## Domain with metric

 $\Omega = 2D$  square

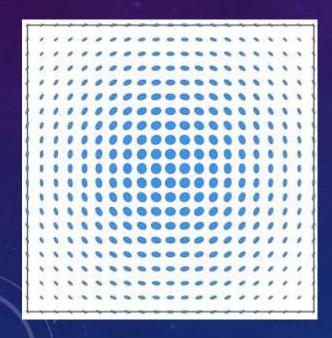
 $M(p): 2 \times 2$ 

 $\Omega = 3D$  surface

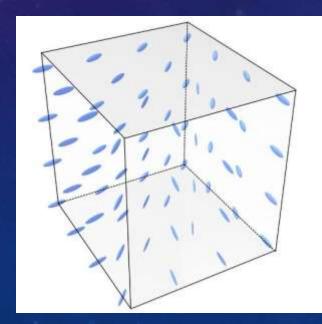
 $M(p): 2 \times 2$ 

 $\Omega = 3D$  volume

 $M(p): 3 \times 3$ 

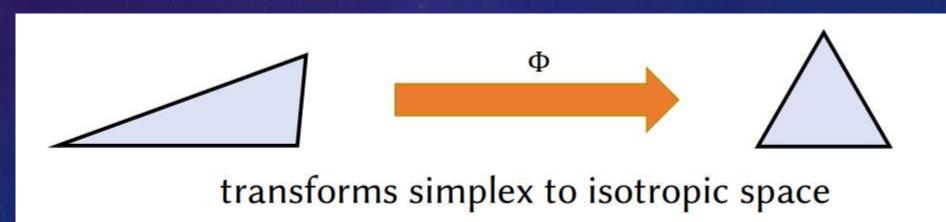






# Anisotropic remeshing

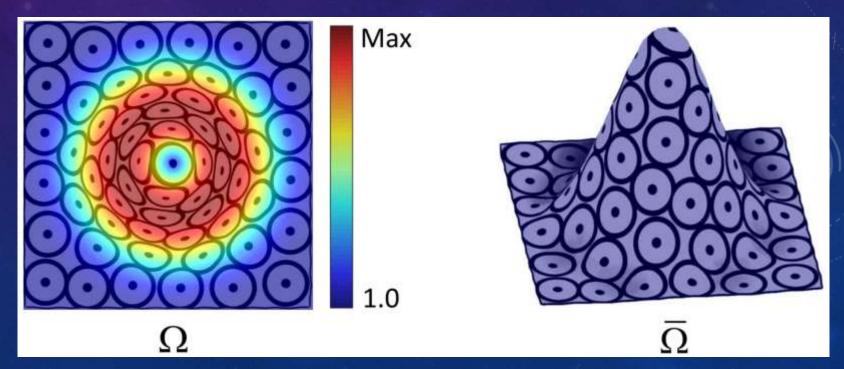
- > Eigen-decomposition  $M(x) = U(x)\Lambda(x)U^T(x)$
- > Transformation  $\phi = \Lambda^{1/2}(x)U^T(x)$
- > Anisotropic remeshing all edge lengths with metric are as equal as possible



# High-dim isometric embedding

For an arbitrary metric field M(x) defined on the surface or volume  $\Omega \subset \mathbb{R}^m$ , there exists a high-d space  $\mathbb{R}^n$  (m < n) in which  $\Omega$  can be embedded with Euclidean

metric as  $\overline{\Omega} \subset \mathbb{R}^n$ .



# Computing high-dim embedding

local-global solver:

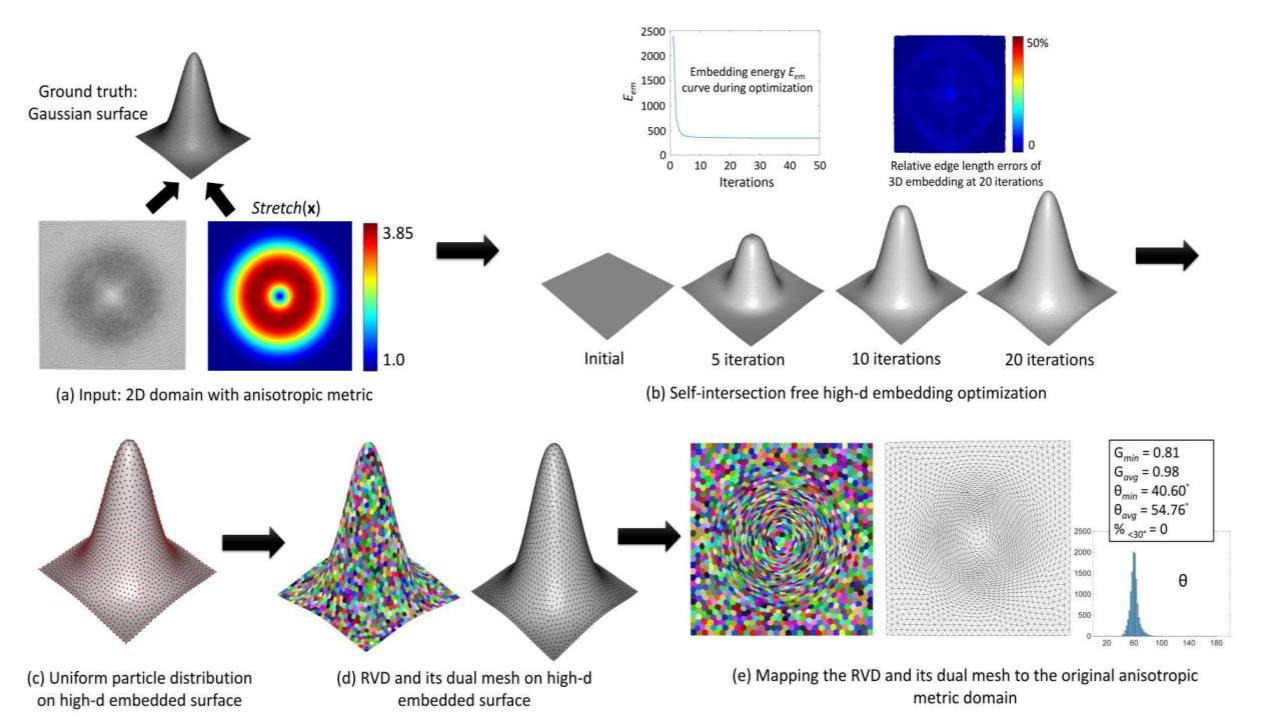
 $E_{embedding} + \mu E_{smoothing}$ 

 $E_{embedding}$ : measure the rigidity, like ARAP

 $E_{smoothing}$ : measure the smoothness of the embedding



A 3D embedding from a 2D domain with an anisotropic metric





# Deformation



## Motivation

Easy modeling – generate new shapes by deforming existing ones



## Motivation

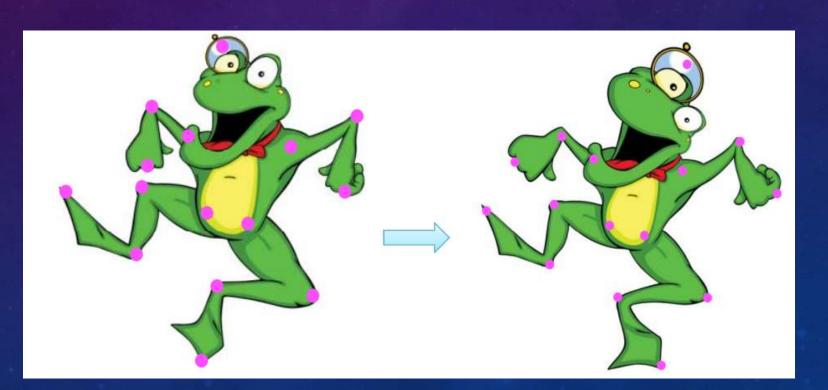
- Easy modeling generate new shapes by deforming existing ones
- Character posing for animation





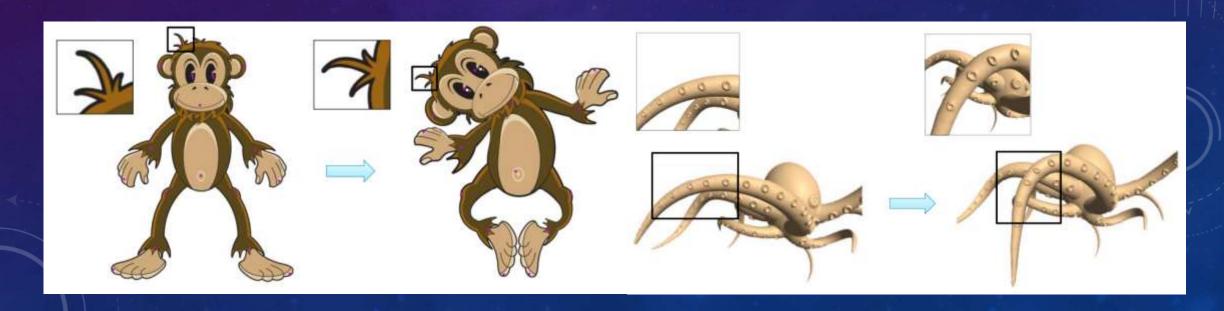
# Challenges

User says as little as possible... (algorithm deduces the rest)



# Challenges

- User says as little as possible... (algorithm deduces the rest)
- "Intuitive" deformation (global change + local detail preservation)



# Challenges

- User says as little as possible... (algorithm deduces the rest)
- "Intuitive" deformation (global change + local detail preservation)
- > Efficient



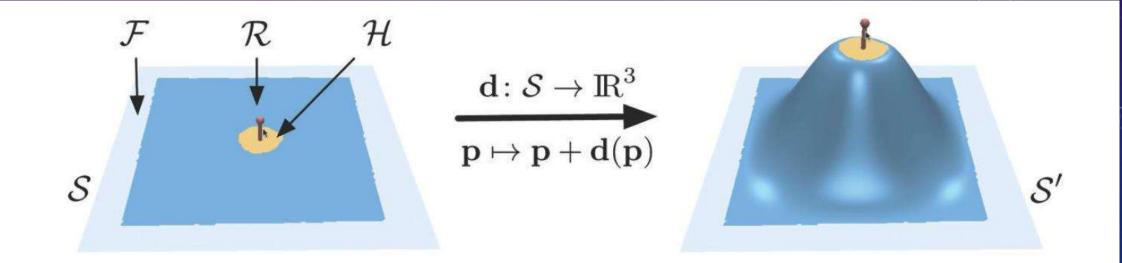
#### Definition

 $\triangleright$  The deformation of a given surface S into the desired surface S'

 $S' = \{p + d(p), p \in S\}, d(p)$  a displacement on each vertex  $p \in S$ 

- The user controls the deformation by
  - Prescribing displacements for a set of vertices  $p_i \in H \subset S$ .
  - $\cdot$  Constraining certain parts F stay fixed.
- > The main question: determine the displacements for vertices in  $S\setminus (H\cup F)$ .

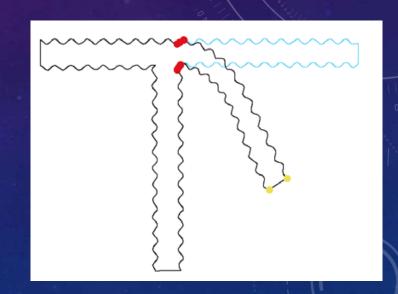
#### Handles



**Figure 9.1.** A given surface S is deformed into S' by a displacement function  $\mathbf{d}(\mathbf{p})$ . The user controls the deformation by moving a handle region  $\mathcal{H}$  (yellow) and keeping the region  $\mathcal{F}$  (gray) fixed. The unconstrained deformation region  $\mathcal{R}$  (blue) should deform in an intuitive, physically-plausible manner.

### Methods

- Surface-based deformations
  - Shape is empty shell (curve for 2D, surface for 3D)
  - Deformation only defined on shape
  - Deformation coupled with shape representation



### Methods

- Surface-based deformations
- Space deformations
  - Shape is volumetric (planar domain for 2D, polyhedral domain for 3D)
  - Deformation defined in neighborhood of shape
  - · Can be applied to any shape representation



## Surface-based deformations

- Physically-based deformation
- > Multi-Scale deformation
- Differential coordinates
- As-Rigid-As-Possible surface deformation

# Shell deformation energy

- Stretching
  - Change of local distances
  - Captured by 1st fundamental form
- > Bending
  - Change of local curvature
  - Captured by 2nd fundamental form

$$egin{aligned} \int_{\Omega} k_s \left\| \mathbf{I} - ar{\mathbf{I}} 
ight\|^2 \ \mathbf{I} &= \left[egin{array}{ccc} \mathbf{x}_u^T \mathbf{x}_u & \mathbf{x}_u^T \mathbf{x}_v \ \mathbf{x}_v^T \mathbf{x}_u & \mathbf{x}_v^T \mathbf{x}_v \end{array}
ight] \ \int_{\Omega} k_b \left\| \mathbf{I} \mathbf{I} - ar{\mathbf{I}} 
ight\|^2 \ \mathbf{I} &= \left[egin{array}{ccc} \mathbf{x}_{uu}^T \mathbf{n} & \mathbf{x}_{uv}^T \mathbf{n} \ \mathbf{x}_{vu}^T \mathbf{n} & \mathbf{x}_{vv}^T \mathbf{n} \end{array}
ight] \end{aligned}$$

> 1st and 2nd fundamental forms determine a surface up to rigid motion.

## Physically-based deformation

Nonlinear stretching & bending energies

$$\int_{\Omega} k_s ||\mathbf{I} - \mathbf{I}'||^2 + k_b ||\mathbf{I} - \mathbf{I}'||^2 \, du dv$$
stretching bending

▶ Linearize terms → quadratic energy

$$\int_{\Omega} k_s \underbrace{\left(\|\mathbf{d}_u\|^2 + \|\mathbf{d}_v\|^2\right)}_{\text{Stretching}} + k_b \underbrace{\left(\|\mathbf{d}_{uu}\|^2 + 2\|\mathbf{d}_{uv}\|^2 + \|\mathbf{d}_{vv}\|^2\right)}_{\text{bending}} \mathrm{d}u \mathrm{d}v$$

## Physically-based deformation

Minimize linearized bending energy

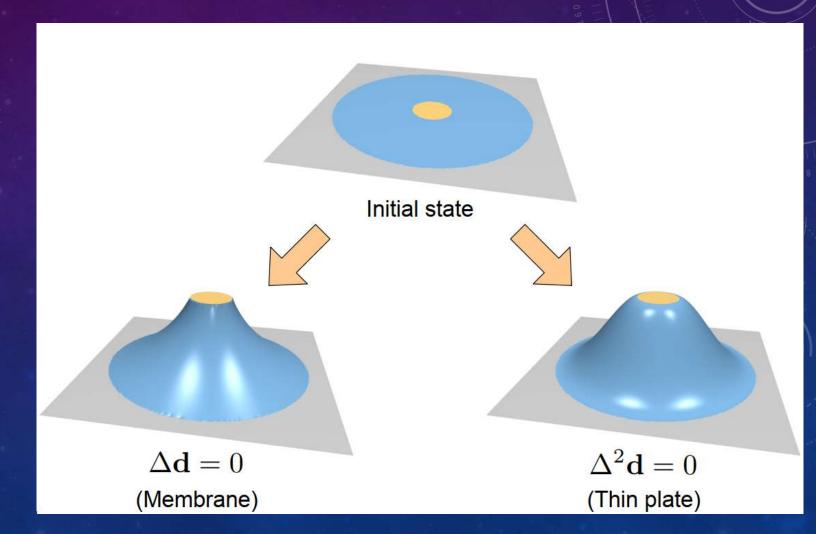
$$E(\mathbf{d}) = \int_{\mathcal{S}} \|\mathbf{d}_{uu}\|^2 + 2\|\mathbf{d}_{uv}\|^2 + \|\mathbf{d}_{vv}\|^2 du dv \to \min_{f(x) \to \min}$$

➤ Variational calculus → Euler-Lagrange PDE

$$\Delta^2 \mathbf{d} := \mathbf{d}_{uuuu} + 2\mathbf{d}_{uuvv} + \mathbf{d}_{vvvv} = 0 \qquad \left( f'(x) = \mathbf{d}_{uuvv} + \mathbf{d}_{vvvv} \right)$$

# Deformation energies

"Best" deformation that satisfies constraints



## Surface-based deformations

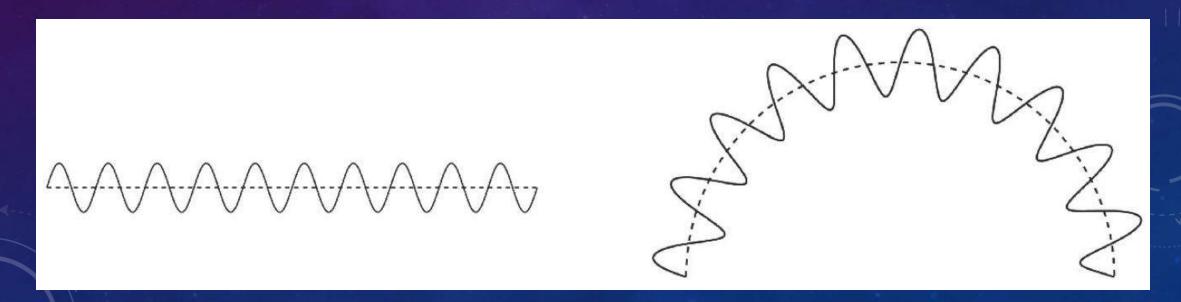
- Physically-based deformation
- Multi-Scale deformation
- > Differential coordinates
- As-Rigid-As-Possible surface deformation

### Multi-scale deformations

- Main idea: decompose the object into two frequency bands using the smoothing and fairing techniques.
  - The low frequencies correspond to the smooth global shape;
  - The high frequencies correspond to the fine-scale details.

## Multi-scale deformations

Goal: deform the low frequencies (global shape) while preserving the high-frequency details



#### Framework

$$> S = B \oplus D$$

$$\rightarrow B \rightarrow B'$$

$$> S' = B' \oplus D$$

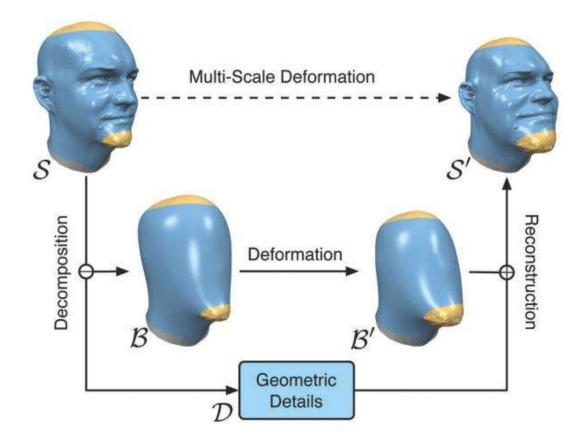
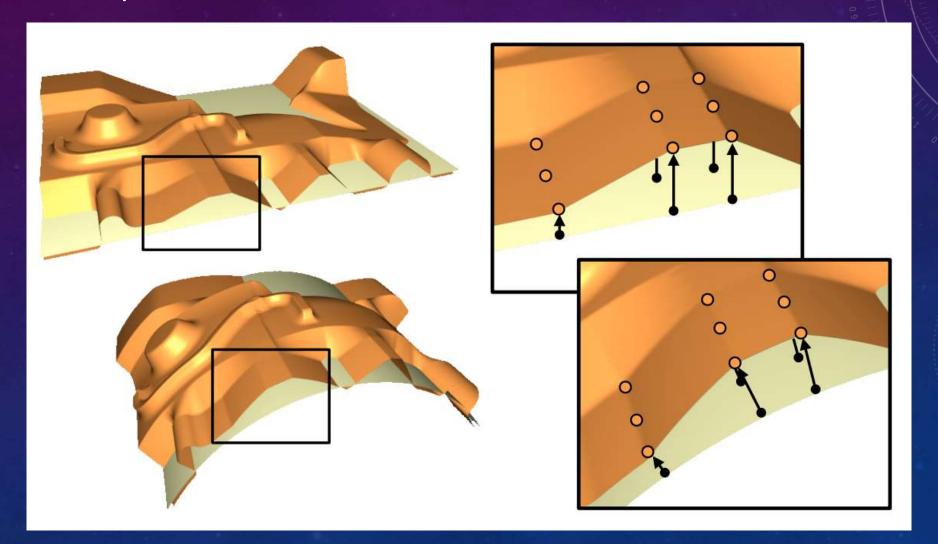


Figure 9.7. A general multi-scale editing framework consists of three main operators: the decomposition operator, which separates the low and high frequencies; the editing operator, which deforms the low frequency components; and the reconstruction operator, which adds the details back onto the modified base surface. Since the lower part of this scheme is hidden in the multi-scale kernel, only the multi-scale edit in the top row is visible to the designer. (Image taken from [Botsch and Sorkine 08]. ©2008 IEEE. Model courtesy of Cyberware.)

## Representation for the geometric detail

- The straightforward representation: a vector-valued displacement function
  - Associates a displacement vector to each point on the base surface.
  - Per-vertex displacement vectors
  - $p_i = b_i + h_i, \ p_i \in S, \ b_i \in B, \ h_i \in \mathbb{R}^3$
- Encoded in local frame  $h_i=lpha_i n_i+eta_i t_{i,1}+\gamma_i t_{i,2}$ , where  $n_i$ : normal,  $t_{i,1},t_{i,2}$ : two tangent vectors

# Normal displacements



### Encoded in local frame

$$h'_i = \alpha_i n'_i + \beta_i t'_{i,1} + \gamma_i t'_{i,2}, \qquad p'_i = b'_i + h'_i$$

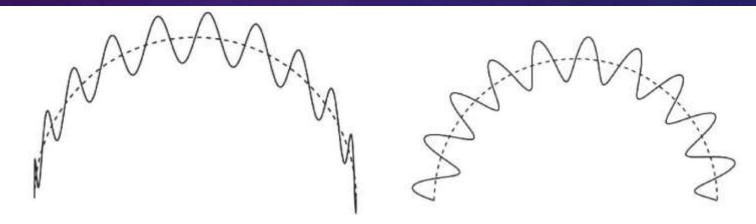
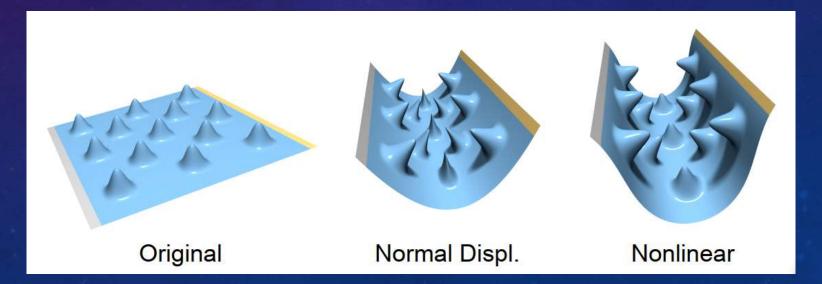


Figure 9.8. Representing the displacements with regard to the global coordinate system does not lead to the desired result (left). The geometrically intuitive solution is achieved by storing the details with regard to local frames that rotate according to the local tangent plane's rotation of  $\mathcal{B}$  (right). (Image taken from [Botsch 05].)

## Limitations

- Neighboring displacements are not coupled
  - Surface bending changes their angle
  - Leads to volume changes or self-intersections



### Limitations

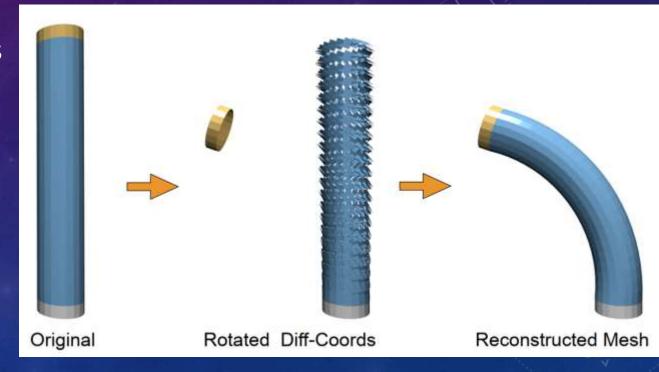
- Neighboring displacements are not coupled
  - Surface bending changes their angle
  - Leads to volume changes or self-intersections
- > Multiresolution hierarchy difficult to compute
  - Complex topology
  - Complex geometry
  - Might require more hierarchy levels

## Surface-based deformations

- Physically-based deformation
- > Multi-Scale deformation
- > Differential coordinates
- As-Rigid-As-Possible surface deformation

### Differential coordinates

- Manipulate differential coordinates instead of spatial coordinates
  - · Gradients, Laplacians, local frames
  - Close connection to surface normal



## Differential coordinates

- > Which differential coordinate  $\delta_i$ ?
  - Gradients
  - Laplacians
- > How to get local transformations  $T_i(\delta_i)$ ?
  - Smooth propagation
  - Implicit optimization

#### Gradient-based deformation

- Manipulate gradient of a function:  $g = \nabla f$ ,  $g \mapsto g' = T(g)$
- $\triangleright$  Find function f' whose gradient is (close to) g'

$$f' = \underset{f}{\operatorname{argmin}} \int_{\Omega} \|\nabla f - T(g)\|^2 dA$$

➤ Variational calculus → Euler-Lagrange PDE

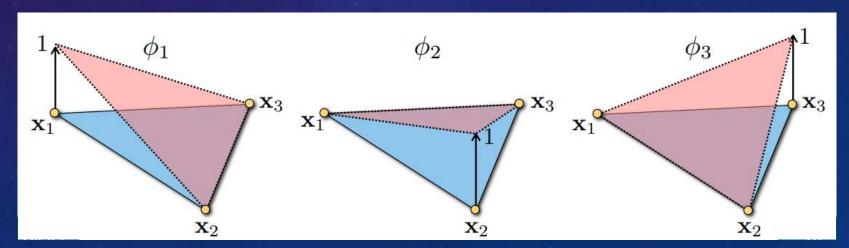
$$\Delta f' = \operatorname{div} T(g)$$

## Gradient-based deformation

Consider piecewise linear coordinate function

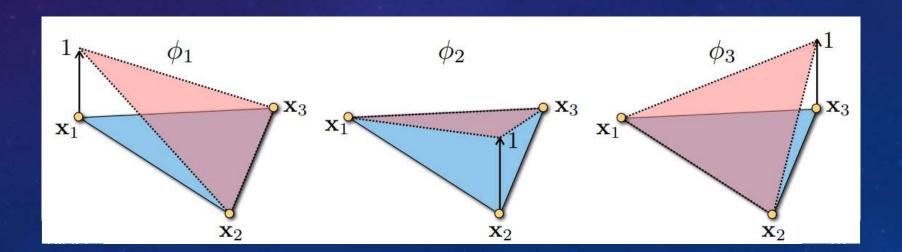
$$p(u,v) = \sum_{i} p_{i} \phi_{i}(u,v)$$

> Its gradient is  $\nabla p(u,v) = \sum_i p_i \nabla \phi_i(u,v)$ 



## Gradient-based deformation

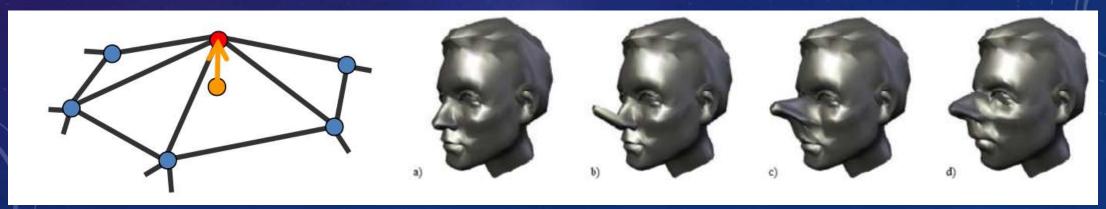
- Its gradient is  $\nabla p(u,v) = \sum_i p_i \nabla \phi_i(u,v)$
- > It is constant per triangle  $\nabla p|_{ijk} = g_{ijk} \in \mathbb{R}^{3 \times 3}$
- $> Lp' = \operatorname{div} T_{ijk}(g_{ijk})$  per vertex



## Laplacian coordinates

- $>\delta=Lp$  approximation to normals unique up to translation
- > Reconstruct by solving  $Lp' = \delta$  for p' (with some constraints)

$$p' = \underset{p'}{\operatorname{arg\,min}} \sum_{i} ||T_{i}\delta_{i} - (Lp')_{i}||^{2}$$

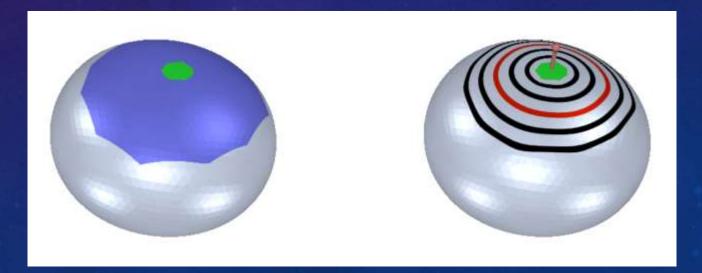


### Differential coordinates

- > Which differential coordinate  $\delta_i$ ?
  - Gradients
  - Laplacians
- > How to get local transformations  $T_i(\delta_i)$ ?
  - Smooth propagation
  - Implicit optimization

## Smooth propagation

- Compute handle's deformation gradient
- Extract rotation and scale/shear components
- Propagate damped rotations over ROI



## Smooth propagation

- Controlled by a scalar field:
  - 1 is at the handle;
  - 0 is at the fixed region;
  - smoothly blends between 1 and 0 within the support region.

 $d_F(p)$  - distance from p to the fixed region,  $d_H(p)$  - distance from p to the handle

$$s(p) = \frac{d_F(p)}{d_F(P) + d_H(p)}$$

### Harmonic field

Solving equation

$$\begin{cases} \Delta s = 0, in S \setminus (H \cup F) \\ s = 1, & in H \\ s = 0, & in F \end{cases}$$

> Easy to implement

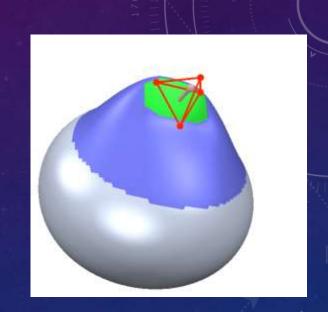
## Deformation gradient

Handle has been transformed affinely

$$T(x) = Ax + t$$

- > Deformation gradient is  $\nabla T(x) = A$
- > Extract rotation *R* and scale/shear *S*

$$A = U\Sigma V^T \Longrightarrow R = UV^T$$
,  $S = V\Sigma V^T$ 



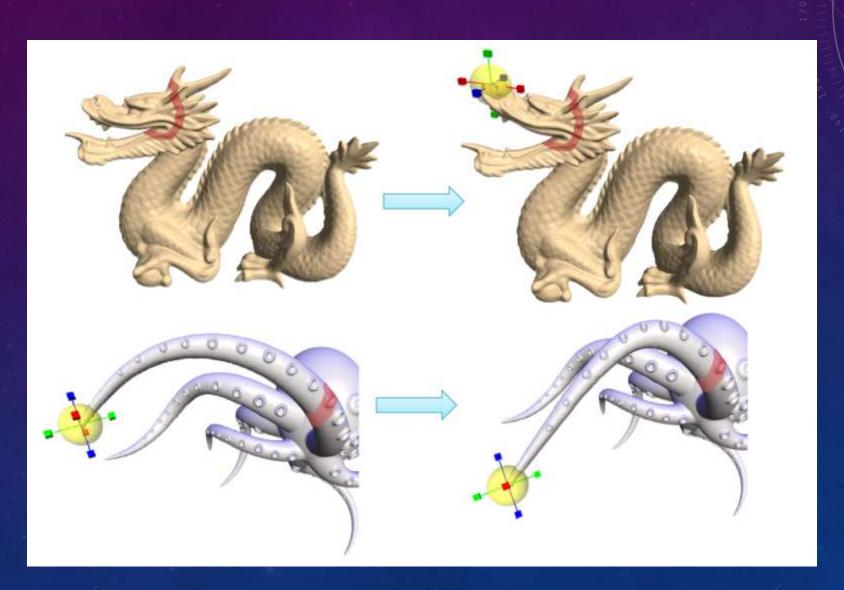
## Linearize rotation/scale

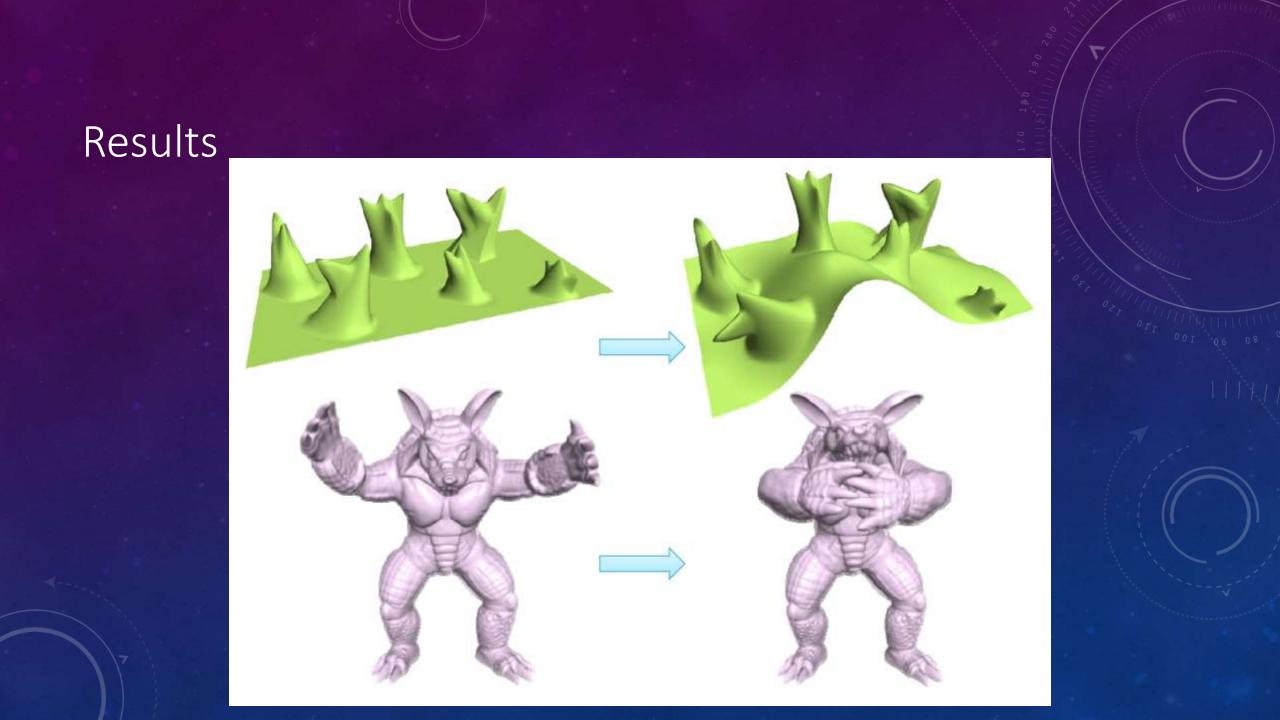
> 2D case: 
$$T_{ijk} = \begin{pmatrix} s & 0 \\ 0 & s \end{pmatrix} \begin{pmatrix} \cos \theta & \sin \theta \\ -\sin \theta & \cos \theta \end{pmatrix} = \begin{pmatrix} a & b \\ -b & a \end{pmatrix}$$

> 3D case:  $T_i$  skew-symmetric

$$T_{i} = \begin{pmatrix} s & -h_{3} & h_{2} \\ h_{3} & s & -h_{1} \\ -h_{2} & h_{1} & s \end{pmatrix} \Longrightarrow T_{i}x = sx + h \times x$$

# Results





#### Connection to shells

 $\triangleright$  Neglect local transformations  $T_i$ 

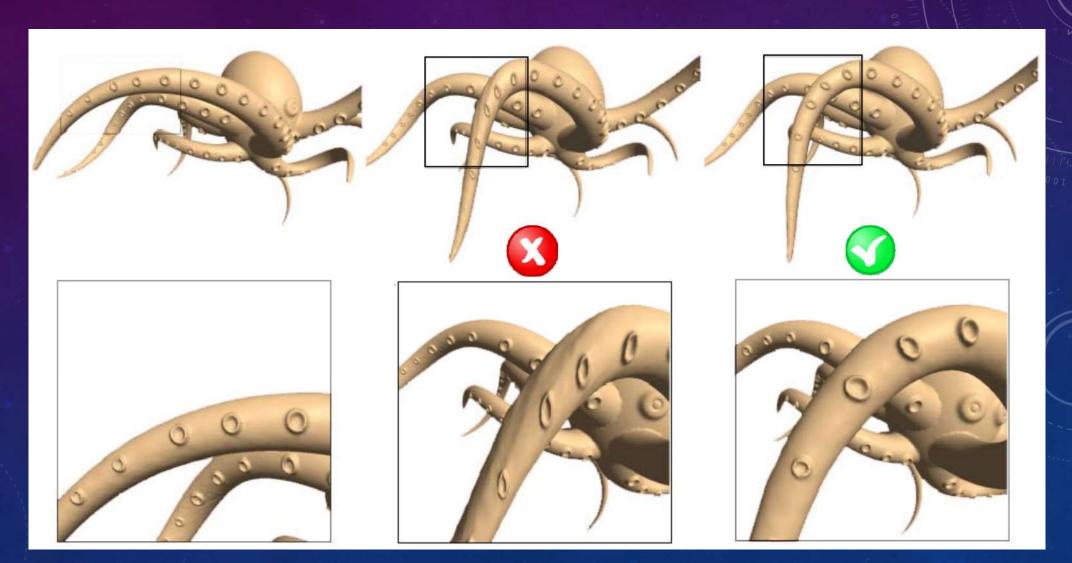
$$p' = \arg\min_{p'} \sum_{i} ||(Lp)_i - (Lp')_i||^2 \Rightarrow \arg\min_{d} \sum_{i} ||(Ld)_i||^2$$

$$E(\mathbf{d}) = \int_{\mathcal{S}} \|\mathbf{d}_{uu}\|^2 + 2\|\mathbf{d}_{uv}\|^2 + \|\mathbf{d}_{vv}\|^2 du dv \to \min$$

$$f(x) \to \min$$

$$\Delta^2 \mathbf{d} := \mathbf{d}_{uuuu} + 2\mathbf{d}_{uuvv} + \mathbf{d}_{vvvv} = 0$$

# Connection to shells



### Surface-based deformations

- Physically-based deformation
- > Multi-Scale deformation
- Differential coordinates
- As-Rigid-As-Possible surface deformation

## As-Rigid-As-Possible surface deformation

- Goal: preserve shape meaning that an object is only rotated or translated, but
   not scaled or sheared local parts should change as rigidly as possible
- > Energy:

$$E(R, p') = \sum_{i} w_{i} \sum_{j \in \Omega(i)} w_{ij} \| (p'_{i} - p'_{j}) - R_{i} (p_{i} - p_{j}) \|^{2}$$

 $w_i$ : local average area,  $w_{ij}$ : cot weight

## Local step

$$E(R, p') = \sum_{i} w_{i} \sum_{j \in \Omega(i)} w_{ij} \| (p'_{i} - p'_{j}) - R_{i} (p_{i} - p_{j}) \|^{2}$$

> Fix  $p'_i$ , compute  $R_i$ 

$$E_i(R_i) = \sum_{j \in \Omega(i)} w_{ij} \| (p'_i - p'_j) - R_i(p_i - p_j) \|^2$$

Let  $e_{ij}' = p_i' - p_j'$  and  $e_{ij} = p_i - p_j$ 

$$E_i(R_i) = \sum_{j \in \Omega(i)} w_{ij} (e'_{ij} - R_i e_{ij})^T (e'_{ij} - R_i e_{ij}) = -\sum_{j \in \Omega(i)} w_{ij} e'_{ij}^T R_i e_{ij} + C$$

Local step

$$E(R, p') = \sum_{i} w_{i} \sum_{j \in \Omega(i)} w_{ij} || (p'_{i} - p'_{j}) - R_{i} (p_{i} - p_{j}) ||^{2}$$

$$\underset{R_i}{\operatorname{argmax}} \sum_{j \in \Omega(i)} w_{ij} e_{ij}^{\prime T} R_i e_{ij} = \underset{R_i}{\operatorname{argmax}} \sum_{j \in \Omega(i)} tr(w_{ij} R_i e_{ij} e_{ij}^{\prime T})$$

$$= \underset{R_i}{\operatorname{argmax}} tr(R_i \sum_{j \in \Omega(i)} w_{ij} e_{ij} e'_{ij}^T)$$

Let  $M_i = \sum_{j \in \Omega(i)} w_{ij} e_{ij} e'_{ij}^T$  and  $M_i = U_i S_i V_i$  (signed SVD), then  $R_i = V_i U_i^T$ 

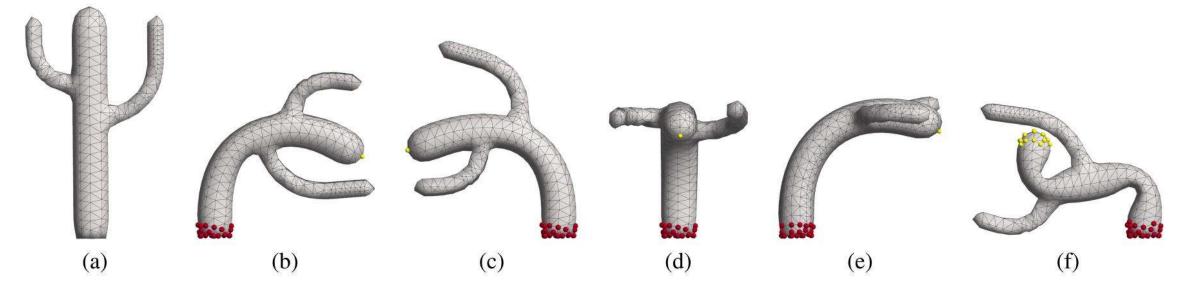
## Global step

$$E(R, p') = \sum_{i} w_{i} \sum_{j \in \Omega(i)} w_{ij} \| (p'_{i} - p'_{j}) - R_{i} (p_{i} - p_{j}) \|^{2}$$

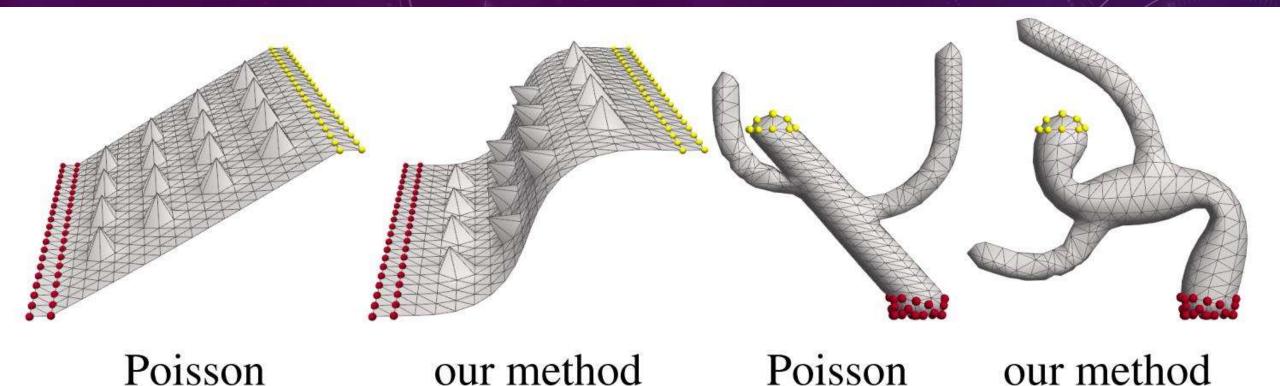
- $\succ$  Fix  $R_i$ , compute  $p_i'$
- Linear least square, easy to solve
- > Initial deformation
  - Previous frame (for interactive manipulation)
  - Naive Laplacian editing

• ...

#### Results



**Figure 7:** Bending the Cactus. (a) is the original model; yellow handles are translated to yield the results (b-f). (d) and (e) show side and front views of forward bending, respectively. Note that in (b-e) a single vertex at the tip of the Cactus serves as the handle, and the bending is the result of translating that vertex, no rotation constraints are given.



**Figure 5:** Comparison with Poisson mesh editing. The original models appear in Figures 2 and 7. The yellow handle was only translated; this poses a problem for rotation-propagation methods such as [YZX\*04, ZRKS05, LSLCO05].

QA How to implement ARAP tetrahedral deformation?