## Curves and Splines

## Curves in Spaces



Parametric function $\gamma(t)$

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Simple curves have well-known formulas:

$$
\gamma(t)=(\cos t, \sin t)
$$

## Curves in Spaces



Parametric function $\gamma(t)$
Simple curves have well-known formulas:


What to do in general?

## Linear Interpolation

## Straight line segment between two points

$$
\underbrace{\gamma(1)=P_{1}}_{\gamma(0)=P_{0}}
$$

## Linear Interpolation

## Straight line segment between two points

$$
\begin{aligned}
& \gamma(t)=P_{0}+t\left(P_{1}-P_{0}\right) \\
& \gamma(t)=(1-t) P_{0}+t P_{1}
\end{aligned}
$$

## Linear Interpolation

## Straight line segment between two points



Also works for arbitrary parameterization

## Linear Interpolation

Straight line segment between two points

$$
\gamma(t)=\frac{u_{1}-t}{u_{1}-u_{0}} P_{0}+\frac{t-u_{0}}{u_{1}-u_{0}} P_{1}
$$

Also works for arbitrary parameterization

## Piecewise Linear Interpolation

Straight line segment between point list

points in space (where curves goes)
points in parameter space (knots)
(how fast it goes)

## Piecewise Linear Interpolation

Straight line segment between point list

points in space
(where curves goes)

$$
\gamma(t)=\frac{u_{i+1}-t}{u_{i+1}-u_{i}} P_{i}+\frac{t-u_{i}}{u_{i+1}-u_{i}} P_{i+1}
$$

points in parameter space (knots)
(how fast it goes)

## Piecewise Linear Interpolation

"Pyramid Notation"

$$
\gamma(t)=\frac{u_{i+1}-t}{u_{i+1}-u_{i}} P_{i}+\frac{t-u_{i}}{u_{i+1}-u_{i}} P_{i+1}
$$



## Piecewise Linear Interpolation

## "Pyramid Notation"

$$
\gamma(t)=\frac{u_{i+1}-t}{u_{i+1}-u_{i}} P_{i}+\frac{t-u_{i}}{u_{i+1}-u_{i}} P_{i+1}
$$

(division by sum implicit)


## Piecewise Linear Interpolation



Easy, but "chunky" - only $C^{0}$

## Piecewise Linear Interpolation



Easy, but "chunky" - only $C^{0}$
Continuity notation: $C^{n}$ means continuous after taking n derivatives

## Lagrange Interpolation

Given some points, find polynomial

$$
\left\{\begin{array}{c}
P_{0}=\gamma\left(u_{0}\right) \\
P_{1}
\end{array}\right.
$$

## Lagrange Interpolation

Given some points, find polynomial

$$
\left\{\begin{array}{c}
P_{0}=\gamma\left(u_{0}\right) \\
P_{1}
\end{array}\right.
$$

Notice: each coordinate is linear combination of a power of $t$

## Lagrange Interpolation

Given some points, find polynomial

$$
\gamma(t)=\left[\begin{array}{llll}
a_{x} & b_{x} & c_{x} & \ldots \\
a_{y} & b_{y} & c_{y} & \ldots
\end{array}\right]\left[\begin{array}{c}
1 \\
t \\
t^{2} \\
\vdots
\end{array}\right] \quad P_{0}=\gamma\left(u_{0}\right)
$$

Notice: each coordinate is linear combination of a power of $t$

## Lagrange Interpolation

Given some points, find polynomial

$$
\gamma(t)=C_{2 \times k}\left[\begin{array}{c}
1 \\
t \\
t^{2} \\
\vdots
\end{array}\right]_{k \times 1}
$$

Notice: each coordinate is linear combination of a power of $t$

## Lagrange Interpolation

Given some points, find polynomial

$$
\gamma(t)=C_{2 \times k}\left[\begin{array}{c}
1 \\
t \\
t^{2} \\
\vdots
\end{array}\right]_{k \times 1}
$$



How to pick k?

## Lagrange Interpolation

Given some points, find polynomial

$$
P_{i}=C_{2 \times k}\left[\begin{array}{c}
1 \\
u_{i} \\
u_{i}^{2} \\
\vdots
\end{array}\right]_{k \times 1}
$$



How to pick k? Use known points

## Lagrange Interpolation

Given some points, find polynomial


How to pick k? Use known points

## Lagrange Interpolation

Given some points, find polynomial


How to pick k? Use $k=n$

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How to pick $k$ ? Use $k=n$

## Lagrange Interpolation

Given some points, find polynomial $n$ points $\rightarrow$ degree ( $n-1$ )

- 2: linear interpolation
- 3: quadratic interp.



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Curves are $C^{n-2}$ smooth


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Given some points, find polynomial $n$ points $\rightarrow$ degree ( $n-1$ )

- 2: linear interpolation
- 3: quadratic interp.

Curves are $C^{n-2}$ smooth
What's the problem?

## Lagrange Interpolation

No oscillation control


## Lagrange Interpolation

No oscillation control

Worse as degree becomes larger


## Lagrange Interpolation

No oscillation control

Worse as degree becomes larger

Lagrange interpolation not practical for large no. of points

## Introducing Spllines



## Bézier Curves



## Spline building block

Polynomial



## Bézier Curves



Spline building block

Polynomial


Variation-diminishing: curve lies in convex hull of points

## Bézier Curves



Spline building block

Polynomial


Variation-diminishing: curve lies in convex hull of points
Cost: only interpolates endpoints

## de Casteljau's Algorithm

Given:

- sequence of control points $P_{i}$
- single value of $t \in[0,1]$

Computes:

- location of $\gamma(t)$



## de Casteljau's Algorithm

Main idea: recursive linear interpolation Start with four points - control polygon


## de Casteljau's Algorithm

Main idea: recursive linear interpolation Start with four points - control polygon Clip corners


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Main idea: recursive linear interpolation Start with four points - control polygon Clip corners


## de Casteljau's Algorithm

Four control points $\rightarrow$ cubic Bézier curve


## de Casteljau's Algorithm

More control points $\rightarrow$ smoother curve (more pyramid levels)


## de Casteljau's Algorithm

Time complexity?


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Time complexity?
$O\left(n^{\wedge} 2\right)$ for each evaluation


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Time complexity?
$O\left(n^{\wedge} 2\right)$ for each evaluation


Also, for long curve, may not want global influence of control points


## B-Splines ("Basis Splines")

Piecewise polynomial

- (cubic common)

Used in Illustrator, Inkscape, etc


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Piecewise polynomial

- (cubic common)

Used in Illustrator, Inkscape, etc

Arbitrary number of control points

- only first and last interpolated


## de Boor's Algorithm

Pyramid algorithm, like de Casteljau


## de Boor's Algorithm

Pyramid algorithm, like de Casteljau

$$
\frac{\alpha_{i+1}}{\beta_{i-2}+\alpha_{i+1}} P_{i-1}+\frac{\beta_{i-2}}{\beta_{i-2}+\alpha_{i+1}} P_{i}
$$



## de Boor's Algorithm

Pyramid algorithm, like de Casteljau


## de Boor's Algorithm

Pyramid algorithm, like de Casteljau Final answer depends on four control pts


## de Boor's Algorithm

Pyramid algorithm, like de Casteljau
Final answer depends on four control pts


## de Boor's Algorithm

Knots triplicated at boundaries

## de Boor's Algorithm

Knots triplicated at boundaries

Higher degree $\rightarrow$ more pyramid levels more duplicates at bdry

## Other Spline Types

## Hermite

- can also specify derivatives at boundary



## Other Spline Types

Hermite

- can also specify derivatives at boundary

Catmull-Rom

- interpolatory



## Spline Keywords

Interpolatory

- spline goes through all control points

Linear

- curve pts linear in control points

Degree $\mathbf{n}$

- curve pts depend on $\mathbf{n t h}$ power of $\mathbf{t}$

Uniform

- knots evenly spaced

