{q^*q} = \sqrt{a^2 + b^2 + c^2 + d^2}$$

This is always a non-negative real number, and it is the same as the Euclidean norm on \mathbf{H} considered as the vector space \mathbf{R}^4 .

$$\|\alpha q\| = \|\alpha\| \|q\|.$$

This is a special case of the fact that the norm is *multiplicative*, meaning that

$$\|pq\| = \|p\| \|q\|.$$

for any two quaternions p and q . Multiplicativity is a consequence of the formula for the conjugate of a product. Alternatively it follows from the identity

$$\det \begin{pmatrix} a + ib & id + c \\ id - c & a - ib \end{pmatrix} = a^2 + b^2 + c^2 + d^2,$$

(where i denotes the usual [imaginary unit](#)) and hence from the multiplicative property of [determinants](#) of square matrices.

This norm makes it possible to define the **distance** $d(p, q)$ between p and q as the norm of their difference:

$$d(p, q) = \|p - q\|.$$

This makes **H** a [metric space](#). Addition and multiplication are continuous in the metric topology. Indeed, for any scalar, positive a it holds

$$\|(p + ap_1 + q + aq_1) - (p + q)\| = a\|p_1 + q_1\|.$$

Continuity follows from taking a to zero in the limit. Continuity for multiplication holds similarly.

Unit quaternion and Reciprocal

A **unit quaternion** is a quaternion of norm one. Dividing a non-zero quaternion q by its norm produces a unit quaternion $\mathbf{U}q$ called the **versor** of q :

$$\mathbf{U}q = \frac{q}{\|q\|}.$$

Every quaternion has a **polar decomposition** $q = \|q\| \cdot \mathbf{U}q$.

Using conjugation and the norm makes it possible to define the **reciprocal** of a non-zero quaternion. The product of a quaternion with its reciprocal should equal 1, and the considerations above imply that the product of q and $q^*/\|q\|^2$ (in either order) is 1. So the **reciprocal** of q is defined to be

$$q^{-1} = \frac{q^*}{\|q\|^2}.$$

This makes it possible to divide two quaternions p and q in two different ways (when q is non-zero). That is, their quotient can be either pq^{-1} or $q^{-1}p$. The notation $\frac{p}{q}$ is ambiguous because it does not specify whether q divides on the left or the right.

Division Algebra

The set **H** of all quaternions is a [vector space](#) over the [real numbers](#) with [dimension 4](#). (In comparison, the real numbers have dimension 1, the complex numbers have dimension 2, and the [octonions](#) have dimension 8.) Multiplication of quaternions is associative and distributes over vector addition, but it is not commutative. Therefore, the quaternions **H** are a non-commutative [associative algebra](#) over the real numbers. Even though **H** contains copies of the complex numbers, it is not an associative algebra over the complex numbers.

Because it is possible to divide quaternions, they form a [division algebra](#). This is a structure similar to a [field](#) except for the non-commutativity of multiplication. Finite-dimensional associative division algebras over the real numbers are very rare. The [Frobenius theorem](#) states that there are exactly three: **R**, **C**, and **H**. The norm makes the quaternions into a [normed algebra](#), and normed division algebras over the reals are also very rare: [Hurwitz's theorem](#) says that there are only four: **R**, **C**, **H**, and **O** (the [octonions](#)). The quaternions are also an example of a [composition algebra](#) and of a unital [Banach algebra](#).

Unit quaternion matrix representation

Euler-Rodrigues Formula

A rotation about the origin is represented by four real numbers, a , b , c , d such that $a^2 + b^2 + c^2 + d^2 = 1$. When the rotation is applied, a point at position x rotates to its new position

$$x' = \begin{bmatrix} a^2 + b^2 - c^2 - d^2 & 2(bc - ad) & 2(bd + ac) \\ 2(bc + ad) & a^2 + c^2 - b^2 - d^2 & 2(cd - ab) \\ 2(bd - ac) & 2(cd + ab) & a^2 + d^2 - b^2 - c^2 \end{bmatrix} x$$