## **Quaternion Applications**

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## Siggraph Asia 2012 Tutorial

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I: (55 min) Introduction to Quaternions:

OUTLINE

What are they good for?

Understanding Rotation Sequences!

II a: (15 min) Quaternion Tubing:
Visualizing Framed Space Curves

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#### ...OUTLINE...

# II b: (15 min) Quaternion Protein Maps:

Amino Acid Frame Sequences with Quaternions

# II c: (20 min) Intro to Dual Quaternions:

Applications to Six-Degrees-of-Freedom

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#### Part I

## Introduction to Quaternions:

# ...Twisting Belts and Rolling Balls...

Explaining Rotation Sequences with Quaternions

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## Where Did Quaternions Come From?

... from the discovery of Complex Numbers:

- z=x+iy Complex numbers = realization that  $z^2+1=0$  cannot be solved unless you have an "imaginary" number with  $i^2=-1$ .
- Euler's formula:  $e^{i\theta} = \cos\theta + i\sin\theta$  allows you to do most of 2D geometry.

#### **Hamilton**

The first to ask "If you can do 2D geometry with complex numbers, how might you do 3D geometry?" was William Rowan Hamilton, circa 1840.



Sir William Rowan Hamilton
4 August 1805 — 2 September 1865

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## Hamilton's epiphany: 16 October 1843

at the site of Hamilton's carving

"An electric circuit seemed to close; and a spark flashed forth ... Nor could I resist the impulse – unphilosophical as it may have been – to cut with a knife on a stone of Brougham Bridge, as we passed it, the fundamental formula with the symbols, i, j, k; namely,

$$i^2 = j^2 = k^2 = ijk = -1$$

which contains the Solution of the Problem..."

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The plaque on Broome Bridge in Dublin, Ireland, commemorating the legendary location where Hamilton conceived of the idea of quaternions. (Photo taken July 2012).

## ...the author on Broome Bridge...



Yes, I have actually been there!

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### The Belt Trick

## Quaternion Geometry in our daily lives

- Two people hold ends of a belt.
- Twist the belt either 360 degrees or 720 degrees.
- Rule: Move belt ends any way you like but do not change orientation of either end.
- Try to straighten out the belt.

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### 360 Degree Belt



360 twist: stays twisted, can change DIRECTION!

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### 720 Degree Belt



720 twist: CAN FLATTEN OUT WHOLE BELT!

### The Beltless Trick

# Quaternion Geometry is right in your hand!

 Hold a coffee cup (empty is a good idea) in the palm of your hand.

Put a ball on a flat table.
 Place hand flat on top of the ball

**Rolling Ball Puzzle** 

3. Make circular rubbing motion, as though polish-

 Keeping the cup vertical, user your hand to twist the handle, first by 360 degrees (painful).

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small clockwise circles

4. Watch a point on the equator of the ball.

ing the tabletop.

6. small counterclockwise circles →

equator goes counterclockwise

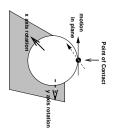
equator goes clockwise

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- Now CONTINUE another 360 degrees, for a total of 720 degrees.
- Your arm is once again STRAIGHT.

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### Rolling Ball Scenario









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#### Gimbal Lock

**Gimbal Lock** occurs when a mechanical or computer system experiences an anomaly due to an (x, y, z)-based orientation control sequence.

- Mechanical systems cannot avoid all possible gimbal lock situations.
- Computer orientation interpolation systems can avoid gimbal-lock-related glitches by using quaternion interpolation.

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# Mechanical Gimbal Lock: Using x, y, z axes to encode orientation gives singular situations.

## Gimbal Lock — Apollo Systems



Red-painted area = Danger of real Gimbal Lock

#### 2D Rotations

- 2D rotations ↔ *complex numbers*.
- Why?  $e^{i\theta}(x+iy) = (x'+iy')$

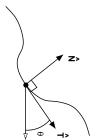
$$x' = x \cos \theta - y \sin \theta$$
$$y' = x \sin \theta + y \cos \theta$$

Complex numbers are a subspace of quaternions — so exploit 2D rotations to introduce us
 to quaternions and their geometric meaning.

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#### Frames in 2D

The tangent and normal to 2D curve move continuously along the curve:



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### Frame Matrix in 2D

This motion is described at each point (or time) by the matrix:

$$R_2(\theta) = \left[ \hat{\mathbf{T}} \hat{\mathbf{N}} \right]$$

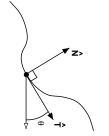
$$\left[ \cos \theta - \sin \theta \right]$$

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

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#### Frames in 2D

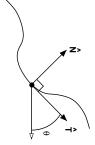
The tangent and normal to 2D curve move continuously along the curve:



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#### Frames in 2D

The tangent and normal to 2D curve move continuously along the curve:



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#### The Belt Trick Says:

There is a Problem...at least in 3D

How do you get  $\cos\theta$  to know about 720 degrees?

#### The Belt Trick Says:

There is a Problem...at least in 3D

Let  $a = \cos(\theta/2)$ ,  $b = \sin(\theta/2)$ ,

A Fix for the Problem?

Half-Angle Transform:

(i.e.,  $\cos \theta = a^2 - b^2$ ,  $\sin \theta = 2ab$ ),

and parameterize 2D rotations as:

 $R_2(a,b) = \begin{bmatrix} a^2 - b^2 & -2ab \\ 2ab & a^2 - b^2 \end{bmatrix}$ .

How do you get  $\cos \theta$  to know about 720 degrees?

Hmmmmm.  $cos(\theta/2)$  knows about 720 degrees, right?

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### Frame Evolution in 2D

First use  $\theta(t)$  coordinates: Examine the time-evolution of a 2D frame (on our way to 3D).

$$\begin{bmatrix} \hat{\mathbf{T}} \ \hat{\mathbf{N}} \end{bmatrix} = \begin{bmatrix} \cos\theta & -\sin\theta \\ \sin\theta & \cos\theta \end{bmatrix}.$$

Differentiate to find frame equations:

$$\hat{\mathbf{T}}(t) = +\kappa \hat{\mathbf{N}}$$

$$\hat{\mathbf{N}}(t) = -\kappa \hat{\mathbf{T}},$$

where  $\kappa(t) = d\theta/dt$  is the curvature.

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## 2D Quaternion Frames!

Rearranging terms, both  $\hat{T}$  and  $\hat{N}$  eqns reduce to

$$\begin{bmatrix} \dot{a} \\ \dot{b} \end{bmatrix} = \frac{1}{2} \begin{bmatrix} 0 & -\kappa \\ +\kappa & 0 \end{bmatrix} \cdot \begin{bmatrix} a \\ b \end{bmatrix}$$

This is the square root of frame equations.

which reduces back to  $a^2 + b^2 = 1$ .

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 $(a^2 + b^2)^2 = 1$ 

where orthonormality implies

### Frame Evolution in (a, b):

freedom. The basis  $(\hat{T},\hat{N})$  is nasty — Four equations with Three constraints from orthonormality, but just One true degree of

**Major Simplification** occurs in (a,b) coordinates!!

$$\hat{\mathbf{T}} = 2 \begin{bmatrix} a\dot{a} - b\dot{b} \\ a\dot{b} + b\dot{a} \end{bmatrix} = 2 \begin{bmatrix} a & -b \\ b & a \end{bmatrix} \begin{bmatrix} \dot{a} \\ \dot{b} \end{bmatrix}$$

Frame Evolution in (a, b):

But this formula for  $\hat{\mathbf{T}}$  is just  $\kappa \hat{\mathbf{N}}$ , where

$$\kappa \hat{\mathbf{N}} = \kappa \begin{bmatrix} -2ab \\ a^2 - b^2 \end{bmatrix} = \kappa \begin{bmatrix} a & -b \\ b & a \end{bmatrix} \begin{bmatrix} -b \\ a \end{bmatrix}$$

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$$\kappa \hat{\mathbf{N}} = \kappa \begin{bmatrix} a & -b \\ b & a \end{bmatrix} \begin{bmatrix} \mathbf{0} & -\mathbf{1} \\ \mathbf{1} & \mathbf{0} \end{bmatrix} \begin{bmatrix} a \\ b \end{bmatrix}$$

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#### 2D Quaternions . . .

So one equation in the two "quaternion" variables (a,b) with the constraint  $a^2+b^2=1$  contains *both* the frame equations

$$\hat{\mathbf{T}} = +\kappa \hat{\mathbf{N}}$$

$$\hat{\mathbf{N}} = -\kappa \hat{\mathbf{T}}$$

 $\Rightarrow$  this is much better for computer implementation, etc.

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## Rotation with no matrices!

Due to an extremely deep reason in Clifford Algebras,

$$a + ib = e^{i\theta/2}$$

represents rotations "more nicely" than the matrices  $R(\theta)$ .

$$(a' + ib')(a + ib) = e^{i(\theta' + \theta)/2} = A + iB$$

where if we want the matrix, we write:

$$R(\theta')R(\theta) = R(\theta' + \theta) = \begin{bmatrix} A^2 - B^2 & -2AB \\ 2AB & A^2 - B^2 \end{bmatrix}$$

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### Quaternion Frames

In 3D, repeat our trick: take square root of the frame, but now use *quaternions*:

- Write down the 3D frame.
- Write as double-valued quadratic form.
- Rewrite frame evolution equations linearly in the new variables.

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## **Rotation as Complex Multiplication**

If we let  $(a+ib)=\exp{(i\,\theta/2)}$  we see that rotation is complex multiplication!

"Quaternion Frames" in 2D are just complex numbers, with

Evolution Eqns = derivative of  $\exp(i\theta/2)!$ 

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## The Algebra of 2D Rotations

The algebra corresponding to 2D rotations is easy: just complex multiplication!!

$$(a',b')*(a,b) \cong (a'+ib')(a+ib)$$

$$= a'a - b'b + i(a'b + ab')$$

$$\cong (a'a - b'b, a'b + ab')$$

$$= (A B)$$

2D Rotations are just complex multiplication, and take you around the unit circle!

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## The Geometry of 3D Rotations

We begin with a basic fact:

**Euler theorem:** *every* 3D frame can be written as a spinning by  $\theta$  about a fixed axis  $\hat{\mathbf{n}}$ , the eigenvector of the rotation matrix:



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#### Quaternion Frames ...

The Matrix  $R_3(\theta,\hat{\mathbf{n}})$  giving 3D rotation by  $\theta$  about axis  $\hat{\mathbf{n}}$  is :

$$\begin{bmatrix} c + (n_1)^2 (1-c) & n_1 n_2 (1-c) - s n_3 & n_3 n_1 (1-c) + s n_2 \\ n_1 n_2 (1-c) + s n_3 & c + (n_2)^2 (1-c) & n_3 n_2 (1-c) - s n_1 \\ n_1 n_3 (1-c) - s n_2 & n_2 n_3 (1-c) + s n_1 & c + (n_3)^2 (1-c) \end{bmatrix}$$

where  $c = \cos \theta$ ,  $s = \sin \theta$ , and  $\hat{\mathbf{n}} \cdot \hat{\mathbf{n}} = 1$ .

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## **Rotations and Quadratic Polynomials**

Remember  $(n_1)^2 + (n_2)^2 + (n_3)^2 = 1$  and  $a^2 + b^2 = 1$ ; letting

$$q_0 = a = \cos(\theta/2)$$
  $\mathbf{q} = b\hat{\mathbf{n}} = \hat{\mathbf{n}}\sin(\theta/2)$ 

We find a matrix  $R_3(q)$ 

$$\begin{bmatrix} q_0^2 + q_1^2 - q_2^2 - q_3^2 & 2q_1q_2 - 2q_0q_3 & 2q_1q_3 + 2q_0q_2 \\ 2q_1q_2 + 2q_0q_3 & q_0^2 - q_1^2 + q_2^2 - q_3^2 & 2q_2q_3 - 2q_0q_1 \\ 2q_1q_3 - 2q_0q_2 & 2q_2q_3 + 2q_0q_1 & q_0^2 - q_1^2 - q_2^2 + q_3^2 \end{bmatrix}$$

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## Quaternions and Rotations . . .

WHAT happens if you do TWO rotations?

EXAMINE the action of two rotations

$$R(q')R(q) = R(Q)$$

EXPRESS in quadratic forms in q and LOOK FOR an analog of complex multiplication:

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## Can we find a 720-degree form?

Remember 2D:  $a^2+b^2=1$  then substitute  $1-c=(a^2+b^2)-(a^2-b^2)=2b^2$  to find the remarkable expression for  $\mathbf{R}(\theta,\hat{\mathbf{n}})$ :

$$\begin{bmatrix} a^2 - b^2 + (n_1)^2 (2b^2) & 2b^2 n_1 n_2 - 2ab n_3 & 2b^2 n_3 n_1 + 2ab n_2 \\ 2b^2 n_1 n_2 + 2ab n_3 & a^2 - b^2 + (n_2)^2 (2b^2) & 2b^2 n_2 n_3 - 2ab n_1 \\ 2b^2 n_3 n_1 - 2ab n_2 & 2b^2 n_2 n_3 + 2ab n_1 & a^2 - b^2 + (n_3)^2 (2b^2) \end{bmatrix}$$

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## Quaternions and Rotations ...

HOW does  $q = (q_0, \mathbf{q})$  represent rotations?

LOOK at

$${}^{?}_{R_3(\theta,\,\hat{\mathbf{n}})} = {}^{R_3(q_0,\,q_1,\,q_2,\,q_3)}$$

THEN we can verify that choosing

$$q(\theta, \hat{\mathbf{n}}) = (\cos \frac{\theta}{2}, \, \hat{\mathbf{n}} \sin \frac{\theta}{2})$$

makes the  $R_3$  equation an *IDENTITY*.

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Quaternions and Rotations ...

RESULT: the following multiplication rule

q'\*q=Q yields **exactly** the correct  $3\times 3$  rotation matrix R(Q):

$$\begin{bmatrix} Q_0 = [q'*q]_0 \\ Q_1 = [q'*q]_1 \\ Q_2 = [q'*q]_2 \\ Q_3 = [q'*q]_3 \end{bmatrix} = \begin{bmatrix} q'_0q_0 - q'_1q_1 - q'_2q_2 - q'_3q_3 \\ q'_0q_1 + q'_1q_0 + q'_2q_3 - q'_3q_2 \\ q'_0q_2 + q'_2q_0 + q'_3q_1 - q'_1q_3 \\ q'_0q_3 + q'_3q_0 + q'_1q_2 - q'_2q_1 \end{bmatrix}$$

## This is Quaternion Multiplication.

### Algebra of Quaternions = 3D Rotations!

2D rotation matrices are represented by complex multiplication

is replaced by 4D quaternion multiplication:

 $q'*q = (q'_0q_0 - q'_1q_1 - q'_2q_2 - q'_3q_3,$ 

 $q'_0q_1 + q'_1q_0 + q'_2q_3 - q'_3q_2,$ 

 $q'_0q_2 + q'_2q_0 + q'_3q_1 - q'_1q_3,$  $q'_0q_3 + q'_3q_0 + q'_1q_2 - q'_2q_1)$ 

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Therefore in 3D, the 2D complex multiplication

Algebraic 2D/3D Rotations

(a',b')\*(a,b) = (a'a - b'b, a'b + ab')

3D rotation matrices are represented by quaternion multiplication

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### Algebra of Quaternions . . .

The equation is easier to remember by dividing it into a *scalar* piece  $q_0$  and a *vector* piece  $\vec{q}$ :

$$q' * q = (q'_0 q_0 - \vec{\mathbf{q}'} \cdot \vec{\mathbf{q}},$$
$$q'_0 \vec{\mathbf{q}} + q_0 \vec{\mathbf{q}'} + \vec{\mathbf{q}'} \times \vec{\mathbf{q}})$$

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We can now make a Quaternion Picture of each of our favorite tricks

- 360° Belt Trick in Quaternion Form. DEMO:
- 720° Belt Trick in Quaternion Form.
- Rolling Ball in Quaternion Form. DEMO:
- Gimbal Lock in Quaternion Form.

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## Now we can SEE quaternions!

Since  $(q_0)^2 + \mathbf{q} \cdot \mathbf{q} = 1$  then

$$q_0 = \sqrt{1 - \mathbf{q} \cdot \mathbf{q}}$$

Plot just the 3D vector:  $q = (q_x, q_y, q_z)$ 

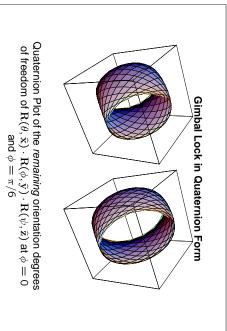
 $q_0$  is KNOWN! We can also use any other triple: the fourth component is *dependent*.

#### DEMO

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360° Belt Trick in Quaternion Form

## 720° Belt Trick in Quaternion Form 49



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## **Quaternion Interpolations**

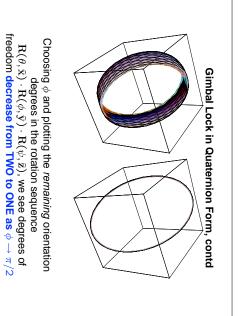
• Shoemake (Siggraph '85) proposed using quaternions instead of Euler angles to get smooth frame interpolations without Gimbal Lock:

tations represented on  $S^3$  by quaternions BEST CHOICE: Animate objects and cameras using ro-

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#### q vector-only plot. **Rolling Ball in Quaternion Form** $(q_0,q_x,q_z)$ plot

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### Interpolating on Spheres

a constant angular velocity transition between two directions, General quaternion spherical interpolation employs the "SLERP,"

 $\widehat{q}_1$  and  $\widehat{q}_2$ :

$$\begin{aligned} \hat{\mathbf{q}}_{12}(t) &= \mathsf{Slerp}(\hat{\mathbf{q}}_1, \hat{\mathbf{q}}_2, t) \\ &= \hat{\mathbf{q}}_1 \frac{\mathsf{sin}((1-t)\theta)}{\mathsf{sin}(\theta)} + \hat{\mathbf{q}}_2 \frac{\mathsf{sin}(t\theta)}{\mathsf{sin}(\theta)} \end{aligned}$$

where  $\cos \theta$  $= \widehat{q}_1 \cdot \widehat{q}_2$ 

#### Plane Interpolations

In Euclidean space, these three basic cubic splines look like this:



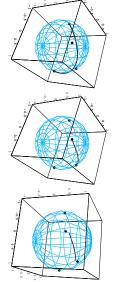
Catmull-Rom

Bezier

Uniform B

The differences are in the derivatives: Bezier has to start matching all over at every fourth point; Catmull-Rom matches the first derivative; and B-spline is the cadillac, matching all derivatives but *no control points*.

## Spherical Interpolations



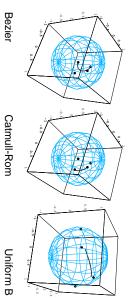
Bezier

Catmull-Rom

Uniform B

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### Quaternion Interpolations



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Bezier

Catmull-Rom

## Exp Form of Quaternion Rotations

In Hamilton's notation, we can generalize the 2D equation

$$a + ib = e^{i\theta/2}$$

Just set

$$q = (q_0, q_1, q_2, q_3)$$
  
=  $q_0 + iq_1 + jq_2 + kq_3$ 

$$= q_0 + iq_1 + jq_2 + kq_3$$

$$= e^{(1\cdot \hat{\mathbf{n}}\theta/2)}$$

$$= e^{(1\cdot \hat{\mathbf{n}}\theta/2)}$$
 and  $\vec{\mathbf{q}} = \hat{\mathbf{n}}\sin(\theta/2)$  and

with  $q_0=\cos(\theta/2)$  and  $\vec{q}=\hat{n}\sin(\theta/2)$  and I=(i,j,k), with  $i^2=j^2=k^2=-1$ , and i\*j=k (cyclic),

### **Cute Quaternion Tricks!**

### Square Roots are cool...

A quaternion p is the **square root** of a quaternion q if

$$p*p=q\;.$$

A hint: remember that if  $c = \cos \theta$ , and  $\gamma = \cos(\frac{\theta}{2})$ , then

$$\gamma = \sqrt{\frac{1+c}{2}} = \frac{1+c}{\sqrt{2(1+c)}}$$

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### Cute Quaternion Tricks...

Suppose we now look at  $1+q=(1+q_0,\mathbf{q})$ . Then

$$(1+q)*(1+q) = ((1+q_0)^2 - \mathbf{q} \cdot \mathbf{q}, 2\mathbf{q}(1+q_0))$$
  
= 2(1+q<sub>0</sub>)q

Dividing through by  $2(1+q_0)$ , we find the **square root:** 

$$p = \sqrt{q} = \frac{1+q}{\sqrt{2(1+q_0)}}$$

#### Tricks, contd: Lining up â and

There is a simple quaternion form for this operation. Let A common rotation task is to line up two directions,  $\mathbf{\hat{a}}$  and  $\mathbf{\hat{b}}$ 

$$\hat{\mathbf{a}} \cdot \hat{\mathbf{b}} = \cos \theta = c$$
,  $\hat{\mathbf{a}} \times \hat{\mathbf{b}} = \hat{\mathbf{n}} \sin \theta$ 

rotation from  $\widehat{\mathbf{a}}$  to  $\widehat{\mathbf{b}}$  using, again, the half-angle formula: where we assume  $\sin \theta > 0$ . Then we can compute the

$$R(\hat{\mathbf{a}}, \hat{\mathbf{b}}) = (\cos(\theta/2), \hat{\mathbf{n}} \sin(\theta/2))$$
$$= \left(\sqrt{\frac{1+c}{2}}, \hat{\mathbf{a}} \times \hat{\mathbf{b}} \sqrt{\frac{1}{2(1+c)}}\right)$$

where we also used  $\sin \theta = 2\cos(\theta/2)\sin(\theta/2)$ 

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#### Clifford Algebras

 All Rotations in any dimension are represented by two reflections using Clifford Algebra:

flection planes,  $A \cdot A = B \cdot B = 1$ . A and B define the perpendicular directions to two re-

 Create Rotation Matrix R and solve for the Quaternion, and you amazingly get THIS:

$$q(A, B) = (A \cdot B, A \times B)$$

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## Clifford Algebra Quaternion Form ...

## Why is this a quaternion form?

$$q \cdot q = (\mathbf{A} \cdot \mathbf{B})^2 + (\mathbf{A} \times \mathbf{B}) \cdot (\mathbf{A} \times \mathbf{B})$$
  
=  $(\mathbf{A} \cdot \mathbf{A}) (\mathbf{B} \cdot \mathbf{B})$   
= 1

If Quaternions are like the Square Roots of Rotations, then Clifford Algebras are like the Square Roots of Quaternions!

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## **Key to Quaternion Intuition**

Fundamental Intuition: We know

$$q_0 = \cos(\theta/2), \ \vec{\mathbf{q}} = \hat{\mathbf{n}}\sin(\theta/2)$$

We also know that *any coordinate frame* M can be written as  $M=R(\theta,\hat{\mathbf{n}}).$ 

Therefore

 $\vec{\mathbf{q}}$  tells us how much to rotate.  $\vec{\mathbf{q}}$  points exactly along the axis we have to rotate around to go from identity I to M, and the length of

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## Summarize Quaternion Properties

- ullet Unit four-vector. Take q=obey constraint  $q \cdot q =$  $(q_0, q_1, q_2, q_3) = (q_0, \vec{\mathbf{q}})$  to
- $q * p = (q_0 p_0 \vec{\mathbf{q}} \cdot \vec{\mathbf{p}}, q_0 \vec{\mathbf{p}} + p_0 \vec{\mathbf{q}} + \vec{\mathbf{q}} \times \vec{\mathbf{p}}),$ Multiplication rule. The quaternion product  $\boldsymbol{q}$  and  $\boldsymbol{p}$  is

or, alternatively,

$$\begin{bmatrix} [q*p]_0 \\ [q*p]_1 \\ [q*p]_1 \end{bmatrix} = \begin{bmatrix} q_0p_0 - q_1p_1 - q_2p_2 - q_3p_3 \\ q_0p_1 + q_1p_0 + q_2p_3 - q_3p_2 \\ q_0p_2 + q_2p_0 + q_3p_1 - q_1p_3 \\ q_0p_3 + q_3p_0 + q_1p_2 - q_2p_1 \end{bmatrix}$$

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### Quaternion Summary . . .

Rotation Correspondence. The unit quaternions q and q correspond to a single 3D rotation  $R_3$ :

$$\begin{bmatrix} q_0^2+q_1^2-q_2^2-q_3^2 & 2q_1q_2-2q_0q_3 & 2q_1q_3+2q_0q_2 \\ 2q_1q_2+2q_0q_3 & q_0^2-q_1^2+q_2^2-q_3^2 & 2q_2q_3-2q_0q_1 \\ 2q_1q_3-2q_0q_2 & 2q_2q_3+2q_0q_1 & q_0^2-q_1^2-q_2^2+q_3^2 \end{bmatrix}$$

 $q=(\cos\frac{\theta}{2},\hat{\mathbf{n}}\sin\frac{\theta}{2})\;,$  with  $\hat{\mathbf{n}}$  a unit 3-vector,  $\hat{\mathbf{n}}\cdot\hat{\mathbf{n}}=1$ . Then  $R(\theta,\hat{\mathbf{n}})$  is usual 3D rotation by  $\theta$  in the plane  $\perp$  to  $\hat{\mathbf{n}}$ .

		• Quaternions represent 3D frames • Quaternion multiplication represents 3D rotation • Quaternions are points on a hypersphere • Quaternions paths can be visualized with 3D display • Belt Trick, Rolling Ball, and Gimbal Lock can be understood as Quaternion Paths.