Weaving Geodesic Foliations

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Research Overview



simulation



cloth, shells crumpling, swellingcontact, friction

What is the relevance to machine learning?

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In computer graphics, we have developed a deep understanding



how to reason about it, discretize

Differential geometry is the language of:

- shape
- deformation
- physics
- symmetries and mappings

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Yet the use of differential geometry in ML is still naive

Geometry in Machine Learning

Voxelization

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Projection onto planes

• inherently 2D...

ML Grand Challenge

How can we learn 3D shape, motion, deformation?

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Groundbreaking new techniques for learning 3D shape must use the **vocabulary** of shape: discrete differential geometry

This Talk: Key Topics

Discrete vector fields and integrability

Discrete foliations

Discrete geodesics and geodesic fields

Branched covering spaces

Woven Structures: From Small Scale...



Martin

Puryear





Nature Nanochemistry

"Quantum Spin Liquids" - Physics





LVIS/LVIS Jr. stents,

J. NeuroInterventional Surgery 2015

...to architectural



Centre Pompidou-Metz



MINIMA | MAXIMA World Expo Pavillion

Elastic Ribbons Woven Triaxially

Can achieve wide array of shapes, using a wide array of materials.





Our Goal

Given a surface, figure out how to weave it



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2. How do we extend to triaxial weaves?





ribbon behaves as Eulerian beam - small resistance th³out-ofplane bending $O(wh^3)$





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- small resistance t_R^3 out-ofplane bending $O(wh^3)$
- small resistance to twist
- large resistance to in-

plane

bending



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ribbons must follow

Geodesics Fundamentally Global

Geodesic segments determined by 3 degrees of freedom:

- Start point
- Direction
- Distance



Geodesic Layout Challenge

Tracing one geodesic for a long time "mummifies" the target surface

We want to "evenly" cover a surface with non-intersecting geodes



Foliations

A decomposition of a surface into a union of submanifolds, called

leaves $\theta: M \to S^1$ Or, a submersion





Geodesic Foliations: **Two Views**



submersion $\theta: M \to S^1$ with geodesic isolines

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submersion $\theta: M \to S^1$ with geodesic isolines

(easier for applications)

complete vector field $\mathbf{v} \in TM$ with closed geodesic integral curves

Geodesic Foliation Relaxations

Issue: geodesic foliations usually don't exist (e.g. on the round sphere)

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Allow geodesic **almost**-foliations: can delete singularities from



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example: gradient of distance function from any point

Ultimate goal: given (discrete) surface, find geodesic almostfoliation



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This is too hard: we don't know how to discretize the isoline constraint

Ultimate goal: given (discrete) surface, find geodesic alm@stfoliation

Our steps:

- 1. Find vector field that has geodesig integral curves
- 2. Recover by integrating the field: $\min_{\theta,s} \|\nabla \theta - s \mathbf{v}^{\perp}\| \quad \text{s.t.} \quad \|s\| = c.$

 \mathbf{V}

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Our steps:

1. Find vector field that has geodesig integral curves

2. Recover by integrating the field solution $\min_{\theta,s} \|\nabla \theta - s\mathbf{v}^{\perp}\| \quad \text{s.t.} \quad \|s\| \stackrel{<}{=} c.$ isolines and integral curves parallel

Geodesic Vector Fields

How can we tell if a discrete vector field "has geodesic integral curves"?



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geodesic equation

$$\nabla_{\mathbf{v}}\mathbf{v}=0?$$
Geodesic Singularities

Singularities are topologically necessary on surfaces of non-zero genus

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Singularities are topologically necessary on surfaces of non-zero



geodesic almost everywhere

Geodesic Singularities

Singularities are topologically necessary on surfaces of non-zero genus Only some singularities are acceptable

Need a definition of discrete geodesic field that is well-defined at "good" singularities

A vector field is **integrable** if it is the gradient of a potential function



 $f(\mathbf{q}) = d(\mathbf{p}, \mathbf{q})$

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Discrete integrability: per-edge



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Discrete Curl

A vector field is **integrable** if it is the gradient of a potential function (locally equivalent conditions $\mathbf{v} = 0$)

Discrete Curl

A vector field is **integrable** if it is the gradient of a potential function (locally equivalent condition $\mathbf{v} = 0$ $(\nabla \times \mathbf{v})_{ij} = (\mathbf{v}_1 - \mathbf{v}_2) \cdot (\mathbf{p}_j - \mathbf{p}_i)$ Discretepcurl:

Discrete Curl: Who Cares?

Geodesic condition can be $\nabla \times \mathbf{v} = 0$ written in terms of vector $\operatorname{cur} \|\mathbf{v}\| = 1$

Discrete Curl: Who **Cares**?

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In the smooth setting: there are many curl-free unit fields

 $\nabla \times \mathbf{v} = 0$

 $\|\mathbf{v}\| = 1$

Problem: discretization

overconstrained

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We define a (discrete, approximately) geodesic field as any solution to: $\min_{\hat{\mathbf{v}},\delta\mathbf{v}} \|\delta\mathbf{v}\|^2 \quad \text{s.t.} \quad \begin{array}{l} \nabla \times (\hat{\mathbf{v}} + \delta\mathbf{v}) = 0 \\ \|\hat{\mathbf{v}}_i\| = 1 \end{array}$

 $\nabla \times \mathbf{v} = 0$

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We show: in the smooth setting $\mathbf{v} = 0$ solutions are exactly those with

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$$\min_{\hat{\mathbf{v}},\delta\mathbf{v}} \|\delta\mathbf{v}\|^2 \quad \text{s.t.}$$

$$\nabla \times (\hat{\mathbf{v}} + \delta \mathbf{v}) = 0$$

 $\|\hat{\mathbf{v}}_i\| = 1$

 $\nabla \times \mathbf{v} = 0$

= 1



Geodesic Field Design

- 1. Start with initial unit field
- 2. Descend using energy

 $\min_{\hat{\mathbf{v}},\delta\mathbf{v}} \|\delta\mathbf{v}\|^2 + \lambda \|\nabla(\hat{\mathbf{v}} + \delta\mathbf{v})\|^2 \text{ s.t. } \frac{\nabla \times (\hat{\mathbf{v}} + \delta\mathbf{v}) = 0}{\|\hat{\mathbf{v}}_i\| = 1}$

Geodesic Field Design

- 1. Start with initial unit field
- 2. Descend using energy



Results on Disk

For random initial field:



$\min_{\hat{\mathbf{v}},\delta\mathbf{v}} \|\delta\mathbf{v}\|^2 + \lambda \|\nabla(\hat{\mathbf{v}} + \delta\mathbf{v})\|^2 \text{ s.t. } \nabla \times (\hat{\mathbf{v}} + \delta\mathbf{v}) = 0$ **Geodesic Field Design**

- 1. Start with initial unit field
- 2. For j = 0, ...
 - fix $\hat{\mathbf{v}}^{j}$, compute $\hat{\mathbf{v}}^{j+1/2}$

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1. Start with initial unit field

2. For
$$j = 0, ...$$

• fix $_{\hat{\mathbf{v}}^{j}}$, compute $_{\hat{\mathbf{v}}^{j+1/2}}$

• set

$$\hat{\mathbf{v}}^{j+1} = \frac{\hat{\mathbf{v}}^j + \delta \mathbf{v}^{j+1/2}}{\|\hat{\mathbf{v}}^j + \delta \mathbf{v}^{j+1/2}\|}$$
$$\delta \mathbf{v}^{j+1} = \mathbf{v}^j + \delta \mathbf{v}^{j+1/2} - \mathbf{v}^{j+1/2}$$

Effect of Smoothness Term



Results in 3D





Once we have the vector field, how to trace out the integral curves?



Usual approach: find scalar function \mathbf{v}^{\perp}

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- local: failure **Q**f[⊥] to be curl-free
- global:





Main idea: we care only about the direction of the geodesic field, not the magnitude

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Find a scalar function with

$$\nabla \times (s\mathbf{v}^{\perp}) = 0$$

Reuse idea from geodesic field design: $\min_{s,\delta \mathbf{v}^{\perp}} \int \|\delta \mathbf{v}^{\perp}\|^2 \quad \text{s.t.} \quad \nabla \times (s \mathbf{v}^{\perp} + \delta \mathbf{v}^{\perp}) = 0$

Reuse idea from geodesic field design: $\min_{s,\delta\mathbf{v}^{\perp}} \int \|\delta\mathbf{v}^{\perp}\|^2 \quad \text{s.t.} \quad \nabla \times (s\mathbf{v}^{\perp} + \delta\mathbf{v}^{\perp}) = 0$ must bar the trivial solution: $\int s^2 = 1$

Reuse idea from geodesic field design: $\min_{s,\delta\mathbf{v}^{\perp}} \int \|\delta\mathbf{v}^{\perp}\|^2 \quad \text{s.t.} \quad \nabla \times (s\mathbf{v}^{\perp} + \delta\mathbf{v}^{\perp}) = 0$ $\int s^2 = 1$

must bar the trivial solution:

Turns into generalized eigenvector problem




Fixing Global Integrability Failure

Very challenging; no fully satisfying solution exists We use global nonlinear optimization technique initialized with v^{\perp}



Knöppel et al

Integrated Vector Fields



Fixing Global Integrability Failure

Very challenging; no fully satisfying solution exists
We use global nonlinear optimization technique initialized with ↓



Knöppel et al



Result: function $\theta \approx sv^{\perp}$ whose isolines are the designed geodesics

Back to Basketweaving

In a **triaxial weave** ribbons are laid out in three near-parallel families





Topological Weave Singularities





http://images.math.cnrs.fr/Visualiser-la-courbure.html

Topological Weave Singularities

Circulating around singularity permutes the six weave families





Triaxial Weave Design

Design **single** geodesic foliation on **sixfold cover** of original surface



Triaxial Weave Design

Then extract isolines, polish with sim





More Results



A Real Design File



Fabricated Examples



















