



#### What are 'good' parameterizations?

Low distortion + injectivity



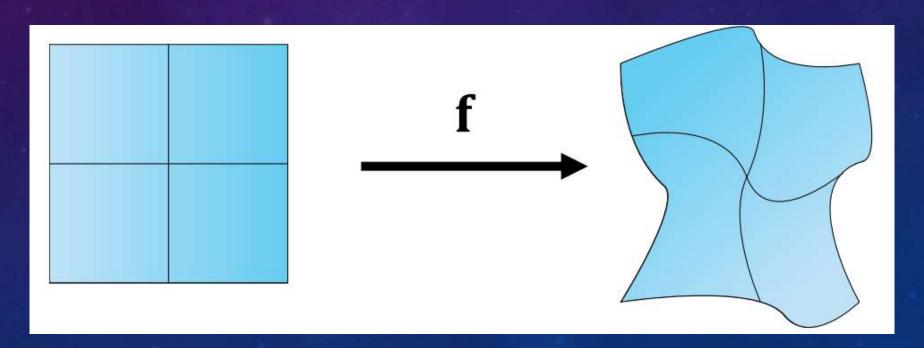
Not injective

Injective

Lower distortion + injective

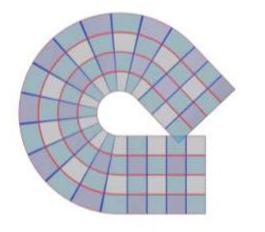
# Condition of injectivity

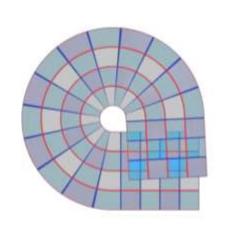
$$\det \left( J_f(x) \right) > 0, \forall x$$

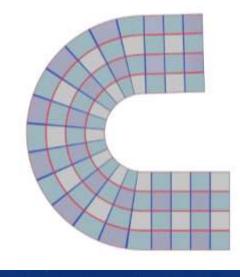




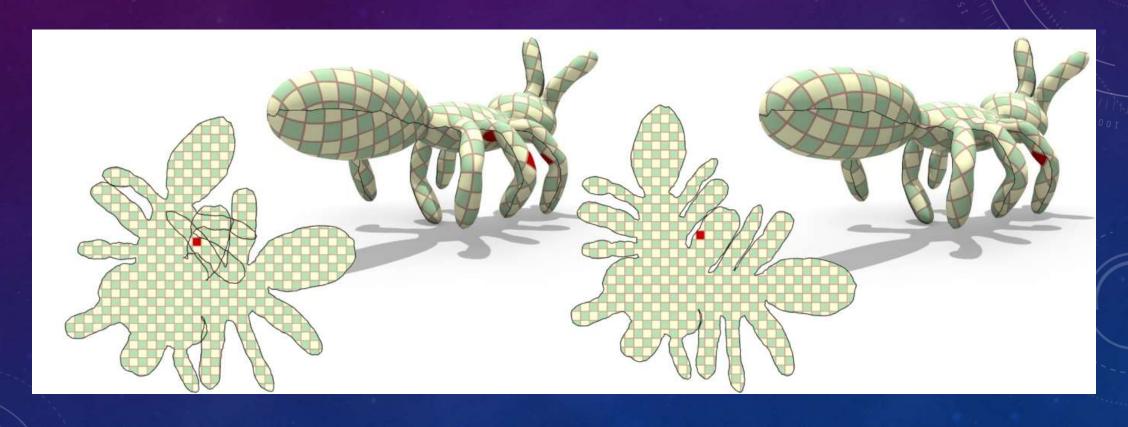
 $\Rightarrow \det \left( J_f(x) \right) > 0, \forall x \text{ and } f(\Omega) \text{ no overlap}$ 







# Bijectivity



With overlap

Without overlap

# Methods for Injective Parameterization

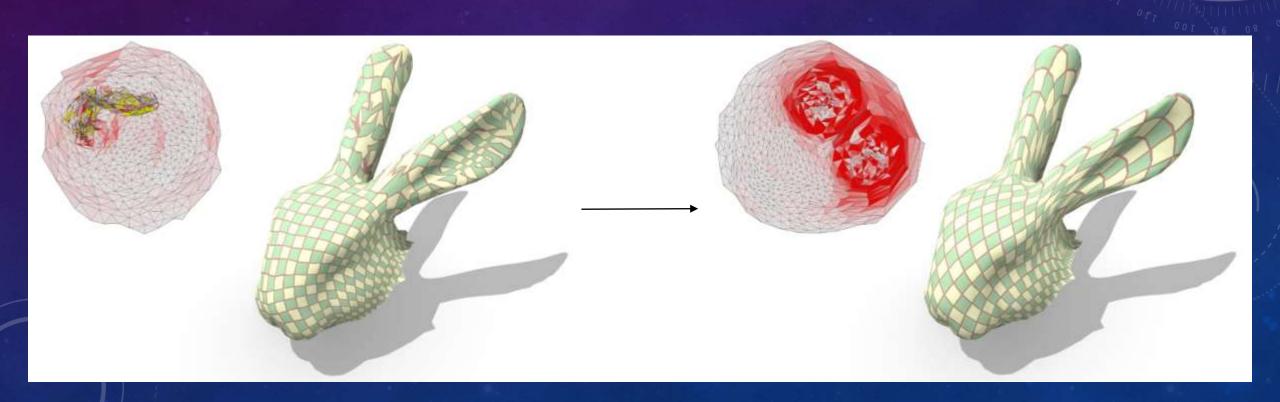
#### Injective Parameterization

#### Two cases:

- ➤ Flipped initializations → removing flipped elements
- Flip-free initializations → keeping mapping always flip-free

# Removing flipped elements

Convert the flipped elements into flip-free.



### Closest point projection

- $\triangleright$  Signed singular value decomposition:  $J_f = USV$ 
  - $\cdot$  *U* and *V* are two rotation matrices
  - $S = diag(\sigma_1, \sigma_2), \sigma_1 \ge |\sigma_2|$
- > Flip-free constraints:  $\sigma_2 > 0$  (constraints)
- Distortion term (energy)

# Methods

- Convex subspace
- Local-global optimization
- > Penalty function
- > Total unsigned area

Bounded conformal distortion constraint :  $1 \le \mathcal{T}(J_{ijk}) = \frac{\sigma}{\tau} \le K$ 

$$J_{ijk}^{T}J_{ijk} = \begin{pmatrix} a & c \\ b & d \end{pmatrix} \begin{pmatrix} a & b \\ c & d \end{pmatrix} = \begin{pmatrix} a^{2} + c^{2} & ab + cd \\ ab + cd & b^{2} + d^{2} \end{pmatrix}$$

Let 
$$a' = \frac{a+d}{2}$$
,  $c' = \frac{a-d}{2}$ ,  $b' = \frac{c-b}{2}$ ,  $d' = \frac{c+b}{2}$ , then

$$\sigma = \sqrt{a'^2 + b'^2} + \sqrt{c'^2 + d'^2}, \qquad \tau = \sqrt{a'^2 + b'^2} - \sqrt{c'^2 + d'^2}$$

Bounded conformal distortion constraint :  $1 \le \mathcal{T}(J_{ijk}) = \frac{\sigma}{\tau} \le K$ 

$$\sigma = \sqrt{a'^2 + b'^2} + \sqrt{c'^2 + d'^2}, \qquad \tau = \sqrt{a'^2 + b'^2} - \sqrt{c'^2 + d'^2}$$

$$\tau > 0 \Rightarrow \sqrt{c'^2 + d'^2} < \sqrt{a'^2 + b'^2}$$

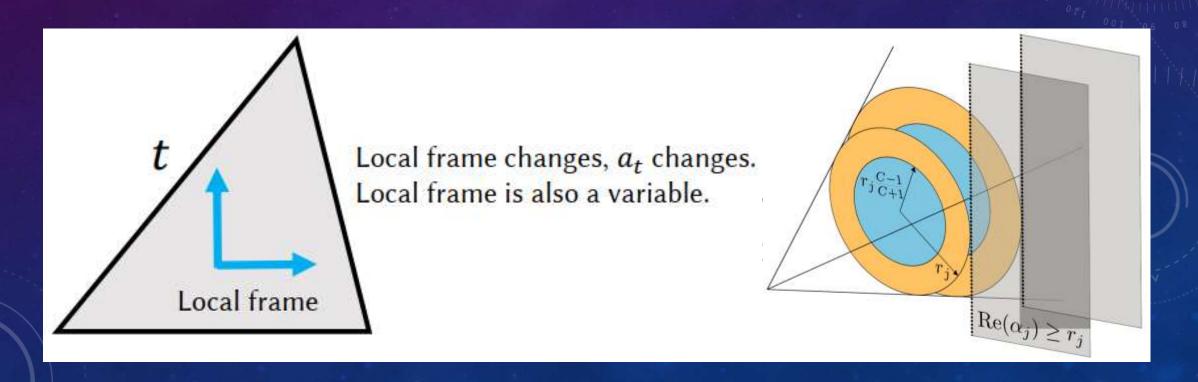
$$\frac{\sigma}{\tau} \le K \Longrightarrow \sqrt{c'^2 + d'^2} \le \frac{K - 1}{K + 1} \sqrt{a'^2 + b'^2}$$

> Non-convex 
$$\sqrt{c'^2 + d'^2} \le \frac{K-1}{K+1} \sqrt{a'^2 + b'^2}$$

Lipman, Yaron. Bounded distortion mapping spaces for triangular meshes. ACM
 Transactions on Graphics (TOG) 31.4 (2012): 1-13.

Auxiliary 
$$r > 0$$
 for each face : 
$$\begin{cases} \sqrt{c'^2 + d'^2} \le \frac{K-1}{K+1} r \text{ (convex)} \\ \sqrt{a'^2 + b'^2} \ge r \text{ (non - convex)} \end{cases}$$

$$a' \ge r \text{ (convex)} \implies \sqrt{a'^2 + b'^2} \ge r$$



### Optimization

#### Objective function:

• LSCM: 
$$E = \sum_{ijk} A_{ijk} (c'^{2}_{ijk} + d'^{2}_{ijk})$$

• ARAP: 
$$E = \sum_{ijk} A_{ijk} ((a'_{ijk} - 1)^2 + b'_{ijk}^2 + c'_{ijk}^2 + d'_{ijk}^2)$$

#### Optimization:

- Fix the local frame on each triangle: Second-Order Cone Programming
- Update local frame to let  $b'_{ijk} = 0$

#### Results



- A small number of iterations n < 10
- Quadratic programming is time-consuming
- How to set *K*?

### Local-global optimization

 $\triangleright$  Auxiliary matrix  $H_{ijk}$  for each face

$$\min_{u} \sum_{ijk} \left\| J_{ijk}(u) - H_{ijk} \right\|_F^2,$$

s.t.  $H_{ijk} \in \mathcal{H} = \{H | 1 \le \tau\{H\} \le K\}$  and Au = b (coordinate constraint)

# Local-global optimization

Local step - Signed singular value decomposition

$$\min_{u} \sum_{ijk} \left\| J_{ijk}(u) - H_{ijk} \right\|_F^2,$$

s.t. 
$$H_{ijk} \in \mathcal{H} = \{H | 1 \le \tau\{H\} \le K\}$$

### Local-global optimization

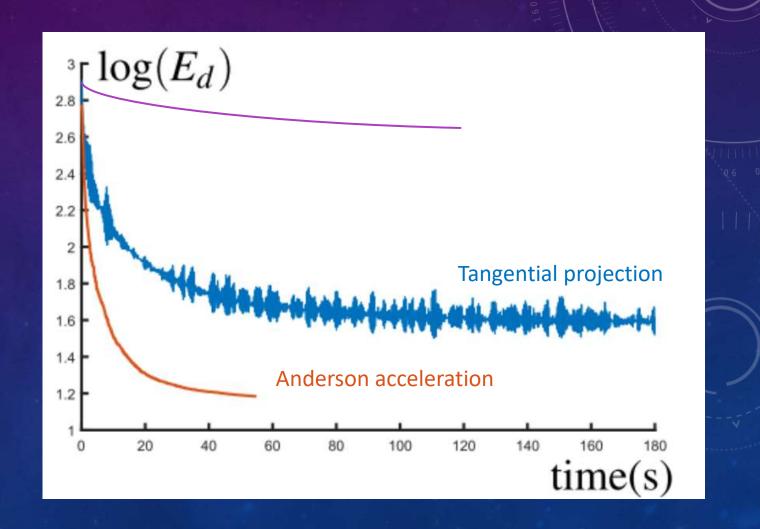
Global step – constraint least square (KKT condition)

$$\min_{u} \sum_{ijk} \left\| J_{ijk}(\mathbf{u}) - H_{ijk} \right\|_F^2,$$

s.t. Au = b (coordinate constraint)

### Slow convergence

- Acceleration
  - Tangential projection
  - Anderson acceleration



#### Tangential projection

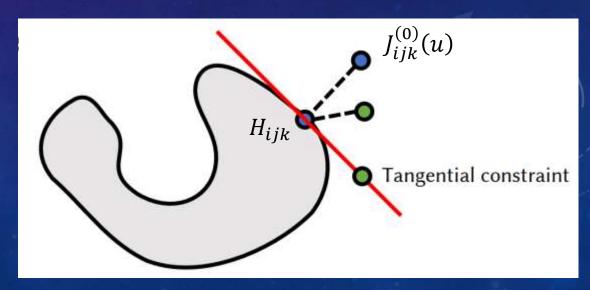
Kovalsky, Shahar Z., et al. Large-scale bounded distortion mappings. ACM Trans.
 Graph. 34.6 (2015): 191-1

Global step – constraint least square (KKT condition)

$$\min_{u} \sum_{ijk} \left\| J_{ijk}(\mathbf{u}) - H_{ijk} \right\|_{F}^{2},$$

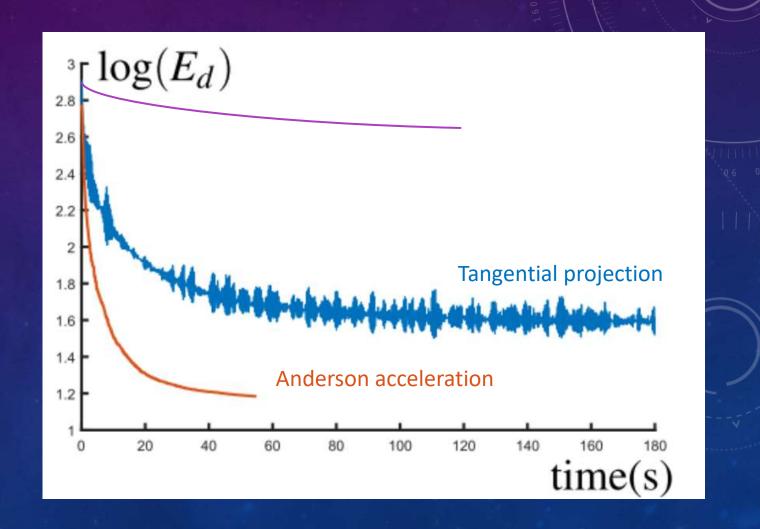
s.t. Au = b (coordinate constraint)

$$(J_{ijk}(u) - H_{ijk}) \perp (J_{ijk}^{(0)}(u) - H_{ijk})$$



### Slow convergence

- Acceleration
  - Tangential projection
  - Anderson acceleration



#### Anderson acceleration

- Su, Jian-Ping, Xiao-Ming Fu, and Ligang Liu. Practical foldover-free
   volumetric mapping construction. Computer Graphics Forum. Vol. 38. No.
   7. 2019
- Peng, Yue, et al. Anderson acceleration for geometry optimization and physics simulation. ACM Transactions on Graphics (TOG) 37.4 (2018): 1-14.

#### Anderson acceleration

Fixed-point iteration  $u^{k+1} = G(u^k)$ . Accelerated iteration

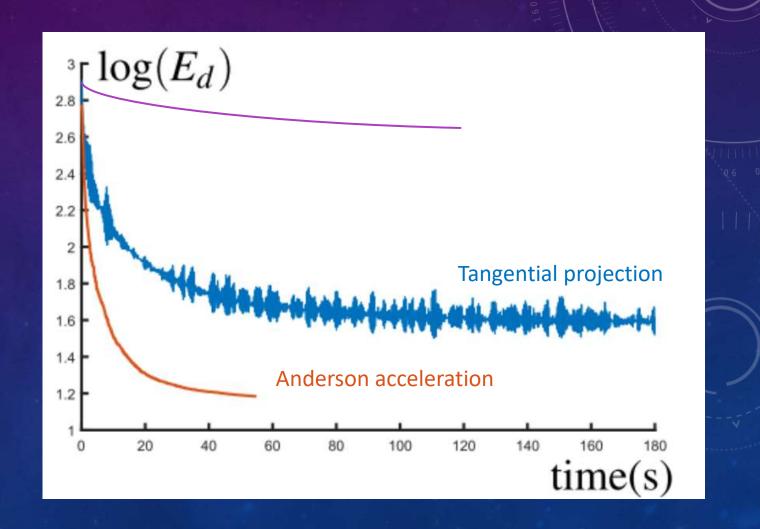
$$u_{AA}^{k+1} = G(u^k) - \sum_{j=1}^m \theta_j^* (G(u^{k-j+1}) - G(u^{k-j}))$$

where  $(\theta_1^*, ..., \theta_m^*)$  is the solution to a linear least-squares problem:

$$\min_{(\theta_1, \dots, \theta_m)} \left\| F^k - \sum_{j=1}^m \theta_j (F^{k-j+1} - F^{k-j}) \right\|, F^k = G(u^k) - u^k$$

### Slow convergence

- Acceleration
  - Tangential projection
  - Anderson acceleration



# Update bound K

$$\min_{u} \sum_{ijk} \left\| J_{ijk}(u) - H_{ijk} \right\|_F^2,$$

s.t.  $H_{ijk} \in \mathcal{H} = \{H | 1 \le \tau\{H\} \le K\}$  and Au = b (coordinate constraint)

Strategy:  $K^0 = 4$ ,  $K^{n+1} = \beta K^n$ 

# Practical Foldover-Free Volumetric Mapping Construction

Submitted to Pacific Graphics 2019

ID:1075

(This video contains no voiceover)

# Penalty function

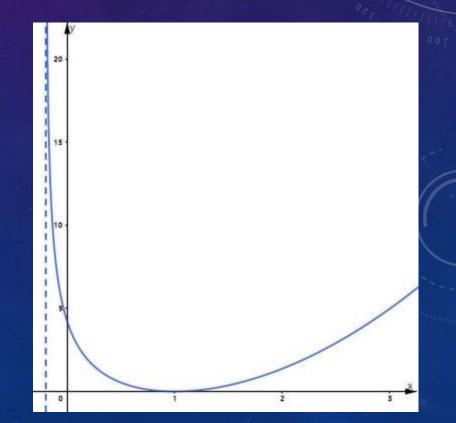
- Key idea: penalize the flipped elements via penalty functions
- Main properties:
  - It is very large to penalize flipped Jacobian matrices;
  - It is very small to accept flip-free Jacobian matrices.
- Solvers are then the challenges
  - Non-linear and non-convex

### Penalty function

$$\sum_{ijk} \frac{\|J_{ijk}\|_F^d}{\det(J_{ijk}) + \sqrt{\det(J_{ijk})^2 + \epsilon}}$$

$$\begin{array}{c|c}
\rho + \sqrt{\rho^2 + \epsilon} \\
\hline
\sqrt{\epsilon} \\
0 \\
\rho
\end{array}$$

$$\sum_{ijk} (\det(J_{ijk}) - 1)^2 + \left(\log \frac{\det(J_{ijk}) - \delta}{1 - \delta}\right)^2$$



#### Parameter $\epsilon$

- Garanzha, Vladimir, et al. Foldover-free maps in 50 lines of code. ACM
   Transactions on Graphics (TOG) 40.4 (2021): 1-16
- > Update strategy of  $\epsilon : \epsilon^0 = 0$

$$\epsilon^{n+1} = \begin{cases} \left(1 - \frac{\sigma^n \sqrt{(D_-^{n+1})^2 + (\epsilon^n)^2}}{|D_-^{n+1}| + \sqrt{(D_-^{n+1})^2 + (\epsilon^n)^2}}\right) \epsilon^n, & \text{if } D_-^{n+1} < 0\\ (1 - \sigma^n) \epsilon^n, & \text{if } D_-^{n+1} \ge 0 \end{cases}$$

Where 
$$D_{-}^{n+1} = \min_{ijk} \det(J_{ijk}^{n+1})$$
 and  $\sigma^n = \max(\frac{1}{10}, 1 - \frac{F(U^{n+1}, \epsilon^n)}{F(U^n, \epsilon^n)})$ 

#### Non-linear solvers

- Block coordinate descent method
- Monotone preconditioned conjugate gradient method
- > L-BFGS
- > SGD
- Secord-order methods

#### Total unsigned area (TUA)

Du, Xingyi, et al. Lifting simplices to find injectivity. ACM Trans. Graph. 39.4 (2020): 120.

Signed area  $S_t$  of a triangle t and unsigned area  $U_t$  of a triangle t. For any 2D triangulation or 3D tetrahedron  $\mathcal{T}$ ,

- Total signed area  $\sum_t S_t = Area(T)$
- Total unsigned area  $\sum_t U_t \ge Area(\mathcal{T})$
- $\mathcal{T}$  is flip-free iff  $\sum_t U_t = Area(\mathcal{T})$

#### Methods

- Optimizing total unsigned area for achieving flip-free mappings.
- > Challenges:
  - TUA is  $C^0$ -continuous as a vertex moves across the supporting line of its opposite edge in a triangle.
  - The triangulation containing degenerate elements is a global minimum of TUA but a non-injective embedding
  - TUA has zero gradients with respect to any vertex surrounded by a ring of consistently oriented triangles

#### Total lifted content

$$\sum_{t} \frac{1}{d!} \sqrt{\det(X^T X + \alpha \tilde{X}^T \tilde{X})}$$

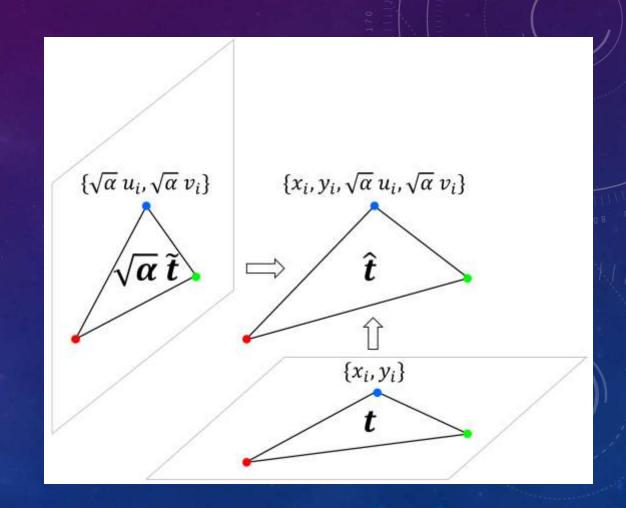
- . X: a  $d \times d$  matrix whose column vectors are the edge vectors from one vertex to the other d vertices.  $U_t = \sqrt{\det(X^TX)}$
- $\tilde{X}$ : similar to X, but from an auxiliary simplex, such as an equilateral triangles or tetrahedra of the same size as the input.

#### Total lifted content

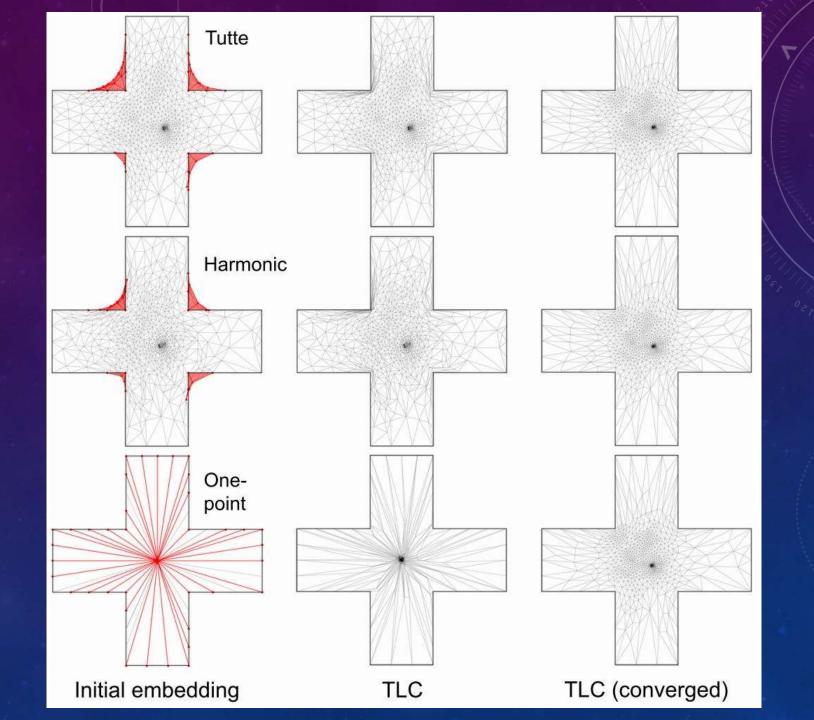
$$\sum_{t} \frac{1}{d!} \sqrt{\det(X^T X + \alpha \tilde{X}^T \tilde{X})}$$

$$\tilde{X} = \begin{pmatrix} u_1 & u_2 & u_3 \\ v_1 & v_2 & v_3 \end{pmatrix}$$

- > TLC is smooth over the entire space
- > TLC has only an injective global minimum for sufficiently small values of  $\alpha$ .



# Results



## Injective Parameterization

#### Two cases:

- Flipped initializations → removing flipped elements
- Flip-free initializations → keeping mapping always flip-free

## Flip-free initializations

Tutte's barycentric mapping

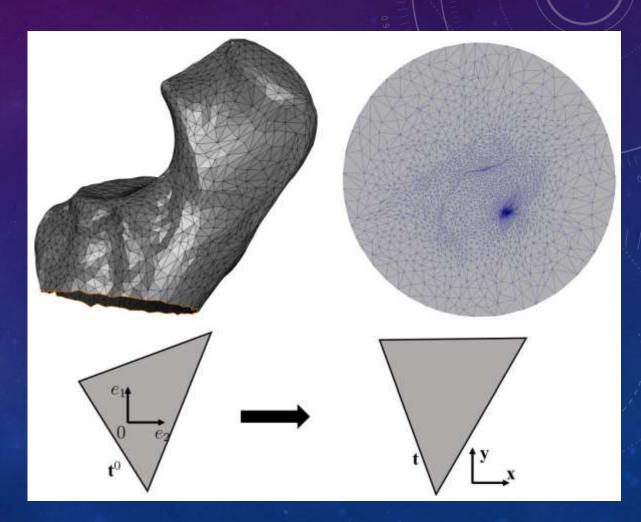
Given a triangulated surface homeomorphic to a disk, if the (u, v) coordinates at the boundary vertices lie on a convex polygon in order, and if the coordinates of the internal vertices are a convex combination of their neighbors, then the (u, v) coordinates form a valid parameterization (without self-intersections, bijective)

# Barycentric Mapping

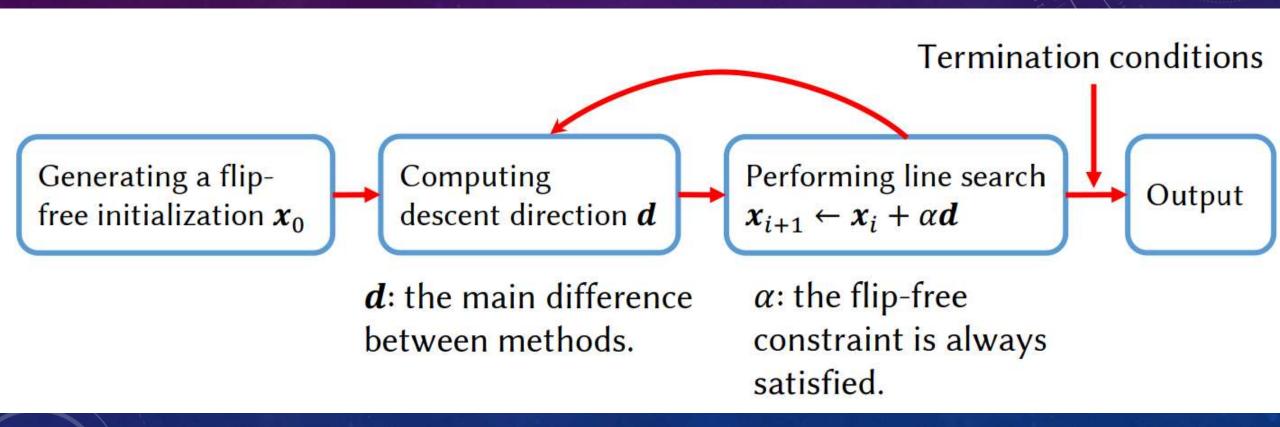
- Homeomorphic to a disk
- > A convex polygon circle, square,.....
- > A convex combination

$$\binom{u_i}{v_i} = \sum_{j \in \Omega(i)} w_{ij} \binom{u_j}{v_j}, w_{ij} > 0$$

Solver: linear equation.



## Pipeline



#### Barrier functions

- Barrier functions diverge to infinity when elements become degenerate, thus inhibiting flips (log of the determinant).
- Distortion metrics explode near degeneracies.

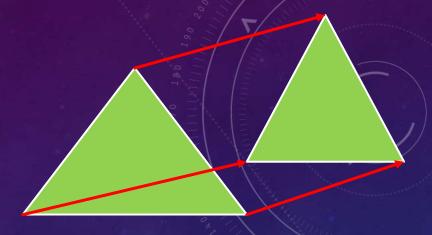
MIPS: 
$$\frac{\sigma_1}{\sigma_2} + \frac{\sigma_2}{\sigma_1} = \frac{\sigma_1^2 + \sigma_2^2}{\sigma_1 \sigma_2} = \frac{\|J\|_F^2}{\det J}$$
. If  $\det J \to 0$ , then MIPS  $\to \infty$ 

### Optimization problem

$$\min_{u,v} \sum_{ijk} A_{ijk} \mathcal{D}(J_{ijk}(u,v)) \triangleq \min_{u,v} E(u,v)$$

- 1. Initial point  $(u_0, v_0)$ , iter n = 0
- 2. Descent direction  $\langle p, \nabla E \rangle < 0$
- 3. Step size  $\min_{\alpha} E((u_n, v_n) + \alpha p)$
- 4. Update  $(u_{n+1}, v_{n+1}) = (u_n, v_n) + \alpha p, n = n+1$

#### Line search



- Theoretical guarantee each triangle has a positive area
- $\triangleright$  Triangle ijk becomes degenerate when its signed area becomes zero:

$$\det\begin{pmatrix} (u_k, v_k) + \alpha p_k - (u_i, v_i) - \alpha p_i \\ (u_j, v_j) + \alpha p_j - (u_i, v_i) - \alpha p_i \end{pmatrix} = 0$$

It is quadratic in  $\alpha$  and max step size for this triangle is the smallest positive root.

The max step size for all triangles is the minimum parameter  $\alpha$  over all triangles.

#### Termination conditions

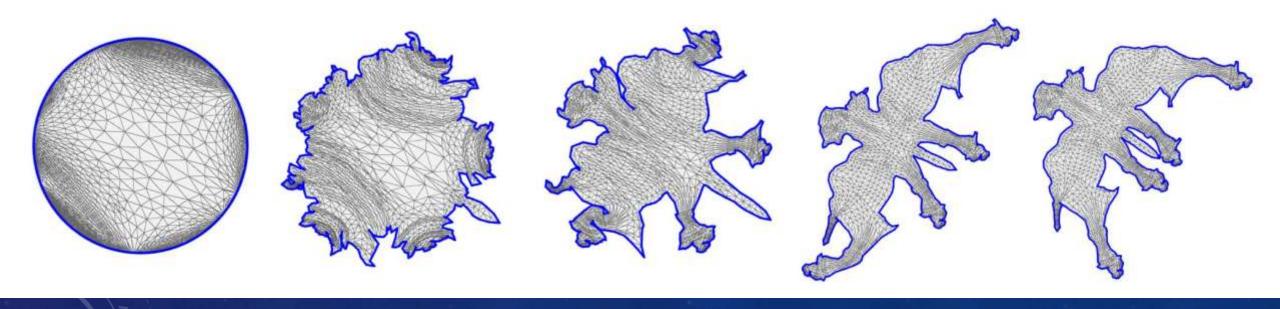
$$\min_{u,v} \sum_{ijk} A_{ijk} \mathcal{D}(J_{ijk}(u,v)) \triangleq \min_{u,v} E(u,v)$$

- 1. The gradient is small  $\|\nabla E\| \leq \epsilon$
- 2. The absolute or relative error in energy and/or position are small.
- 3. A fixed number of iterations

# Methods for Bijective Parameterization



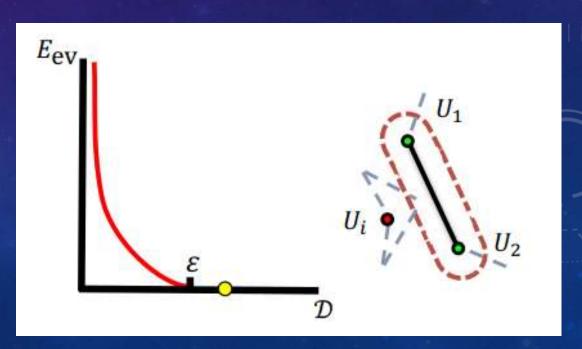
From overlap-free initialization → keep overlap free



#### Barrier functions

- Smith J, Schaefer S. Bijective parameterization with free boundaries[J].
  ACM Transactions on Graphics (TOG), 2015, 34(4): 1-9.
- Boundary barrier function

$$E_{ev}(b_j, u_i) = \max\left(0, \frac{\epsilon}{\mathcal{D}(b_j, u_i)} - 1\right)^2$$

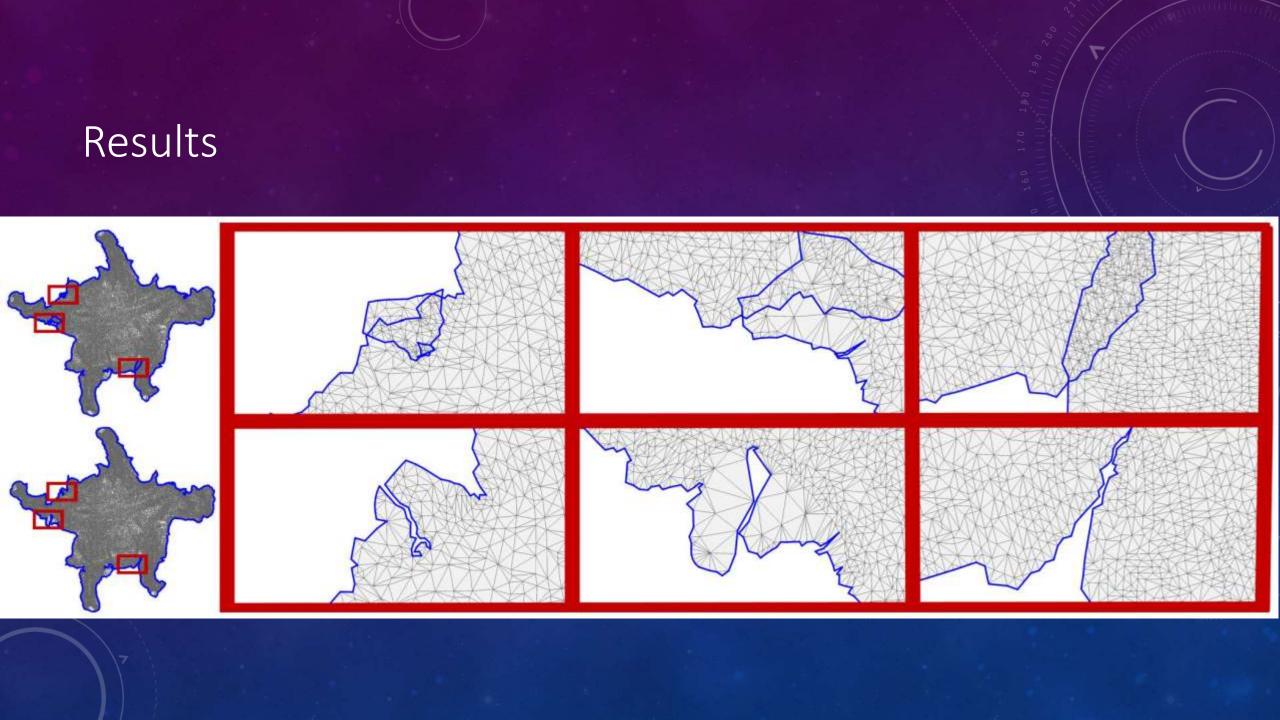


#### Formulation

$$\min_{u} E_d(u) + \lambda E_b(u)$$

$$E_d(u) = \frac{1}{4} \sum_{ijk} (\|J_{ijk}(u)\|_F^2 + \|J_{ijk}^{-1}(u)\|_F^2)$$

$$E_b(u) = \sum_{b_j \in \partial \Omega} \sum_{u_i \in \Omega} E_{ev}(b_j, u_i)$$

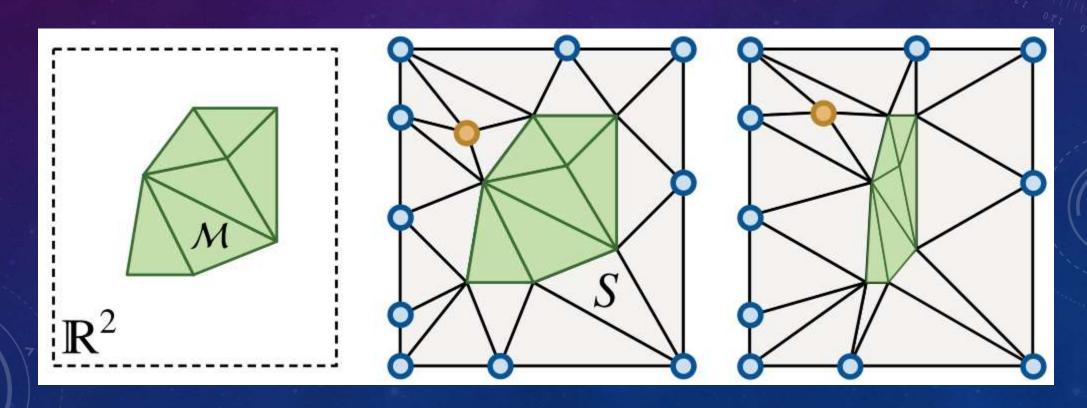


## Scaffold

Jiang Z, Schaefer S, Panozzo D. Simplicial complex augmentation framework for bijective maps[J]. ACM Transactions on Graphics, 2017, 36(6).

## Motivation

➤ Overlap-free ⇒ flip-free



# Connectivity updating



