

# Computer Animation Algorithms and Techniques

Interpolating Values

# Animation

**Animator specified**  
**interpolation**  
**key frame**

**Algorithmically controlled**  
**Physics-based**  
**Behavioral**

**Data-driven**  
**motion capture**

# Motivation

**Common problem: given a set of points  
Smoothly (in time and space) move an object  
through the set of points**

**Example additional temporal constraints:  
From zero velocity at first point, smoothly  
accelerate until time  $t_1$ , hold a constant  
velocity until time  $t_2$ , then smoothly  
decelerate to a stop at the last point at time  $t_3$**

# Motivation - solution steps

**1. Construct a space curve that interpolates the given points with piecewise first order continuity**

$$\mathbf{p}=\mathbf{P}(\mathbf{u})$$

**2. Construct an arc-length-parametric-value function for the curve**

$$\mathbf{u}=\mathbf{U}(s)$$

**3. Construct time-arc-length function according to given constraints**

$$s=\mathbf{S}(t)$$

$$\mathbf{p}=\mathbf{P}(\mathbf{U}(\mathbf{S}(t)))$$

# Interpolating function

**Interpolation v. approximation**

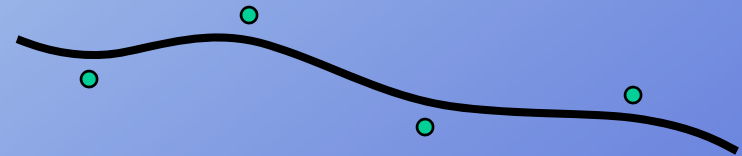
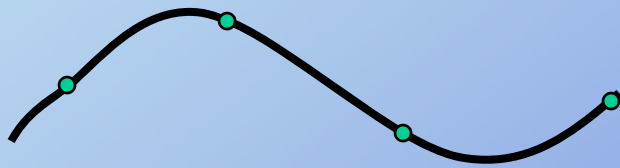
**Complexity: cubic**

**Continuity: first degree (tangential)**

**Local v. global control: local**

**Information requirements: tangents needed?**

# Interpolation v. Approximation

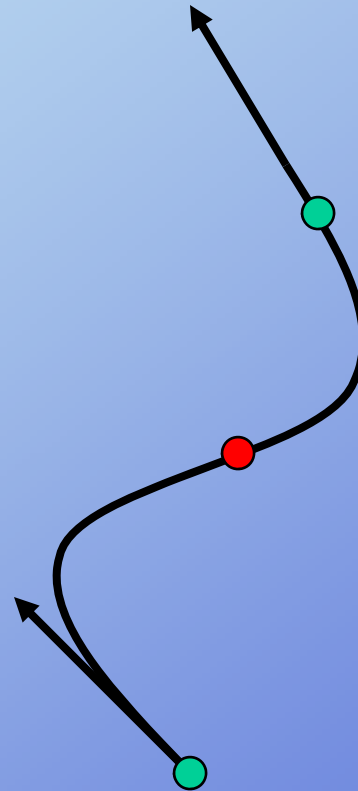


# Complexity

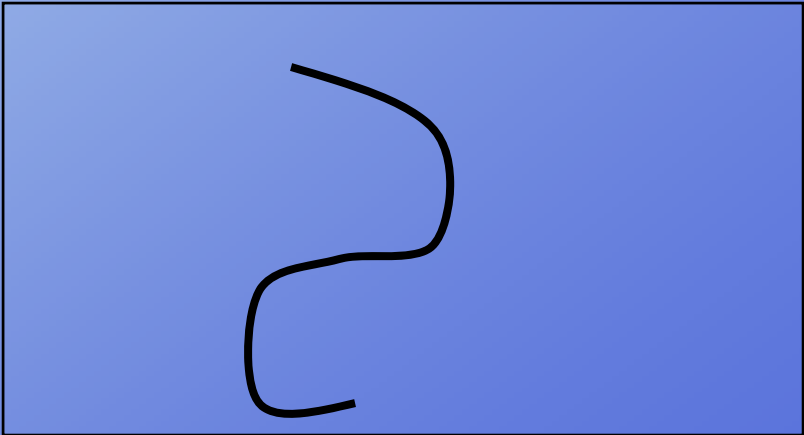
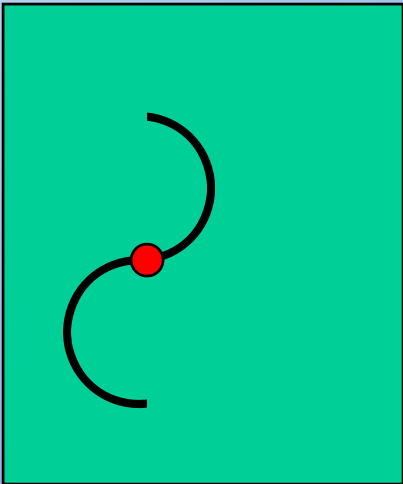
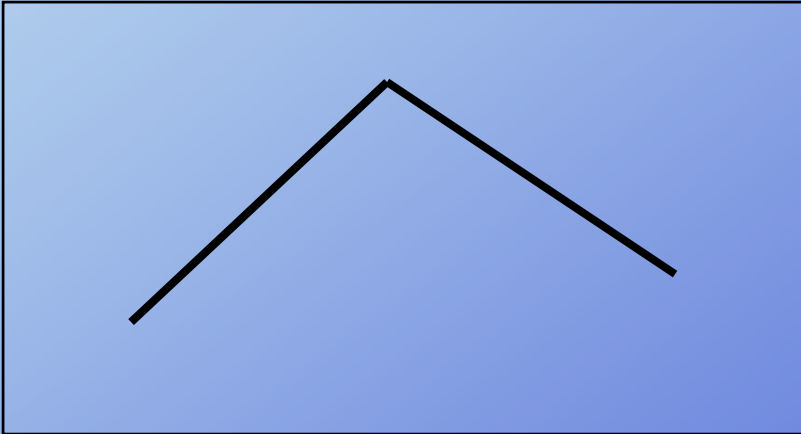
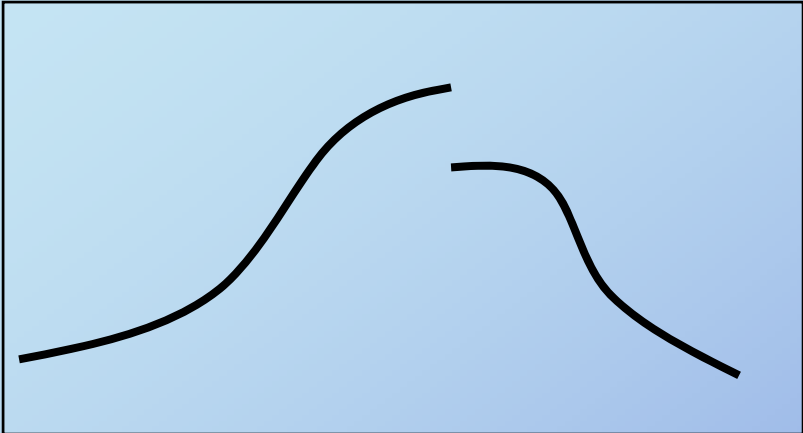
Low complexity  
reduced computational cost

Point of Inflection  
Can match arbitrary tangents at  
end points

CUBIC polynomial



# Continuity

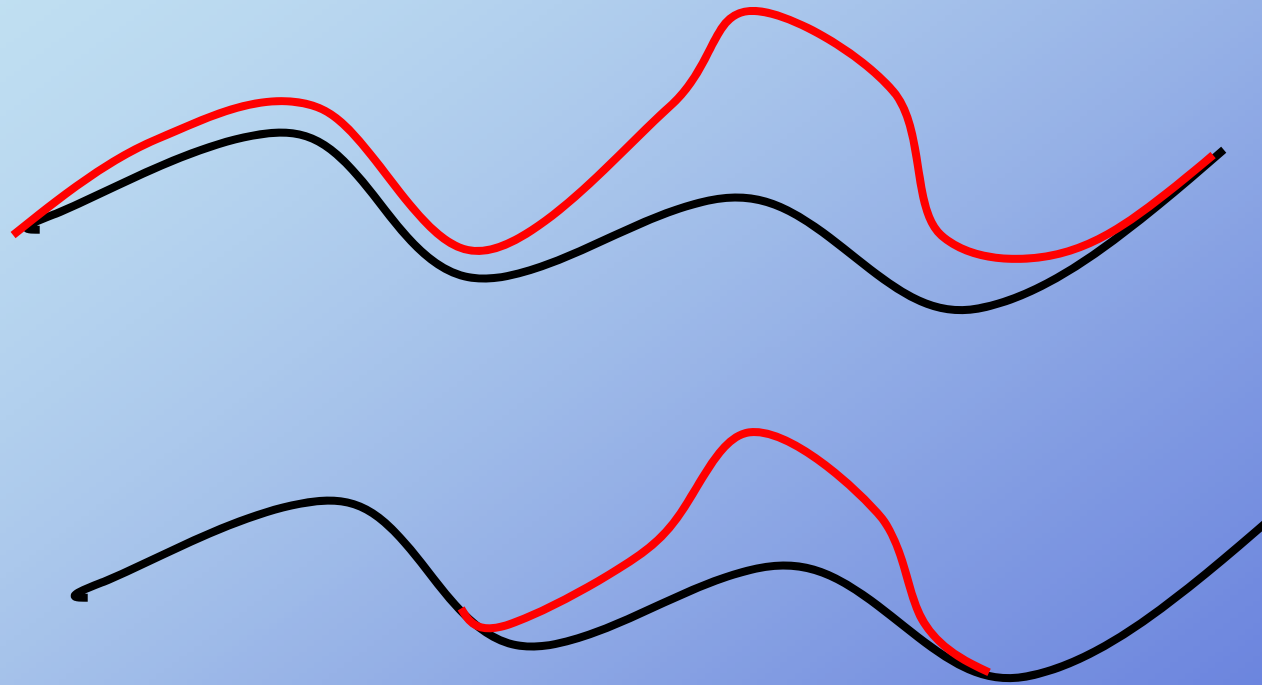


Rick Parent

Computer Animation



# Local v. Global Control

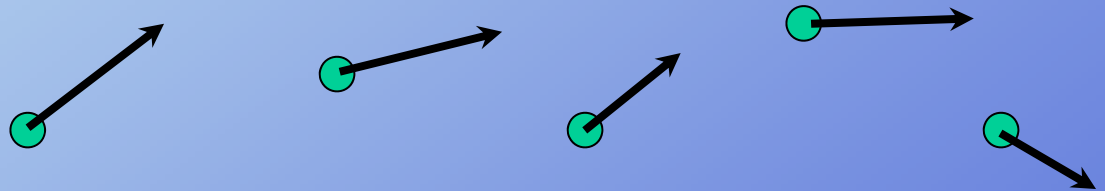


# Information requirements

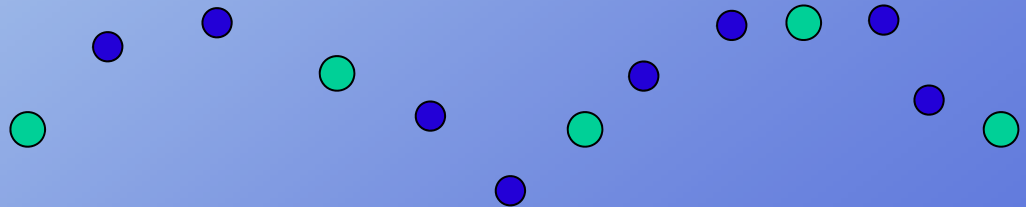
just the points



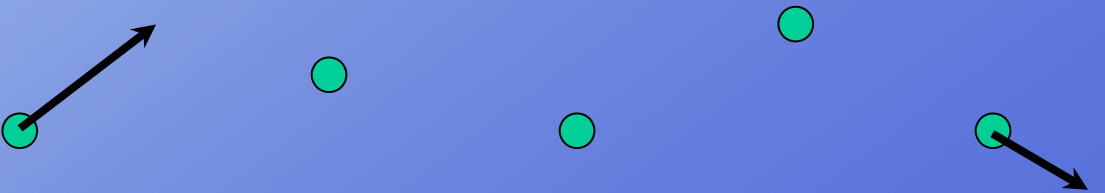
tangents



interior control points



just beginning and ending tangents



# Curve Formulations

**Lagrange Polynomial**

**Piecewise cubic polynomials**

**Hermite**

**Catmull-Rom**

**Blended Parabolas**

**Bezier**

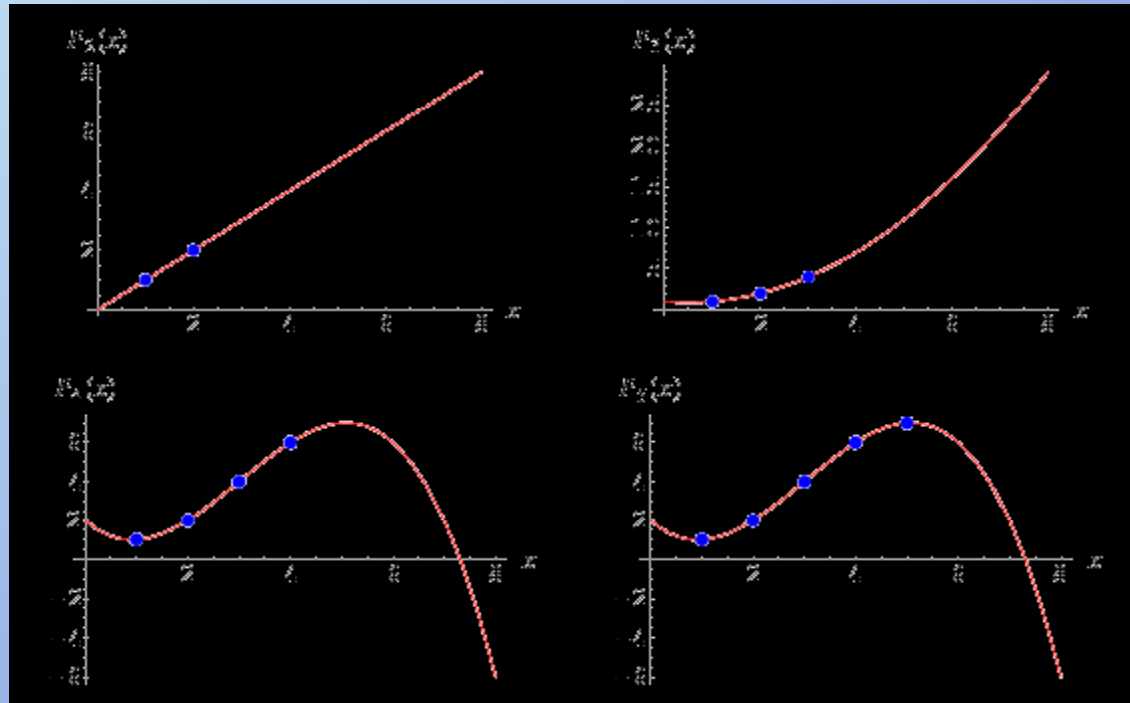
**B-spline**

**Tension-Continuity-Bias**

**4-Point Form**

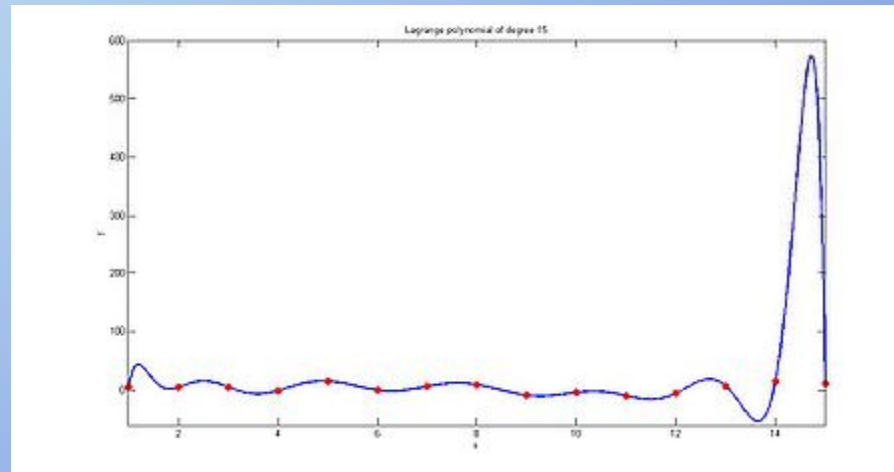
# Lagrange Polynomial

$$P_j(x) = y_j \prod_{\substack{k=1 \\ k \neq j}}^x \frac{x - x_k}{x_j - x_k}$$



# Lagrange Polynomial

$$P_j(x) = y_j \prod_{\substack{k=1 \\ k \neq j}}^x \frac{x - x_k}{x_j - x_k}$$



# Polynomial Curve Formulations

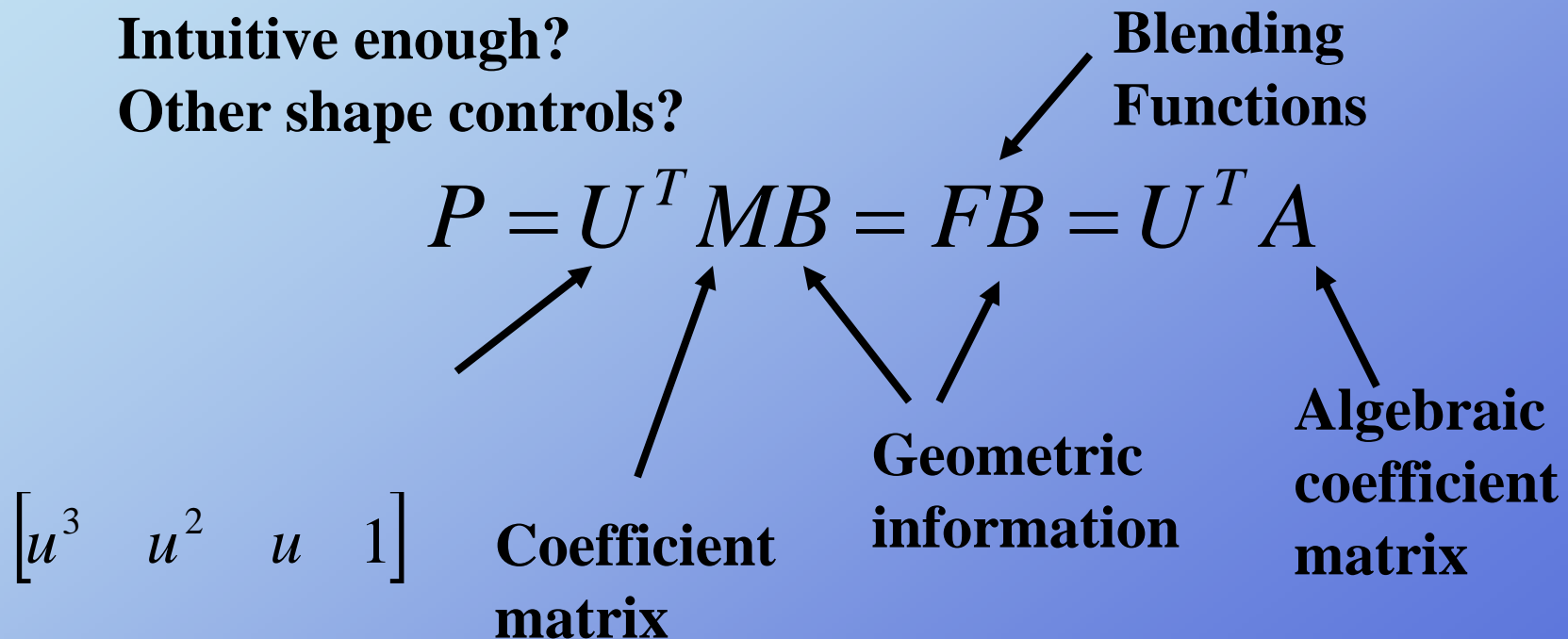
Need to match real-world data v. design from scratch

Information requirements: just points? tangents?

Qualities of final curve?

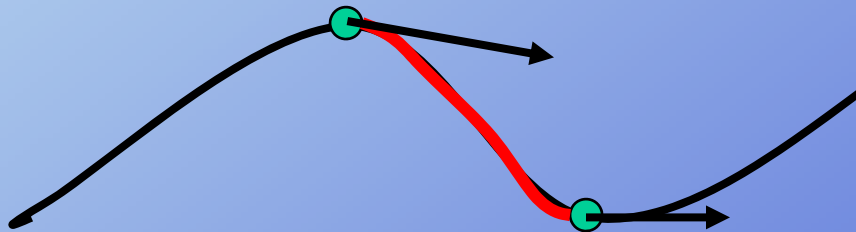
Intuitive enough?

Other shape controls?



# Hermite

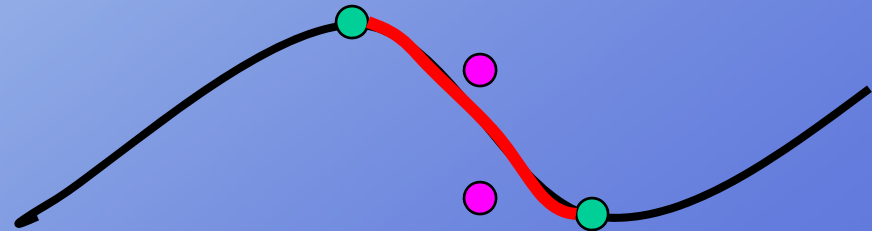
$$P = \begin{bmatrix} u^3 & u^2 & u & 1 \end{bmatrix} \begin{bmatrix} 2.0 & -2.0 & 1.0 & 1.0 \\ -3.0 & 3.0 & -2.0 & -1.0 \\ 0.0 & 0.0 & 1.0 & 0.0 \\ 1.0 & 0.0 & 0.0 & 0.0 \end{bmatrix} \begin{bmatrix} p_i \\ p_{i+1} \\ p_i' \\ p_{i+1}' \end{bmatrix}$$



# Cubic Bezier

$$P = \begin{bmatrix} u^3 & u^2 & u & 1 \end{bmatrix} \begin{bmatrix} 1.0 & 3.0 & -3.0 & 1.0 \\ 3.0 & -6.0 & 3.0 & 0.0 \\ -3.0 & 3.0 & 0.0 & 0.0 \\ 1.0 & 0.0 & 0.0 & 0.0 \end{bmatrix} \begin{bmatrix} p_i \\ p_{i+1} \\ p_{i+2} \\ p_{i+3} \end{bmatrix}$$

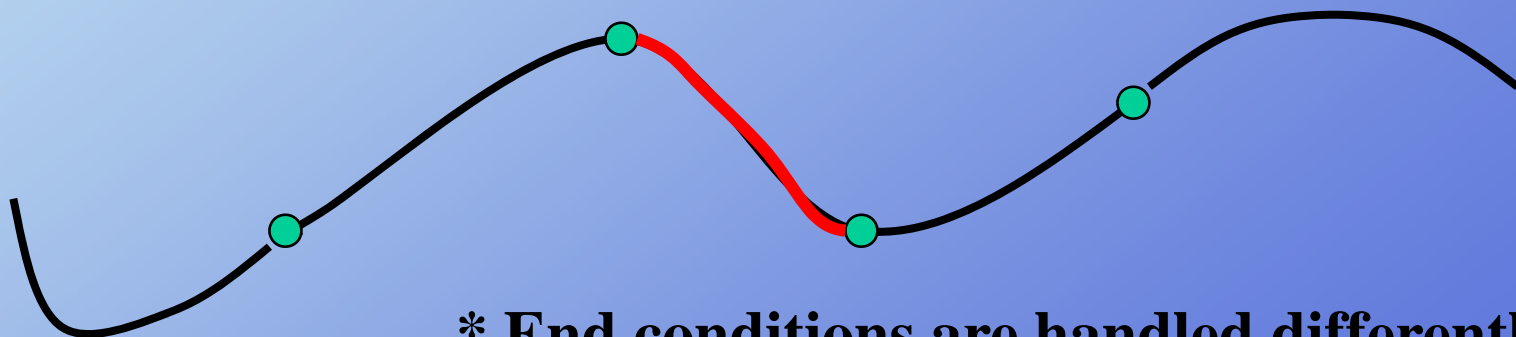
**Interior control points play the same role as the tangents of the Hermite formulation**



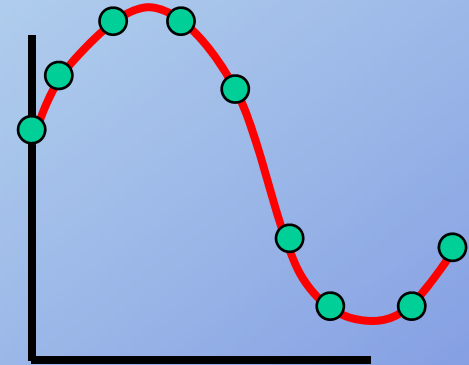


# Blended Parabolas/Catmull-Rom\*

$$P = \begin{bmatrix} u^3 & u^2 & u & 1 \end{bmatrix} \begin{bmatrix} -0.5 & 1.5 & -1.5 & 0.5 \\ 1 & -2.5 & 2 & -0.5 \\ -0.5 & 0 & 0.5 & 0 \\ 0 & 1 & 0 & 0 \end{bmatrix} \begin{bmatrix} p_{i-1} \\ p_i \\ p_{i+1} \\ p_{i+2} \end{bmatrix}$$



# Controlling Motion along $p=P(u)$



## Step 2. Reparameterization by arc length

$u = U(s)$  where  $s$  is distance along the curve

## Step 3. Speed control

for example, ease-in / ease-out

$s = \text{ease}(t)$  where  $t$  is time

# Reparameterizing by Arc Length

**Analytic**

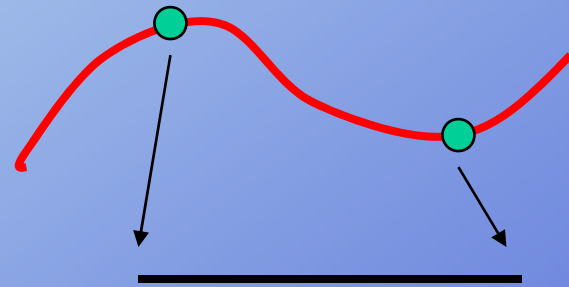
**Forward differencing**

**Supersampling**

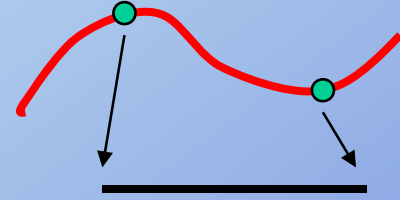
**Adaptive approach**

**Numerically**

**Adaptive Gaussian**



# Reparameterizing by Arc Length - analytic



$$P(u) = au^3 + bu^2 + cu + d$$

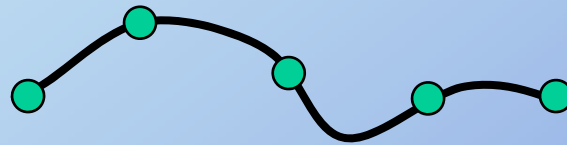
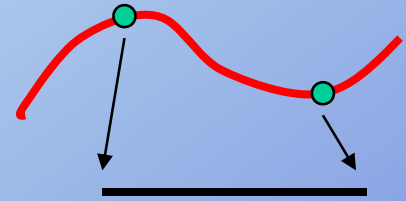
$$s = \int_{u_1}^{u_2} |dP / du| \, du$$

$$dP / du = \left( dx(u) / du \quad dy(u) / du \quad dz(u) / du \right)$$

$$|dP / du| = \sqrt{\left( dx(u) / du \right)^2 + \left( dy(u) / du \right)^2 + \left( dz(u) / du \right)^2}$$

**Can't always be solved analytically for our curves**

# Reparameterizing by Arc Length - supersample

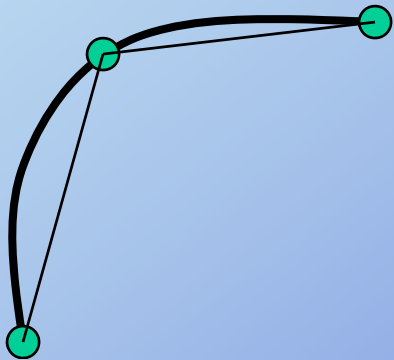


1. Calculate a bunch of points at small increments in  $u$
2. Compute summed linear distances as approximation to arc length
3. Build table of (parametric value, arc length) pairs

## Notes

1. Often useful to normalize total distance to 1.0
2. Often useful to normalize parametric value for multi-segment curve to 1.0

**Build  
table of  
approx.  
lengths**

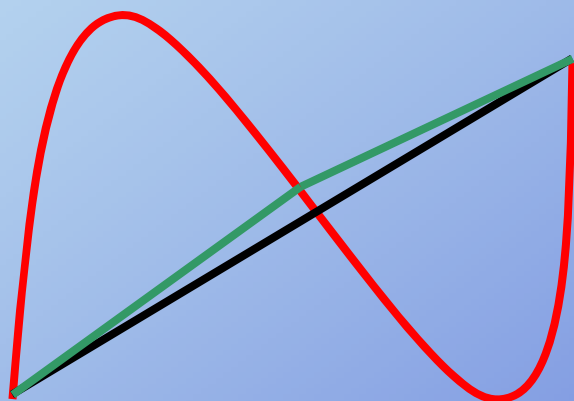
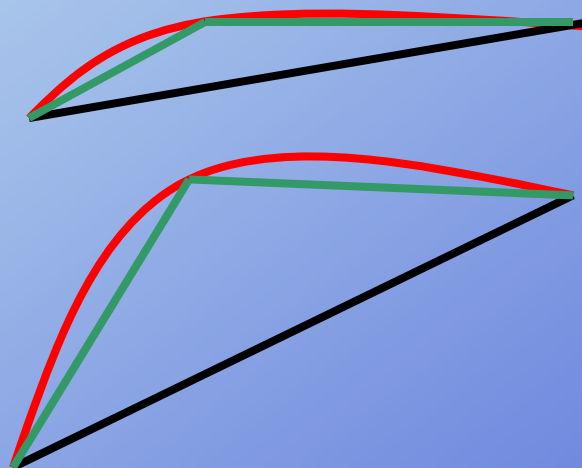


index	u	Arc Length
0	0.00	0.000
1	0.05	0.080
2	0.10	0.150
3	0.15	0.230
...	...	...
20	1.00	1.000

# Adaptive Approach

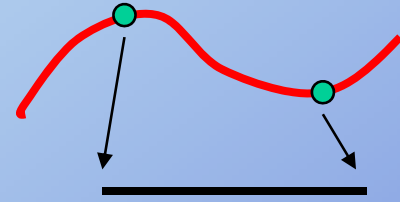
## How fine to sample?

Compare successive approximations and see if they agree within some tolerance



Test can fail – subdivide to predefined level, then start testing

# Reparameterizing by Arc Length - quadrature



$$\int_{-1}^{+1} f(u) du = \sum_i w_i f(u_i)$$

$$P(u) = au^3 + bu^2 + cu + d$$

$$\int_{-1}^{+1} \sqrt{Au^4 + Bu^3 + Cu^2 + Du + E}$$

**Lookup tables of weights and parametric values**

**Can also take adaptive approach here**



# Reparameterizing by Arc Length

**Analytic**

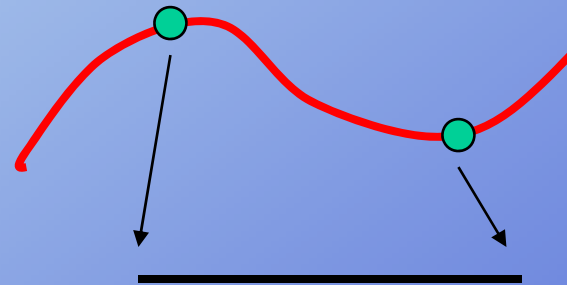
**Forward differencing**

**Supersampling**

**Adaptive approach**

**Numerically**

**Adaptive Gaussian**



**Sufficient for many problems**

# Speed Control

## Time-distance function

### Ease-in

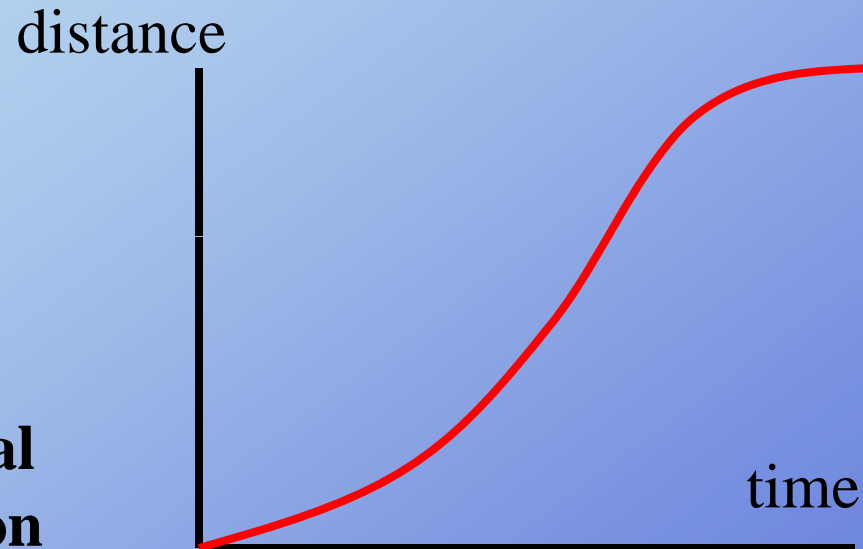
Cubic polynomial

Sinusoidal segment

Segmented sinusoidal

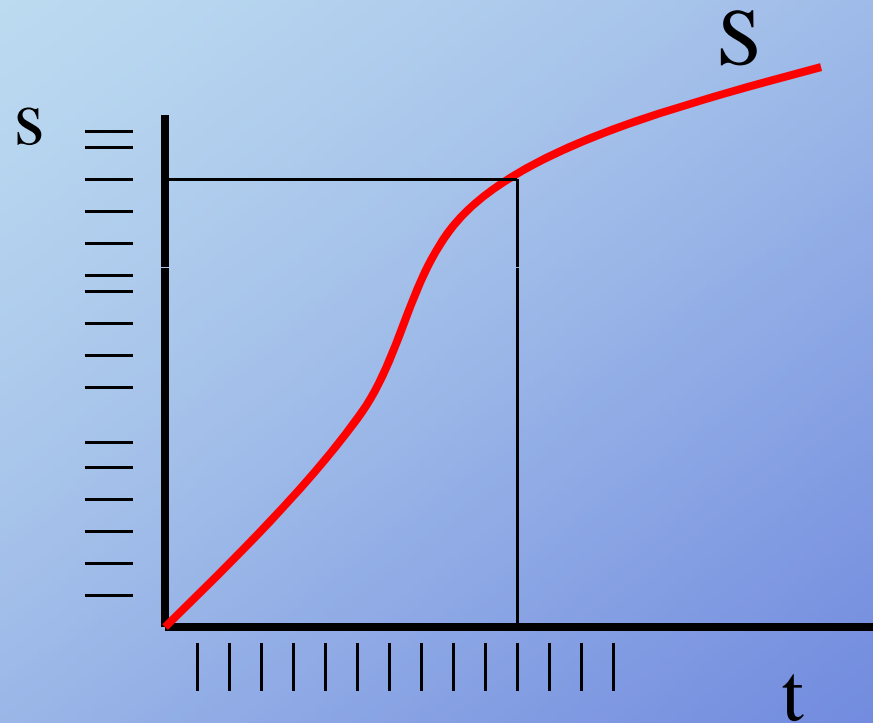
Constant acceleration

### General distance-time functions

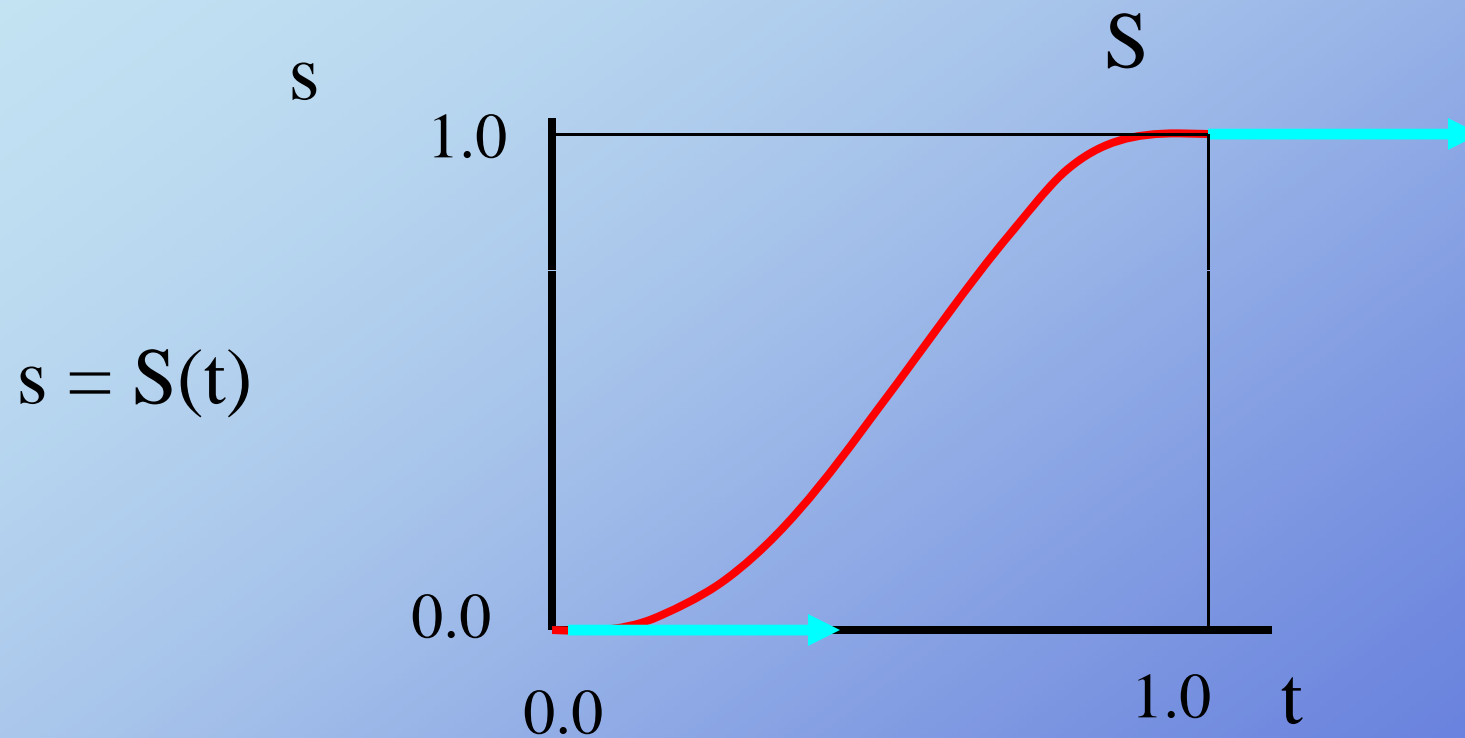


# Time Distance Function

$$s = S(t)$$

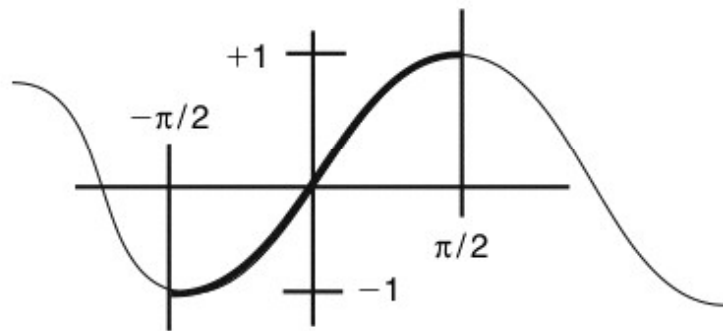


# Ease-in/Ease-out Function

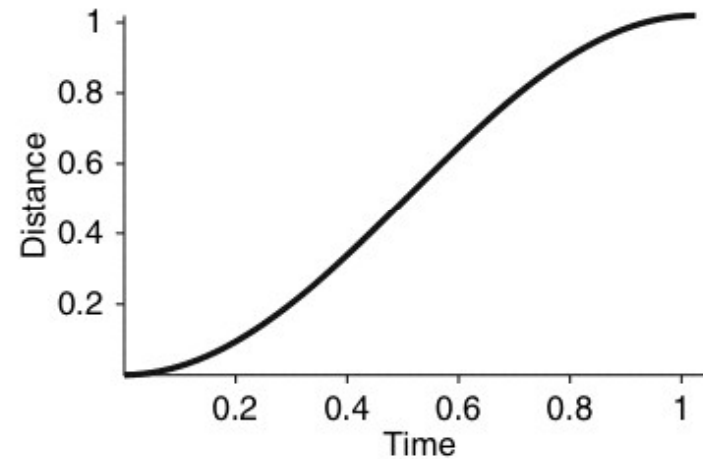


**Normalize distance and time to 1.0 to facilitate reuse**

# Ease-in: Sinusoidal



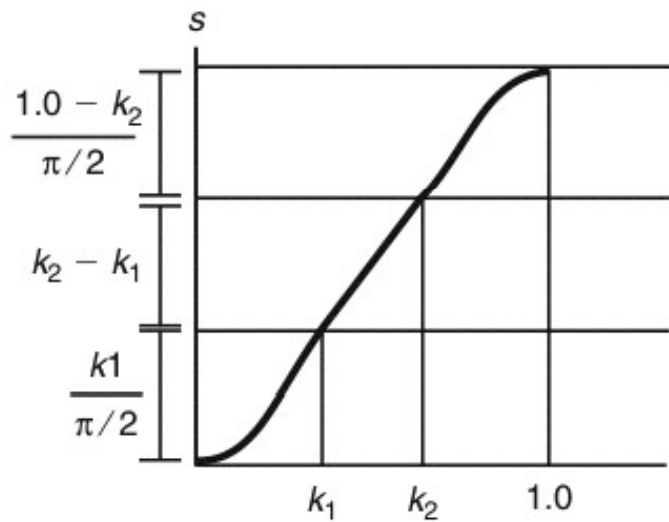
Sine curve segment to use as ease-in/ease-out control



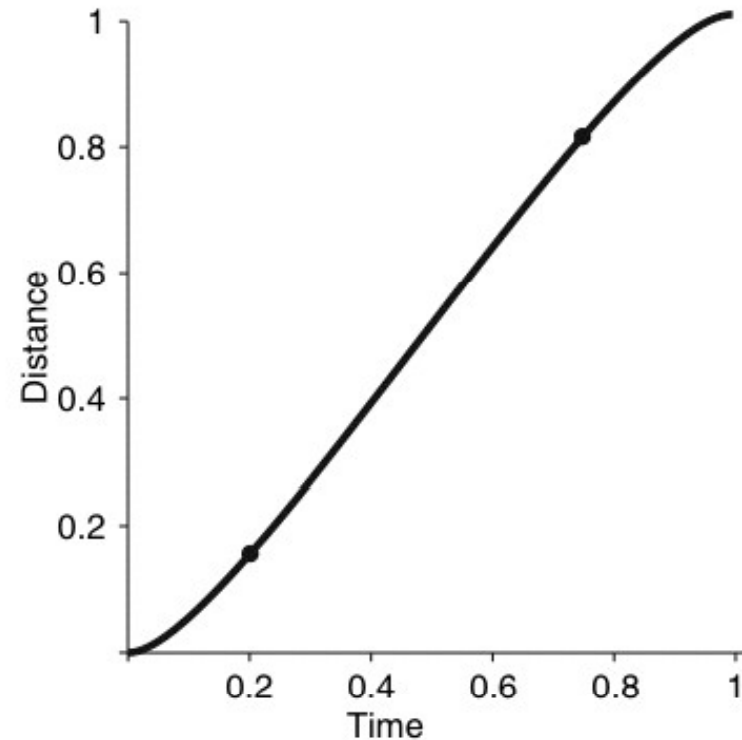
Sine curve segment mapped to useful values

$$s = \text{ease}(t) = (\sin(t\pi - \pi/2) + 1) / 2$$

# Ease-in: Piecewise Sinusoidal



Ease-in/ease-out curve as it is initially pieced together



Curve segments scaled into useful values with points marking segment junctions

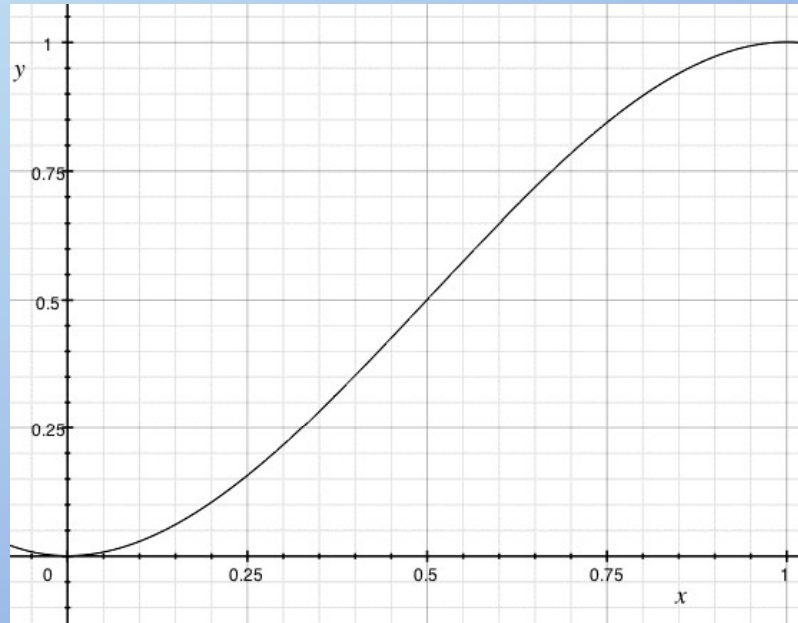
# Ease-in: Piecewise Sinusoidal

$$ease(t) = \begin{cases} \left( k_1 \frac{2}{\pi} \left( \sin\left( \frac{t\pi}{2k_1} - \frac{\pi}{2} \right) \right) \right) / f & t \leq k_1 \\ \left( \frac{k_1}{\pi/2} + t - k_1 \right) / f & k_1 < t \leq k_2 \\ \left( \frac{k_1}{\pi/2} + k_2 - k_1 + (1 - k_2) \frac{2}{\pi} \sin\left( \frac{\pi(t - k_2)}{2(1 - k_2)} \right) \right) / f & k_2 < t \end{cases}$$

where  $f = k_1 \frac{2}{\pi} + k_2 - k_1 + (1 - k_2) \frac{2}{\pi}$

**Provides linear (constant velocity) middle segment**

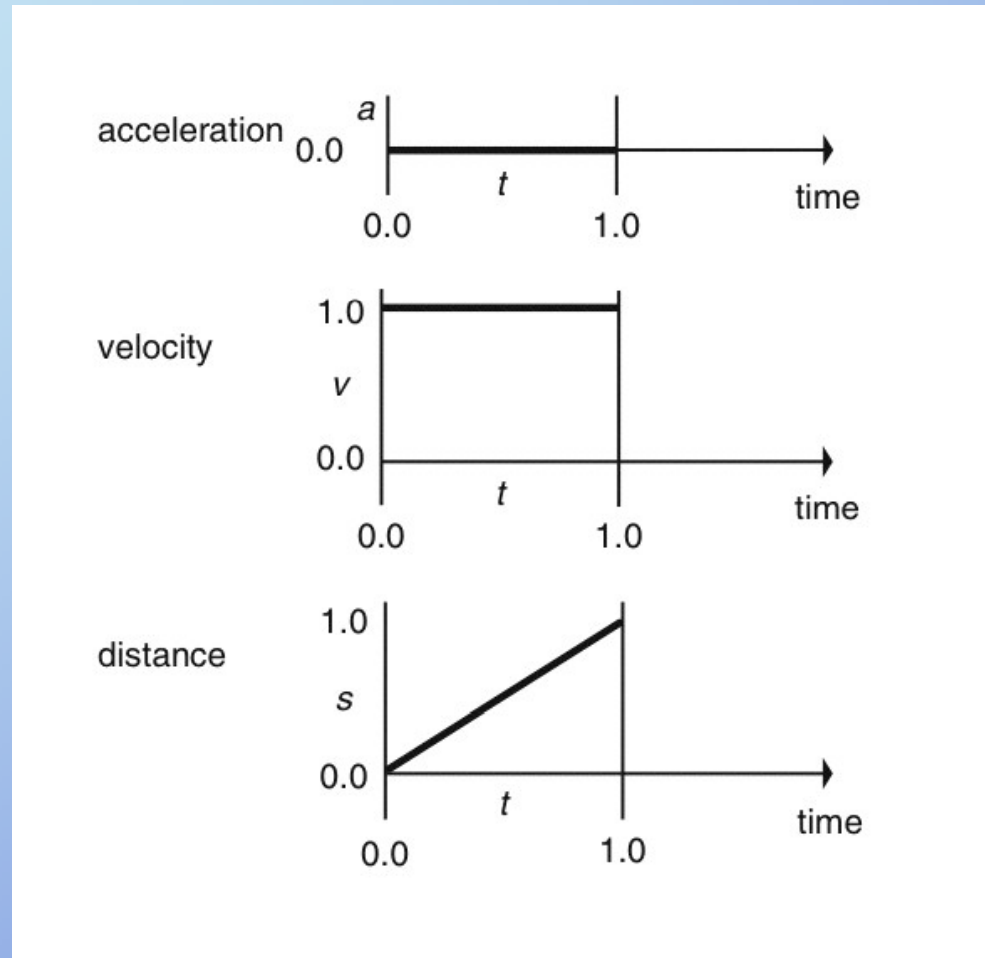
# Ease-in: Single Cubic



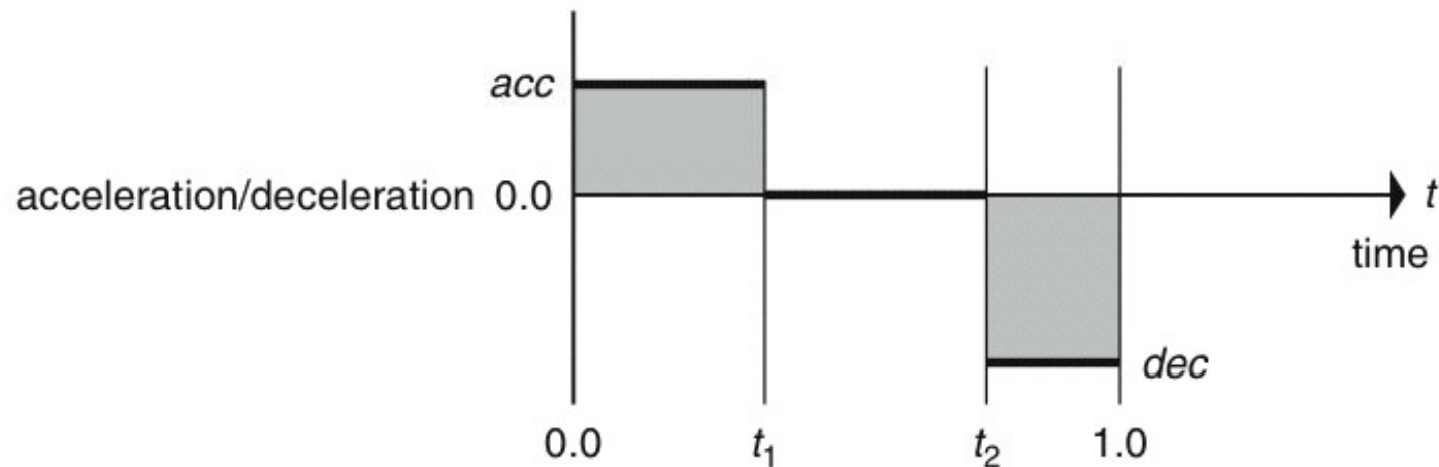
$$s = ease(t) = -2t^3 + 3t^2$$



# Ease-in: Constant Acceleration

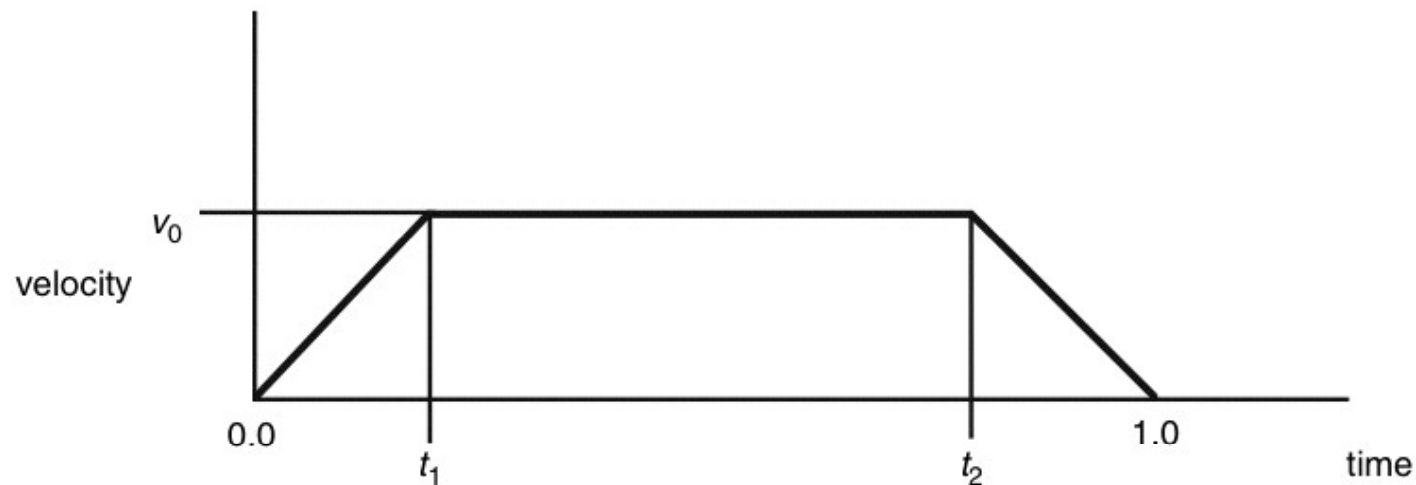


# Ease-in: Constant Acceleration



$$\begin{array}{ll} a = acc & 0 < t < t_1 \\ a = 0.0 & t_1 < t < t_2 \\ a = dec & t_2 < t < 1.0 \end{array}$$

# Ease-in: Constant Acceleration

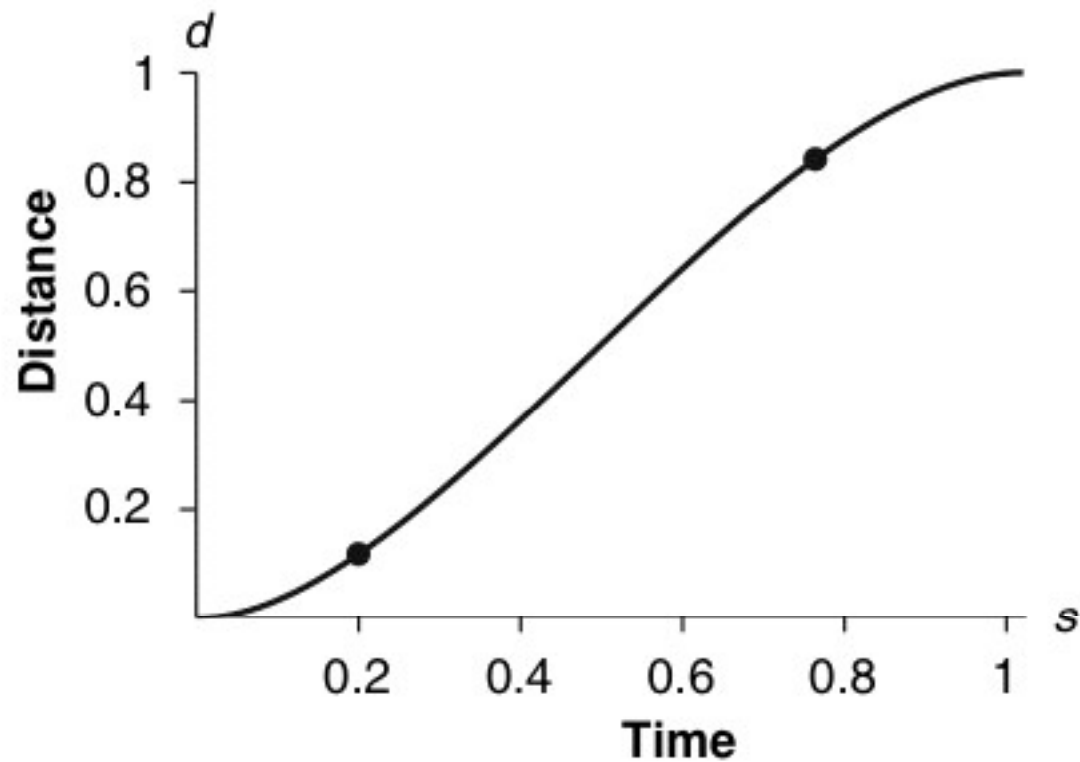


$$v = v_0 \cdot \frac{t}{t_1} \quad 0.0 < t < t_1$$

$$v = v_0 \quad t_1 < t < t_2$$

$$v = v_0 \cdot \left( 1.0 - \frac{t - t_2}{1 - t_2} \right) \quad t_2 < t < 1.0$$

# Ease-in: Constant Acceleration



# Constant Acceleration

$$d = v_0 \frac{t^2}{2t_1} \quad 0.0 < t \leq t_1$$

$$d = v_0 \frac{t_1}{2} + v_0(t - t_1) \quad t_1 < t \leq t_2$$

$$d = v_0 \frac{t_1}{2} + v_0(t_2 - t_1) + v_0 \left(1 - \frac{(t - t_2)}{2(1 - t_2)}\right)(t - t_2) \quad t_2 < t \leq 1.0$$

# Motivation - solution steps

**1. Construct a space curve that interpolates the given points with piecewise first order continuity**

$$\mathbf{p}=\mathbf{P}(\mathbf{u})$$

**2. Construct an arc-length-parametric-value function for the curve**

$$\mathbf{u}=\mathbf{U}(s)$$

**3. Construct time-arc-length function according to given constraints**

$$s=\mathbf{S}(t)$$

$$\mathbf{p}=\mathbf{P}(\mathbf{U}(\mathbf{S}(t)))$$

# Arbitrary Speed Control

**Animators can work in:**

**Distance-time space curves**

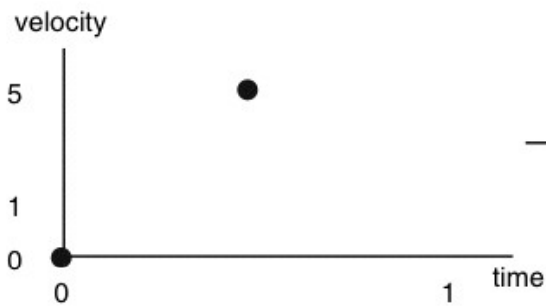
**Velocity-time space curves**

**Acceleration-time space curves**

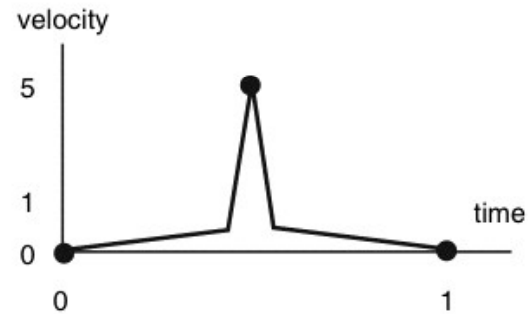
**Set time-distance constraints**

**etc.**

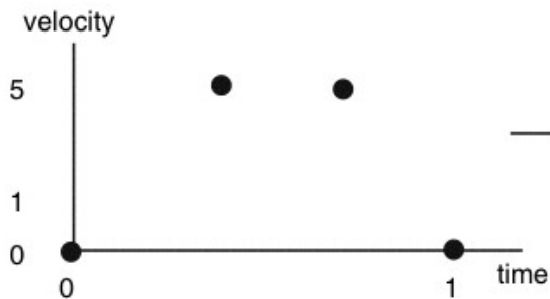
# Curve fitting to distance-time pairs



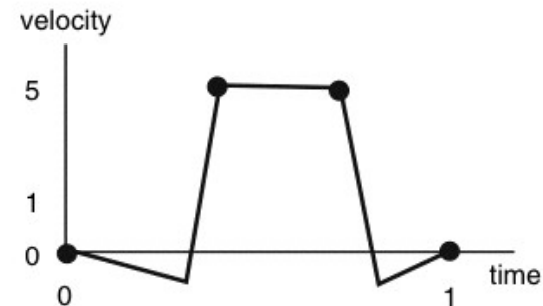
User-specified velocities



Possible solution to enforce total distance covered equal to one



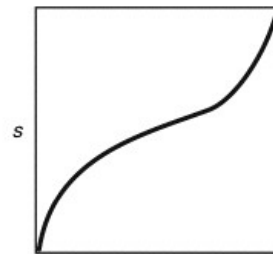
User-specified velocities



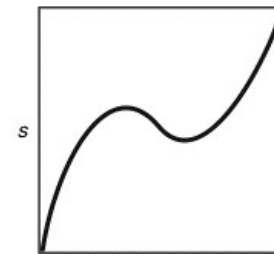
Possible solution to enforce total distance covered (signed area under the curve) equal to one. Negative velocity corresponds to



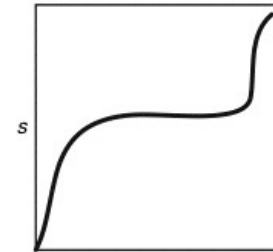
# Working with time-distance curves



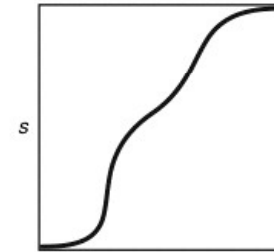
Starts and ends abruptly



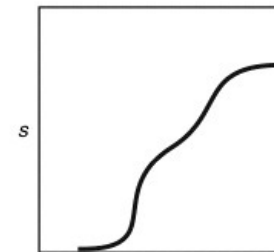
Backs up



Stalls

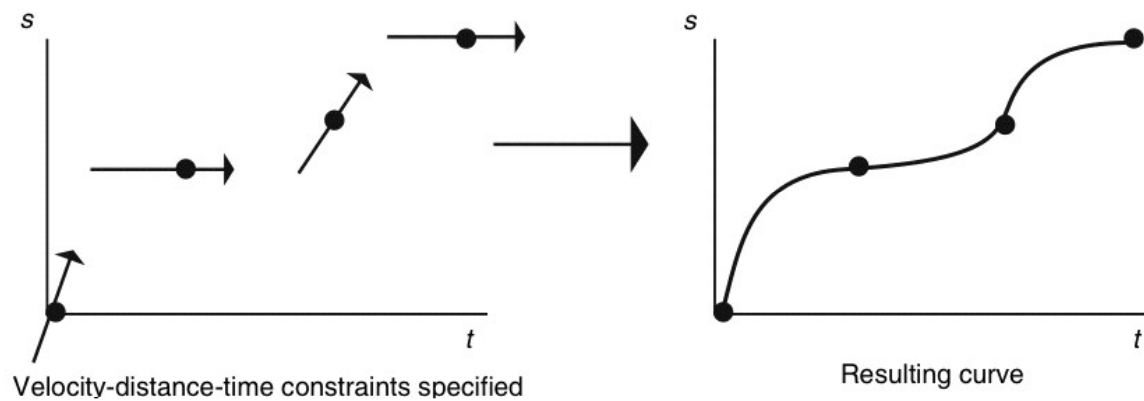
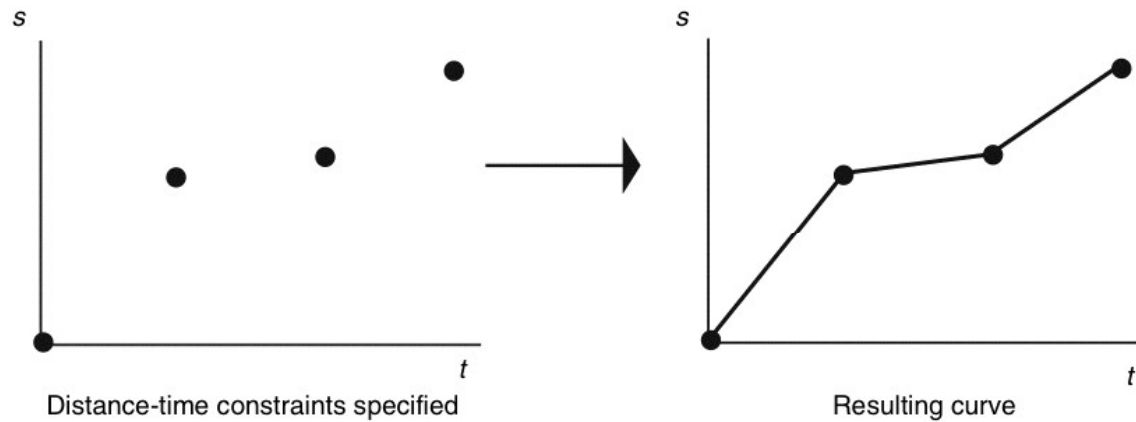


Starts partway along the curve  
and gets to the end before  $t = 1.0$

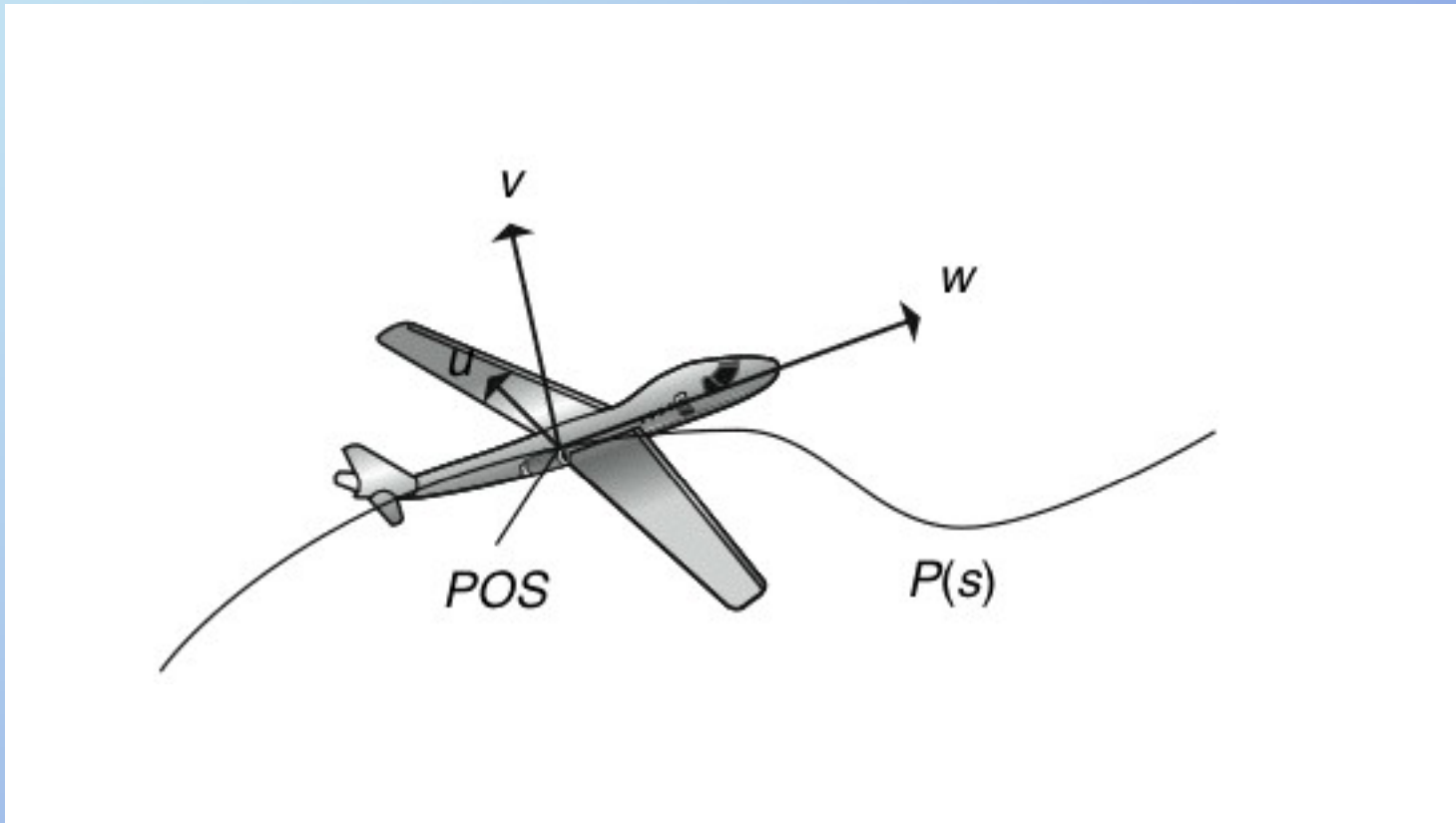


Waits a while before starting  
and does not reach the end

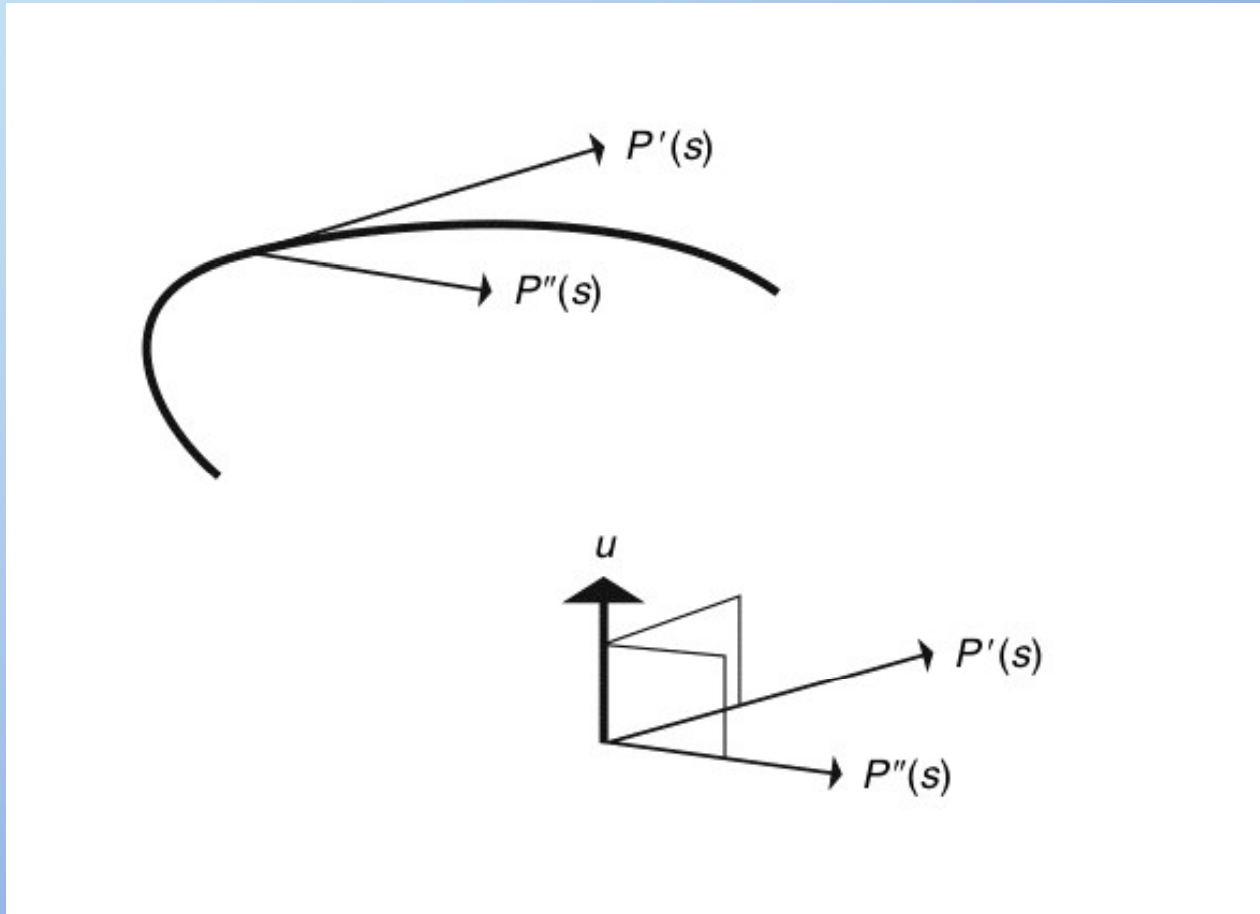
# Interpolating distance-time pairs



# Frenet Frame - control orientation



# Frenet Frame tangent & curvature vector

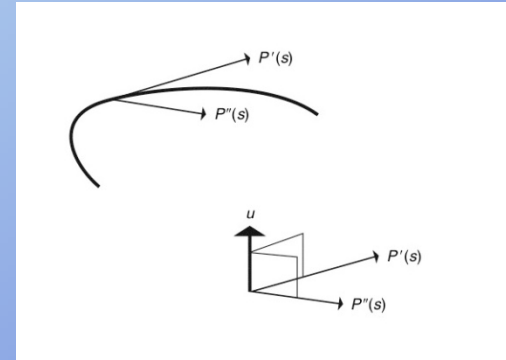


# Frenet Frame tangent & curvature vector

$$P(u) = UMB$$

$$P'(u) =$$

$$P''(u) =$$



$$U = \begin{bmatrix} u^3 & u^2 & u & 1 \end{bmatrix}$$

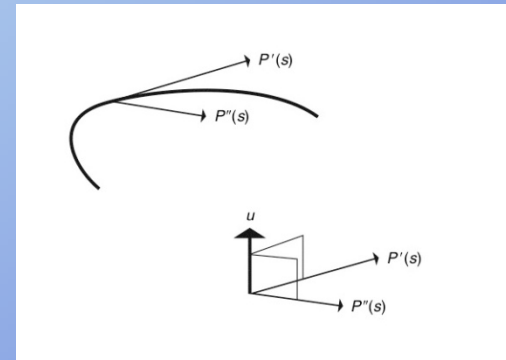
# Frenet Frame tangent & curvature vector

$$P(u) = UMB$$

$$P'(u) = U' MB$$

$$P''(u) = U'' MB$$

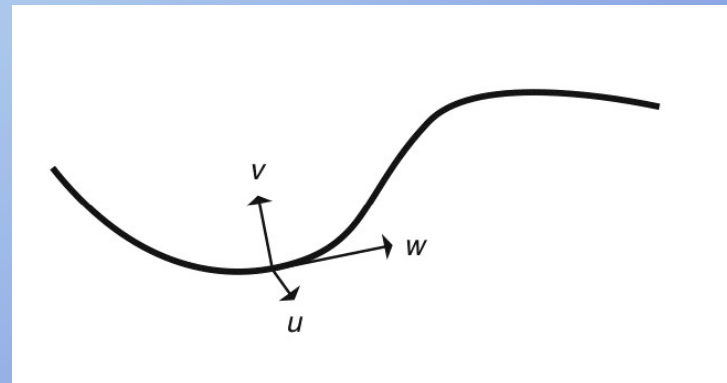
$$U = \begin{bmatrix} u^3 & u^2 & u & 1 \end{bmatrix}$$
$$U' = \begin{bmatrix} 3u^2 & 2u & 1 & 0 \end{bmatrix}$$
$$U'' = \begin{bmatrix} 6u & 2 & 0 & 0 \end{bmatrix}$$



# Frenet Frame local coordinate system

- Directly control orientation of object/camera

- Use for direction and bank into turn, especially for ground-planar curves (e.g. roads)

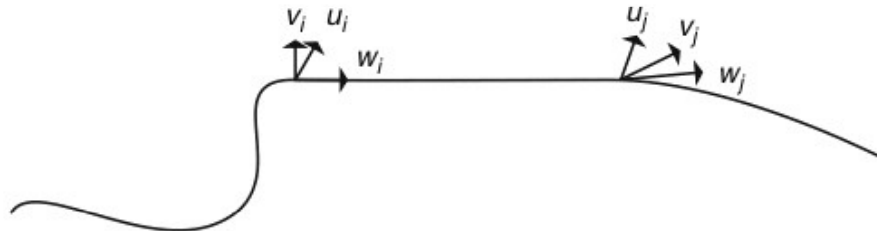


- $v$  is perpendicular to  $w$  if curve is parameterized by arclength; otherwise probably not perpendicular

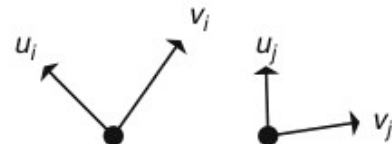
- For general curve must

$$v = wxu$$

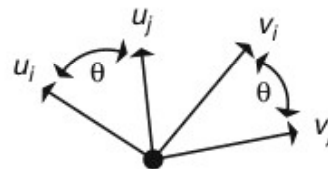
# Frenet Frame - undefined



Frenet frames on the boundary of an undefined Frenet frame segment because of zero curvature.



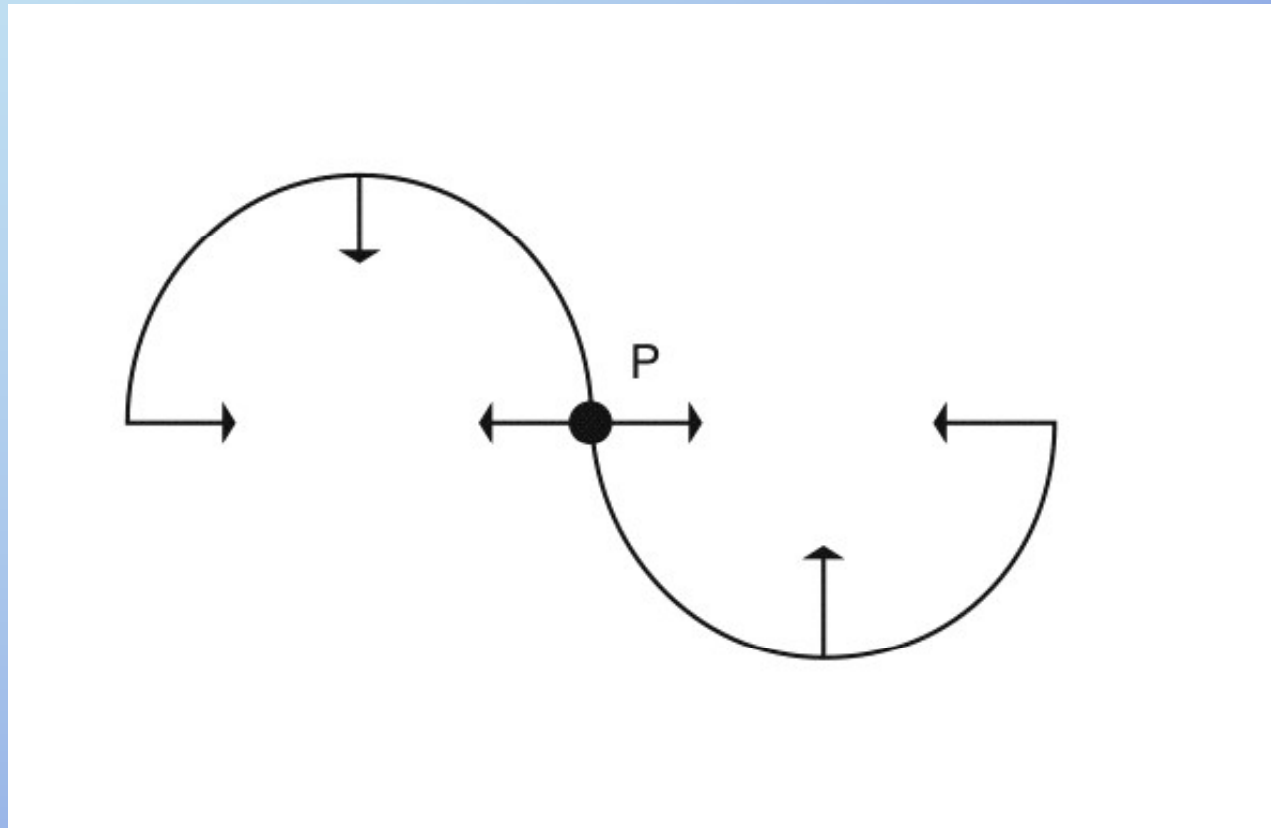
The two frames sighted down the (common)  $w$  vector.



The two frames superimposed to identify angular difference.

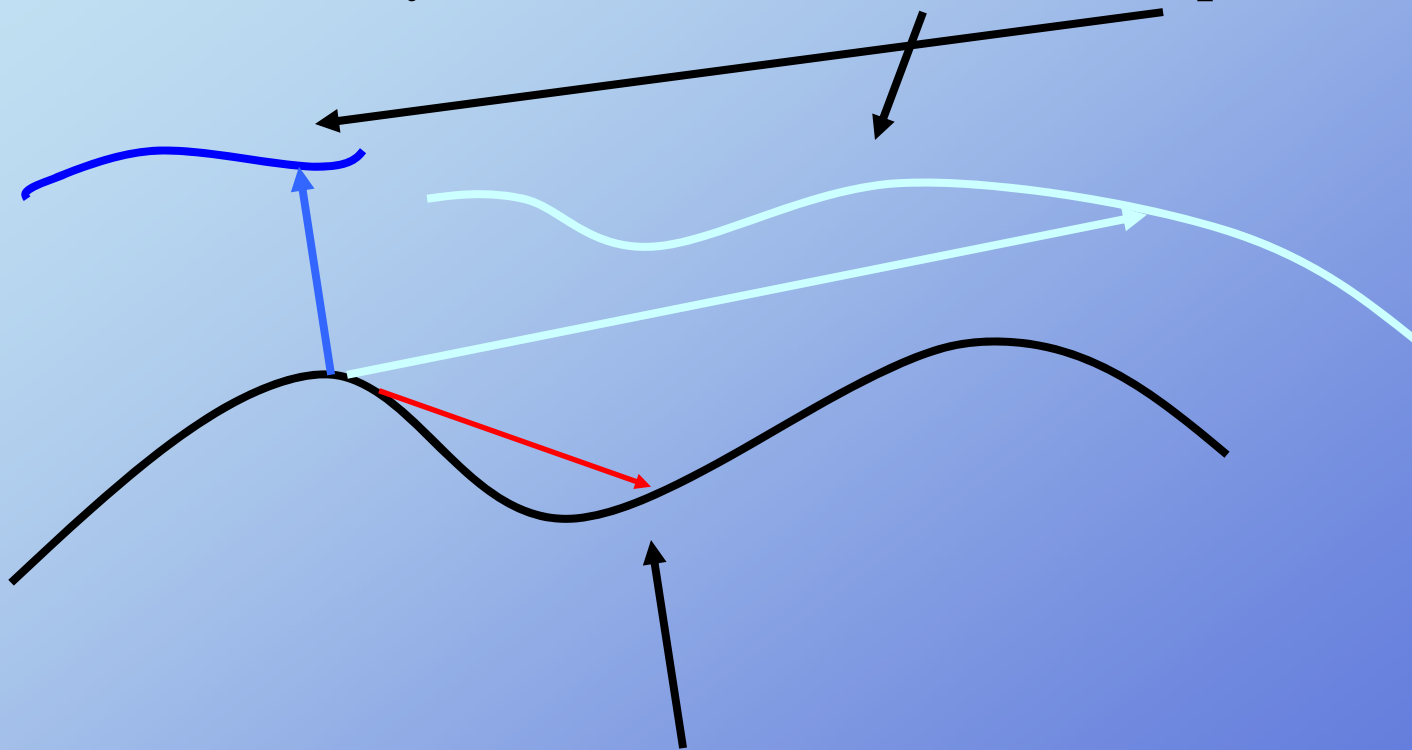


# Frenet Frame - discontinuity



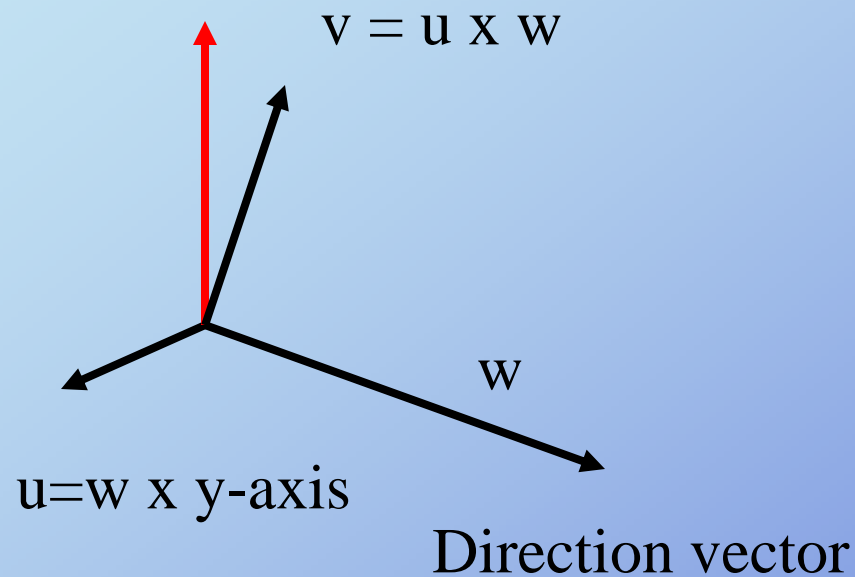
# Other ways to control orientation

Use auxiliary curve to define direction or up vector



Use point  $P(s+ds)$  for direction

# Direction & Up vector



To keep 'head up', use y-axis to compute over and up vectors perpendicular to direction vector

If up vector supplied, use that instead of y-axis

# Orientation interpolation

**Preliminary note:**

- 1. Remember that  $Rot_q(v) \equiv Rot_{kq}(v)$**
- 2. Affects of scale are divided out by the inverse appearing in quaternion rotation**
- 3. When interpolating quaternions, use UNIT quaternions – otherwise magnitudes can interfere with spacing of results of interpolation**

# Orientation interpolation

Quaternions can be interpolated to produce in-between orientations:

$$q = (1 - k)q_1 + kq_2$$

**2 problems analogous to issues when interpolating positions:**

- 1. How to take equi-distant steps along orientation path?**

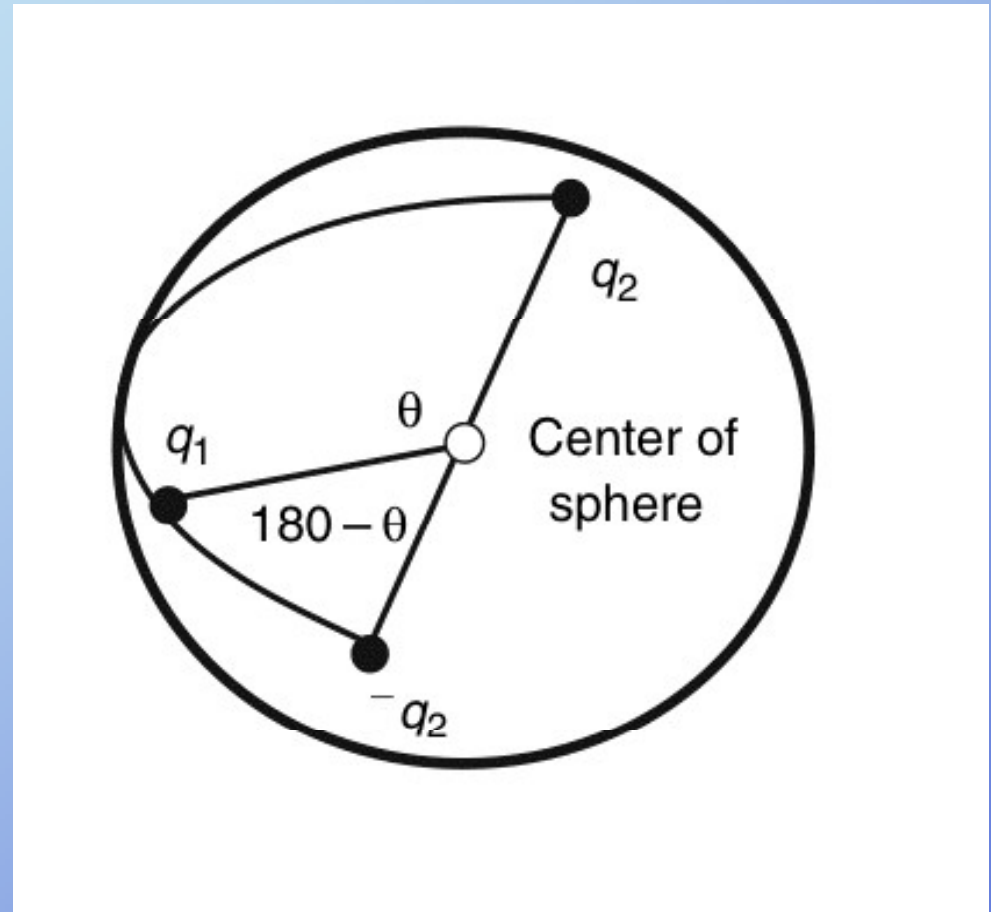
- 2. How to pass through orientations smoothly (1<sup>st</sup> order continuous)**

- 3. And another particular to quaternions: with dual unit quaternion representations, which to use?**

# Dual representation

$$Rot_q(v) = Rot_{kq}(v)$$

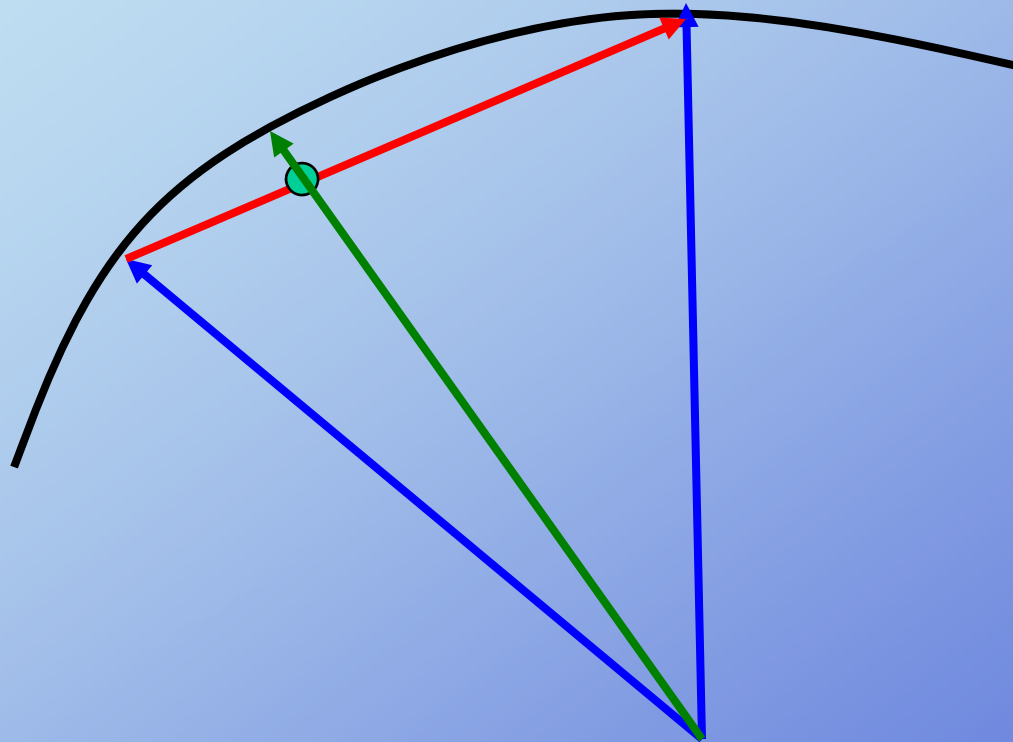
Dual unit quaternion representations



For Interpolation between  $q_1$  and  $q_2$ , compute cosine between  $q_1$  and  $q_2$  and between  $q_1$  and  $-q_2$ ; choose smallest angle

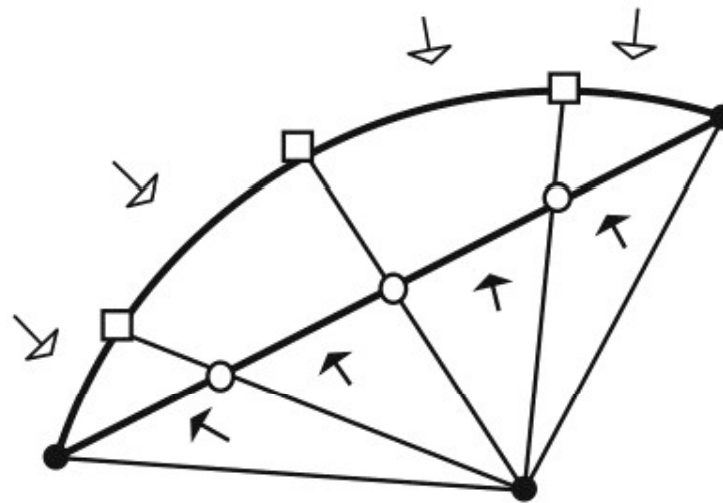
# Interpolating quaternions

Unit quaternions form set of points on 4D sphere



**Linearly interpolating unit quaternions: not equally spaced**

# Interpolating quaternions in great arc => equal spacing



- linearly interpolated intermediate points
- projection of intermediate points onto circle
- equal intervals
- ↷ unequal intervals



# Interpolating quaternions with equal spacing

$$\text{slerp}(q_1, q_2, u) = \frac{\sin(1-u)\theta}{\sin \theta} q_1 + \frac{\sin u\theta}{\sin \theta} q_2$$

where  $q_1 \cdot q_2 = \cos \theta$

**‘slerp’, spherical linear interpolation is a function of**

- the beginning quaternion orientation, q1**
- the ending quaternion orientation, q2**
- the interpolant, u**

# Smooth Orientation interpolation

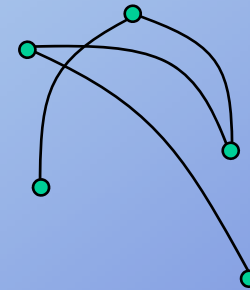
Use quaternions

Interpolate along great arc (in 4-space) using cubic Bezier on sphere

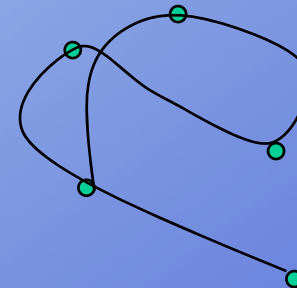
1. Select representation to use from duals
2. Construct interior control points for cubic Bezier
3. use DeCasteljau construction of cubic Bezier

# Smooth quaternion interpolation

Similar to first order continuity desires with positional interpolation

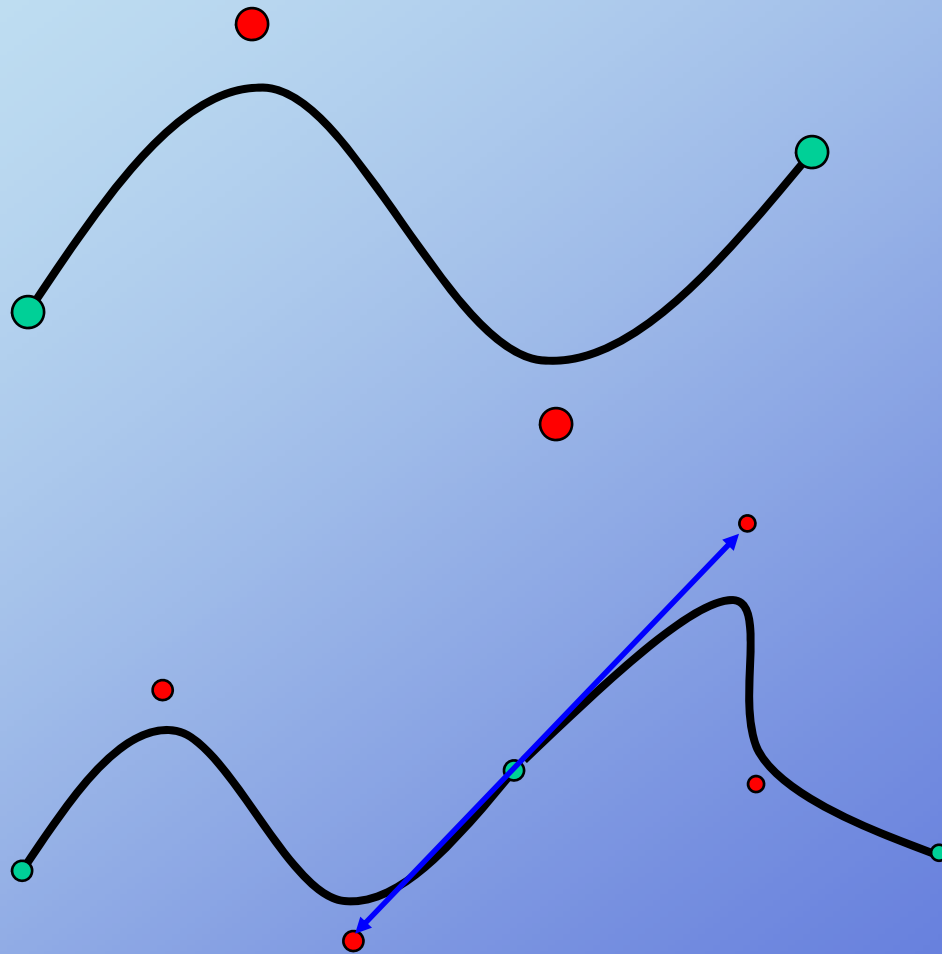


How to smoothly interpolate through orientations  $q_1, q_2, q_3, \dots, q_n$



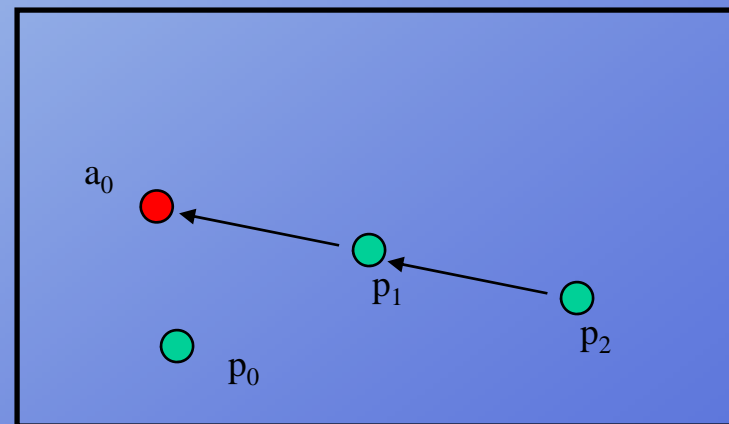
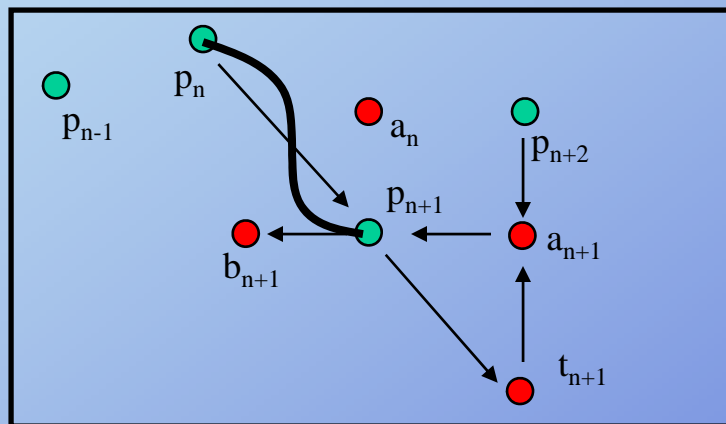
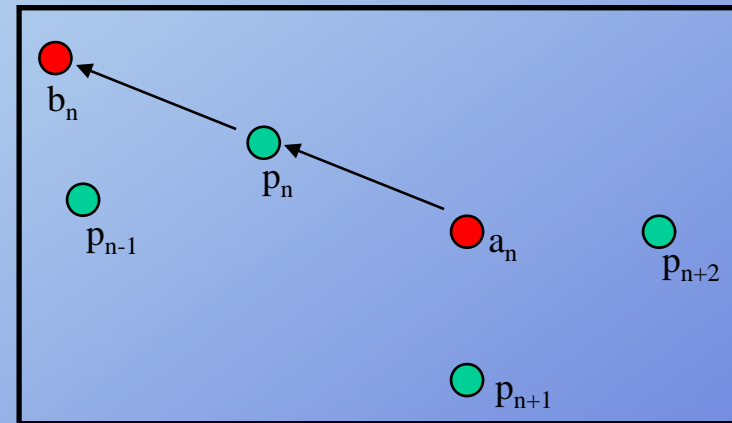
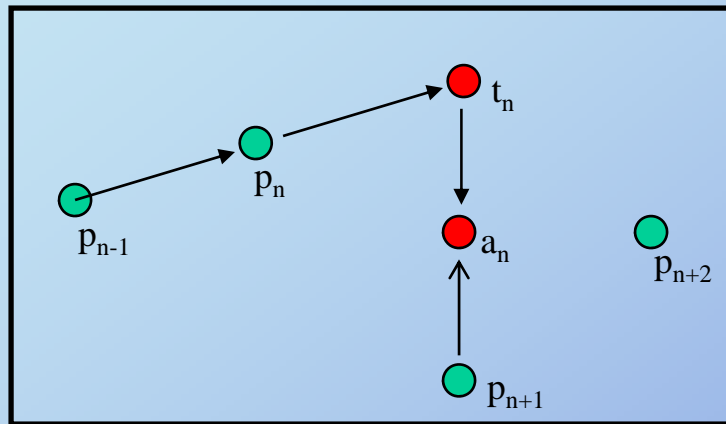
Bezier interpolation – geometric construction

# Bezier interpolation



# Bezier interpolation

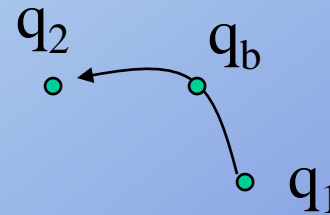
Construct interior control points



# Quaternion operators

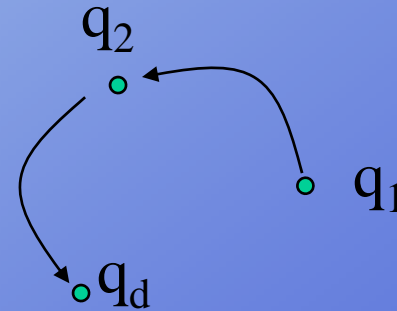
## **bisect( $q_1, q_2$ )**

Similar to forming a vector between 2 points, form the rotation between 2 orientations



## **double( $q_1, q_2$ )**

Given 2 orientations, form result of applying rotation between the two to 2<sup>nd</sup> orientation



# Quaternion operators:

$$\text{double}(p, q) = r$$

Given p and q, form r

‘Double’ where q’ is the mid-orientation between p and the yet-to-be-determined r

If p and q are unit quaternions,

Then  $q' = \cos(\theta)q$  and  $\cos(\theta) = p \cdot q$

$$q' = \cos(\theta)q = (p \cdot q)q$$

$$\text{double}(p, q) = r = q' + (q' - p) = 2(p \cdot q)q - p$$

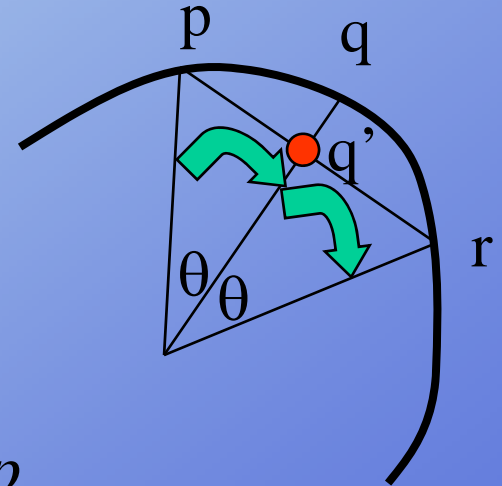
$$\text{bisect}(p, r) = q$$

Given p and r, form q

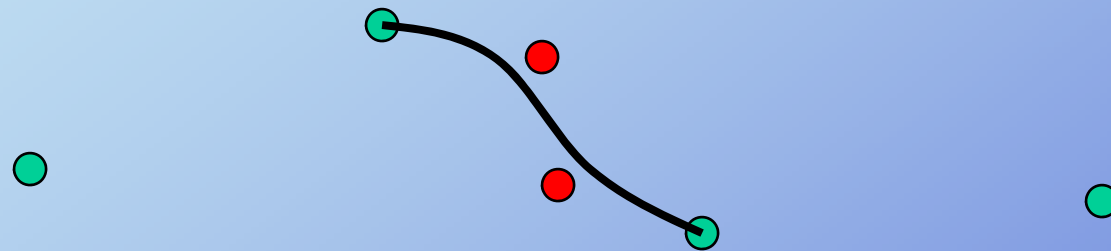
Bisect 2 orientations:

if p and r are unit length

$$\text{bisect}(p, r) = \frac{p + r}{\|p + r\|} = q$$



# Bezier interpolation

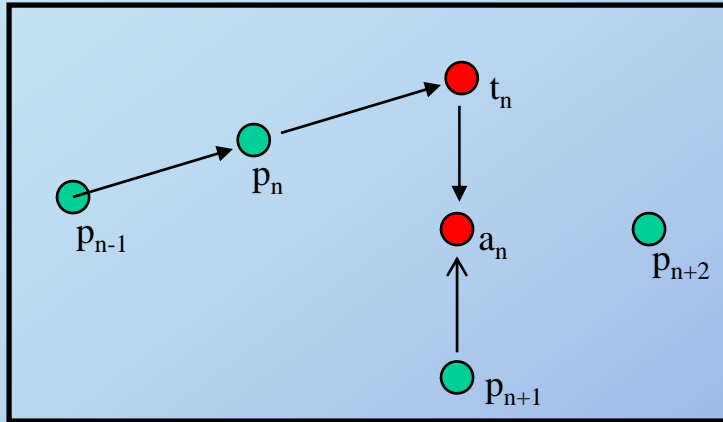


**Need quaternion-friendly operators  
to form interior control points**

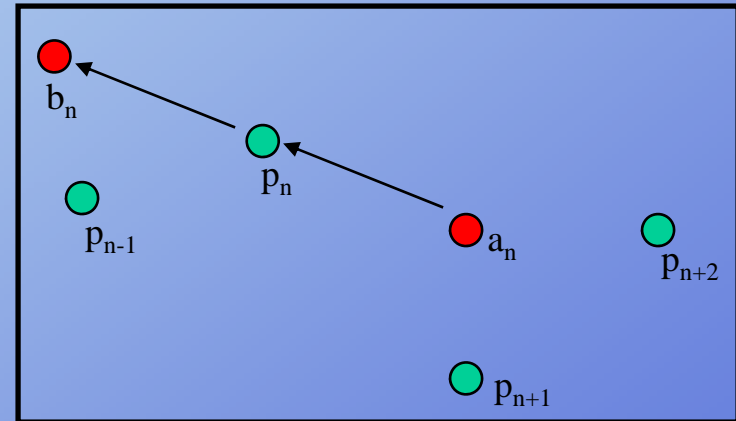


# Bezier interpolation

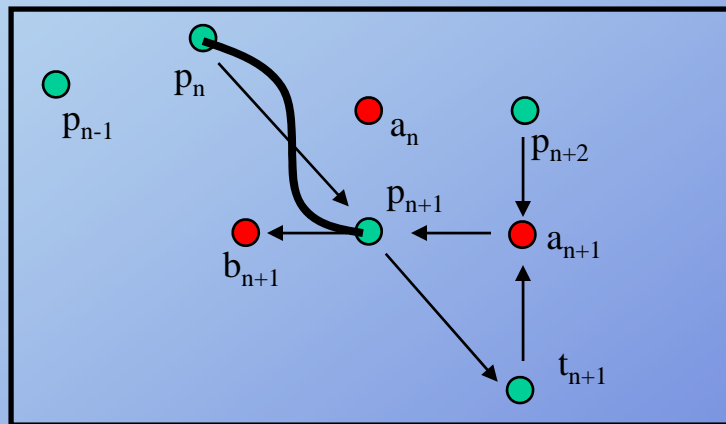
Construct interior control points



$$a_n = \text{bisect}(\text{double}(p_{n-1}, p_n), p_{n+1})$$



$$b_n = \text{double}(a_n, q_n)$$



Bezier segment:

$$q_n, a_n, b_{n+1}, q_{n+1}$$

# Bezier construction using quaternion operators



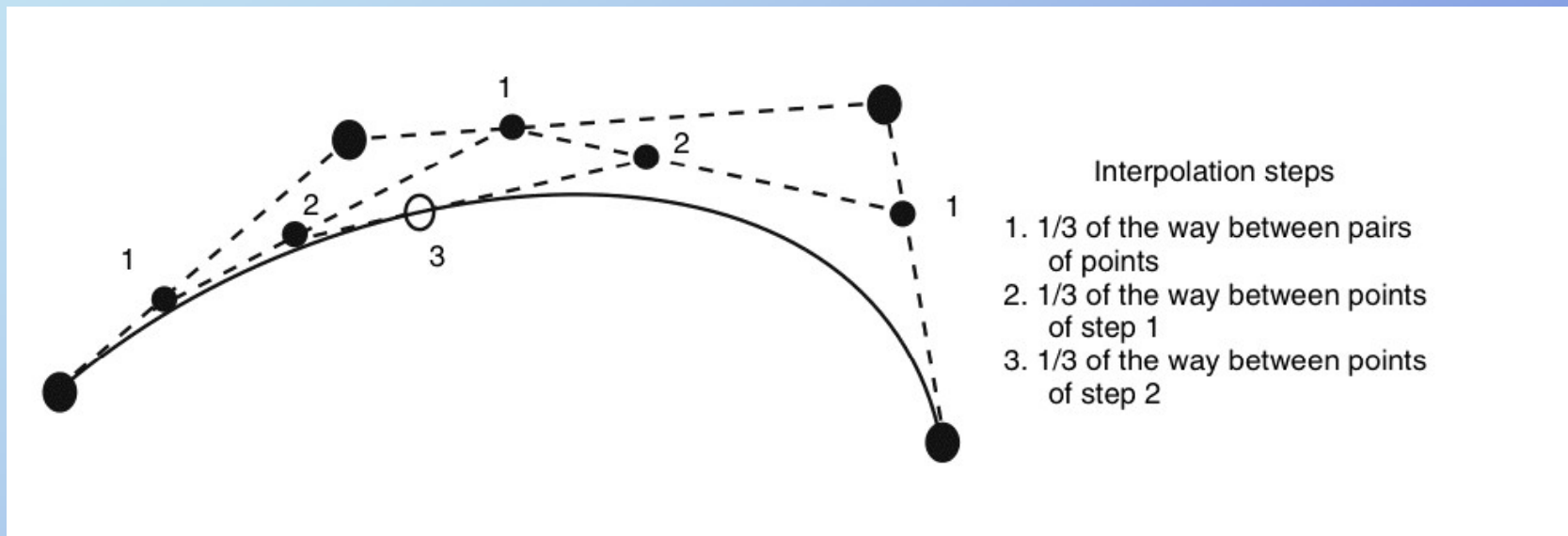
**Need quaternion-friendly operations to interpolate cubic Bezier curve using ‘quaternion’ points**



**de Casteljau geometric construction algorithm**

# Bezier construction using quaternion operators

For  $p(1/3)$



$$t_1 = \text{slerp}(q_n, a_n, 1/3)$$

$$t_2 = \text{slerp}(a_n, b_{n+1}, 1/3)$$

$$t_3 = \text{slerp}(b_{n+1}, q_{n+1}, 1/3)$$

$$t_{12} = \text{slerp}(t_1, t_2, 1/3)$$

$$t_{23} = \text{slerp}(t_{12}, t_{23}, 1/3)$$

$$q = \text{slerp}(t_{12}, t_{23}, 1/3)$$

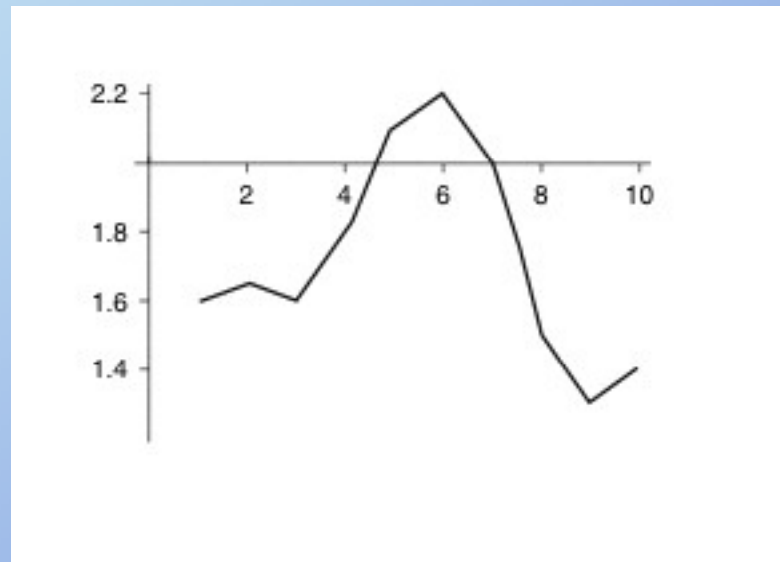
# Working with paths

**Smoothing a path**

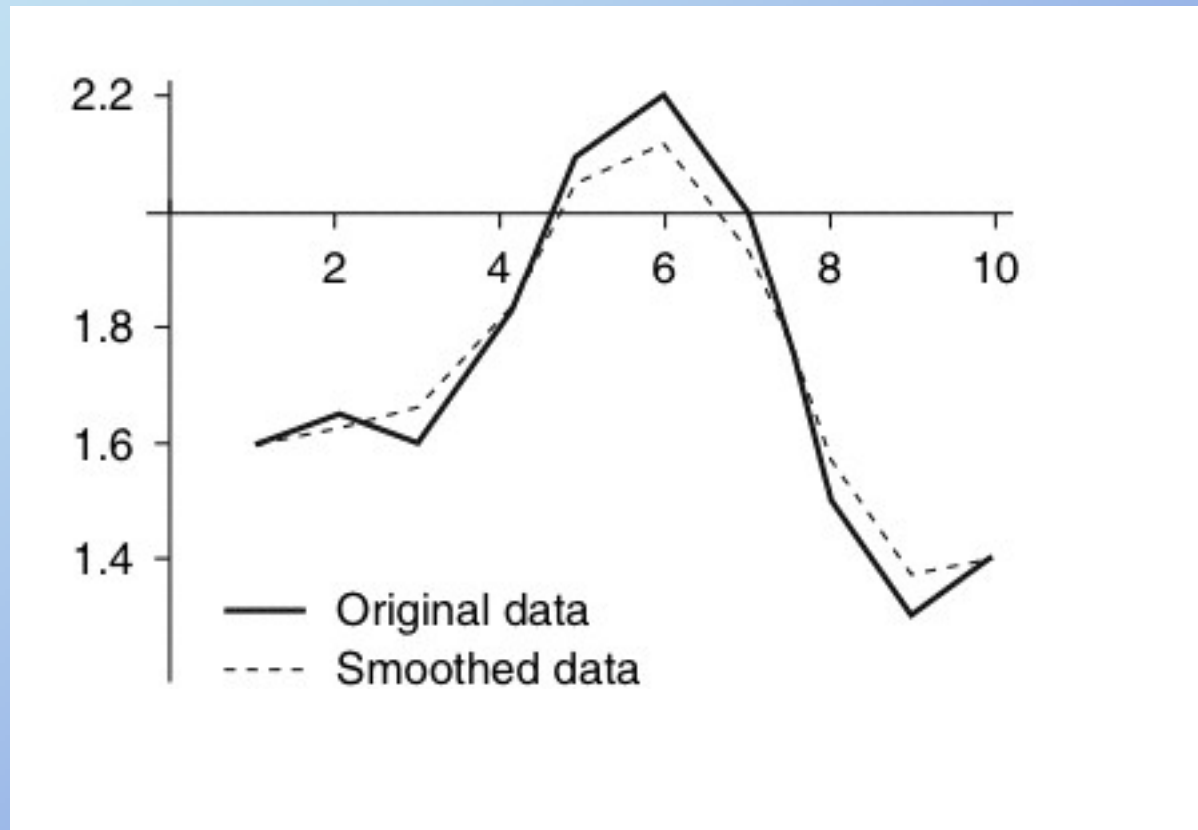
**Determining a path along a surface**

**Finding downhill direction**

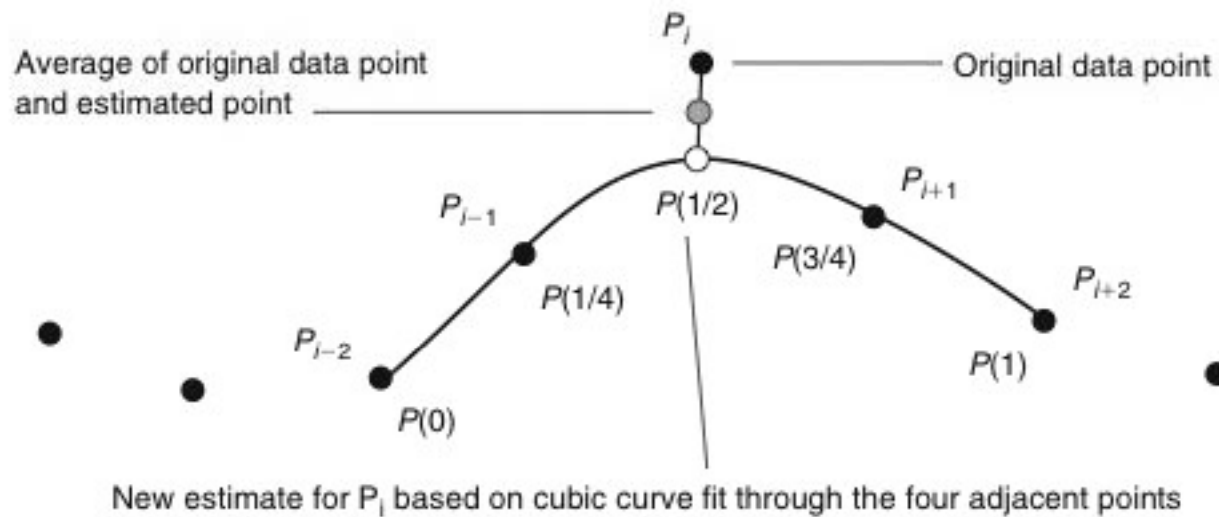
# Smoothing data



# Smoothing data

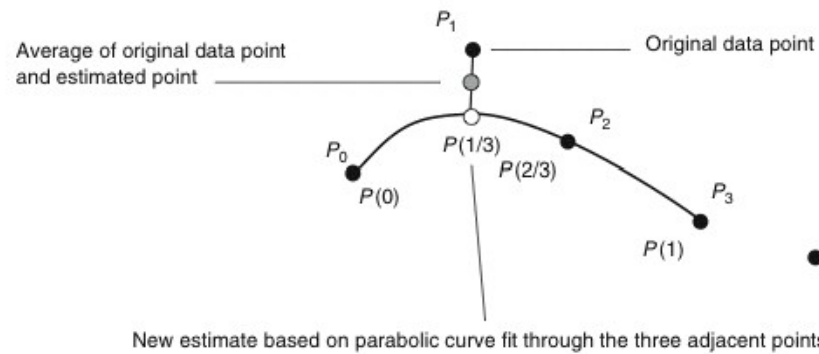
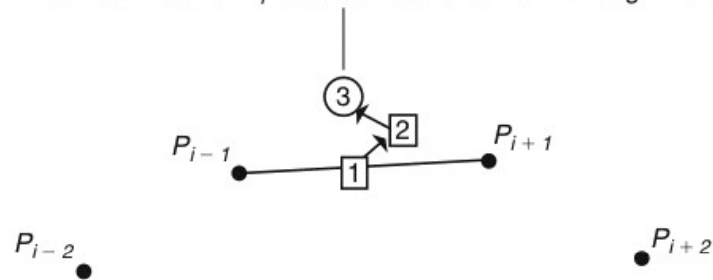


# Smoothing data



# Smoothing data

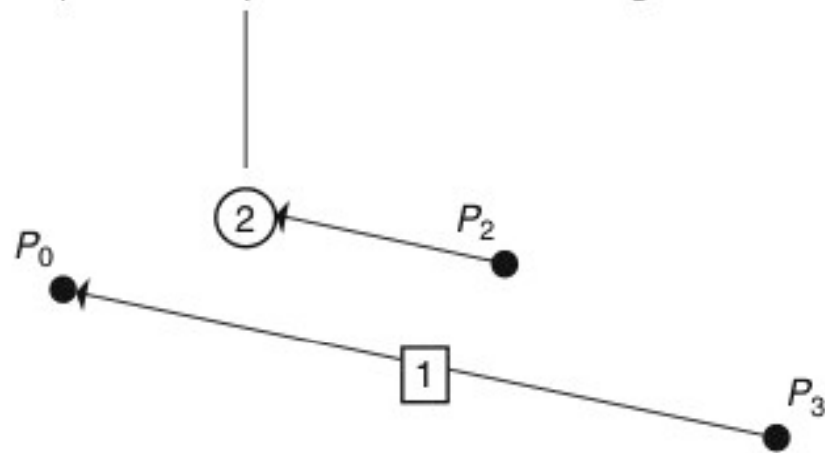
New estimate for  $P_i$  based on cubic curve fit through the four adjacent points





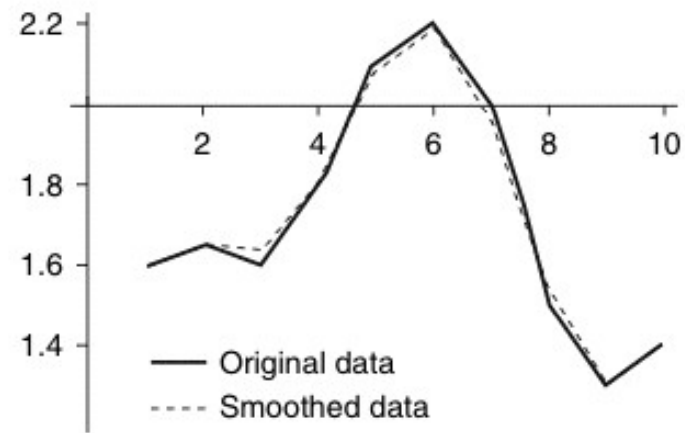
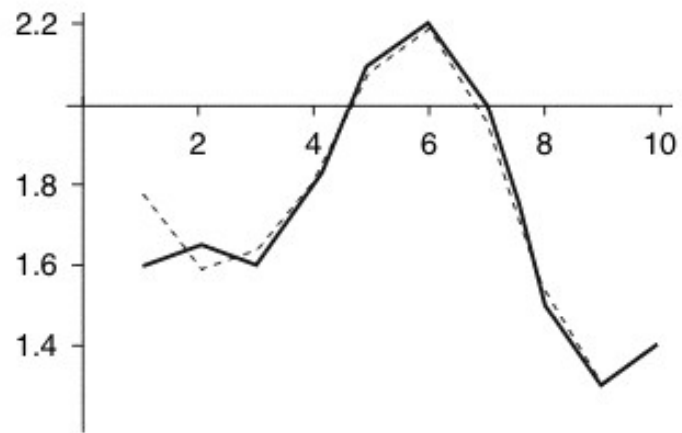
# Smoothing data

New estimate for  $P_1$  based on parabolic curve fit through the three adjacent points

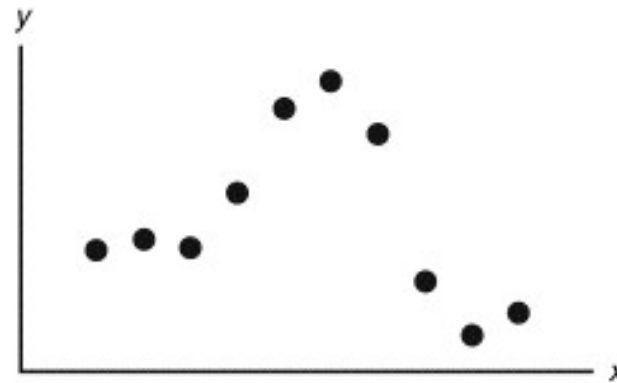
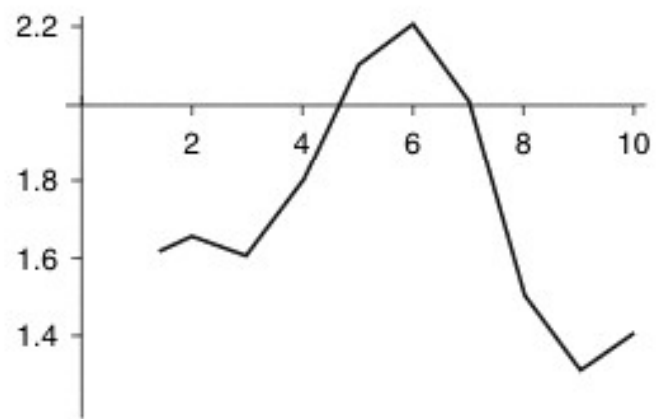


1. Construct vector from  $P_3$  to  $P_0$
2. Add  $1/3$  of the vector to  $P_2$
3. (Not shown) Average estimated point with original data point

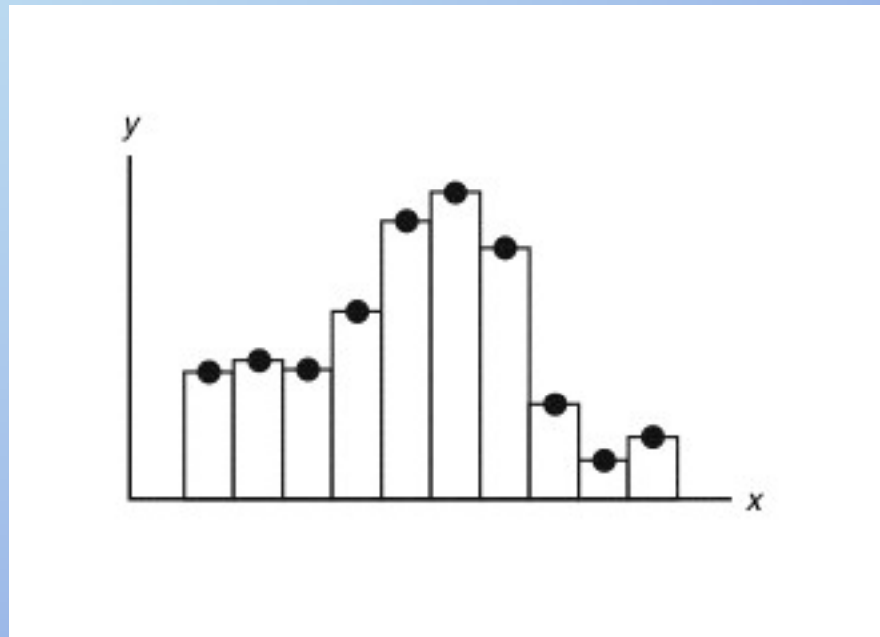
# Smoothing data



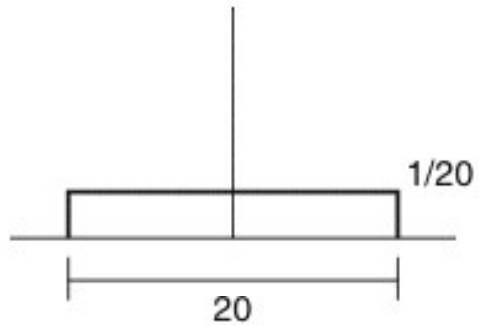
# Smoothing data



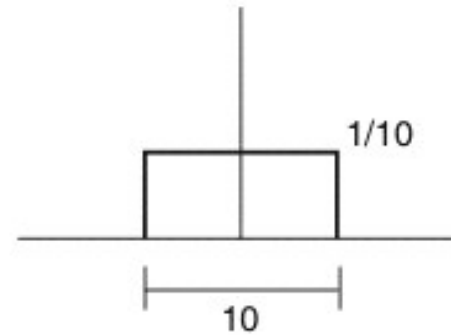
# Smoothing data



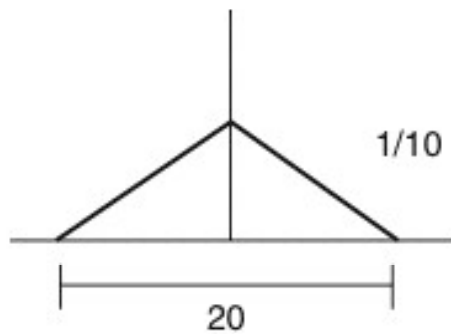
# Smoothing data



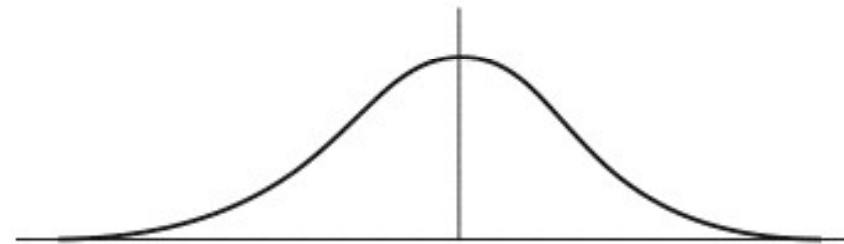
Wide box



Box



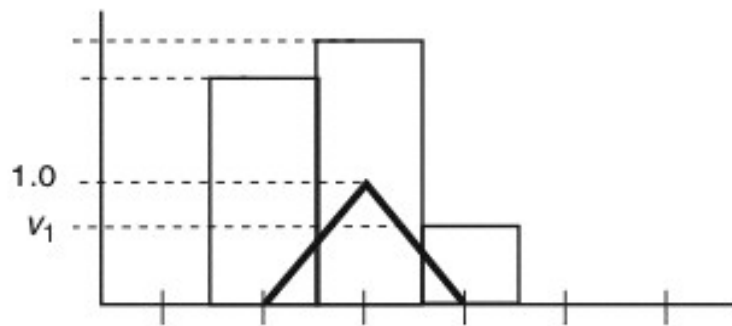
Tent



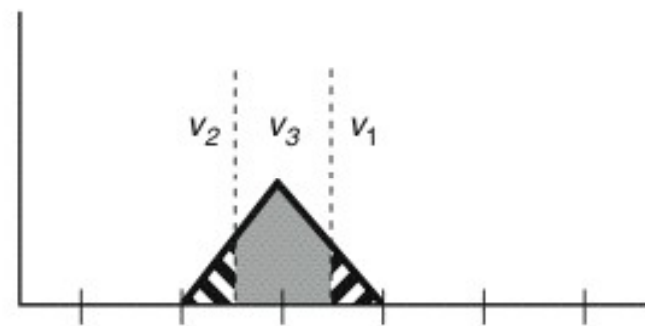
Gaussian

$$\frac{1}{a\sqrt{2\pi}} e^{-(x-b)^2/(2a^2)}$$

# Smoothing data



Smoothing kernel superimposed over step function

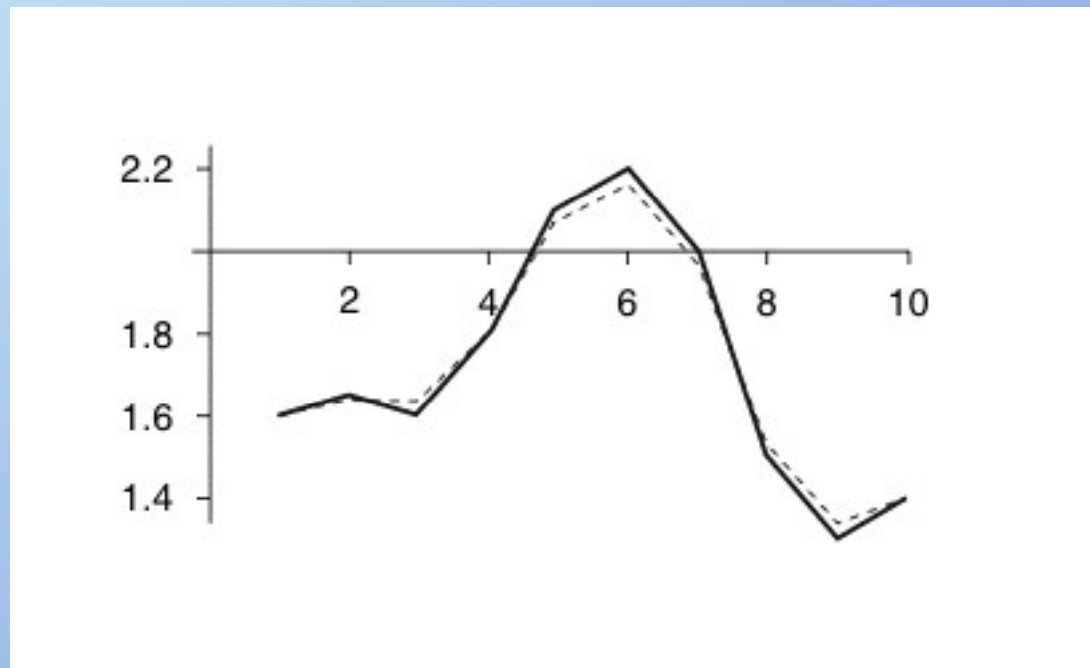


Areas of tent kernel under the different step function values

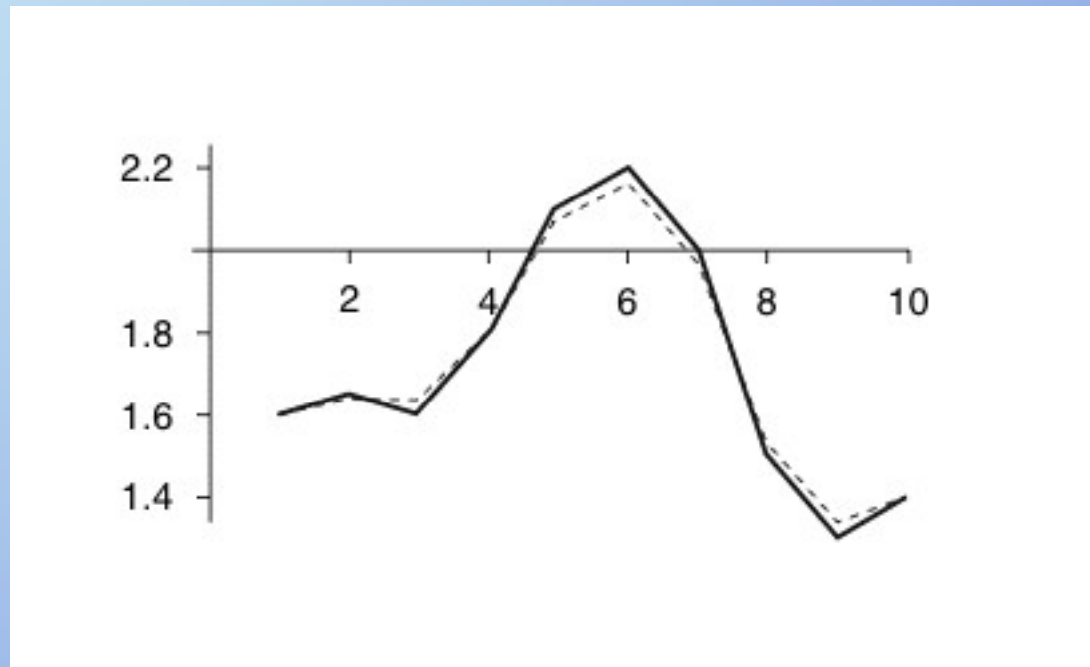
$$V = \frac{1}{8}v_1 + \frac{3}{4}v_2 + \frac{1}{8}v_3$$

Computation of value smoothed by applying area weights to step function values

# Smoothing data

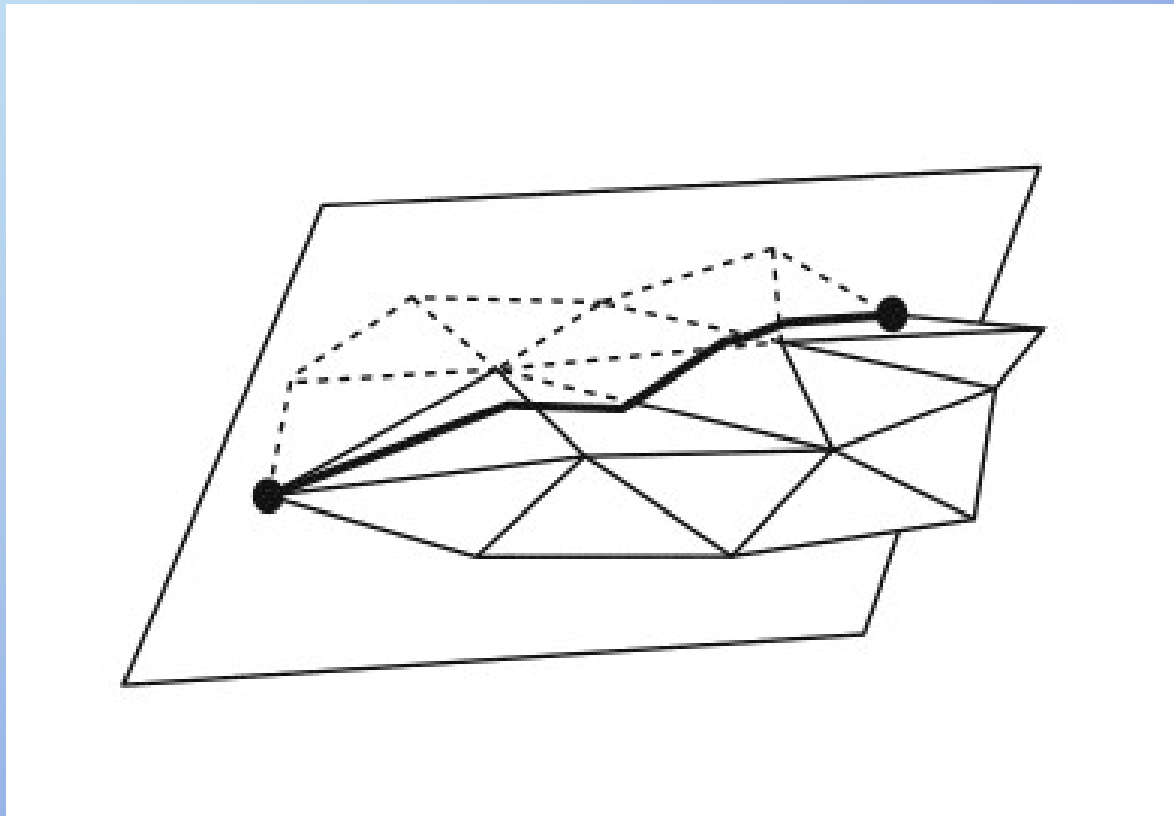


# Smoothing data





# Path finding



# Path finding - downhill

