252-0538-00L, Spring 2018

# Shape Modeling and Geometry Processing

**Discrete Differential Geometry** 

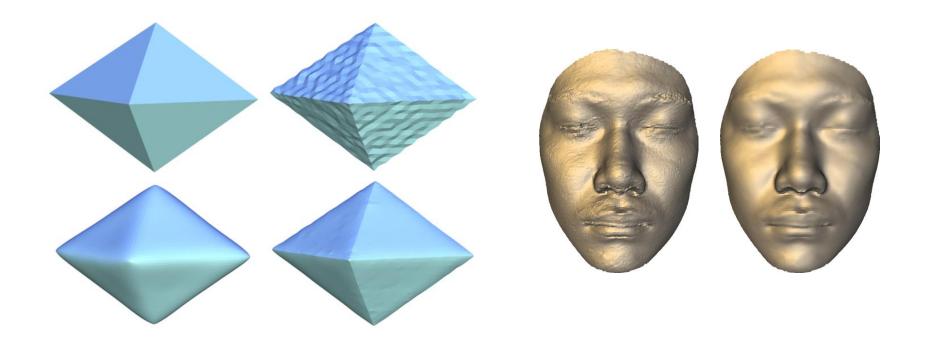


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Formalize geometric properties of shapes

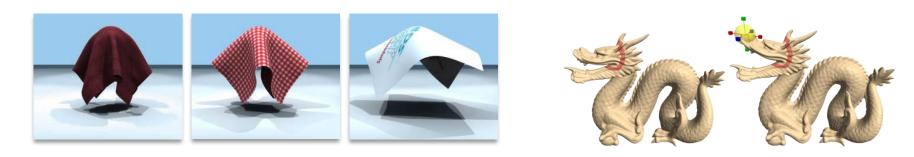


#### Formalize geometric properties of shapes Smoothness





#### Formalize geometric properties of shapes Smoothness Deformation





Roi Poranne

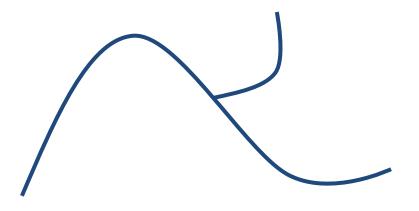
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# Formalize geometric properties of shapes **Smoothness** Deformation **Mappings**

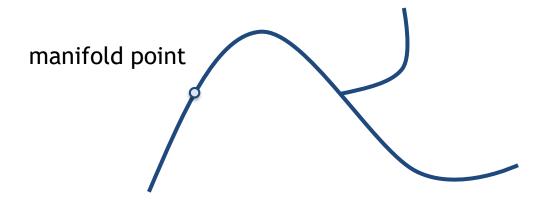
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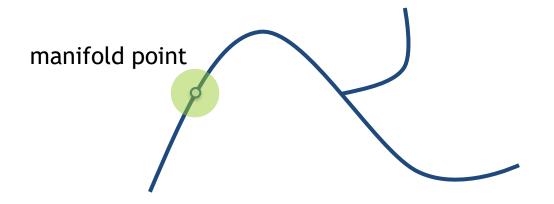
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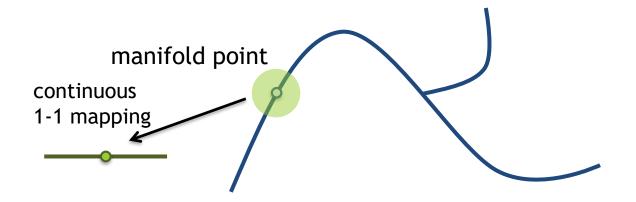




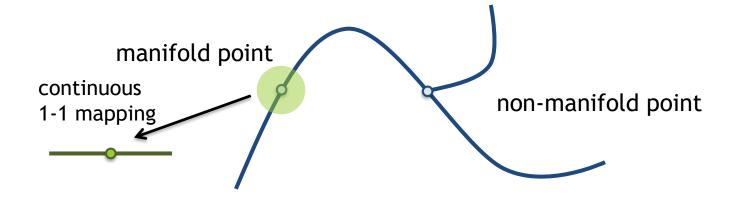






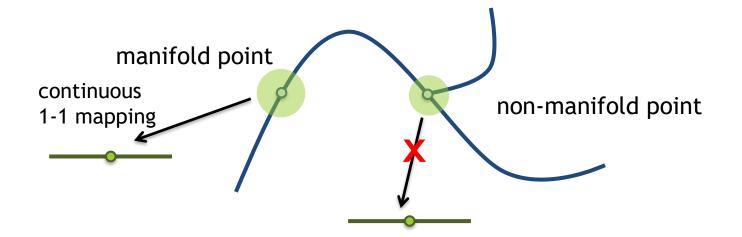


## Geometry of manifolds Things that can be explored locally point + neighborhood



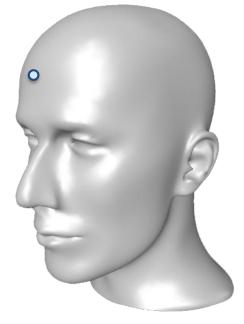
#10

## Geometry of manifolds Things that can be explored locally point + neighborhood

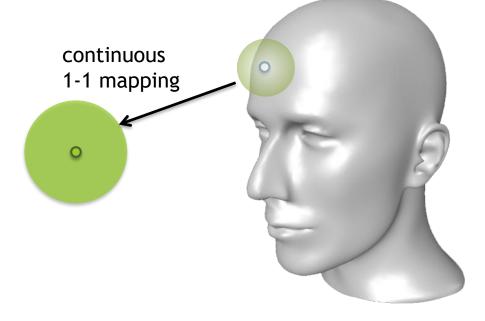


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## Geometry of manifolds Things that can be explored locally point + neighborhood

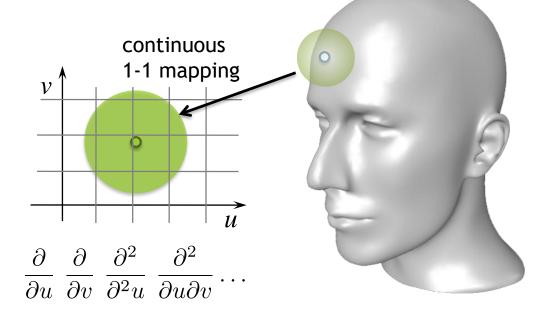








## Geometry of manifolds Things that can be explored locally point + neighborhood



If a sufficiently smooth mapping can be constructed, we can look at its first and second derivatives

Tangents, normals, curvatures, curve angles

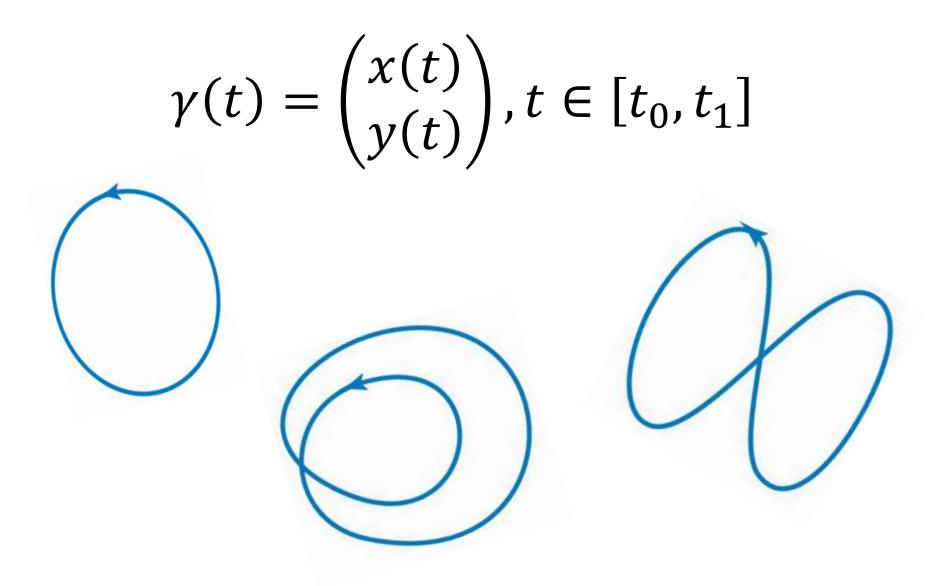
Distances, topology



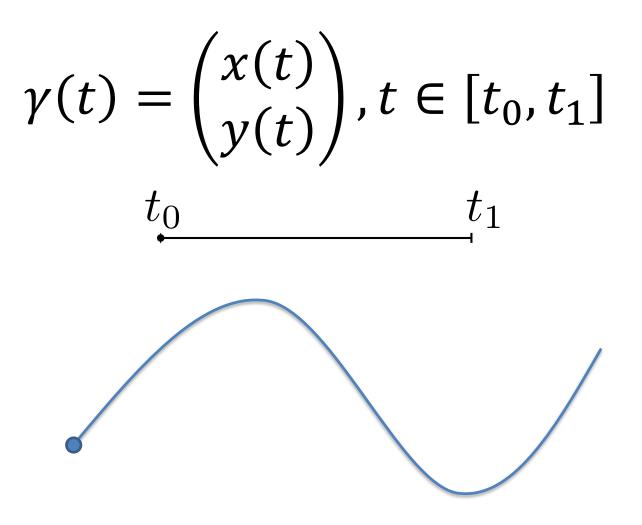
# Differential Geometry of Curves



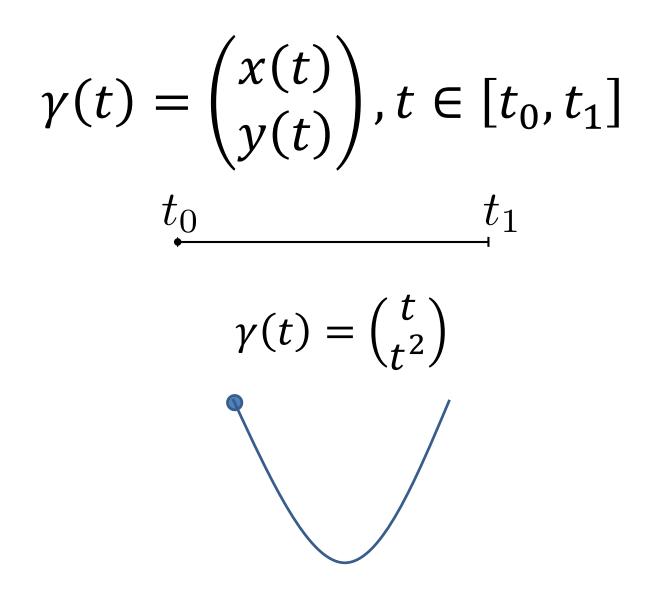
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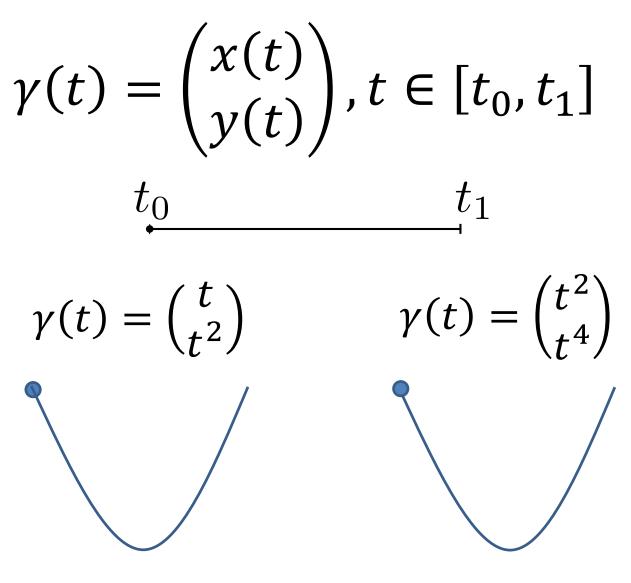














# Arc Length Parameterization

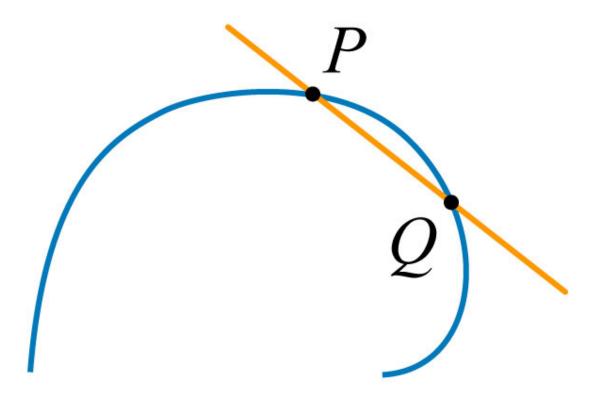
Same curve has many parameterizations! Arc-length: equal speed of the parameter along the curve

$$L(\gamma(t_1), \gamma(t_2)) = |t_1 - t_2|$$

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#### Secant

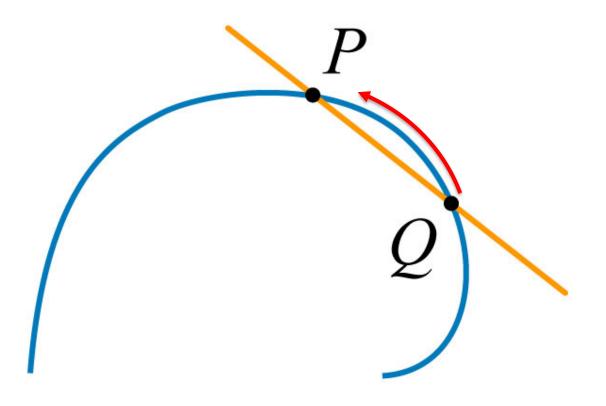
#### A line through two points on the curve.





#### Secant

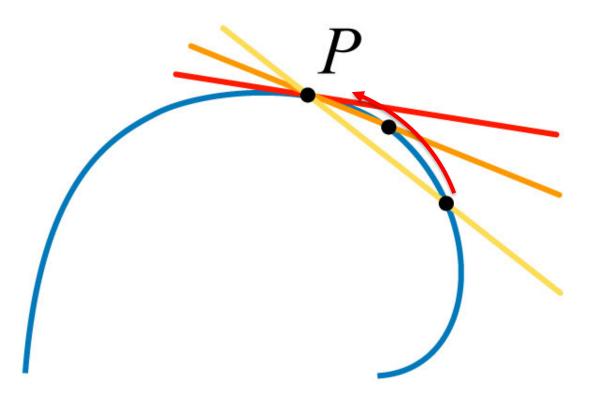
#### A line through two points on the curve.





#### Secant

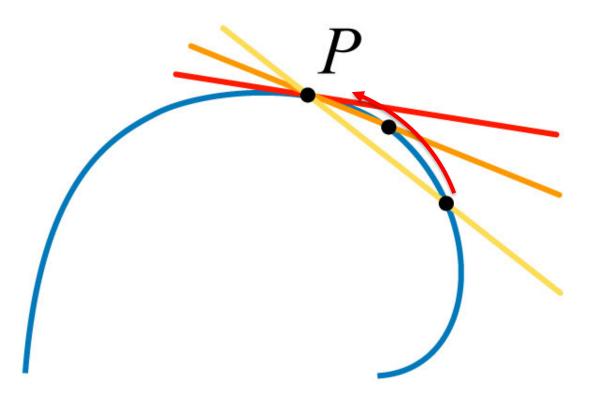
#### A line through two points on the curve.





# Tangent

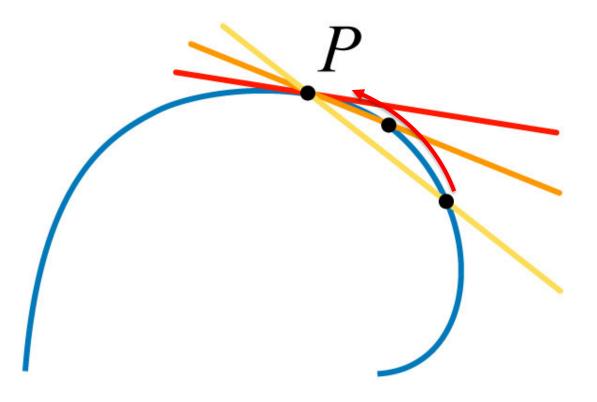
#### A line through two points on the curve.





# Tangent

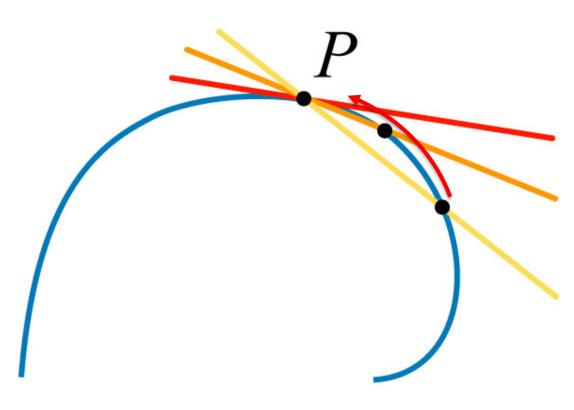
#### The limit secant as two points come together.





#### Secant and Tangent

## Secant: line through p(P) - p(Q)Tangent: $\gamma'(P) = (x'(P), y'(P), ...)^T$

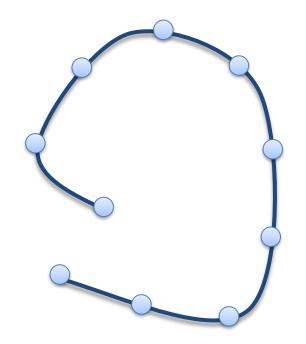




# Arc Length Parameterization

Same curve has many parameterizations! Arc-length: equal speed of the parameter along the curve

$$L(\gamma(t_1), \gamma(t_2)) = |t_1 - t_2|$$
  
 $||\gamma'(t)|| =$ 





# Arc Length Parameterization

Same curve has many parameterizations! Arc-length: equal speed of the parameter along the curve

 $L(\gamma)$  What it  $\gamma(t)$  is not arc length?

 $\|\gamma'(t)\| =$ 



#### Arc Length Parameterization Re

Curve Reparamterization

 $\gamma(t) \longrightarrow \gamma(p(t))$   $p: [t_0, t_1] \rightarrow [t_0, t_1]$   $p'(t) \neq 0$ Arc length reparamterization  $\|\gamma'(p(t))\| = 1$ 



#### Arc Length Parameterization Re

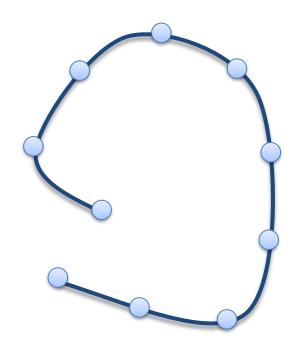
Arc length reparamterization

$$\left\|\gamma'(p(t))\right\| = 1$$

Let  

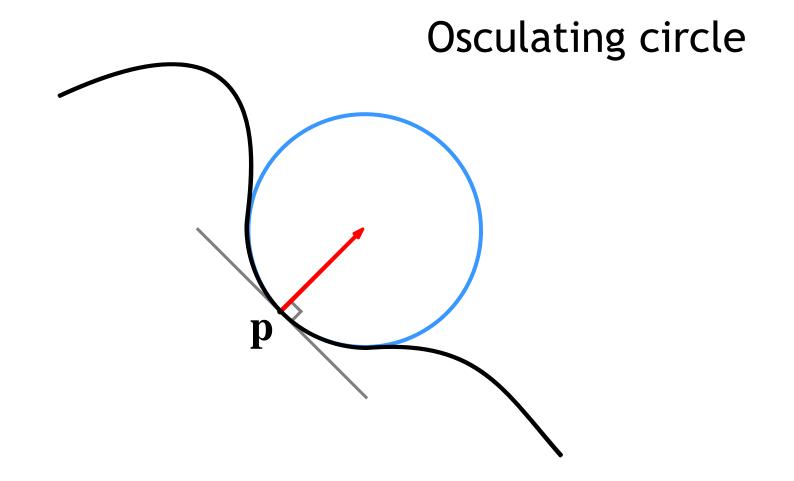
$$q(t) = \int_{t0}^{t} ||\gamma'(t)||$$
Then  

$$p(t) = q^{-1}(t)$$



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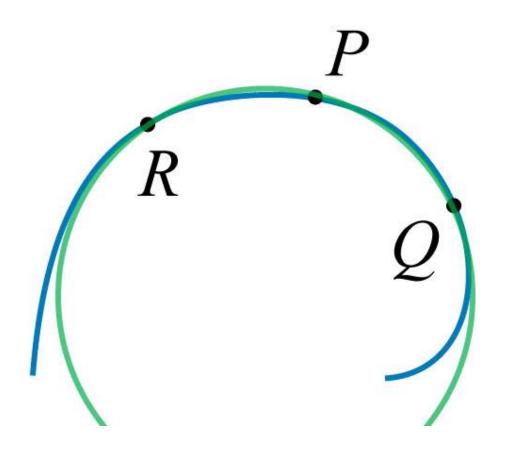
#### Tangent, normal, curvature





#### Curvature

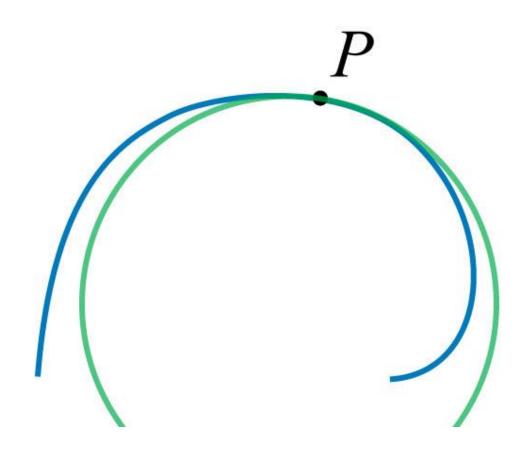
#### Circle through three points on the curve





#### Curvature

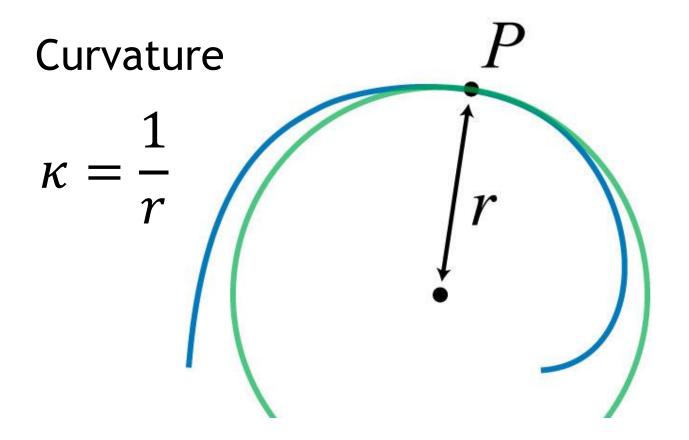
#### The limit circle as points come together.





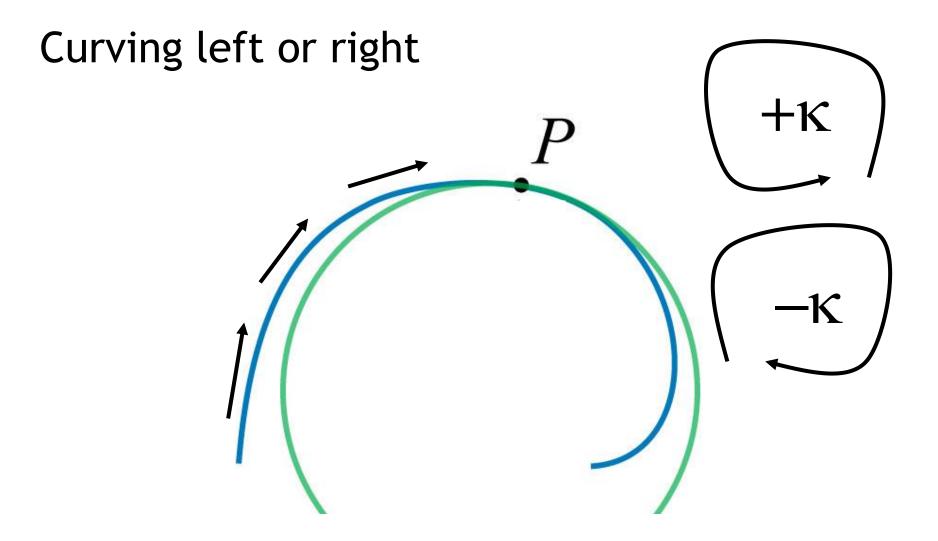
## Curvature

The limit circle as points come together.





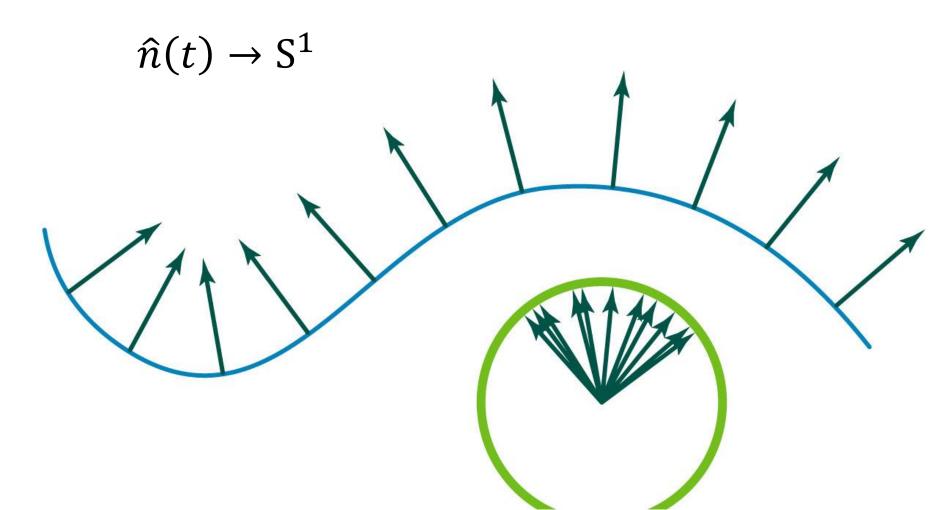
# Signed Curvature





Gauss map  $\hat{n}(t)$ 

Point on curve maps to point on unit circle.



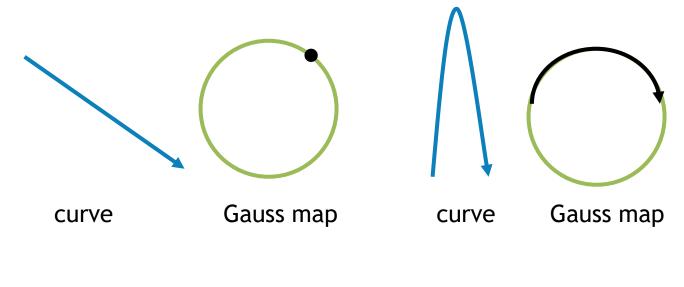
# Curvature = change in normal direction

Absolute curvature (assuming arc length)

$$\kappa = \|\mathbf{\hat{n}}'(t)\|$$

via the Gauss map

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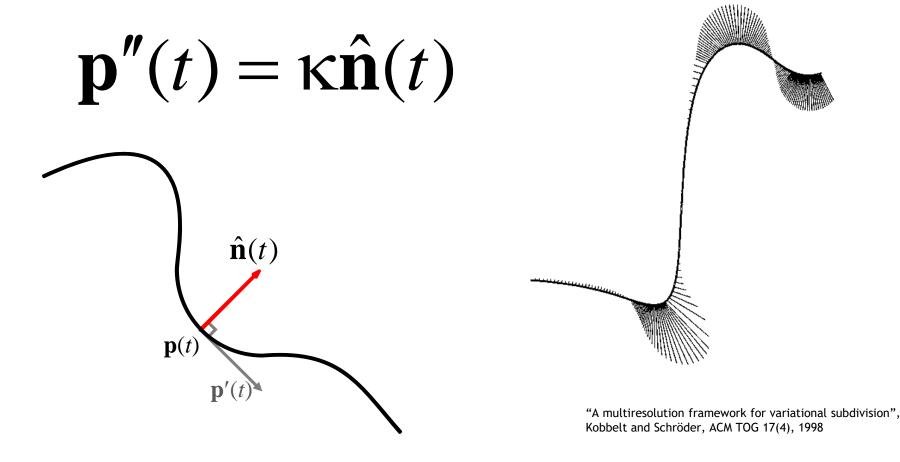


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# **Curvature Normal**

Assume t is arc-length parameter

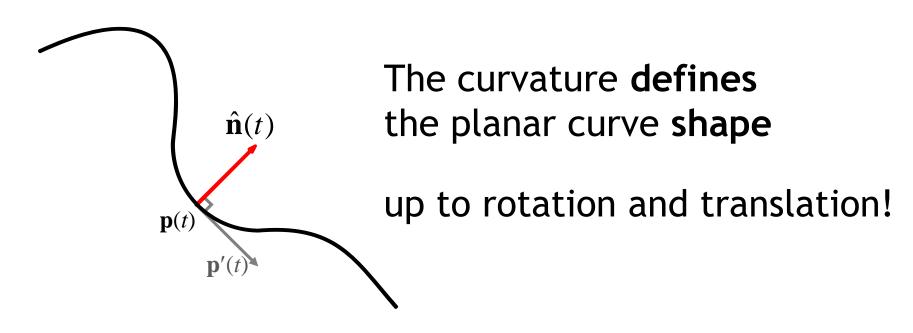




# **Curvature Normal**

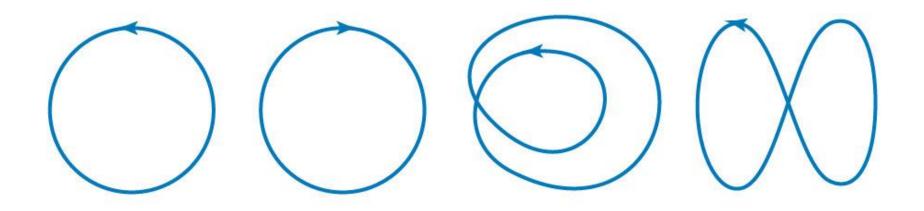
Assume t is arc-length parameter

$$\mathbf{p}''(t) = \kappa \hat{\mathbf{n}}(t)$$



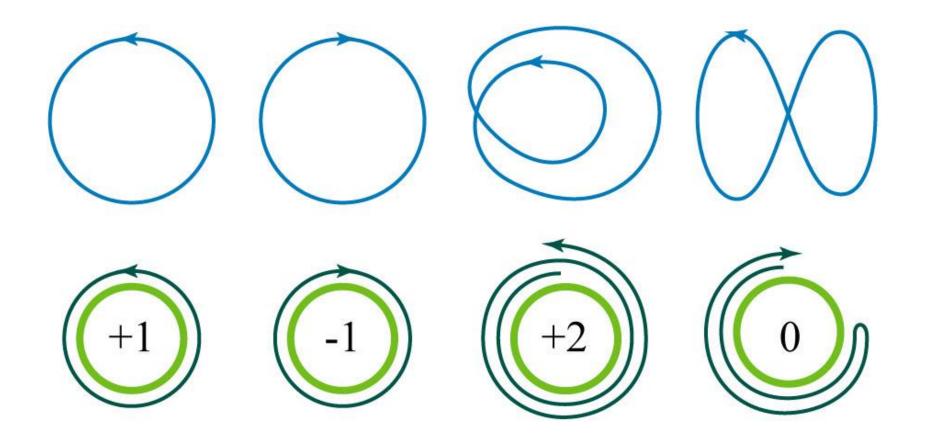


## Turning Number, k





## Turning Number, k

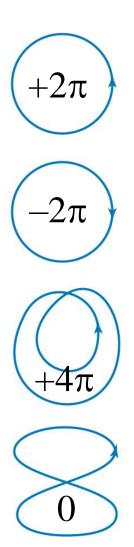




## **Turning Number Theorem**

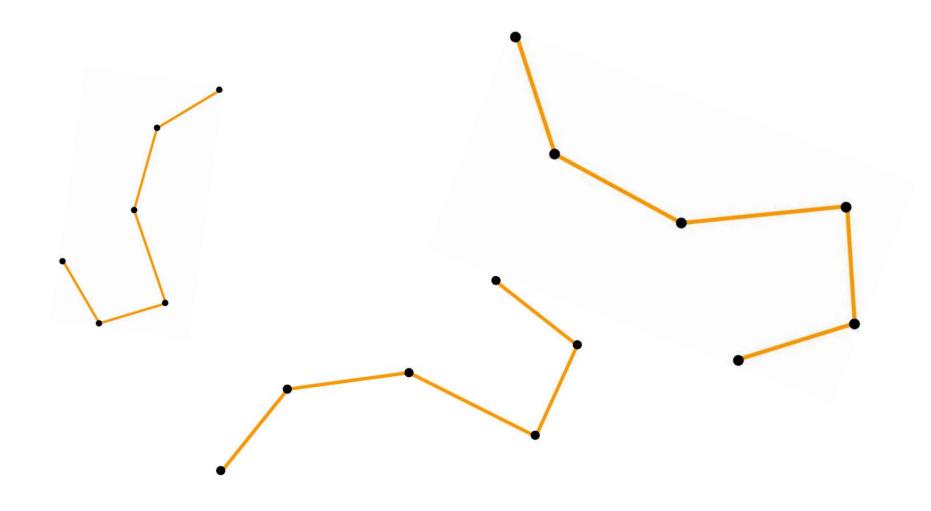
 $\int \kappa \, dt = 2\pi k$ 

For a closed curve, the integral of curvature is an integer multiple of  $2\pi$ .





## **Discrete Planar Curves**



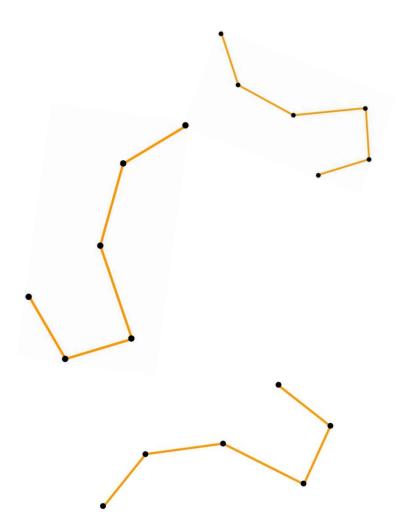
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## **Discrete Planar Curves**

Piecewise linear curves Not smooth at vertices Can't take derivatives

Goal :Generalize notions From the smooth world for the discrete case

There is no one single way!



# Sampling

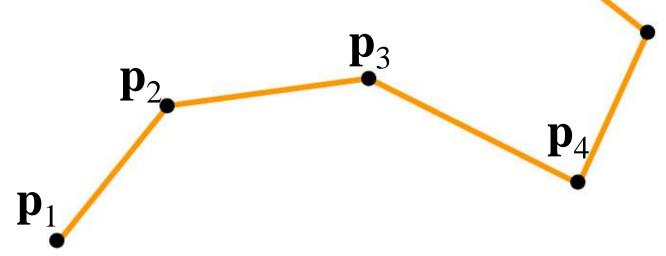
Connection between discrete and smooth Finite number of vertices each lying on the curve, connected by straight edges.

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## The Length of a Discrete Curve

$$len(p) = \sum_{i=1}^{n-1} \|\mathbf{p}_{i+1} - \mathbf{p}_i\|$$

#### Sum of edge lengths

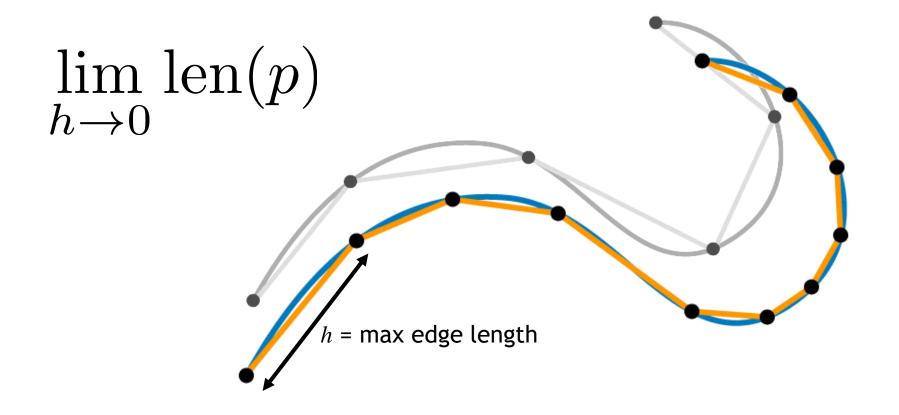






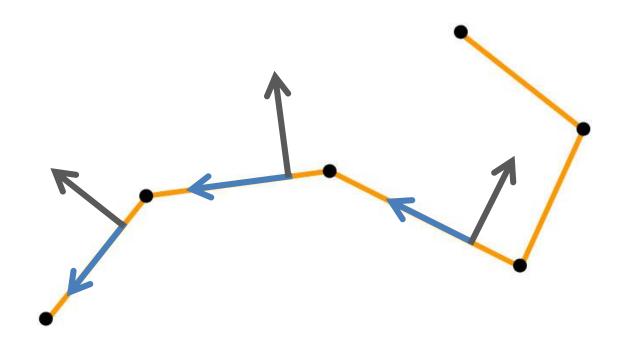
# The Length of a Continuous Curve

limit over a refinement sequence



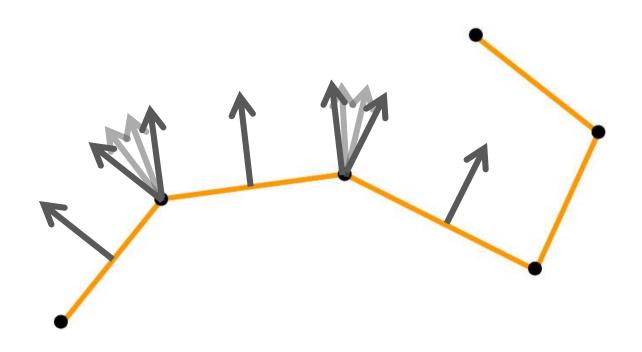


## Tangents, Normals On edges tangent is the unit vector along edge normal is the perpendicular vector





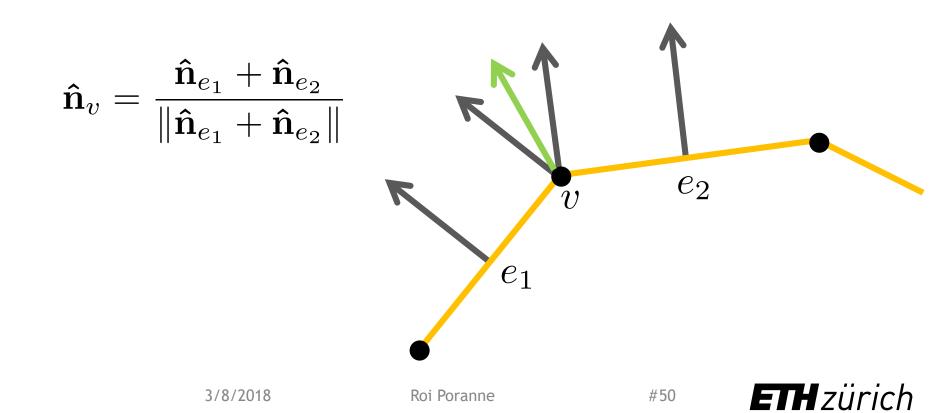
Many options...





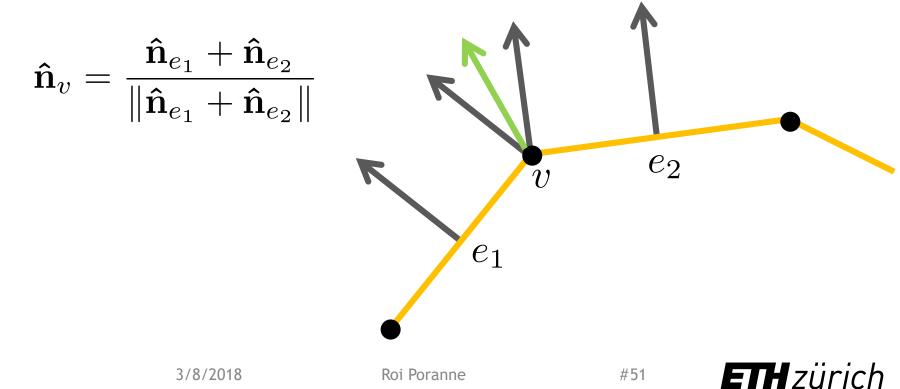
#### Many options...

Average the adjacent edge normals



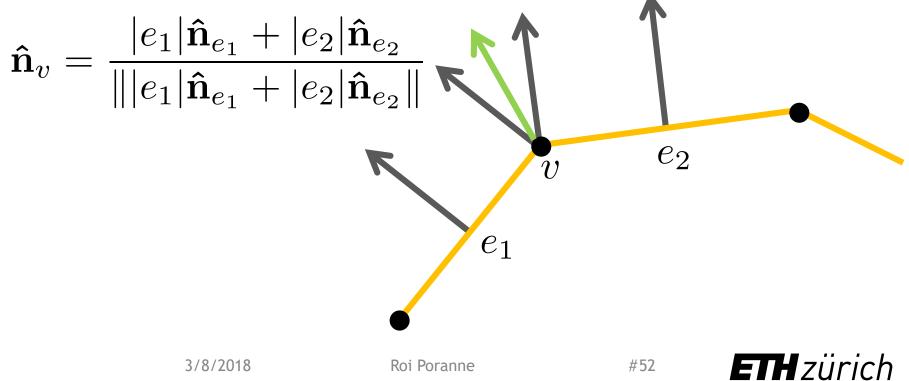
Many options...

Average the adjacent edge normals Weighting by edge lengths



Many options...

Average the adjacent edge normals Weighting by edge lengths



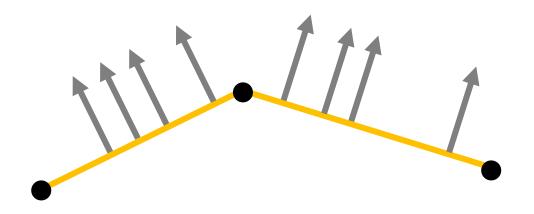
Many options...

Average the adjacent edge normals Weighting by edge lengths

$$\hat{\mathbf{n}}_{v} = \frac{|e_{1}|\hat{\mathbf{n}}_{e_{1}} + |e_{2}|\hat{\mathbf{n}}_{e_{2}}}{\||e_{1}|\hat{\mathbf{n}}_{e_{1}} + |e_{2}|\hat{\mathbf{n}}_{e_{2}}\|}$$

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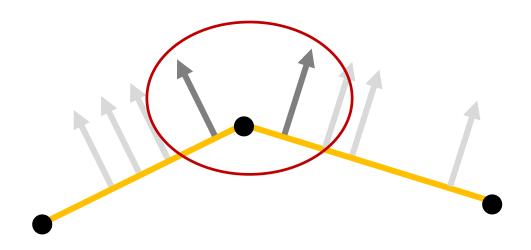
### Again: change in normal direction



no change along each edge curvature is zero along edges



## Again: change in normal direction

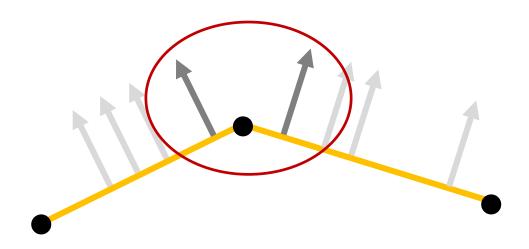


#### no change along each edge curvature is zero along edges

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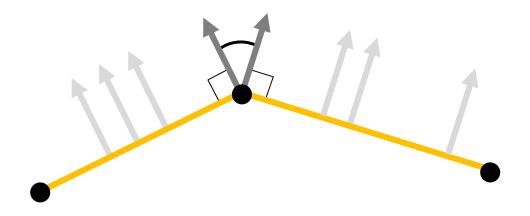
## Again: change in normal direction



normal changes at vertices - record the turning angle!



## Again: change in normal direction

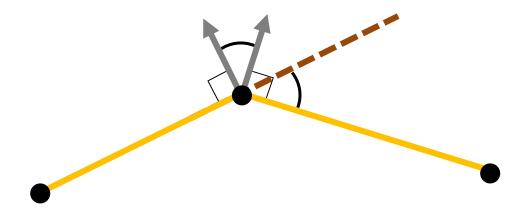


normal changes at vertices - record the turning angle!

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## Again: change in normal direction

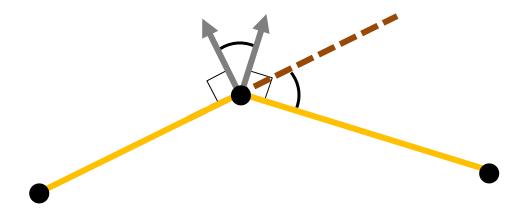


normal changes at vertices - record the turning angle!

3/8/2018



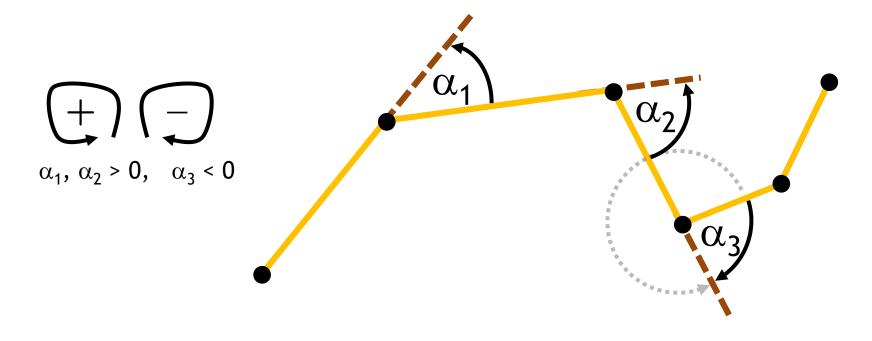
## Again: change in normal direction



same as the turning angle between the edges

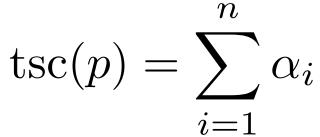


## Zero along the edges Turning angle at the vertices = the change in normal direction

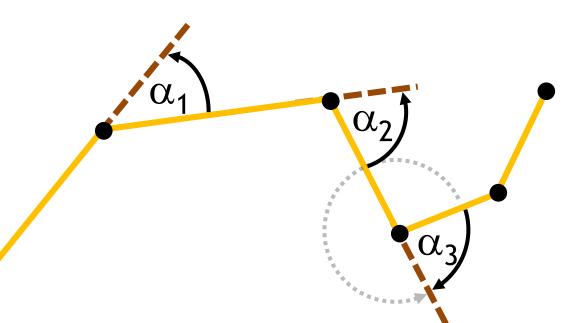


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## **Total Signed Curvature**



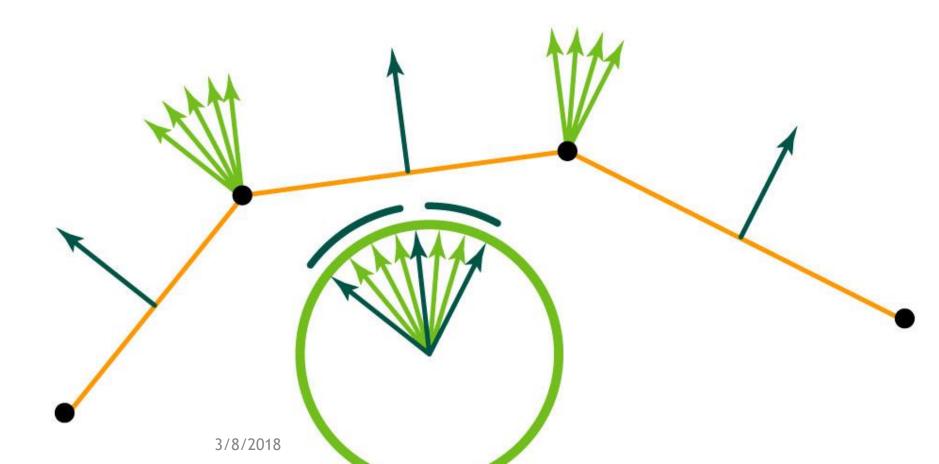
# Sum of turning angles





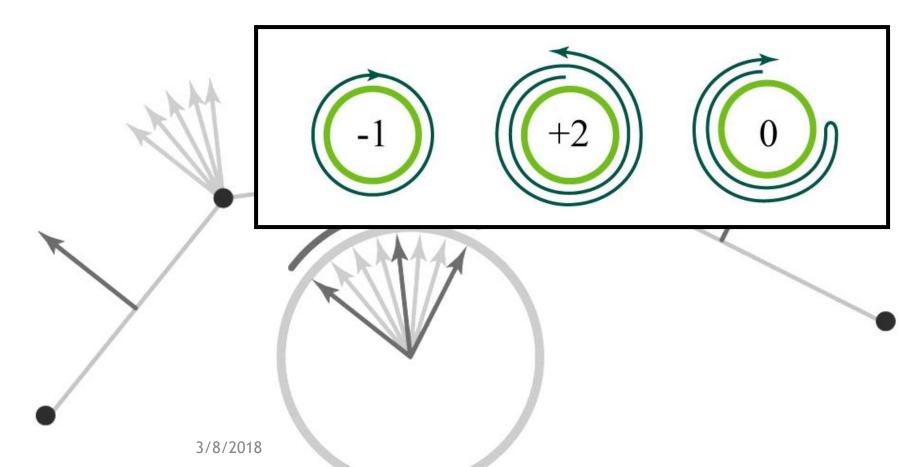
## **Discrete Gauss Map**

Edges map to points, vertices map to arcs.



## **Discrete Gauss Map**

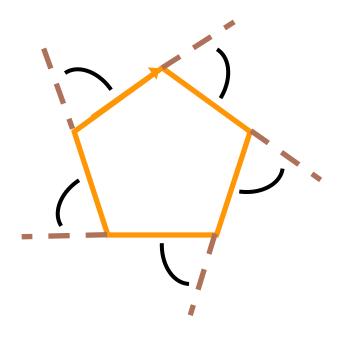
# Turning number well defined for discrete curves.



## **Discrete Turning Number Theorem**

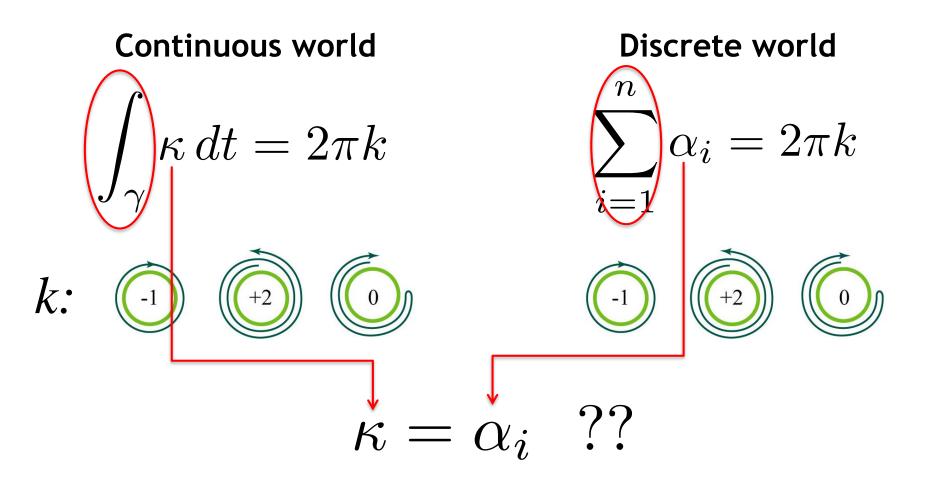
$$\operatorname{tsc}(p) = \sum_{i=1}^{n} \alpha_i = 2\pi k$$

For a closed curve, the total signed curvature is an integer multiple of  $2\pi$ . proof: sum of exterior angles

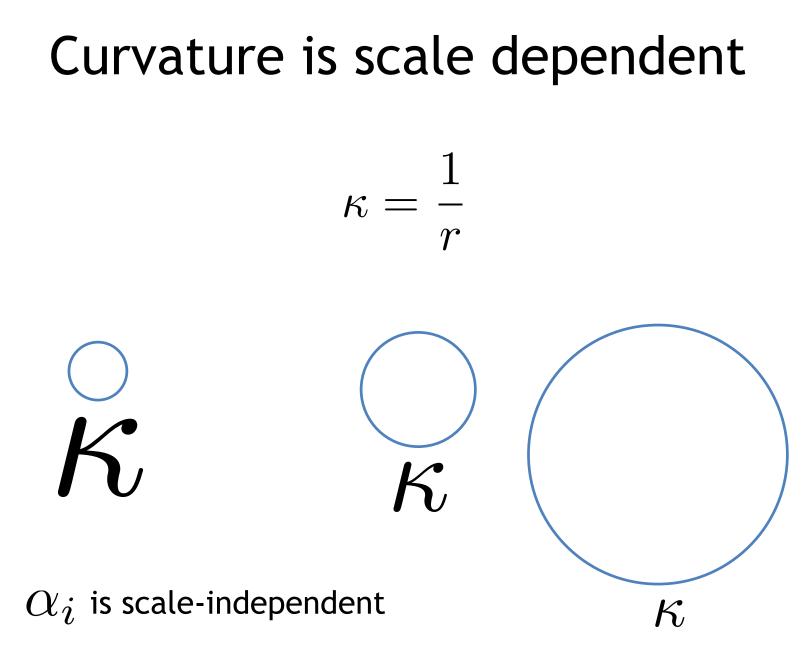




## **Turning Number Theorem**



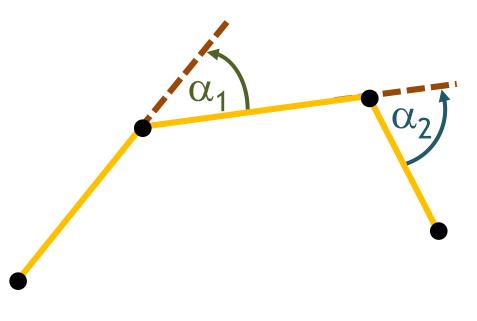






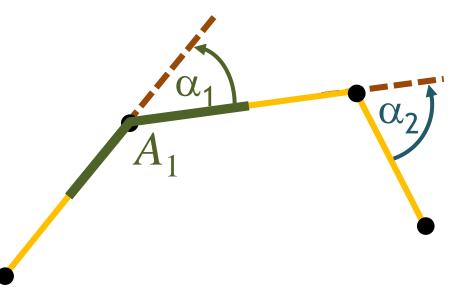
Cannot view  $\alpha_i$  as pointwise curvature

It is *integrated curvature* over a local area associated with vertex *i* 



Integrated over a local area associated with vertex *i* 

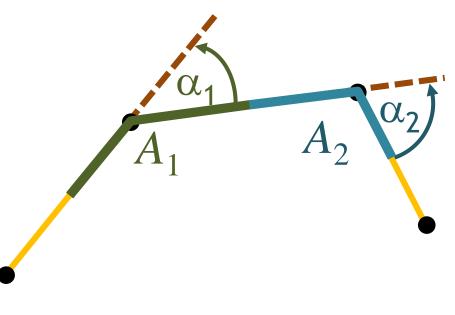
$$\alpha_1 = A_1 \cdot \kappa_1$$



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Integrated over a local area associated with vertex *i* 

$$\alpha_1 = A_1 \cdot \kappa_1$$
$$\alpha_2 = A_2 \cdot \kappa_2$$





Integrated over a local area associated with vertex *i* 

$$\alpha_1 = A_1 \cdot \kappa_1$$

$$\alpha_2 = A_2 \cdot \kappa_2$$

$$\sum A_i = \operatorname{len}(p)$$

The vertex areas  $A_i$  form a covering of the curve. They are pairwise disjoint (except endpoints).



## Discrete analogues

- Arbitrary discrete curve
  - total signed curvature obeys discrete turning number theorem
    - even coarse mesh (curve)
  - which continuous theorems to preserve?
    - that depends on the application...



## Convergence

- length of sampled polygon approaches length of smooth curve
- in general, discrete measures approaches continuous analogues
- How to refine?
  - depends on discrete operator
  - pathological sequences may exist
  - in what sense does the operator converge? (pointwise, L<sub>2</sub>; linear, quadratic)





## Differential Geometry of Surfaces



3/8/2018

# Surfaces, Parametric Form

#### Continuous surface

$$\mathbf{p}(u,v) = \begin{pmatrix} x(u,v) \\ y(u,v) \\ z(u,v) \end{pmatrix}, \ (u,v) \in \mathbb{R}^2$$

Tangent plane at point  $\mathbf{p}(u,v)$  is spanned by

$$\mathbf{p}_u = \frac{\partial \mathbf{p}(u, v)}{\partial u}, \quad \mathbf{p}_v = \frac{\partial \mathbf{p}(u, v)}{\partial v}$$

These vectors don't have to be orthogonal

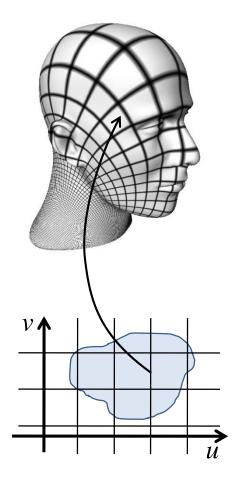
 $\mathbf{p}_{u}$ 



## **Isoparametric Lines**

Lines on the surface when keeping one parameter fixed

 $\gamma_{u_0}(v) = \mathbf{p}(u_0, v)$  $\gamma_{u_0}(u) = \mathbf{p}(u, v_0)$ 





# Surfaces, Parametric Form

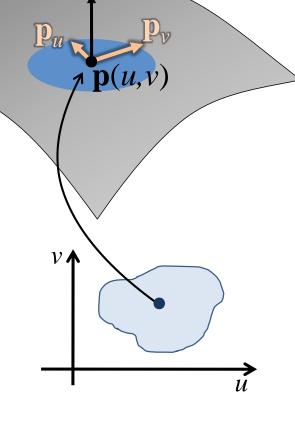
#### Continuous surface

$$\mathbf{p}(u,v) = \begin{pmatrix} x(u,v) \\ y(u,v) \\ z(u,v) \end{pmatrix}, \ (u,v) \in \mathbb{R}^2$$

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These vectors don't have to be orthogonal

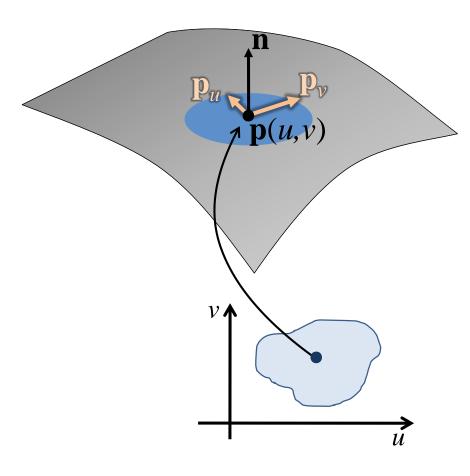




# Surface Normals

#### Surface normal:

$$\mathbf{n}(u,v) = \frac{\mathbf{p}_u \times \mathbf{p}_v}{\|\mathbf{p}_u \times \mathbf{p}_v\|}$$





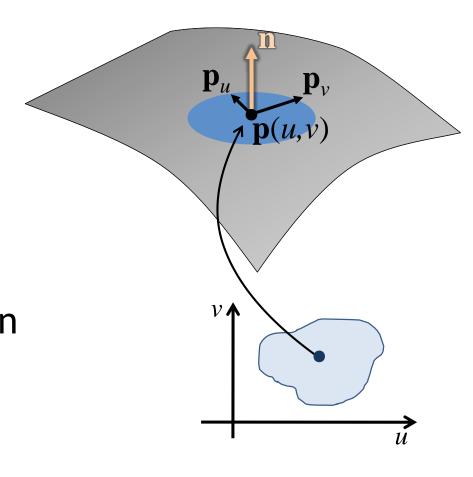


# Surface Normals

#### Surface normal:

$$\mathbf{n}(u,v) = \frac{\mathbf{p}_u \times \mathbf{p}_v}{\|\mathbf{p}_u \times \mathbf{p}_v\|}$$

$$\mathbf{p}_u \times \mathbf{p}_v \neq 0$$
  
Regular parameterization



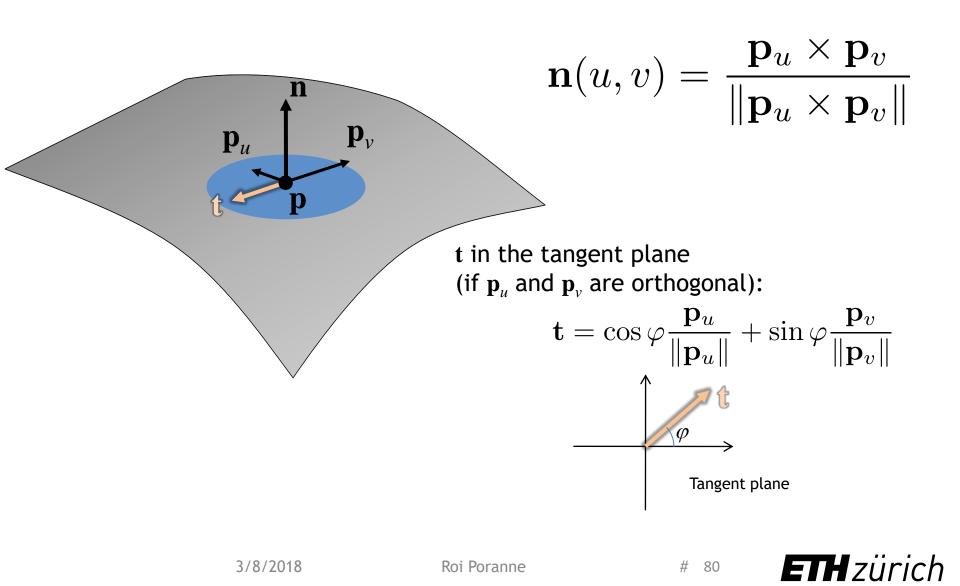




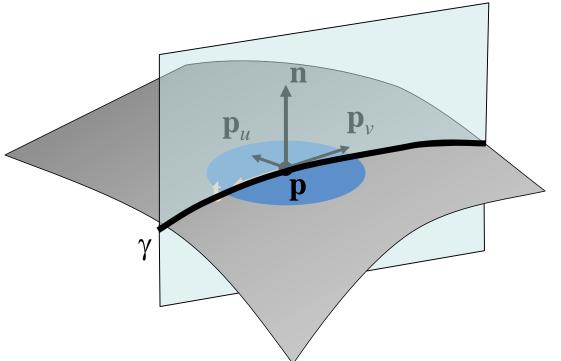
## Normal Curvature



## Normal Curvature



## Normal Curvature



The curve  $\gamma$  is the intersection of the surface with the plane through  $\mathbf{n}$  and  $\mathbf{t}$ .

Normal curvature:

$$\kappa_n(\varphi) = \kappa(\gamma(\mathbf{p}))$$



## Surface Curvatures

#### Principal curvatures

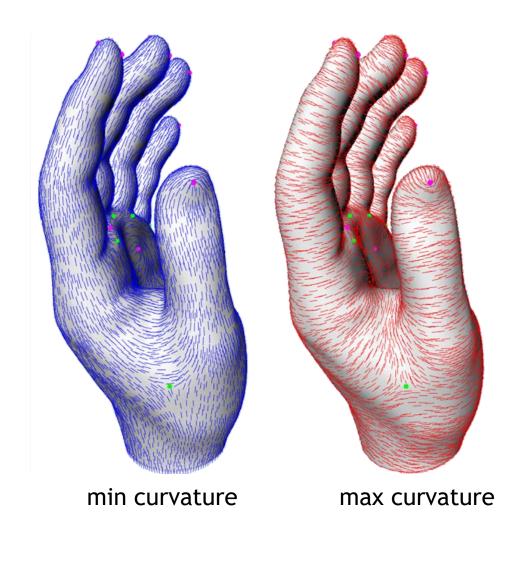
- Minimal curvature  $\kappa_1 = \kappa_{\min} = \min \kappa_n(\varphi)$
- Maximal curvature  $\kappa_2 = \kappa_{\max} = \max_{\varphi} \kappa_n(\varphi)$

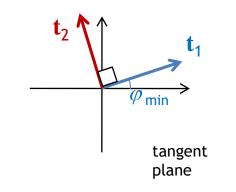
• Mean curvature 
$$H = \frac{\kappa_1 + \kappa_2}{2} = \frac{1}{2\pi} \int_0^{2\pi} \kappa_n(\varphi) d\varphi$$

• Gaussian curvature  $K = \kappa_1 \cdot \kappa_2$ 



Principal directions: tangent vectors corresponding to  $\varphi_{max}$  and  $\varphi_{min}$ 



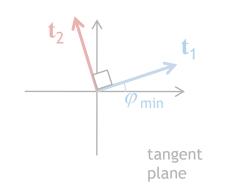








What can we say about the principal directions?







min curvature

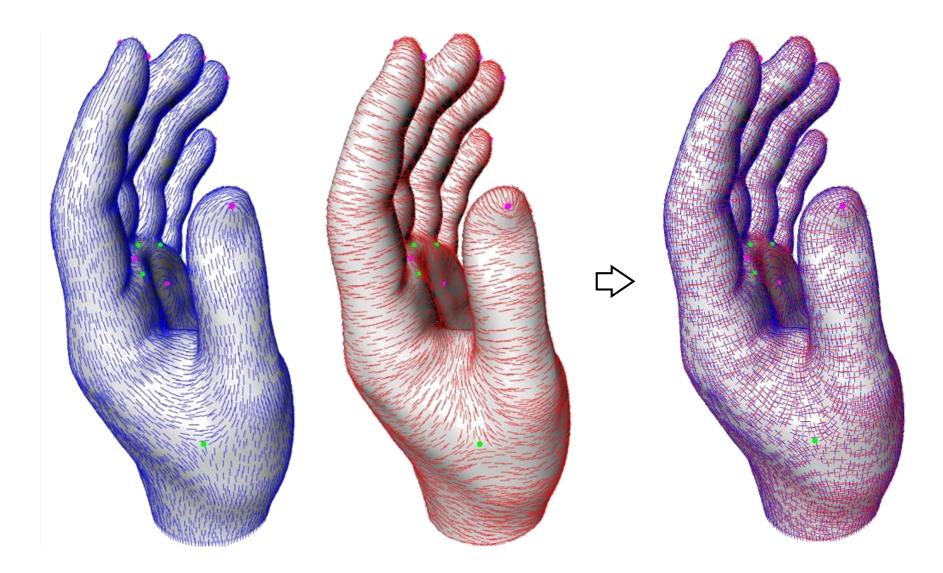
max curvature



#### Euler's Theorem: Principal directions are orthogonal.

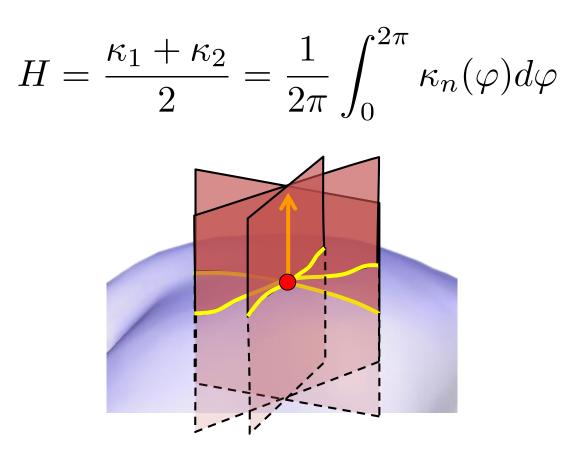
$$\kappa_n(\varphi) = \kappa_1 \cos^2 \varphi + \kappa_2 \sin^2 \varphi$$







## Mean Curvature





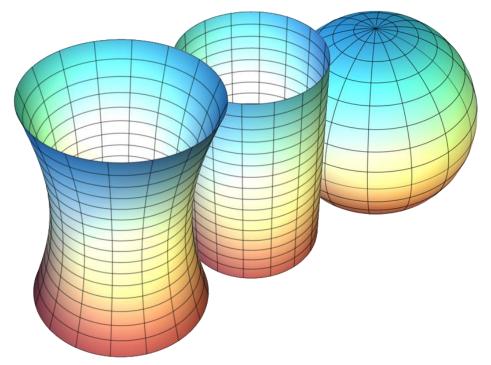
## Gaussian Curvature

Classification  $K = \kappa_1 \cdot \kappa_2$ 

A point  $\mathbf{p}$  on the surface is called

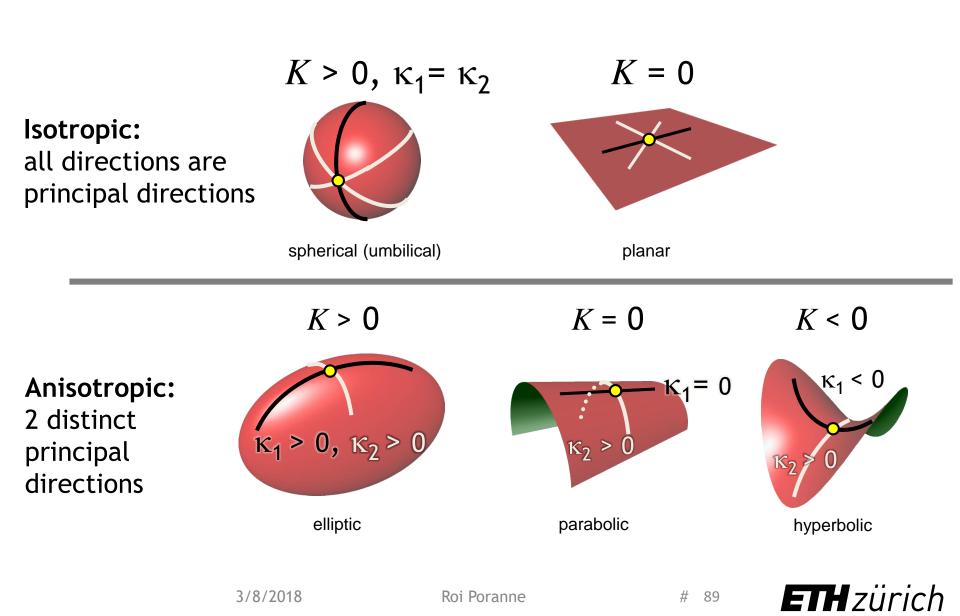
- Elliptic, if K > 0
- Parabolic, if K = 0
- Hyperbolic, if K < 0

# Developable surface iff K = 0



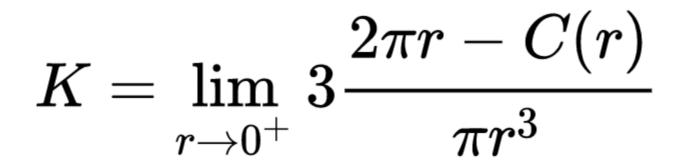


## Local Surface Shape By Curvatures



## Theorema Egregium

#### "Remarkable theorem"





## Reminder: Euler-Poincaré Formula

For orientable meshes:

$$v - e + f = 2(c - g) - b = \chi(M)$$

c = number of connected components

$$g = genus$$

*b* = number of boundary loops

$$\chi(\bigcirc) = 2 \quad \chi(\bigcirc) = 0$$



## **Gauss-Bonnet Theorem**

For a closed surface *M*:

$$\int_{\mathcal{M}} K \, dA = 2\pi \, \chi(\mathcal{M})$$

$$\int K(\mathbf{v}) = \int K(\mathbf{v}) = \int K(\mathbf{v}) = 4\pi$$



## Gauss-Bonnet Theorem

For a closed surface *M*:

$$\int_{\mathcal{M}} K \, dA = 2\pi \, \chi(\mathcal{M})$$

Compare with planar curves:

$$\int_{\gamma} \kappa \, ds = 2\pi \, k$$



## Fundamental Forms

First fundamental form

$$\mathbf{I} = \begin{pmatrix} E & F \\ F & G \end{pmatrix} = \begin{pmatrix} \mathbf{p}_u^T \mathbf{p}_u & \mathbf{p}_u^T \mathbf{p}_v \\ \mathbf{p}_u^T \mathbf{p}_v & \mathbf{p}_v^T \mathbf{p}_v \end{pmatrix}$$



## Fundamental Forms

I is a generalization of the dot product allows to measure length, angles, area, curvature arc element

$$ds^2 = E \, du^2 + 2F \, du dv + G \, dv^2$$

area element

$$dA = \sqrt{EG - F^2} \, du dv$$



## Intrinsic Geometry

Properties of the surface that only depend on the first fundamental form

- length
- angles
- Gaussian curvature (Theorema Egregium)



## Fundamental Forms

First fundamental form

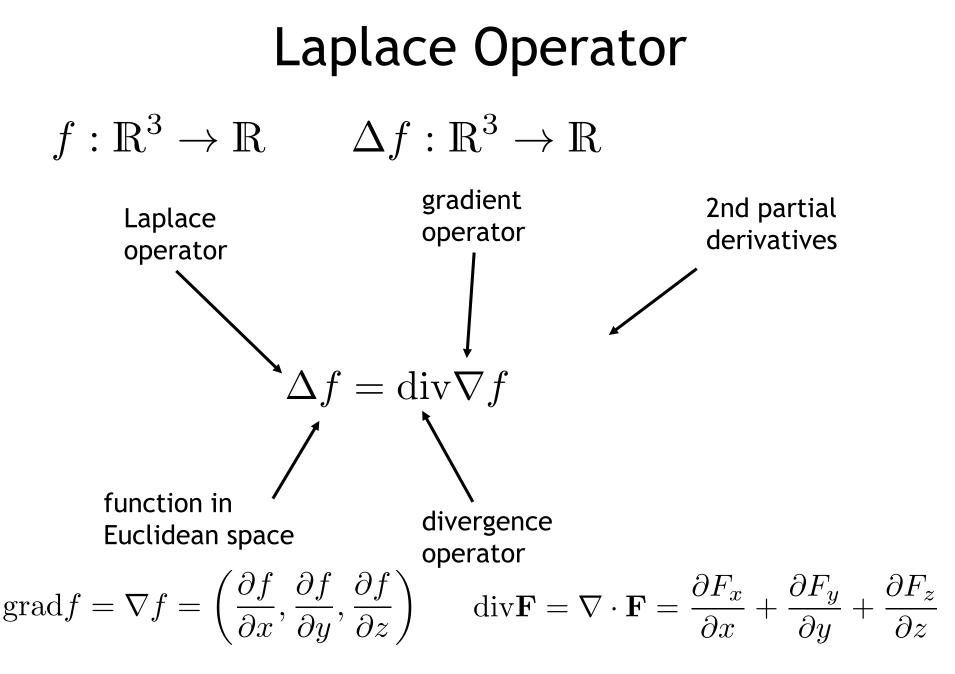
$$\mathbf{I} = \begin{pmatrix} E & F \\ F & G \end{pmatrix} = \begin{pmatrix} \mathbf{p}_u^T \mathbf{p}_u & \mathbf{p}_u^T \mathbf{p}_v \\ \mathbf{p}_u^T \mathbf{p}_v & \mathbf{p}_v^T \mathbf{p}_v \end{pmatrix}$$

Second fundamental form

$$\mathbf{II} = \begin{pmatrix} e & f \\ f & g \end{pmatrix} = \begin{pmatrix} \mathbf{p}_{uu}^T \mathbf{n} & \mathbf{p}_{uv}^T \mathbf{n} \\ \mathbf{p}_{uv}^T \mathbf{n} & \mathbf{p}_{vv}^T \mathbf{n} \end{pmatrix}$$

Together, they define a surface (if some compatibility conditions hold)



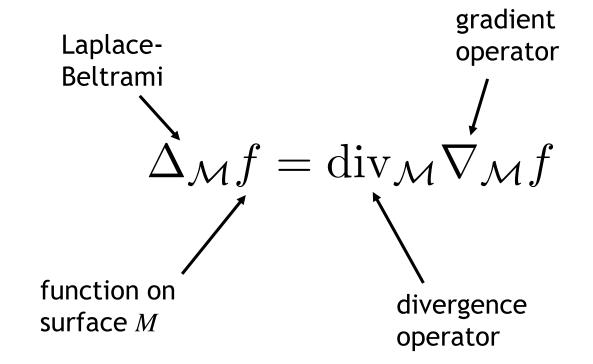




## Laplace-Beltrami Operator

Extension of Laplace to functions on manifolds

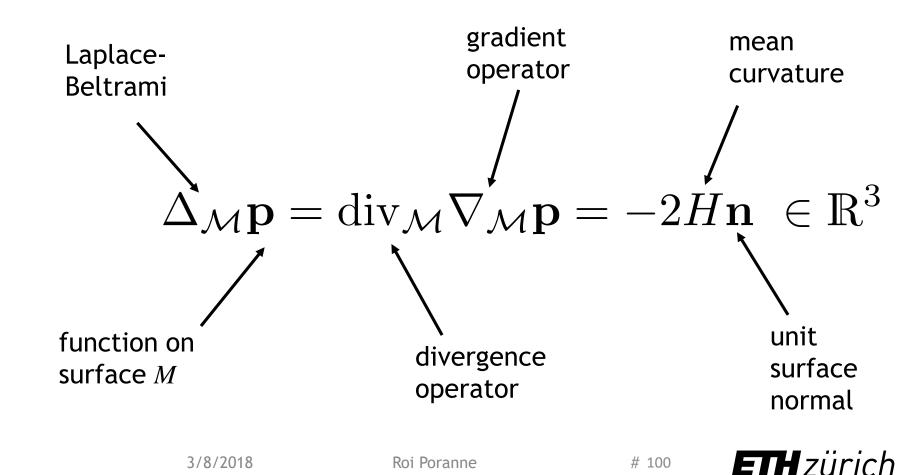
$$f: \mathcal{M} \to \mathbb{R} \qquad \Delta f: \mathcal{M} \to \mathbb{R}$$





## Laplace-Beltrami Operator

For coordinate functions:  $\mathbf{p}(x, y, z) = (x, y, z)$ 



## Differential Geometry on Meshes

Assumption: meshes are piecewise linear approximations of smooth surfaces

Can try fitting a smooth surface locally (say, a polynomial) and find differential quantities analytically

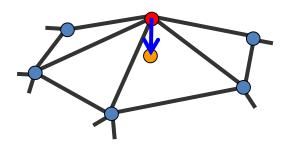
But: it is often too slow for interactive setting and error prone



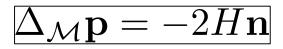
## **Discrete Differential Operators**

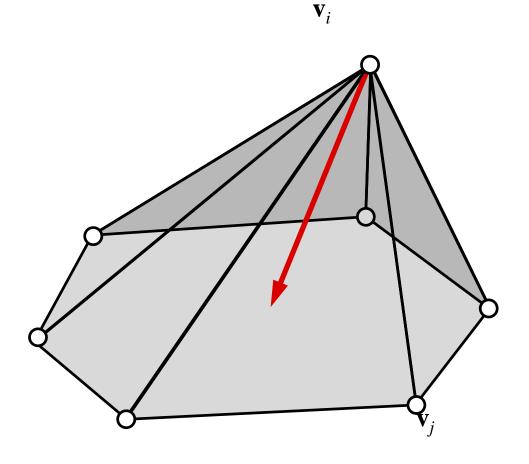
Approach: approximate differential properties at point  $\mathbf{v}$  as spatial average over local mesh neighborhood  $N(\mathbf{v})$  where typically

- v = mesh vertex
- $N_k(\mathbf{v}) = k$ -ring neighborhood









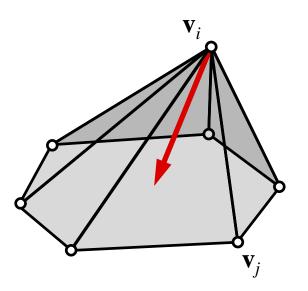
 $\Delta_{\mathcal{M}}\mathbf{p} = -2H\mathbf{n}$ 

Uniform discretization:  $L(\mathbf{v})$  or  $\Delta \mathbf{v}$ 

$$L_u(\mathbf{v}_i) = \frac{1}{|\mathcal{N}(i)|} \sum_{j \in \mathcal{N}(i)} (\mathbf{v}_j - \mathbf{v}_i) = \left(\frac{1}{|\mathcal{N}(i)|} \sum_{j \in \mathcal{N}(i)} \mathbf{v}_j\right) - \mathbf{v}_i$$

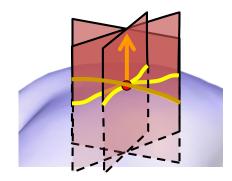
Depends only on connectivity = simple and efficient

Bad approximation for irregular triangulations





#### $\Delta_{\mathcal{M}}\mathbf{p} = -2H\mathbf{n}$ Intuition for uniform discretization



$$H = \frac{1}{2\pi} \int_0^{2\pi} \kappa(\varphi) d\varphi$$

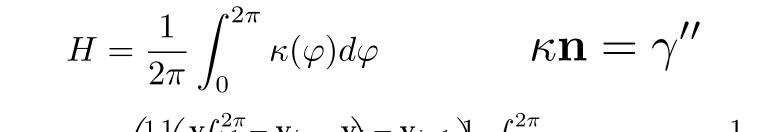
$$\kappa \mathbf{n} = \gamma''$$





#### $\Delta_{\mathcal{M}}\mathbf{p} = -2H\mathbf{n}$ Intuition for uniform discretization



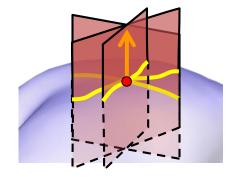


 $-2H\mathbf{n} = \gamma'' 2 \approx \left(\frac{1}{h2\pi} \left(\frac{\mathbf{v}_{i+1}^{2\pi} - \mathbf{v}_{i}}{\int_{0}^{2\pi} h^{\kappa}(\varphi)} d\varphi\right) - \frac{\mathbf{v}_{i-1}}{h} \right) \frac{1}{\pi} \int_{0}^{2\pi} \kappa(\varphi) \mathbf{n} \, d\varphi = -\frac{1}{\pi} \int_{0}^{2\pi} \gamma'' \, d\varphi$ 



**T**7

#### $\Delta_{\mathcal{M}}\mathbf{p} = -2H\mathbf{n}$ Intuition for uniform discretization



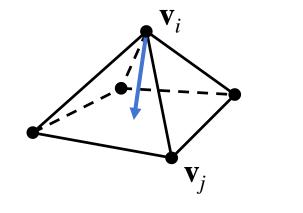
$$H = \frac{1}{2\pi} \int_0^{2\pi} \kappa(\varphi) d\varphi$$

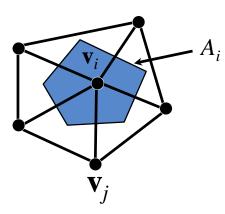
$$\mathbf{v}_{j6} \qquad \mathbf{v}_{j4} \qquad \mathbf{v}_{j3} \\ \frac{1}{2} (\mathbf{v}_{j1} + \mathbf{v}_{j4}) - \mathbf{v}_i + \\ \frac{1}{2} (\mathbf{v}_{j2} + \mathbf{v}_{j5}) - \mathbf{v}_i + \\ \frac{1}{2} (\mathbf{v}_{j3} + \mathbf{v}_{j6}) - \mathbf{v}_i = \underbrace{\underline{L}_u(\mathbf{v}_i)}_{j \in \mathcal{N}(i)} \\ = \frac{1}{2} \sum_{j \in \mathcal{N}(i)} \mathbf{v}_j - 3\mathbf{v}_i = 3 \left( \frac{1}{6} \sum_{j \in \mathcal{N}(i)} \mathbf{v}_j - \mathbf{v}_i \right)$$

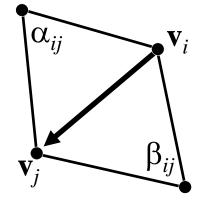


#### Cotangent formula

$$L_c(\mathbf{v}_i) = \frac{1}{A_i} \sum_{j \in \mathcal{N}(i)} \frac{1}{2} (\cot \alpha_{ij} + \cot \beta_{ij}) (\mathbf{v}_j - \mathbf{v}_i)$$





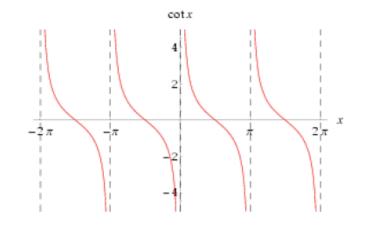




#### Cotangent formula

$$L_c(\mathbf{v}_i) = \frac{1}{A_i} \sum_{j \in \mathcal{N}(i)} \frac{1}{2} (\cot \alpha_{ij} + \cot \beta_{ij}) (\mathbf{v}_j - \mathbf{v}_i)$$

Accounts for mesh geometry Potentially negative/ infinite weights



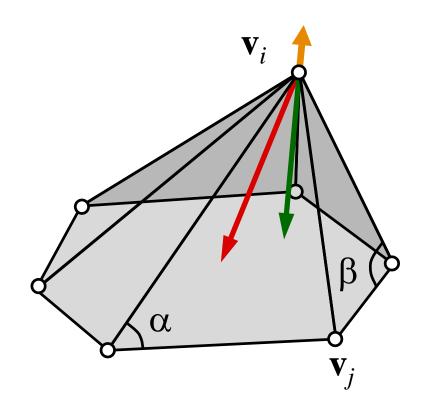


Cotangent formula

$$L_c(\mathbf{v}_i) = \frac{1}{A_i} \sum_{j \in \mathcal{N}(i)} \frac{1}{2} (\cot \alpha_{ij} + \cot \beta_{ij}) (\mathbf{v}_j - \mathbf{v}_i)$$

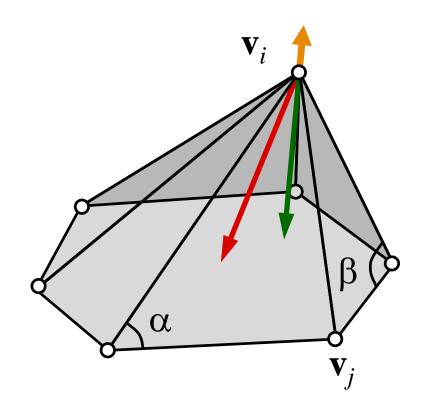
Can be derived using linear Finite Elements Nice property: gives zero for planar 1-rings!





- Uniform Laplacian  $L_u(v_i)$
- Cotangent Laplacian  $L_c(v_i)$
- Normal



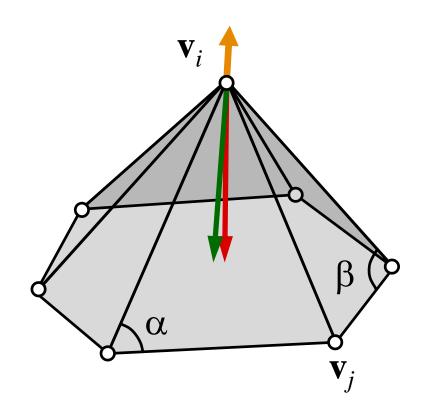


- Uniform Laplacian  $\mathbf{L}_{u}(\mathbf{v}_{i})$
- Cotangent Laplacian  $L_c(v_i)$

• Normal

 For nearly equal edge lengths Uniform ≈ Cotangent

# 112



- Uniform Laplacian  $L_u(v_i)$
- Cotangent Laplacian  $L_c(v_i)$

• Normal

 For nearly equal edge lengths Uniform ≈ Cotangent

#### Cotan Laplacian allows computing discrete normal

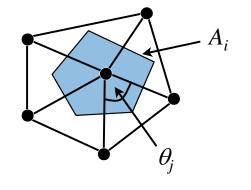


## **Discrete Curvatures**

#### Mean curvature

$$|H(\mathbf{v}_i)| = ||L_c(\mathbf{v}_i)||/2$$

## Gaussian curvature $K(\mathbf{v}_i) = \frac{1}{A_i} (2\pi - \sum_j \theta_j)$



### Principal curvatures $\kappa_1 = H - \sqrt{H^2 - K}$

$$\kappa_2 = H + \sqrt{H^2 - K}$$



## **Discrete Gauss-Bonnet Theorem**

# Total Gaussian curvature is fixed for a given topology

$$\int_{\mathcal{M}} K \, dA = \, 2\pi \chi(\mathcal{M})$$



## **Discrete Gauss-Bonnet Theorem**

# Total Gaussian curvature is fixed for a given topology

 $\int_{\Lambda A} K \, dA =$ 

 $2\pi\chi(\mathcal{M})$ 



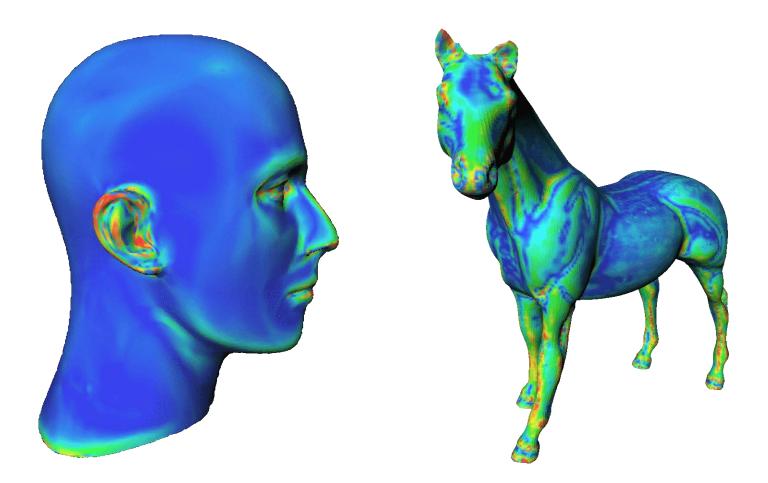


## **Discrete Gauss-Bonnet Theorem**

Total Gaussian curvature is fixed for a given topology

$$\int_{\mathcal{M}} K \, dA = \sum_{i} A_{i} K(\mathbf{v}_{i}) = \sum_{i} \left[ 2\pi - \sum_{j \in \mathcal{N}(i)} \theta_{j} \right] = 2\pi \chi(\mathcal{M})$$

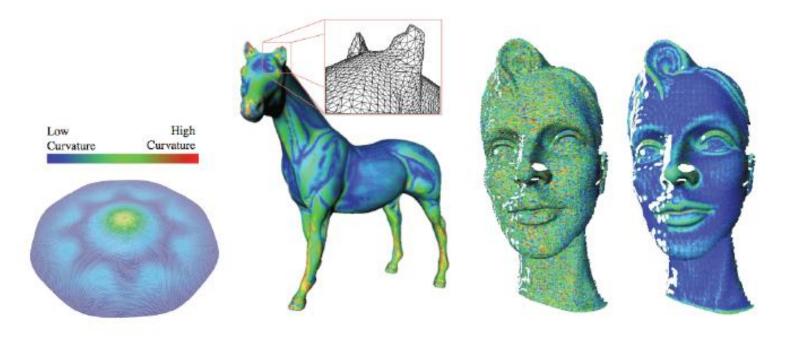
## Example: Discrete Mean Curvature





## Links and Literature

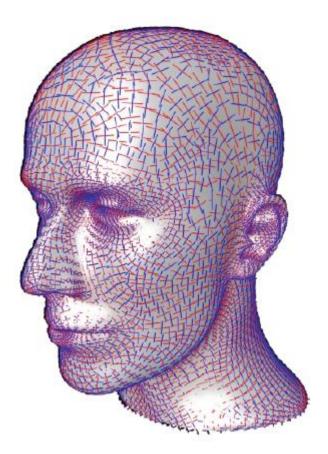
• M. Meyer, M. Desbrun, P. Schroeder, A. Barr Discrete Differential-Geometry Operators for Triangulated 2-Manifolds, VisMath, 2002





## Links and Literature

- libigl implements many discrete differential operators
- See the tutorial!
- <u>http://libigl.github.io/libigl/tut</u>
   <u>orial/tutorial.html</u>



principal directions



## Thank You



3/8/2018