

6.2 Quaternions

...or, adventures on the 4D unit sphere

Jaakko Lehtinen
with lots of slides from Frédo Durand

Video on YouTube

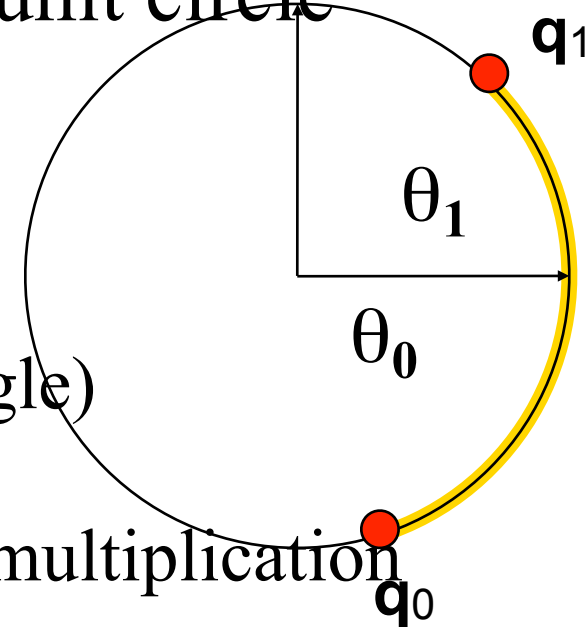
- Watch the fantastic video by Grant Sanderson (3Blue1Brown)
- These slides are only for your reference!

In These Slides

- Quaternions
 - Warmup: 2D rotations and complex numbers
 - Spherical linear interpolation (slerp)
 - Representing rotations using quaternions

1D Sphere and Complex Plane

- Represent 2D rotation by point on unit circle
 - 2 coordinates but only 1 DOF
- Let's take the 2D plane to be the complex plane
 - Orientation = complex argument (angle)
 - Unit circle = complex magnitude is 1
 - composition of rotation \Leftrightarrow complex multiplication
 - Trivial with exponential notation $re^{i\theta}$



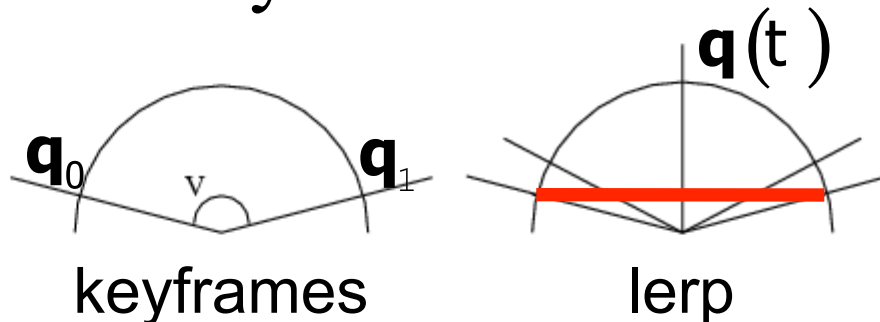
- Remember homogeneous coordinates? Adding a dimension can make life easier.
- Interpolation of angle is easy: Just slide the point along the circle.

Velocity Issue: lerp vs. slerp

- Linear Interpolation (lerp) between the 2D points interpolates the straight line between the two orientations

$$\text{lerp}(\mathbf{q}_0, \mathbf{q}_1, t) = \mathbf{q}(t) = \mathbf{q}_0 (1 - t) + \mathbf{q}_1 t$$

- Renormalize $\mathbf{q}(t)$ to lie on the circle again
- \rightarrow lerp motion does not have uniform angular velocity



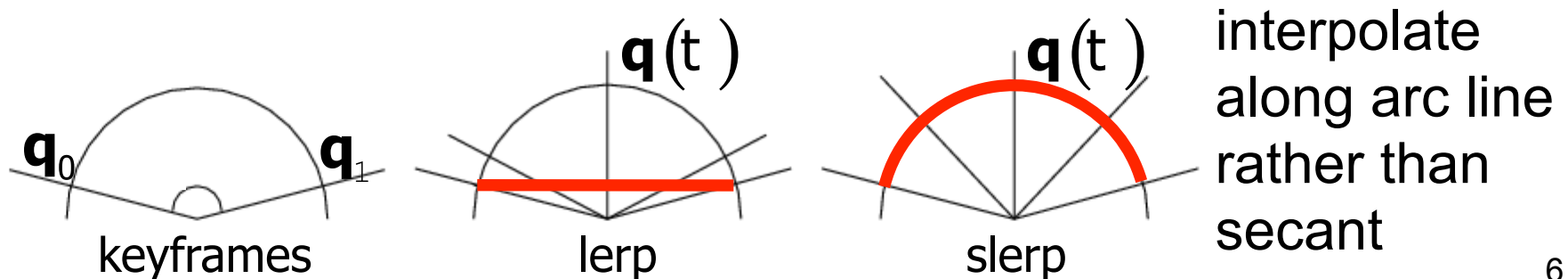
Velocity Issue: lerp vs. slerp

- Spherical Linear Interpolation (slerp) interpolates along the arc lines by adding a sine term:

$$\text{slerp}(\mathbf{q}_0, \mathbf{q}_1, t) = \mathbf{q}(t) = \frac{\mathbf{q}_0 \sin((1-t)\omega) + \mathbf{q}_1 \sin(t\omega)}{\sin(\omega)},$$

where ω is the angle between \mathbf{q}_0 and \mathbf{q}_1

- We still interpolate in 2D plane, but along an arc
- Silly to make things so complex in 2D, but will be critical in 3D



Velocity Issue: lerp vs. slerp

Brain teasers

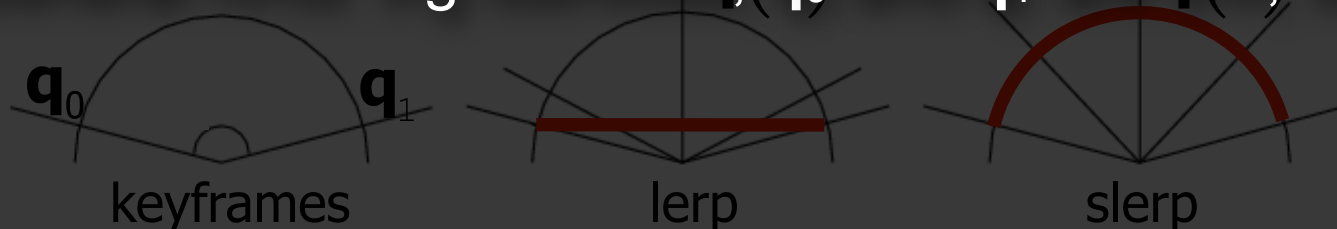
- Linear Interpolation (lerp) interpolates the straight line between the two orientations

$$\text{lerp}(\mathbf{q}_0, \mathbf{q}_1, t) = \mathbf{q}(t) = \mathbf{q}_0(1-t) + \mathbf{q}_1t$$

Can you prove that...

- lerp motion does not have uniform angular velocity
- 1) slerp produces a constant-speed curve?
- 2) the result is always a unit vector when \mathbf{q}_0 and \mathbf{q}_1 are unit vectors?

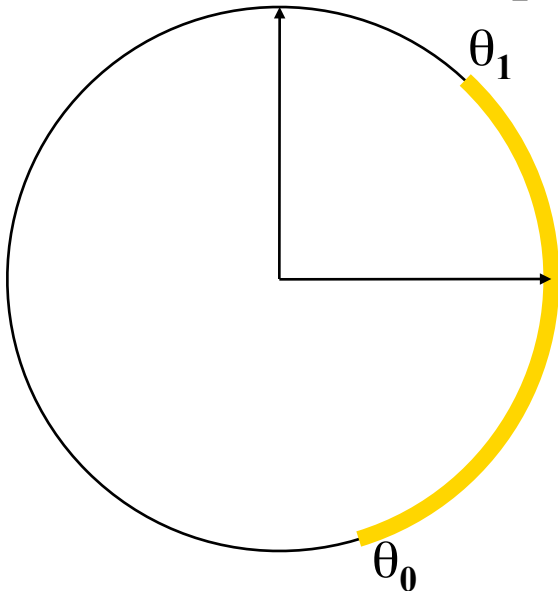
- where ω is the angle between \mathbf{q}_0 and \mathbf{q}_1
 - We still interpolate in 2D plane at unit speed, but along an arc
 - (Hint for 1: Differentiate w.r.t. t , take magnitude, trig identities)
 - Silly to make things so complex in 2D, but will be critical in 3D.
- General hints: trig identities, \mathbf{q}_0 and \mathbf{q}_1 are unit, definition of ω



interpolate
along arc line
rather than
secant

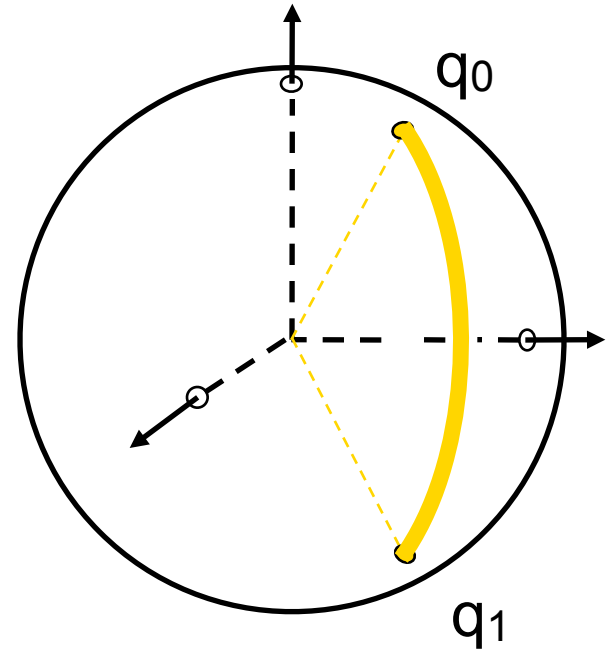
Questions?

- Recap
 - plane rotation in 2D: a point on unit circle
 - complex number interpretation
 - use slerp for uniform speed
 - works on the sphere in any dimension



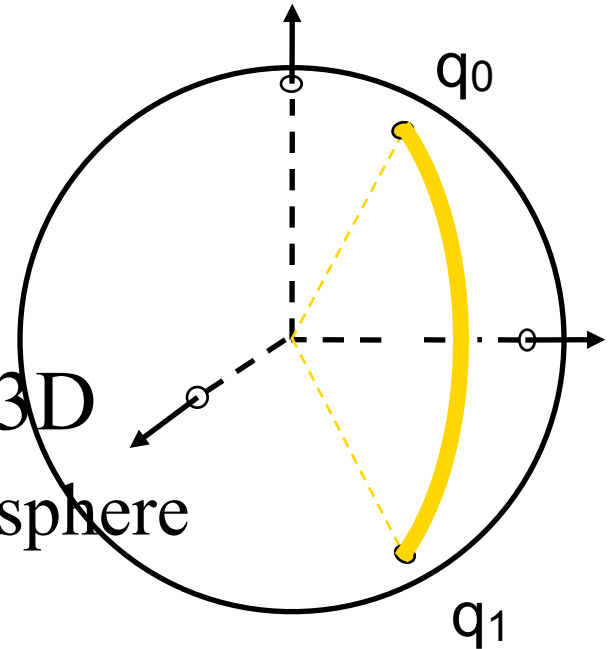
2-DOF Orientation

- Can represent by 2 angles
 - But this is messy because modulo 2π and pole...



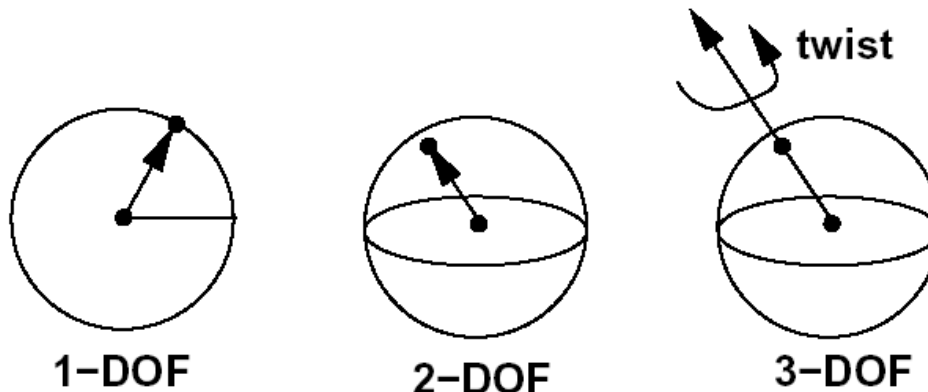
(2-DOF Orientation)

- Can represent by 2 angles
 - But this is messy because modulo 2π and pole...
- Solution: Embed 2-sphere in 3D
 - Interpolate 3D points on the 2-sphere along great circles
 - When done interpolating, convert the point back to angles
- Use slerp for uniform velocity & to stay on sphere
 - Note that it's still a 1D problem along the great circle
 - \mathbf{q}_0 and \mathbf{q}_1 are now 3D points



3 DOF – Quaternions!

- Use the same principle
 - interpolate on higher-dimensional sphere
 - use slerp formula to get uniform angular velocity, stay on 3-sphere
- 3-sphere embedded in 4D
 - More complex, harder to visualize
 - A point on 3-sphere corresponds to an 3D orientation



Quaternions: Hypercomplex Numbers

- Due to Hamilton (1843)
- Can be defined like complex numbers but with 4 coordinates
 - $d+ai+bj+ck$
 - One real part (d), three imaginary ones.
- Based on three different roots of -1:
 - $i^2 = j^2 = k^2 = -1$
 - and weird multiplication rules
 - $ij = k = -ji$
 - $jk = i = -kj$
 - $ki = j = -ik$



Quaternions: Hypercomplex Numbers

- Due to Hamilton (1843)
- Can be defined like complex numbers but with 4 coordinates
 - $d+ai+bj+ck$
 - One real part (d), three imaginary ones.
- Or defined with an imaginary part \mathbf{v} that is a 3D vector:
 - (s, \mathbf{v})
 - simpler notation

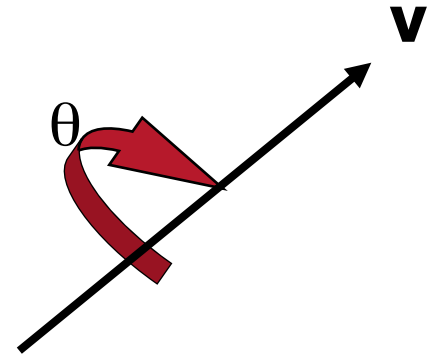


Quaternions: Rotation

- Rotations represented by **unit** vectors in 4D

- Right-hand rotation of θ radians about \mathbf{v} :

$$\mathbf{q} = (\cos(\theta/2); \mathbf{v} \sin(\theta/2)),$$



- Notes

- **unit** quaternions are restricted to the unit 3-sphere in 4D (by definition of the unit sphere)

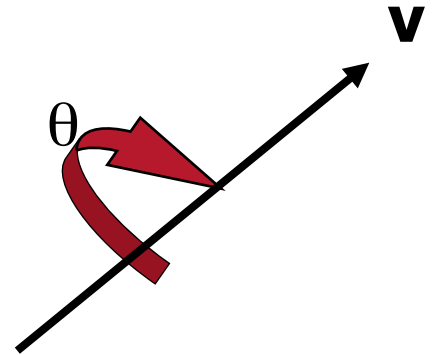
- \mathbf{q} & $-\mathbf{q}$ represent the same orientation

- Why? (Hint: Graphs of sine and cosine, what happens to angle when axis flips if rotation is to remain same?)

- Resembles axis-angle, but with the sines and cosines

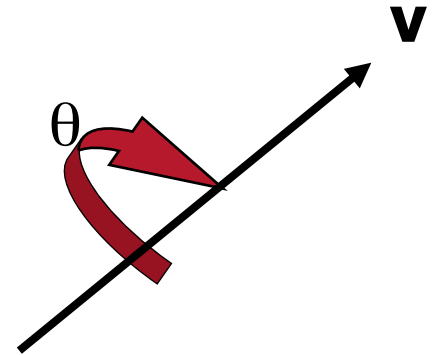
Quaternions: Identity

- Rotations represented by **unit** vectors in 4D
 - Right-hand rotation of θ radians about \mathbf{v} :
 $\mathbf{q} = (\cos(\theta/2); \mathbf{v} \sin(\theta/2))$,
- Identity orientation?



Quaternions: Identity

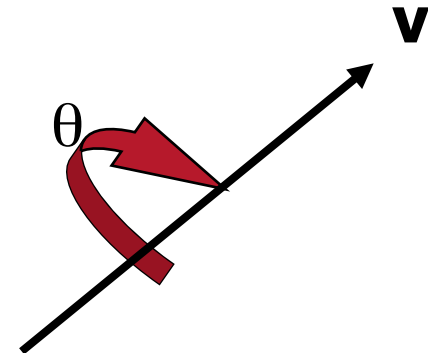
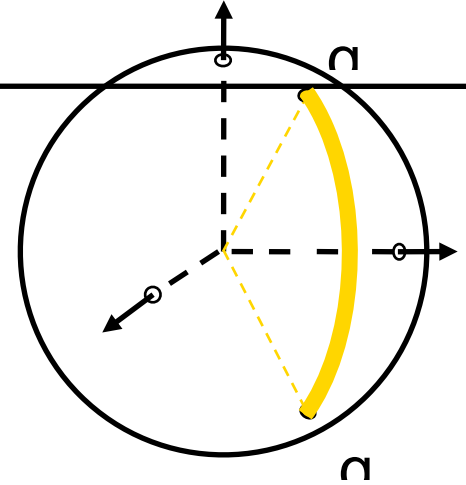
- Rotations represented by **unit** vectors in 4D
 - Right-hand rotation of θ radians about \mathbf{v} :
 $\mathbf{q} = (\cos(\theta/2); \mathbf{v} \sin(\theta/2))$,



- Identity orientation?
 - θ is zero \Rightarrow scalar part = 1
 - Axis can be arbitrary, but since we want a unit quaternion $\Rightarrow \mathbf{q} = (1, \mathbf{0})$
 - BUT: Can also take $\mathbf{q} = (-1, \mathbf{0})$
 - \mathbf{q} & $-\mathbf{q}$ represent the same rotation, remember

Question?

- Recap:
 - Rotation in 2D embedded on unit circle
 - complex number interpretation
 - slerp for uniform speed
 - works on the sphere in any dimension
 - Quaternions
 - 4D extension of complex numbers
 - rotations = unit quaternions (on 3-sphere)
 - $(\cos(\theta/2); \mathbf{v} \sin(\theta/2))$: rotation of θ around \mathbf{v}



Interpolating Rotations

- Given two unit quaternions, we want to interpolate
- Use slerp!
 - Works on the sphere in any dimension

$$\text{slerp}(\mathbf{q}_0, \mathbf{q}_1, t) = \mathbf{q}(t) = \frac{\mathbf{q}_0 \sin((1-t)\omega) + \mathbf{q}_1 \sin(t\omega)}{\sin(\omega)},$$

- Where ω is still the angle between \mathbf{q}_0 and \mathbf{q}_1 like in 2D
- Note: This is again a linear combination of \mathbf{q}_0 and \mathbf{q}_1

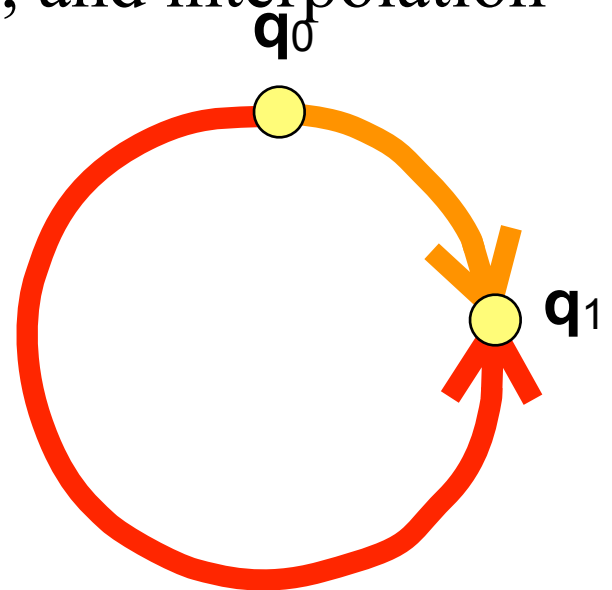
Linear Combination of

- Just like vectors, just like complex numbers!
- Addition: Componentwise
 - $(s, \mathbf{v}) + (s', \mathbf{v}') = (s+s', \mathbf{v}+\mathbf{v}')$
- Multiplication by scalar
 - $t(s, \mathbf{v}) = (ts, t\mathbf{v})$

$$\text{slerp}(\mathbf{q}_0, \mathbf{q}_1, t) = \mathbf{q}(t) = \frac{\mathbf{q}_0 \sin((1-t)\omega) + \mathbf{q}_1 \sin(t\omega)}{\sin(\omega)},$$

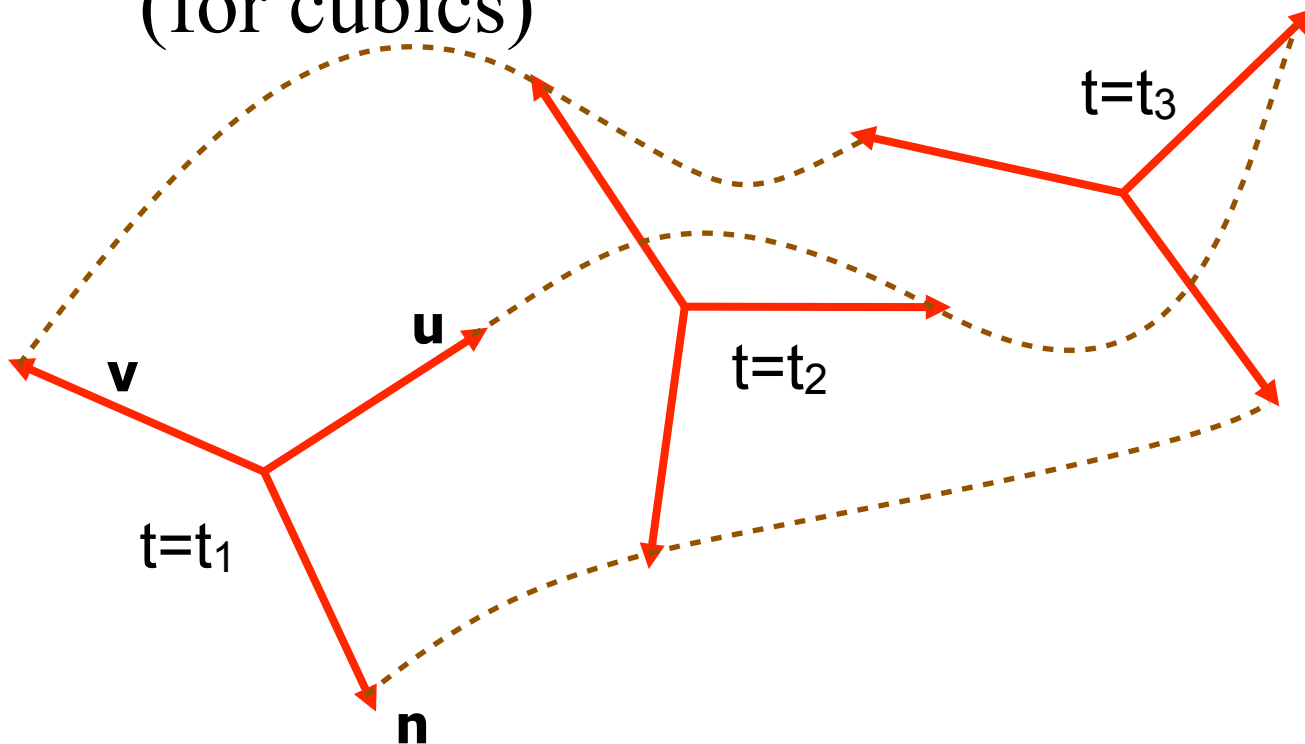
You Might Need To Invert q

- Recall: q & $-q$ represent the same rotation
- Given q_0 and q_1 , test the angle (in 4D!)
 - If dot product of q_0 and q_1 is negative, they are on opposite sides of the hypersphere, and interpolation will take the longer route (red)
 - If this is the case, just use $-q_1$ instead of q_1



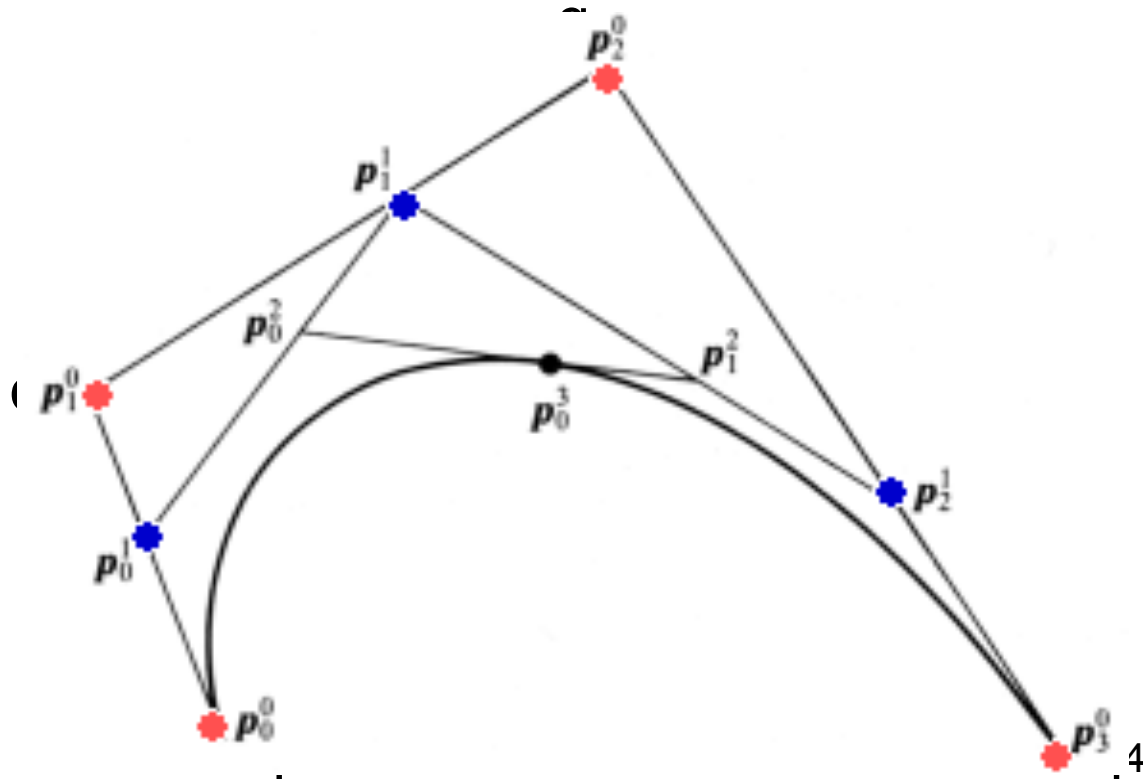
Problem with Splines

- Slerp only works to interpolate between **two** positions
- For splines, we need to blend more, typically 4 (for cubics)



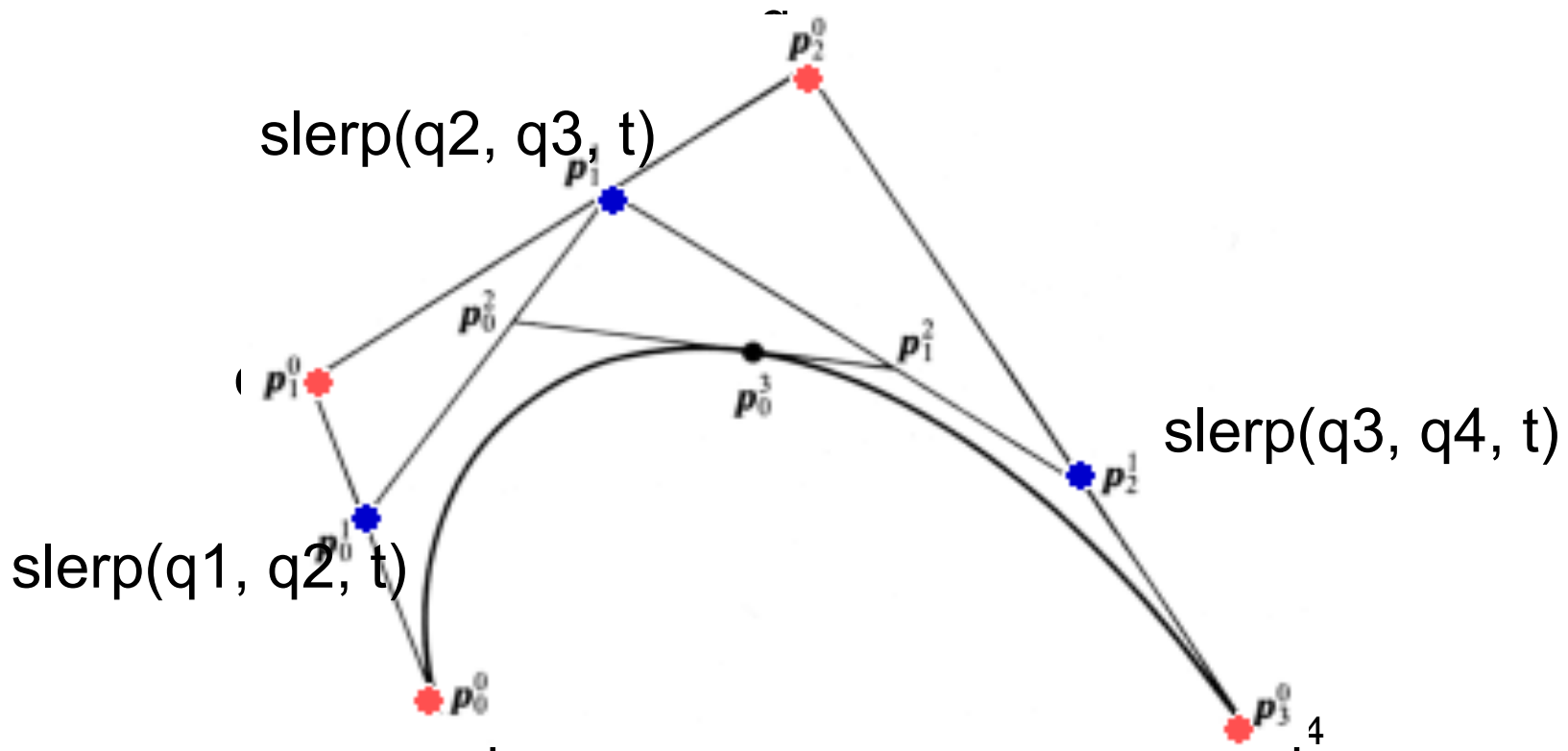
De Casteljau Construction w/ Slerp

- Remember what we did with cubic Bézier curves!
- Works to construct a point at any t
 - Only requires interpolation between pairs of points



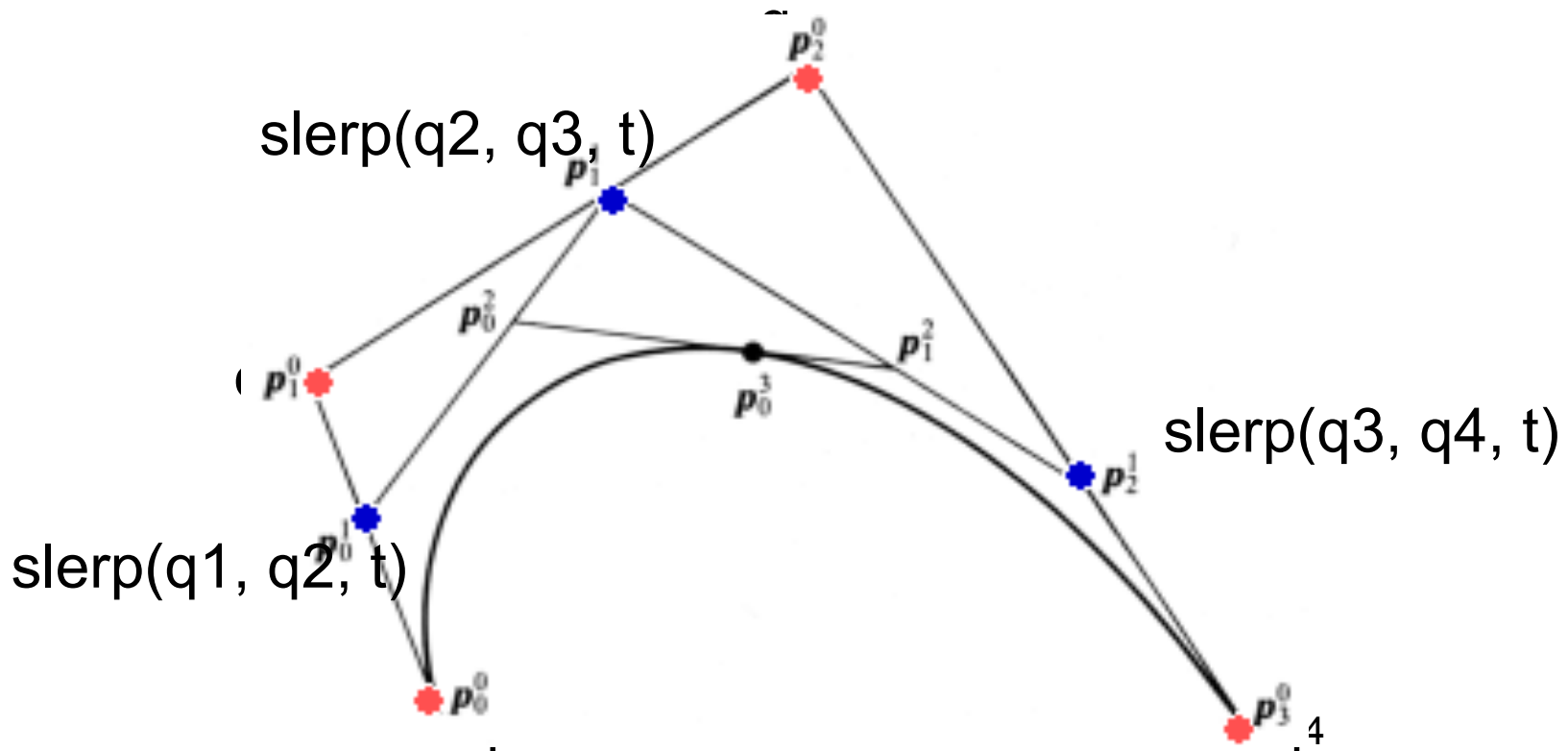
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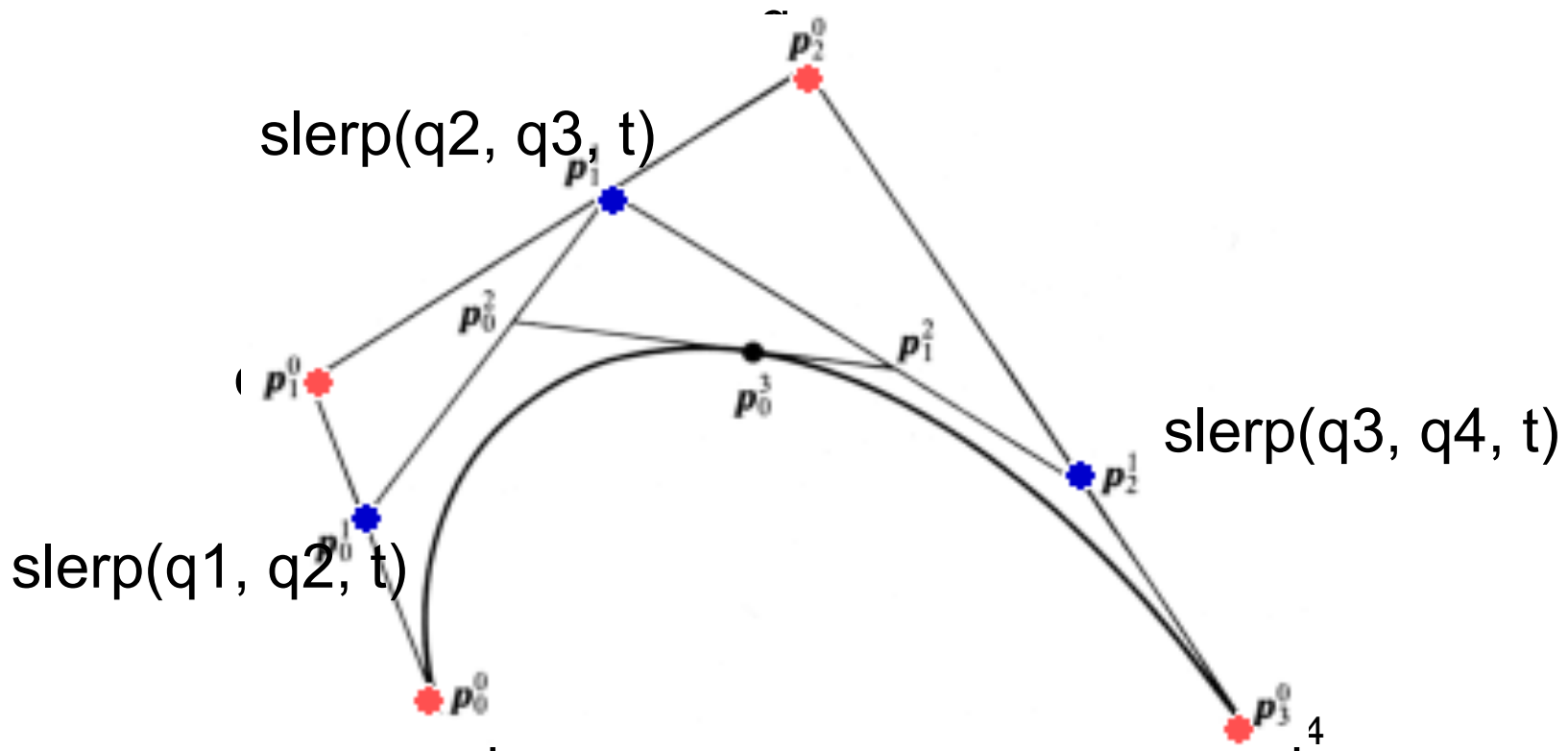
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De Casteljau Construction w/ Slerp

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**This is an easy-ish
extra in Assignment 2!**

Extensions

- Better interpolation
 - E.g. minimize acceleration, velocity constraint
 - http://www.gg.caltech.edu/STC/rr_sig97.html
 - <http://portal.acm.org/citation.cfm?id=218486&dl=ACM&coll=portal&CFID=1729050&CFTOKEN=74418864>
 - <http://portal.acm.org/citation.cfm?id=134086&dl=ACM&coll=portal&CFID=1729050&CFTOKEN=74418864>

From Kim et al. 1995

Cookbook Recipe

- You need matrices to draw (e.g. OpenGL)
- General approach for 3 DOF rotations
 - Store keyframe orientations as quaternions
 - Interpolate between them using slerp (pairwise) or slerp + De Casteljau (splines)
 - Convert to quaternion to matrix
 - Profit.
 - (Or, store matrices, convert to quaternions for interpolation, then convert back.)

Cookbook Recipe

- You need matrices to draw (e.g. OpenGL)
- General approach for 3 DOF rotations
 - Store keyframe orientations as quaternions
 - Interpolate between them using slerp (pairwise) or slerp + De Casteljau (splines)
 - Convert to quaternion to matrix
 - Profit.
- Often need to convert from matrix to quaternion.
 - **Next:** Conversion to/from matrices.

Quaternion to Rotation Matrix

- Quaternion (q_0, q_1, q_2, q_3) corresponds to matrix

$$\begin{pmatrix} 1 - 2q_2^2 - 2q_3^2 & 2(q_1q_2 - q_3q_0) & 2(q_1q_3 + q_2q_0) \\ 2(q_1q_2 + q_3q_0) & 1 - 2q_1^2 - 2q_3^2 & 2(q_2q_3 - q_1q_0) \\ 2(q_1q_3 - q_2q_0) & 2(q_1q_0 + q_2q_3) & 1 - 2q_1^2 - 2q_2^2 \end{pmatrix}$$

- Similar to Rodrigues' rotation formula
 - but recall that quaternions use $\theta/2$
- After conversion, you can combine rotations and other affine/projective transforms!

3x3 Orthonormal Matrix to Quaternion

- More challenging (e.g., not all \mathbf{M} s are rotations)
- if \mathbf{M} is a rotation, $\text{trace}(\mathbf{M}) > 0$
then you get quaternion (s, x, y, z) through:
 - $s = \sqrt{(1 + M_{11} + M_{22} + M_{33})} / 2$
 - $x = (M_{23} - M_{32}) / (4 * s)$
 - $y = (M_{31} - M_{13}) / (4 * s)$
 - $z = (M_{12} - M_{21}) / (4 * s)$
- if $\text{trace}(\mathbf{M}) < 0$, need permutations/sign changes

General Conversion Resource

- [http://en.wikipedia.org/wiki/
Rotation_representation_%28mathematics%29](http://en.wikipedia.org/wiki/Rotation_representation_%28mathematics%29)

What about other transforms?

- What to do if the matrix to be interpolated does not only rotation, but scale, shear, etc.?

Non-orthonormal 3x3 matrix

- “Polar decomposition” breaks arbitrary matrix \mathbf{M} into
 - Rotation \mathbf{Q} (+potential reflection)
 - Symmetric positive definite \mathbf{S} (anisotropic scale)



Figure 4. Direct Shear Interpolation

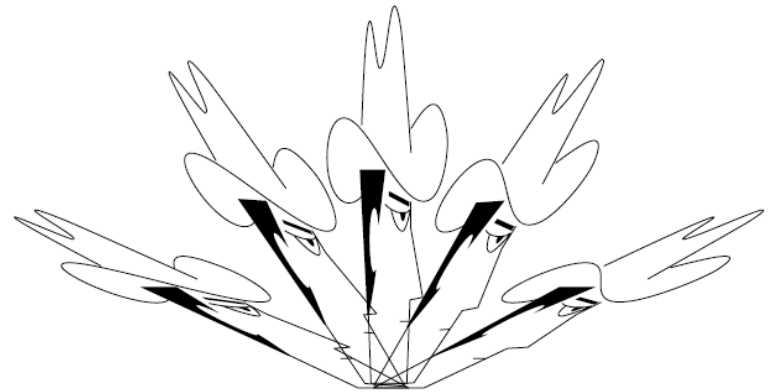


Figure 5. Decomposed Shear Interpolation

Polar Decomposition Algorithm

- Given 3x3 Matrix \mathbf{M}
- Compute the rotation factor \mathbf{Q} by averaging the matrix with its inverse transpose until convergence:
 - Set $\mathbf{Q}_0 = \mathbf{M}$,
 - then $\mathbf{Q}_{i+1} = 1/2(\mathbf{Q}_i + \mathbf{Q}_i^{-T})$ until $\mathbf{Q}_{i+1} - \mathbf{Q}_i \approx 0$.

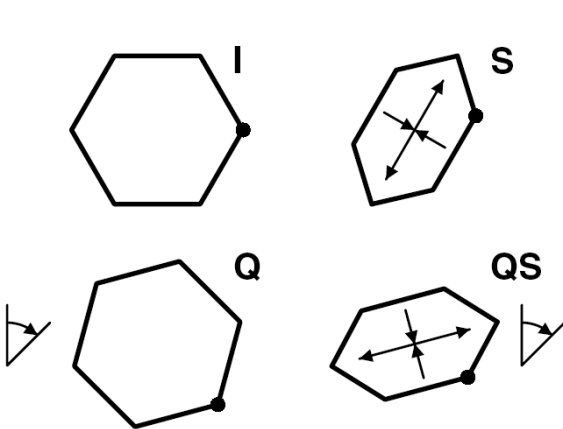


Figure 3. Physical View of Polar Decomposition

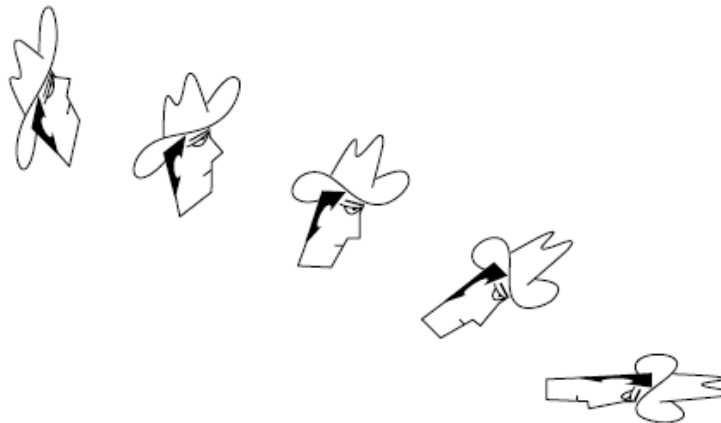



Figure 6. Polar Decomposed Matrix Interpolation

More Quaternion Magic: Multiplication

- Turns out that quaternion multiplication corresponds to composing rotations
 - $\mathbf{q}_2 = \mathbf{q}_1 \mathbf{q}_0$ is equivalent to first rotating by \mathbf{q}_0 , then \mathbf{q}_1 .

$$(\theta; \mathbf{v})(\theta'; \mathbf{v}') =$$
$$(\theta\theta' - \mathbf{v} \cdot \mathbf{v}'; \theta\mathbf{v}' + \theta'\mathbf{v} + \mathbf{v} \times \mathbf{v}')$$


- Multiplication is **not commutative** (why? **cross product**)
 - $\mathbf{q}_1 \mathbf{q}_0$ does not equal $\mathbf{q}_0 \mathbf{q}_1$ except in special cases
 - Makes sense, rotations are not commutative either

Even More Quaternion Magic

- Let's define a conjugate $\mathbf{q}^* = (\theta, -\mathbf{v})$
 - Remember complex conjugate? $a = x + iy$, $a^* = x - iy$
- Is there an inverse quaternion \mathbf{q}^{-1} such that $\mathbf{q}\mathbf{q}^{-1} = (1; \mathbf{0})$ for unit \mathbf{q} ? Let's try the conjugate...
 - Again, compare to complex: $aa^* = x^2 + y^2 = 1$ when a is unit length.

$$\begin{aligned}(\theta; \mathbf{v})(\theta'; \mathbf{v}') = \\ (\theta\theta' - \mathbf{v} \cdot \mathbf{v}'; \theta\mathbf{v}' + \theta'\mathbf{v} + \mathbf{v} \times \mathbf{v}')\end{aligned}$$

Conjugate = Inverse for Unit Q's

- Let's define a conjugate $\mathbf{q}^* = (\theta, -\mathbf{v})$
 - Remember complex conjugate? $a = x + iy$, $a^* = x - iy$
- Let's see:

$$\mathbf{q}\mathbf{q}^* =$$

$$(\theta^2 + \mathbf{v} \cdot \mathbf{v}; \theta\mathbf{v} - \theta\mathbf{v} + \mathbf{v} \times \mathbf{v}) = (1; \mathbf{0})$$

- Note that this only works for unit \mathbf{q} . If not unit, need normalization factor.

Conjugate = Inverse for Unit Q's

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 - Remember complex conjugate? $a = x + iy$, $a^* = x - iy$
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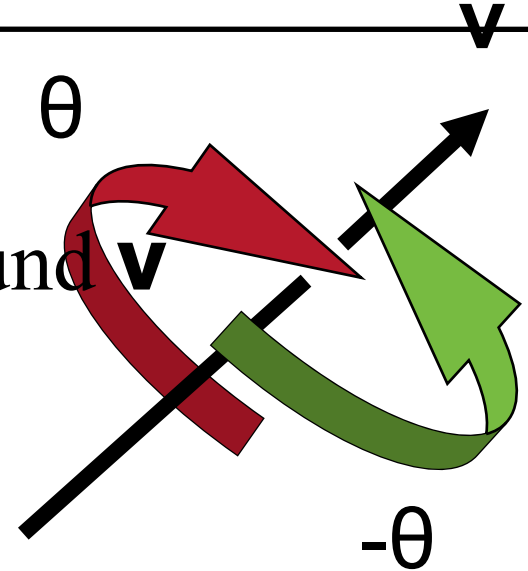
$$q q^* = \quad \mathbf{q}^* = \mathbf{q}^{-1} \text{ for unit quaternions}$$

$$(\theta^2 + \mathbf{v} \cdot \mathbf{v}; \theta \mathbf{v} - \theta \mathbf{v} + \mathbf{v} \times \mathbf{v}) = (1; \mathbf{0})$$

- Note that this only works for unit \mathbf{q} . If not unit, need normalization factor.

Inverse & Conjugate: Geometry

- $\mathbf{q} = (\cos \theta/2; \sin \theta/2 \mathbf{v})$
represents a rotation of angle θ around \mathbf{v}
- Inverse rotation \mathbf{q}^{-1} :
 - Angle $-\theta$ around \mathbf{v}
 - Angle θ around $-\mathbf{v}$
- In both cases, leads to $(\cos \theta/2; -\sin \theta/2 \mathbf{v})$
 - $\mathbf{q}^* = (\cos \theta/2; -\sin \theta/2 \mathbf{v})$, remember



Inverse & Conjugates: Matrices

- What is the inverse of a rotation matrix?

Inverse & Conjugates: Matrices

- What is the inverse of a rotation matrix?
- The conjugate/transpose matrix!
 - For a rotation (or any orthonormal matrix) $\mathbf{M}^T\mathbf{M}=\mathbf{I}$
 - (Formally, to get the conjugate of a complex-valued matrix, take the transpose and the conjugate of each coefficient. But we don't care here.)
- The notion of conjugation is related between matrices & quaternions
 - Isn't that cool?

Even More 4D Magic: Rotating a Point

- 3D vector **p** is represented by quaternion $(0, \mathbf{p})$
- To rotate 3D point/vector **p** by rotation/quaternion **q**, compute

$$\mathbf{qpq}^{-1} = \mathbf{q}(0; \mathbf{p})\mathbf{q}^{-1}$$

- (In practice, better convert the quaternion to a matrix first.)

That's All Folks!

