

Mathematics for 3D graphics

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Content

Homogeneous coordinates, matrix transformations

- coordinate-system conversions

Coordinate systems, projections, frustum

Orientations

- Euler angles, quaternions
- orientation interpolation

Smooth interpolations and approximations

- spline functions, natural spline, B-spline
- Hermite-type interpolations
- KB spline, Catmull-Rom...



Geometric transformations in 3D

Cartesian 3D coordinate vector $[x, y, z]$

Multiplying by a 3×3 matrix

- **row** vector multiplied **from the right** (DirectX)

$$[x, y, z] \cdot \begin{bmatrix} a_{11} & a_{12} & a_{13} \\ a_{21} & a_{22} & a_{23} \\ a_{31} & a_{32} & a_{33} \end{bmatrix} = [x', y', z']$$

- **column** vector multiplied **from the left** (OpenGL)

Transform matrices 3×3 have serious drawback – **cannot do translations!**



Homogeneous coordinates

Homogeneous coordinate vector $[x, y, z, w]$

Transformation: multiplying by a 4×4 matrix

$$[x, y, z, w] \cdot \begin{bmatrix} a_{11} & a_{12} & a_{13} & a_{14} \\ a_{21} & a_{22} & a_{23} & a_{24} \\ a_{31} & a_{32} & a_{33} & a_{34} \\ a_{41} & a_{42} & a_{43} & a_{44} \end{bmatrix} = [x', y', z', w']$$

Homogeneous matrix is able to do **translations** and **perspective projections**



Coordinate conversions

From **homogeneous coordinates** $[x, y, z, w]$ into Cartesian coordinates: by division ($w \neq 0$) $[x/w, y/w, z/w]$

Coordinate vector $[x, y, z, 0]$ does not correspond to any real point in space

- can be interpreted as a **directional vector** (point in infinity)

From **Cartesian coordinates** to homogeneous: trivial extension $[x, y, z] \dots [x, y, z, 1]$



Elementary transformations

Affine transformation

$$\begin{bmatrix} a_{11} & a_{12} & a_{13} & 0 \\ a_{21} & a_{22} & a_{23} & 0 \\ a_{31} & a_{32} & a_{33} & 0 \\ t_1 & t_2 & t_3 & 1 \end{bmatrix}$$

Upper left submatrix [\mathbf{a}_{11} to \mathbf{a}_{33}] defines scaling, orientation and shear

Vector [$\mathbf{t}_1, \mathbf{t}_2, \mathbf{t}_3$] defines translation

- translation is performed as the last step



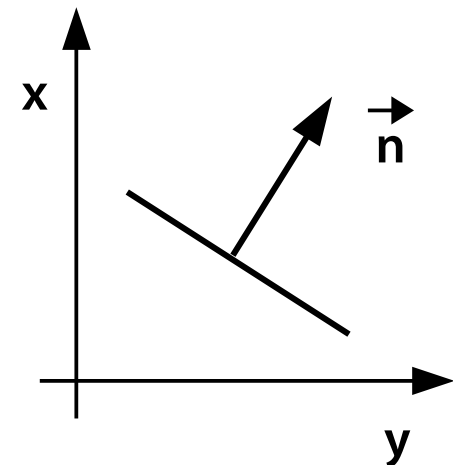
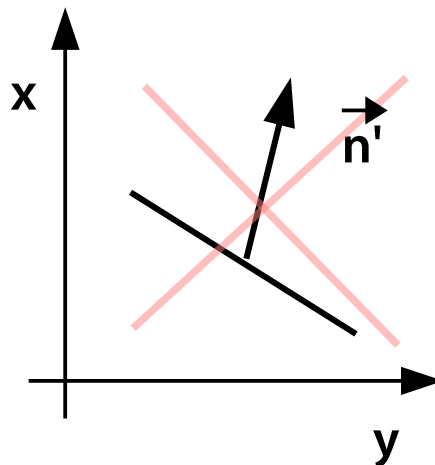
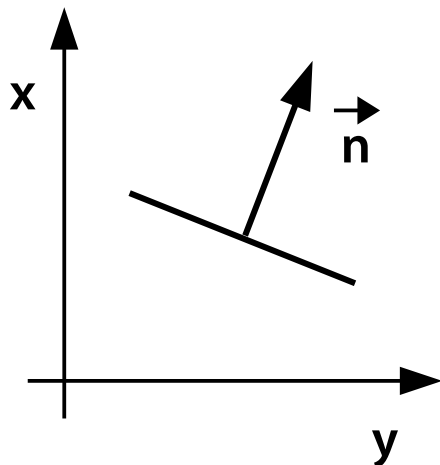
Normal vector transformation

Normal vectors must not be transformed by regular matrices (like point positions are)

- exception: M is rotational (orthonormal)

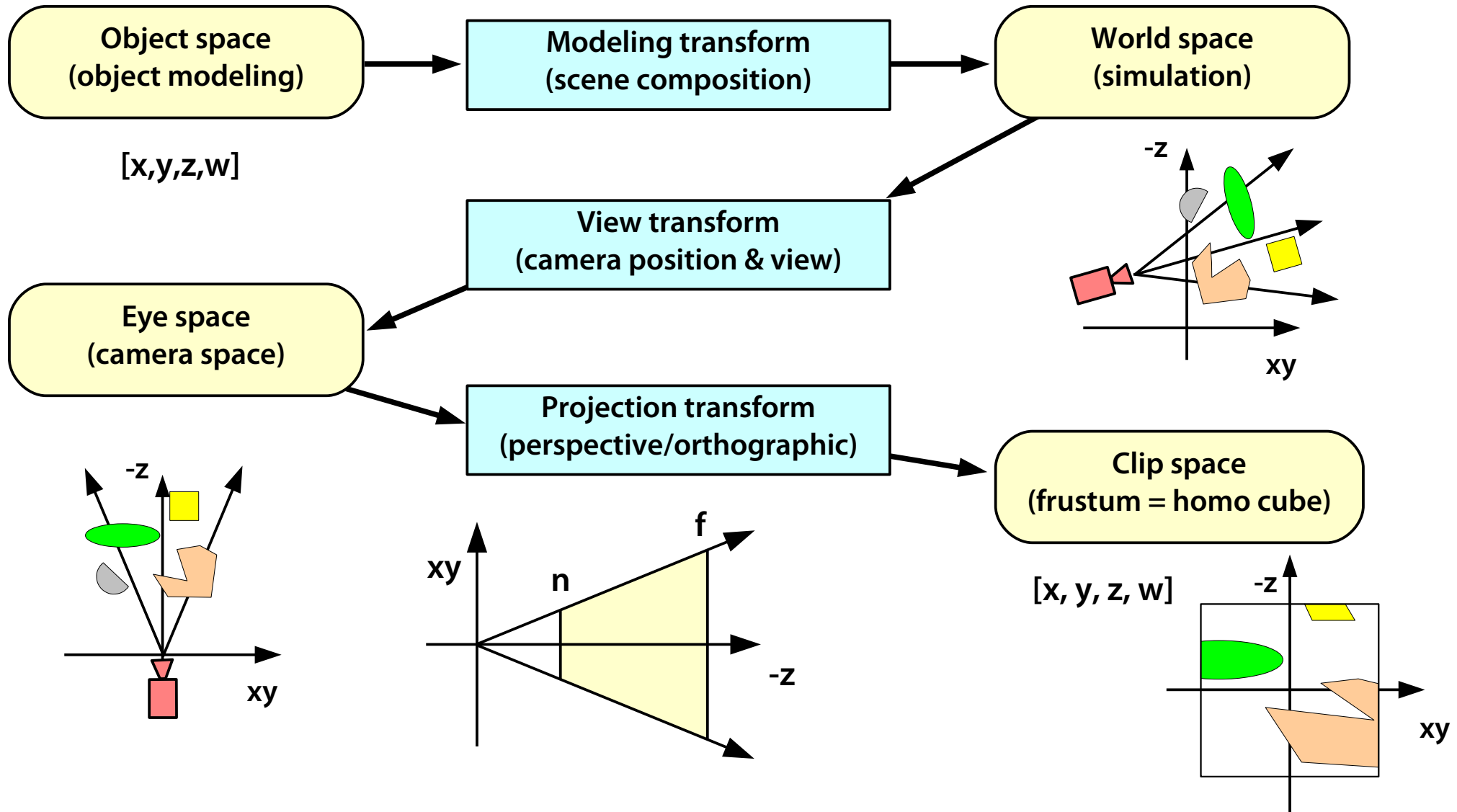
Normal-vector transformation matrix N :

$$N = (M^{-1})^T$$



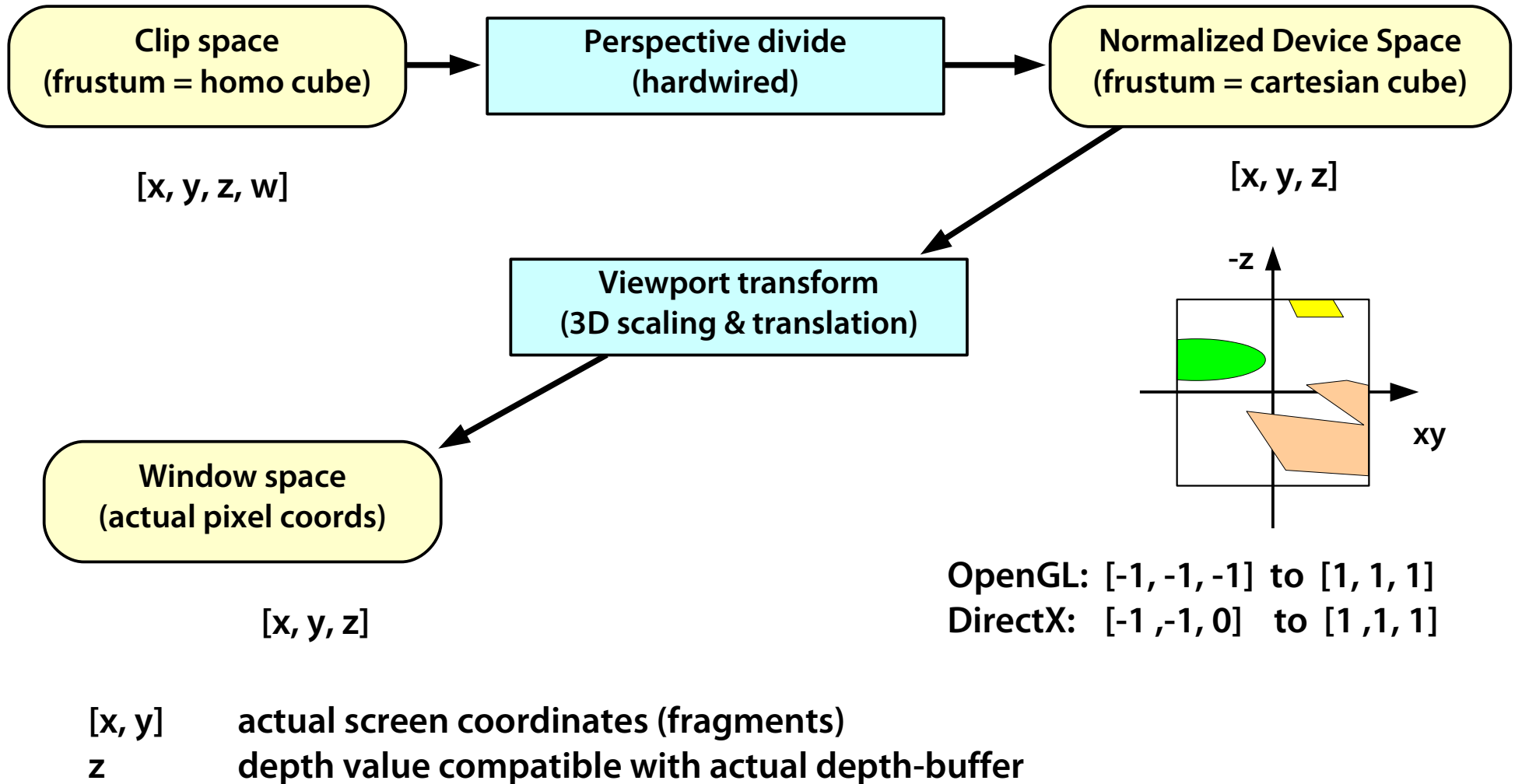


Coordinate systems in OpenGL





Coordinate systems in OpenGL





Coordinate systems in OpenGL

Object space

- modeling of individual objects, modularity
- 3D modeling software (3DS Max, Blender, Rhino...)

World space

- absolute (real) coordinates in simulated virtual world
- object instantiation, collision detection, AI planning...

Camera space

- the whole virtual world transforms into coordinates relative to a camera
- center of projection: **origin**, view direction: **-z** (or **z**)



Coordinate systems & transformations

Transformation “model → camera”

- altogether – “model-view” matrix
- world coordinates are not directly used in rendering pipeline

Projection transformation

- defines visible volume = **frustum** [**l**, **r**, **b**, **t**, **n**, **f**]
- front & back clip distances: **n**, **f**
- result: homogeneous coordinate (before clipping)

“Clip space”

- **mandatory output coordinate** of vertex shader!

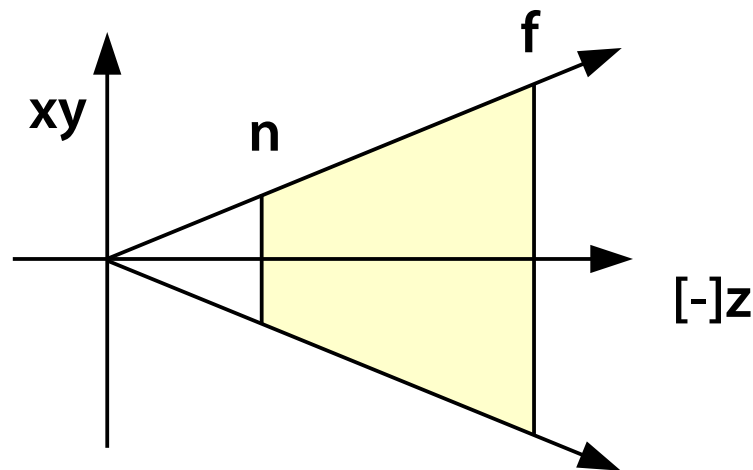


Projection transform (perspective)

Far point f can be in infinity

$$\begin{bmatrix} \frac{2n}{r-l} & 0 & 0 & 0 \\ 0 & \frac{2n}{t-b} & 0 & 0 \\ -\frac{r+l}{r-l} & -\frac{t+b}{t-b} & \frac{f+n}{f-n} & 1 \\ 0 & 0 & -\frac{2fn}{f-n} & 0 \end{bmatrix}$$

$$\begin{bmatrix} \frac{2n}{r-l} & 0 & 0 & 0 \\ 0 & \frac{2n}{t-b} & 0 & 0 \\ -\frac{r+l}{r-l} & -\frac{t+b}{t-b} & 1 & 1 \\ 0 & 0 & -2n & 0 \end{bmatrix}$$





Coordinate systems & transforms

Perspective division

- just converts **homogeneous** coordinates into **cartesian**

Normalized coordinates (“NDS”)

- standard-sized cube/cuboid
- OpenGL: $[-1, -1, -1]$ to $[1, 1, 1]$
- DirectX: $[-1, -1, 0]$ to $[1, 1, 1]$

Window coordinates (“window space”)

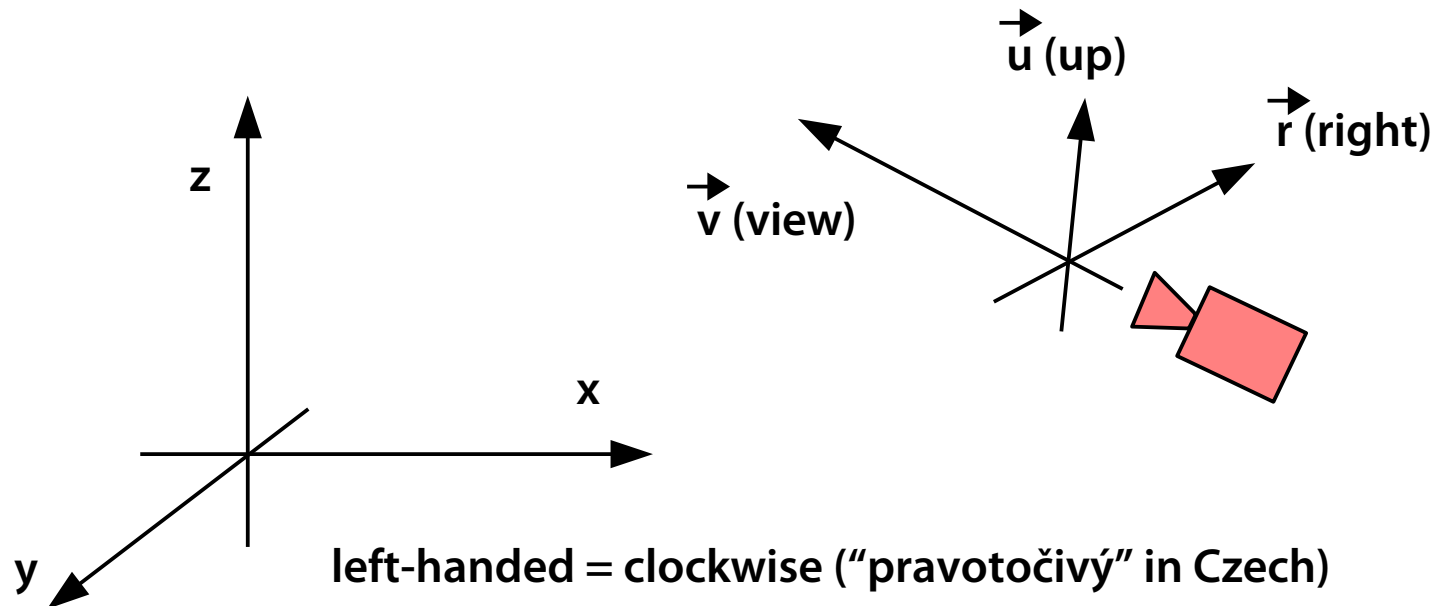
- result of **linear adjustment** to window size in pixels
- used in **rasterizer** and all **fragment processing**



Rigid body transformation

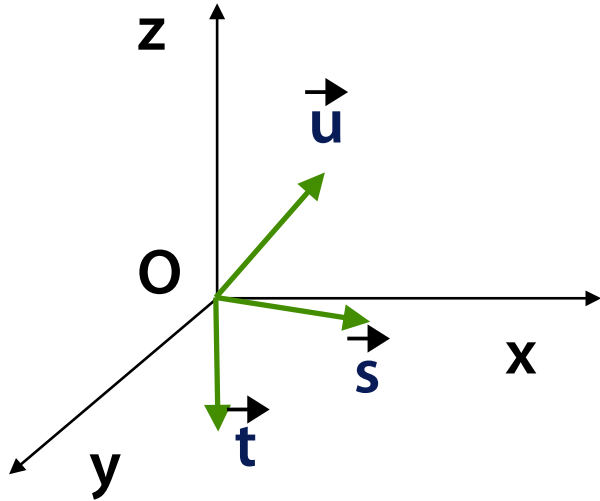
Preserves **shapes**, alters **orientation & position**

- **translation** and **rotation**
- **conversion between coordinate systems** (e.g. between world-space and camera-space)





Conversion between two orientations



Coordinate system has an origin **O** and is defined by three unit vectors **[s, t, u]**

$$[1, 0, 0] \cdot M_{stu \rightarrow xyz} = s$$

$$[0, 1, 0] \cdot M_{stu \rightarrow xyz} = t$$

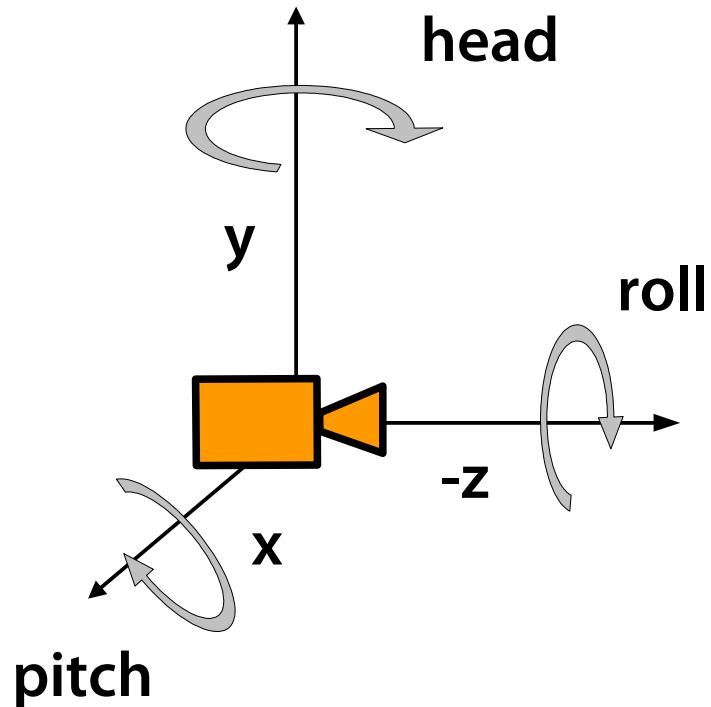
$$[0, 0, 1] \cdot M_{stu \rightarrow xyz} = u$$

$$M_{stu \rightarrow xyz} = \begin{bmatrix} s_x & s_y & s_z \\ t_x & t_y & t_z \\ u_x & u_y & u_z \end{bmatrix}$$

$$M_{xyz \rightarrow stu} = M_{stu \rightarrow xyz}^T$$



Euler transformation



Arbitrary rotation decomposed into **three components**

– Leonard Euler (1707-1783)

$$E(h, p, r) = R_y(h) \cdot R_x(p) \cdot R_z(r)$$

h (head, yaw): plan view direction

p (pitch): forward/backward pitching

r (roll): rolling around the view vector



Euler transformation II

Result matrix of rotation

$$E = \begin{pmatrix} c(r)c(h) - s(r)s(p)s(h) & s(r)c(h) + c(r)s(p)s(h) & -c(p)s(h) \\ -s(r)c(p) & c(r)c(p) & s(p) \\ c(r)s(h) + s(r)s(p)c(h) & s(r)s(h) - c(r)s(p)c(h) & c(p)c(h) \end{pmatrix}$$

$s(x) \dots \sin(x)$, $c(x) \dots \cos(x)$

Backward matrix \rightarrow angles computation h, p, r

- $p \dots e_{23}$
- $r \dots e_{21}/e_{22}$
- $h \dots e_{13}/e_{33}$



Rotations: different conventions

Main convention

- 1. rotation around \mathbf{z} by φ
- 2. rotation around \mathbf{x}' by θ
- 3. rotation around \mathbf{z}'' by ψ

X-convention

- 1. rotation around \mathbf{z}
- 2. rotation around original \mathbf{x}
- 3. rotation around original \mathbf{z}

More systems (24): aeronautics, gyroscopes, physics...



Quaternions

Sir William Rowan **Hamilton**, 16 Oct 1843 (Dublin)

- $i^2 = j^2 = k^2 = ijk = -1$
- usage in graphics since 1985 (Shoemake)
- **generalization of complex numbers** in 4D space

$$\mathbf{q} = (\mathbf{v}, w) = \underline{i} \underline{x} + \underline{j} \underline{y} + \underline{k} \underline{z} + \underline{w} = \mathbf{v} + w \quad \text{sometimes } (w, \mathbf{v})!$$

Imaginary part $\mathbf{v} = (x, y, z) = i x + j y + k z$

$$i^2 = j^2 = k^2 = -1, \quad jk = -kj = i, \quad ki = -ik = j, \quad ij = -ji = k$$



Quaternions: operations I

Addition

$$- (\mathbf{v}_1, w_1) + (\mathbf{v}_2, w_2) = (\mathbf{v}_1 + \mathbf{v}_2, w_1 + w_2)$$

Multiplication

$$- \mathbf{q} \mathbf{r} = (\mathbf{v}_q \times \mathbf{v}_r + w_r \mathbf{v}_q + w_q \mathbf{v}_r, w_q w_r - \mathbf{v}_q \cdot \mathbf{v}_r)$$

$$i(q_y r_z - q_z r_y + r_w q_x + q_w r_x),$$

$$j(q_z r_x - q_x r_z + r_w q_y + q_w r_y),$$

$$k(q_x r_y - q_y r_x + r_w q_z + q_w r_z),$$

$$q_w r_w - q_x r_x - q_y r_y - q_z r_z$$



Quaternions: operations II

Conjugation

- $(\mathbf{v}, w)^* = (-\mathbf{v}, w)$

Norm (squared absolute value)

- $\|\mathbf{q}\|^2 = n(\mathbf{q}) = \mathbf{q} \mathbf{q}^* = x^2 + y^2 + z^2 + w^2$

Unit

- $\mathbf{i} = (0, 1)$

Reciprocal

- $\mathbf{q}^{-1} = \mathbf{q}^* / n(\mathbf{q})$

Multiplication by a scalar

- $s \mathbf{q} = (0, s) (\mathbf{v}, w) = (s \mathbf{v}, s w)$



Unit quaternions

Every unit quaternion ($x^2 + y^2 + z^2 + w^2 = 1$) can be expressed as

- $\mathbf{q} = (\mathbf{u}_q \sin \phi, \cos \phi)$
- for some **unit 3D vector** \mathbf{u}_q

It represents a **rotation (orientation)** in 3D

- **ambiguity**: both \mathbf{q} and $-\mathbf{q}$ represent the same rotation! ($\phi + \pi$)
- **identity** (zero rotation): $(\mathbf{0}, 1)$

Power, exponential, logarithm

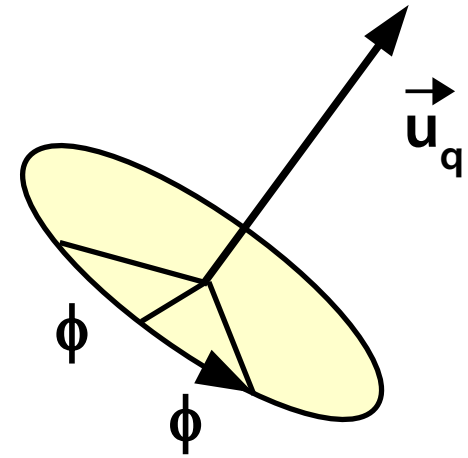
- $\mathbf{q} = \mathbf{u}_q \sin \phi + \cos \phi = \exp(\phi \mathbf{u}_q)$, $\log \mathbf{q} = \phi \mathbf{u}_q$
- $\mathbf{q}^t = (\mathbf{u}_q \sin \phi + \cos \phi)^t = \exp(t\phi \mathbf{u}_q) = \mathbf{u}_q \sin t\phi + \cos t\phi$



Rotation using a quaternion

Unit quaternion

- $\mathbf{q} = (\mathbf{u}_q \sin \phi, \cos \phi)$
- \mathbf{u}_q ... axis of rotation, ϕ ... angle



Vector (point) in 3D: $\mathbf{p} = [p_x, p_y, p_z, 0]$

Rotation of vector (point) \mathbf{p} around \mathbf{u}_q by angle 2ϕ

$$\mathbf{p}' = \mathbf{q} \mathbf{p} \mathbf{q}^{-1} = \mathbf{q} \mathbf{p} \mathbf{q}^*$$



Quaternion \leftrightarrow matrix conversions

Quaternion q converted to a matrix

$$M = \begin{pmatrix} 1 - 2(y^2 + z^2) & 2(xy + wz) & 2(xz - wy) \\ 2(xy - wz) & 1 - 2(x^2 + z^2) & 2(yz + wx) \\ 2(xz + wy) & 2(yz - wx) & 1 - 2(x^2 + y^2) \end{pmatrix}$$

Reverse conversion is based on equations

$$\begin{aligned} m_{23} - m_{32} &= 4wx \\ m_{31} - m_{13} &= 4wy \\ m_{12} - m_{21} &= 4wz \\ \text{tr } M + 1 &= 4w^2 \end{aligned} \quad (\$)$$



Matrix \rightarrow quaternion II

1. “matrix_trace+1” has large enough absolute value

$$w = \frac{1}{2} \sqrt{\text{tr } M + 1} \quad x = \frac{m_{23} - m_{32}}{4w}$$
$$y = \frac{m_{31} - m_{13}}{4w} \quad z = \frac{m_{12} - m_{21}}{4w}$$

2. ... otherwise compute a component with largest absolute value first and then apply \$

$$4x^2 = 1 + m_{11} - m_{22} - m_{33}$$

$$4y^2 = 1 - m_{11} + m_{22} - m_{33}$$

$$4z^2 = 1 - m_{11} - m_{22} + m_{33}$$

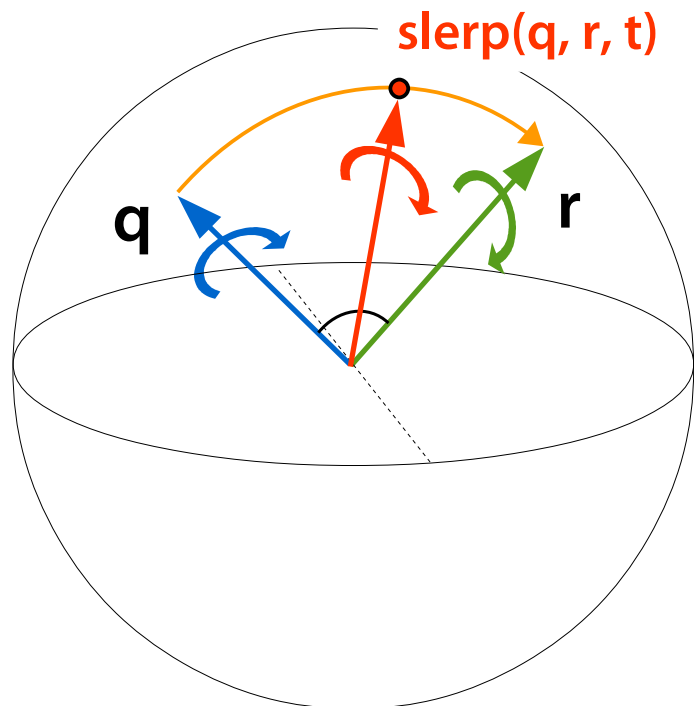


Spherical linear interpolation (slerp)

Two quaternions \mathbf{q} and \mathbf{r} ($\mathbf{q} \cdot \mathbf{r} \geq 0$, else take $-\mathbf{q}$)

Real parameter $0 \leq t \leq 1$

Interpolated quaternion $\text{slerp}(\mathbf{q}, \mathbf{r}, t) = \mathbf{q} (\mathbf{q}^* \mathbf{r})^t$



$$\text{slerp}(\mathbf{q}, \mathbf{r}, t) = \frac{\sin(\phi(1-t))}{\sin \phi} \cdot \mathbf{q} + \frac{\sin(\phi t)}{\sin \phi} \cdot \mathbf{r}$$

$$\cos \phi = q_x r_x + q_y r_y + q_z r_z + q_w r_w$$

The shortest spherical arc
between \mathbf{q} and \mathbf{r}
(quaternion splines will be explained later)



Rotation between two vectors

Two vectors \mathbf{s} and \mathbf{t}

1. normalization of \mathbf{s} , \mathbf{t}

2. unit rotation axis

$$\mathbf{u} = (\mathbf{s} \times \mathbf{t}) / \|\mathbf{s} \times \mathbf{t}\|$$

3. angle between \mathbf{s} and \mathbf{t}

$$e = \mathbf{s} \cdot \mathbf{t} = \cos 2\phi$$

$$\|\mathbf{s} \times \mathbf{t}\| = \sin 2\phi$$

4. final quaternion

$$\mathbf{q} = (\mathbf{u} \cdot \sin \phi, \cos \phi)$$

$$q = (q_v, q_w) = \left(\frac{1}{\sqrt{2(1+e)}} (\mathbf{s} \times \mathbf{t}), \frac{\sqrt{2(1+e)}}{2} \right)$$



Slerp of rotational matrices (theory)

Two rotational matrices Q and R

Real parameter $0 \leq t \leq 1$

Interpolated matrix $\text{slerp}(Q, R, t) = Q (Q^T R)^t$

Technical problem – how to do power operation on matrices?

Need to compute axis and angle $Q^T R$
(not very efficient)

See “RotationIssues.pdf” for details (D. Eberly)



Rotation representation – summary

Rotational matrix

- + HW support, efficient point/vector transformation
- memory (float[9]), other operations are not so efficient

Rotational axis and angle

- + memory (float[4] or float[6]), similar to quaternion
- inefficient composition and interpolation

Quaternion

- + memory (float[4]), composition, interpolation
- inefficient point/vector transformation

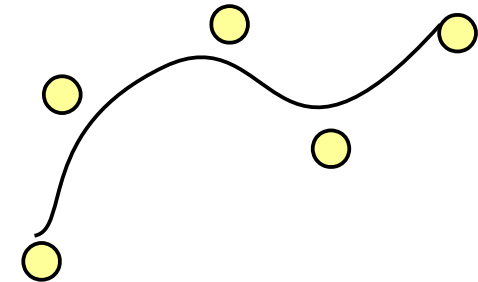
See “RotationIssues.pdf” for details (D. Eberly)



Approximation and interpolation

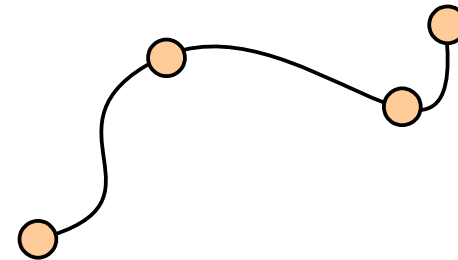
Approximation (e.g. B-spline)

- needs not to pass through control points



Interpolation (e.g. Catmull-Rom)

- curve passes through control points



Curve continuity

- \mathbf{G}^n – geometric continuity of the n^{th} order (\mathbf{G}^0 – simple continuity, \mathbf{G}^1 – tangent, \mathbf{G}^2 – curvature...)
- \mathbf{C}^n – analytical continuity of the n^{th} order, n^{th} derivative continuity (\mathbf{C}^1 – speed, \mathbf{C}^2 – acceleration), superior to geometric continuity



Curves in modeling industry

- Paul de Faget de **Casteljau**, Citroën (1959)
- Pierre **Bèzier** (Renault 1933-1975, UNISURF)
 - » late start, but his results were more popular
- application of spline function theory – mostly in USA (James **Ferguson**, 1964, Boeing, C^2 spline curves)

Spline function theory

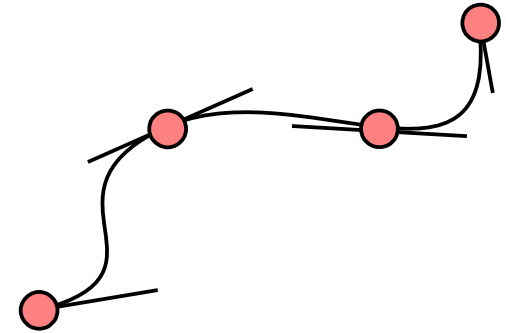
- B-spline: Isaac Jacob **Schoenberg**, (ballistics, Aberdeen, MD, 1946)
- theory: Carl **de Boor** (also worked for General Motors)
- Gordon, Riesenfeld **united** Bèzier and B-spline curves (1972)



“Free-form” curves I

Defined by a sequence of **control points**

- “control polygon”
- approximation or interpolation
- boundary conditions can be different



Controllability

- sometimes **tangent vectors** added in control points (Hermit)
- interpolation \Rightarrow closer control

Locality

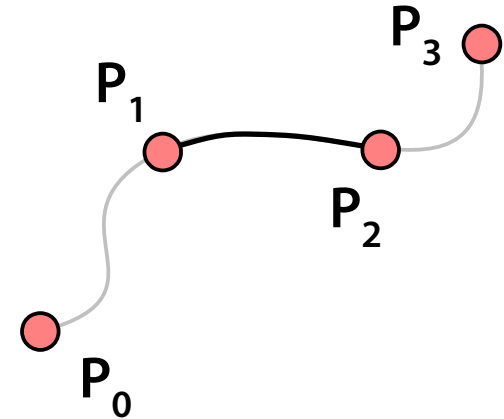
- change of single control point (one tangent vector) induces change in a **restricted neighborhood** only



“Free-form” curves II

Parametric expression ($0 \leq t \leq 1$)

$$P(t) = \sum_{i=0}^{N-1} w_i(t) P_i$$



Convex hull property

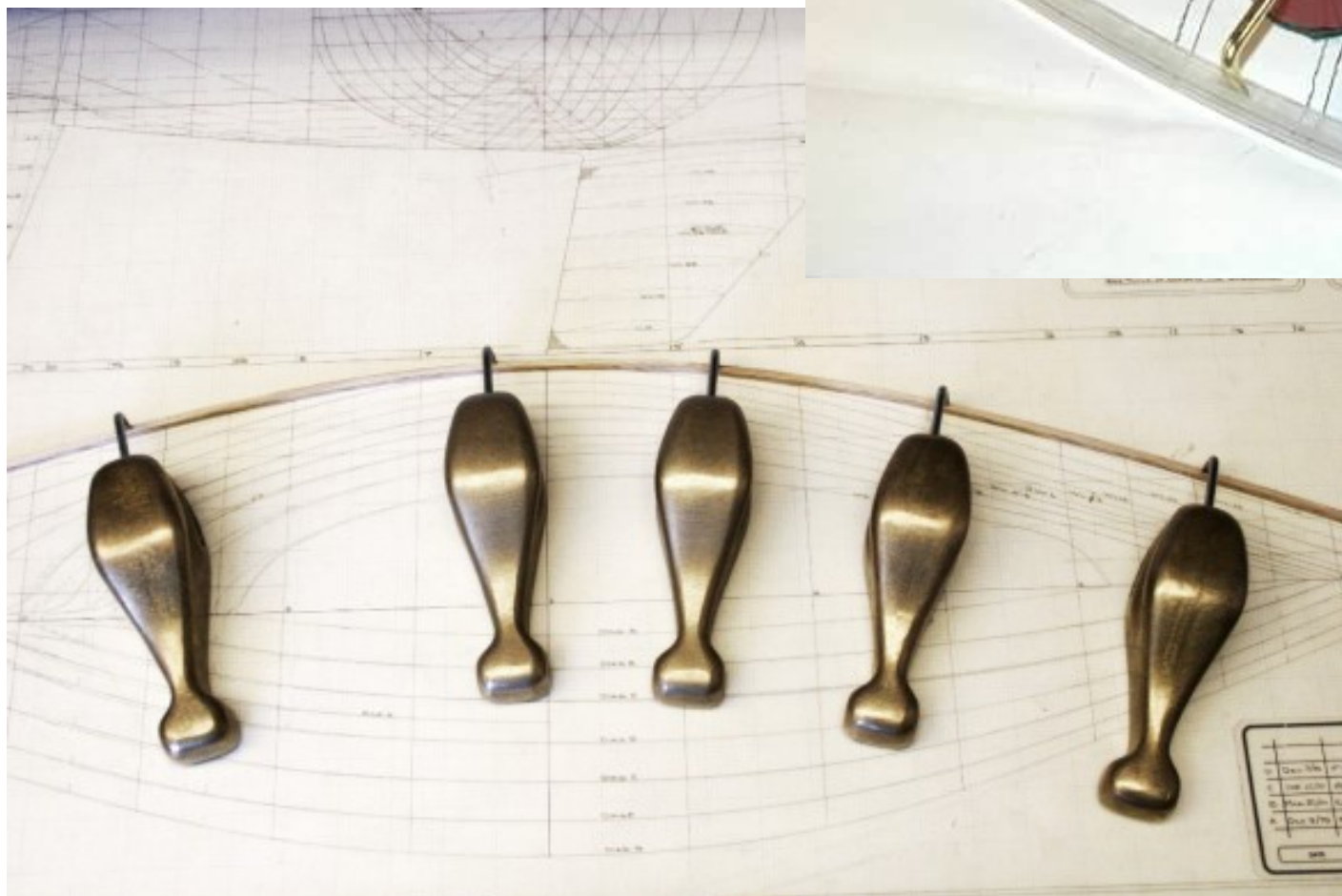
- curve lies in convex hull of its control polygon

Cauchy condition for blending functions

- sufficient for convex hull property
- ensures **affine transformation invariancy**

$$\sum_{i=0}^{N-1} w_i(t) = 1$$

Splines



© Jay Greer

© Edson International



Spline functions

Named after elastic ruler used in ship design (pinned in several points by “ducks”)

Definition: **spline function of degree n**

- piece-wise **polynomial** (of degree n)
- **maximum-smoothness connection:**

C^{n-1} – continuity of $n-1^{\text{th}}$ derivative (polynomial of degree n)

- **global parametrization** u , $u_0 \leq u \leq u_N$ [u_0, u_1, \dots, u_N]
- individual parts are often uniformly parametrized – **uniform spline** $t_i = (u - u_i) / (u_{i+1} - u_i)$, $0 \leq t_i \leq 1$



Polynomial curve

Matrix notation

$$P(t) = \mathbf{TC} = [t^n, t^{n-1}, \dots, t, 1] \cdot \begin{bmatrix} x_n & y_n & z_n \\ x_{n-1} & y_{n-1} & z_{n-1} \\ \dots & \dots & \dots \\ x_1 & y_1 & z_1 \\ x_0 & y_0 & z_0 \end{bmatrix}$$

Basis matrix \mathbf{M} and vector of geometric conditions \mathbf{G}

$$\mathbf{C} = \mathbf{MG} = [m_{ij}]_{i=n, j=1}^{0, k} \cdot \begin{bmatrix} G_1 \\ \dots \\ G_k \end{bmatrix} \quad P(t) = \mathbf{TMG}$$



Matrix notation of a curve

$$P(t) = T C = T M G$$

- separation of a parameter vector (**T**) from polynomial basis (**M**) and geometric control conditions/points (**G**)
- differentiation (tangent, curvature) restricted to **T**
- control polynomial **TM** times “geometry” **G**

Cubic: $n = 3, k = 4$

$$Q(t) = [t^3, t^2, t, 1] \cdot \begin{bmatrix} m_{11} & m_{12} & m_{13} & m_{14} \\ m_{21} & m_{22} & m_{23} & m_{24} \\ m_{31} & m_{32} & m_{33} & m_{34} \\ m_{41} & m_{42} & m_{43} & m_{44} \end{bmatrix} \cdot \begin{bmatrix} G_1 \\ G_2 \\ G_3 \\ G_4 \end{bmatrix}$$



Hermite cubic curve

Ferguson curve (cubic)

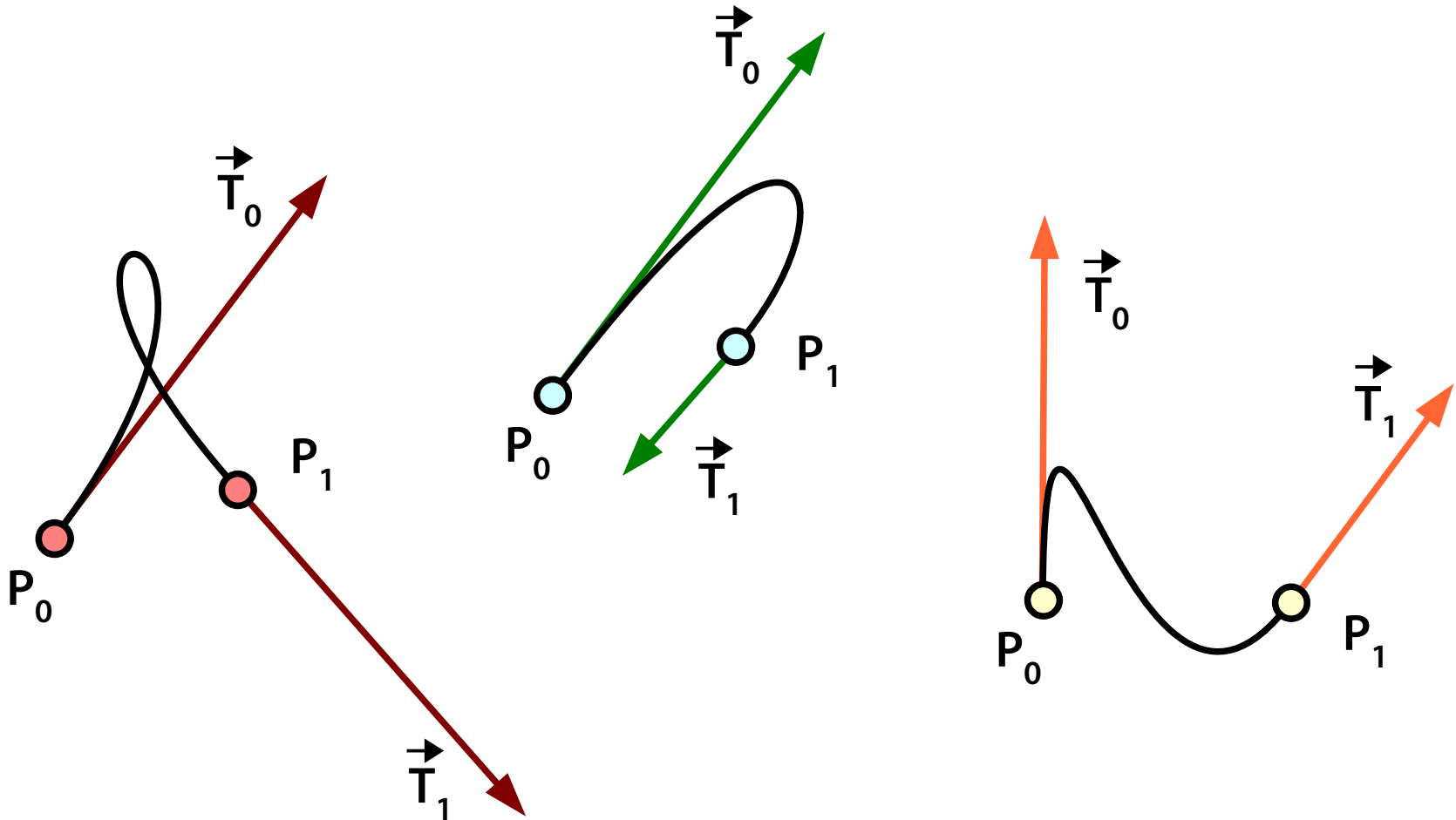
Geometry: endpoints and tangent vectors

- beginning (P_0) and end (P_1) of a curve
- tangents in beginning (T_0) and ending (T_1) points

$$F(t) = [t^3, t^2, t, 1] \cdot \begin{bmatrix} 2 & -2 & 1 & 1 \\ -3 & 3 & -2 & -1 \\ 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 \end{bmatrix} \cdot \begin{bmatrix} P_0 \\ P_1 \\ T_0 \\ T_1 \end{bmatrix}$$



Hermite cubic – examples





More curves

Interpolating cubics derived from Hermite

- general: **Kochanek-Bartels** (KB-spline, TCB cubic)
- special: **cardinal** spline, **Catmull-Rom** spline
- **Akima** interpolation (“Akima spline”, not C^2)
- **D-spline** cubic

Another popular curves

- **Bèzier** curves
- **B-spline** curve, **Coons** spline (approximation)
- **natural** spline (interpolation)



Kochanek-Bartels cubic (KB-spline, TCB)

Derived from **Hermite** cubic (3DS Max, Lightwave)

- **tangent vectors** are derived from **control points**
- three additional scalar parameters (**zero** by default)
 - » “**tension**” **t**: sharpness of a curve passing control point (absolute value of a tangent vector)
 - » “**continuity**” **c**: in control points
 - » “**bias**” **b**: tangent direction in control point

Left and right tangent (T_0 and T_1 in local sense):

$$L_i = \frac{(1-t)(1-c)(1+b)}{2} \cdot (P_i - P_{i-1}) + \frac{(1-t)(1+c)(1-b)}{2} \cdot (P_{i+1} - P_i)$$
$$R_i = \frac{(1-t)(1+c)(1+b)}{2} \cdot (P_i - P_{i-1}) + \frac{(1-t)(1-c)(1-b)}{2} \cdot (P_{i+1} - P_i)$$



Cardinal spline, Catmull-Rom spline

Special cases of KB-spline

cardinal spline

- parameter a only (in fact relates to “ t ”, $c = b = 0$)

$$T_i = a \cdot (P_{i+1} - P_{i-1}) \quad 0 \leq a \leq 1$$

Catmull-Rom spline

- $a = t = 1/2$

$$T_i = \frac{1}{2} \cdot (P_{i+1} - P_{i-1})$$

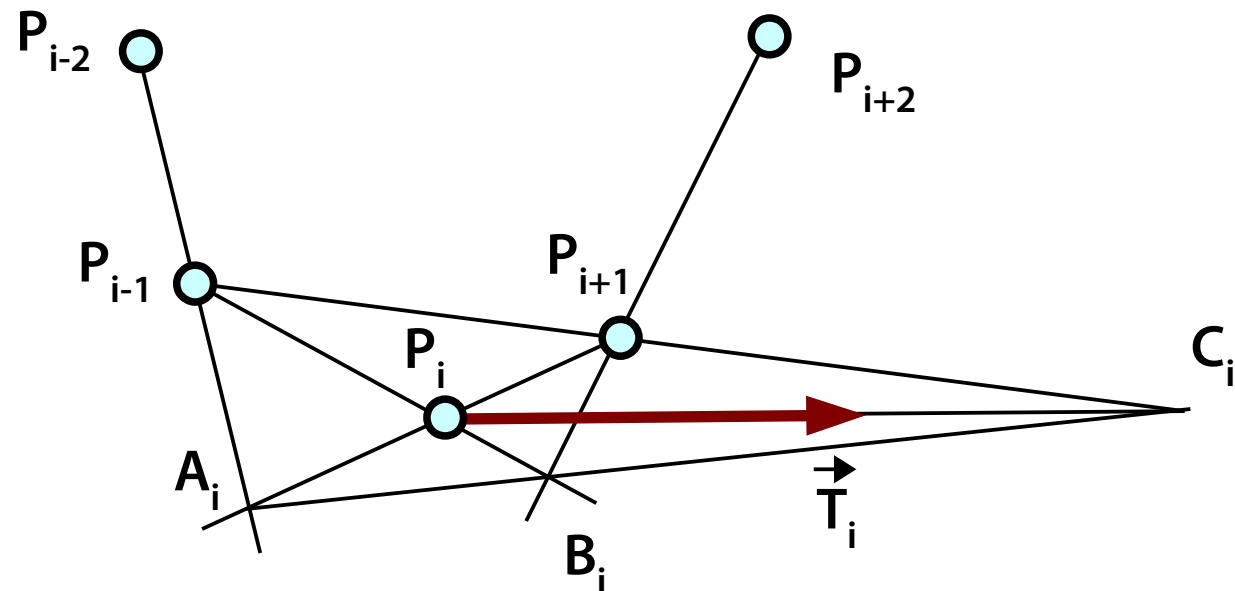
$$MG = \frac{1}{2} \begin{bmatrix} -1 & 3 & -3 & 1 \\ 2 & -5 & 4 & -1 \\ -1 & 0 & 1 & 0 \\ 0 & 2 & 0 & 0 \end{bmatrix} \cdot \begin{bmatrix} P_{i-1} \\ P_i \\ P_{i+1} \\ P_{i+2} \end{bmatrix}$$



Akima interpolation

Alternative definition of **tangent vectors** for Hermite cubic:

– non- C^2 !



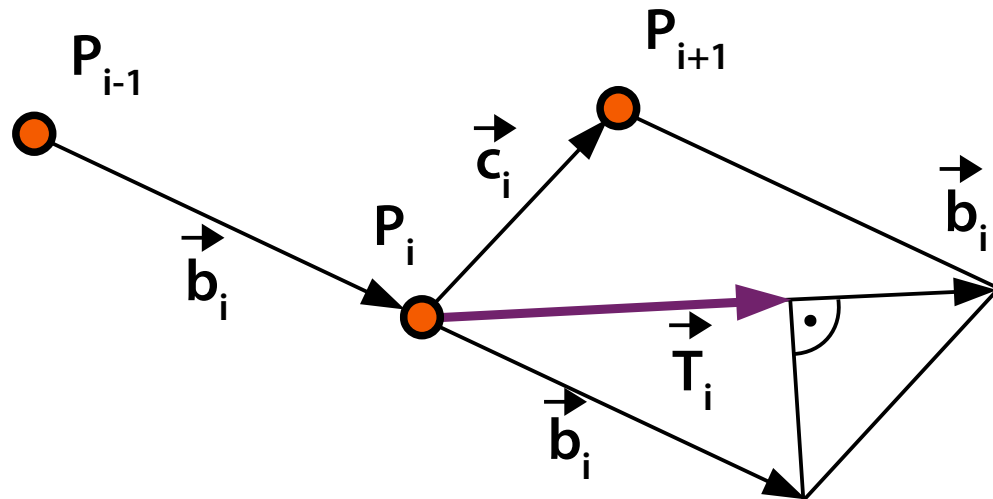
$$|\vec{T}_i| = |\overrightarrow{P_{i+1} - P_{i-1}}|$$



D-spline cubic

One more variant of Hermite cubic

- tangent vector computed by the “D-interpolation”



$$G = \begin{bmatrix} P_i \\ P_{i+1} \\ T_i \\ T_{i+1} \end{bmatrix}$$



Bézier curves I

Polynomial curve of degree N

- N+1 control points
 - » **boundary control points** define **endpoints** of a curve
 - » boundary control-point pairs define **tangent vectors**
- parametric expression using **Bernstein polynomials**
- easy **G¹** or **C¹** connection
- spline-join is also possible, but much more complicated

Bernstein polynomials:

$$B_i^n(t) = \binom{n}{i} t^i (1-t)^{n-i} \quad 0 \leq i \leq n, \quad 0 \leq t \leq 1$$



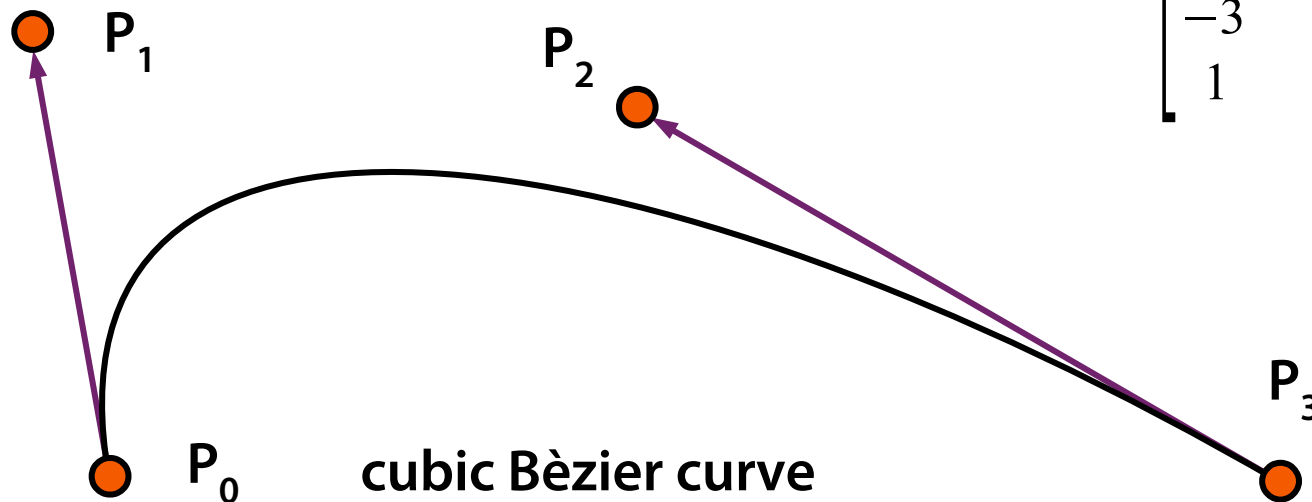
Bèzier curves II

Cauchy condition

⇒ convex combination of control points

$$\sum_{i=0}^n B_i^n(t) = 1 \quad \text{for } 0 \leq t \leq 1$$

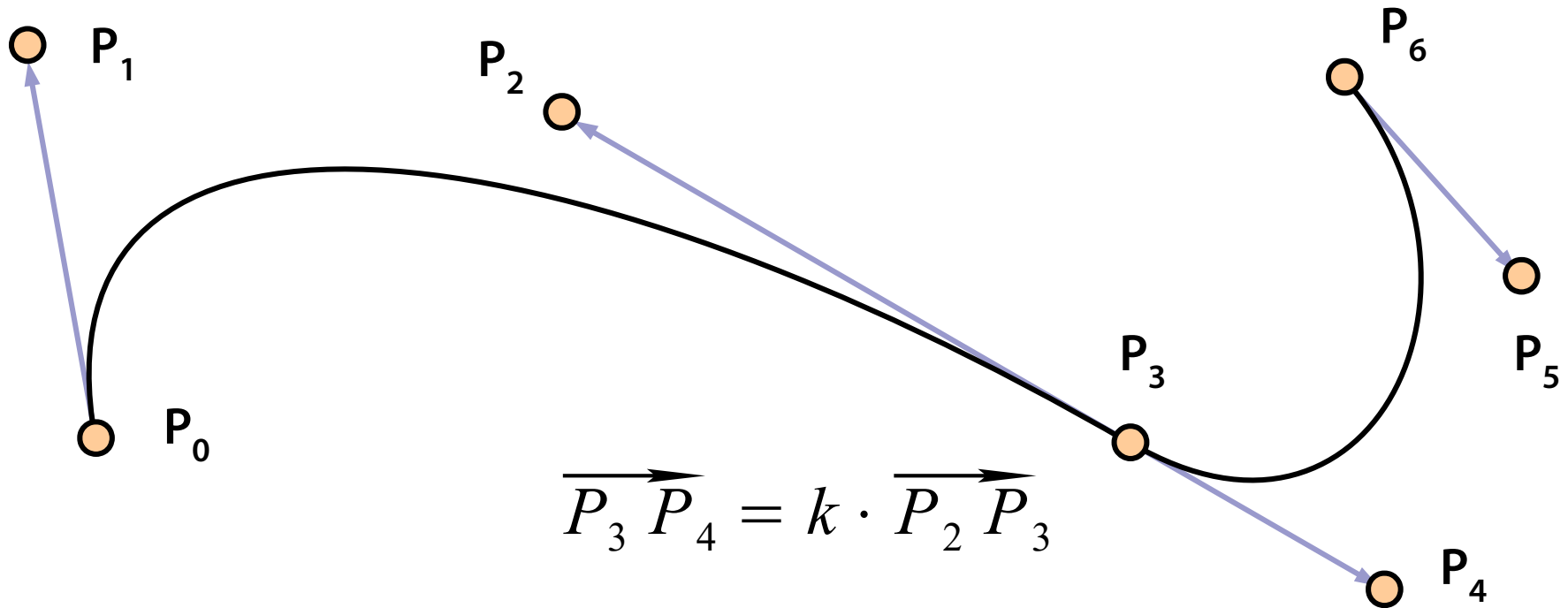
$$MG = \begin{bmatrix} -1 & 3 & -3 & 1 \\ 3 & -6 & 3 & 0 \\ -3 & 3 & 0 & 0 \\ 1 & 0 & 0 & 0 \end{bmatrix} \cdot \begin{bmatrix} P_0 \\ P_1 \\ P_2 \\ P_3 \end{bmatrix}$$





Joining Bézier curves I

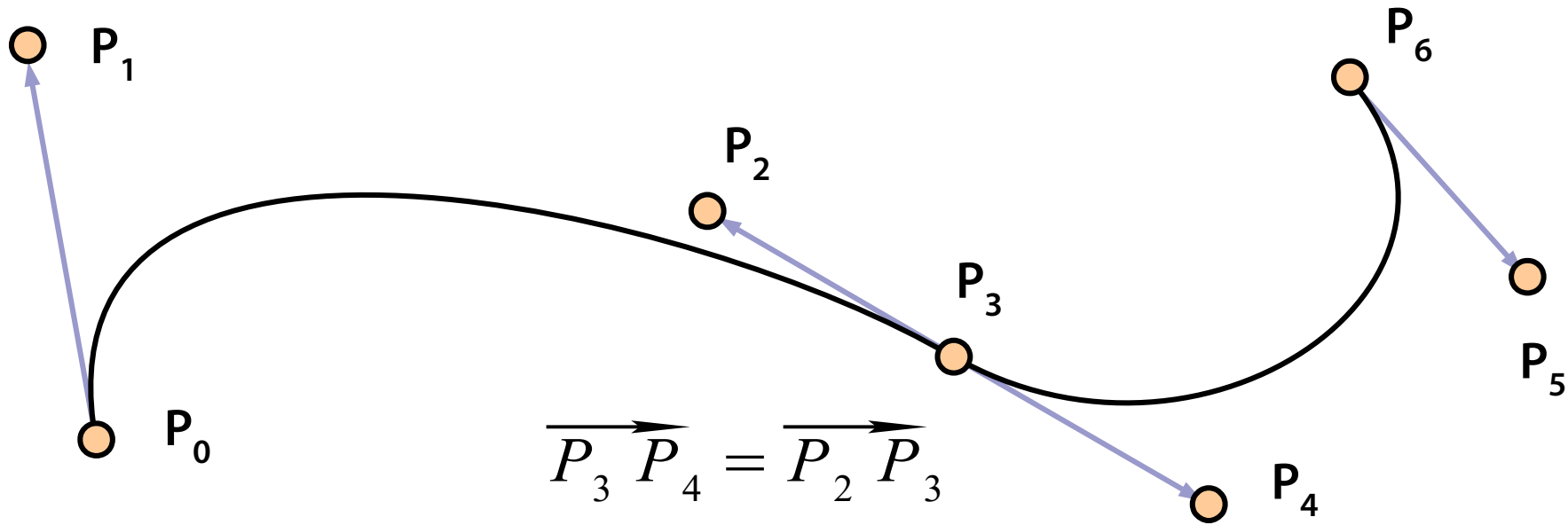
G^1 connection (co-linear tangents)





Joining Bèzier curves II

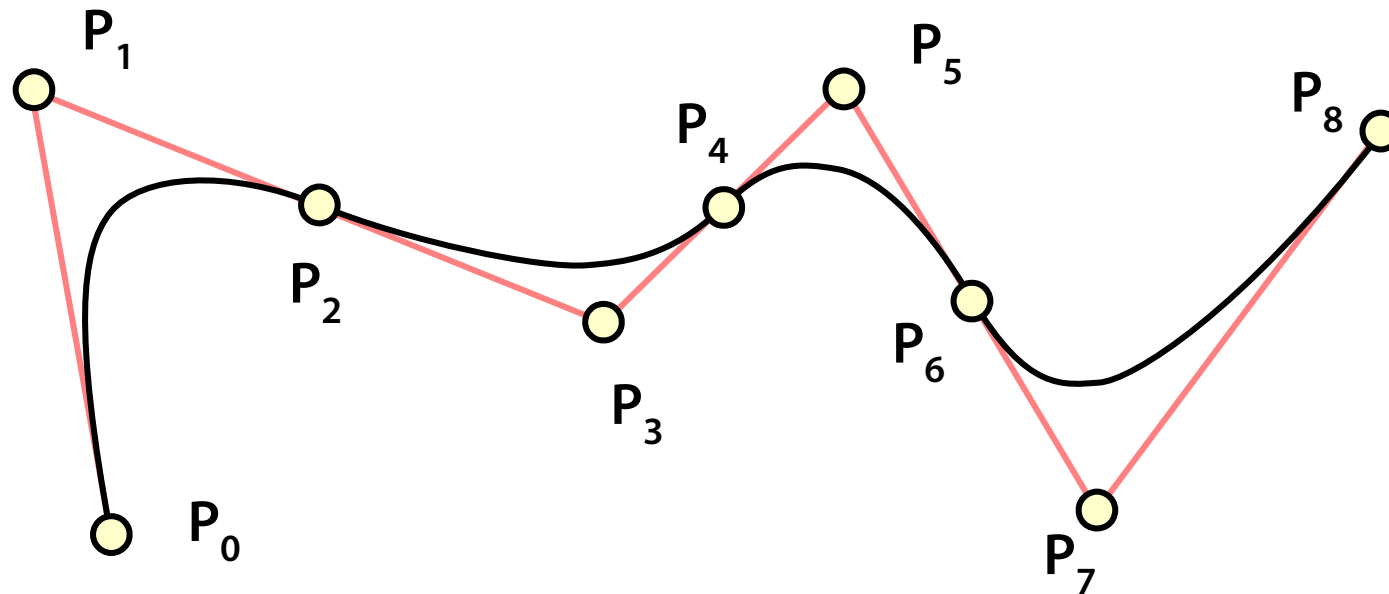
C^1 connection (equal tangent vectors)





Joining Bèzier curves III

Quadratic spline from Bèzier segments

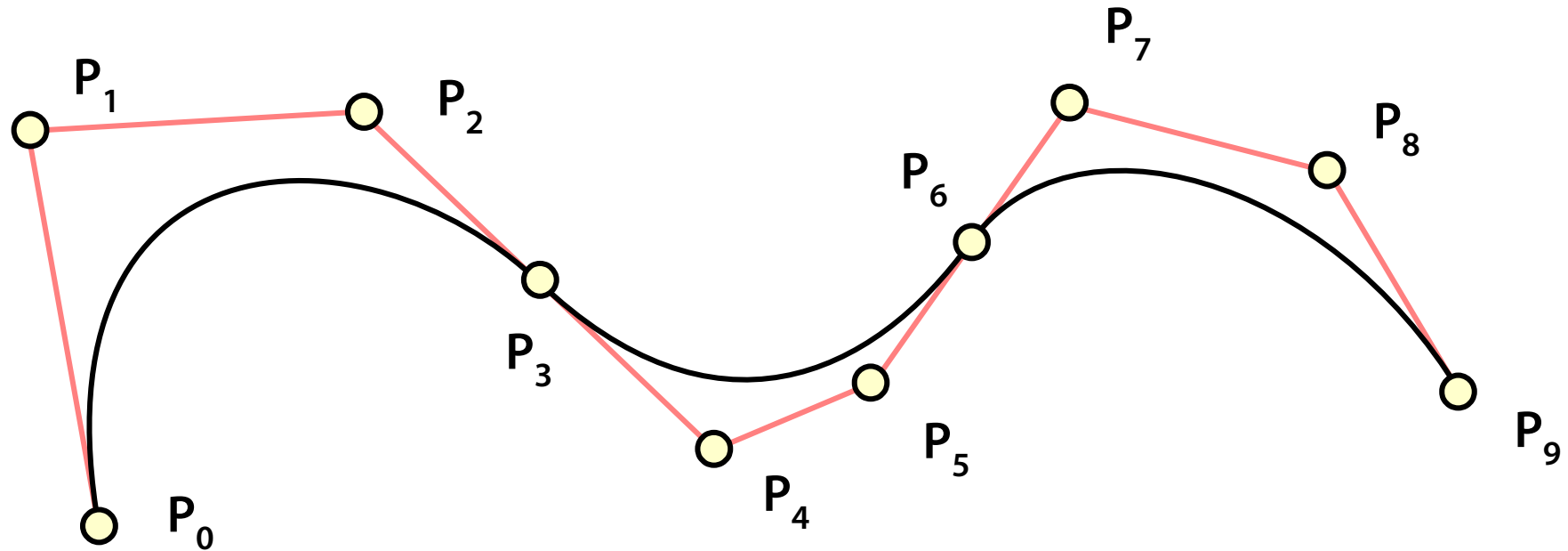


$$\overrightarrow{P_1 P_2} = \overrightarrow{P_2 P_3} \quad \overrightarrow{P_3 P_4} = \overrightarrow{P_4 P_5} \quad \dots \quad \overrightarrow{P_{2k-1} P_{2k}} = \overrightarrow{P_{2k} P_{2k+1}}$$



Joining Bézier curves IV

Cubic spline from Bézier segments



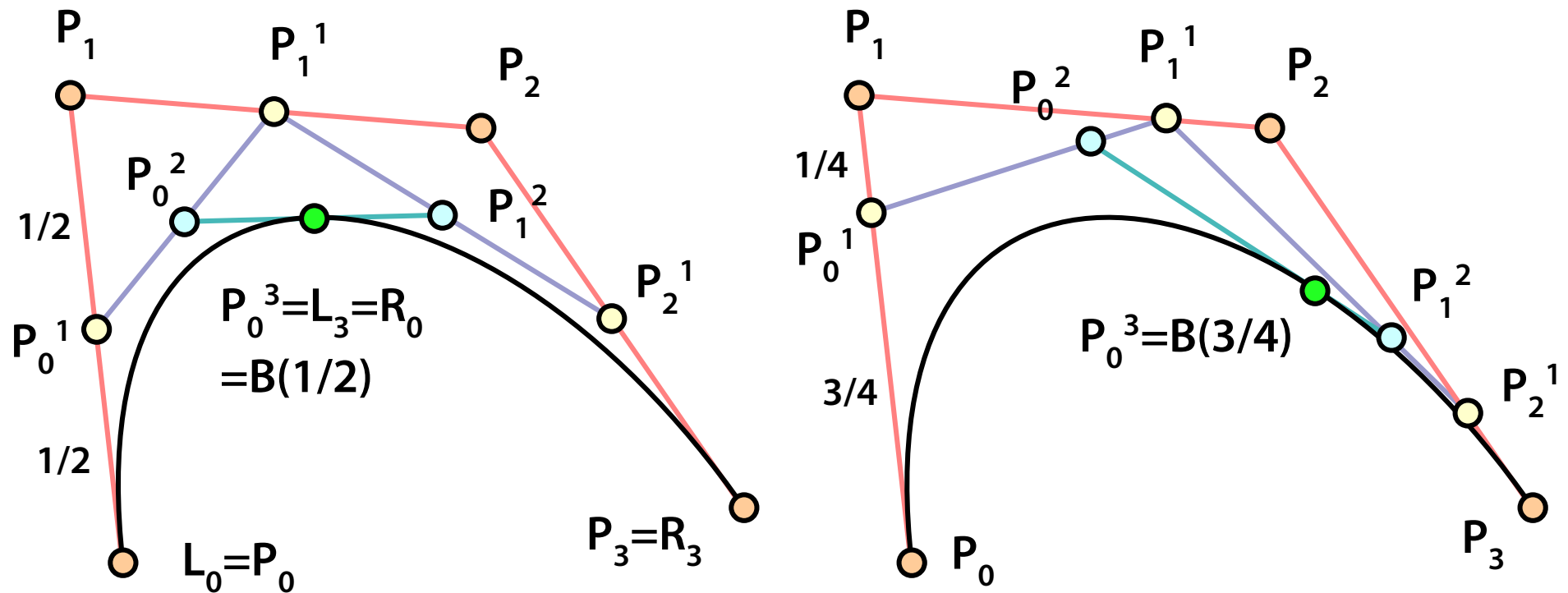
$$\overrightarrow{P_2 P_3} = \overrightarrow{P_3 P_4} \quad \overrightarrow{P_5 P_6} = \overrightarrow{P_6 P_7} \quad \dots \quad \overrightarrow{P_{3k-1} P_{3k}} = \overrightarrow{P_{3k} P_{3k+1}}$$



De Casteljau (de Boor) algorithm

Geometric construction of Bèzier curve

- used as “subdivision” scheme or for computation of a specific point...

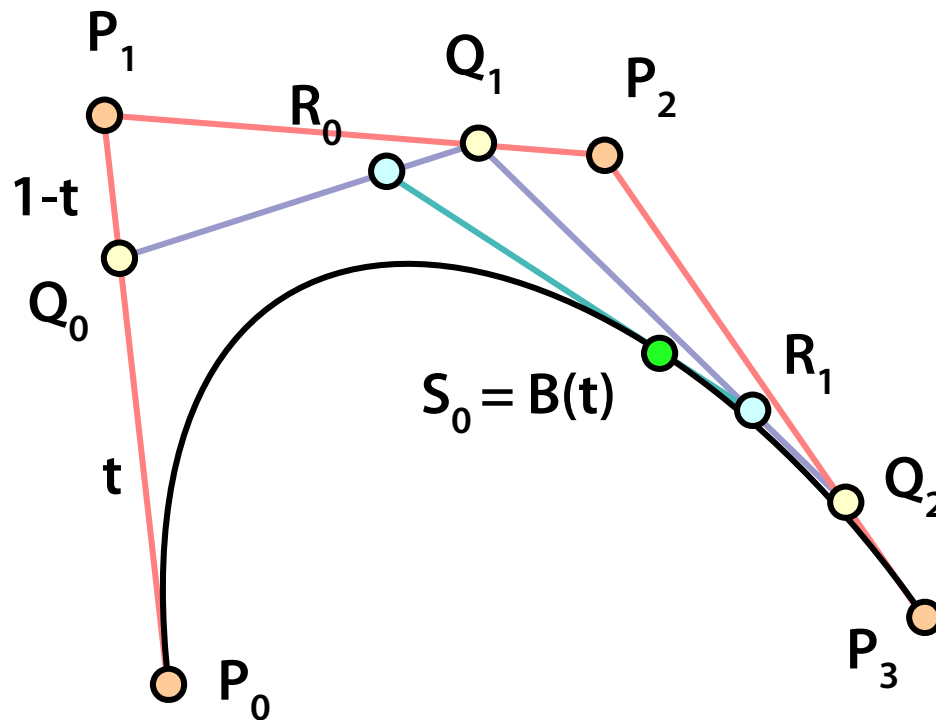




Using [S]LERP operation

Linear interpolation LERP (SLERP for quaternions)

$$\text{LERP}(A, B, t) = A \cdot (1 - t) + B \cdot t$$



Cubic Bézier

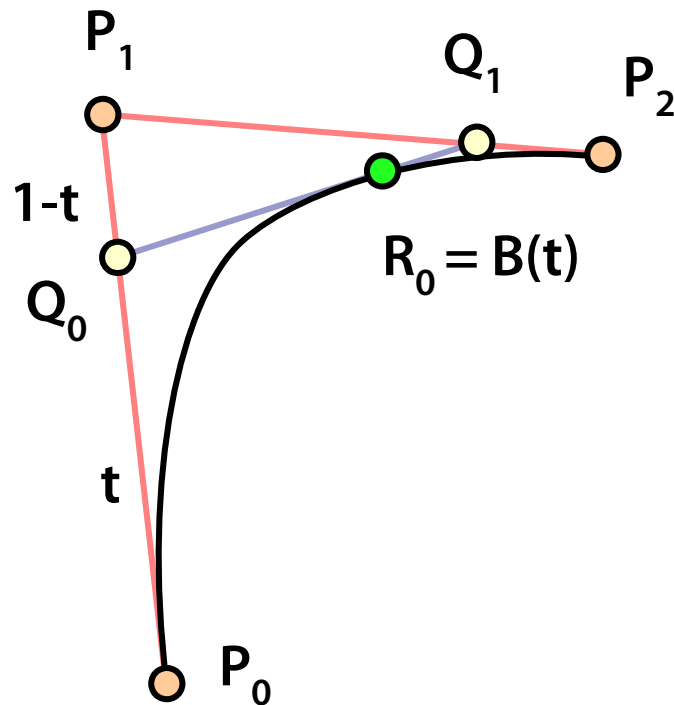
$$Q_i = \text{LERP}(P_i, P_{i+1}, t)$$

$$R_i = \text{LERP}(Q_i, Q_{i+1}, t)$$

$$S_i = \text{LERP}(R_i, R_{i+1}, t)$$



[S]LERP for quadratic interpolation



Quadratic Bèzier

$$Q_i = \text{LERP}(P_i, P_{i+1}, t)$$

$$R_i = \text{LERP}(Q_i, Q_{i+1}, t)$$



Cubic spline

Function assembled from **cubic polynomials**

- neighbor polynomials have C^2 joint
- elastic “spline-ruler” (see construction)

Interpolating cubic spline

- in knot points x_0, x_1, \dots, x_n function values y_0, y_1, \dots, y_n are prescribed

$$S(x) = S_k(x) = s_{k,0} + s_{k,1}(x - x_k) + s_{k,2}(x - x_k)^2 + s_{k,3}(x - x_k)^3$$
$$x \in [x_k, x_{k+1}], \quad k = 0, 1, \dots, n-1$$

Condition A: $S(x_k) = y_k \quad k = 0, 1, \dots, n$



Interpolating cubic spline

Condition **B** (C^0 continuity):

$$S_k(x_{k+1}) = S_{k+1}(x_{k+1}) \quad k=0, 1, \dots, n-2$$

Condition **C** (C^1 continuity):

$$S'_k(x_{k+1}) = S'_{k+1}(x_{k+1}) \quad k=0, 1, \dots, n-2$$

Condition **D** (C^2 continuity):

$$S''_k(x_{k+1}) = S''_{k+1}(x_{k+1}) \quad k=0, 1, \dots, n-2$$

Natural cubic spline has an additional condition **E**:

$$S''(x_0) = S''(x_n) = 0$$



Natural cubic spline

Interpolating spline

- **uniquely determined** by the conditions (solution of linear system of equations $s_{k,l}$)
- **has no local property** (the whole curve changes after altering one control point)

Open spline

- conditions **A, B, C, D** are not sufficient, two more DoF
- additional condition **E** (second derivatives at endpoints)

Closed (cyclic) spline: $\mathbf{x}_0 = \mathbf{x}_n$

- **C** and **D** give us missing conditions for \mathbf{x}_0



B-spline (basis spline)

“Free-form” curve

- shape is defined by a sequence of **control points**
- parametric form using **basis/blending functions** (dependency of a curve point on control polygon)
- **local property** (only local change after altering one CP)

Uniform cubic B-spline (Coons curve)

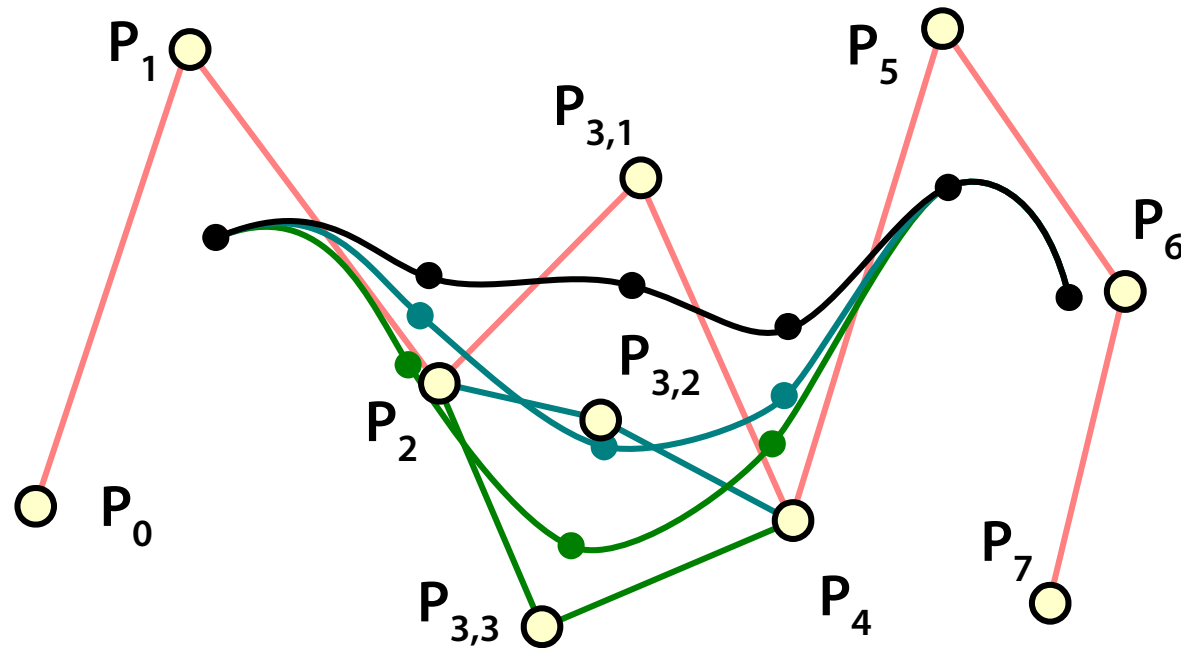
- unified set of basis functions (cubic polynomials)

Nonuniform B-spline

- more complicated definition using knot vector $[t_i]_i$, $0 \leq t_i \leq 1$



Coons B-spline



- continuity C^2
- **sharing** 3 CP between neighbours
- altering one CP induces change in closest **4 segments**

$$MG = \frac{1}{6} \begin{bmatrix} -1 & 3 & -3 & 1 \\ 3 & -6 & 3 & 0 \\ -3 & 0 & 3 & 0 \\ 1 & 4 & 1 & 0 \end{bmatrix} \cdot \begin{bmatrix} P_{i-1} \\ P_i \\ P_{i+1} \\ P_{i+2} \end{bmatrix}$$

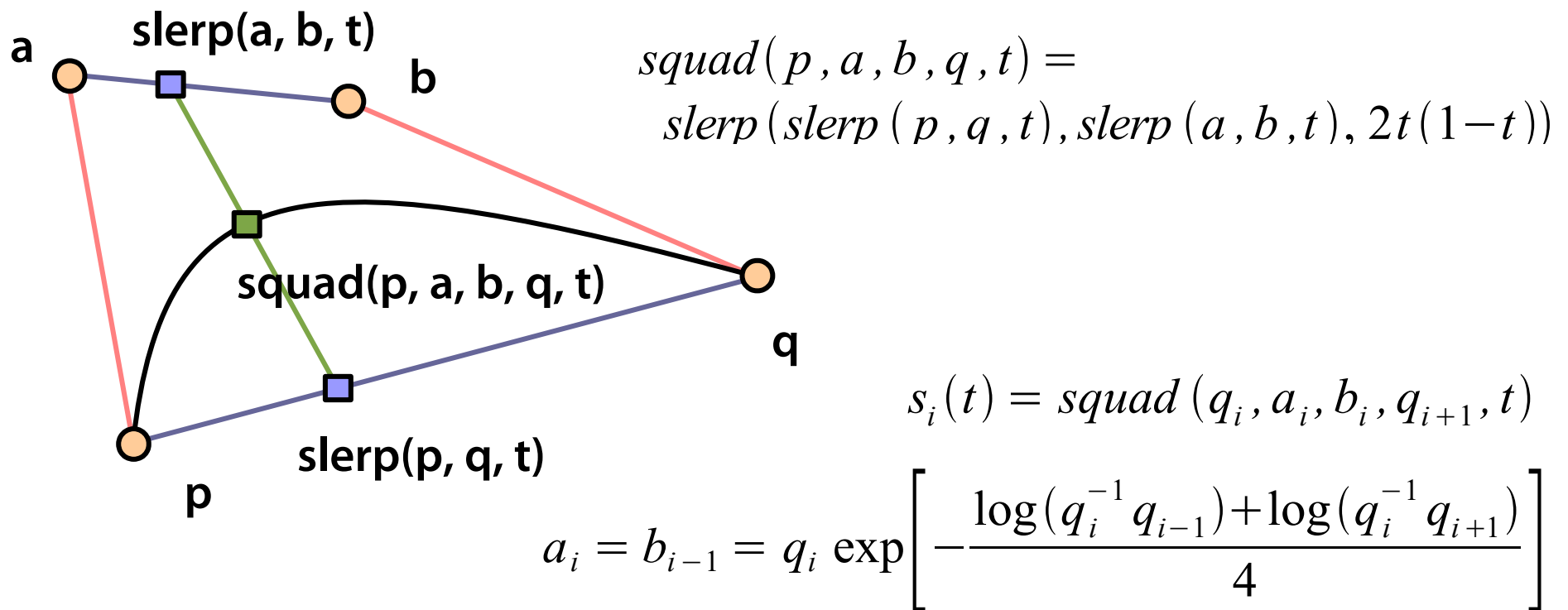


Spline interpolation of quaternions

Subsequent interpolation by a sequence of orientations

$$q_0, q_1, \dots, q_n$$

– $\text{slerp}(q_i, q_{i+1}, t)$ has not sufficient continuity (C^0 only)





Literature

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<http://www.geometrictools.com/> (Dave Eberly)