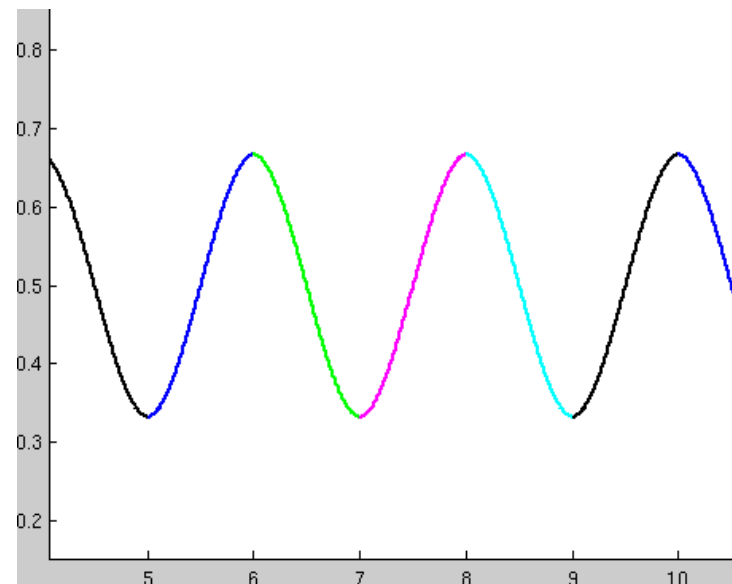
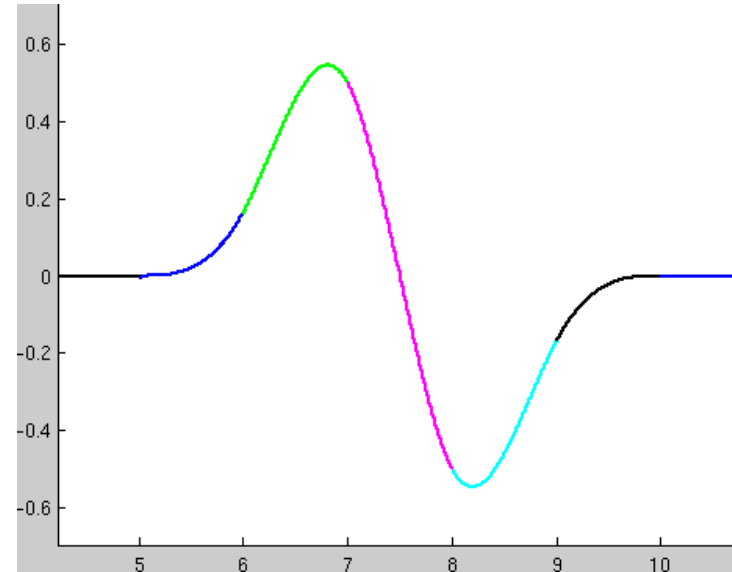


# B(asis)-Splines

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CISE, UF

# Splines

- Piecewise polynomial
- More flexible than single polynomials
  - can have finite support
  - can be periodic
- Degree  $d$  splines – typically  $C^{d-1}$  continuity

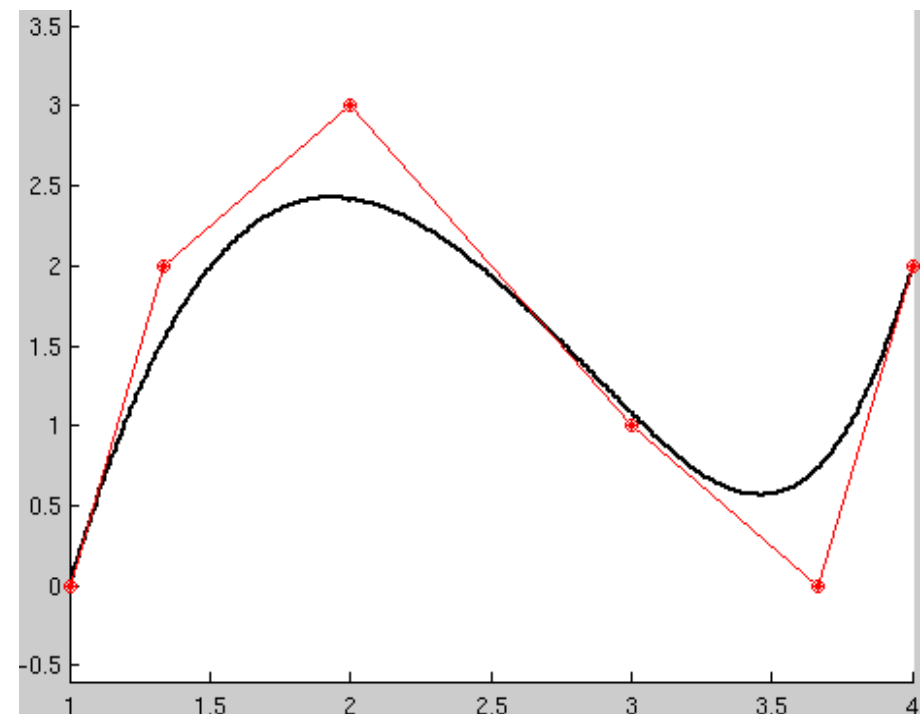
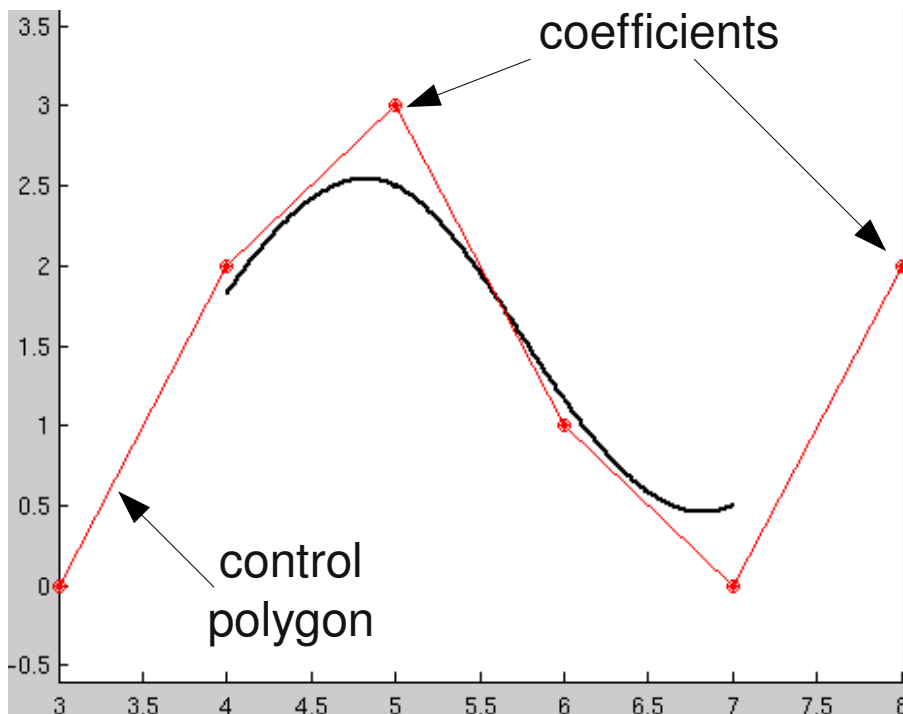


# Some polynomial representations

- Polynomials
  - Power / Taylor series
  - Newton polynomials
  - Lagrange polynomials
  - Hermite polynomials
  - **Bézier** (very special case of B-spline)
- Splines
  - Box spline (for curves, same as uniform B-spline)
  - **B-spline**

# B-spline examples

- <http://www.cs.technion.ac.il/~cs234325/Applets/applets/bspline/GermanApplet.html>
- <http://www.engin.umd.umich.edu/CIS/course.des/cis577/projects/BSP/welcome.html>
- <http://www.cs.uwaterloo.ca/~r3fraser/splines/bspline.html>
- <http://www.doc.ic.ac.uk/~dfg/AndysSplineTutorial/BSplines.html>



# Polynomials as linear combinations

- Power basis  $\{1, t, t^2, \dots, t^d\}$

$$p(t) = \sum_{i=0}^d c_i t^i$$

- Taylor basis  $\{1, (t-t_0), (t-t_0)^2, \dots, (t-t_0)^d\}$

$$p(t) = \sum_{i=0}^d c_i (t-t_0)^i$$

- Bézier basis  $\left\{ (1-t)^d, d(1-t)^{d-1}t, \dots, \binom{d}{i}(1-t)^{d-i}t^i, \dots, t^d \right\}$

terms in the binomial expansion of  $((1-t)+t)^d$  ( $=1$ )

$$p(t) = \sum_{i=0}^d c_i \binom{d}{i} (1-t)^{d-i} t^i$$

# Splines as linear combinations

- A linear combination of **spline** basis functions
- Defined by
  - $k$  knots  $t_i$ 
    - non-decreasing sequence specifying domain
    - determines basis functions (hence continuity and ranges)
  - $n$  coefficients  $c_i$ 
    - coefficients with which the basis functions are multiplied
  - degree  $d$  automatically determined:  $k = n + d + 1$

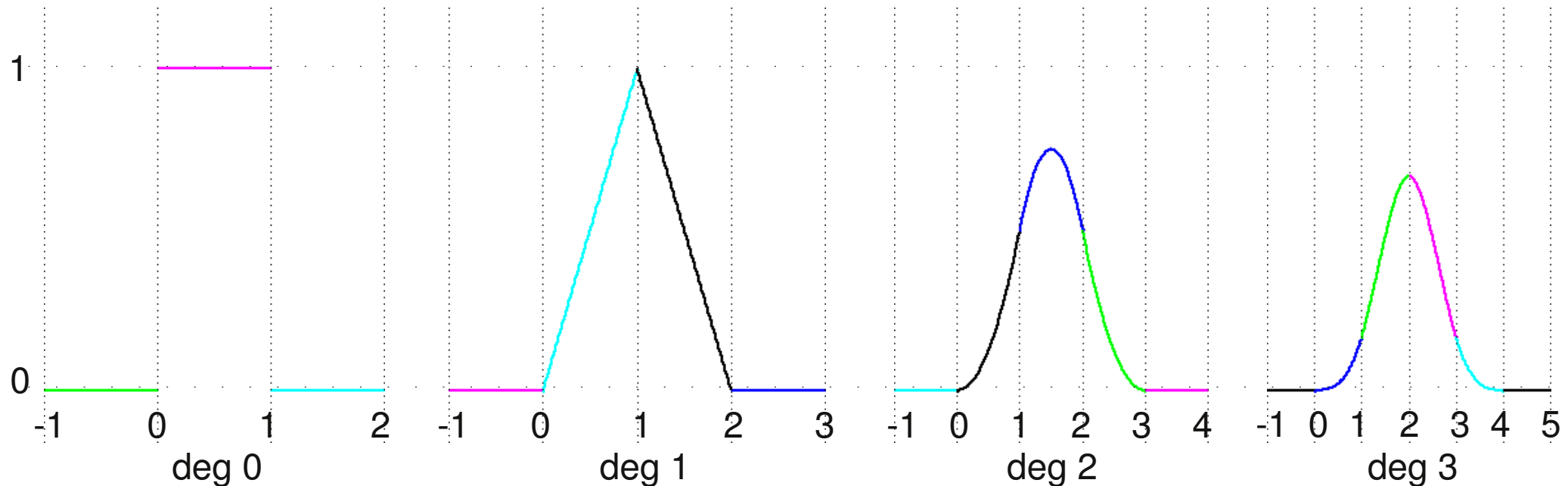
# B-spline basis

- Basis function:

$$N_i^0(t) = \begin{cases} 1 & \text{if } t \in [t_i, t_{i+1}] \\ 0 & \text{otherwise} \end{cases}$$

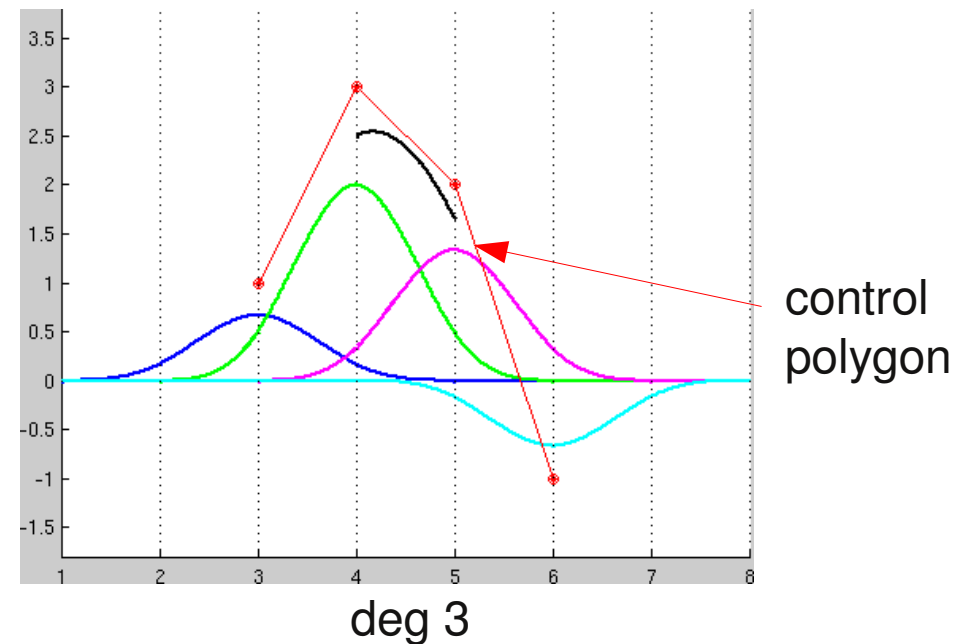
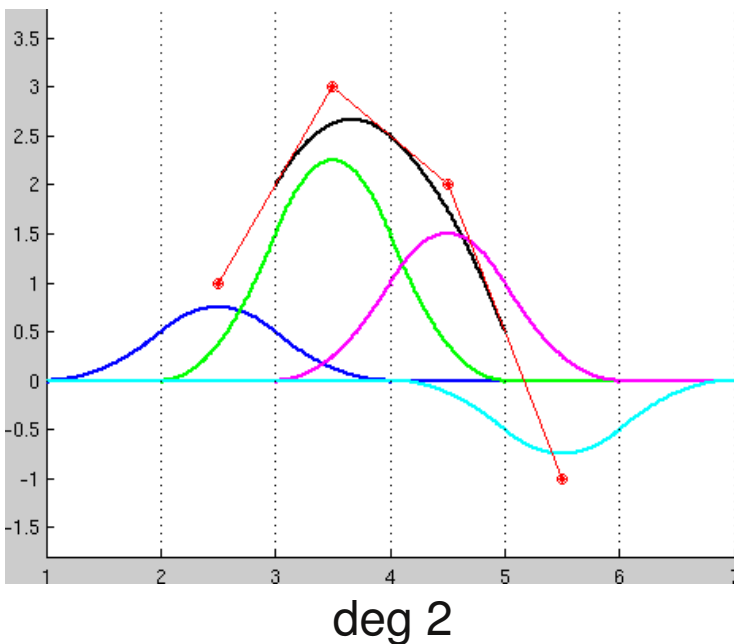
$$N_i^d(t) = \frac{t-t_i}{t_{i+d}-t_i} N_i^{d-1}(t) + \frac{t_{i+d+1}-t}{t_{i+d+1}-t_{i+1}} N_{i+1}^{d-1}(t)$$

- Non-neg. & finite support
- Shifts add up to 1 in their overlap
- (Uniform B-splines  $\Leftrightarrow$  uniformly spaced knots)



# Spline in B-spline form

- Curve (degree  $d$ ):  $p(t) = \sum_i c_i N_i^d(t)$



- Example:  $c_i = [1, 3, 2, -1]$  (y-coord only)

- **Greville abscissa:**  
natural x-coord for  $c_i$

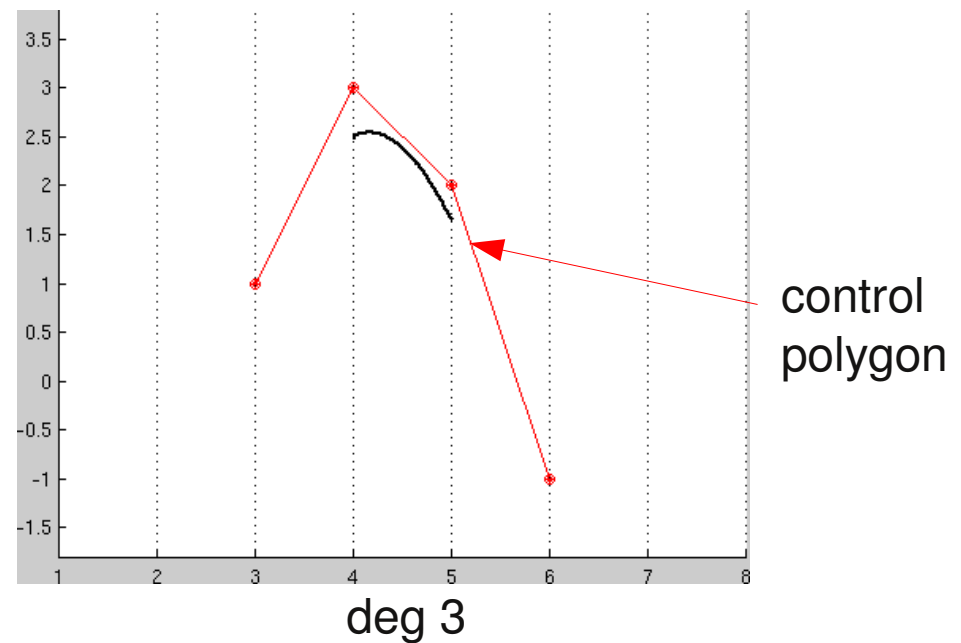
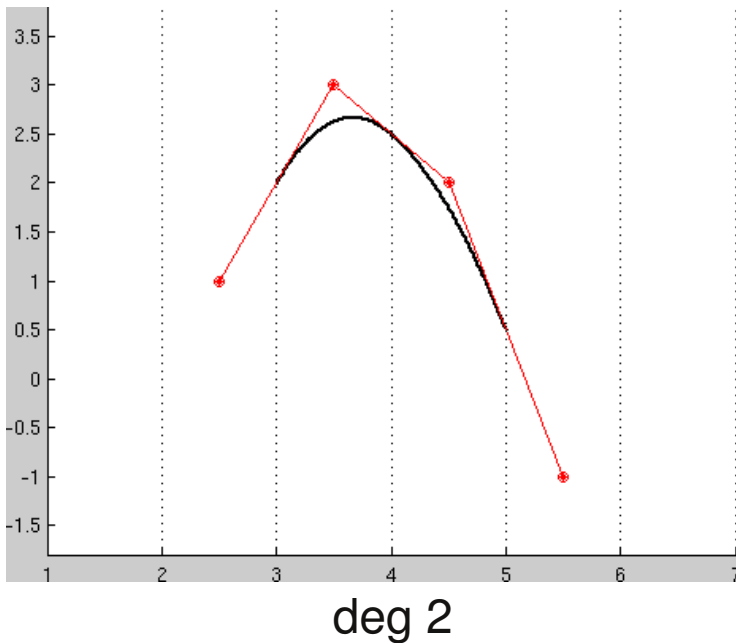
$$t_i^* = \frac{1}{d} \sum_{j=i+1}^{i+d} t_j$$

- $k = n + d + 1$  knots



# Geometric Properties

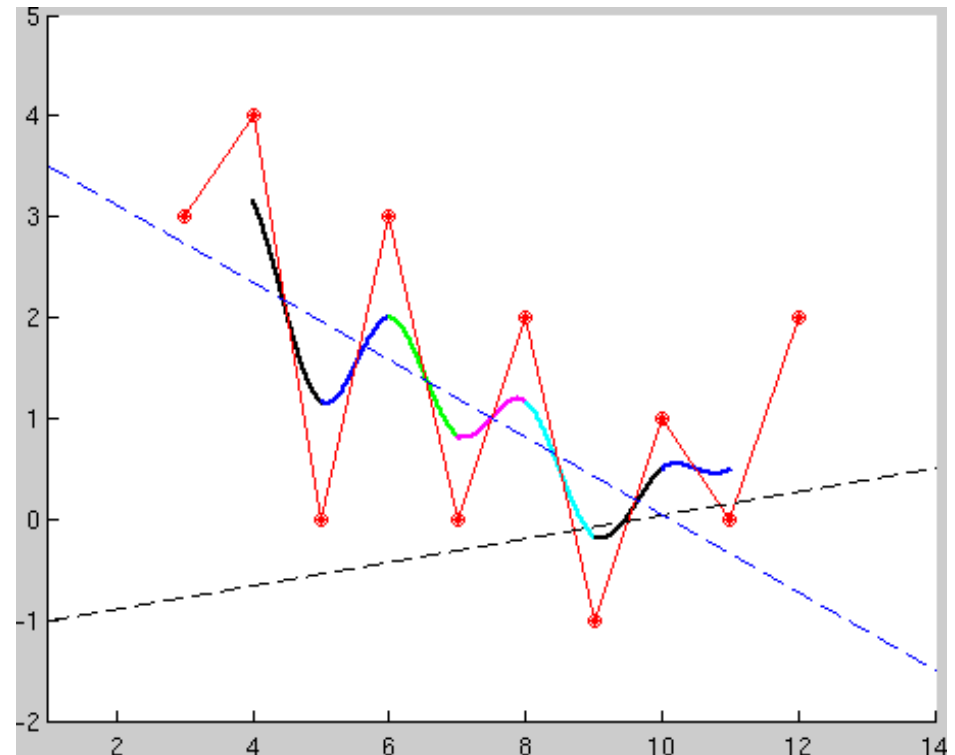
- Curve (degree  $d$ ):  $p(t) = \sum_i c_i N_i^d(t)$  ← sum to 1, non-negative



- Affine invariance:  $c_i' = A(c_i) \iff p'(t) = A(p(t))$
- Convex hull property: curve lies within  $\text{CH}(c_i)$

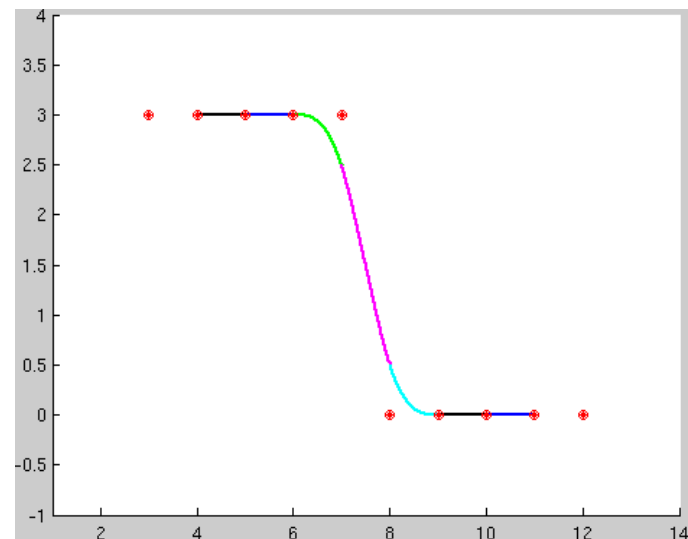
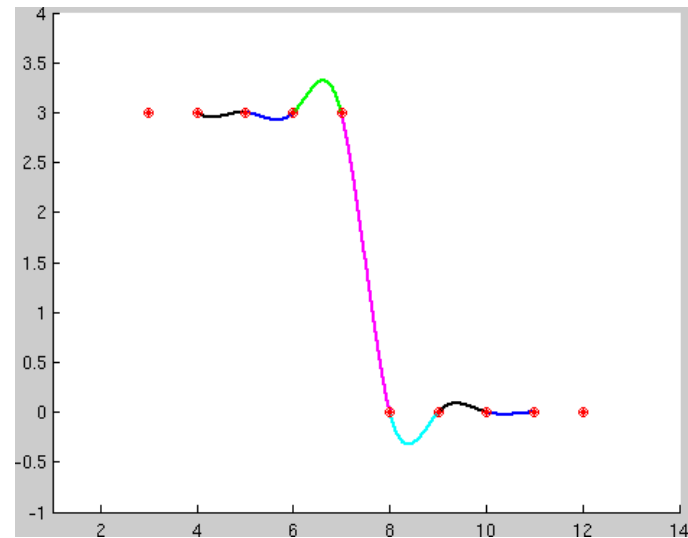
# Variation diminishing property

- No line intersects the spline more times than it intersects the control polygon.
- i.e. The curve will not wiggle more than the control polygon.



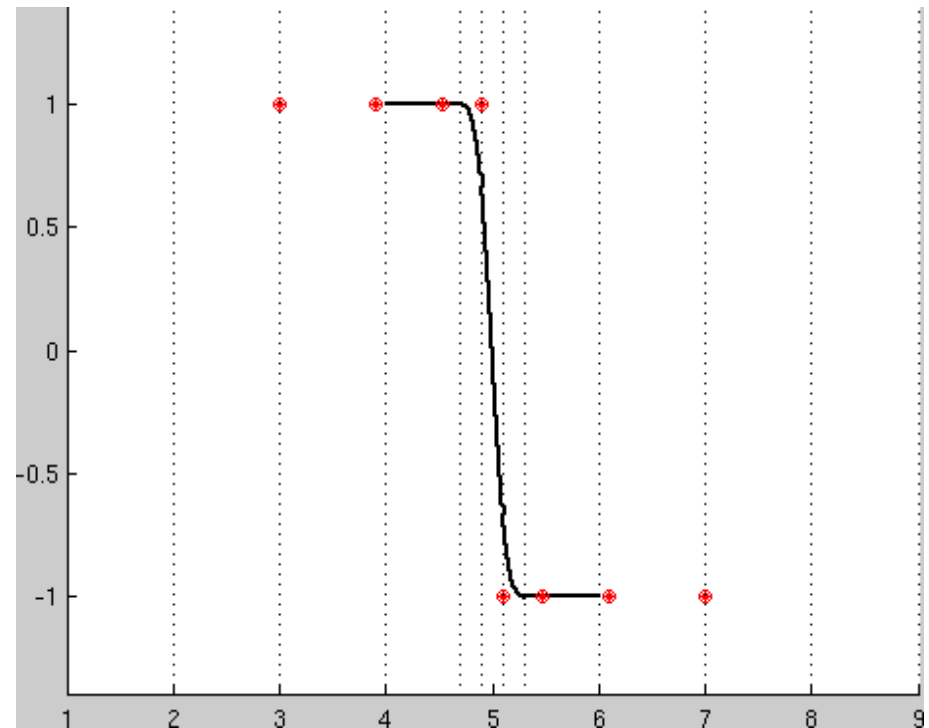
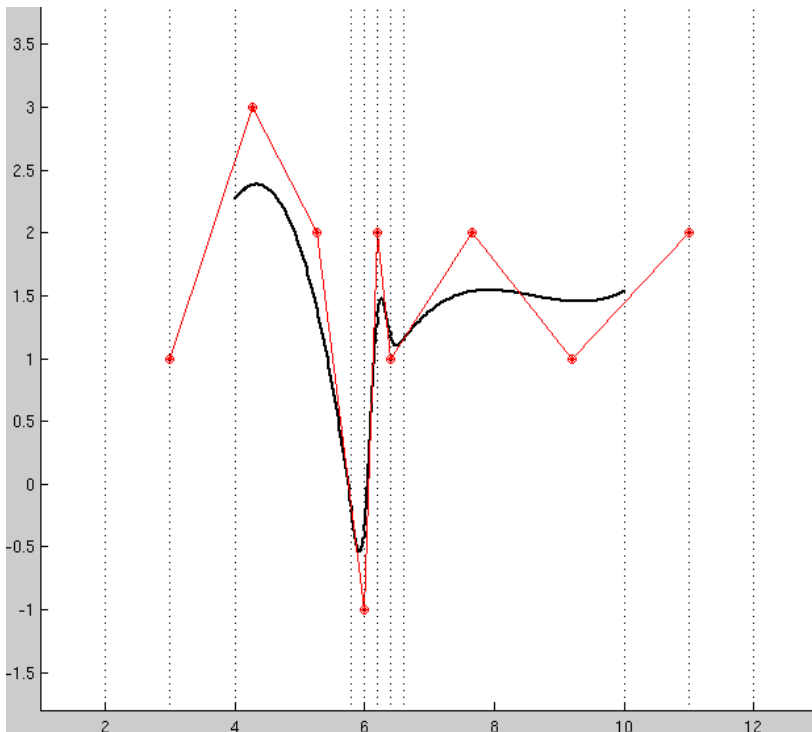
# An alternative to interpolation

- Interpolating samples suffers from the Gibb's phenomenon
- Treating samples as coefficients has no such problems – curve can't wiggle more than coefficients.



# Examples of non-uniform splines

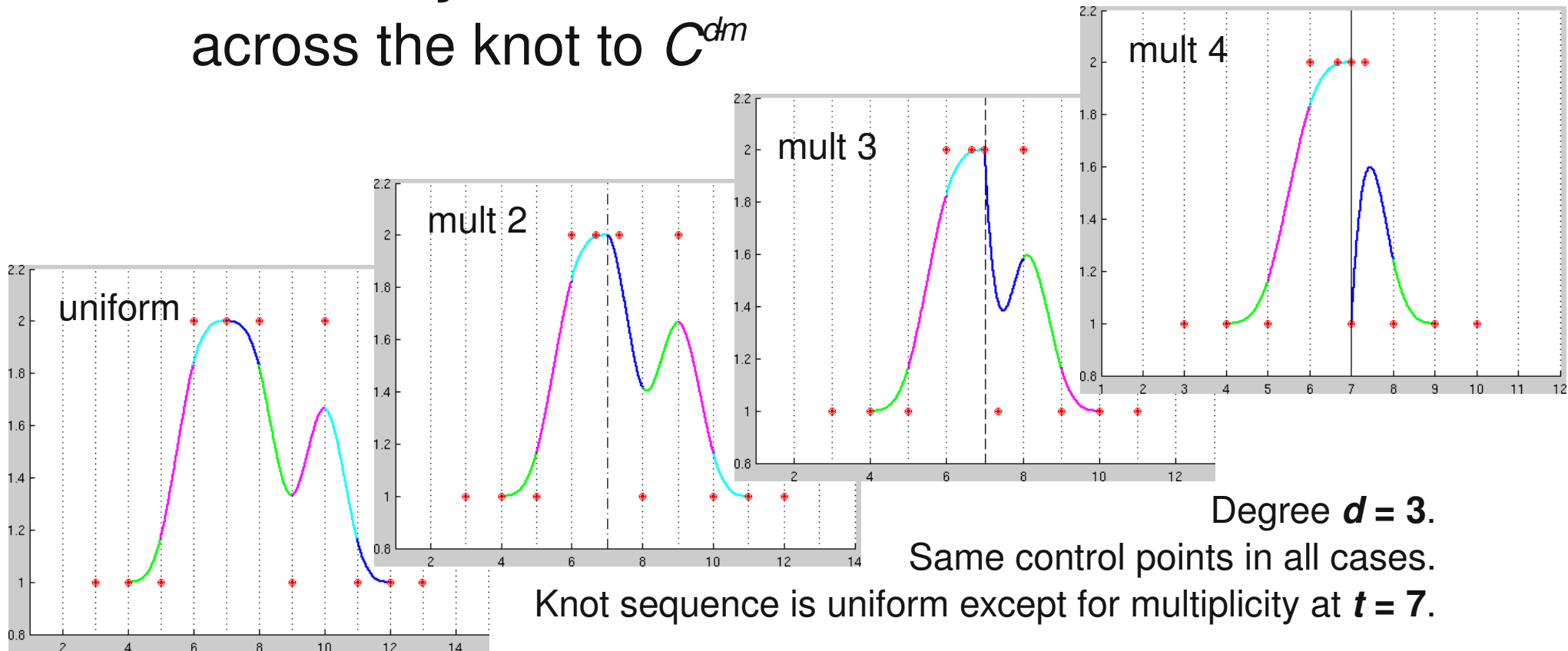
- Knot sequence can be denser in areas needing more degrees of freedom.



# Decreasing inherent continuity

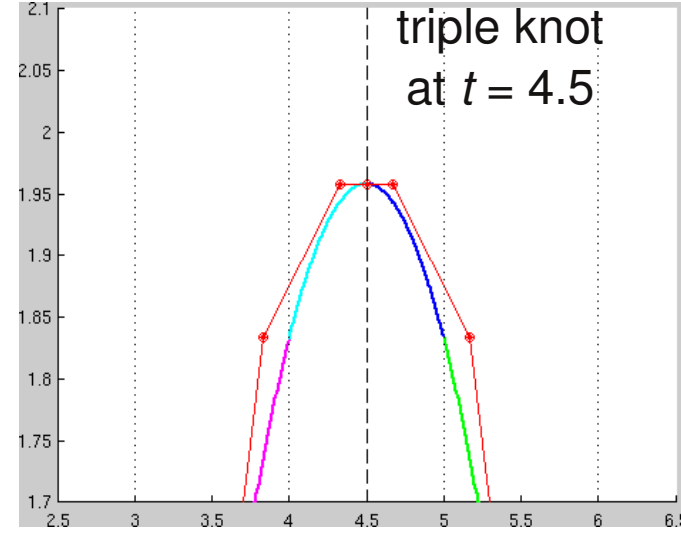
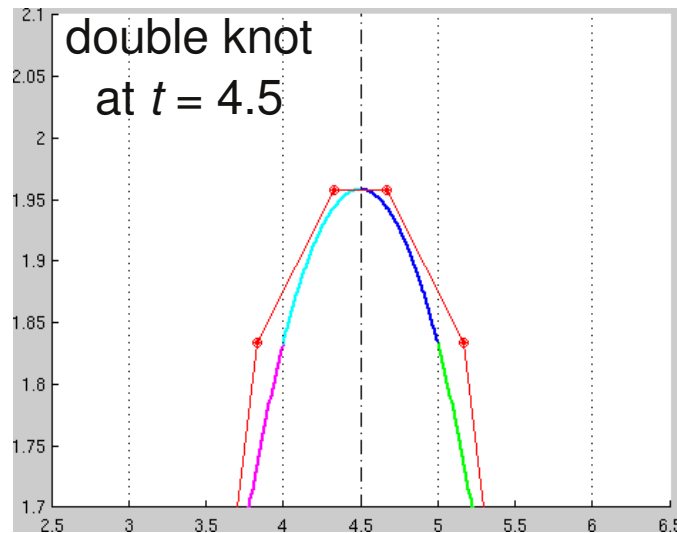
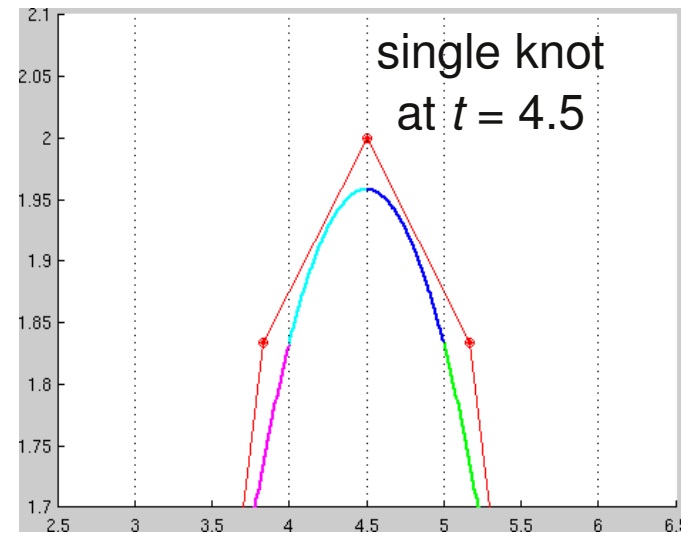
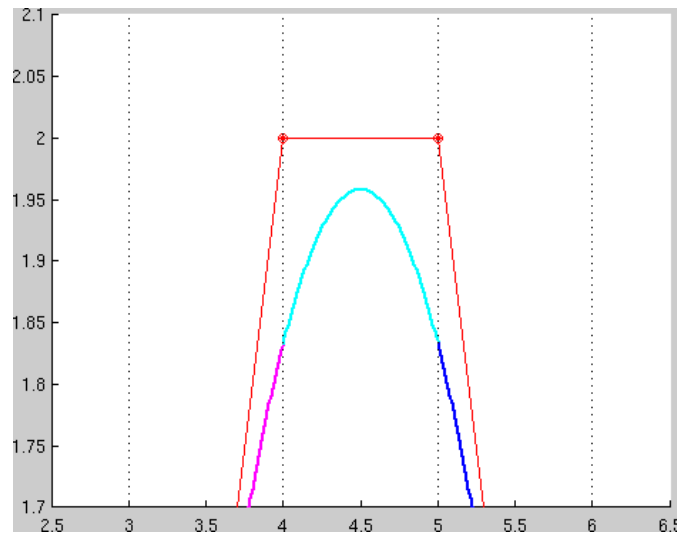
- **Knot multiplicity**

- Repeating a knot  $m$  times decreases the **inherent continuity** of the basis functions across the knot to  $C^{dm}$



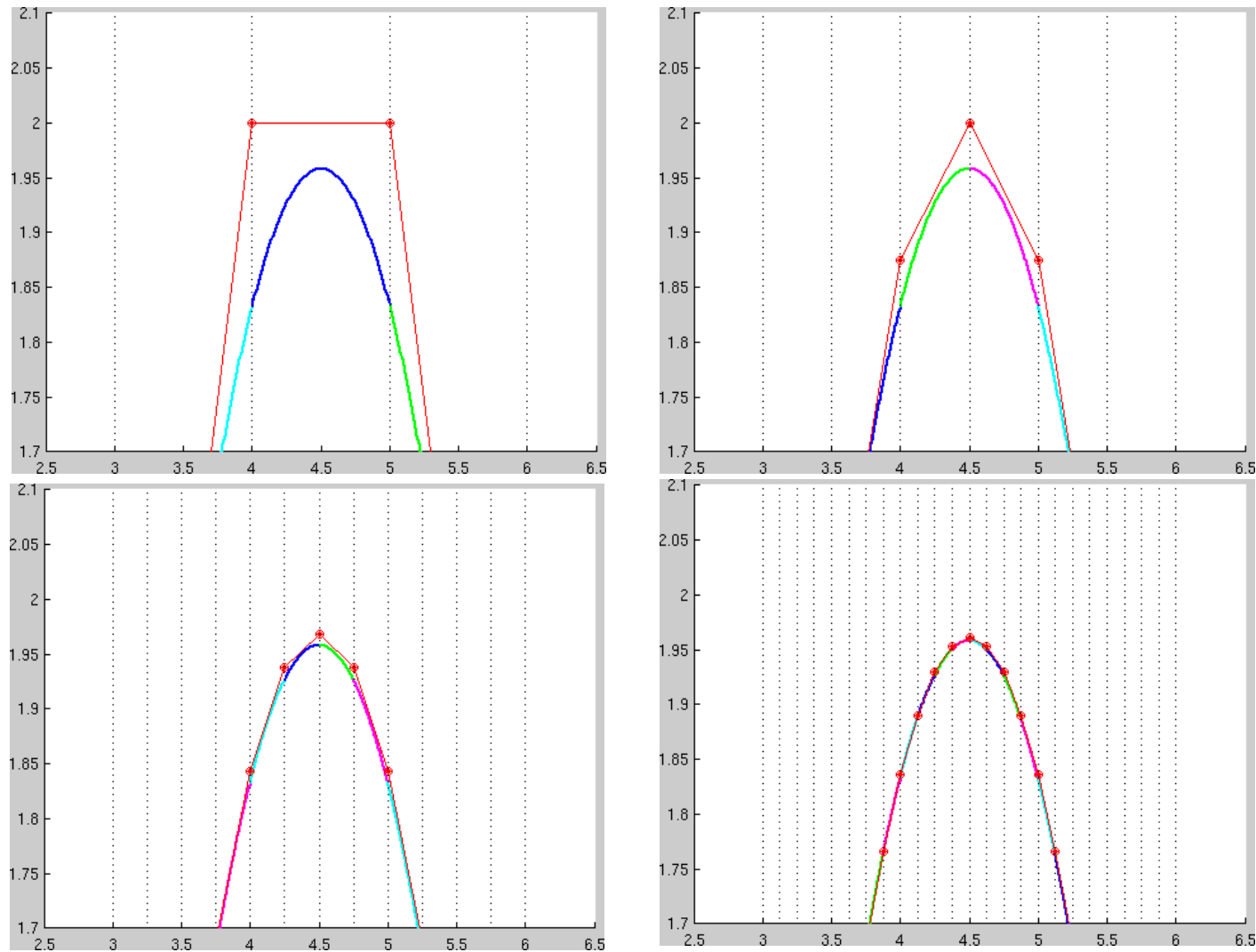
# Evaluation – deBoor's Algorithm

- Evaluate at  $t = 4.5$  by repeated knot insertion without changing the underlying function.



# Convergence under knot insertion

- Repeated uniform knot insertion converges to function as fast as  $O(h^2)$ , with  $h =$  knot width.

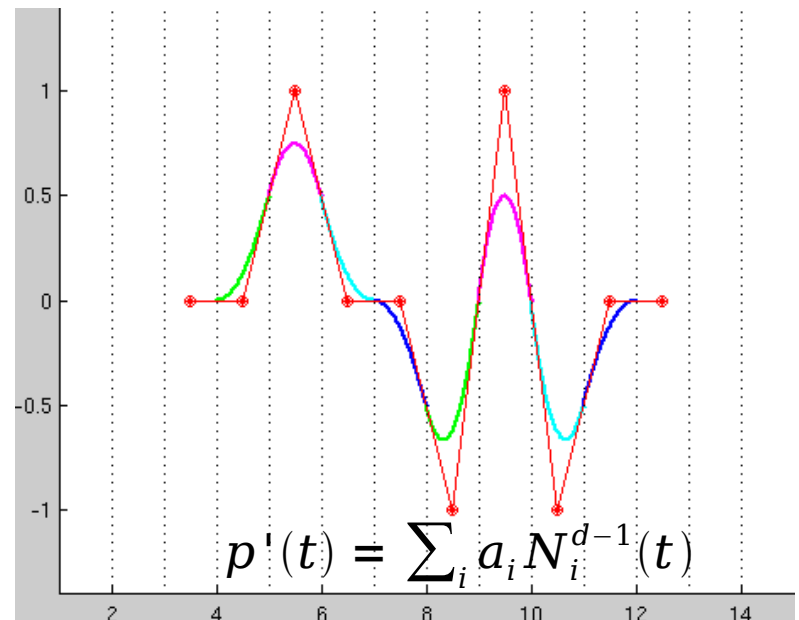
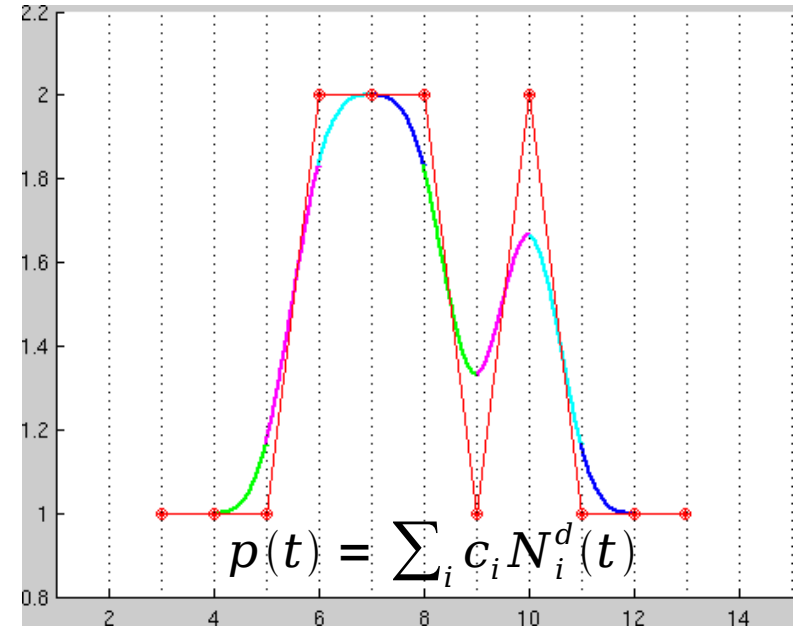


# Derivatives

- Compute using **divided differences**

- deg 1 lower
- continuity 1 lower
- domain the same

$$a_i = \frac{d}{t_{i+d+1} - t_{i+1}} (c_{i+1} - c_i)$$





# Matlab spline toolbox

- Written by deBoor himself
- I used for my figures:
  - `spmak`, `spapi` – create/interpolate a B-spline
  - `fnplt` – plot the B-spline
  - `fnrfn` – do knot insertion
  - `fnder`, `fnint` – differentiation and integration
- It's well documented and comes with tutorials and demos

# Summary

- The B-spline form is
  - geometrically intuitive
  - numerically robust
  - easy to differentiate
  - easy to make discontinuous
  - very, very knotty
- Matlab spline toolbox

# More terms to look up

- Tensor-product B-splines
  - for surfaces, volumes
- Bézier
  - tensor-product (special case of B-splines)
  - total-degree (triangular) – no good B-spline equivalent
- Blossoms
  - Excellent theoretical tool
  - Inefficient for implementation, though

# References

- Curves and Surfaces for CAGD
  - Gerald Farin
- Bézier and B-Spline Techniques
  - Hartmut Prautzsch, Wolfgang Boehm, and Marco Paluszny
- Matlab spline toolbox documentation & demos