# rowan Documentation

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Welcome to the documentation for rowan, a package for working with quaternions! Quaternions form a number system with various interesting properties, and they have a number of uses. This package provides tools for standard algebraic operations on quaternions as well as a number of additional tools for *e.g.* measuring distances between quaternions, interpolating between them, and performing basic point-cloud mapping. A particular focus of the rowan package is working with unit quaternions, which are a popular means of representing rotations in 3D. In order to provide a unified framework for working with the various rotation formalisms in 3D, rowan allows easy interconversion between these formalisms.

Core features of rowan include (but are not limited to):

- Algebra (multiplication, exponentiation, etc).
- Derivatives and integrals of quaternions.
- Rotation and reflection operations, with conversions to and from matrices, axis angles, etc.
- Various distance metrics for quaternions.
- Basic point set registration, including solutions of the Procrustes problem and the Iterative Closest Point algorithm.
- Quaternion interpolation (slerp, squad).

To install rowan, first clone the repository from source. Once installed, the package can be installed using setuptools:

\$ python setup.py install --user

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## rowan

## Overview

rowan.conjugate	Conjugates an array of quaternions
rowan.inverse	Computes the inverse of an array of quaternions
rowan.exp	Computes the natural exponential function $e^q$ .
rowan.expb	Computes the exponential function $b^q$ .
rowan.exp10	Computes the exponential function $10^q$ .
rowan.log	Computes the quaternion natural logarithm.
rowan.logb	Computes the quaternion logarithm to some base b.
rowan.log10	Computes the quaternion logarithm base 10.
rowan.multiply	Multiplies two arrays of quaternions
rowan.divide	Divides two arrays of quaternions
rowan.norm	Compute the quaternion norm
rowan.normalize	Normalize quaternions
rowan.rotate	Rotate a list of vectors by a corresponding set of quater-
	nions
rowan.vector_vector_rotation	Find the quaternion to rotate one vector onto another
rowan.from_euler	Convert Euler angles to quaternions
rowan.to_euler	Convert quaternions to Euler angles
rowan.from_matrix	Convert the rotation matrices mat to quaternions
rowan.to_matrix	Convert quaternions into rotation matrices.
rowan.from_axis_angle	Find quaternions to rotate a specified angle about a spec-
	ified axis
rowan.to_axis_angle	Convert the quaternions in q to axis angle representa-
	tions
rowan.from_mirror_plane	Generate quaternions from mirror plane equations.
rowan.reflect	Reflect a list of vectors by a corresponding set of quater-
	nions
rowan.equal	Check whether two sets of quaternions are equal.
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rowan.not_equal	Check whether two sets of quaternions are not equal.
rowan.isfinite	Test element-wise for finite quaternions.
rowan.isinf	Test element-wise for infinite quaternions.
rowan.isnan	Test element-wise for NaN quaternions.

### **Details**

The core *rowan* package contains functions for operating on quaternions. The core package is focused on robust implementations of key functions like multiplication, exponentiation, norms, and others. Simple functionality such as addition is inherited directly from numpy due to the representation of quaternions as numpy arrays. Many core numpy functions implemented for normal arrays are reimplemented to work on quaternions ( such as *allclose()* and *isfinite()*). Additionally, numpy broadcasting is enabled throughout rowan unless otherwise specified. This means that any function of 2 (or more) quaternions can take arrays of shapes that do not match and return results according to numpy's broadcasting rules.

```
rowan.allclose(p, q, **kwargs)
```

Check whether two sets of quaternions are all close.

This is a direct wrapper of the corresponding numpy function.

### **Parameters**

- p((..,4) np.array) First set of quaternions
- **q**((..,4) np.array) First set of quaternions
- \*\*kwargs Keyword arguments to pass to np.allclose

**Returns** Whether or not all quaternions are close

### rowan.conjugate(q)

Conjugates an array of quaternions

```
Parameters q((..,4) np.array) - Array of quaternions
```

**Returns** An array containing the conjugates of q

### Example:

```
q_star = conjugate(q)
```

## $\verb"rowan.divide"\,(qi,qj)$

Divides two arrays of quaternions

Division is non-commutative; this function returns  $q_i q_j^{-1}$ .

### **Parameters**

- qi ((.., 4) np.array) Dividend quaternion
- qj ((..., 4) np.array) Divisors quaternions

**Returns** An array containing the quotients of row i of qi with column j of qi

### Example:

```
qi = np.array([[1, 0, 0, 0]])
qj = np.array([[1, 0, 0, 0]])
prod = divide(qi, qj)
```

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rowan.exp(q)

Computes the natural exponential function  $e^q$ .

The exponential of a quaternion in terms of its scalar and vector parts q = a + v is defined by exponential power series: formula  $e^x = \sum_{k=0}^{\infty} \frac{x^k}{k!}$  as follows:

$$e^{q} = e^{a+v}$$

$$= e^{a} \left( \sum_{k=0}^{\infty} \frac{v^{k}}{k!} \right)$$

$$= e^{a} \left( \cos||\boldsymbol{v}|| + \frac{\boldsymbol{v}}{||\boldsymbol{v}||} \sin||\boldsymbol{v}|| \right)$$

$$(1.1)$$

**Parameters q**((..., 4) np.array) – Quaternions

Returns Array of shape (...) containing exponentials of q

Example:

$$q_exp = exp(q)$$

rowan.expb(q, b)

Computes the exponential function  $b^q$ .

We define the exponential of a quaternion to an arbitrary base relative to the exponential function  $e^q$  using the change of base formula as follows:

$$b^{q} = y$$

$$q = \log_{b} y = (\frac{\ln y}{\ln b})$$

$$y = e^{q \cdot b} b$$
(1.4)

Parameters q((..,4) np.array) - Quaternions

Returns Array of shape (...) containing exponentials of q

Example:

$$q_exp = exp(q, 2)$$

rowan.exp10(q)

Computes the exponential function  $10^q$ .

Wrapper around expb().

Parameters q((..., 4) np.array) - Quaternions

**Returns** Array of shape (...) containing exponentials of q

Example:

$$q_{exp} = exp(q, 2)$$

rowan.equal (p, q)

Check whether two sets of quaternions are equal.

This function is a simple wrapper that checks array equality and then aggregates along the quaternion axis.

**Parameters** 

• p((..,4) np.array) - First set of quaternions

```
• q((..,4) np.array) - First set of quaternions
```

**Returns** A boolean array of shape (...) indicating equality.

```
rowan.from_axis_angle (axes, angles)
```

Find quaternions to rotate a specified angle about a specified axis

#### **Parameters**

- axes ((..,3) np.array) An array of vectors (the axes)
- angles (float or (..,1) np.array) An array of angles in radians. Will be broadcast to match shape of v as needed

**Returns** An array of the desired rotation quaternions

### Example:

```
import numpy as np
axis = np.array([[1, 0, 0]])
ang = np.pi/3
quat = about_axis(axis, ang)
```

```
rowan.from_euler(alpha, beta, gamma, convention='zyx', axis_type='intrinsic')
```

Convert Euler angles to quaternions

For generality, the rotations are computed by composing a sequence of quaternions corresponding to axis-angle rotations. While more efficient implementations are possible, this method was chosen to prioritize flexibility since it works for essentially arbitrary Euler angles as long as intrinsic and extrinsic rotations are not intermixed.

#### **Parameters**

- alpha ((...) np.array) Array of  $\alpha$  values in radians.
- **beta** ((...) np.array) Array of  $\beta$  values in radians.
- gamma ((...) np.array) Array of  $\gamma$  values in radians.
- **convention** (*str*) One of the 12 valid conventions xzx, xyx, yxy, yzy, zyz, zxz, xzy, xyz, yxz, yzx, zyx, zxy
- axes (str) Whether to use extrinsic or intrinsic rotations

**Returns** An array containing the converted quaternions

### Example:

```
rands = np.random.rand(100, 3)
alpha, beta, gamma = rands.T
ql.from_euler(alpha, beta, gamma)
```

### rowan.from\_matrix (mat, require\_orthogonal=True)

Convert the rotation matrices mat to quaternions

Thhis method uses the algorithm described by Bar-Itzhack in [Itzhack00]. The idea is to construct a matrix K whose largest eigenvalue corresponds to the desired quaternion. One of the strengths of the algorithm is that for nonorthogonal matrices it gives the closest quaternion representation rather than failing outright.

```
Parameters mat ((..., 3, 3) np.array) – An array of rotation matrices
```

**Returns** An array containing the quaternion representations of the elements of mat (i.e. the same elements of SO(3))

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### rowan.from\_mirror\_plane (x, y, z)

Generate quaternions from mirror plane equations.

Reflection quaternions can be constructed of the from (0, x, y, z), *i.e.* with zero real component. The vector (x, y, z) is the normal to the mirror plane.

### **Parameters**

- x ((...) np.array) First planar component
- y ((..) np.array) Second planar component
- **z** ((...) np.array) Third planar component

**Returns** An array of quaternions corresponding to the provided reflections.

### Example:

```
plane = (1, 2, 3)
quat_ref = from_mirror_plane(*plane)
```

### rowan.inverse(q)

Computes the inverse of an array of quaternions

```
Parameters q((..., 4) np.array) – Array of quaternions
```

**Returns** An array containing the inverses of q

### Example:

```
q_inv = inverse(q)
```

### rowan.isclose(p, q, \*\*kwargs)

Element-wise check of whether two sets of quaternions close.

This function is a simple wrapper that checks using the corresponding numpy function and then aggregates along the quaternion axis.

### **Parameters**

- p((..,4) np.array) First set of quaternions
- q((..,4) np.array) First set of quaternions
- \*\*kwargs Keyword arguments to pass to np.isclose

**Returns** A boolean array of shape (...)

### rowan.isinf(q)

Test element-wise for infinite quaternions.

A quaternion is defined as infinite if any elements are infinite.

```
Parameters q((..., 4) np.array) – Quaternions to check
```

**Returns** A boolean array of shape (...) indicating infinite quaternions.

### rowan.isfinite(q)

Test element-wise for finite quaternions.

A quaternion is defined as finite if all elements are finite.

```
Parameters q((..., 4) np.array) – Quaternions to check
```

**Returns** A boolean array of shape (...) indicating finite quaternions.

### rowan.isnan(q)

Test element-wise for NaN quaternions.

A quaternion is defined as NaN if any elements are NaN.

Parameters q((..,4) np.array) - Quaternions to check

**Returns** A boolean array of shape (...) indicating NaN.

### rowan.is\_unit(q)

Check if all input quaternions have unit norm

### rowan.log(q)

Computes the quaternion natural logarithm.

The natural of a quaternion in terms of its scalar and vector parts q = a + v is defined by inverting the exponential formula (see exp(i)), and is defined by the formula  $\frac{x^k}{k!}$  as follows:

$$\ln(q) = \ln||q|| + \frac{\mathbf{v}}{||\mathbf{v}||} \arccos\left(\frac{a}{q}\right) (1.7)$$

Parameters q((..,4) np.array) - Quaternions

Returns Array of shape (...) containing logarithms of q

### Example:

$$ln_q = log(q)$$

### rowan.logb(q, b)

Computes the quaternion logarithm to some base b.

The quaternion logarithm for arbitrary bases is defined using the standard change of basis formula relative to the natural logarithm.

$$\log_{b} q = y$$

$$q \notin \mathcal{B}'$$

$$\ln q = (y \cdot \ln 0)$$

$$y = \log_{b} q \neq 1 \frac{\ln q}{\ln b}$$
(1.8)

### **Parameters**

- q((..,4) np.array) Quaternions
- n((...) np.array) Scalars to use as log bases

Returns Array of shape (...) containing logarithms of q

### Example:

$$\log_{q} = \log(q, 2)$$

### rowan.log10(q)

Computes the quaternion logarithm base 10.

Wrapper around logb().

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**Parameters** q((..., 4) np.array) – Quaternions

Returns Array of shape (...) containing logarithms of q

## Example:

```
\log_q = \log(q, 2)
```

### rowan.multiply(qi, qj)

Multiplies two arrays of quaternions

Note that quaternion multiplication is generally non-commutative.

### **Parameters**

- qi ((.., 4) np.array) First set of quaternions
- qj ((..., 4) np.array) Second set of quaternions

**Returns** An array containing the products of row i of qi with column j of qj

### Example:

```
qi = np.array([[1, 0, 0, 0]])
qj = np.array([[1, 0, 0, 0]])
prod = multiply(qi, qj)
```

### rowan.norm(q)

Compute the quaternion norm

**Parameters q**((..,4) np.array) – Quaternions to find norms for

**Returns** An array containing the norms for qi in q

### Example:

```
q = np.random.rand(10, 4)
norms = norm(q)
```

### rowan.normalize(q)

Normalize quaternions

**Parameters q**((..., 4) np.array) – Array of quaternions to normalize

**Returns** An array containing the unit quaternions q/norm(q)

### Example:

```
q = np.random.rand(10, 4)
u = normalize(q)
```

### rowan.not\_equal (p, q)

Check whether two sets of quaternions are not equal.

This function is a simple wrapper that checks array equality and then aggregates along the quaternion axis.

### **Parameters**

- p((..,4) np.array) First set of quaternions
- **q**((..,4) np.array) First set of quaternions

**Returns** A boolean array of shape (...) indicating inequality.

```
rowan.power (q, n)
```

Computes the power of a quaternion  $q^n$ .

Quaternions raised to a scalar power are defined according to the polar decomposition angle  $\theta$  and vector  $\hat{u}$ :  $q^n = ||q||^n (\cos(n\theta) + \hat{u}\sin(n\theta))$ . However, this can be computed more efficiently by noting that  $q^n = \exp(n\ln(q))$ .

### **Parameters**

- q((...,4) np.array) Quaternions.
- n ((...) np.arrray) Scalars to exponentiate quaternions with.

Returns Array of shape (...) containing of q

### Example:

```
q_n = pow(q^n)
```

### rowan.reflect (q, v)

Reflect a list of vectors by a corresponding set of quaternions

For help constructing a mirror plane, see from\_mirror\_plane().

### **Parameters**

- q((..,4) np.array) Quaternions to use for reflection
- **v**((..., 3) np.array) Vectors to reflect.

**Returns** An array of the vectors in v reflected by q

### Example:

```
q = np.random.rand(1, 4)
v = np.random.rand(1, 3)
v_rot = rotate(q, v)
```

### rowan.rotate(q, v)

Rotate a list of vectors by a corresponding set of quaternions

### **Parameters**

- **q**((..,4) np.array) Quaternions to rotate by.
- $\mathbf{v}((...,3)$  np.array) Vectors to rotate.

**Returns** An array of the vectors in v rotated by q

### Example:

```
q = np.random.rand(1, 4)
v = np.random.rand(1, 3)
v_rot = rotate(q, v)
```

### rowan.to\_axis\_angle(q)

Convert the quaternions in q to axis angle representations

```
Parameters q((..,4) np.array) – An array of quaternions
```

**Returns** A tuple of np.arrays (axes, angles) where axes has shape (...,3) and angles has shape (...,1). The angles are in radians

```
rowan.to_euler(q, convention='zyx', axis_type='intrinsic')
```

Convert quaternions to Euler angles

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Euler angles are returned in the sequence provided, so in, e.g., the default case ('zyx'), the angles returned are for a rotation  $Z(\alpha)Y(\beta)X(\gamma)$ .

**Note:** In all cases, the  $\alpha$  and  $\gamma$  angles are between  $\pm \pi$ . For proper Euler angles,  $\beta$  is between 0 and pi degrees. For Tait-Bryan angles,  $\beta$  lies between  $\pm \pi/2$ .

For simplicity, quaternions are converted to matrices, which are then converted to their Euler angle representations. All equations for rotations are derived by considering compositions of the three elemental rotations about the three Cartesian axes:

$$R_x(\theta) = \begin{pmatrix} 1 & 0 & 0 \\ 0 & \cos \theta & -\sin \theta \\ 0 & \sin \theta & \cos \theta \end{pmatrix}$$

$$R_y(\theta) = \begin{pmatrix} \cos \theta & 0 & \sin \theta \\ 0 & 1 & 0 \\ -\sin \theta & 1 & \cos \theta \end{pmatrix}$$

$$R_z(\theta) = \begin{pmatrix} \cos \theta & -\sin \theta & 0 \\ \sin \theta & \cos \theta & 0 \\ 0 & 0 & 1 \end{pmatrix}$$

Extrinsic rotations are represented by matrix multiplications in the proper order, so z - y - x is represented by the multiplication XYZ so that the system is rotated first about Z, then about y, then finally X. For intrinsic rotations, the order of rotations is reversed, meaning that it matches the order in which the matrices actually appear i.e. the z - y' - x'' convention (yaw, pitch, roll) corresponds to the multiplication of matrices ZYX. For proof of the relationship between intrinsic and extrinsic rotations, see the Wikipedia page on Davenport chained rotations.

For more information, see the Wikipedia page for Euler angles (specifically the section on converting between representations).

### **Parameters**

- **q**((.., 4) np.array) Quaternions to transform
- convention (str) One of the 6 valid conventions zxz, xyx, yzy, zyz, xzx, yxy
- **axes** (str) Whether to use extrinsic or intrinsic

**Returns** An array with Euler angles  $(\alpha, \beta, \gamma)$  as the last dimension (in radians)

### Example:

```
rands = np.random.rand(100, 3)
alpha, beta, gamma = rands.T
ql.from_euler(alpha, beta, gamma)
alpha_return, beta_return, gamma_return = ql.to_euler(full)
```

### rowan.to\_matrix(q, require\_unit=True)

Convert quaternions into rotation matrices.

Uses the conversion described on Wikipedia.

```
Parameters q((..,4) np.array) – An array of quaternions
```

**Returns** The array containing the matrix representations of the elements of q (i.e. the same elements of SO(3))

```
rowan.vector_vector_rotation(v1, v2)
```

Find the quaternion to rotate one vector onto another

## **Parameters**

- **v1**((...,3) np.array) Vector to rotate
- **v2**((...,3) np.array) Desired vector

**Returns** Array (..., 4) of quaternions that rotate v1 onto v2.

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## calculus

### Overview

rowan.calculus.derivative	Compute the instantaneous derivative of unit quater-
	nions.
rowan.calculus.integrate	Integrate unit quaternions by angular velocity.

### **Details**

This subpackage provides the ability to compute the derivative and integral of a quaternion.

```
rowan.calculus.derivative (q, v)
```

Compute the instantaneous derivative of unit quaternions.

### **Parameters**

- q((..,4) np.array) Quaternions to integrate
- v((..,3) np.array) Angular velocities

**Returns** An array containing the element-wise derivatives.

```
rowan.calculus.integrate (q, v, dt)
```

Integrate unit quaternions by angular velocity.

### **Parameters**

- q((..,4) np.array) Quaternions to integrate
- v((..., 3) np.array) Angular velocities
- dt ((...) np.array) Timesteps

**Returns** An array containing the element-wise integral of the quaternions in q.

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## geometry

### Overview

rowan.geometry.distance	Determine the distance between quaternions p and q.
rowan.geometry.sym_distance	Determine the distance between quaternions p and q.
rowan.geometry.riemann_exp_map	Compute the exponential map on the Riemannian man-
	ifold $\mathbb{H}^*$ of nonzero quaterions.
rowan.geometry.riemann_log_map	Compute the log map on the Riemannian manifold $\mathbb{H}^*$
	of nonzero quaterions.
rowan.geometry.intrinsic_distance	Compute the intrinsic distance between quaternions on
	the manifold of quaternions.
rowan.geometry.sym_intrinsic_distance	Compute the intrinsic distance between quaternions on
	the manifold of quaternions.
rowan.geometry.angle	Compute the angle of rotation of a quaternion.

### **Details**

This subpackage provides various tools for working with the geometric representation of quaternions. A particular focus is computing the distance between quaternions. These distance computations can be complicated, particularly good metrics for distance on the Riemannian manifold representing quaternions do not necessarily coincide with good metrics for similarities between rotations. An overview of distance measurements can be found in this paper.

```
rowan.geometry.distance (p, q)
```

Determine the distance between quaternions p and q.

This is the most basic distance that can be defined on the space of quaternions; it is the metric induced by the norm on this vector space  $\rho(p,q) = ||p-q||$ .

When applied to unit quaternions, this function produces values in the range [0, 2].

### **Parameters**

• p((..,4) np.array) - First set of quaternions

```
• q((..,4) np.array) - Second set of quaternions
```

**Returns** An array containing the element-wise distances between the two sets of quaternions.

## Example:

```
p = np.array([[1, 0, 0, 0]])
q = np.array([[1, 0, 0, 0]])
distance.distance(p, q)
```

```
rowan.geometry.sym_distance(p, q)
```

Determine the distance between quaternions p and q.

This is a symmetrized version of distance() that accounts for the fact that p and -p represent identical rotations. This makes it a useful measure of rotation similarity.

#### **Parameters**

- p((..,4) np.array) First set of quaternions
- q((..,4) np.array) Second set of quaternions

When applied to unit quaternions, this function produces values in the range  $[0, \sqrt{2}]$ .

**Returns** An array containing the element-wise distances between the two sets of quaternions.

### Example:

```
p = np.array([[1, 0, 0, 0]])
q = np.array([[-1, 0, 0, 0]])
distance.sym_distance(p, q) # 0
```

```
rowan.geometry.riemann_exp_map (p, v)
```

Compute the exponential map on the Riemannian manifold  $\mathbb{H}^*$  of nonzero quaterions.

The nonzero quaternions form a Lie algebra  $\mathbb{H}^*$  that is also a Riemannian manifold. In general, given a point p on a Riemannian manifold  $\mathcal{M}$  and an element of the tangent space at p  $v \in T_p \mathcal{M}$ , the Riemannian exponential map is defined by the geodesic starting at p and tracing out an arc of length v in the direction of v. This function computes the endpoint of that path (which is itself a quaternion).

Explicitly, we define the exponential map as

```
\operatorname{Exp}_n(v) = p \exp(v)(3.1)
```

### **Parameters**

- p((..,4) np.array) Points on the manifold of quaternions
- **v**((..., 4) np.array) Tangent vectors to traverse

**Returns** The endpoint of the geodesic that starts from p and travels a distance ||v|| in the direction of v.

```
rowan.geometry.riemann_log_map(p, q)
```

Compute the log map on the Riemannian manifold  $\mathbb{H}^*$  of nonzero quaterions.

This function inverts <code>riemann\_exp\_map()</code>. See that function for more details. In brief, given two quaternions p and q, this method returns a third quaternion parameterizing the geodesic passing from p to q. It is therefore an important measure of the distance between the two input quaternions.

### **Parameters**

- p((..,4) np.array) Starting points (quaternions)
- q((..,4) np.array) Endpoints (quaternions)

**Returns** Quaternions pointing from p to q with magnitudes equal to the length of the geodesics joining these quaternions.

```
rowan.geometry.intrinsic_distance (p, q)
```

Compute the intrinsic distance between quaternions on the manifold of quaternions.

The quaternion distance is determined as the length of the quaternion joining the two quaternions (see riemann\_log\_map()). Rather than computing this directly, however, as shown in [Huynh09] we can compute this distance using the following equivalence:

$$||\log(pq^{-1})|| = 2\cos(|\langle p, q \rangle|)(3.2)$$

When applied to unit quaternions, this function produces values in the range  $[0, \pi]$ .

#### **Parameters**

- **p**((..., 4) np.array) First set of quaternions.
- q((..,4) np.array) Second set of quaternions.

**Returns** The element-wise intrinsic distance between p and q.

```
rowan.geometry.sym_intrinsic_distance (p, q)
```

Compute the intrinsic distance between quaternions on the manifold of quaternions.

This is a symmetrized version of  $intrinsic\_distance()$  that accounts for the double cover  $SU(2) \rightarrow SO(3)$ , making it a more useful metric for rotation similarity.

When applied to unit quaternions, this function produces values in the range  $[0, \frac{\pi}{2}]$ .

### **Parameters**

- p((..., 4) np.array) First set of quaternions.
- q((..,4) np.array) Second set of quaternions.

**Returns** The element-wise intrinsic distance between p and q.

```
rowan.geometry.angle (p)
```

Compute the angle of rotation of a quaternion.

Note that this is identical to intrinsic distance (p, np.array([1, 0, 0, 0])).

```
Parameters p((...,4) np.array) – Quaternions.
```

**Returns** The element-wise angles traced out by these rotations.

## interpolate

#### Overview

rowan.interpolate.slerp	Linearly interpolate between p and q.
rowan.interpolate.slerp_prime	Compute the derivative of slerp.
rowan.interpolate.squad	Cubically interpolate between p and q.

### **Details**

The rowan package provides a simple interface to slerp, the standard method of quaternion interpolation for two quaternions.

```
rowan.interpolate.slerp (q0, q1, t, ensure\_shortest=True) Linearly interpolate between p and q.
```

The slerp formula can be easily expressed in terms of the quaternion exponential (see rowan.exp()).

### **Parameters**

- q0 ((.., 4) np.array) First set of quaternions
- q1 ((.., 4) np.array) Second set of quaternions
- t((...) np.array) Interpolation parameter  $\in [0,1]$
- ensure\_shortest (bool) Flip quaternions to ensure we traverse the geodesic in the shorter ( $< 180^{\circ}$ ) direction

**Note:** Given inputs such that  $t \notin [0, 1]$ , the values outside the range are simply assumed to be 0 or 1 (depending on which side of the interval they fall on).

**Returns** An array containing the element-wise interpolations between p and q.

### Example:

```
q0 = np.array([[1, 0, 0, 0]])
q1 = np.array([[np.sqrt(2)/2, np.sqrt(2)/2, 0, 0]])
interpolate.slerp(q0, q1, 0.5)
```

rowan.interpolate.slerp\_prime  $(q0, q1, t, ensure\_shortest=True)$ 

Compute the derivative of slerp.

### **Parameters**

- q0 ((.., 4) np.array) First set of quaternions
- q1 ((..., 4) np.array) Second set of quaternions
- t((...) np.array) Interpolation parameter  $\in [0,1]$
- ensure\_shortest (bool) Flip quaternions to ensure we traverse the geodesic in the shorter ( $< 180^{\circ}$ ) direction

**Returns** An array containing the element-wise derivatives of interpolations between p and q.

### Example:

```
q0 = np.array([[1, 0, 0, 0]])
q1 = np.array([[np.sqrt(2)/2, np.sqrt(2)/2, 0, 0]])
interpolate.slerp_prime(q0, q1, 0.5)
```

rowan.interpolate.squad (p, a, b, q, t)

Cubically interpolate between p and q.

The SQUAD formula is just a repeated application of Slerp between multiple quaternions:

$$\operatorname{squad}(p, a, b, q, t) = \operatorname{slerp}(p, q, t) \left(\operatorname{slerp}(p, q, t)^{-1} \operatorname{slerp}(a, b, t)\right)^{2t(1-t)} (4.1)$$

### **Parameters**

- p((..,4) np.array) First endpoint of interpolation
- q((..,4) np.array) Second endpoint of interpolation
- t((...) np.array) Interpolation parameter  $\in [0,1]$

**Returns** An array containing the element-wise interpolations between p and q.

### Example:

```
q0 = np.array([[1, 0, 0, 0]])
q1 = np.array([[np.sqrt(2)/2, np.sqrt(2)/2, 0, 0]])
interpolate.squad(q0, q1, 0.5)
```

mapping

### Overview

rowan.mapping.kabsch	Find the optimal rotation and translation to map between two sets of points.
rowan.mapping.davenport	Find the optimal rotation and translation to map be-
	tween two sets of points.
rowan.mapping.procrustes	Solve the orthogonal Procrustes problem with algorith-
	mic options.
rowan.mapping.icp	Find best mapping using the Iterative Closest Point al-
	gorithm

### **Details**

The general space of problems that this subpackage addresses is a small subset of the broader space of point set registration, which attempts to optimally align two sets of points. In general, this mapping can be nonlinear. The restriction of this superposition to linear transformations composed of translation, rotation, and scaling is the study of Procrustes superposition, the first step in the field of Procrustes analysis, which performs the superposition in order to compare two (or more) shapes.

If points in the two sets have a known correspondence, the problem is much simpler. Various precise formulations exist that admit analytical formulations, such as the orthogonal Procrustes problem searching for an orthogonal transformation

$$R = \mathrm{argmin}_{\Omega} ||\Omega A - B||_F, \ \Omega^T \Omega = \mathbb{1}(5.1)$$

or, if a pure rotation is desired, Wahba's problem

$$\min_{\mathbf{R} \in SO(3)} \frac{1}{2} \sum_{k=1}^{N} a_k ||\mathbf{w}_k - \mathbf{R} \mathbf{v}_k||^2 (5.2)$$

Numerous algorithms to solve this problem exist, particularly in the field of aerospace engineering and robotics where this problem must be solved on embedded systems with limited processing. Since that constraint does not apply here, this package simply implements some of the most stable known methods irrespective of cost. In particular, this package contains the Kabsch algorithm, which solves Wahba's problem using an SVD in the vein of Peter Schonemann's original solution to the orthogonal Procrustes problem. Additionally this package contains the Davenport q method, which works directly with quaternions. The most popular algorithms for Wahba's problem are variants of the q method that are faster at the cost of some stability; we omit these here.

In addition, rowan.mapping also includes some functionality for more general point set registration. If a point cloud has a set of known symmetries, these can be tested explicitly by rowan.mapping to find the smallest rotation required for optimal mapping. If no such correspondence is known at all, then the iterative closest point algorithm can be used to approximate the mapping.

```
rowan.mapping.kabsch(X, Y, require_rotation=True)
```

Find the optimal rotation and translation to map between two sets of points.

This function implements the Kabsch algorithm, which minimizes the RMSD between two sets of points. One benefit of this approach is that the SVD works in dimensions > 3.

#### **Parameters**

- X((N, m) np.array) First set of N points
- Y((N, m) np.array) Second set of N points
- require\_rotation (bool) If false, the returned quaternion

**Returns** A tuple (R, t) where R is the (mxm) rotation matrix to rotate the points and t is the translation

rowan.mapping.davenport (X, Y)

Find the optimal rotation and translation to map between two sets of points.

This function implements the Davenport q-method, the most robust method and basis of most modern solvers. It involves the construction of a particular matrix, the Davenport K-matrix, which is then diagonalized to find the appropriate eigenvalues. More modern algorithms aim to solve the characteristic equation directly rather than diagonalizing, which can provide speed benefits at the potential cost of robustness.

### **Parameters**

- **X**((N, 3) np.array) First set of N points
- Y((N, 3) np.array) Second set of N points

**Returns** A tuple (q, t) where q is the quaternion to rotate the points and t is the translation.

rowan.mapping.procrustes (*X*, *Y*, *method='best'*, *equivalent\_quaternions=None*) Solve the orthogonal Procrustes problem with algorithmic options.

### **Parameters**

- X ((N, m) np.array) First set of N points
- Y((N, m) np.array) Second set of N points

- **method** (str) A method to use. Options are 'kabsch', 'davenport' and 'horn'. The default is to select the best option ('best')
- equivalent\_quaternions (array-like) If the precise correspondence is not known, but the points are known to be part of e.g. a rigid body with specific symmetries, the set of quaternions generating symmetry equivalent configurations can be provided and tested with.
- to generate symmetry equivalent objects. (ways) -

**Returns** A tuple (q, t) where q is the quaternion to rotate the points and t is the translation.

rowan.mapping.icp  $(X, Y, method='best', unique\_match=True, max\_iterations=20, tolerance=0.001)$  Find best mapping using the Iterative Closest Point algorithm

#### **Parameters**

- X ((N, m) np.array) First set of N points
- Y((N, m) np.array) Second set of N points
- **method** (str) A method to use for each alignment. Options are 'kabsch', 'davenport' and 'horn'. The default is to select the best option ('best').
- unique\_match (bool) Whether to require nearest neighbors to be unique.
- max\_iterations (int) Number of iterations to attempt.
- tolerance (float) Indicates convergence

**Returns** A tuple (R, t) where R is the matrix to rotate the points and t is the translation.

## random

#### Overview

rowan.random.rand	Generate random rotations uniformly
rowan.random.random_sample	Generate random rotations unifo

### **Details**

Various functions for generating random sets of rotation quaternions. Note that if you simply want random quaternions not restricted to SO(3) you can just generate these directly using np.random.rand(... 4). This subpackage is entirely focused on generating rotation quaternions.

```
rowan.random.rand(*args)
```

Generate random rotations uniformly

This is a convenience function a la np.random.rand. If you want a function that takes a tuple as input, use  $random\_sample()$  instead.

**Parameters** shape (tuple) – The shape of the array to generate.

**Returns** Random quaternions of the shape provided with an additional axis of length 4.

```
rowan.random.random_sample(size=None)
```

Generate random rotations unifo

In general, sampling from the space of all quaternions will not generate uniform rotations. What we want is a distribution that accounts for the density of rotations, *i.e.*, a distribution that is uniform with respect to the appropriate measure. The algorithm used here is detailed in [Shoe92].

**Parameters** size (tuple) – The shape of the array to generate

Returns Random quaternions of the shape provided with an additional axis of length 4

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**Development Guide** 

## 7.1 Philosophy

The goal of rowan is to provide a flexible, easy-to-use, and scalable approach to dealing with rotation representations. To ensure maximum flexibility, rowan operates entirely on numpy arrays, which serve as the *de facto* standard for efficient multi-dimensional arrays in Python. To be available for a wide variety of applications, rowan aims to work for arbitrarily shaped numpy arrays, mimicking numpy broadcasting to the extent possible. Functions for which this broadcasting is not available should be documented as such.

Since rowan is designed to work everywhere, all hard dependencies aside from numpy are avoided, although soft dependencies for specific functions are allowed. To avoid any dependencies on compilers or other software, all rowan code is written in **pure Python**. This means that while rowan is intended to provide good performance, it may not be the correct choice in cases where performance is critical. The package was written principally for use-cases where quaternion operations are not the primary bottleneck, so it prioritizes portability, maintainability, and flexibility over optimization.

### 7.1.1 PEP 20

In general, all code in rowan should follow the principles in PEP 20. In particular, prefer simple, explicit code where possible, avoiding unnecessary convolution or complicated code that could be written more simply. Avoid writing code that is not easy to parse up front.

Inline comments are **highly encouraged**; however, code should be written in a way that it could be understood without comments. Comments such as "Set x to 10" are not helpful and simply clutter code. The most useful comments in a package such as rowan are the ones that explain the underlying algorithm rather than the implementations, which should be simple. For example, the comment "compute the spectral decomposition of A" is uninformative, since the code itself should make this obvious, *e.g.*, np.linalg.eigh. On the other hand, the comment "the eigenvector corresponding to the largest eigenvalue of the A matrix is the quaternion" is instructive.

## 7.2 Source Code Conventions

All code in rowan should follow PEP 8 guidelines, which are the *de facto* standard for Python code. In addition, follow the Google Python Style Guide, which is largely a superset of PEP 8. Note that Google has amended their standards to match PEP 8's 4 spaces guideline, so write code accordingly. In particular, write docstrings in the Google style.

Python example:

```
# This is the correct style
def multiply(x, y):
    """Multiply two numbers
    Args:
        x (float): The first number
        y (float): The second number
    Returns:
       The product
# This is the incorrect style
def multiply(x, y):
    """Multiply two numbers
    :param x: The first number
    :type x: float
    :param y: The second number
    :type y: float
    :returns: The product
    :rtype: float
```

Documentation must be included for all files, and is then generated from the docstrings using sphinx.

## 7.3 Unit Tests

All code should include a set of unit tests which test for correct behavior. All tests should be placed in the tests folder at the root of the project. These tests should be as simple as possible, testing a single function each, and they should be kept as short as possible. Tests should also be entirely deterministic: if you are using a random set of objects for testing, they should either be generated once and then stored in the tests/files folder, or the random number generator in use should be seeded explicitly (e.g., numpy.random.seed or random.seed). Tests should be written in the style of the standard Python unittest framework. At all times, tests should be executable by simply running python -m unittest discover tests from the root of the project.

## 7.4 General Notes

- For consistency, NumPy should always be imported as np in code: import numpy as np.
- Avoid external dependencies where possible, and avoid introducing **any** hard dependencies. Dependencies other than NumPy should always be soft, enabling the rest of the package to function as is.

## 7.5 Release Guide

To make a new release of rowan, follow the following steps:

- 1. Make a new branch off of develop based on the expected new version, e.g. release-2.3.1.
- 2. Ensure all tests are passing as expected on the new branch. Make any final changes as desired on this branch.
- 3. Once the branch is completely finalized, run bumpversion with the appropriate type (patch, minor, major) so that the version now matches the version number in the branch name.
- 4. Once all tests pass on the release branch, merge the branch back into develop.
- 5. Merge develop into master.
- 6. Generate new source and binary distributions as described in the Python guide for Packaging and distributing projects.
- 7. Update the conda recipe.

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## CHAPTER 9

## Changelog

The format is based on Keep a Changelog. This project adheres to Semantic Versioning.

## 9.1 Unreleased

## 9.2 v0.5.2 - 2018-04-20

#### 9.2.1 Added

- Derivatives and integrals of quaternions.
- Point set registration methods and Procrustes analysis.

## 9.3 v0.5.1 - 2018-04-13

### 9.3.1 Fixed

• README rendering on PyPI

## 9.4 v0.5.0 - 2018-04-12

#### 9.4.1 Added

- Various distance metrics on quaternion space.
- Quaternion interpolation.

#### 9.4.2 Fixed

• Update empty \_\_all\_\_ variable in geometry to export functions.

### 9.5 v0.4.4 - 2018-04-10

#### 9.5.1 Added

• Rewrote internals for upload to PyPI.

### 9.6 v0.4.3 - 2018-04-10

#### 9.6.1 Fixed

• Typos in documentation.

## 9.7 v0.4.2 - 2018-04-09

#### 9.7.1 Added

- Support for Read The Docs and Codecov.
- Simplify CircleCI testing suite.
- Minor changes to README.
- Properly update this document.

### 9.8 v0.4.1 - 2018-04-08

#### 9.8.1 Fixed

• Exponential for bases other than e are calculated correctly.

### 9.9 v0.4.0 - 2018-04-08

#### 9.9.1 Added

- Add functions relating to exponentiation: exp, expb, exp10, log, logb, log10, power.
- Add core comparison functions for equality, closeness, finiteness.

## 9.10 v0.3.0 - 2018-03-31

#### 9.10.1 Added

- Broadcasting works for all methods.
- · Quaternion reflections.
- Random quaternion generation.

## 9.10.2 Changed

- Converting from Euler now takes alpha, beta, and gamma as separate args.
- Ensure more complete coverage.

### 9.11 v0.2.0 - 2018-03-08

#### 9.11.1 Added

- · Added documentation.
- Add tox support.
- Add support for range of python and numpy versions.
- Add coverage support.

## 9.11.2 Changed

- Clean up CI.
- Ensure pep8 compliance.

## 9.12 v0.1.0 - 2018-02-26

### 9.12.1 Added

• Initial implementation of all functions.

9.10. v0.3.0 - 2018-03-31 35

# CHAPTER 10

Credits

The following people contributed to the rowan package.

Vyas Ramasubramani, University of Michigan - Lead developer.

- Initial design
- Core quaternion operations
- Sphinx docs support

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## **Support and Contribution**

This package is hosted on Bitbucket. Please report any bugs or problems that you find on the issue tracker.

All contributions to rowan are welcomed! Please see the *development guide* for more information.

# CHAPTER 12

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