
THREE POINTS MAKE A TRIANGLE... OR A CIRCLE

Peter Schröder

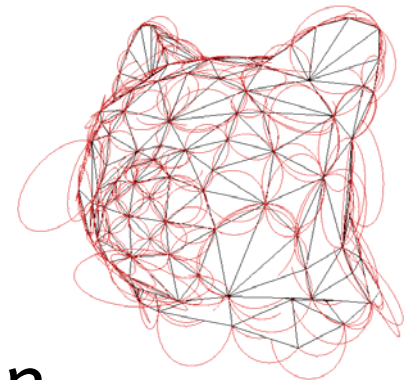
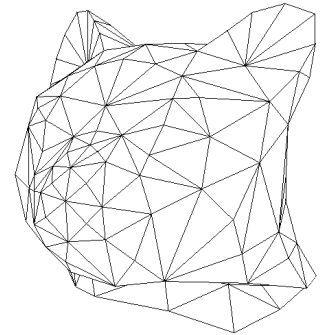
joint work with

Liliya Kharevych, Boris Springborn, Alexander Bobenko

IN THIS SECTION

Circles as basic primitive

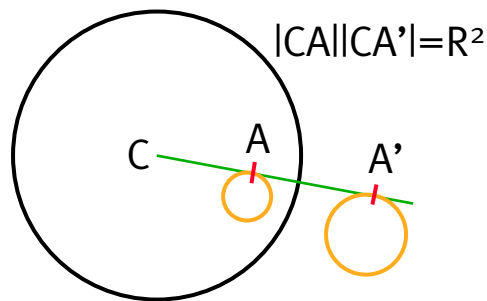
- it's all about the underlying geometry!
 - Euclidean: triangles
 - conformal: circles
- two examples
 - conformal parameterization
 - discrete curvature energies



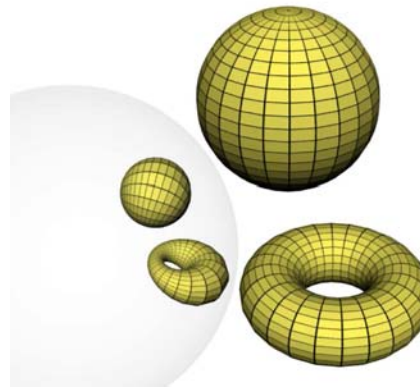
GEOMETRIES

The Erlangen program (1872)

- geometry through symmetries
 - affine, perspective
 - conformal



Möbius xform

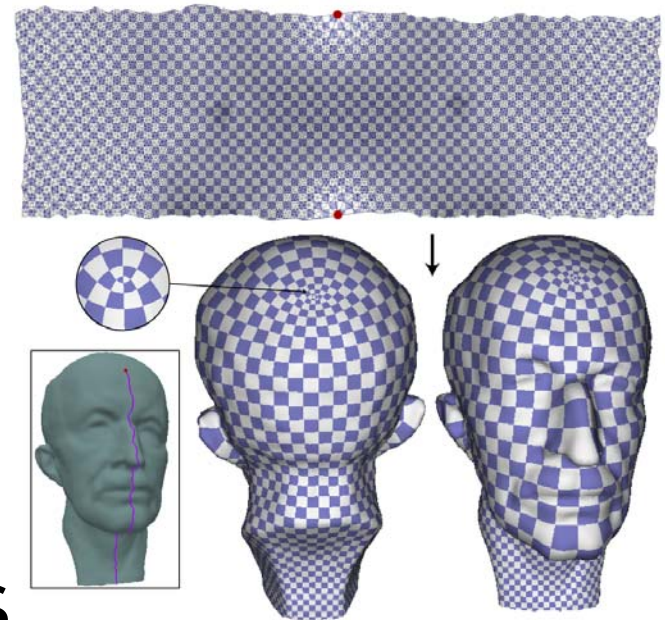


Library of Congress

CONFORMAL MAPPINGS

Piecewise Linear Surfaces

- map to domain
- discrete conformal
- preserve angles
 - as well as possible
- circles as primitives



PARAMATERIZATIONS

An old problem...

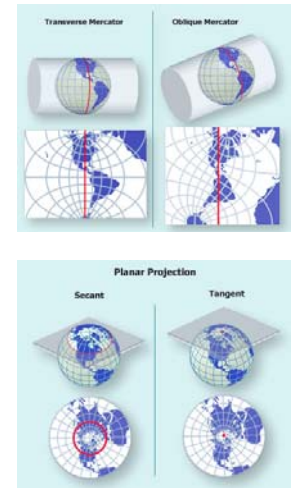
- can't have it all
 - keep angles
 - keep areas

Our setup

- find discrete conformal map from triangle mesh to Euclidean domain



Mercator (1512-1594);
Frontispiece of *Atlas Sive
Cosmographicae* (1585-1595)

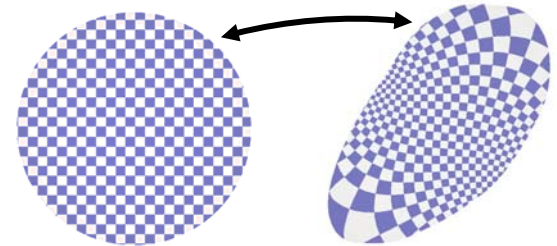


USGS Map Projections Site

CONFORMAL MAPS

Mathematical basis

- Riemann mapping theorem
- unique (up to Möbius xforms)



$$f : \Omega_1 \subset \mathbb{C} \rightarrow \Omega_2 \subset \mathbb{C}$$

$$i \frac{\partial f}{\partial x} = \frac{\partial f}{\partial y}$$

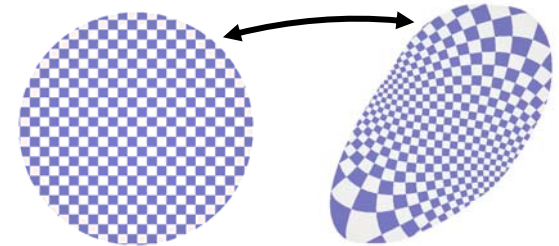
$$f_x \perp f_y \quad |f_x| = |f_y|$$

CONFORMAL MAPS

Mathematical basis

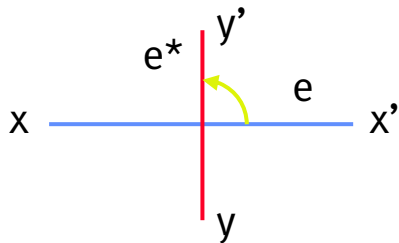
- Riemann mapping theorem

- unique (up to Möbius xforms)



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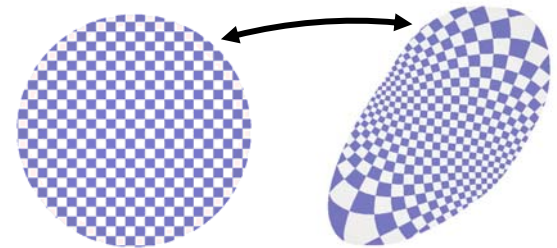
$$\frac{f(y') - f(y)}{l(y, y')} = i \frac{f(x') - f(x)}{l(x, x')}$$

CONFORMAL MAPS

Mathematical basis

- Riemann mapping theorem

- unique (up to Möbius xforms)



$$f : \Omega_1 \subset \mathbb{C} \rightarrow \Omega_2 \subset \mathbb{C}$$

$$i \frac{\partial f}{\partial x} = \frac{\partial f}{\partial y}$$

$$0 = \sum_{e_{ij}} (\cot \alpha_{ij} + \cot \alpha_{ji}) (v_i - v_j)$$

Intrinsic
angles in
original mesh

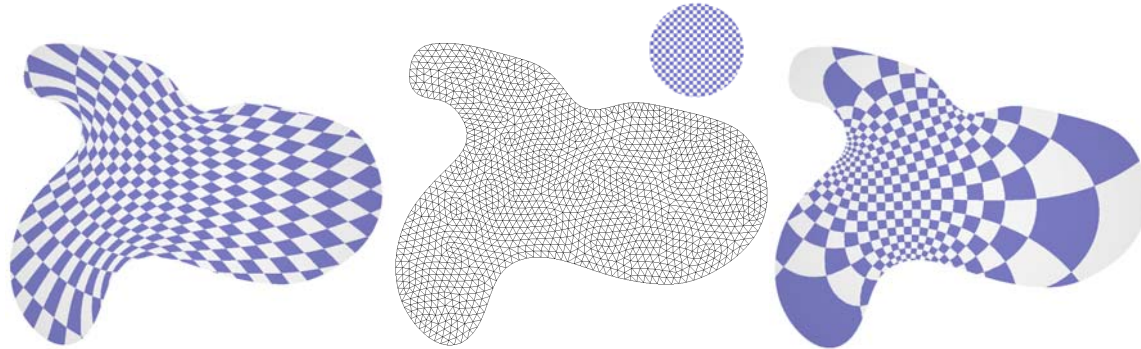
Texture coordinates

SOUNDS GREAT!

You knew there was a catch...

- Laplace problem

- Dirichlet or Neumann bndry. cond.

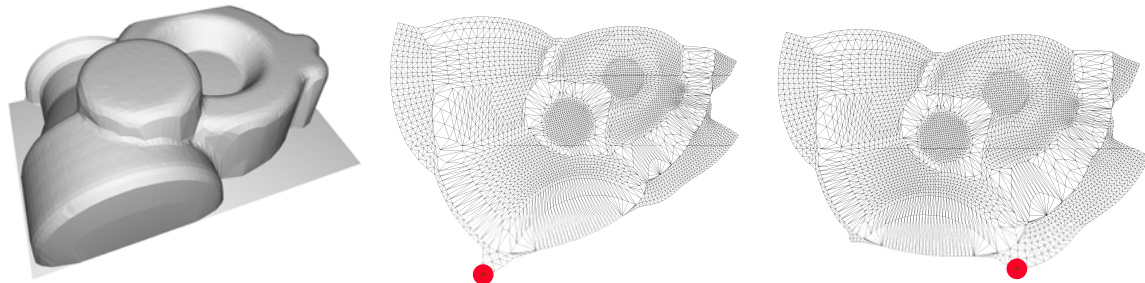


$$\Delta u = 0$$
$$u|_{\partial\Omega} = u_0$$

SOUNDS GREAT!

You knew there was a catch...

- Laplace problem
 - Dirichlet or Neumann bndry. cond.



- too much control or too little...

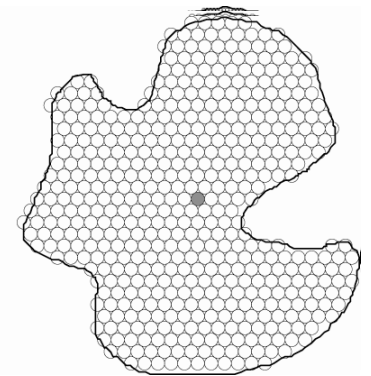
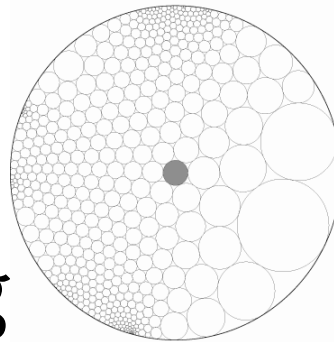
AN OLD IDEA

Riemann mapping theorem

- conformal maps map infinitesimal circles to infinitesimal circles

Thurston (85)

- finite circles
- circle packing



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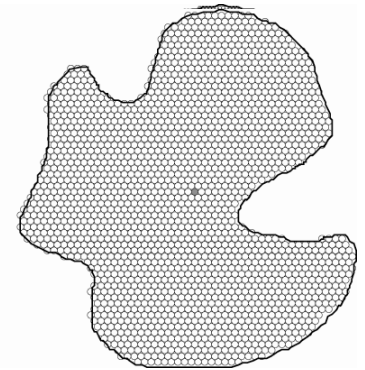
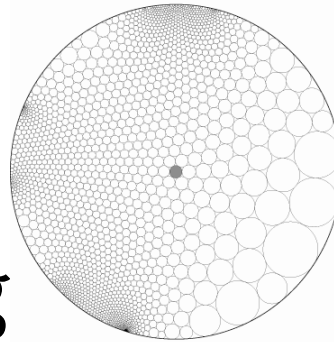
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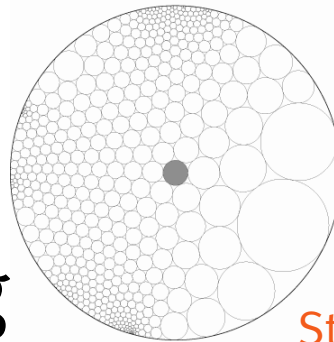
AN OLD IDEA

Riemann mapping theorem

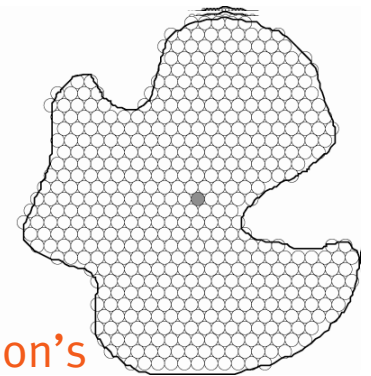
- conformal maps map infinitesimal circles to infinitesimal circles

Thurston (85)

- finite circles
- circle packing



Stephenson's
CirclePack



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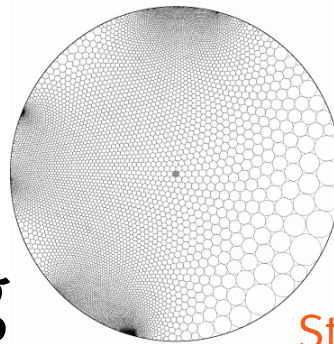
AN OLD IDEA

Riemann mapping theorem

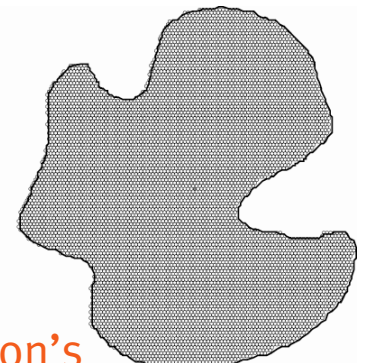
- conformal maps map infinitesimal circles to infinitesimal circles

Thurston (85)

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Stephenson's
CirclePack



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HISTORY

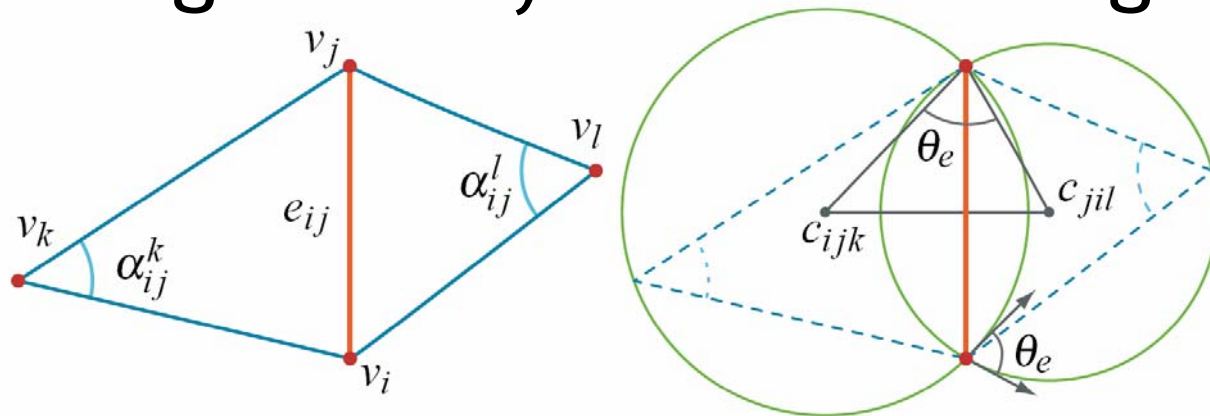
Theory

- early: Koebe 36; Andreev 70
- modern: Rudin & Sullivan 87 (hex packing); He & Schramm 98 (C^∞ convgce.)
- variational approaches 91-02
 - de Verdière, Brägger, Rivin, Leibon, Bobenko & Springborn

BASIC SETUP

Given a mesh

- local geometry around an edge



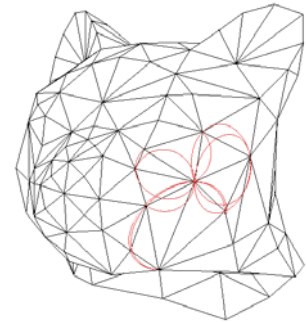
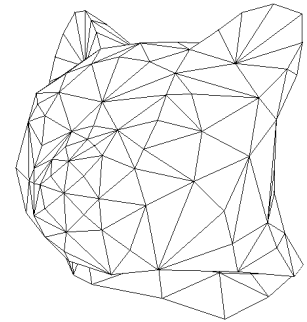
$$\forall e_{ij} \in E : \theta_e = \begin{cases} \pi - \alpha_{ij}^k - \alpha_{ij}^l \\ \pi - \alpha_{ij}^k \end{cases}$$

CIRCLE PATTERN PROBLEM

Rivin 94, Bobenko & Springborn 04

- given a triangulation K
- an angle assignment

$$\forall e_{ij} \in E : 0 < \theta_e < \pi$$



CIRCLE PATTERN PROBLEM

Rivin 94, Bobenko & Springborn 04

■ given a triangulation K

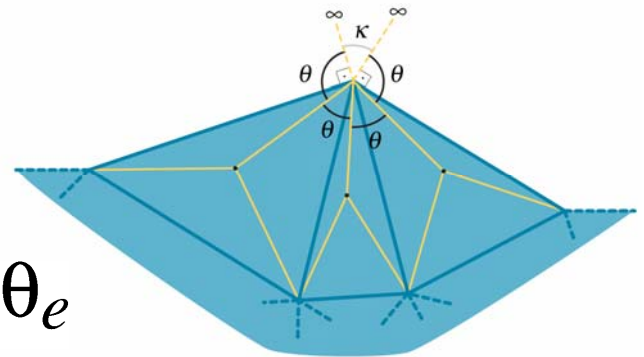
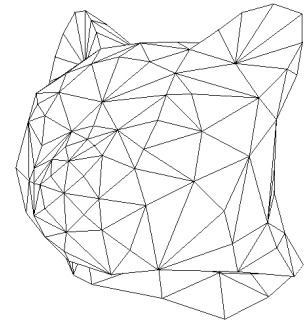
■ an angle assignment

$$\forall e_{ij} \in E : 0 < \theta_e < \pi$$

■ sum conditions

$$\forall v_i \in V_{\text{int}} : \sum_{e \ni v_i} \theta_e = 2\pi$$

$$\forall v_i \in V_{\text{bdy}} : \kappa_i = 2\pi - \sum_{e \ni v_i} \theta_e$$



CIRCLE PATTERN PROBLEM

Uniquely realizable iff

- a coherent angle system exists

$$\hat{\alpha}_{ij}^k > 0 \quad \forall t_{ijk} \in T : \hat{\alpha}_{ij}^k + \hat{\alpha}_{jk}^i + \hat{\alpha}_{ki}^j = \pi,$$

$$\forall e_{ij} \in E : \theta_e = \begin{cases} \pi - \hat{\alpha}_{ij}^k - \hat{\alpha}_{ij}^l \\ \pi - \hat{\alpha}_{ij}^k \end{cases}$$

- linear feasibility problem

GEOMETRY AT AN EDGE

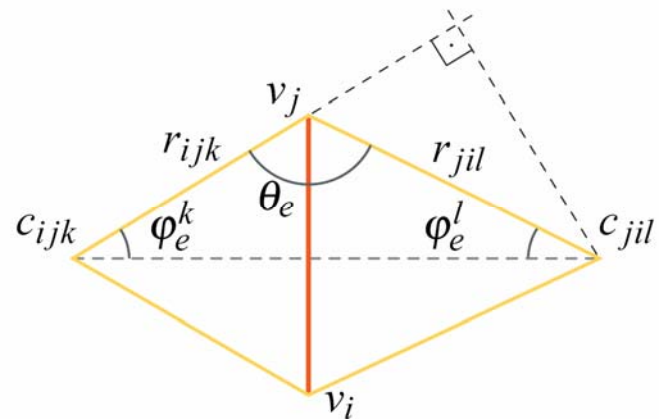
Relationship between variables

■ angle and radii

$$\varphi_e^k = \begin{cases} f_e(x) = \tan^{-1} \frac{\sin \theta_e}{e^x - \cos \theta_e} & e \in E_{\text{int}} \\ \pi - \theta_e & e \in E_{\text{bdy}} \end{cases}$$

$x = \log r_{ijk} - \log r_{jil}$

$$\forall t \in T : 2\pi = \sum_{e \in t} 2\varphi_e^t$$



ENERGY

Solution is unique minimum!

■ **convex energy** in $\rho_{ijk} = \log r_{ijk}$

$$\begin{aligned} S(\rho) = & \sum_{e \in E_{\text{int}}} \left(\text{ImLi}(e^{\rho_k - \rho_l + i\theta_e}) + \text{ImLi}(e^{\rho_l - \rho_k + i\theta_e}) \right. \\ & \left. - (\pi - \theta_e)(\rho_k + \rho_l) \right) \\ & - \sum_{e \in E_{\text{bdy}}} 2(\pi - \theta_e)\rho_k + 2\pi \sum_{t \in T} \rho_t \end{aligned}$$

■ **easy gradients and Hessians!**

ALGORITHM

Angle assignment

- quadratic program
- boundary curvatures
 - free, prescribed

Minimize energy

Lay out circles

- angles and radii determine layout

$$Q(\hat{\alpha}) = \sum |\hat{\alpha}_{ij}^k - \alpha_{ij}^k|^2$$

$$\forall \hat{\alpha}_{ij}^k : \hat{\alpha}_{ij}^k > 0$$

$$\forall e_{ij} \in E_{\text{int}} : \hat{\alpha}_{ij}^k + \hat{\alpha}_{ij}^l < \pi$$

$$\forall t_{ijk} \in T : \hat{\alpha}_{ij}^k + \hat{\alpha}_{jk}^i + \hat{\alpha}_{ki}^j = \pi$$

$$\forall v_k \in V_{\text{int}} : \sum_{t_{ijk} \ni v_k} \hat{\alpha}_{ij}^k = 2\pi$$

$$\forall v_k \in V_{\text{bdy}} : \sum_{t_{ijk} \ni v_k} \hat{\alpha}_{ij}^k < 2\pi$$

$$\forall v_k \in V_{\text{bdy}} : \sum_{t_{ijk} \ni v_k} \hat{\alpha}_{ij}^k = \pi - \kappa_k$$

RESULTS

Disk boundary

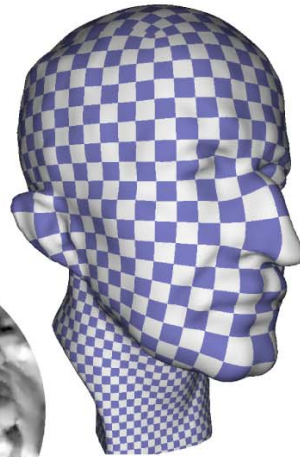


39.6k F

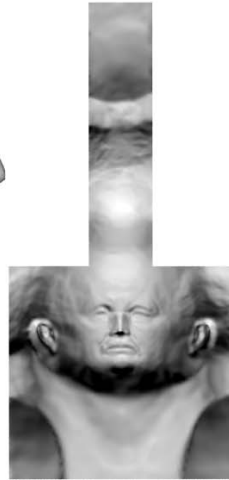


28+8s

Prescribed boundary



37.9k F



26+9s

Free boundary



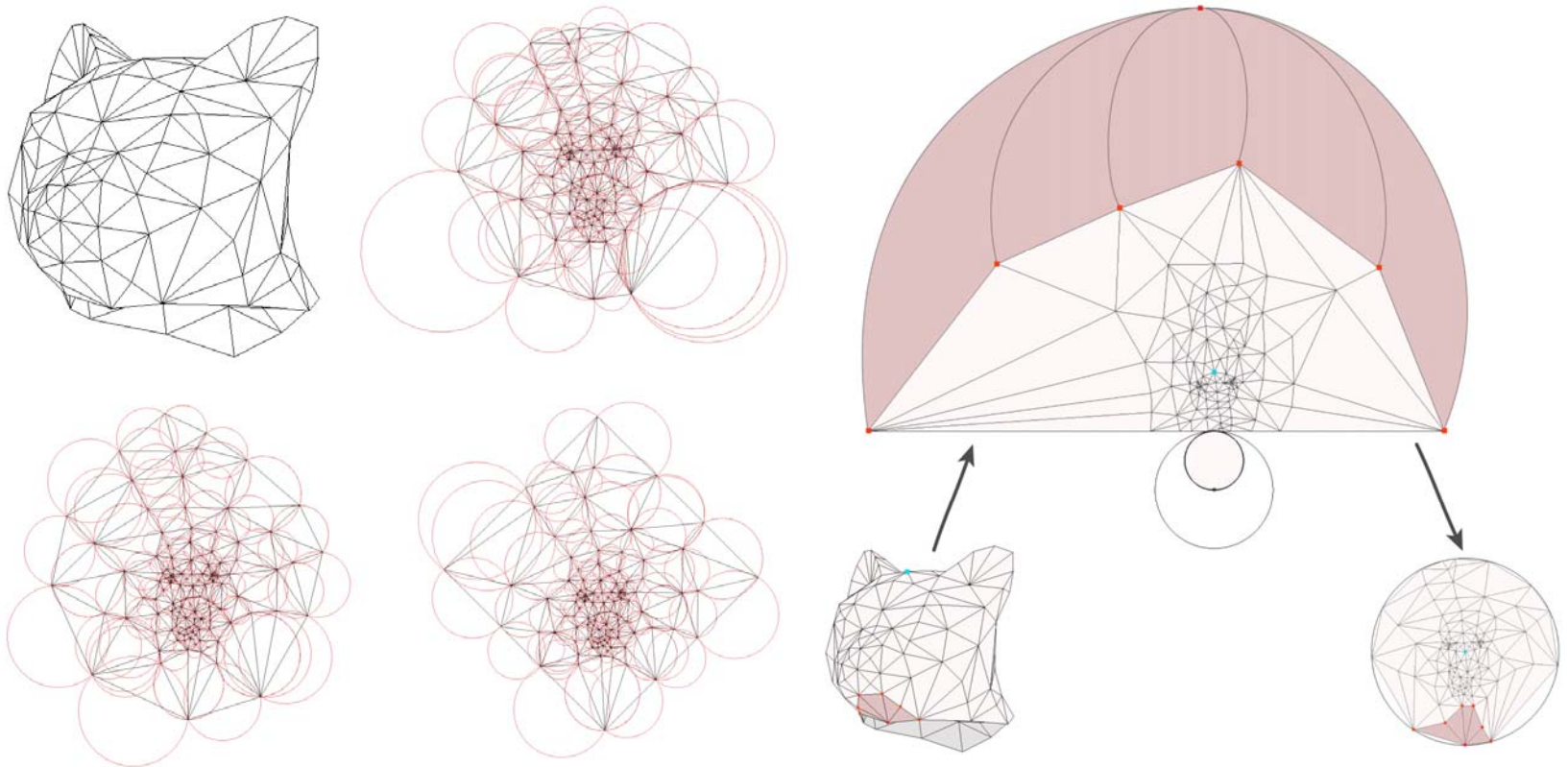
12.6k F



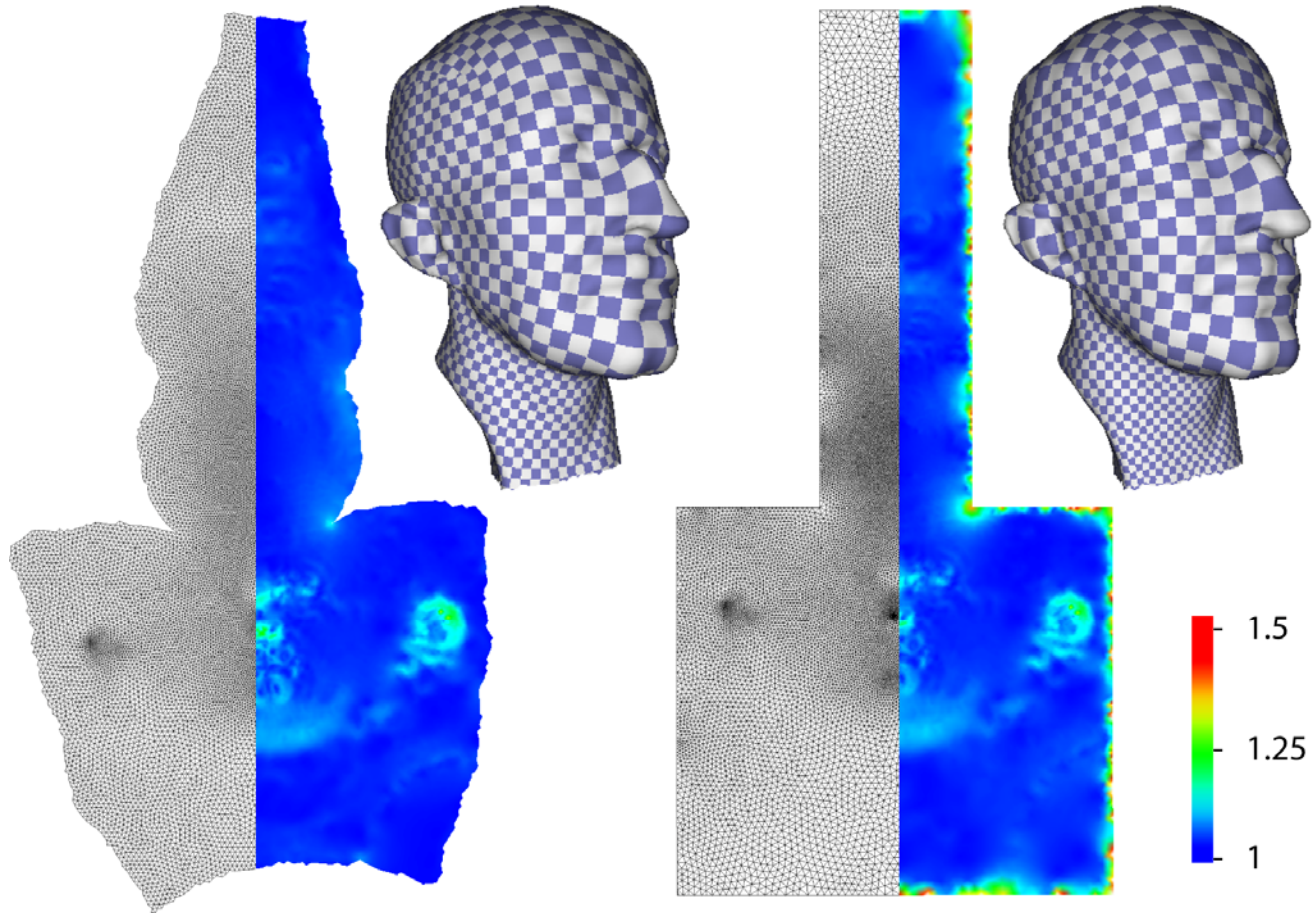
7+2s

BOUNDARY CONTROL

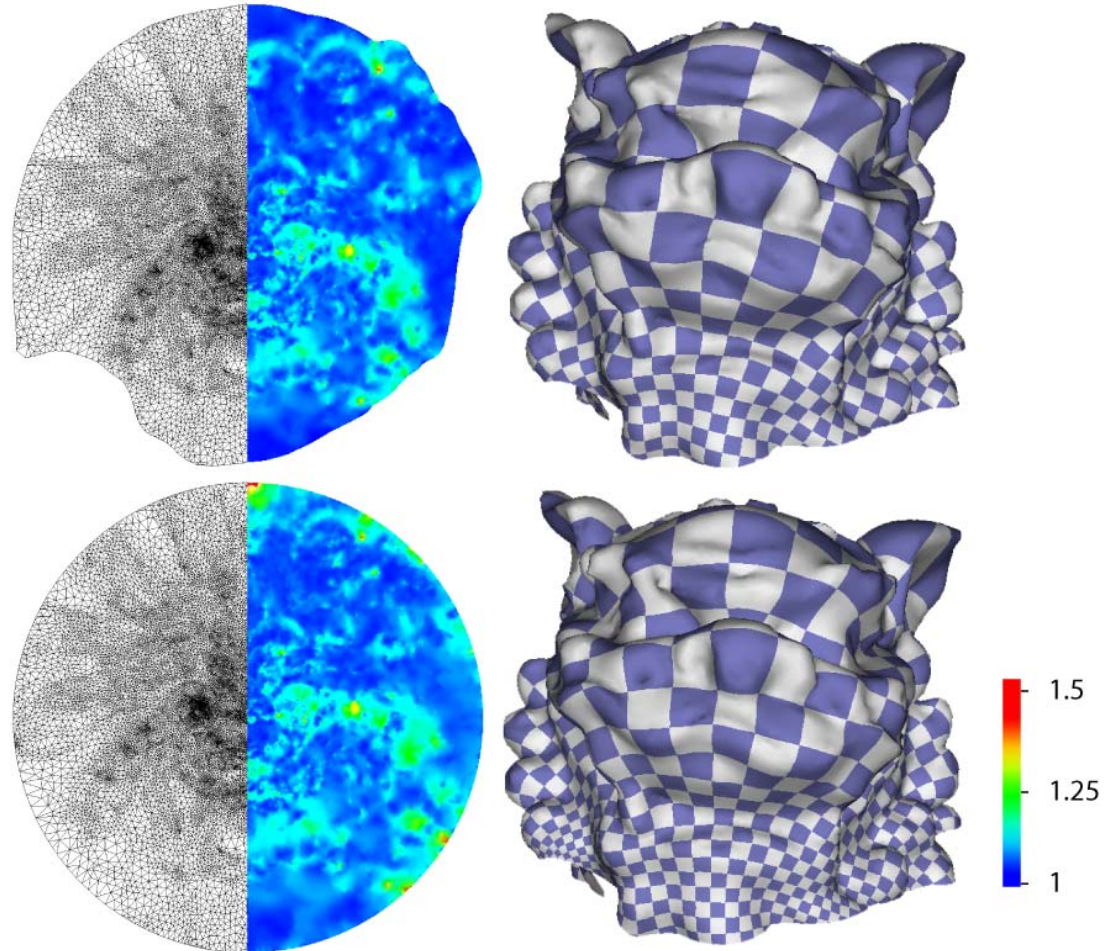
You get to control curvature...



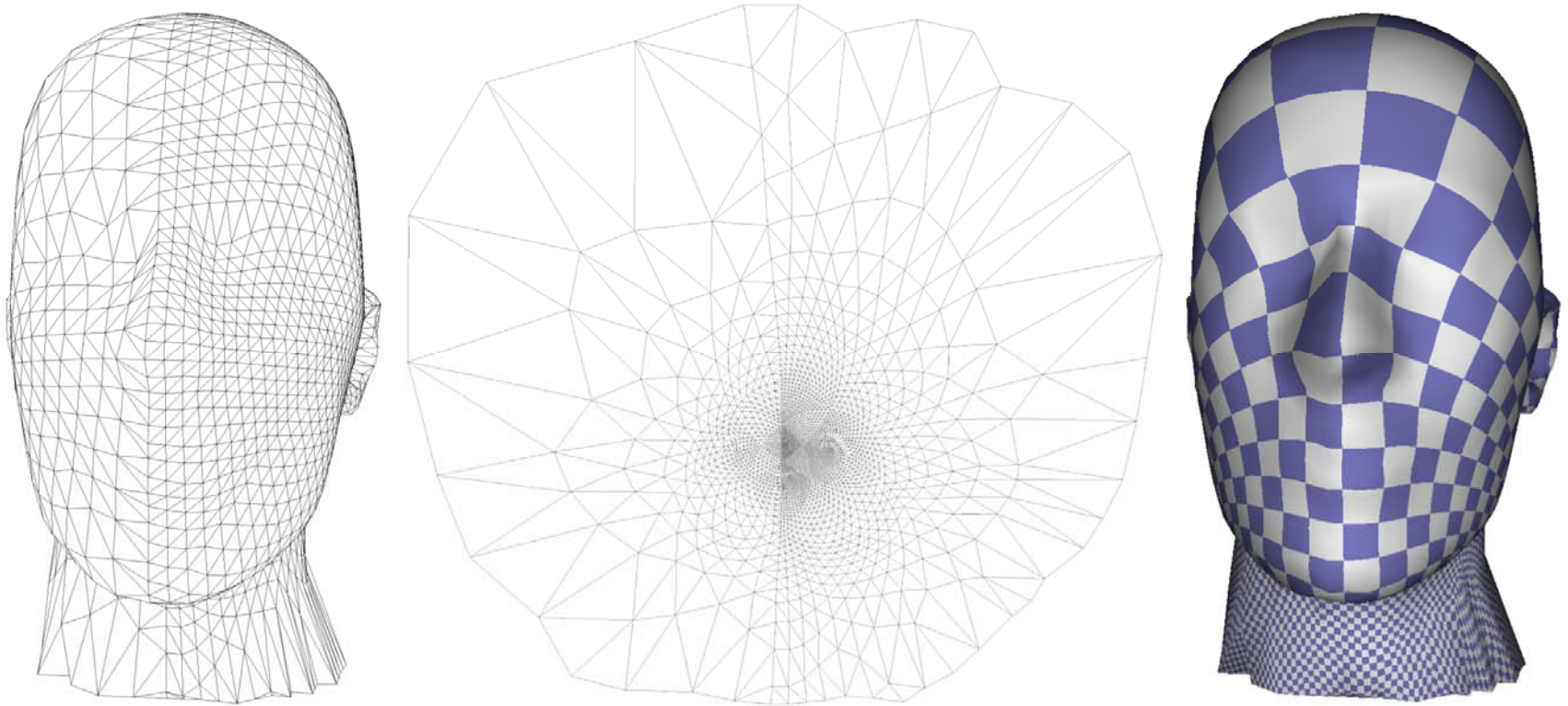
QUASI-CONFORMAL DISTR.



QUASI-CONFORMAL DISTR.



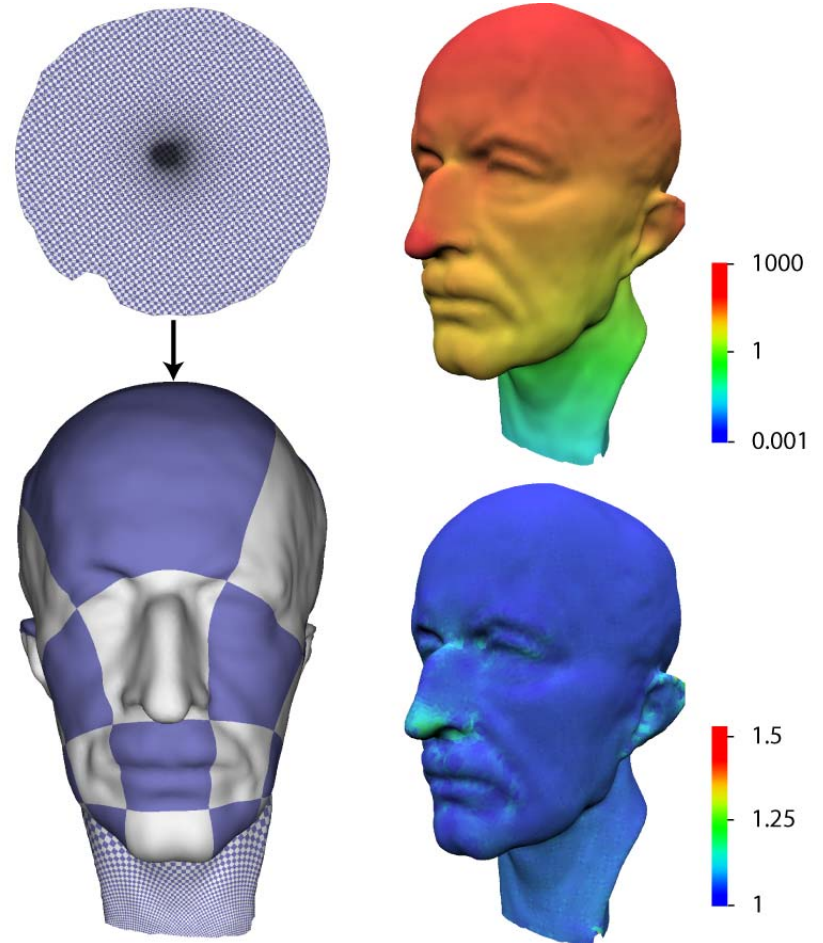
ROBUSTNESS



PROBLEMS

The price to pay

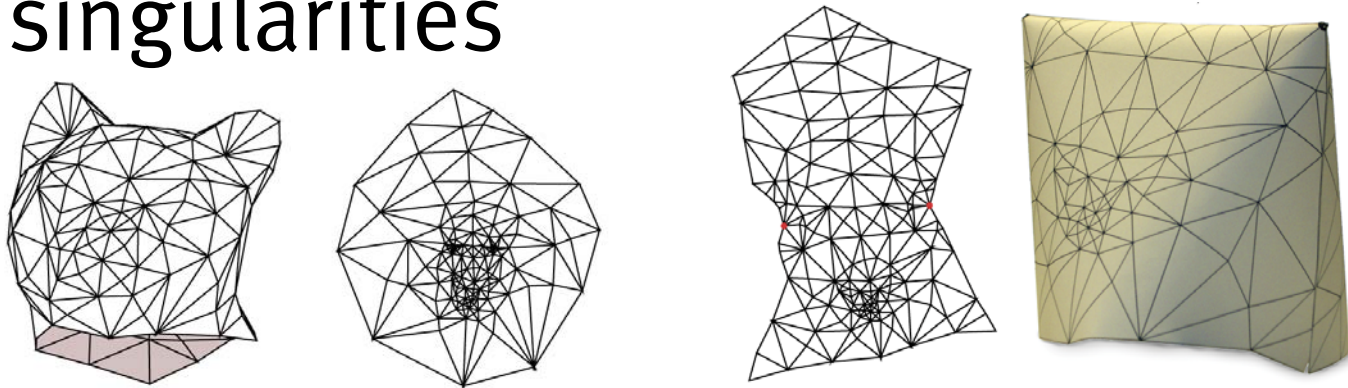
- want angles (nearly) preserved
- must suffer large area distortion



PIECEWISE FLAT

Back to first principles

- what does the mesh give us?
 - everywhere flat with some exceptions
- Euclidean metric with cone singularities



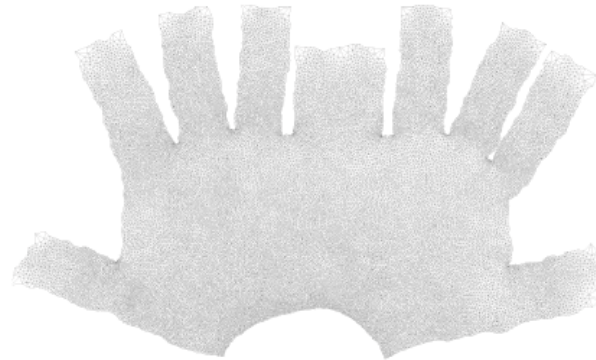
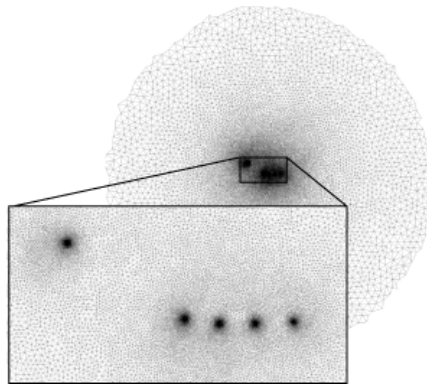
CONE SINGULARITIES

Circle pattern approach

- allows for cone singularities!

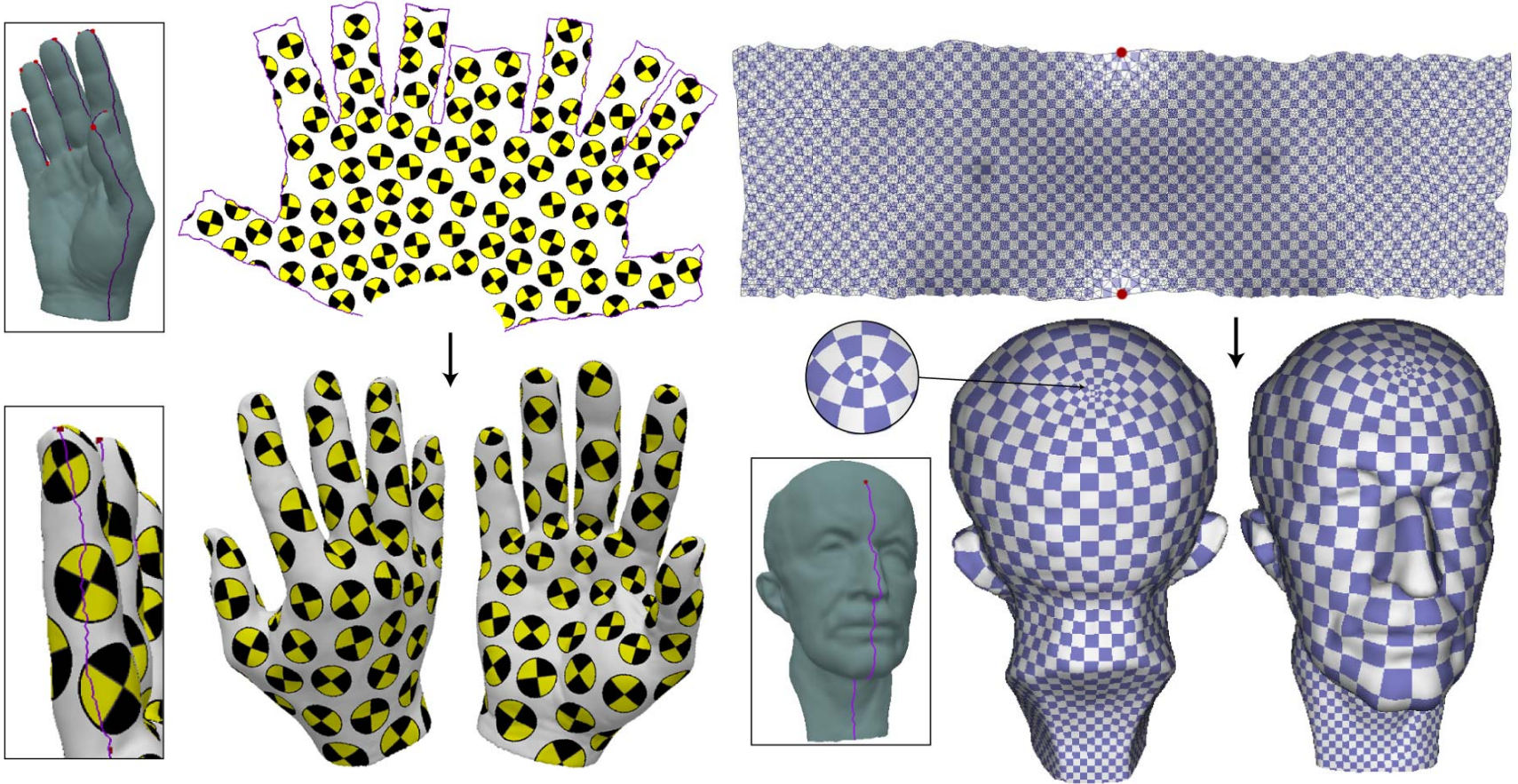
- set cone vertices

$$2\pi \neq \Theta_i = \sum_{e_{ij} \ni v_i} \theta_{ij}$$

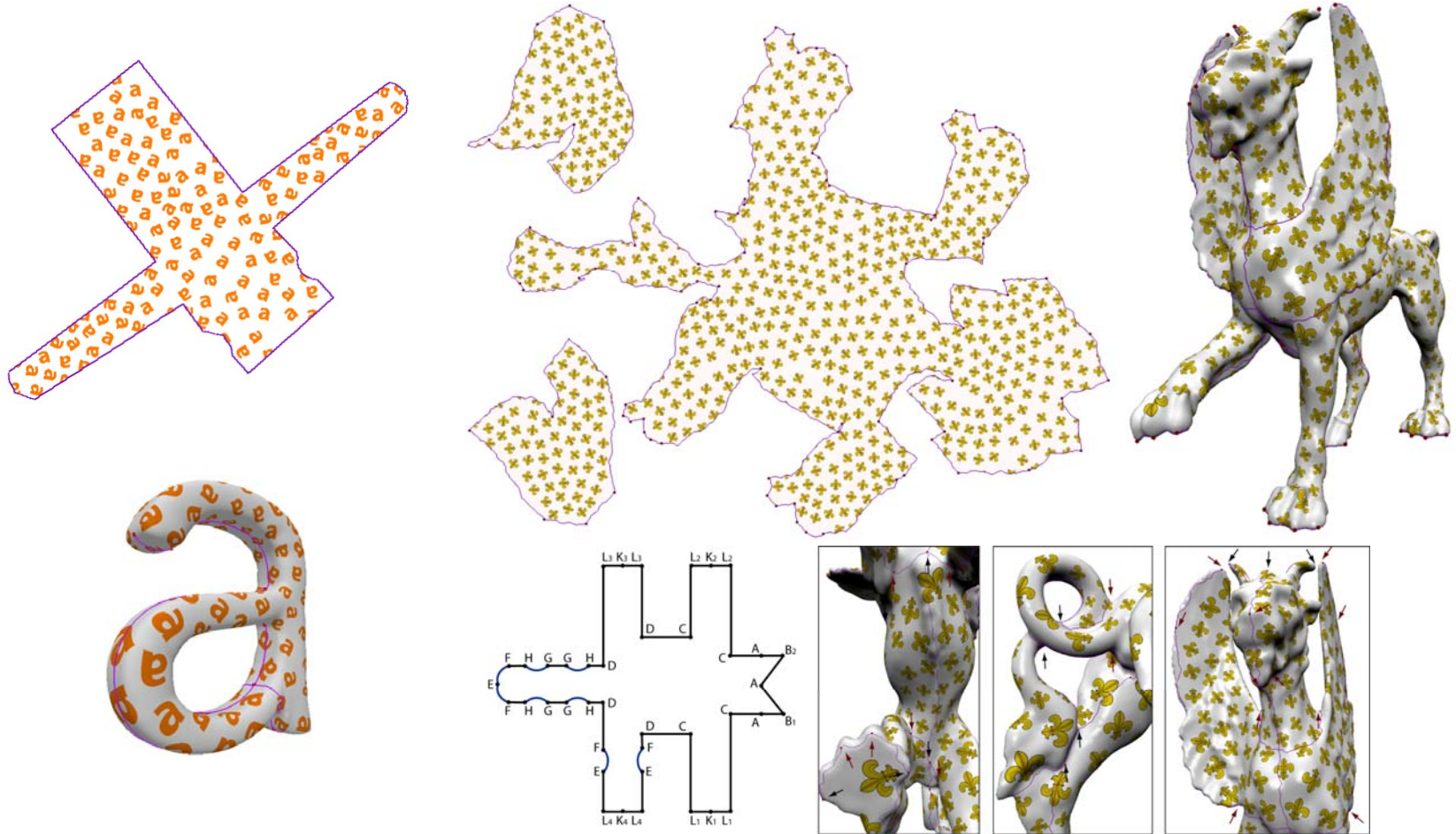


- rest of machinery works as before

EXAMPLES



EXAMPLES



PROPERTIES

Circle patterns with cone sing.

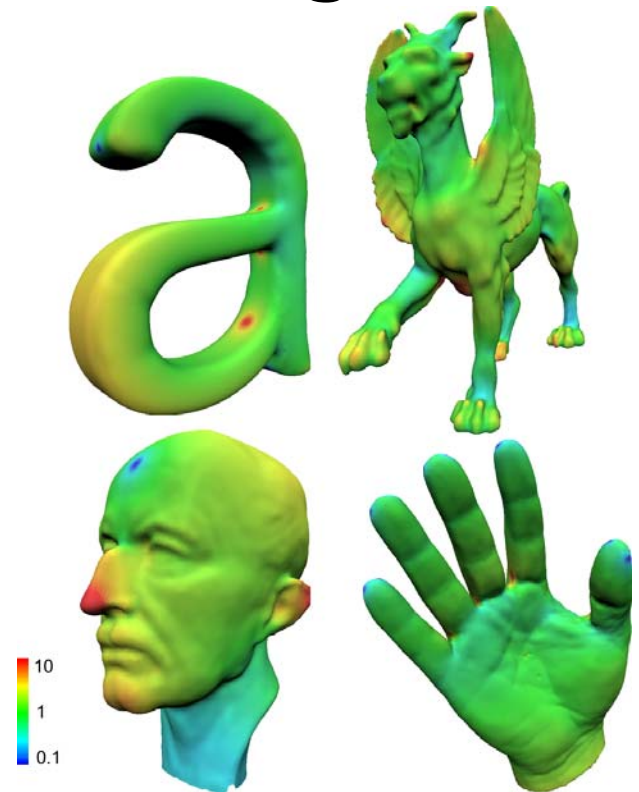
■ discrete conformal



PROPERTIES

Circle patterns with cone sing.

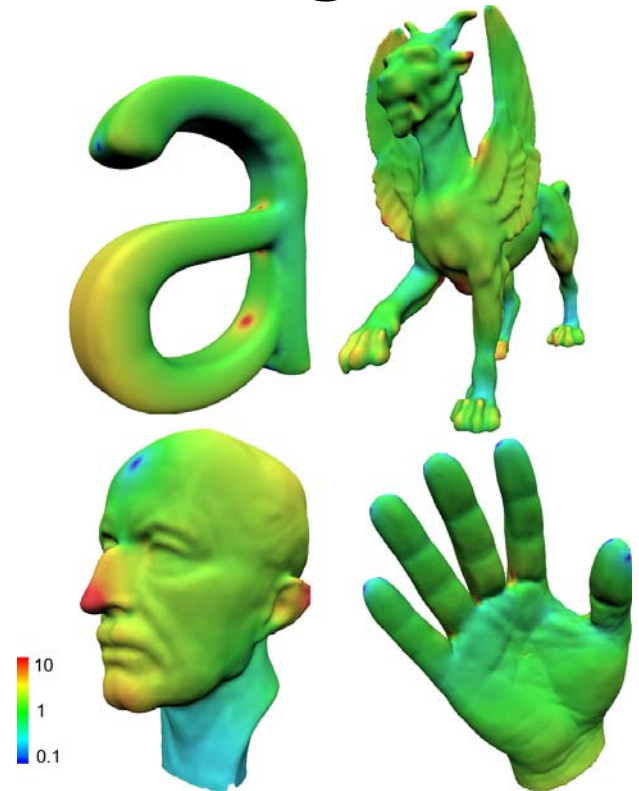
- discrete conformal
- low area distortion



PROPERTIES

Circle patterns with cone sing.

- discrete conformal
- low area distortion
- arbitrary topology
- no cutting a priori!
- globally continuous



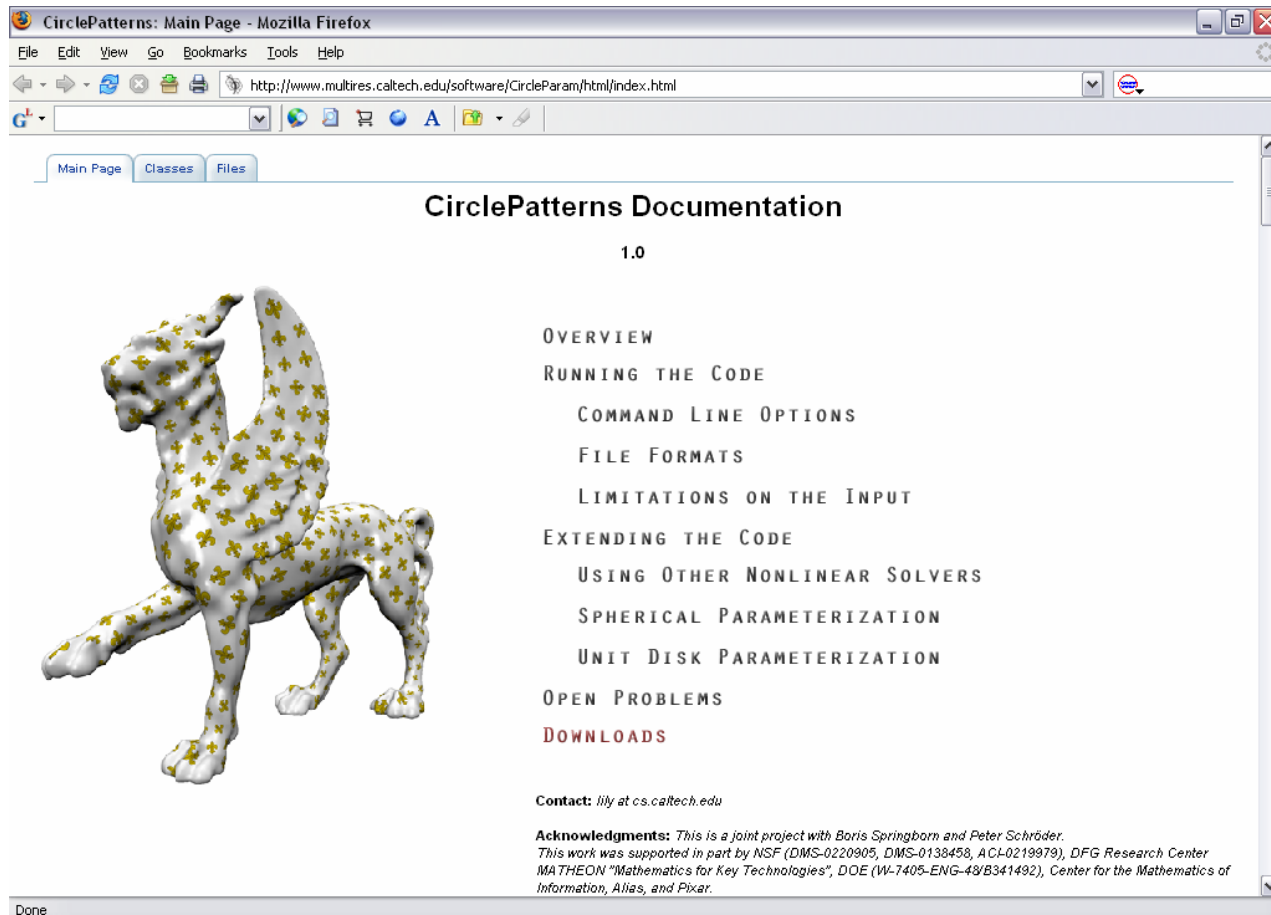
SUMMARY

Discrete conformal mappings

- formulate as circle pattern problem
- solution is min. of convex energy
 - simple gradient and Hessian
- cone singularities
 - no cutting a priori & arbitrary topology

You *can* have both: area & angle!

SOFTWARE



MORE FUN WITH CIRCLES

Willmore energy of a surface

vanishes iff
surface is
sphere

$$E_W(S) = \int_S ((H/2)^2 - K) dA$$

$$\int_S (\kappa_1 - \kappa_2)^2 dA$$

MORE FUN WITH CIRCLES

Willmore energy of a surface

$$E_W(S) = \int_S ((H/2)^2 - K) dA$$

$$\int_S (\kappa_1 - \kappa_2)^2 dA$$

- of interest: minimizers
- theory of surfaces

Conformal Geometry

MORE FUN WITH CIRCLES

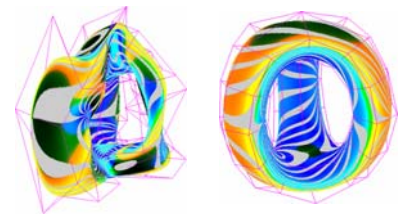
Willmore energy of a surface

$$E_W(S) = \int_S ((H/2)^2 - K) dA$$

$$\int_S \kappa_1^2 + \kappa_2^2 dA$$

- of interest: minimizers
 - theory of surfaces
 - geometric modeling

Conformal Geometry



MORE FUN WITH CIRCLES

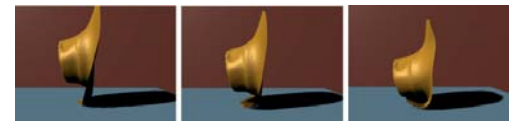
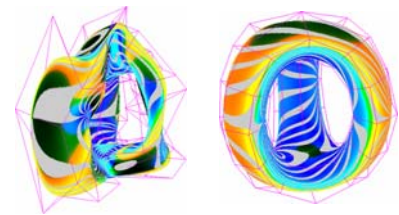
Willmore energy of a surface

$$E_W(S) = \int_S ((H/2)^2 - K) dA$$

$$\int_S \alpha + \beta (H - H_0)^2 dA$$

- of interest: minimizers
 - theory of surfaces
 - geometric modeling
 - physical modeling

Conformal Geometry



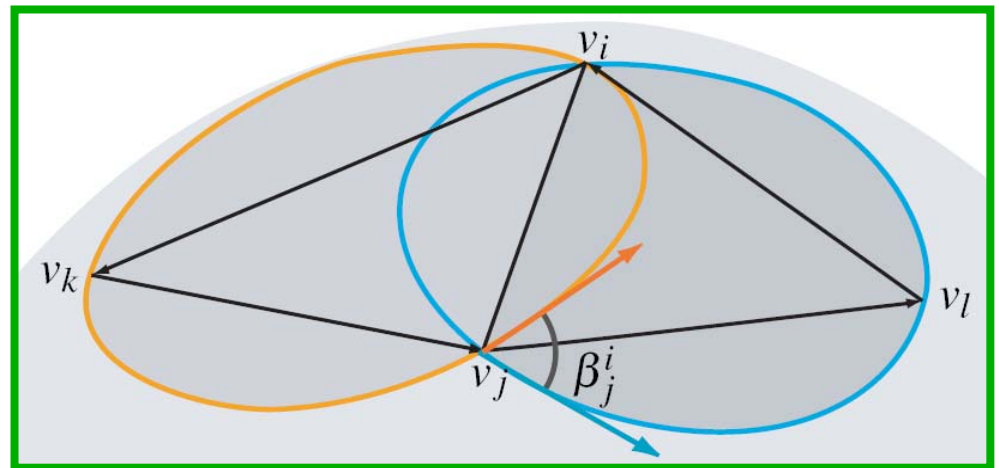
DISC. WILLMORE ENERGY

Definition [Bo5]

- object of conformal geometry...
- ...use circles and angles

$$W_i = \sum_{e_{ij}} \beta_j^i - 2\pi$$

at each vertex



PROPERTIES

Discrete Willmore energy

- vanishes iff spherical and convex

$$\Sigma_j \beta_j \geq 2\pi$$

$$W_i + K_i \geq 0$$

$$H^2 dA \geq 0$$

$$\Sigma_j \beta_j - 2\pi$$

$$2\pi - \Sigma_j \alpha_j$$

PROPERTIES

Discrete Willmore energy

- vanishes iff spherical and convex

$$\sum_j \beta_j \geq 2\pi$$

$$W_i + K_i \geq 0$$

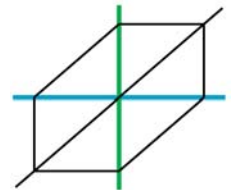
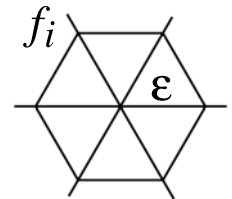
$$H^2 dA \geq 0$$

- smooth limit

$$\lim_{\varepsilon \rightarrow 0} \frac{W(D_\varepsilon)}{\mathcal{W}(D_\varepsilon)} = 1$$

← discrete

← continuous



PROPERTIES

Discrete Willmore energy

- vanishes iff spherical and convex

$$\sum_j \beta_j \geq 2\pi$$

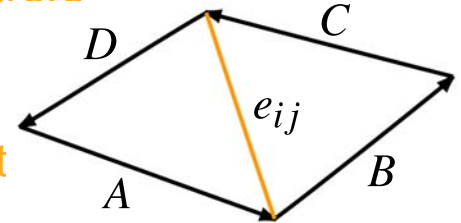
$$W_i + K_i \geq 0$$

$$H^2 dA \geq 0$$

- smooth limit

$$\lim_{\varepsilon \rightarrow 0} \frac{W(D_\varepsilon)}{\mathcal{W}(D_\varepsilon)} = 1$$

← discrete
← cont



- evaluation

$$\cos \beta_j^i = \langle A, C \rangle \langle B, D \rangle - \langle A, B \rangle \langle C, D \rangle - \langle B, C \rangle \langle D, A \rangle$$

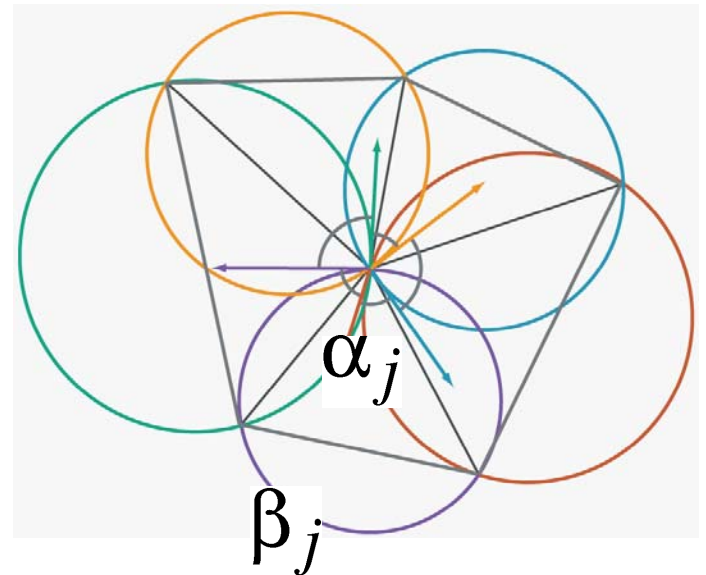
PROPERTIES I

Discrete Willmore energy

■ vanishes iff co-spherical & convex

$$\sum_j \beta_j \geq 2\pi$$

$$\sum_j \alpha_j \leq \sum_j \beta_j$$



PROPERTIES I

Discrete Willmore energy

■ vanishes iff co-spherical & convex

$$\sum_j \beta_j \geq 2\pi$$

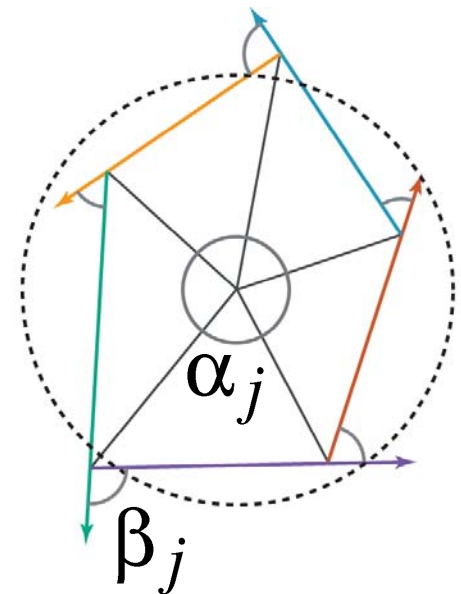
$$\sum_j \alpha_j \leq \sum_j \beta_j$$

$$\sum_j \beta_j - 2\pi$$

$$2\pi - \sum_j \alpha_j$$

$$W_i + K_i \geq 0$$

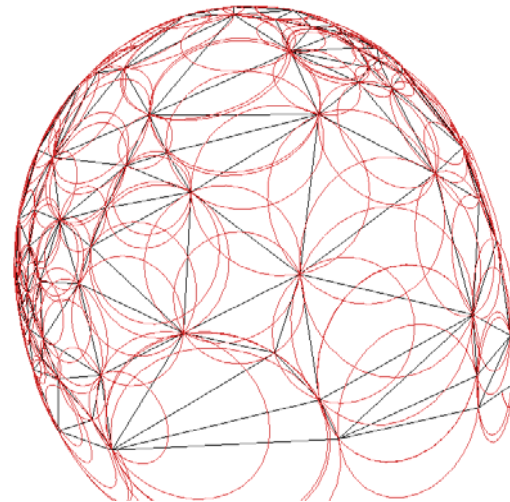
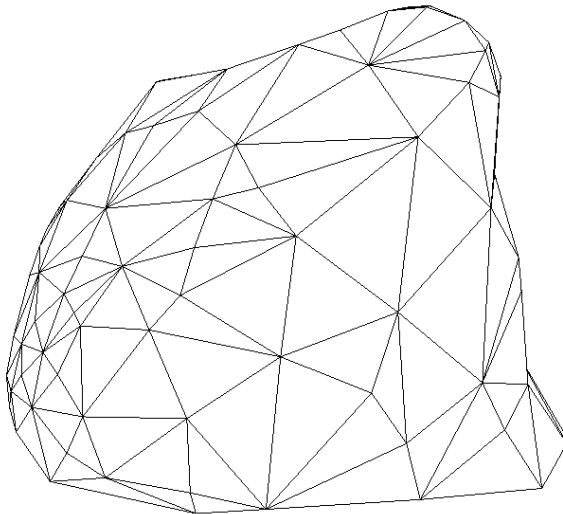
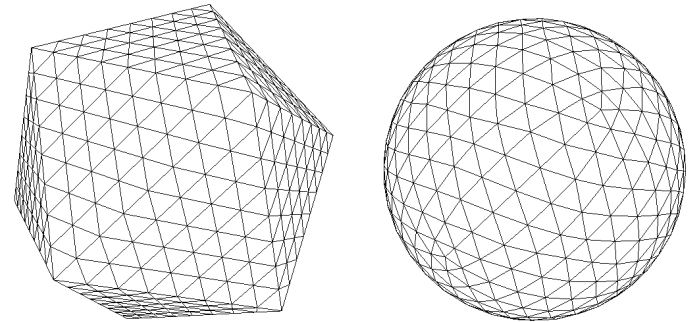
$$H^2 dA \geq 0$$



RESULTS I

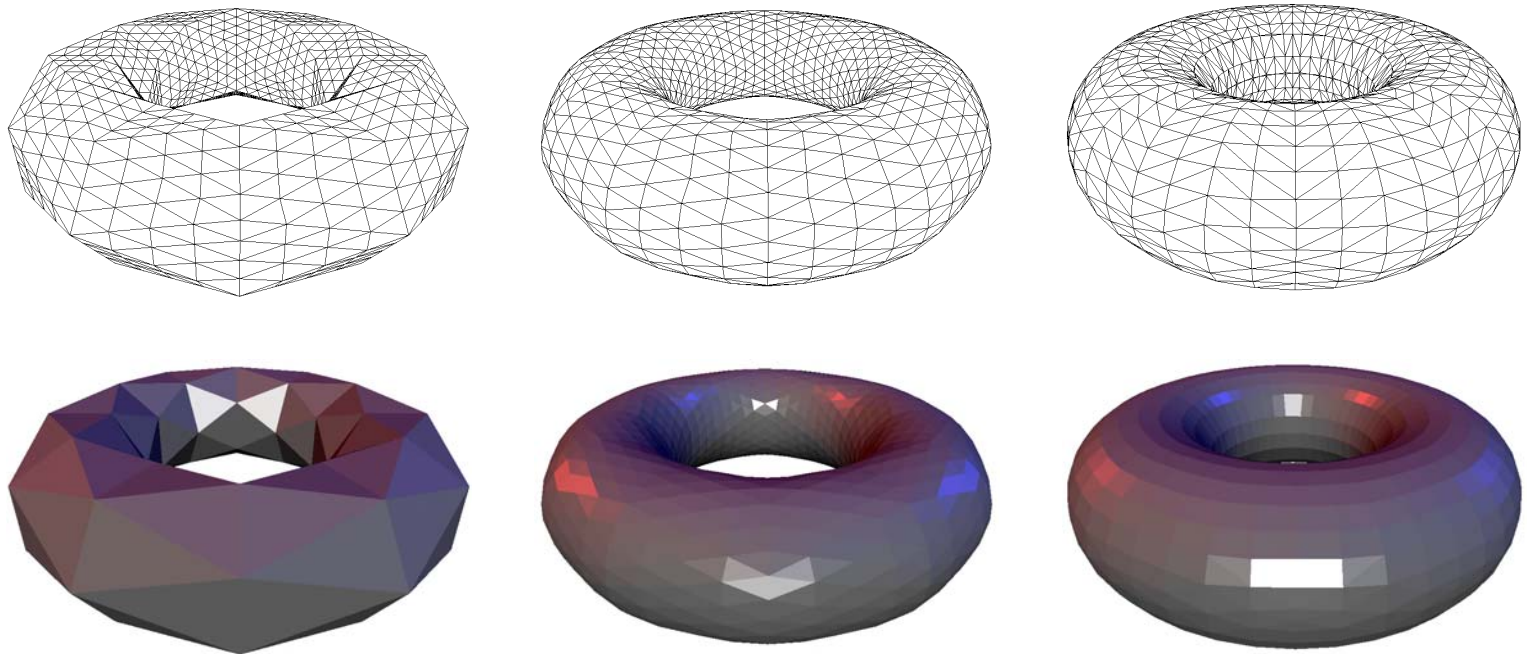
Simple tests

- sphere
- boundaries



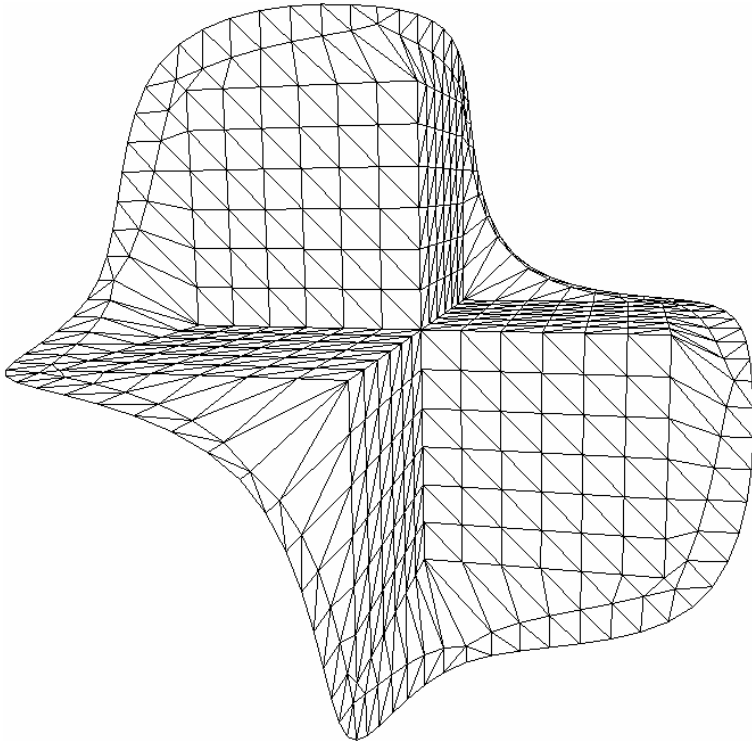
RESULTS II

Curvature alignment



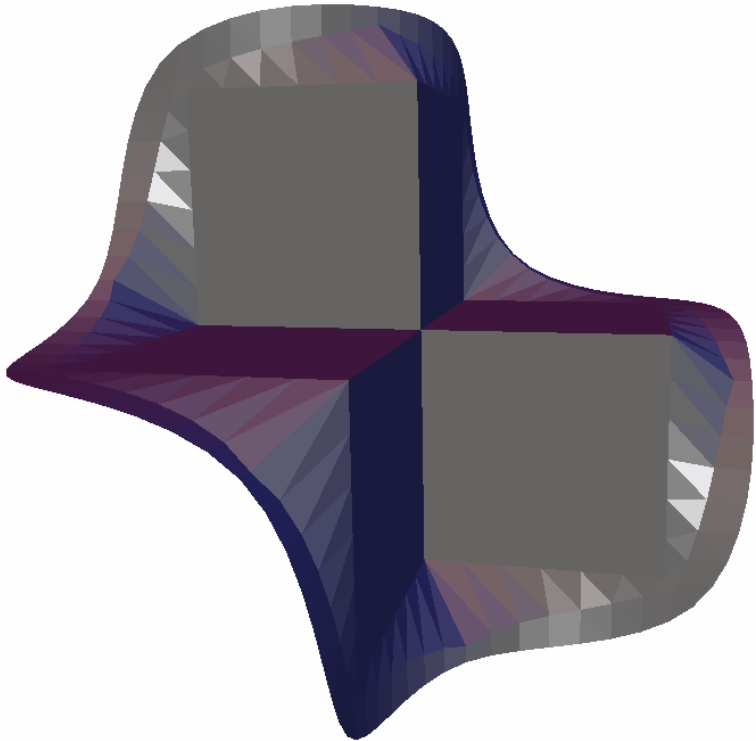
RESULTS III

Hole filling



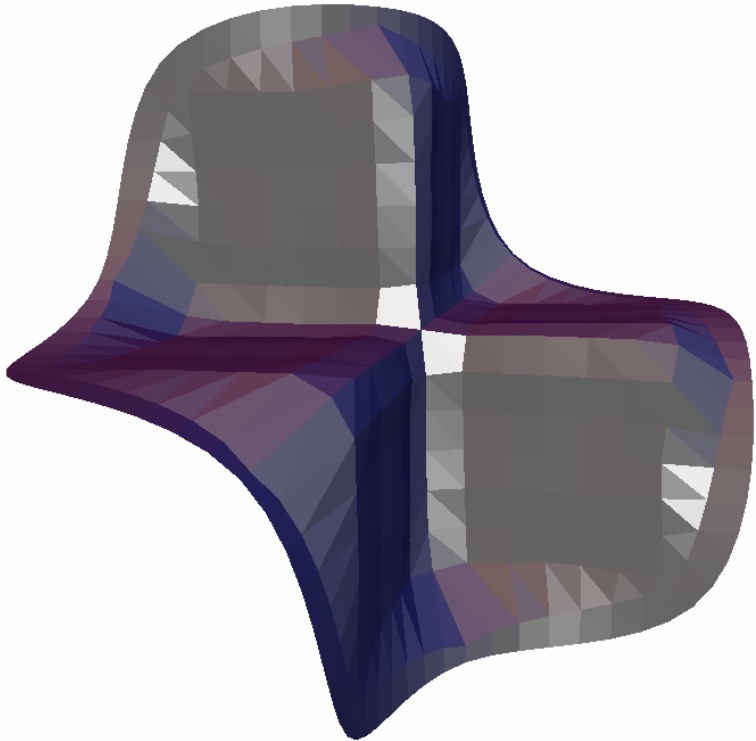
RESULTS III

Hole filling



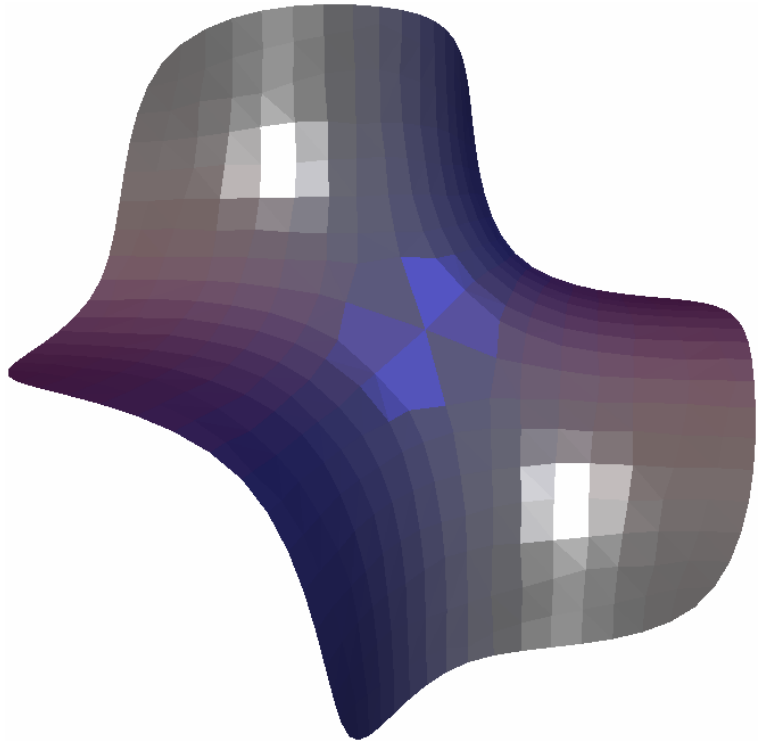
RESULTS III

Hole filling



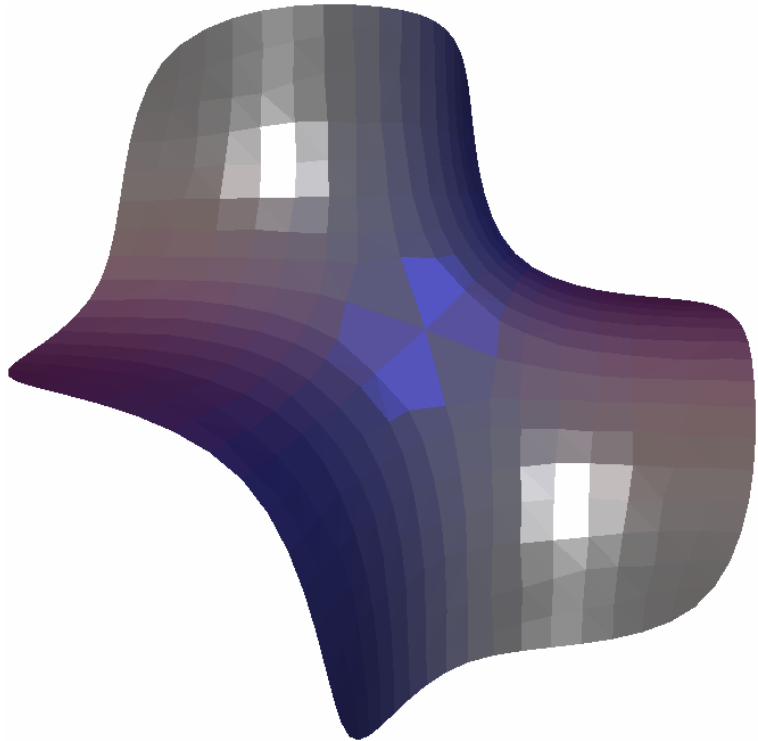
RESULTS III

Hole filling



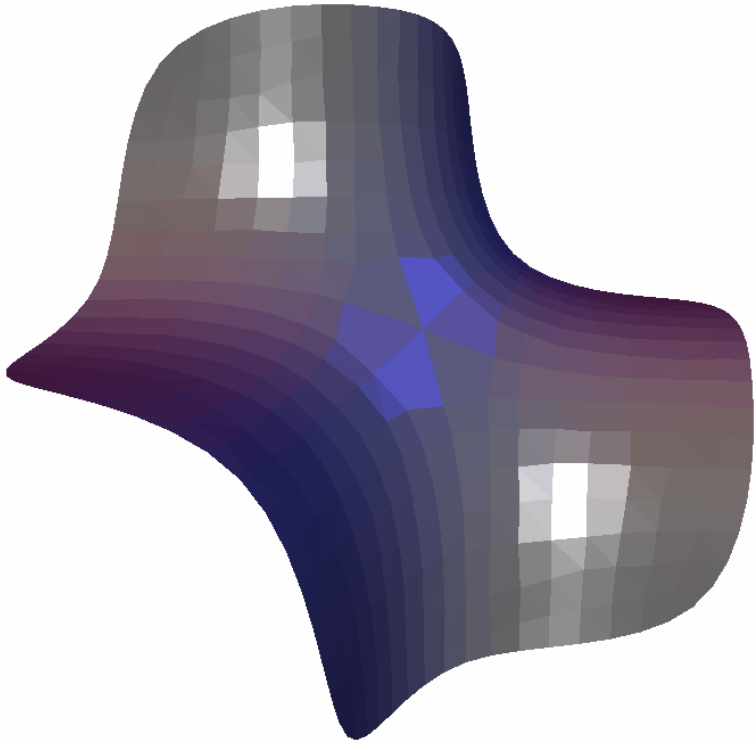
RESULTS III

Hole filling



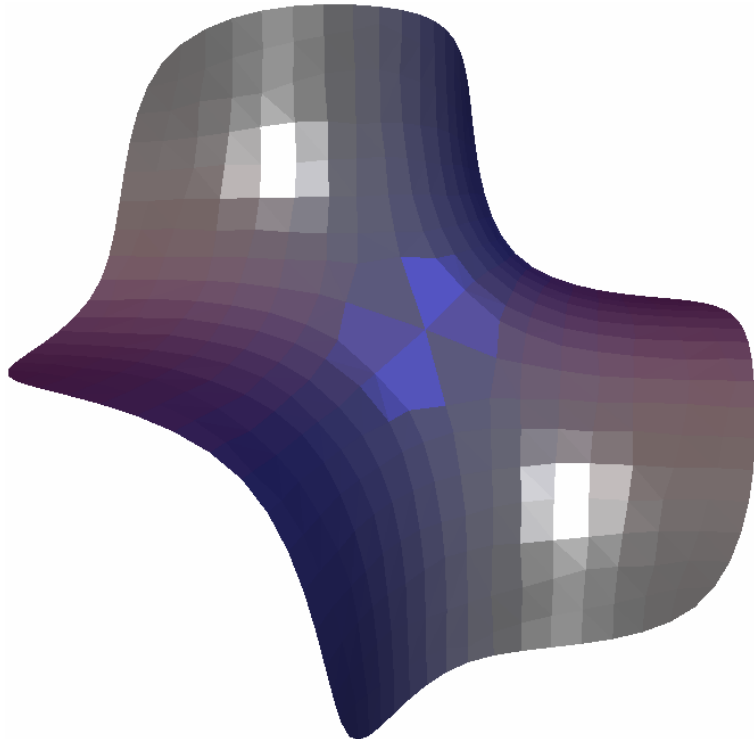
RESULTS III

Hole filling

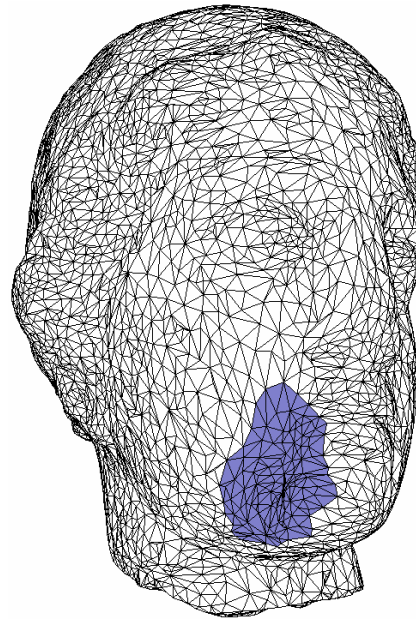


RESULTS III

Hole filling

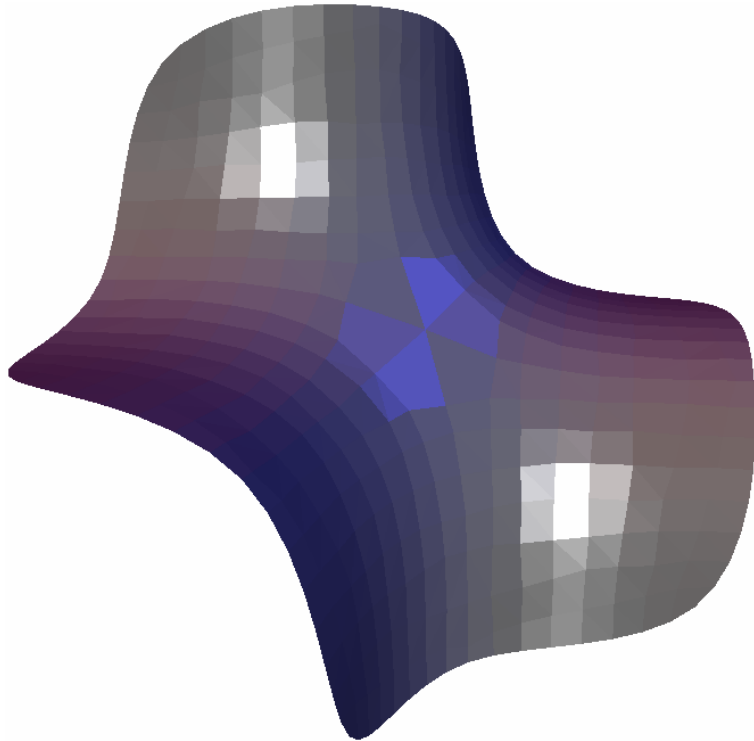


Inpainting

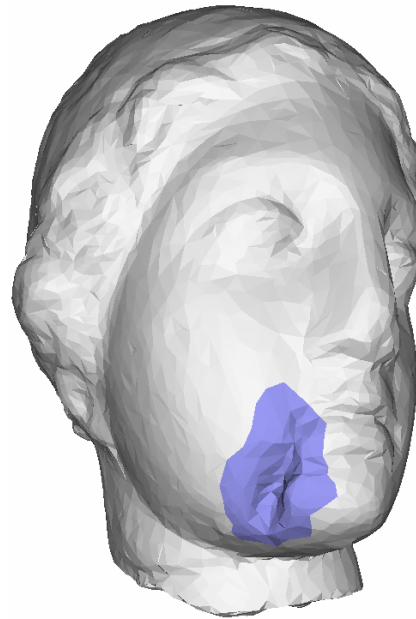


RESULTS III

Hole filling

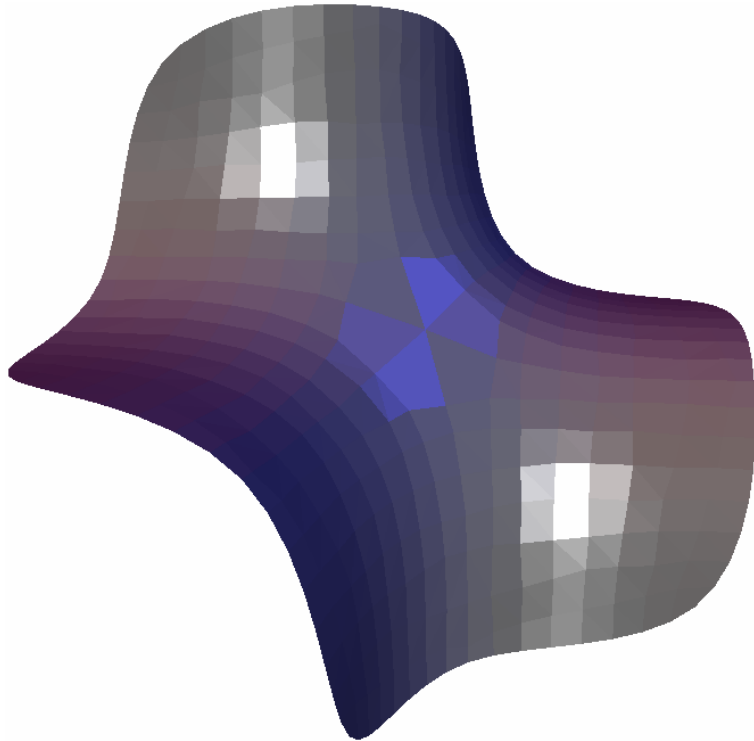


Inpainting

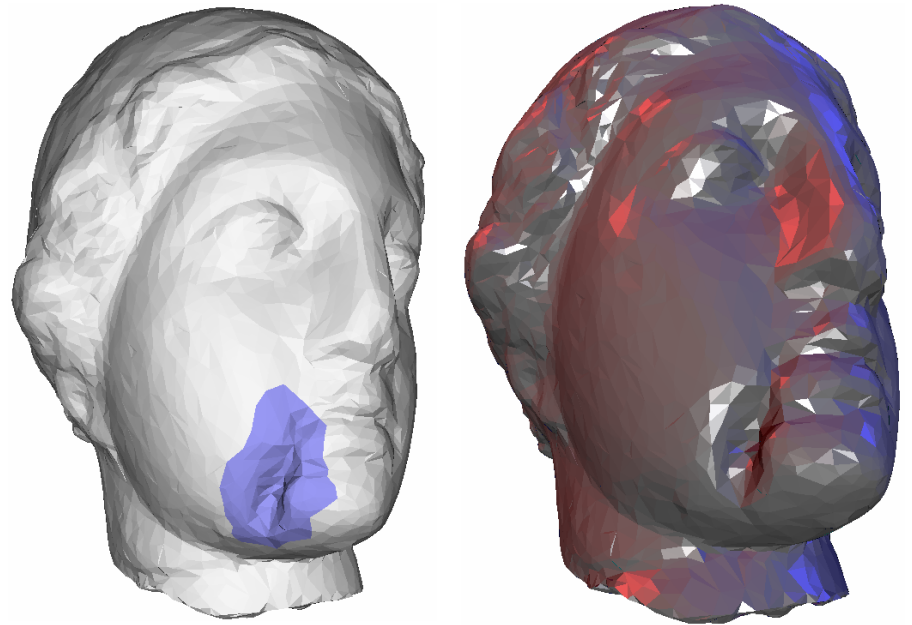


RESULTS III

Hole filling

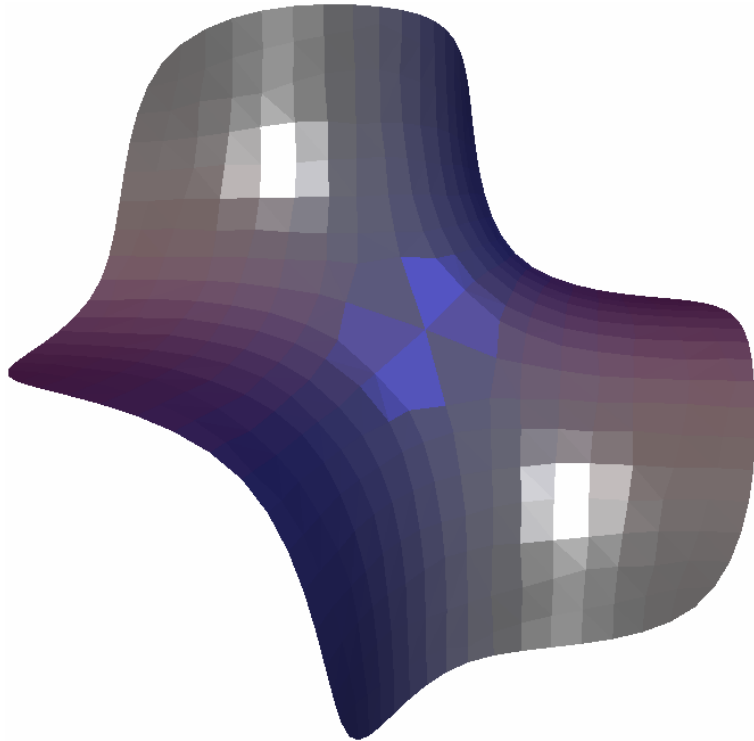


Inpainting

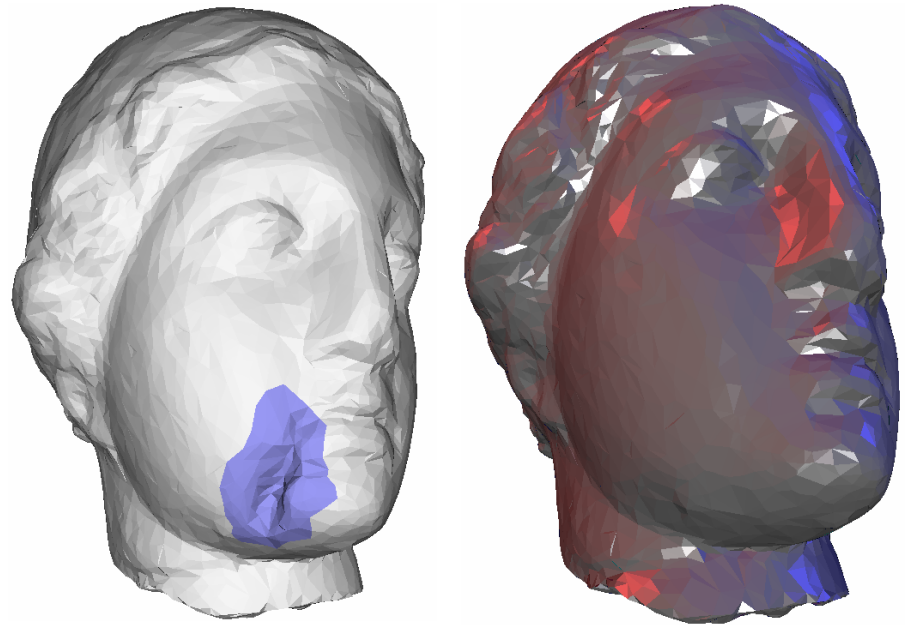


RESULTS III

Hole filling

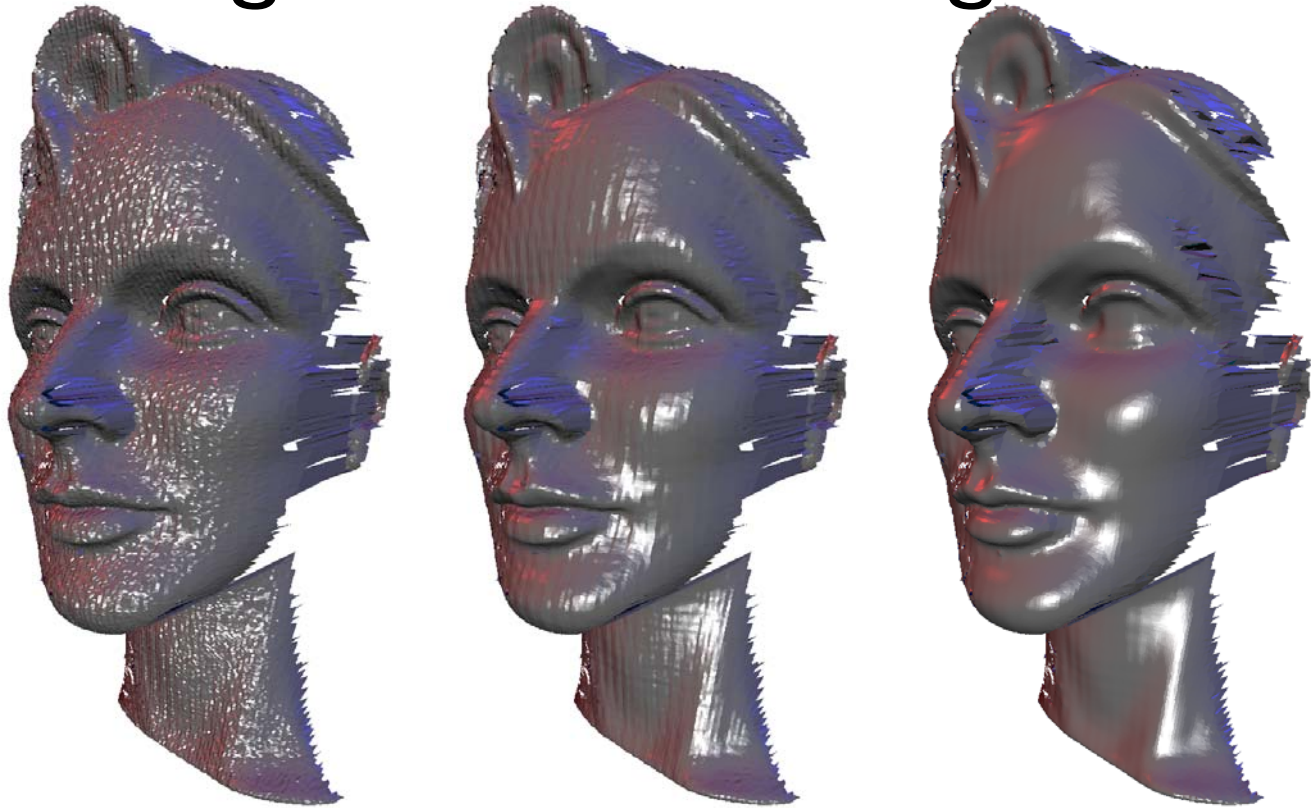


Inpainting



RESULTS IV

Shrinkage free denoising



S U M M A R Y

Discrete Willmore flow

- preserve symmetries: Möbius
- semi-implicit time stepping
- relevance in many geo. proc. areas
 - surface theory
 - variational geometric modeling
 - physical modeling

CIRCLE SUMMARY

Obey the geometry

- what geometry do the objects of interest belong to?
 - conformal parameterization
 - curvature energies
- circles and the angles they make with one another
- complete non-linear treatment