## Computational Conformal Geometry Applied in Computer Science

#### **Computational and Conformal Geometry**

David Gu April 21, 2007

#### Thanks

 Thank Chris for giving me the great chance to present my recent works.

#### Thanks

 Thank my first advisor, professor David Mumford, for his guidance and advices.

#### Thanks

- Thank Professor Sullivan, his seminal works kindled my interested in conformal geometry.
- Thank Professor Ken Stephenson for his valuable advices and consistent help during the last several years.

### Collaborators

Mathematicians

- Prof. Shing-Tung Yau
- Prof. Feng Luo
- Prof. Zeng-Xue He
- Computer Scientists
  - Prof. Hong Qin
  - Prof. Arie Kaufman
  - Prof. Dimitris Samaras
  - Prof. Klaus Muller
  - Prof. Joe, Esther
  - Profi Jie Gao

#### Contributors

- Researchers in center of visual computing
  Junho Kim, Ying He, Wei Hong
- Phd Students
  - Miao Jin, Tim Yin, Xin Li, Huayi Zeng, Wei Zeng, Feng Qiu
- Researchers from other departments
  - Peisen Huang, Song Zhang
  - Jerome Liang
  - Lance Cong

### Outline

- Applications of conformal geometry
  - Computer graphics
  - Computer vision
  - Medical imaging
  - Scientific Computing
  - Geometric Modeling
- Computational Methods
  - Harmonic Map
  - Holomorphic forms:
  - Discrete surface Ricci flow/

### Conformal Geometry in Computer Science

- Conformal geometry is getting more and more popular in computer science since 2000, the major reasons are:
  - The rapid development of 3D scanning technology, shape acquisition is becoming much easier
  - The fast development of computer hardware, especially the graphics hardware – GPU.

# Applications in Computer Vision

# Wave Optics - Light Interference



### Three Channel Geometry Video

#### •Geometry is reconstructed by 3 fringe images



# 3D Acquisition



# 3D Acquisition









#### Digital fringe projection and phase shifting









# 3D Data Acquisition

- High resolution
- High speed



# Summary: 3D Video Camera



# Riemann Mapping



# Conformal Mapping

- Scaling first fundamental from
- Angle preserving
- Similarities in the small

#### $\varphi: M_1 \rightarrow M_2$ , $g_{ij} = \lambda \varphi^{\iota} \tilde{g}_{ij}$



# Riemann Mapping



# Riemann Mapping



#### Geometric matching

- Parameterize surfaces to a canonical domain
- Match features by parameter
- Depends on geometry continuously



# Animators: automatic facial expression generation



#### demo

demo

#### demo

# Conformal Invariants



# Conformal Invariants



# Face Registration



### Virtual Actor

















### Summary: 3D Video Camera

- Faster Speed
- Higher resolution
- Cheaper cost



#### Surfaces with boundaries

- Copy the surface, invert the orientation
- Glue two copies together along the boundaries
- Treat the doubling as a closed surface
- Keep symmetry



### Conformal mapping properties

- Intrinsic to geometry
- Insensitive to triangulations and noise


### Computer Graphics - Rendering

#### Global Conformal Parameterization

- Conformality is held everywhere.
- All oriented metric surfaces are Riemann surfaces.













# Texture Mapping - Nondistortion











































#### Holomorphic One Form Basis

Dual to each handle





#### demo

#### Holomorphic one-form space

2g real dimension
Dual to homology





#### Linear combination

- Linearly combine holomorphic: 1-form bases
- Different holomorphic one-form, different properties (conformal factor, zero points)



#### Example: Minimal Surface

- Genus one, 3 boundaries
- Genus four





### Teapot Model





#### Zero points of the tangential vector fields







#### Different holomorphic one-form, different zero points







demo



# Locally it behaves like $\omega = z^2$



demo

demo

demo

#### Riemann Surface Structure



#### Media for geometry

Use regular grids to sample each chart
 Optimal Decomposition to triangle strips (J. Mitchell)














## Manifold TSpline



## Efficient Rendering



## **Optimal Parameterizations**



# Medical Imaging









#### Genus O surfaces

demo

- All conformally equivalent
- Harmonic is equivalent to conformal
- Mobius group



## Conformal Mapping











#### Surfaces with boundaries

- Copy the surface, invert the orientation
- Glue two copies together along the boundaries
- Treat the doubling as a closed surface
- Keep symmetry



## Geometry Matching-brain mapping



## Conformal Brain Mapping

#### • Brain to Sphere





#### Geometric Matching-brain mapping

- Minimize L2 norm under Mobius transformation
- Least square problem





## Conformal Brain Mapping



## Geometry Compression

- Spherical harmonic functions
- Spectrum compression



# Manifold Spline



#### Surface Segmentation/Matching

#### Boundary curve matching → Segmentation → Sub-patch matching



## Conformal Colon Flattening



## Conformal Colon Flattening





## Scientific Computation

#### Geometric Matching

Level set of Gaussian curvature
Gradient of gaussian curvature





### Flows on Mesh

- Curvilinear Grids
- Holomorphic Flow, Segmenation
- Transition functions are holomorphic



## Flows on Mesh

- Navier-Stokes Equations
- Co-variant differentiation
- Simpler differential operators
- No singularities
- Arbitrary meshes



## Flows on Mesh





# Physical Simulation









## Surface Matching



## Quasi-Conformal Maps



## Meromorphic Function



#### Geometry classification Geometric Database application











#### Space of Riemann Surfaces Teichmuller Space

Theorem:

Teichmuller Space for Genus O surface is only one point, for Genus 1 surfaces is 2 dimensional, for genus g surface is 6g-6 dimension.



## Conformal invariants - Periods

- Torus is conformally mapped to a parallelogram
- The shape factors of the parallelogram are conformal invariants





#### Conformal invariants - periods

Topologically equivalent
Not Conformally equivalent



## Conformal Invariants - periods

Snap shot	mesh	Angle	length ratio	Vertic es	faces
0	Torus	89.987	2.2916	1089	2048
	Teapot	89.95	3.026	17024	34048
	knot	85.1	31.150	5808	11616
	rocker	85.432	4.993	3750	7500

#### Conformal invariants - period matrix

High genus case – period matrix


### Tecimuller Coordinates









### Visualize Curvature Flow



## Geometric Modeling - Manifold Spline

### Mesh Spline Conversion

Convert mesh to T-Spline



### Goal: Generalize Planar Spline to Surfaces

- Long Lasting Open Problem in CAGD:
  - Can splines are defined on general manifolds?
  - If it is impossible, what is the intrinsic obstacle?
  - If it is possible, how to construct the manifold spline?

### Triangular B-spline : Parametric Affine Invariance



### Main theorem

- A domain manifold M with an atlas A, a spline scheme S, such that
  - S is parametric affine invariant
  - S has local support
  - S is complete ( polynomial reproduction )
- M admits manifold spline with scheme S, if and only if A is affine (all coordinate transition functions are affine.)



### Existence of Affine Structure theorem

- A closed 2-manifold M admits an affine atlas, if and only if M is a torus.
- Any open 2-manifolds admits an affine atlas.

### Construction theorem

- A holomorphic differential one-form induced an affine atlas on the Riemann surface with 2g-2 extraordinary points.
- A flat metric induces an affine atlas.















































User





#### Conformal Geometry Applied in Computer Science

#### David Gu<sup>1</sup>

<sup>1</sup>Department of Computer Science State University of New York at Stony Brook

Computational and Conformal Geometry

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#### The work is collaborated with the

**Mathematicians** 

Shing-Tung Yau, Feng Luo, Zeng-Xue He

#### **Computer Scientists**

Arie Kaufman, Hong Qin, Dimitris Samaras, Klaus Mueller, Joe Mitchell, Esther Arkin, Jie Gao

#### Artist

Lance Cong

and many faculty members in computer science department in Stony Brook University.

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The work is implemented by many students in the *Center of Visual Computing*. Especially, Miao Jin, Junho Kim, Xiaotian Yin, Wei Zeng and Xin Li.

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#### Definition (Conformal Structure)

An atlas is conformal, if all its transition maps are conformal (biholomorphic). A conformal structure is the maximal conformal atlas. A topological surface with an conformal structure is called a Riemann Surface.



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#### **Isothermal Coordinates**

#### Relation between conformal structure and Riemannian metric

#### Isothermal Coordinates

A surface  $\Sigma$  with a Riemannian metric **g**, a local coordinate system (u, v) is an isothermal coordinate system, if

$$\mathbf{g}=e^{2u}(du^2+dv^2).$$

The atlas formed by isothermal coordinate systems is an conformal atlas.



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#### All metric surfaces are Riemann surfaces.

#### Conformal Structure



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#### **Conformal Structure**





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#### Heat Flow

Suppose the temperature field on the surface is T(u, v, t), the surface is with a Riemannian metric **g**, then the temperature will evolve according to the heat flow:

$$\frac{dT(u,v,t)}{dt} = \Delta_{\mathbf{g}}T(u,v,t),$$

at the steady state

$$\Delta_{\mathbf{g}} T(u, v, \infty) \equiv \mathbf{0},$$

which is called a harmonic function.



#### Linear Harmonic Maps

Heat flow acting on the maps

 $\frac{d\phi(u,v,t)}{dt} = \Delta\phi(u,v,t).$ 

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## Linear Harmonic Maps

Heat flow acting on the maps

$$\frac{d\phi(u,v,t)}{dt} = \Delta\phi(u,v,t).$$

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### Non-linear Harmonic Maps Heat flow acting on the maps

 $\frac{d\phi(u,v,t)}{dt}$ 

 $\Delta \phi(u,v,t) - (\Delta \phi(u,v,t))^{\perp}$ 

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#### Non-linear Harmonic Maps

Heat flow acting on the maps

$$\frac{d\phi(u,v,t)}{dt} = \Delta\phi(t)$$

 $\Delta \phi(u,v,t) - (\Delta \phi(u,v,t))^{\perp}$ 

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# Heat Flow Acting on Vector Fields (Differential Forms)



#### Holomorphic 1-forms

Heat flow acting on 1-forms, the heat flow is

 $\frac{d\omega(u,v,t)}{dt} = \Delta\omega(u,v,t).$ 

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#### Euclidean Ricci Flow

Heat flow acting on metrics, the curvature satisfies the heat flow

 $\frac{dK(u,v,t)}{dt} = \Delta_{g(t)}K(u,v,t).$ 

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## **Euclidean Ricci Flow**

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#### Hyperbolic Ricci Flow

Heat flow acting on metrics, the curvature satisfies the heat flow

 $\frac{dK(u,v,t)}{dt} = \Delta_{g(t)}K(u,v,t).$ 

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## Hyperbolic Ricci Flow

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Linear Harmonic Maps

Heat flow acting on the maps

 $\frac{d\phi(u,v,t)}{dt} = \Delta\phi(u,v,t).$ 

#### Theorem (Rado's theorem)

Assume  $\Omega \subset \mathbb{R}^2$  is a convex domain with smooth boundary  $\partial \Omega$ . Given any homeomorphism  $\phi : S^1 \to \partial \Omega$ , there exists a unique harmonic map  $u : D \to \Omega$ , such that  $u = \phi$ on  $\partial D = S^1$  and u is a diffeomorphism.

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### Linear Harmonic Maps

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### Finite Element Method

Given a mesh  $\Sigma$ , for an edge  $e_{ij}$ connecting vertices  $v_i$  and  $v_j$ , suppose two angles against eare  $\alpha$ , $\beta$ , the define *edge weight* as

$$w_{ij} = \frac{1}{2}(\cot\alpha + \cot\beta)$$

suppose a map  $\phi : \Sigma \to \mathbb{R}^2$ , then the discrete energy is

 $E(\phi) = \sum_{\Theta_{ij}} w_{ij} |\phi(v_i) - \phi(v_j)|^2.$ 

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#### Finite Element Method

Discrete Laplace-Beltrami operator

 $\Delta \phi(\mathbf{v}_i) = \sum_{\mathbf{e}_{ij}} W_{ij}(\phi(\mathbf{v}_i) - \phi(\mathbf{v}_j)),$ 

Heat flow

$$\phi(V_i) - = \Delta \phi(V_i) \varepsilon,$$

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where  $\varepsilon$  is a small constant.



#### Finite Element Method

Discrete Laplace-Beltrami operator

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Non-linear Harmonic Maps

Heat flow acting on the maps

 $\frac{d\phi(u,v,t)}{dt}$ 

 $\Delta \phi(u,v,t) - (\Delta \phi(u,v,t))^{\perp}$ 

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## Theorem (Heat Flow for Topological Sphere)

The heat flow of a map from a closed genus zero surface to the unit sphere converges to a conformal map under normalization constraints. The conformal map is a diffeomorphism.



Non-linear Harmonic Maps

Heat flow acting on the maps

 $\frac{d\phi(u,v,t)}{dt}$ 

$$= \Delta \phi(u, v, t) - (\Delta \phi(u, v, t))^{\perp}$$

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Discrete Approximation Heat flow acting on the maps  $\phi(v_i) - = (\Delta \phi(v_i) - \Delta \phi(v_i)^{\perp})\varepsilon$ where  $\Delta \phi(v_i))^{\perp}$  is defined as  $< \Delta \phi(v_i), \phi(v_i) > \phi(v_i).$ 

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#### Stereo graphic projection

A conformal map from the unit sphere p(x, y, z) to the complex plane

$$p'=\frac{2}{2-z}p,$$

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## Stereo graphic projection

A conformal map from the unit sphere p(x, y, z) to the complex plane

$$p'=rac{2}{2-z}p$$

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## Möbius Transform

A Möbius transform on the complex plane  $\phi : \mathbb{C} \to \mathbb{C}$  is

$$\phi(z)=\frac{az+b}{cz+d}, ad-bc=1,$$

where  $a, b, c, d \in \mathbb{C}$ 

Theorem (Conformal Automorphism Group)

The conformal maps from a unit sphere to itself (or the complex plane) differ by a Möbius map.

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#### Normalization

In order to remove the Möbius ambiguity, spherical harmonic map in normalized

 Compute the mass center of the image,

$$\mathbf{c} = \sum_{\mathbf{v}_i} \phi(\mathbf{v}_i),$$

2 Normalize

$$\phi(v_i) = rac{\phi(v_i) - \mathbf{c}}{|\phi(v_i) - \mathbf{c}|}$$

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# **Riemann Mapping Theorem**



# Topological Disk Conformal Mapping

- Double cover
- Conformally map the doubled surface to the unit sphere
- Use the sphere Möbius transformation to make the mapping symmetric.
- Use stereographic projection to map each hemisphere to the unit disk.

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# **Riemann Mapping Theorem**



## Möbius Transformation

A Möbius transformation from the unit disk to itself is a conformal map

$$\phi(z) = \mathrm{e}^{i\theta} \frac{z - z_0}{1 - \bar{z}_0 z}$$

## Theorem (Riemann Mapping)

Any metric topological disk can be conformally mapped to the unit disk, the mapping is unique up to a Möbius transformation.

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## Definition (Holomorphic 1-form)

Suppose  $\Sigma$  is a Riemann surface,  $\{z_{\alpha}\}$  is a local complex parameter, a holomorphic 1-form  $\omega$  has a local representation as

 $\omega = f(z_{\alpha}) dz_{\alpha},$ 

where  $f(z_{\alpha})$  is a holomorphic function.

Locally,  $\omega$  is the derivative of a holomorphic function. Globally, it is not.



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# Holomorphic 1-forms



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# Another one basis holomorphic 1-form



# Holomorphic 1-forms






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Holomorphic 1-form induces a conformal parameterization.



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Holomorphic 1-form induces a conformal parameterization.



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## Theorem (Holomorphic 1-forms)

All holomorphic 1-forms form a linear space  $\Omega(\Sigma)$  which is isomorphic to the first cohomology group  $H^1(\Sigma, \mathbb{R})$ .



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Holomorphic 1-form  $\omega$  can be treated as two real 1-forms  $\omega = (\omega_0, \omega_1).$ 

Furthermore, we can treat each 1-form as a vector field, such that

- curl  $\omega_0 \equiv 0$
- **2**  $div\omega_0 \equiv 0$
- $\omega_1 = \mathbf{n} \times \omega_0$ , where **n** is the normal field.



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Intuition Hodge star operator rotates a vector field about the normal a right angle.

#### Definition (Hodge Star)

Hodge star operator is defined in the following:

$$*dx = dy, *dy = -dx,$$

#### Definition (harmonic 1-form)

Suppose  $\Sigma$  is a Riemann surface,  $\omega$  is differential 1-form, locally  $\omega$  is the derivative of a harmonic function. Symbolically,

$$d\omega = 0, *d * \omega = 0.$$

Globally, such harmonic function doesn't exist



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## Theorem (Hodge)

Each cohomologous class has a unique harmonic 1-form.



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## Algorithm for Holomorphic 1-forms

Input : A triangle mesh  $\Sigma$ . Output : Basis for holomorphic 1-forms

- Compute cohomology basis  $\{\omega_1, \omega_2, \cdots, \omega_n\}$ .
- 2 Heat flow to deform  $\omega_i$  to harmonic 1-forms.
- Compute hodge star of ω<sub>i</sub>'s.
- return holomorphic 1-form basis



 $\{\omega_1 + \sqrt{-1} * \omega_1, \omega_2 + \sqrt{-1} * \omega_2, \cdots, \omega_n + \sqrt{-1} * \omega_n\}$ 

#### Heat Flow for 1-forms

Suppose  $\omega : \{Edges\} \to \mathbb{R}$  is a closed 1-form. Let  $f : \{Vertices\} \to \mathbb{R}$  is a function, then

$$f - = \Delta(\omega + df) \times \varepsilon$$
,

where  $\Delta(\omega + df)(v_i)$ 

$$\sum_{\mathbf{e}_{ij}} w_{ij}(\omega(\mathbf{e}_{ij}) + f(v_j) - f(v_i)).$$



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Choose the best cohomology class to optimize the distortion,



## Uniformization

#### Theorem (Poincaré Uniformization Theorem)

Let  $(\Sigma, \mathbf{g})$  be a compact 2-dimensional Riemannian manifold. Then there is a metric  $\tilde{\mathbf{g}} = e^{2\lambda} \mathbf{g}$  conformal to  $\mathbf{g}$  which has constant Gauss curvature.



## **Conformal Metric**

#### Definition

Suppose  $\Sigma$  is a surface with a Riemannian metric,

$$\mathbf{g}=\left(egin{array}{cc} g_{11} & g_{12}\ g_{21} & g_{22} \end{array}
ight)$$

Suppose  $\lambda : \Sigma \to \mathbb{R}$  is a function defined on the surface, then  $e^{2\lambda} \mathbf{g}$  is also a Riemannian metric on  $\Sigma$  and called a conformal metric.  $e^{2\lambda}$  is called the conformal factor.



# Angles are invariant measured by conformal metrics.

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Suppose  $\bar{\mathbf{g}} = e^{2\lambda} \mathbf{g}$  is a conformal metric on the surface, then the Gaussian curvature on interior points are

$$\bar{K} = e^{-2\lambda}(-\Delta\lambda + K),$$

geodesic curvature on the boundary

$$\bar{k_g} = e^{-\lambda} (\partial_n \lambda + k_g).$$

## Definition (Surface Ricci Flow)

A closed surface with a Riemannian metric **g**, the Ricci flow on it is defined as

 $\frac{dg_{ij}}{dt} = -Kg_{ij}.$ 

If the total area of the surface is preserved during the flow, the Ricci flow will converge to a metric such that the Gaussian curvature is constant every where.

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## Theorem (Hamilton 1982)

For a closed surface of non-positive Euler characteristic, if the total area of the surface is preserved during the flow, the Ricci flow will converge to a metric such that the Gaussian curvature is constant (equals to  $\bar{K}$ ) every where.

#### Theorem (Chow)

For a closed surface of positive Euler characteristic, if the total area of the surface is preserved during the flow, the Ricci flow will converge to a metric such that the Gaussian curvature is constant (equals to  $\bar{K}$ ) every where.

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# Generic Surface Model - Triangular Mesh

- Surfaces are represented as polyhedron triangular meshes.
- Isometric gluing of triangles in  $\mathbb{E}^2$ .
- Isometric gluing of triangles in ℍ<sup>2</sup>, S<sup>2</sup>.



# Generic Surface Model - Triangular Mesh

- Surfaces are represented as polyhedron triangular meshes.
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- Isometric gluing of triangles in H<sup>2</sup>, S<sup>2</sup>.



# Generic Surface Model - Triangular Mesh

- Surfaces are represented as polyhedron triangular meshes.
- Isometric gluing of triangles in  $\mathbb{E}^2$ .
- Isometric gluing of triangles in  $\mathbb{H}^2, \mathbb{S}^2$ .



## **Discrete Metrics**

## Definition (Discrete Metric)

A Discrete Metric on a triangular mesh is a function defined on the vertices,  $I: E = \{all \ edges\} \rightarrow \mathbb{R}^+$ , satisfies triangular inequality.

## A mesh has infinite metrics.



## **Discrete Metrics**

## Metric

- Discrete Metric: *I* : *E* = {*all edges*} → ℝ<sup>1</sup>, satisfies triangular inequality.
- Metrics determine curvatures by cosine law.

$$\cos \theta_i = \frac{l_j^2 + l_k^2 - l_i^2}{2l_j l_k}, l \neq j \neq k \neq i$$



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## Theorem (Derivative Cosine Law)

Consider an Euclidean triangle  $\theta_i = \theta_i(l_1, l_2, l_3), i \neq j \neq k \neq i$ , then

$$\frac{1}{\sin \theta_i} \frac{\partial \theta_i}{\partial I_j} = \frac{1}{\sin \theta_j} \frac{\partial \theta_j}{\partial I_i}$$

# **Discrete** Curvature

## Definition (Discrete Curvature)

Discrete curvature:  $K : V = \{vertices\} \rightarrow \mathbb{R}^1$ .

$$K(\mathbf{v}) = 2\pi - \sum_{i} lpha_{i}, \mathbf{v} \notin \partial M; K(\mathbf{v}) = \pi - \sum_{i} lpha_{i}, \mathbf{v} \in \partial M$$

Theorem (Discrete Gauss-Bonnet theorem)

$$\sum_{v\notin\partial M} K(v) + \sum_{v\in\partial M} K(v) = 2\pi \chi(M).$$



## Conformal metric deformation

## **Conformal maps Properties**

- transform infinitesimal circles to infinitesimal circles.
- preserve the intersection angles among circles.



Idea - Approximate conformal metric deformation

Replace infinitesimal circles by circles with finite radii.

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## Circle Patterns

There are many local settings for circle patterns. The radius is variable, the intersection angles do not change.



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## **Circle Packing Metric**

#### **CP** Metric

We associate each vertex  $v_i$ with a circle with radius  $\gamma_i$ . On edge  $e_{ij}$ , the two circles intersect at the angle of  $\Phi_{ij}$ . The edge lengths are

$$I_{ij}^2 = \gamma_i^2 + \gamma_j^2 + 2\gamma_i\gamma_j\cos\Phi_{ij}$$

CP Metric  $(\Sigma, \Gamma, \Phi), \Sigma$  triangulation,

$$\mathsf{\Gamma} = \{\gamma_i | \forall v_i\}, \Phi = \{\phi_{ij} | \forall \mathbf{e}_{ij}\}$$



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## **Conformal Equivalent Circle Packing Metrics**

#### Definition (Conformal Equivalent Circle Packing Metrics)

Two circle packing metrics of the same mesh M,  $\{M, \Gamma_1, \Phi_1\}$  and  $\{M, \Gamma_2, \Phi_2\}$ , are *conformal equivalent*, if  $\Phi_1$  equals to  $\Phi_2$ .



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Suppose the vertex set of the mesh is  $\{v_1, v_2, \dots, v_n\}$ , we represent a conformal circle packing metric by  $\mathbf{u} = (u_1, u_2, \dots, u_n)$ , where  $u_i = \log \gamma_i$ .

#### Definition (Normalized Conformal Circle Packing Metric Space)

Each conformal equivalence class of circle packing metrics form a space, we call it *conformal circle packing metric space*. Because scaling doesn't affect curvature, we require  $\sum_i u_i = 0$ . All such **u** form a hyper-plane in the  $\mathbb{R}^n$ , denoted as  $\Pi_u$ . We call  $\Pi_u$  the *normalized conformal circle packing metric space*.

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#### Definition (Discrete Curvature Space)

We use  $\mathbf{k} = (k_1, k_2, \dots, k_n)$  to represent the curvature on the vertices of the mesh. Then all such  $\mathbf{k}$  form the *discrete curvature space*, which is on a hyper-plane in  $\mathbb{R}^n$ ,  $\sum_i k_i = 2\pi \chi(M), \chi(M)$  is the Euler number of the mesh.

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#### Definition (Discrete Curvature Map)

## The discrete curvature Equation defines a discrete curvature map (1)

$$\mathsf{K}: \mathsf{u} \to \mathsf{k}.$$

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## Image of Curvature Map

Given any subset  $I \subset V$ , let  $F_I$  be the set of all faces in M whose vertices are in I and let the link of I, denoted by Lk(I), be the set of pairs (e, v) of an edge e and a vertex v so that (1) the end points of e are not in I and (2) the vertex v is in I and (3) e and v form a triangle.

## Theorem (Image of Curvature Space)

All possible curvatures functions **k** induced by a conformal equivalence class of circle packing metrics  $\{M, \Gamma, \Phi\}$ , where  $\Gamma$  varies but  $\Phi$  is fixed, form a n-1 dimensional convex polytope, such that the total curvature satisfies the Gauss-Bonnet theorem and for any proper subset  $I \subset V$ ,

$$\frac{2\pi|I|\chi(M)}{|V|} > -\sum_{(e,v)\in Lk(I)} (\pi - \Phi(e)) + 2\pi\chi(F_I).$$
(2)

The convex polytope is denoted as  $\Omega_k$ .

#### Theorem (Inverse Curvature Map)

The curvature map K from normalized conformal circle packing metrics space  $\Pi_u$  to the image of curvature map  $\Omega_k$  is a  $C^{\infty}$  diffeomorphism, furthermore, it is real analytic. The derivative map dK :  $T\Pi_u(\mathbf{u}) \rightarrow T\Omega_k(\mathbf{k})$ , satisfies the discrete Poisson equation,

$$d\mathbf{k} = \Delta(\mathbf{u})d\mathbf{u},$$
 (3)

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where  $T\Pi_u(\mathbf{u})$  is the tangent space of  $\Pi_u$  at the point  $\mathbf{u}$ ,  $T\Omega_k(\mathbf{k})$  is the tangent space of  $\Omega_k$  at the point  $\mathbf{k}$ ,  $\Delta(\mathbf{u})$  is a positive definite matrix when constrained on  $T\Pi_u(\mathbf{u})$ .

#### Definition (Discrete Ricci flow)

A mesh  $\Sigma$  with a circle packing metric { $\Sigma$ ,  $\Gamma$ ,  $\Phi$ }, where  $\Gamma = {\gamma_i, v_i \in V}$  are the vertex radii,  $\Phi = {\Phi_{ij}, e_{ij} \in E}$  are the angles associated with each edge, the discrete Ricci flow on  $\Sigma$  is defined as

$$\frac{d\gamma_i}{dt}=(\bar{K}_i-K_i)\gamma_i,$$

where  $\bar{K}_i$  are the target curvatures on vertices. If  $\bar{K}_i \equiv 0$ , the flow with normalized total area leads to a metric with constant Gaussian curvature.

#### Idea

Metric deformation is driven by curvature.

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#### Theorem (Chow and Luo 2002)

A discrete Euclidean Ricci flow  $\{\Sigma, \Gamma, \Phi\} \rightarrow \{M, \overline{\Gamma}, \Phi\}$  converges.

$$|K_i(t) - \bar{K}_i| < c_1 e^{-c_2 t},$$

and

$$|\gamma_i(t) - \bar{\gamma}_i| < c_1 e^{-c_2 t},$$

where  $c_1, c_2$  are positive numbers.

#### Definition

Let  $u_i = ln\gamma_i$ , the Ricci energy is defined as

$$f(\mathbf{u}) = \int_{\mathbf{u}_0}^{\mathbf{u}} \sum_{i=1}^{n} (K_i - \bar{K}_i) du_i,$$

where  $\mathbf{u} = (u_1, u_2, \cdots, u_n), \mathbf{u}_0 = (0, 0, \cdots, 0).$ 

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## Theorem (Ricci Energy)

Euclidean Ricci energy is Well defined and convex, namely, there exists a unique global minimum.

#### Proof.

In an Euclidean triangle, with angles  $(\theta_1, \theta_2, \theta_3)$  and radius  $(\gamma_1, \gamma_2, \gamma_3)$ , let  $u_i = ln\gamma_i$ , according to Euclidean cosine law,

$$\frac{\partial \theta_i}{\partial u_j} = \frac{\partial \theta_j}{\partial u_i}.$$

Therefore  $\omega = \sum \theta_i du_i$  is a closed 1-form. The Euclidean Ricci energy is well defined. Direct computation verifies that Hessian matrix is positive definite.

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## Newton's method for Euclidean Ricci energy

#### Gradient descent Method

Ricci flow is the gradient descent method for minimizing Ricci energy,

$$\nabla f = (K_1 - \bar{K}_1, K_2 - \bar{K}_2, \cdots, K_n - \bar{K}_n).$$

#### Newton's method

The Hessian matrix of Ricci energy is

$$\frac{\partial^2 f}{\partial u_i \partial u_j} = \frac{\partial K_i}{\partial u_j}.$$

Newton's method can be applied directly.

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#### **Ricci Flow for Uniform Flat Metric**

Suppose  $\Sigma$  is a closed genus one mesh,

- Compute the circle packing metric (Γ, Φ).
- Set the target curvature to be zero for each vertex

$$ar{K}_i \equiv 0, \forall v_i \in V$$

- Minimize the Euclidean Ricci energy using Newton's method to get the target radii F.
- Ompute the target flat metric.

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## Algorithm : uniform flat metric for open surfaces

Given a surface  $\Sigma$  with genus g and b boundaries, then it Euler number is

$$\chi(\Sigma)=2-2g-b.$$

Suppose the boundary of  $\Sigma$  is a set of closed curves

$$\partial \Sigma = C_1 \cup C_2 \cup C_3 \cdots C_b.$$

The total curvature for each  $C_i$  is denoted as  $2m_i\pi, m_i \in \mathbb{Z}$ , and  $\sum_{i=1}^{b} m_i = \chi(\Sigma)$ . The target curvature for interior vertices are zeros



## Algorithm : uniform flat metric for open surfaces

#### Euclidean Ricci flow for open surfaces

- Use Newton's method to minimize the Ricci energy to update the metric.
- Adjust the boundary vertex curvature to be proportional to the ratio between the current lengths of the adjacent edges and the current total length of the boundary component.
- Repeat until the process converges.

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## Algorithm : Flatten a mesh with a uniform flat metric

#### Embedding

- Determine the planar shape of each triangle using 3 edge lengths.
- Glue all triangles on the plane along their common edges by rigid motions. Because the metric is flat, the gluing process is coherent and results in a planar embedding.

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original surface genus 1, 3 boundaries universal cover embedded in  $\mathbb{R}^2$ 

texture mapping

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#### Different boundaries are mapped to straight lines.

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original surface



fundamental domain



universal cover

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#### **Optimal Conformal Parameterizations**

A surface has infinite conformal mappings, different mappings have different area distortions.



Figure: There are an infinity number of conformal parameterizations of a given surface. We minimize the area distortion within the conformal mappings.

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## **Dual Ricci Flow Method**



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## **Dual Ricci Flow Method**



## **Dual Ricci Flow Method**



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#### Poincaré disk

A unit disk |z| < 1 with the Riemannian metric

$$ds^2 = \frac{4dzd\bar{z}}{(1-\bar{z}z)^2}.$$



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#### Poincaré disk

## The rigid motion is the Möbius transformation

$$e^{i\theta}\frac{z-z_0}{1-\bar{z}_0z}.$$



#### Poincaré disk

The hyperbolic line through two point  $z_0, z_1$  is the circular arc through  $z_0, z_1$  and perpendicular to the boundary circle |z| = 1.



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#### Poincaré disk

A hyperbolic circle  $(c, \gamma)$  on Poincare disk is also an Euclidean circle (C, R) on the plane, such that  $\mathbf{C} = \frac{2-2\mu^2}{1-\mu^2|\mathbf{c}|^2}$ ,  $R^2 = |\mathbf{C}|^2 - \frac{|\mathbf{c}|^2 - \mu^2}{1-\mu^2|\mathbf{c}|^2}, \mu = \frac{e^r - 1}{e^r + 1}.$ 



Definition (Discrete Hyperbolic Ricci Flow)

Let

$$u_i = ln \tanh \frac{\gamma_i}{2},$$

Discrete hyperbolic Ricci flow for a mesh  $\Sigma$  is

$$\frac{du_i}{dt}=\bar{K}_i-K_i,\bar{K}_i\equiv 0,$$

the Euler number of  $\Sigma$  is negative,  $\chi(\Sigma) < 0$ .

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Theorem (Discrete Hyperbolic Ricci flow, Chow and Luo 2002)

A hyperbolic discrete Ricci flow  $(M, \Gamma, \Phi) \rightarrow (M, \overline{\Gamma}, \Phi)$  converges,

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#### Definition (Discrete Hyperbolic Ricci Energy)

The discrete Hyperbolic Ricci energy is defined as

$$f(\mathbf{u}) = \int_{\mathbf{u}_0}^{\mathbf{u}} \sum_{i=1}^{n} (\bar{K}_i - K_i) du_i.$$

Discrete hyperbolic Ricci flow is the gradient descendent method to minimize the discrete hyperbolic ricci energy.

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#### Theorem (Hyperbolic Discrete Ricci Energy)

Discrete hyperbolic Ricci energy is well defined and convex, namely, there exists a unique global minimum.

#### Proof.

In a hyperbolic triangle, with angles  $(\theta_1, \theta_2, \theta_3)$  and radius  $(\gamma_1, \gamma_2, \gamma_3)$ ,  $u_i = In \tanh \frac{\gamma_i}{2}$ , according to hyperbolic cosine law,

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# Algorithm: Computing Hyperbolic uniformization metric

#### Hyperbolic Ricci Energy Optimization

- Set target curvature  $K(v_i) \equiv 0$ .
- Optimize the hyperbolic Ricci energy using Newton's method, with the constraint the total area is preserved.

#### Flattening Mesh in Hyperbolic Space

- Determine the shape of each triangle.
- Glue the hyperbolic triangles coherently by Möbius transformation.

Key: all computations use hyperbolic geometry.

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Genus 0 surface with 3 boundaries. The double covered surface is of genus 2. The boundaries are mapped to hyperbolic lines.

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Embedding in the upper half plane hyperbolic space model. Different period embedded in the hyperbolic space. The boundaries are mapped to hyperbolic lines.

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## Universal Covering Space and Deck Transformation



#### **Universal Cover**

A pair  $(\bar{\Sigma}, \pi)$  is a universal cover of a surface  $\Sigma$ , if

- Surface Σ
   is simply connected.
- Projection π : Σ̄ → Σ is a local homeomorphism.

#### **Deck Transformation**

A transformation  $\phi: \overline{\Sigma} \to \overline{\Sigma}$  is a deck transformation, if

 $\pi = \pi \circ \phi$ .

A deck transformation maps one period to another.

## **Fuchsian Group**

#### Definition (Funchsian Group)

Suppose  $\Sigma$  is a surface, **g** is its uniformization metric,  $(\bar{\Sigma}, \pi)$  is the universal cover of  $\Sigma$ . **g** is also the uniformization metric of  $\bar{\Sigma}$ . A deck transformation of  $(\bar{\Sigma}, \mathbf{g})$  is a Möbius transformation. All deck transformations form the Fuchsian group of  $\Sigma$ .

Fuchsian group indicates the intrinsic symmetry of the surface.



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## **Fuchsian Group**



#### The Fuchsian group is isomorphic to the fundamental group

	e <sup>iθ</sup>	<i>Z</i> <sub>0</sub>
<i>a</i> <sub>1</sub>	-0.631374 + <i>i</i> 0.775478	+0.730593+ <i>i</i> 0.574094
<i>b</i> <sub>1</sub>	+0.035487 - <i>i</i> 0.999370	+0.185274 - <i>i</i> 0.945890
a <sub>2</sub>	-0.473156+ <i>i</i> 0.880978	-0.798610- <i>i</i> 0.411091
<i>b</i> <sub>2</sub>	-0.044416- <i>i</i> 0.999013	+0.035502+ <i>i</i> 0.964858

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#### Klein Model

Another Hyperbolic space model is Klein Model, suppose  $\mathbf{s}, \mathbf{t}$  are two points on the unit disk, the distance is

$$d(s,t) = \operatorname{arccosh} \frac{1 - \mathbf{s} \cdot \mathbf{t}}{\sqrt{(1 - \mathbf{s} \cdot \mathbf{s})(1 - \mathbf{t} \cdot \mathbf{t})}}$$

#### Poincaré vs. Klein Model

From Poincaré model to Klien model is straight froward

$$\beta(z) = rac{2z}{1+\overline{z}z}, \beta^{-1}(z) = rac{1-\sqrt{1-\overline{z}z}}{\overline{z}z},$$

Assume  $\phi$  is a Möbius transformation, then transition maps  $\beta \circ \phi \circ \beta^{-1}$  are real projective.



#### Real projective structure

The embedding of the universal cover in the Poincaré disk is converted to the embedding in the Klein model, which induces a real projective atlas of the surface.

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#### Hyperbolic Structure



#### **Projective Structure**

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## Hyperbolic and Real Projective Structure



Hyperbolic Structure

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#### Hyperbolic Uniformization Metric



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### Hyperbolic Structure



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### Hyperbolic Structure



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#### For more information, please email to gu@cs.sunysb.edu.



# Thank you!

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