




$$
\mathrm{SO}(3) \times \text { Sphere }
$$

## What's a manifold?



## What's a manifold?



Hopefully, the tangent space at $x$ is Euclidean


Manifolds.

## Interpolation.



## Interpolation on $\mathcal{M}=\mathbb{R}^{n}$



■ Lagrange polynomials

- Cubic splines
- Bernstein
- curve fitting
- ... and many more (ask V.Legat).


## Interpolation on $\mathcal{M}=\mathbb{R}^{n}$



- Runge phenomenon
- Extrapolation error

■ How to solve? Piecewise curves!

## How to interpolate?

Each segment between two consecutive points is a Bézier function.


## Reconstruction: the De Casteljau algorithm



## How to generalize to manifolds?

(

Geodesics are straight lines


I'm a straight line!

Exponential maps computes geodesics


I compute the straight line!

Logarithmic maps are in the tangent space


I'm in the tangent space!
(And I'm the velocity needed to compute the straight line!)
)

## Example on the sphere



It's ugly. Make it smooth!

## $\mathcal{C}^{1}$-piecewise Bézier interpolation (in $\mathbb{R}^{n}$ )



## Manifolds.

## Interpolation.

Results?

## A result on $\mathbb{R}^{2}$





## A result on the sphere




Norm of the acceleration


## A result on $\mathrm{SO}(3)$




Norm of the acceleration


## Satellite moving



## Morphing...

## 500000000000B



Norm of the acceleration


Smooth Bézier path Piecewise geodesic (ugly) path

2D

## A result on $\mathbb{R}^{2}$



A result on $\mathrm{SO}(3)$








A result on the space of triangulated shells (just because the result is cool)


## Any questions?

# Bézier interpolation on Riemannian manifolds 

## ASCII's tutorial seminar

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## Application 1: MRI navigation




Application 2: Endometrial volume reconstruction




## Optimal $\mathcal{C}^{1}$-piecewise Bézier interpolation (in $\mathbb{R}^{n}$ )

Minimization of the mean square acceleration of the path

$$
\underbrace{\min _{b_{i}^{-}} \int_{0}^{1}\left\|\ddot{\beta}_{2}^{0}\left(b_{1}^{-} ; t\right)\right\|^{2} \mathrm{~d} t+\sum_{i=1}^{n-1} \int_{0}^{1}\left\|\ddot{\beta}_{3}^{i}\left(b_{i}^{-} ; t\right)\right\|^{2} \mathrm{~d} t+\int_{0}^{1}\left\|\ddot{\beta}_{2}^{n}\left(b_{n-1}^{-} ; t\right)\right\|^{2} \mathrm{~d} t}_{\text {Second order polynomial } P\left(b_{i}^{-}\right)}
$$

$$
\nabla P\left(b_{i}^{-}\right)!
$$

## Optimal $\mathcal{C}^{1}$-piecewise Bézier interpolation (in $\mathbb{R}^{n}$ )

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$$



## Optimal $\mathcal{C}^{1}$-piecewise Bézier interpolation (on $\mathcal{M}$ )

■ The control points are given by:

$$
b_{i}^{-}=\sum_{j=0}^{n} D_{i, j} p_{j}
$$

■ These points are invariant under translation, i.e.:

$$
b_{i}^{-}-p^{r e f}=\sum_{j=0}^{n} D_{i, j}\left(p_{j}-p^{r e f}\right)
$$

■ Transfer to the manifolds setting using the Log as $a-b \Leftrightarrow \log _{b}(a)$

$$
\log _{p^{r e f}}\left(b_{i}^{-}\right)=\sum_{j=0}^{n} D_{i, j} \log _{p^{r e f}}\left(p_{j}\right)
$$

