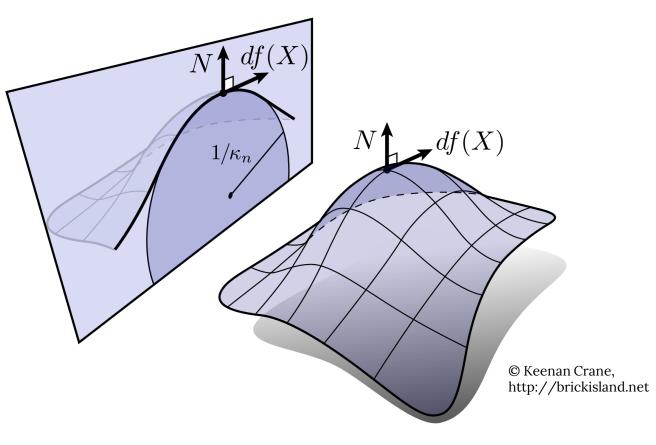
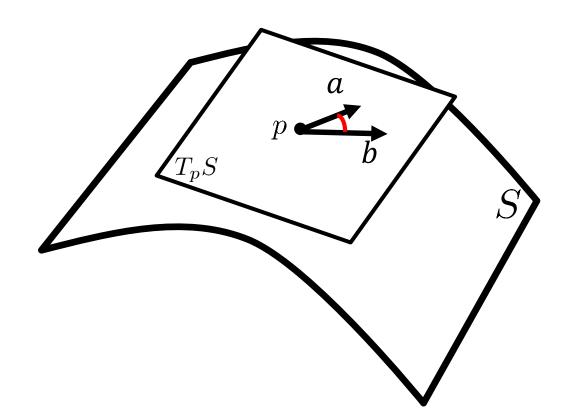
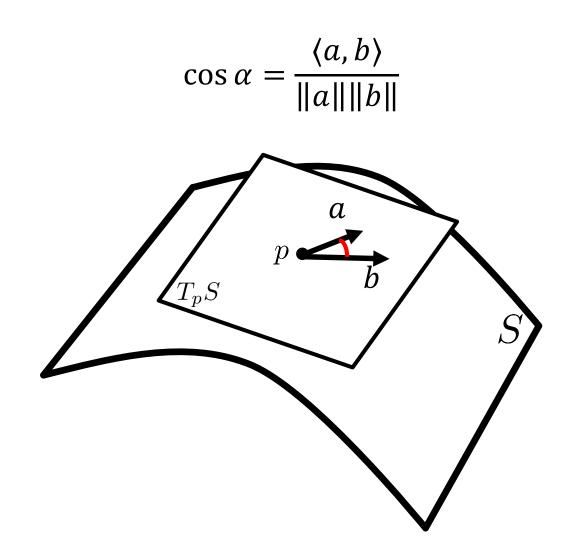
### IFT 6113 SURFACES

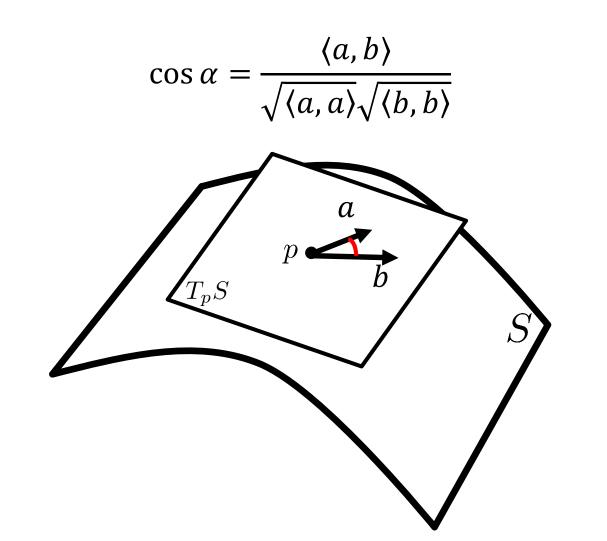


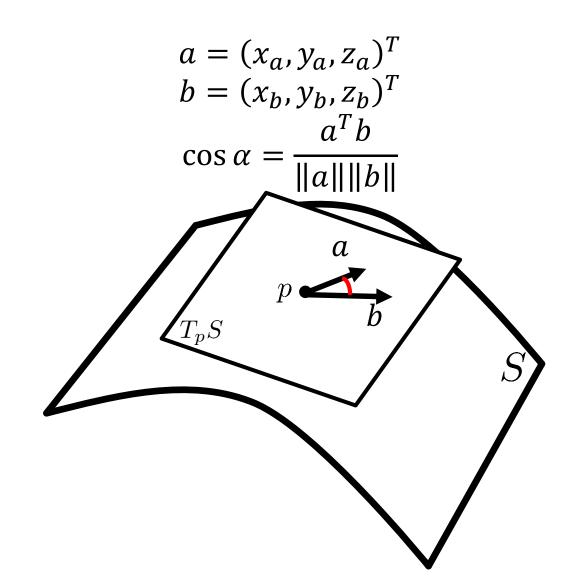
## Mikhail Bessmeltsev

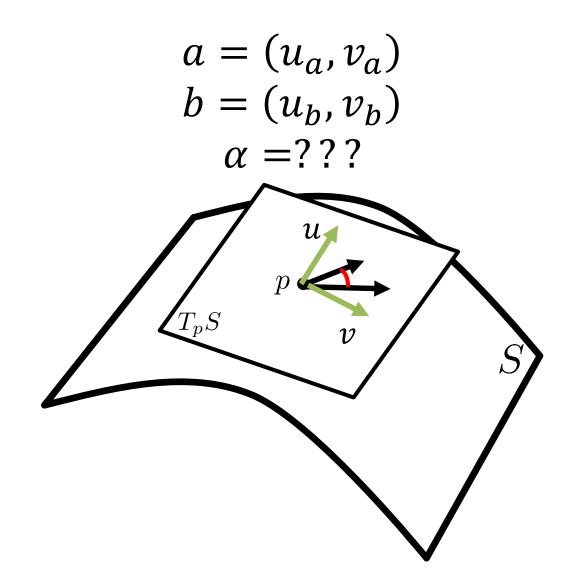
How to measure angle between two vectors?



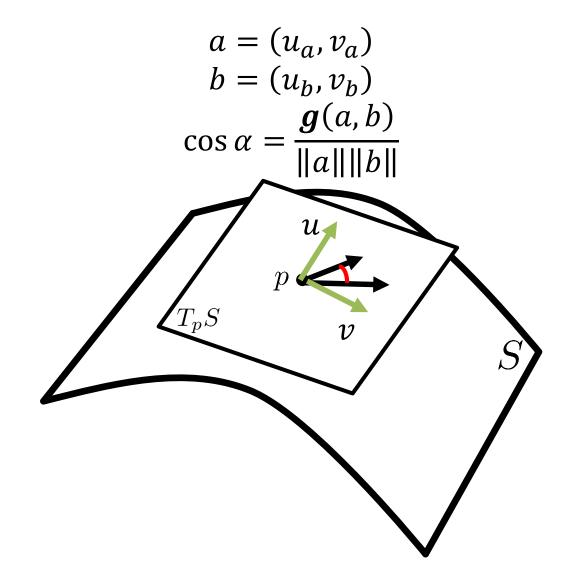








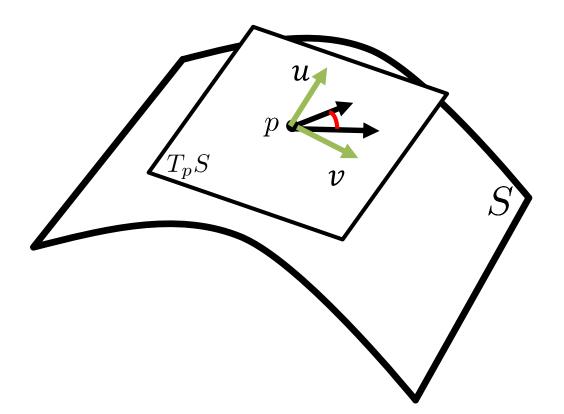
### METRIC TENSOR AKA FIRST FUNDAMENTAL FORM



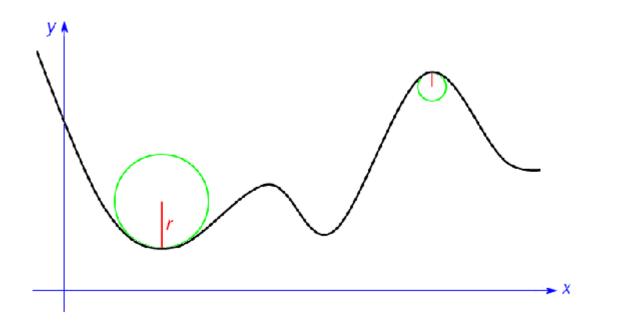
### METRIC TENSOR AKA FIRST FUNDAMENTAL FORM

## $g: T_p S \times T_p S \to \mathbb{R}$

g is symmetric, positive definite



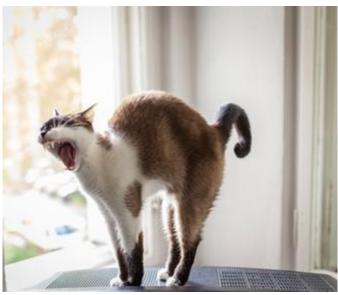
### PREVIOUSLY



$$r(s) \coloneqq \frac{1}{k(s)} \qquad \gamma''(s) = k(s) \cdot \vec{n}(s)$$



# Quantify how a surface **bends**.



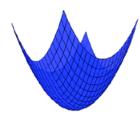
http://www.vetstreet.com/our-pet-experts/why-does-my-cat-arch-her-back



### **HIGH-LEVEL QUESTIONS**

(b) KG > 0, KH < 0

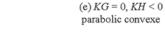
elliptic convexe



(a) KG > 0, KH > 0 elliptic concave



(d) KG = 0, KH > 0parabolic concave



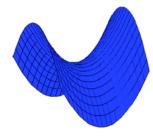


(g) KG < 0, KH < 0 hyperbolic-like

(h) KG < 0, KH > 0 hyperbolic-like N



(c) KG = 0, KH = 0plane

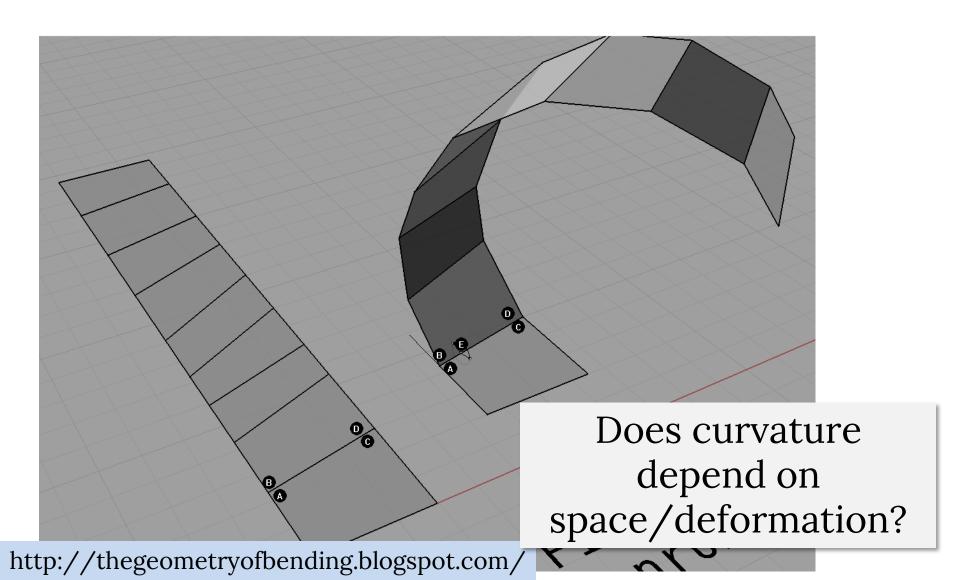


(f) KG < 0, KH = 0saddle (hyperbolic)

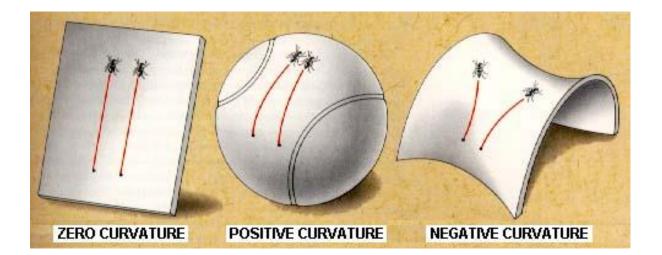


http://pubs.rsc.org/is/content/articlelanding/2013/cp/c3cp44375b

### **HIGH-LEVEL QUESTIONS**



### **HIGH-LEVEL QUESTIONS**



Does surrounding space matter?

http://starchild.gsfc.nasa.gov/docs/StarChild/questions/question35.html

### **PRACTICAL APPLICATION**



#### Share this

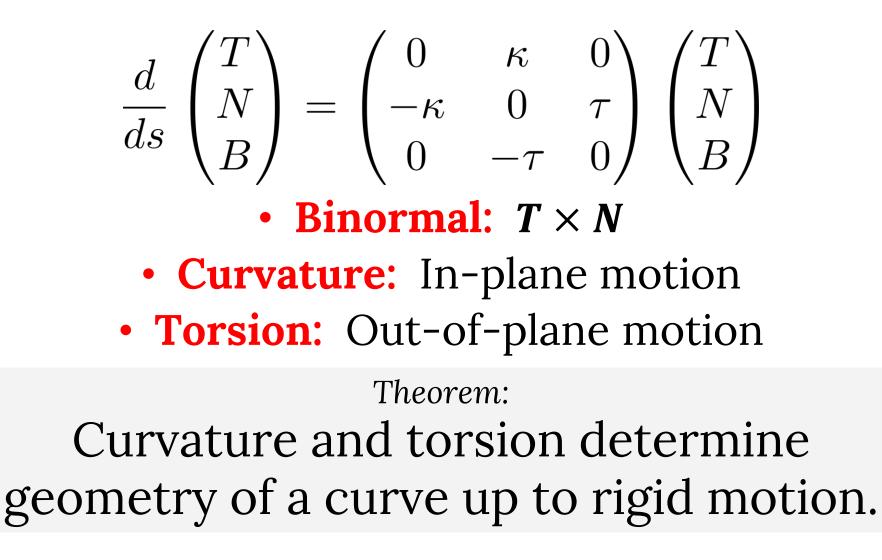
By LUCIA PETERS Oct 10 2014

Congratulations, New Yorkers: Here's proof that you are apparently the only people in the United States who have mastered the best way to eat pizza. As part of their "It's Okay to Be Smart" Web series, PBS' latest video delves into all the scientific trivia you never thought you'd need to know about everyone's favorite late-night drunk food — including the most scientifically sound way to gobble down your slice. Bend It Like Gauss:



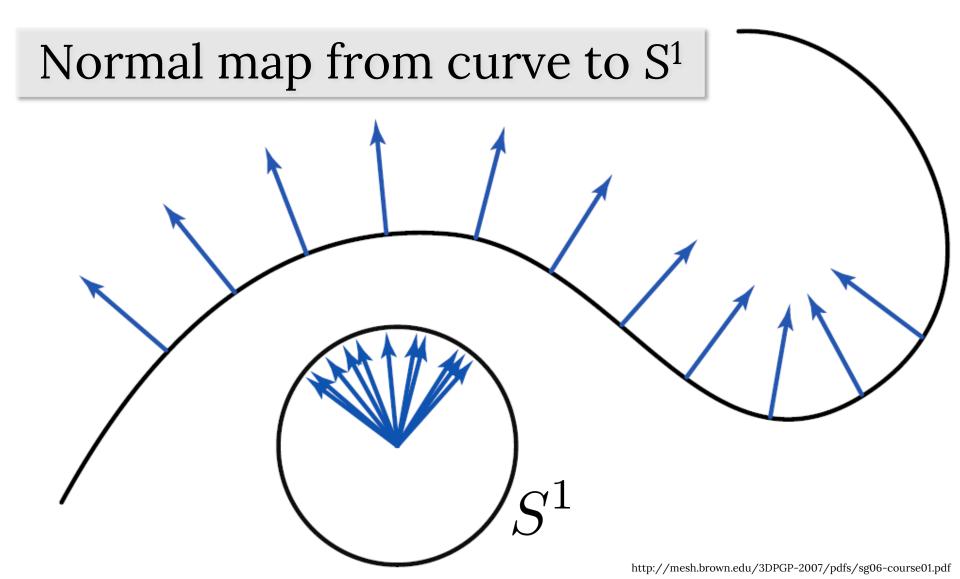
https://www.bustle.com/articles/43697-the-best-way-to-eat-pizza-according-to-science-means-you-probably-have-been-doing-it

### *Recall:* **FRENET FRAME:** CURVES IN $\mathbb{R}^3$

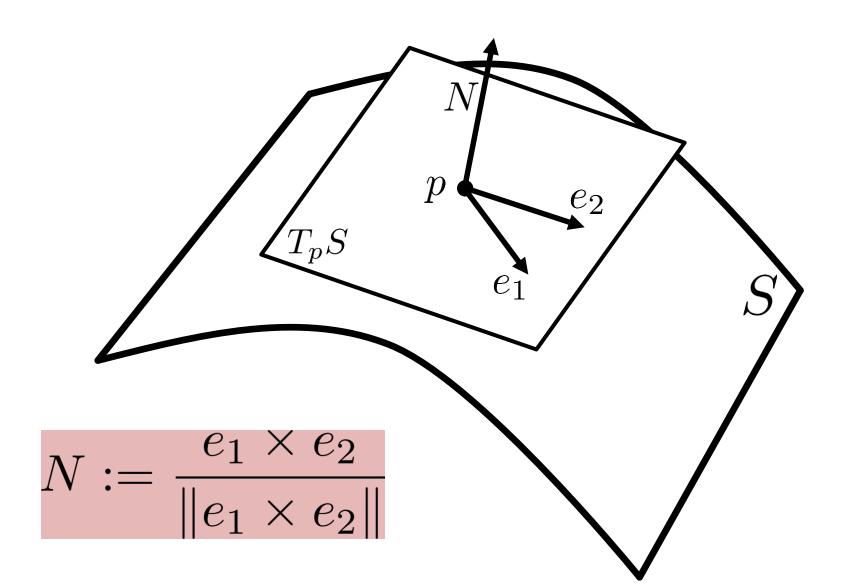


Can we say something about **surface curvature** using *curve* curvature/torsion?

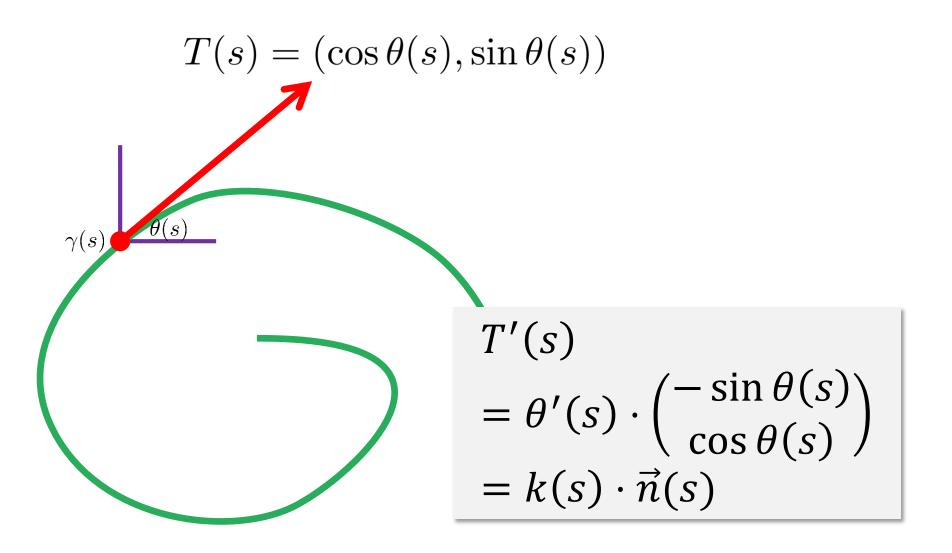




### **UNIT NORMAL**



### Recall: SIGNED CURVATURE ON PLANE CURVES



### Recall: SIGNED CURVATURE ON PLANE CURVES $T(s) = (\cos \theta(s), \sin \theta(s))$

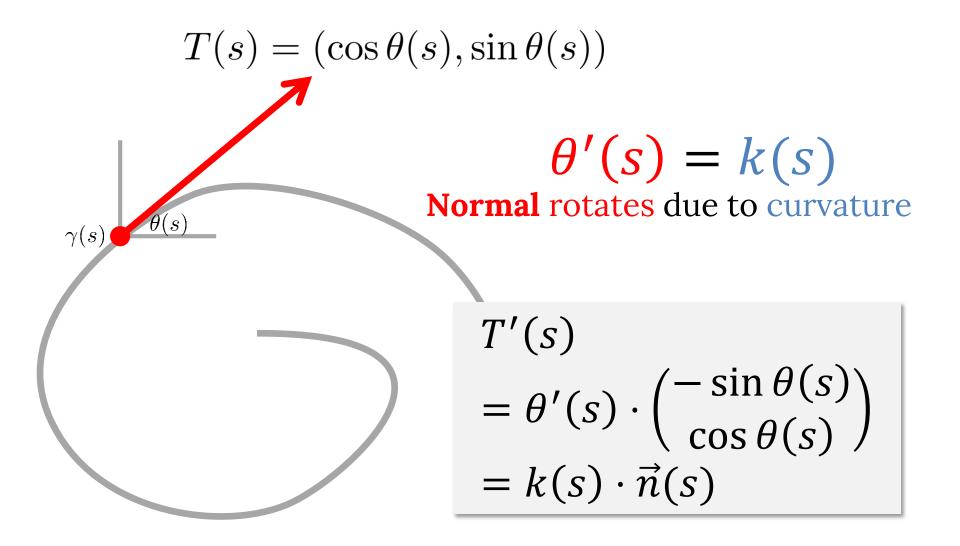
 $\theta(s)$ 

 $\gamma(s)$ 

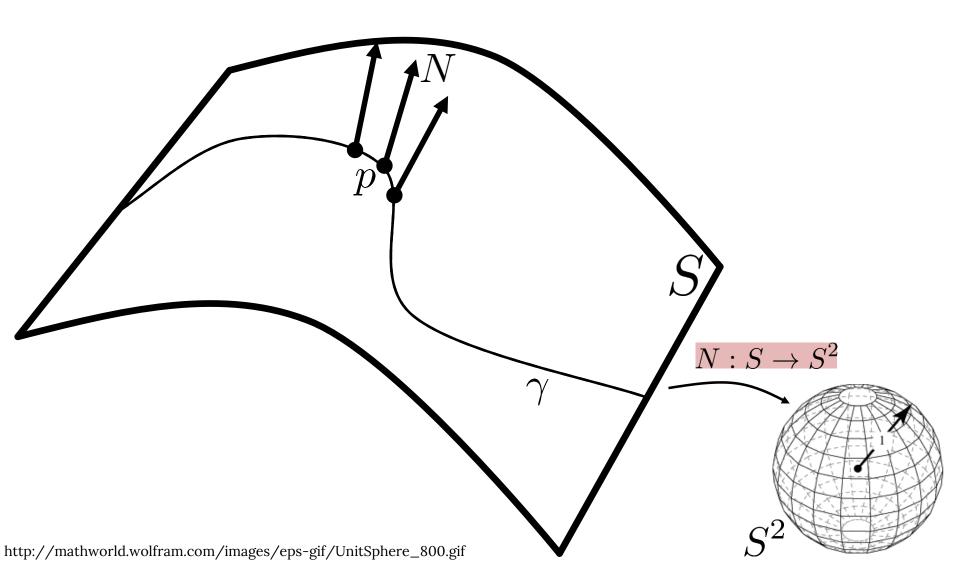
 $\theta'(s) = k(s)$ Tangent rotates due to curvature

$$T'(s) = \theta'(s) \cdot \begin{pmatrix} -\sin\theta(s) \\ \cos\theta(s) \end{pmatrix}$$
$$= k(s) \cdot \vec{n}(s)$$

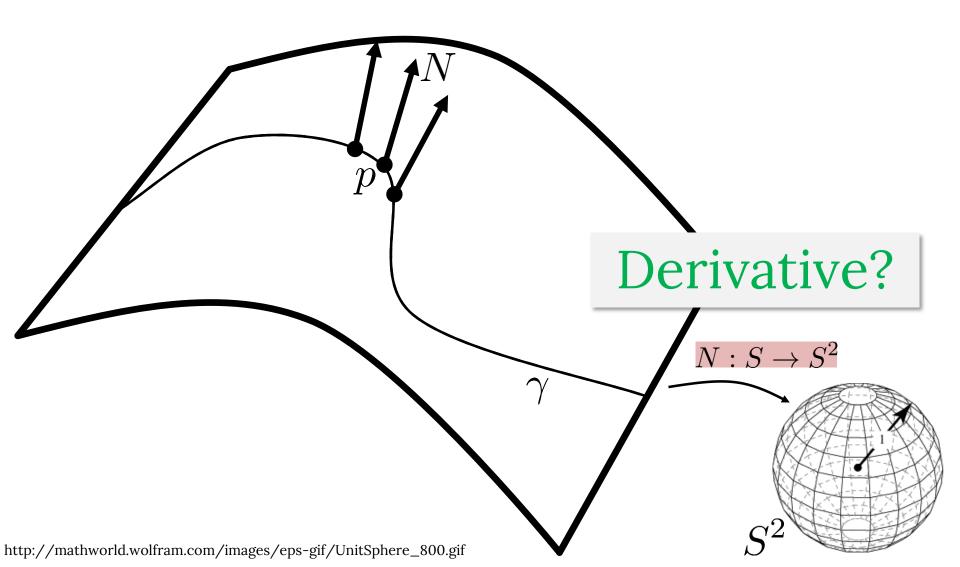
### Recall: SIGNED CURVATURE ON PLANE CURVES

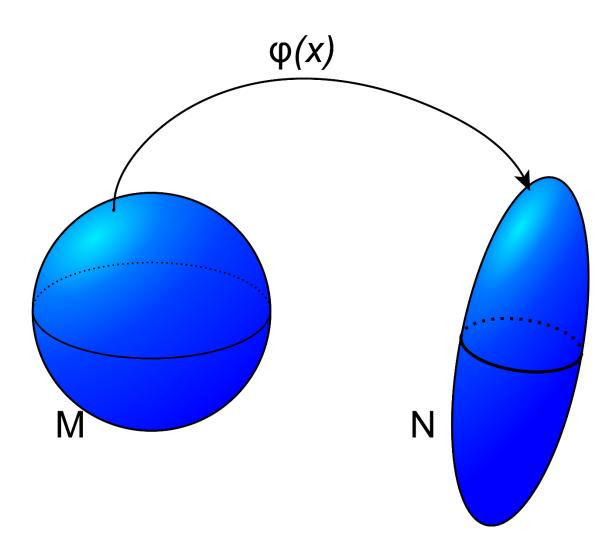


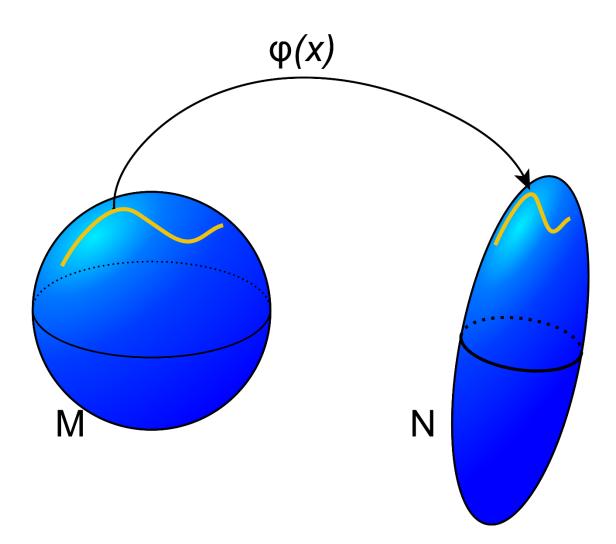
### **GAUSS MAP FOR SURFACE**

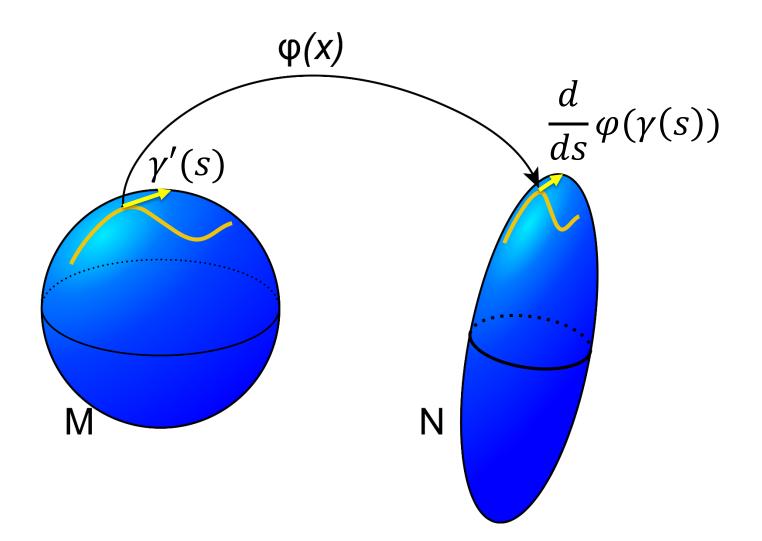


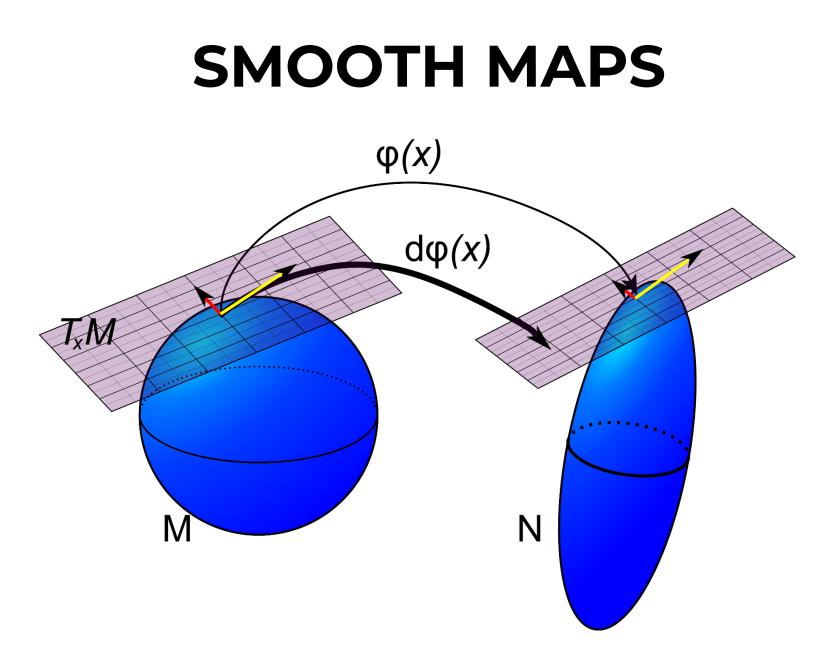
### **GAUSS MAP FOR SURFACE**

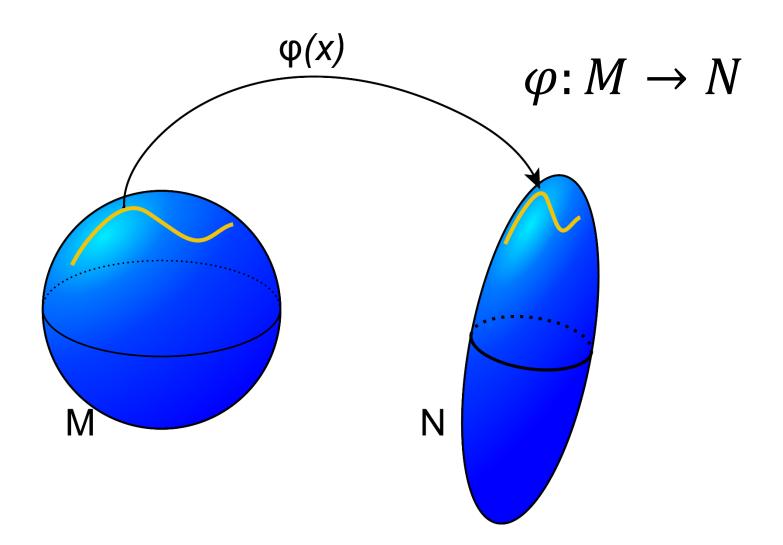


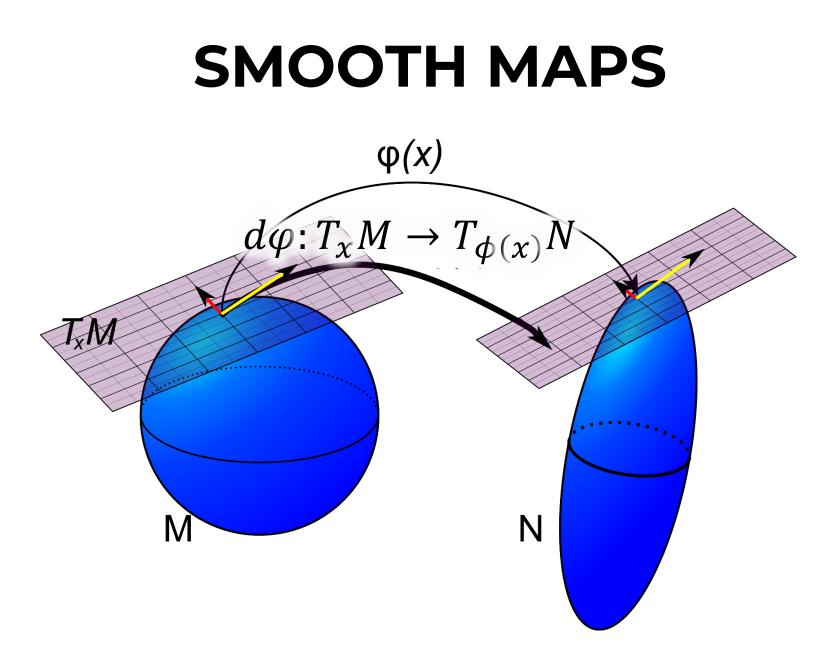












### **DIFFERENTIAL OF A MAP**

Definition

$$d\varphi: T_{\chi}M \to T_{\phi(\chi)}N$$
$$d\varphi \cdot \gamma'(s) \equiv \frac{d\varphi(\gamma(s))}{ds}$$

#### Linear map of tangent spaces

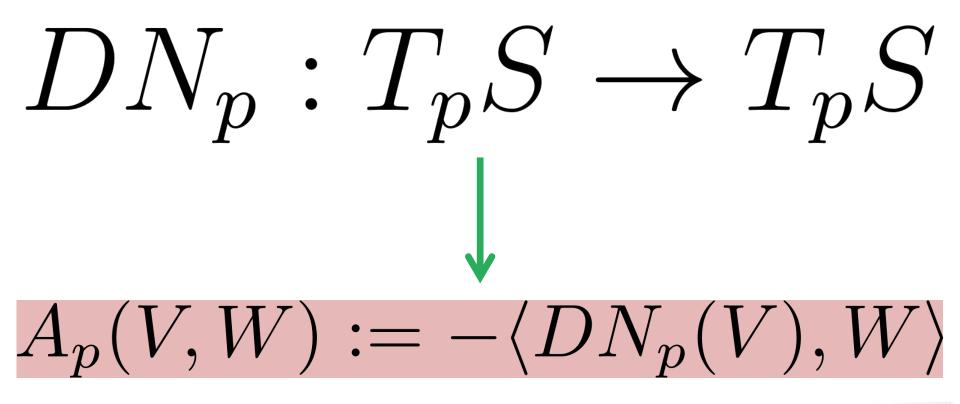
Image from Wikipedia

### **CALCULATION ON BOARD**

# Where is the derivative of N?

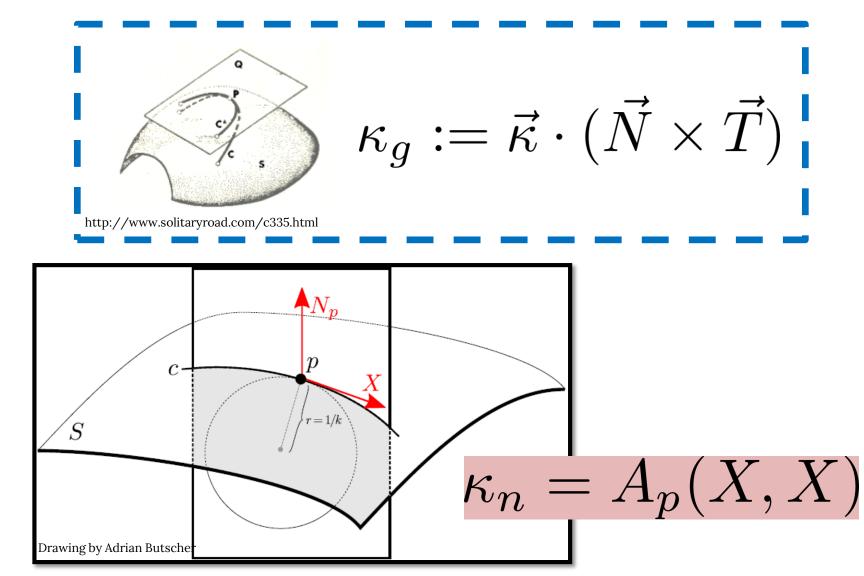
Spoiler alert:  $T_pS$ 

#### SECOND FUNDAMENTAL FORM



"Shape operator"

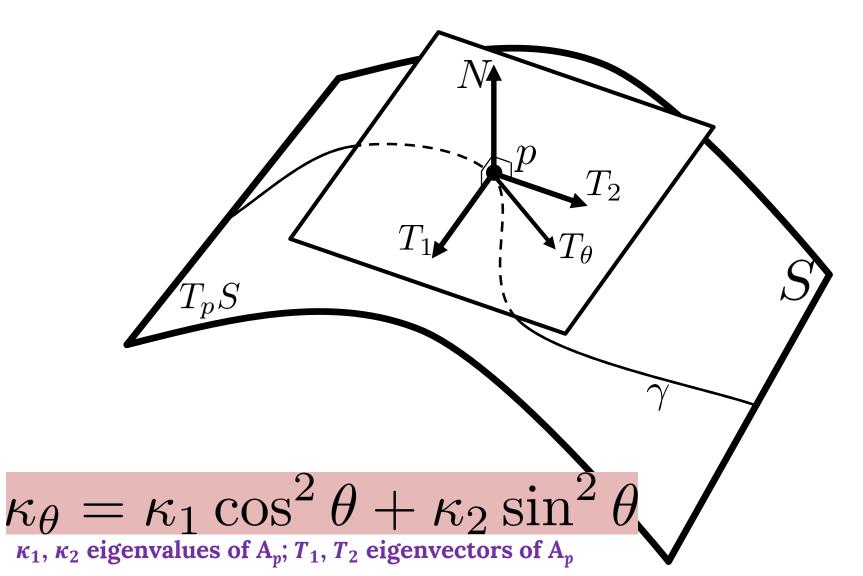
### RELATIONSHIP TO CURVATURE OF CURVES



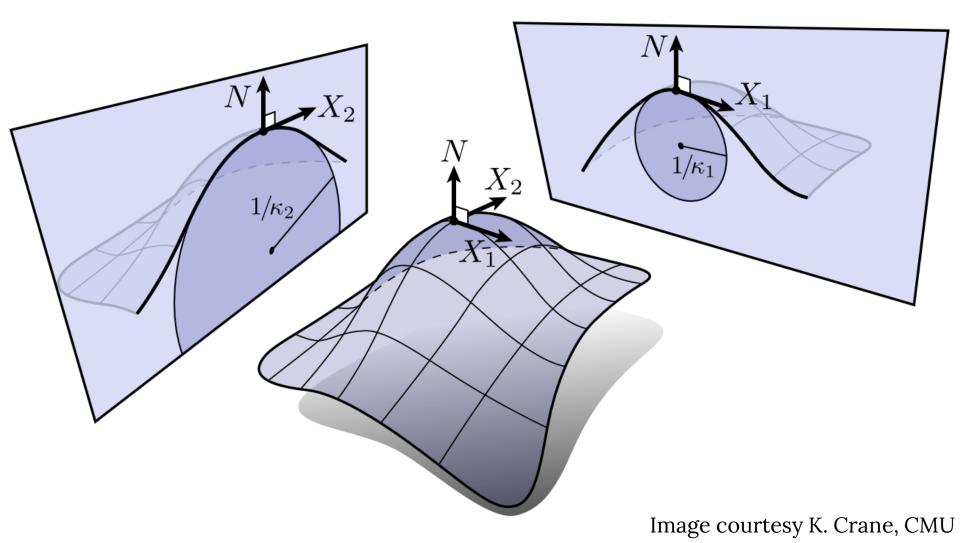
### **A<sub>P</sub> IS SELF-ADJOINT**

(on board)

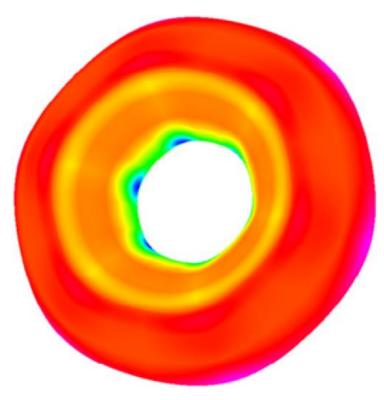
### PRINCIPAL DIRECTIONS AND CURVATURES



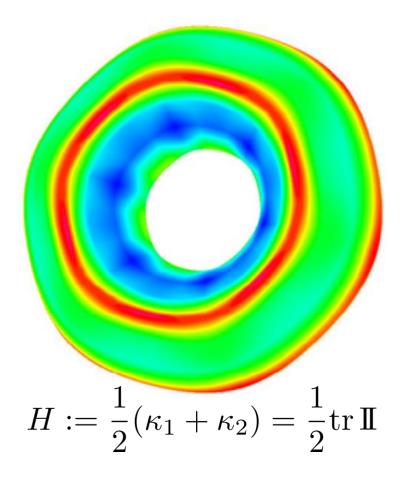
### **PRINCIPAL CURVATURES**



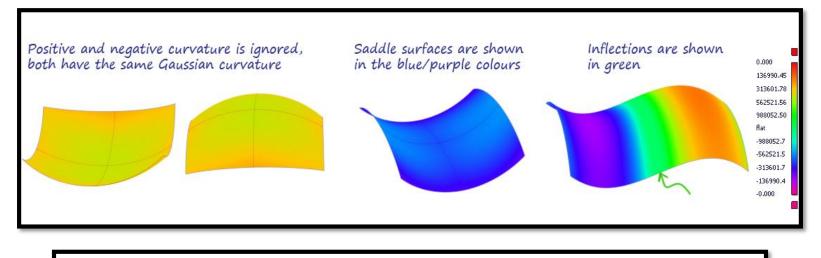
#### **EXTRINSIC CURVATURE**

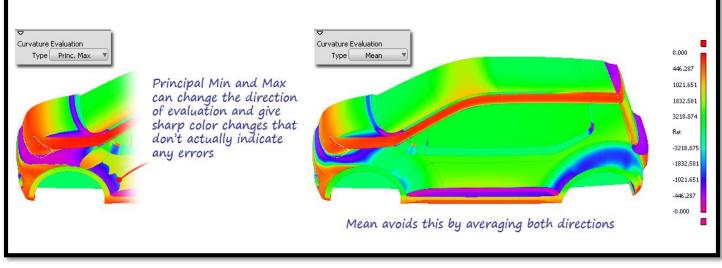


 $K := \kappa_1 \kappa_2 = \det \mathbb{I}$ 



### INTERPRETATION





http://www.aliasworkbench.com/theoryBuilders/TB7\_evaluate3.htm

### **UNIQUENESS RESULT**

#### **Theorem:**

#### A smooth surface is determined up to rigid motion by its first and second fundamental forms.

#### WHO CARES?

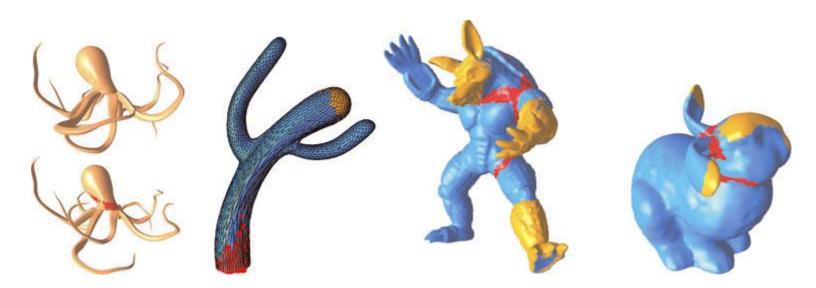
## Curvature completely determines local surface geometry.

### **USE AS A DESCRIPTOR**



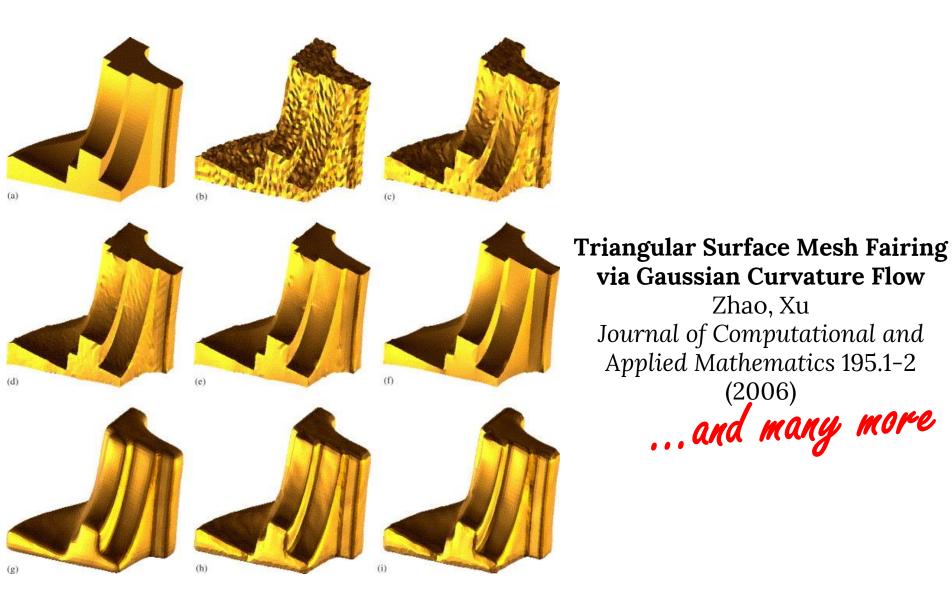
http://graphics.ucsd.edu/~iman/Curvature/

#### SMOOTHING AND RECONSTRUCTION



Linear Surface Reconstruction from Discrete Fundamental Forms on Triangle Meshes Wang, Liu, and Tong Computer Graphics Forum 31.8 (2012)

#### **FAIRNESS MEASURE**



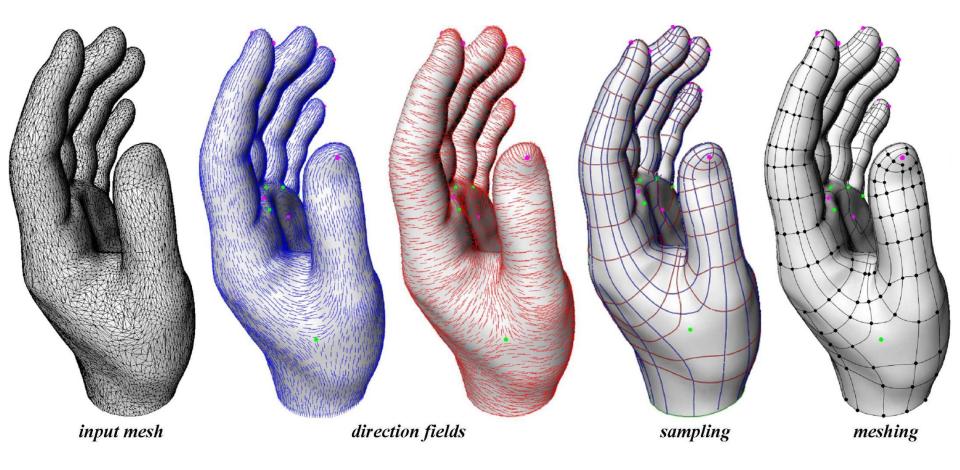
### **GUIDING RENDERING**



Highlight Lines for Conveying Shape DeCarlo, Rusinkiewicz NPAR (2007)

http://www.cs.rutgers.edu/~decarlo/pubs/npar07.pdf

### **GUIDING MESHING**



Anisotropic Polygonal Remeshing Alliez et al. SIGGRAPH (2003)

### **CHALLENGE ON MESHES**

#### Curvature is a second derivative, but triangles are flat.

### **STANDARD CITATION**

#### ESTIMATING THE TENSOR OF CURVATURE OF A SURFACE FROM A POLYHEDRAL APPROXIMATION

Gabriel Taubin

ICCV 1995

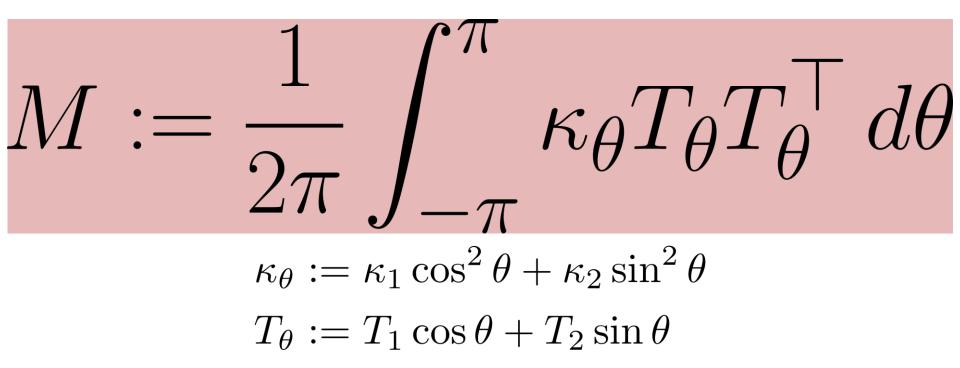
IBM T.J.Watson Research Center P.O.Box 704, Yorktown Heights, NY 10598 taubin@watson.ibm.com

#### Abstract

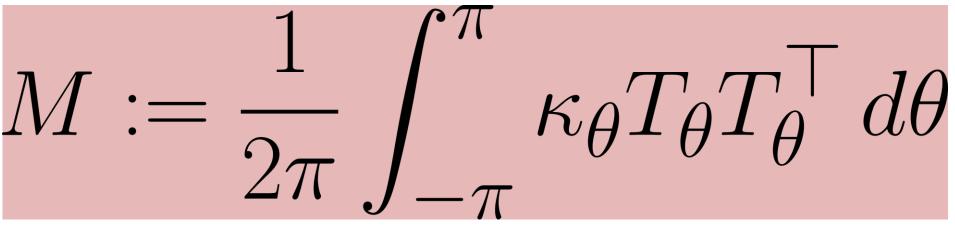
Estimating principal curvatures and principal directions of a surface from a polyhedral approximation with a large number of small faces, such as those produced by iso-surface construction algorithms, has become a basic step in many computer vision algorithms. Particularly in those targeted at medical applications. In this paper we describe a method to estimate the tensor of curvature of a surface at the vertices of a polyhedral approximation. Principal curvatures and principal directions are obtained by computing in closed form the eigenvalues and eigenvectors of certain  $3 \times 3$ symmetric matrices defined by integral formulas, and closely related to the matrix representation of the tenmate principal curvatures at the vertices of a triangulated surface. Both this algorithm and ours are based on constructing a quadratic form at each vertex of the polyhedral surface and then computing eigenvalues (and eigenvectors) of the resulting form, but the quadratic forms are different. In our algorithm the quadratic form associated with a vertex is expressed as an integral, and is constructed in time proportional to the number of neighboring vertices. In the algorithm of Chen and Schmitt, it is the least-squares solution of an overdetermined linear system, and the complexity of constructing it is quadratic in the number of neighbors.

#### 2 The Tensor of Curvature

#### **TAUBIN MATRIX**

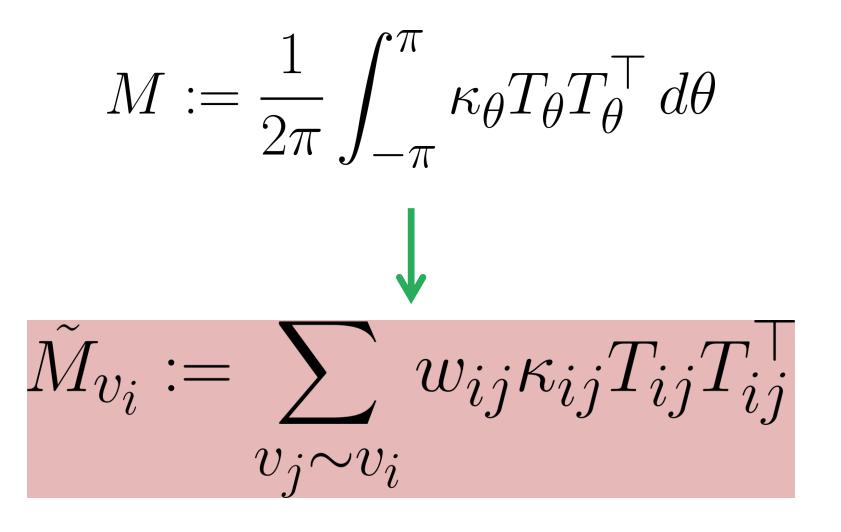


### **TAUBIN MATRIX**

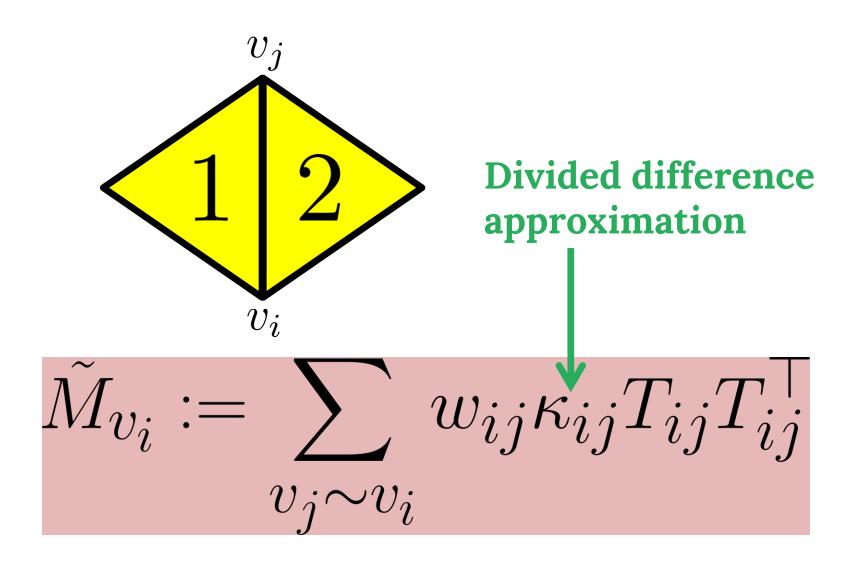


- Eigenvectors are  $N, T_1$ , and  $T_2$
- Eigenvalues are  $\frac{3}{8}\kappa_1 + \frac{1}{8}\kappa_2$  and  $\frac{1}{8}\kappa_1 + \frac{3}{8}\kappa_2$

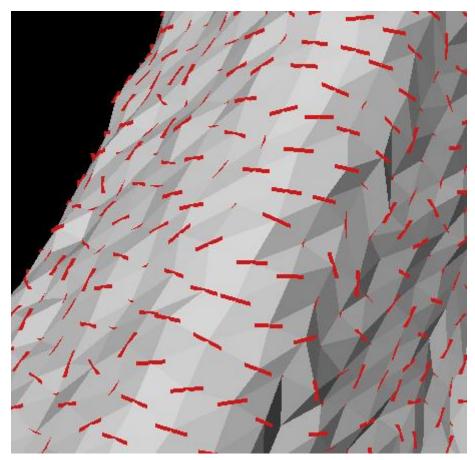
#### **TAUBIN'S APPROXIMATION**



#### **TAUBIN'S APPROXIMATION**



#### PROBLEM



http://iristown.engr.utk.edu/~koschan/paper/CVPR01.pdf

### Local estimates are noisy

#### MAIN TAKE-AWAY

# Use application to motivate choice of curvature.

Simulation, smoothing, analysis, meshing, nonphotorealistic rendering, ...

### **ANOTHER EXAMPLE**

#### **Estimating Curvatures and Their Derivatives on Triangle Meshes**

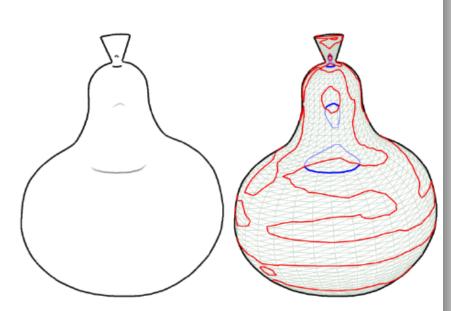
Szymon Rusinkiewicz Princeton University

#### Abstract

The computation of curvature and other differential properties of surfaces is essential for many techniques in analysis and rendering. We present a finite-differences approach for estimating curvatures on irregular triangle meshes that may be thought of as an extension of a common method for estimating per-vertex normals. The technique is efficient in space and time, and results in significantly fewer outlier estimates while more broadly offering accuracy comparable to existing methods. It generalizes naturally to computing derivatives of curvature and higher-order surface differentials.

#### 1 Introduction

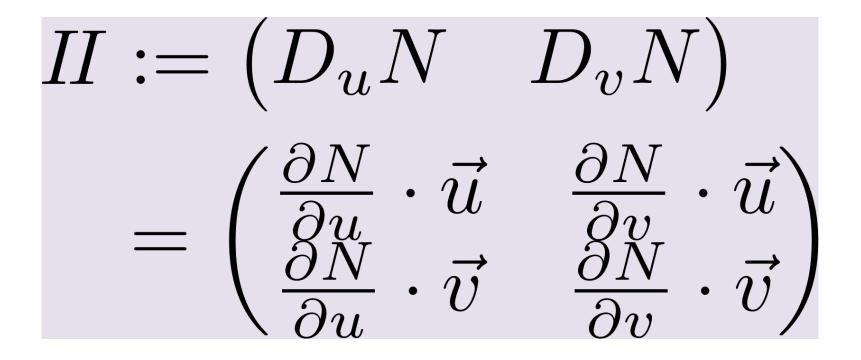
As the acquisition and use of sampled 3D geometry become more widespread, 3D models are increasingly becoming the focus of analysis and signal processing techniques previously applied to data types such as audio, images, and video. A key component of algorithms such as feature detection, filtering, and indexing, when applied to both geometry and other data types, is the discrete estimation of differential quantities. In



3DP1/T '04

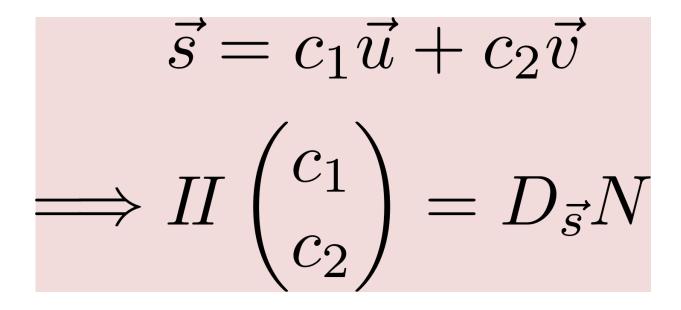
Figure 1: Left: suggestive contours for line drawings [DeCarlo et al. 2003] are a recent example of a driving application for the estimation of curvatures and derivatives of curvature. Right: suggestive contours are drawn along the zeros of curvature in the view direction, shown here in blue, but only where the derivative of curvature in the view direction is positive (the curvature derivative zeros are shown here in red). This paper describes a general

#### SECOND FUNDAMENTAL FORM MATRIX



Assume u, v are orthogonal

#### SECOND FUNDAMENTAL FORM MATRIX



# FACE

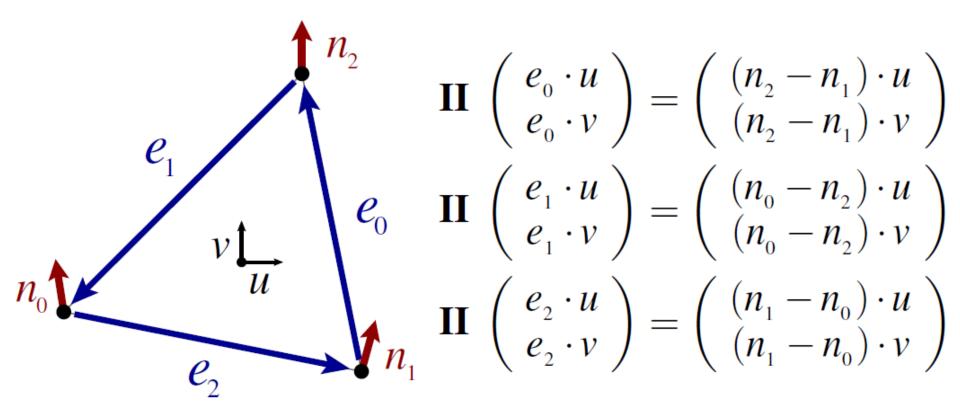


Figure from the paper

Least-squares

#### **AVERAGE FOR PER-VERTEX**

 Rotate tangent plane about cross product of normals

 Average using Voronoi weights

#### COMPLETELY DIFFERENT FORMULA

#### Consistent Computation of First- and Second-Order Differential Quantities for Surface Meshes

Xiangmin Jiao\* Dept. of Applied Mathematics & Statistics Stony Brook University

#### Abstract

Differential quantities, including normals, curvatures, principal directions, and associated matrices, play a fundamental role in geometric processing and physics-based modeling. Computing these differential quantities consistently on surface meshes is important and challenging, and some existing methods often produce inconsistent results and require ad hoc fixes. In this paper, we show that the computation of the gradient and Hessian of a height function provides the foundation for consistently computing the differential quantities. We derive simple, explicit formulas for the transformations between the first- and second-order differential quantities (i.e., normal vector and curvature matrix) of a smooth surface and the first- and second-order derivatives (i.e., gradient and Hessian) of its corresponding height function. We then investigate a general, flexible numerical framework to estimate the derivatives of the height function based on local polynomial fittings formulated as weighted least squares approximations. We also propose an iterative fitting Hongyuan Zha<sup>†</sup> College of Computing Georgia Institute of Technology

often require *ad hoc* fixes to avoid crashing of the code, and their effects on the accuracy of the applications are difficult to analyze.

The ultimate goal of this work is to investigate a mathematically sound framework that can compute the differential quantities consistently (i.e., satisfying the intrinsic constraints) with provable convergence on general surface meshes, while being flexible and easy to implement. This is undoubtly an ambitious goal. Although we may have not fully achieved the goal, we make some contributions toward it. First, using the singular value decomposition [Golub and Van Loan 1996] of the Jacobian matrix, we derive explicit formulas for the transformations between the first- and second-order differential quantities of a smooth surface (i.e., normal vector and curvature matrix) and the first- and second-order derivatives of its corresponding height function (i.e., gradient and Hessian). We also give the explicit formulas for the transformations of the gradient and Hessian under a rotation of the coordinate system. These transformations can be obtained without forming the shape operator and the associated computation of its eigenvalues or eigenvectors. We

#### COMPLETELY DIFFERENT FORMULA

#### Consistent Computation of First- and Second-Order Differential Quantities for Surface Meshes

Xiangmin Jiao\* Dept. of Applied Mathematics & Statistics Stony Brook University Hongyuan Zha<sup>†</sup> College of Computing Georgia Institute of Technology

#### Abstract

Differential quantities, including normals, curvatures, principal directions, and associated matrices, play a fundamental role in geooften require *ad hoc* fixes to avoid crashing of the code, and their effects on the accuracy of the applications are difficult to analyze.

The ultimate goal of this work is to investigate a mathematically sound framework that can compute the differential quantities *con*-

Theorem 3 The mean and Gaussian curvature of the height funcan sis tion  $f(\boldsymbol{u}) : \mathbb{R}^2 \to \mathbb{R}$  are  $\kappa_H = \frac{tr(\boldsymbol{H})}{2\ell} - \frac{(\nabla f)^T \boldsymbol{H}(\nabla f)}{2\ell^3}, \text{ and } \kappa_G = \frac{det(\boldsymbol{H})}{\ell^4}.$ (16) It is the numerical framework to estimate the derivatives of the height is and Hessian under a rotation of the coordinate system. These trans-

function based on local polynomial fittings formulated as weighted least squares approximations. We also propose an iterative fitting scheme to improve accuracy. This framework generalizes polyno and Hessian under a rotation of the coordinate system. These transformations can be obtained without forming the shape operator and the associated computation of its eigenvalues or eigenvectors. We

#### CONSERVED QUANTITY APPROACH

#### Discrete Differential-Geometry Operators for Triangulated 2-Manifolds

Mark Meyer<sup>1</sup>, Mathieu Desbrun<sup>1,2</sup>, Peter Schröder<sup>1</sup>, and Alan H. Barr<sup>1</sup>

<sup>1</sup> Caltech <sup>2</sup> USC

Visualization and Math. III

Summary. This paper proposes a unified and consistent set of flexible tools to approximate important geometric attributes, including normal vectors and curvatures on arbitrary triangle meshes. We present a consistent derivation of these first and second order differential properties using *averaging Voronoi cells* and the mixed Finite-Element/Finite-Volume method, and compare them to existing formulations. Building upon previous work in discrete geometry, these operators are closely related to the continuous case, guaranteeing an appropriate extension from the continuous to the discrete setting: they respect most intrinsic properties of the continuous differential operators. We show that these estimates are optimal in accuracy under mild smoothness conditions, and demonstrate their numerical quality. We also present applications of these operators, such as mesh smoothing, enhancement, and quality checking, and show results of denoising in higher dimensions, such as for tensor images.

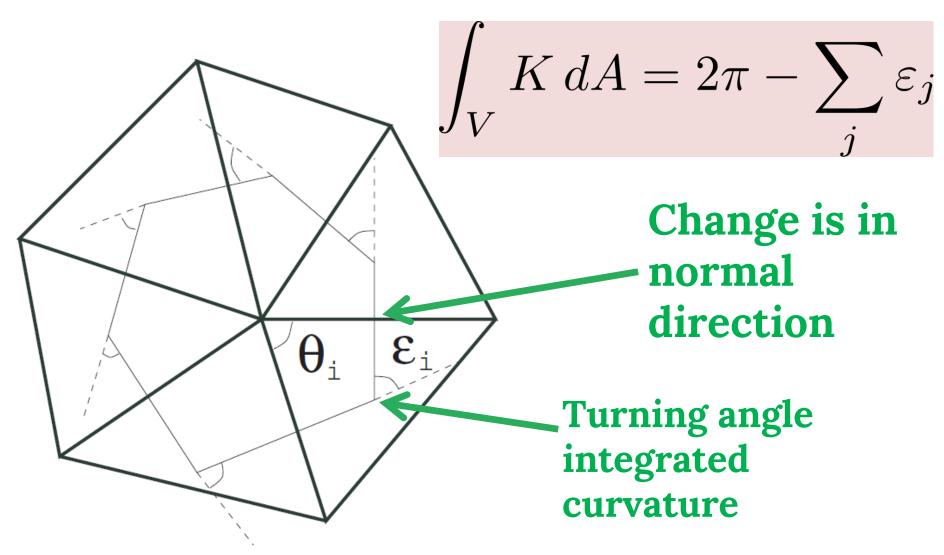
#### DISCRETE DIFFERENTIAL GEOMETRY

Structure preservation:

- Keeping properties from the continuous abstraction exactly true in a discretization.

#### **GAUSS-BONNET THEOREM** Number of boundaries $\int_{M} K dA + \int_{\partial M} k_g ds = 2\pi (\chi(M) - n_b)$ 2-2g Gaussian curvature **Geodesic curvature** (curvature projected on tangent plane)

### FOR POLYGONAL CELLS



#### **FLIP THINGS BACKWARD**

#### **DEFINITION:**

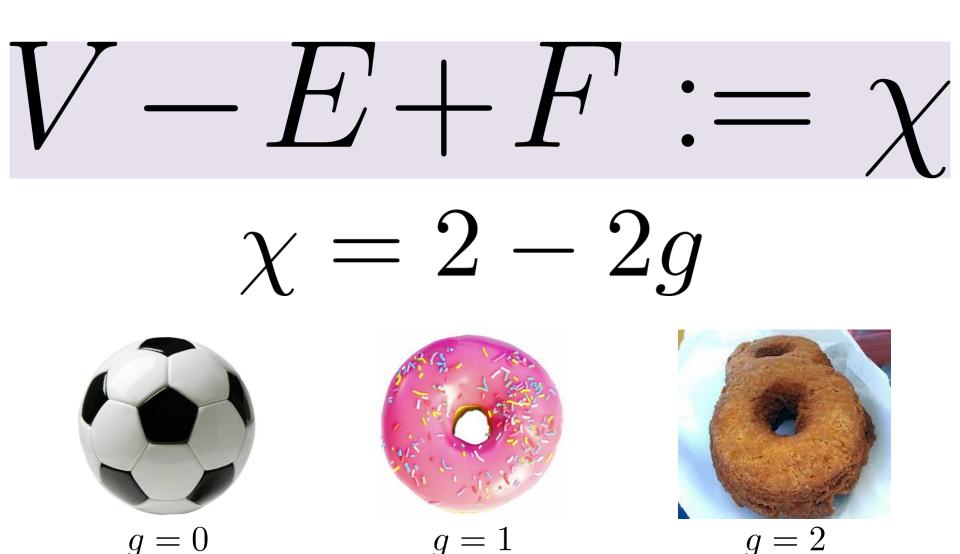
# Gaussian curvature integrated over region V is given by

$$\int_{V} K \, dA = 2\pi - \sum_{j} \theta_{j}$$

Divide by area for curvature estimate

Recall:

### **EULER CHARACTERISTIC**

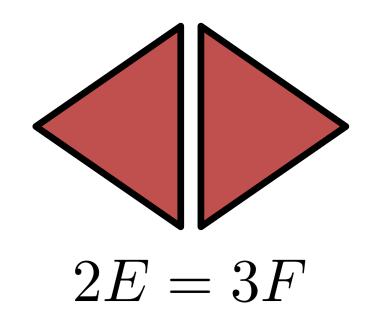




#### CONSEQUENCES FOR TRIANGLE MESHES

-E + E' :=

"Each edge is adjacent to two faces. Each face has three edges."



Closed mesh: Easy estimates!



### CONSEQUENCES FOR TRIANGLE MESHES

 $= \chi$ 

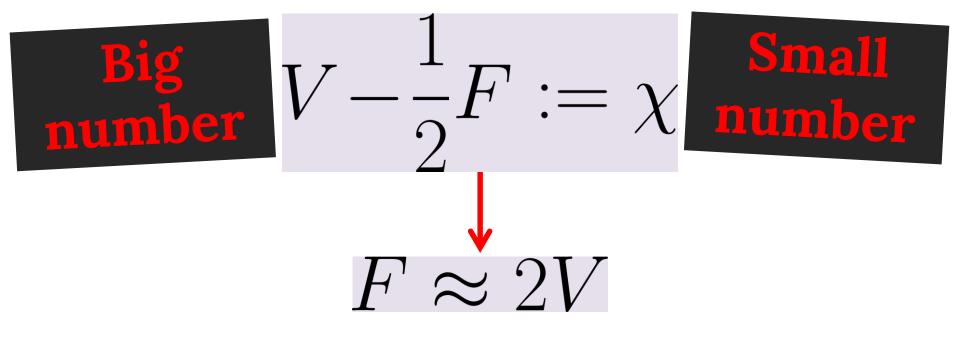
2E = 3F

"Each edge is adjacent to two faces. Each face has three edges."

Closed mesh: Easy estimates!



### CONSEQUENCES FOR TRIANGLE MESHES



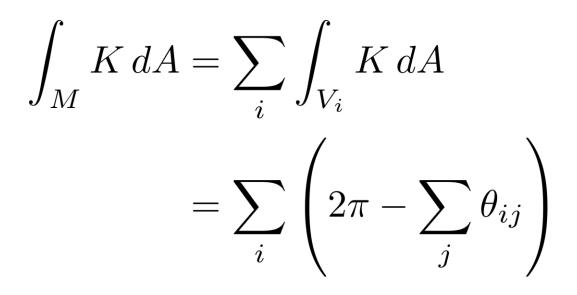
## Closed mesh: Easy estimates!

#### **DISCRETE GAUSS-BONNET**

$$\int_{M} K \, dA = \sum_{i} \int_{V_{i}} K \, dA$$

#### Partition the surface

### **DISCRETE GAUSS-BONNET**



## Apply our definition

#### **DISCRETE GAUSS-BONNET**

 $\int_{M} K \, dA = \sum_{i} \int_{V_{i}} K \, dA$  $=\sum_{i}\left(2\pi-\sum_{j}\theta_{ij}\right)$  $= 2\pi V - \sum_{ij} \theta_{ij}$ 

Pull out constants

# **DISCRETE GAUSS-BONNET**

 $\int_{M} K \, dA = \sum_{i} \int_{V_i} K \, dA$  $=\sum_{i}\left(2\pi-\sum_{j}\theta_{ij}\right)$  $= 2\pi V - \sum \theta_{ij}$  $=2\pi V-\pi F$ 

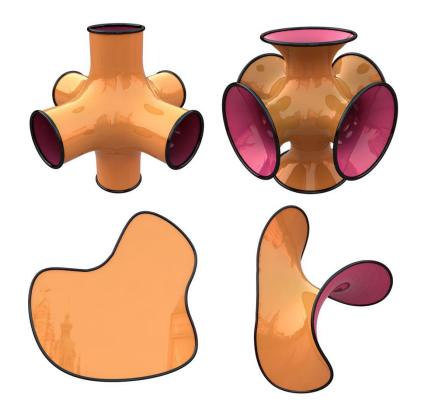
Consider sum over triangles

# **DISCRETE GAUSS-BONNET**

 $\int_{M} K \, dA = \sum_{i} \int_{V_i} K \, dA$  $=\sum_{i}\left(2\pi-\sum_{j}\theta_{ij}\right)$  $= 2\pi V - \sum \theta_{ij}$  $=2\pi V-\pi F$ By definition  $= \pi(2V - F)$  $= 2\pi\chi \quad <qed/>$ 

### MEAN CURVATURE NORMAL

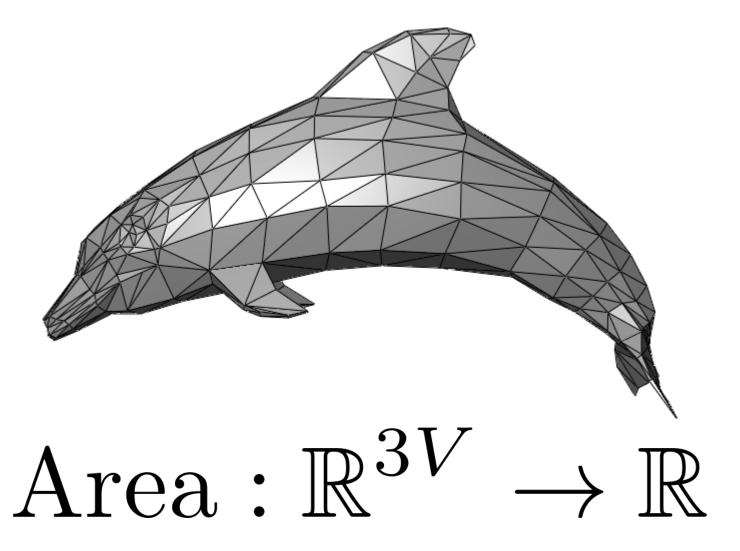
 $E(M) = \operatorname{Area}(M)$   $\nabla E(p) = H\vec{n}$ "Variational derivative"



#### $\nabla E(p) \equiv 0 \ \forall p \in \text{int } M$ Minimal surfaces

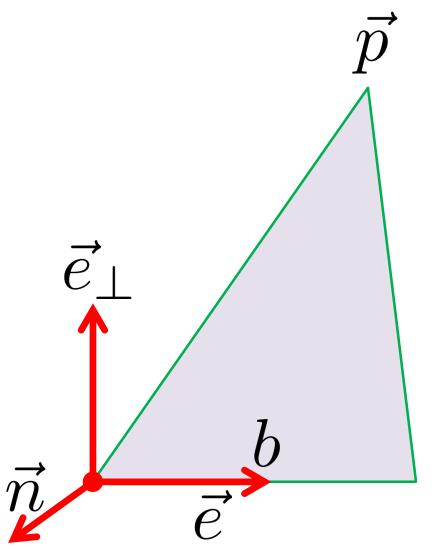
Image courtesy K. Crane

### AREA FUNCTIONAL FOR MESHES



http://upload.wikimedia.org/wikipedia/commons/f/fb/Dolphin\_triangle\_mesh.png

# SINGLE TRIANGLE

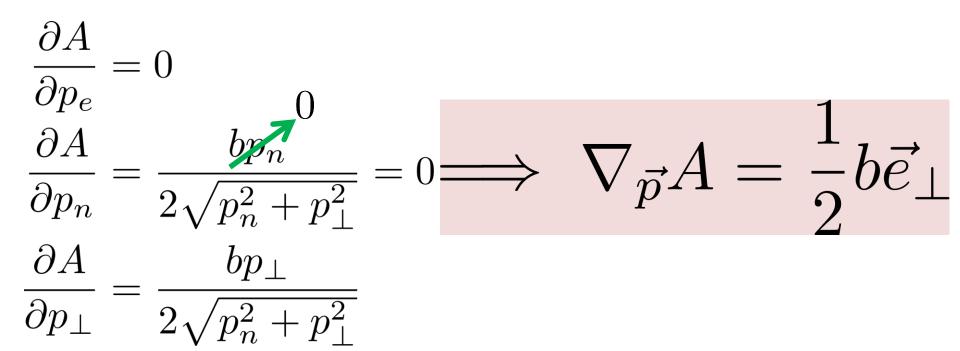


 $\vec{p} = p_n \vec{n} + p_e \vec{e} + p_\perp \vec{e}_\perp$  $=\frac{1}{2}b\sqrt{p_n^2+p_\perp^2}$ 

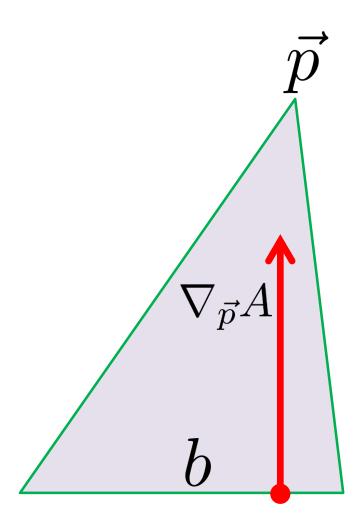
As a function of  $\vec{p}$ 

### SINGLE TRIANGLE: DERIVATIVES

$$\vec{p} = p_n \vec{n} + p_e \vec{e} + p_\perp \vec{e}_\perp$$
$$A = \frac{1}{2} b \sqrt{p_n^2 + p_\perp^2}$$

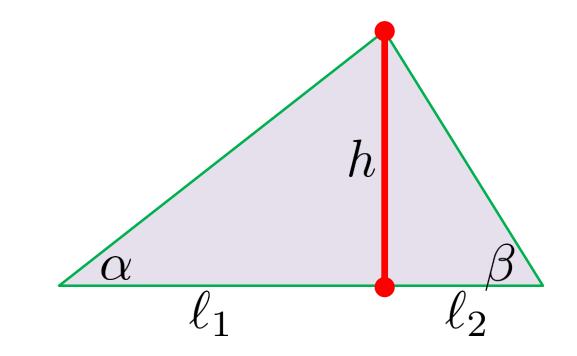


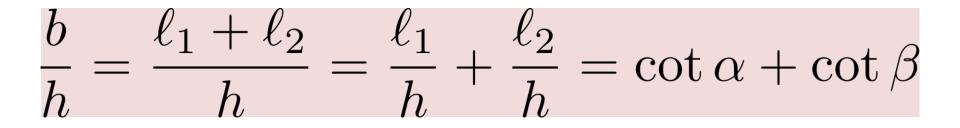
### SINGLE TRIANGLE: COMPLETE



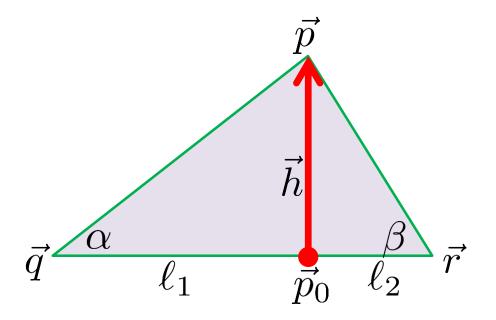
 $\vec{p} = p_n \vec{n} + p_e \vec{e} + p_\perp \vec{e}_\perp$  $A = \frac{1}{2}b\sqrt{p_n^2 + p_\perp^2}$  $\nabla_{\vec{p}}A = \frac{1}{2}b\vec{e}_{\perp}$ 

# **RATIO OF BASE TO HEIGHT**

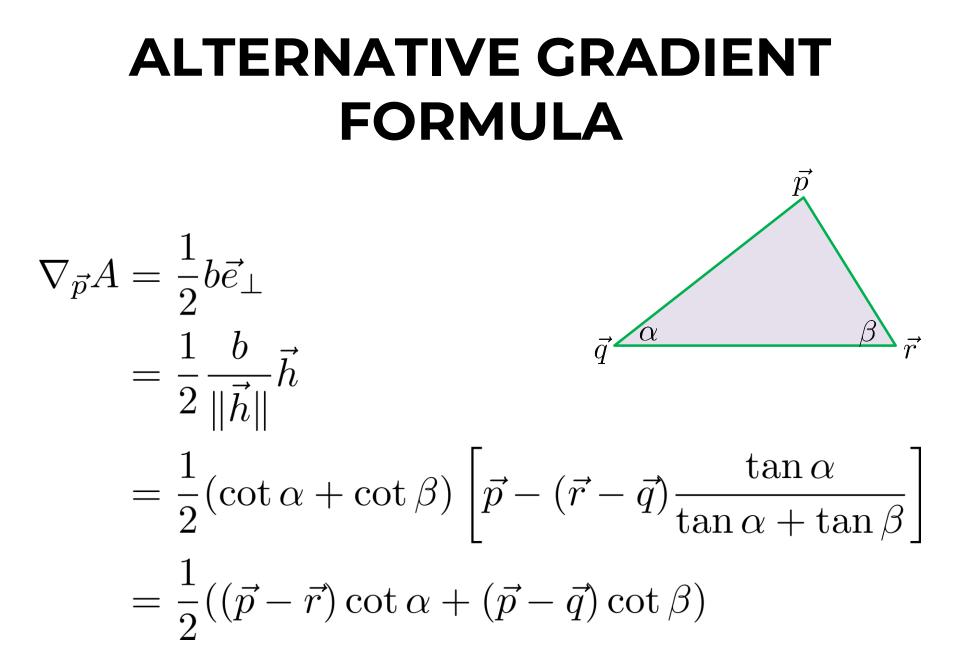




# **HEIGHT VECTOR**

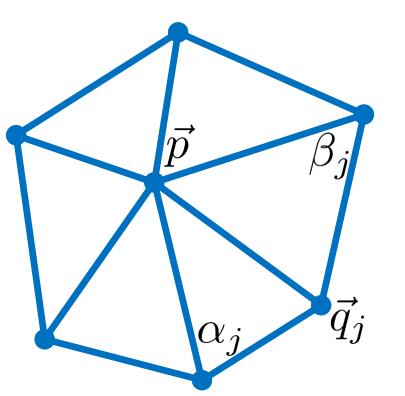


$$\vec{h} = \vec{p} - \vec{p_0} = \vec{p} - (\vec{r} - \vec{q}) \frac{\tan \alpha}{\tan \alpha + \tan \beta}$$



### **SUMMING AROUND A VERTEX**

$$\nabla_{\vec{p}}A = \frac{1}{2}\sum_{j} (\cot\alpha_j + \cot\beta_j)(\vec{p} - \vec{q}_j)$$



$$\nabla_{\vec{p}}A = \frac{1}{2}((\vec{p} - \vec{r})\cot\alpha + (\vec{p} - \vec{q})\cot\beta)$$

Vanishes as you refine the mesh

# INTEGRATED MEAN CURVATURE NORMAL

# **DEFINITION:**

The mean curvature normal integrated over region V is given by

$$\nabla_{\vec{p}}A = \frac{1}{2} \sum_{j} (\cot \alpha_j + \cot \beta_j) (\vec{p} - \vec{q}_j)$$

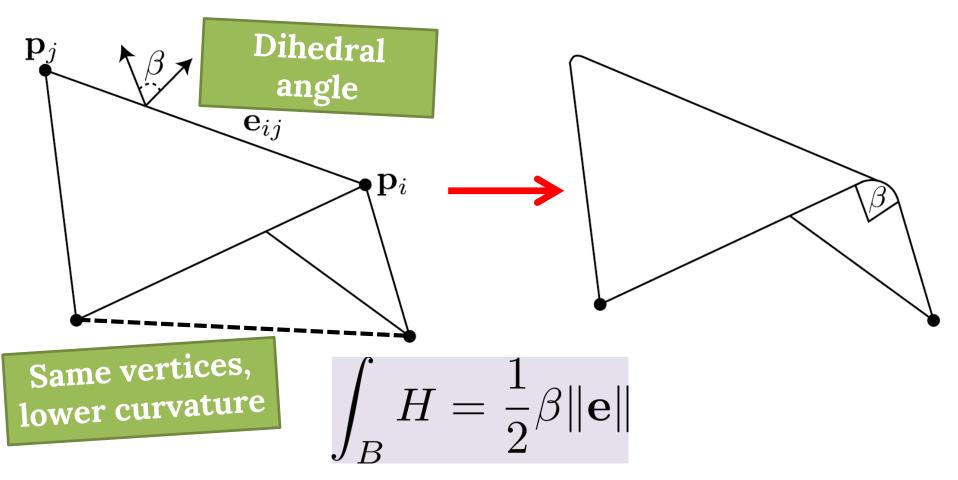
Divide by area for curvature estimate

# PIPELINE

# • Compute integrated H, K

# • Divide by area of cell for estimated value

# **ANOTHER MEAN CURVATURE**



J.A. Bærentzen et al., Guide to Computational Geometry Processing (2012)

# Used for triangulation applications

# TUNED FOR VARIATIONAL APPLICATIONS

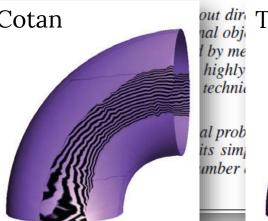
#### **Computing discrete shape operators on general meshes**

Eitan Grinspun Columbia University eitan@cs.columbia.edu Yotam Gingold New York University gingold@mrl.nyu.edu Jason Reisman New York University jasonr@mrl.nyu.edu Denis Zorin New York University dzorin@mrl.nyu.edu

#### Abstract

Discrete curvature and shape operators, which c are essential in a variety of applications: simulat geometric data processing. In many of these appl approaches for formulating curvature operators expensive methods used in engineering applicatio computer graphics.

We propose a simple and efficient formulation for degrees of freedom associated with normals. On curvature operators commonly used in graphics; and produces consistent results for different types





# **TUNED FOR ROBUSTNESS**

Eurographics Symposium on Geometry Processing (2007) Alexander Belyaev, Michael Garland (Editors)

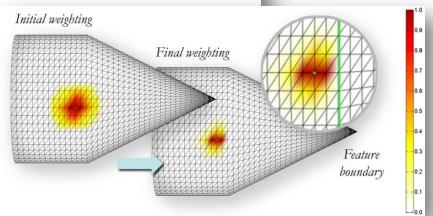
#### Robust statistical estimation of curvature on discretized surfaces

Evangelos Kalogerakis, Patricio Simari, Derek Nowrouzezahrai and Karan Singh

Dynamic Graphics Project, Computer Science Department, University of Toronto

#### Abstract

A robust statistics approach to curvature estimation on discretely sample point clouds, is presented. The method exhibits accuracy, stability and sampled surfaces with irregular configurations. Within an M-estimation noise and structured outliers by sampling normal variations in an ad each point. The algorithm can be used to reliably derive higher order de surface normals while preserving the fine features of the normal and de with state-of-the-art curvature estimation methods and shown to improv across ground truth test surfaces under varying tessellation densities noise. Finally, the benefits of a robust statistical estimation of curvature applications of mesh segmentation and suggestive contour rendering.



Categories and Subject Descriptors (according to ACM CCS): I.3.5 [Computational Geometry and Object Modeling]: Geometric algorithms, languages, and systems; curve, surface, solid, and object representations.

# **ALTERNATIVE STRATEGIES**

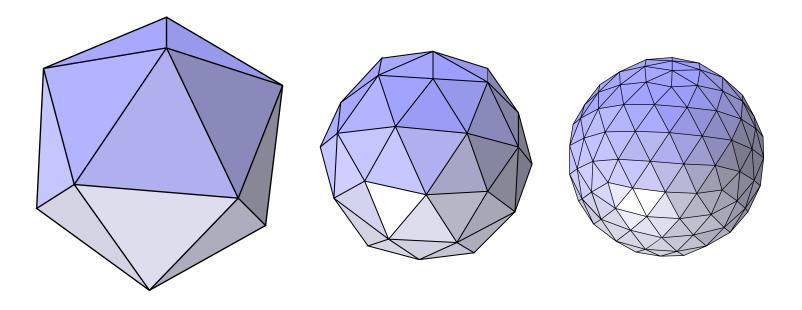
• Locally fit a smooth surface What type of surface? How to fit?

- Different formula Function of curvature? Where on mesh? Convergence of approximation?
- Learn curvature computation Tune for application? Training data?

# **PRACTICAL ADVICE**

# Try as many as you can. Most are easy to implement!

### **ASSIGNMENT: SUBDIVISION**

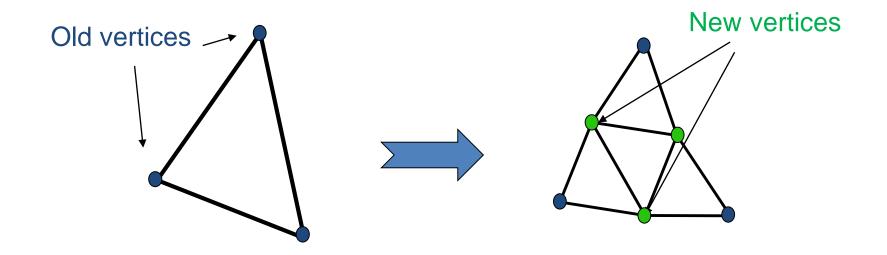


# **ASSIGNMENT: SUBDIVISION**

- Each iteration
  - Subdivision refines mesh

- Converges
- Questions:
  - Where to place new vertices?
  - How to connect them?

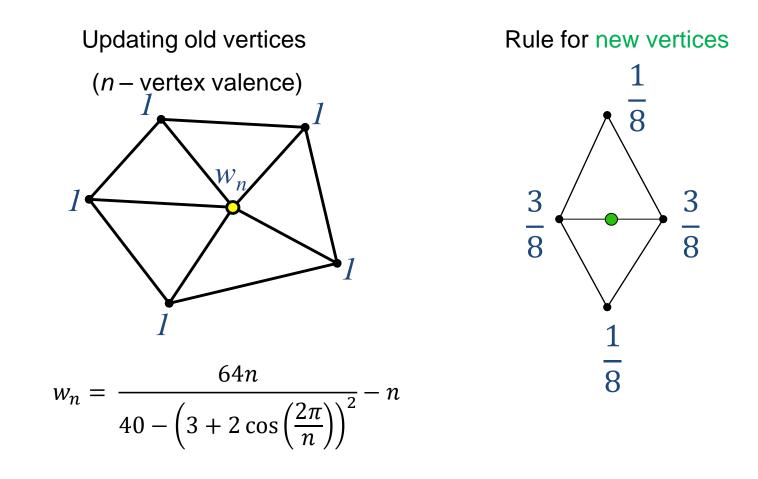
# **TRIANGULAR SUBDIVISION**



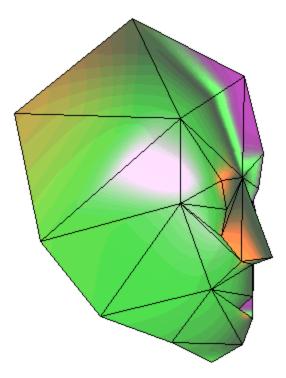
- Every face replaced by 4 new triangular faces
- Insert new vertices (one per old edge)
  Green vertices are associated with old edges
- Update positions of old vertices

# LOOP'S SCHEME

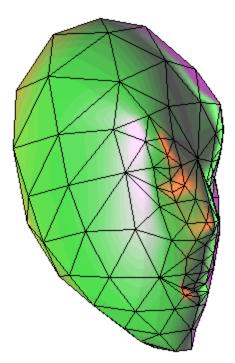
• List of weights called subdivision <u>mask</u> or <u>stencil</u>



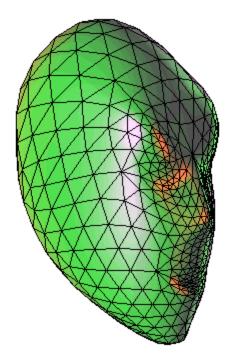
# The original control net



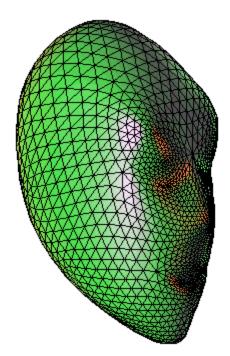
# After 1st iteration

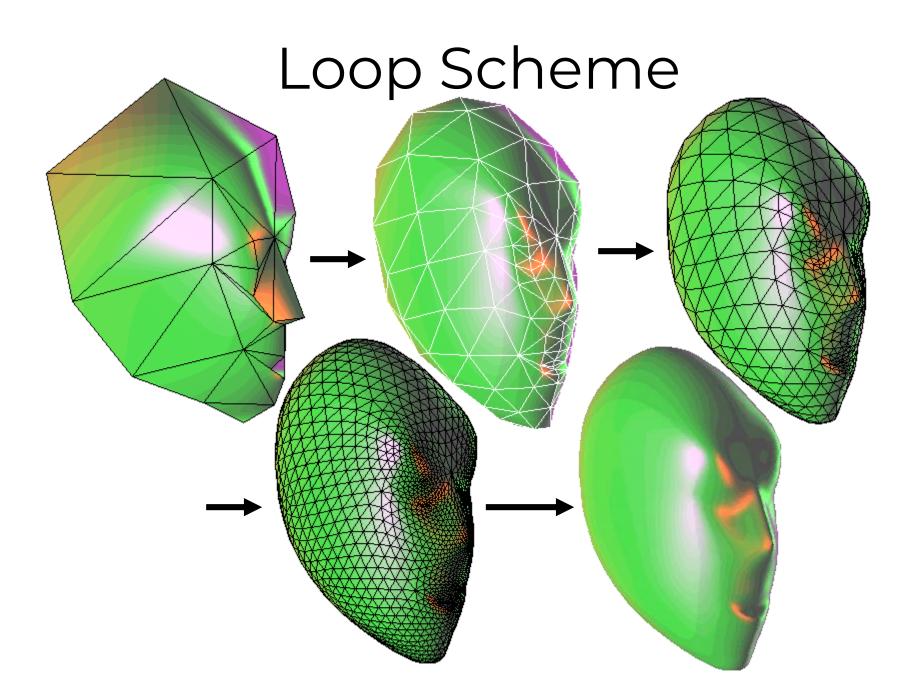


# After 2nd iteration

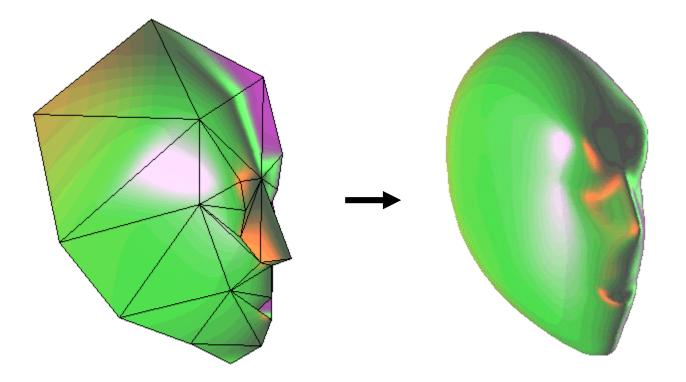


# After 3rd iteration





# Loop Limit Surface



#### Limit surface is C<sup>2</sup> almost everywhere