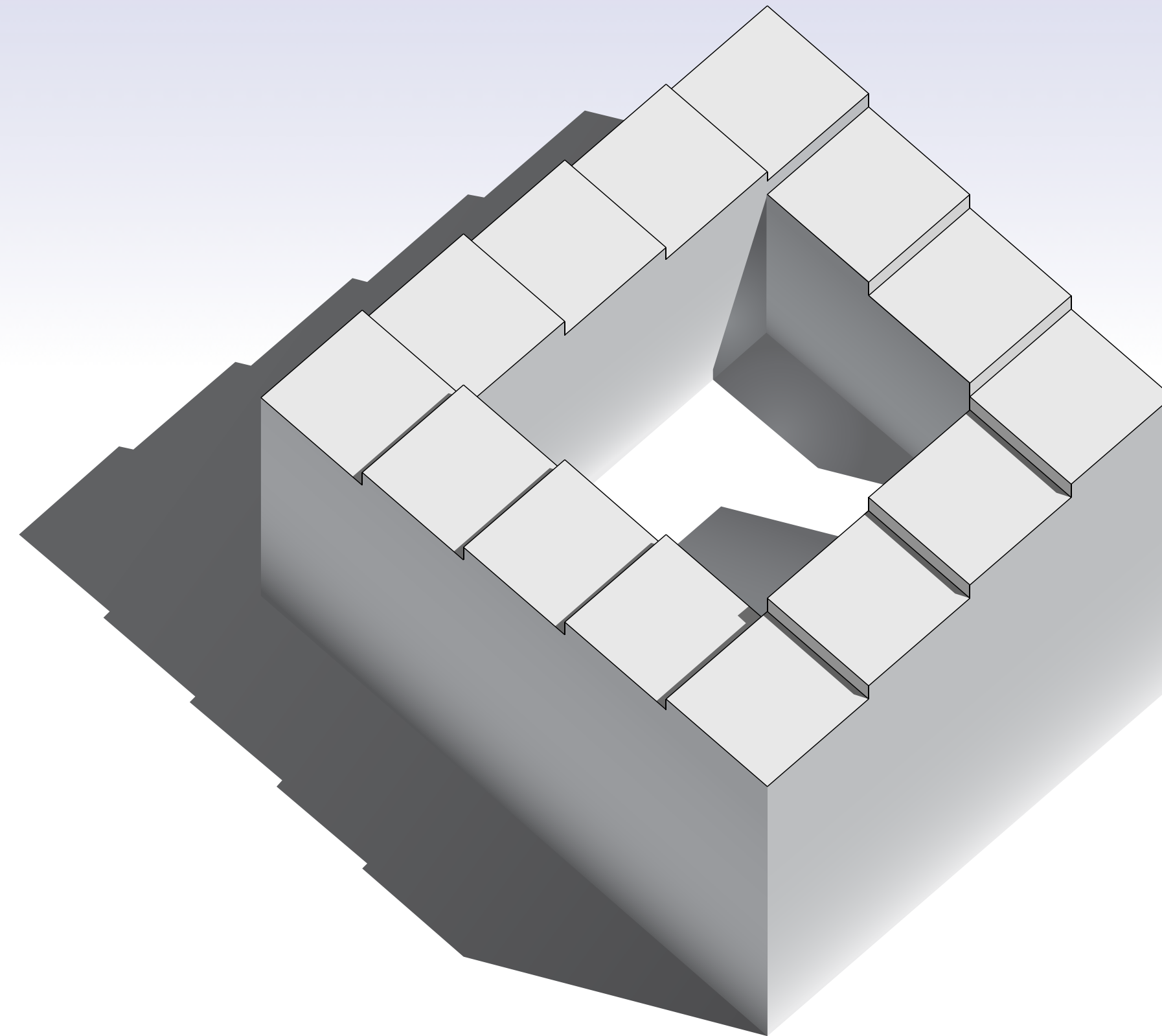
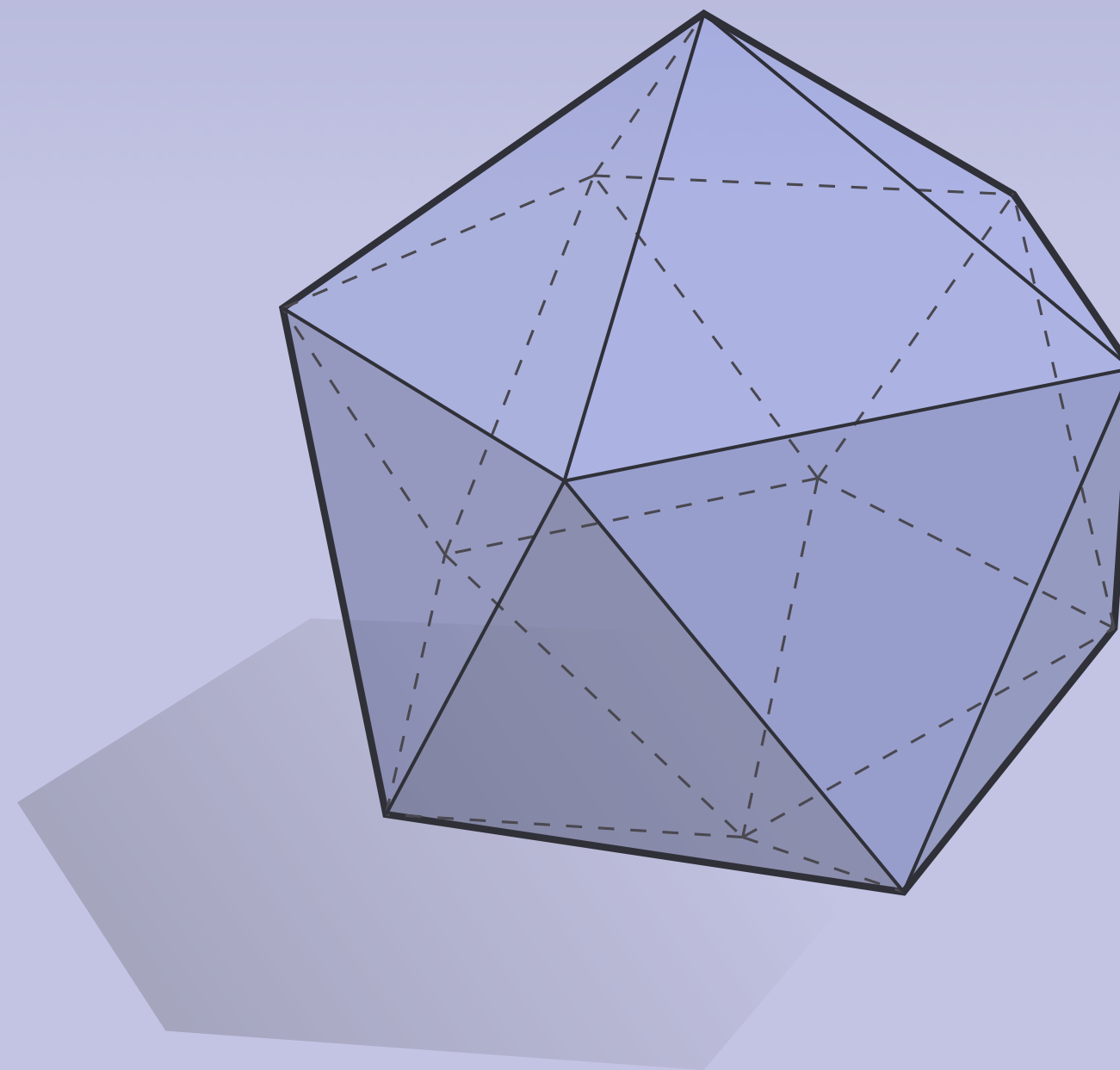




DISCRETE DIFFERENTIAL
GEOMETRY:
AN APPLIED INTRODUCTION
Keenan Crane • CMU 15-458/858

LECTURE 15: CURVATURE

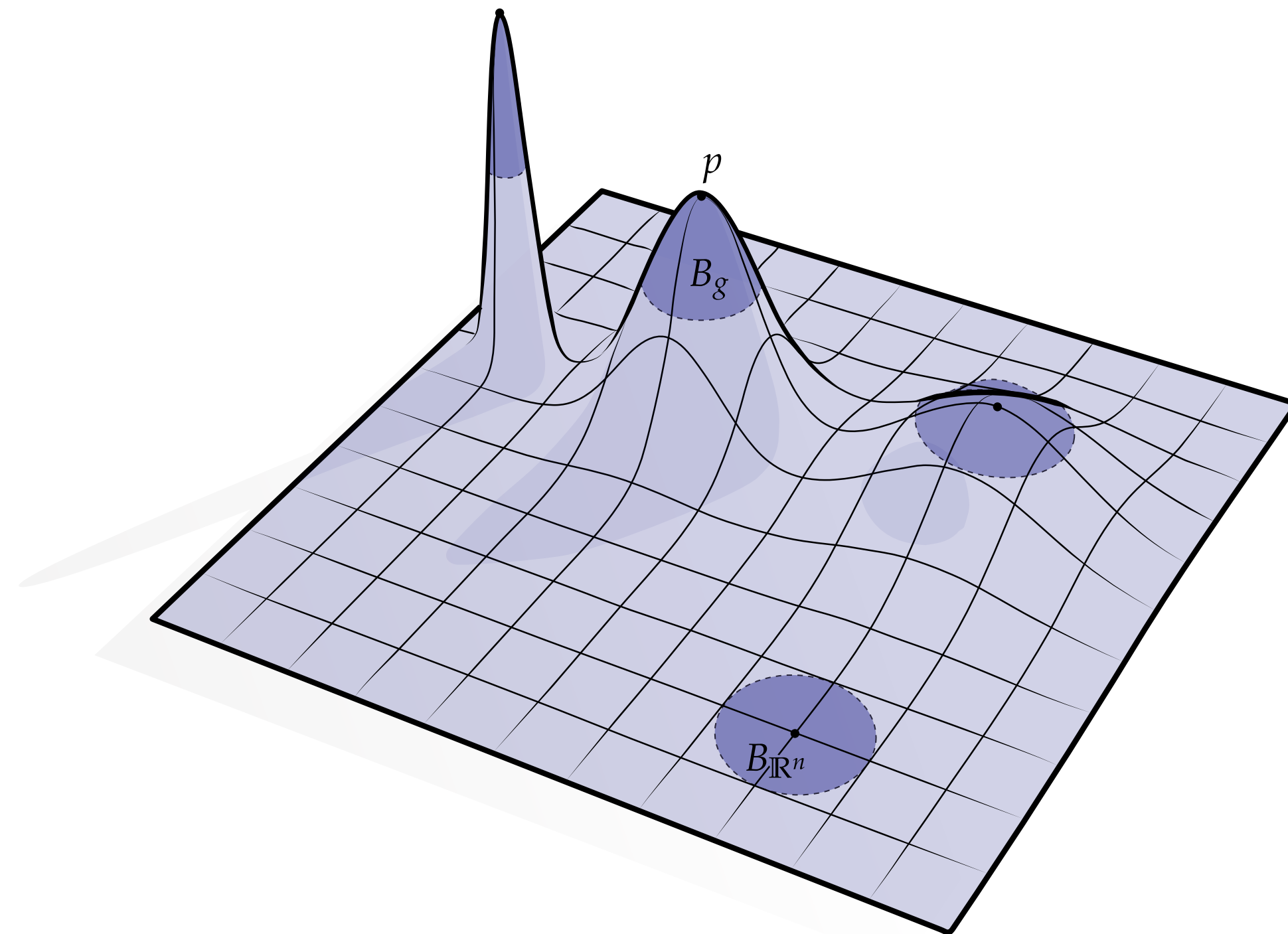
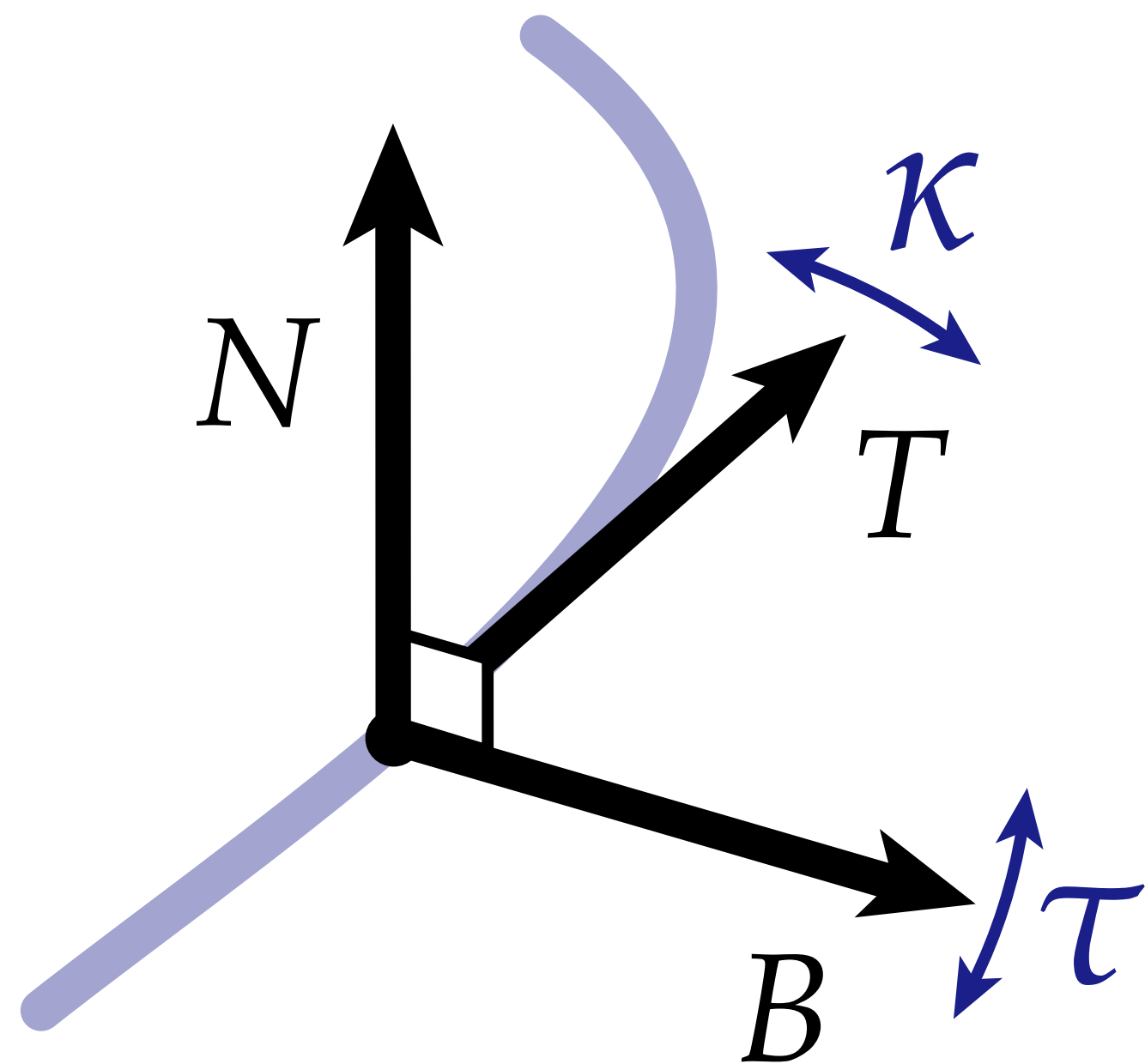


DISCRETE DIFFERENTIAL GEOMETRY: AN APPLIED INTRODUCTION

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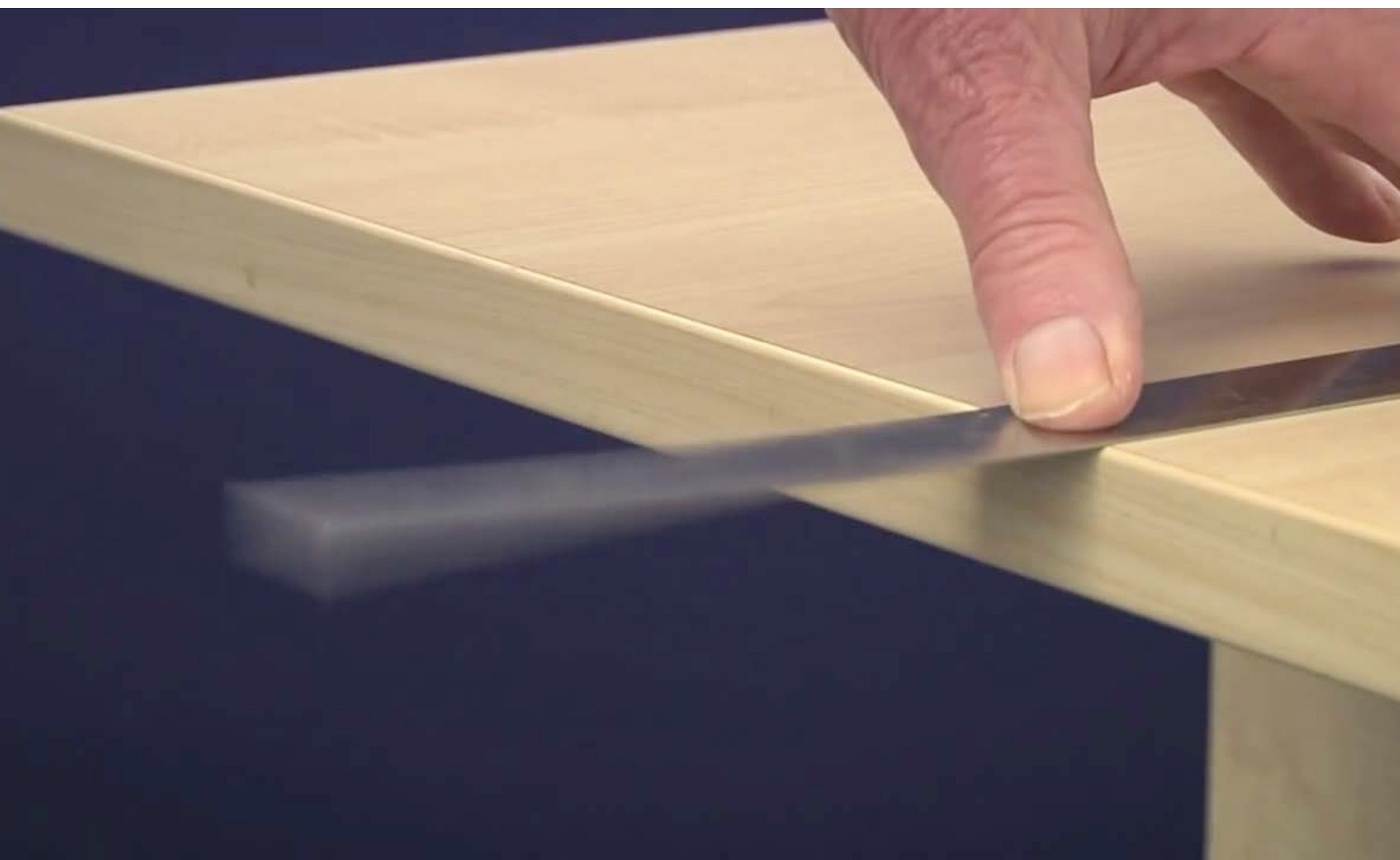
Curvature—Overview

- Intuitively, describes “*how much a shape bends*”
 - **Extrinsic:** how quickly does the tangent plane / normal change?
 - **Intrinsic:** how much do quantities differ from flat case?



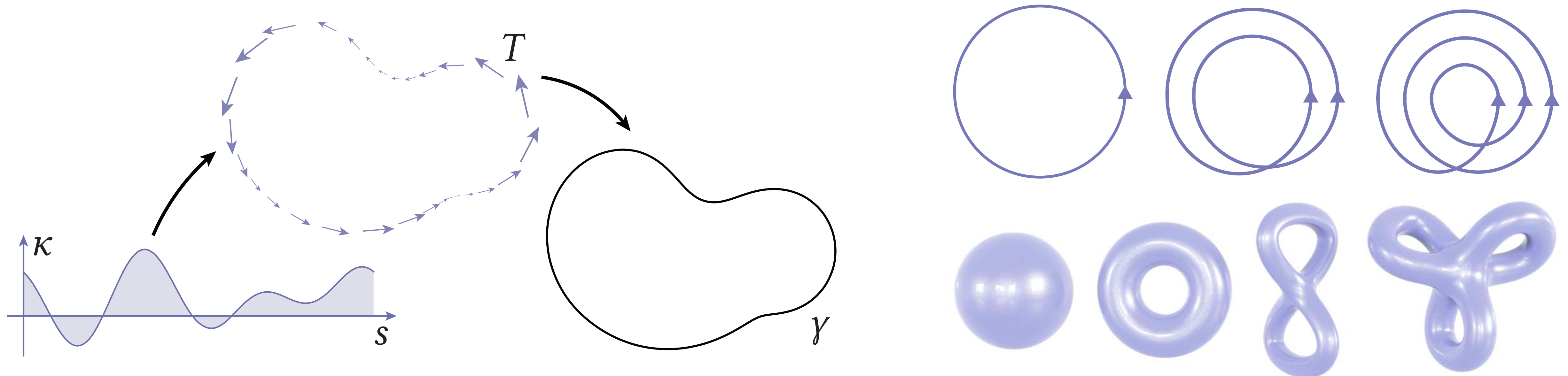
Curvature—Overview

- Driving force behind wide variety of physical phenomena
 - Objects want to reduce—or restore—their curvature
 - Even space and time are driven by curvature...



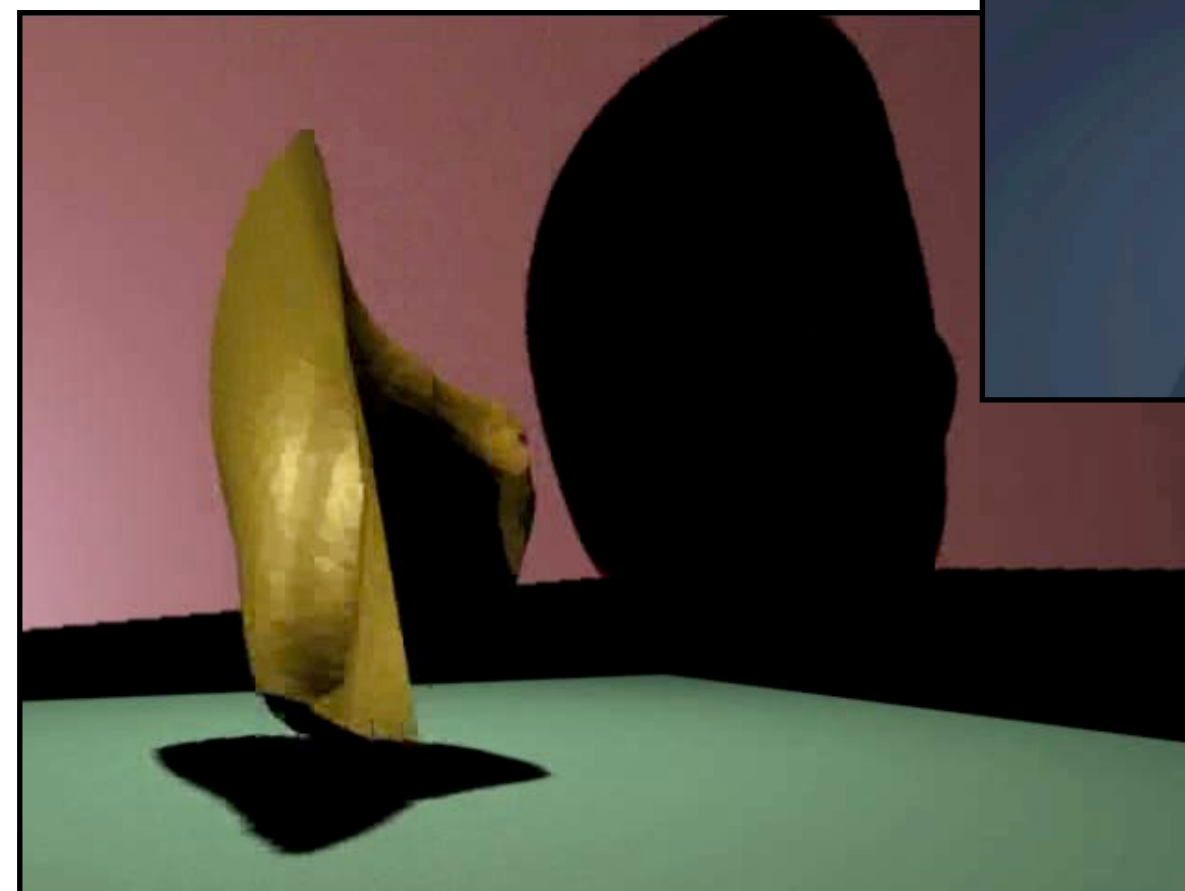
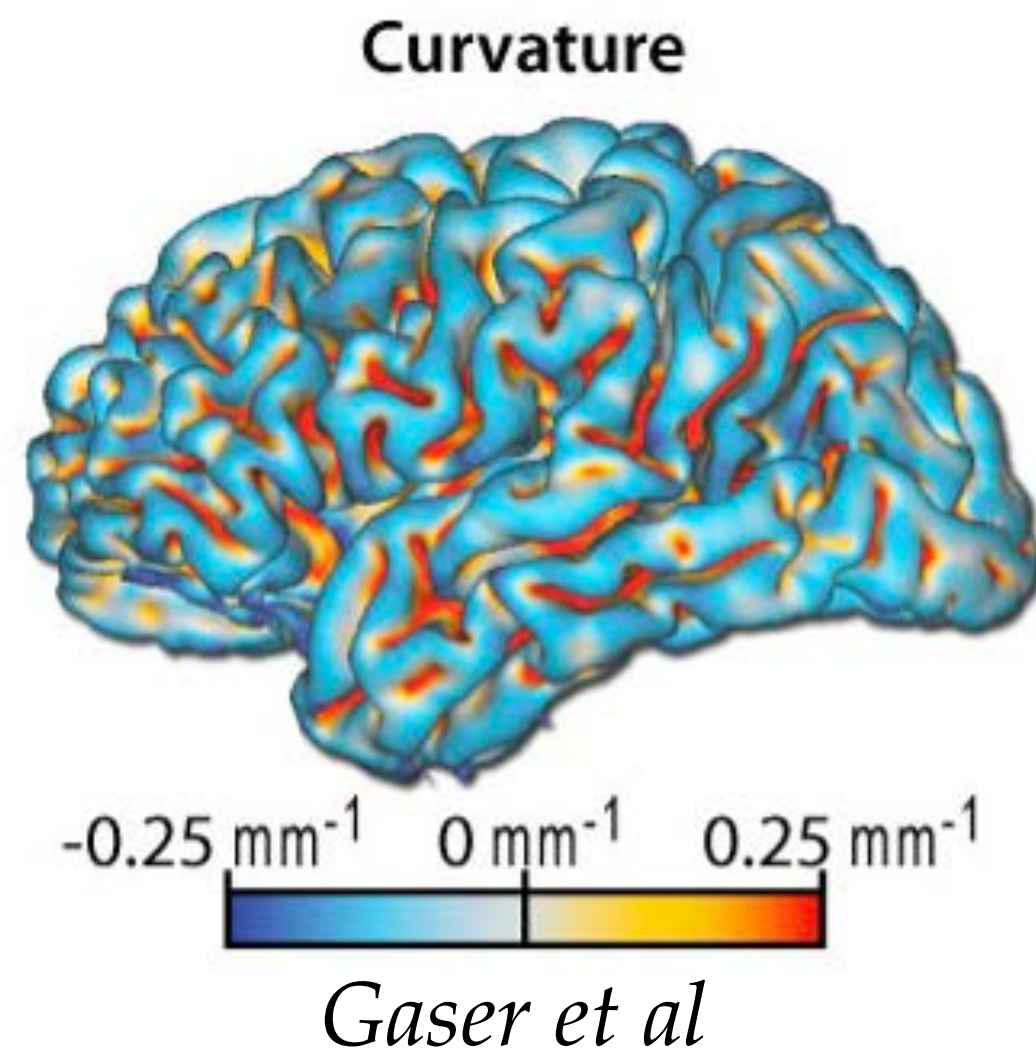
Curvature — Overview

- Gives a *coordinate-invariant* description of shape
 - fundamental theorems of plane curves, space curves, surfaces, ...
- Amazing fact: curvature gives you information about global topology!
 - “local-global theorems”: turning number, Gauss-Bonnet, ...

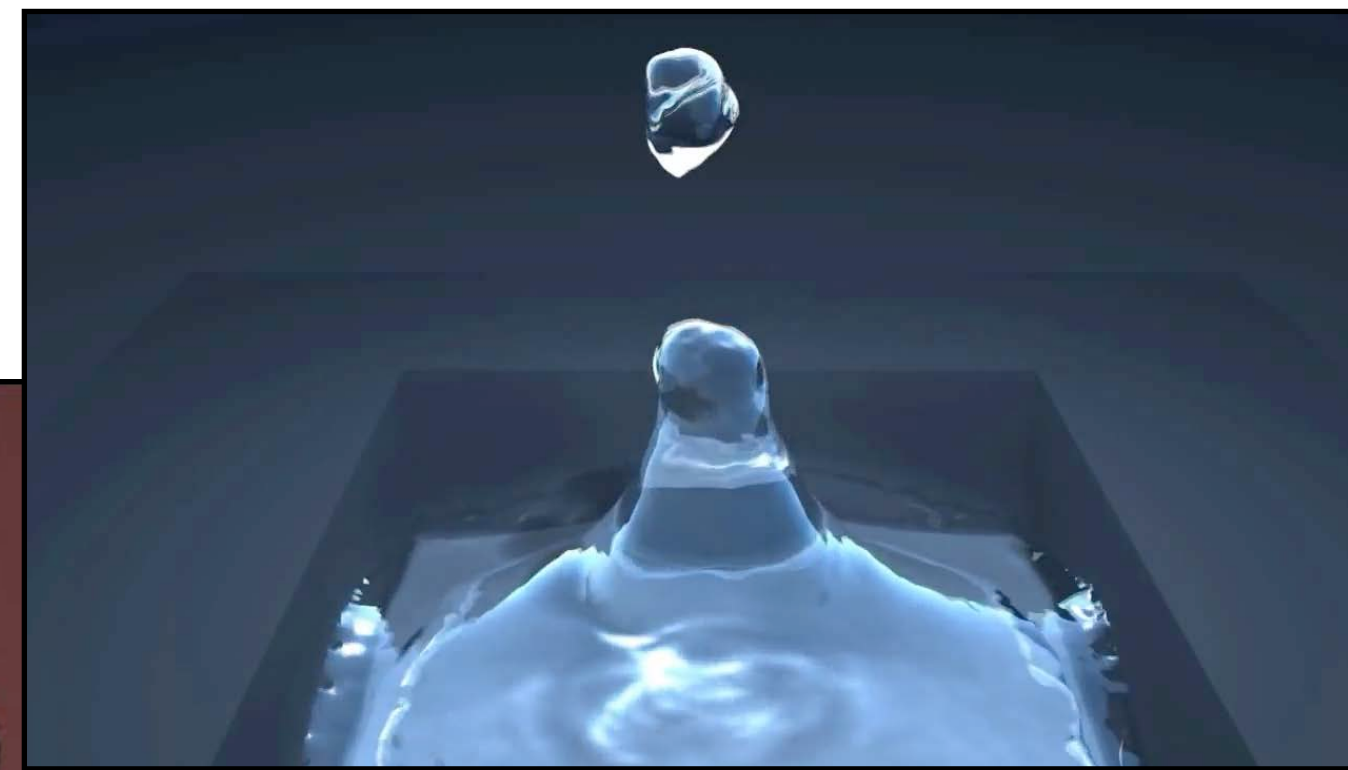


Curvature — Overview

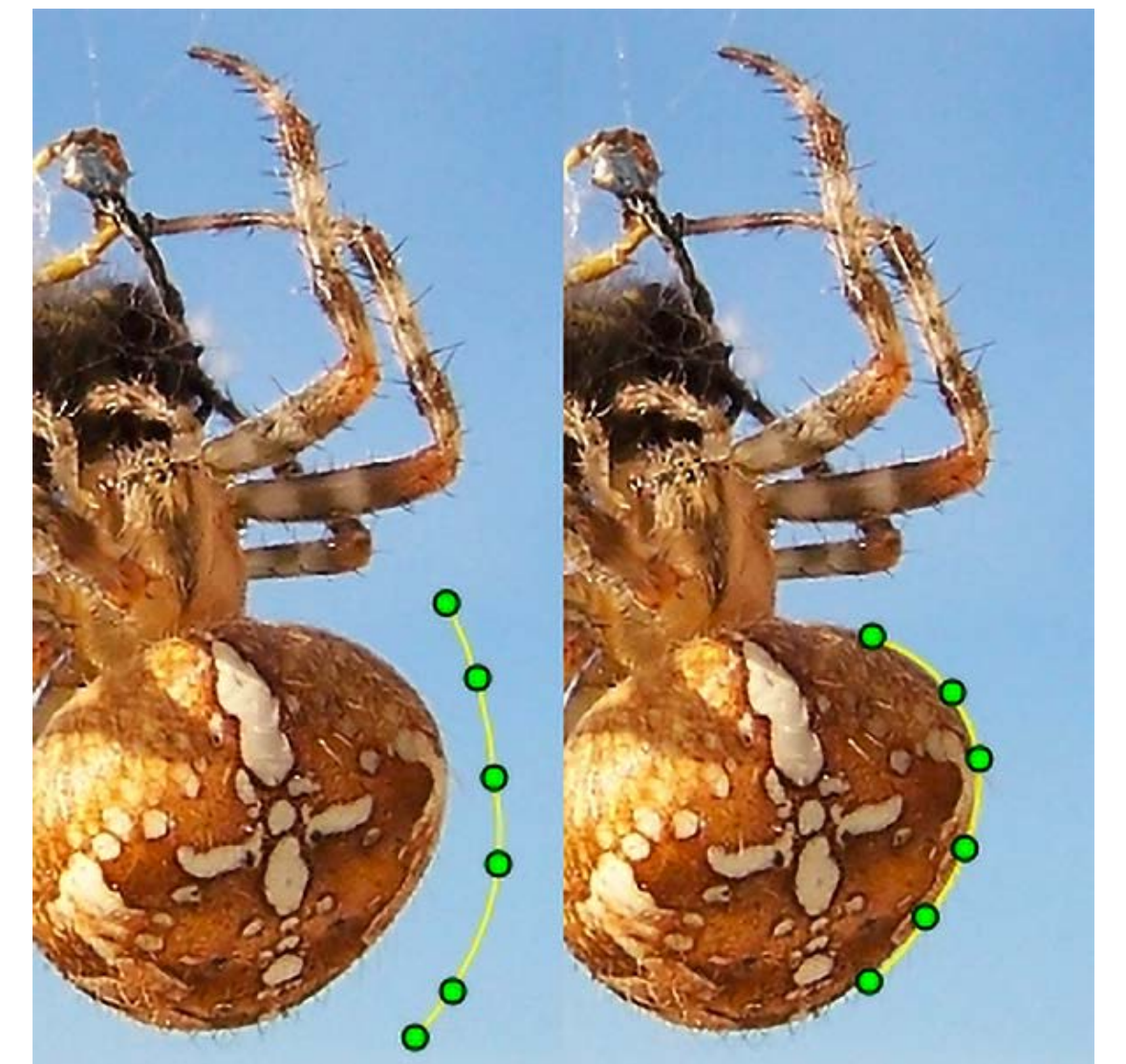
- Geometric algorithms: shape analysis, local descriptors, smoothing, ...
- Numerical simulation: elastic rods / shells, surface tension, ...
- Image processing algorithms: denoising, feature / contour detection, ...



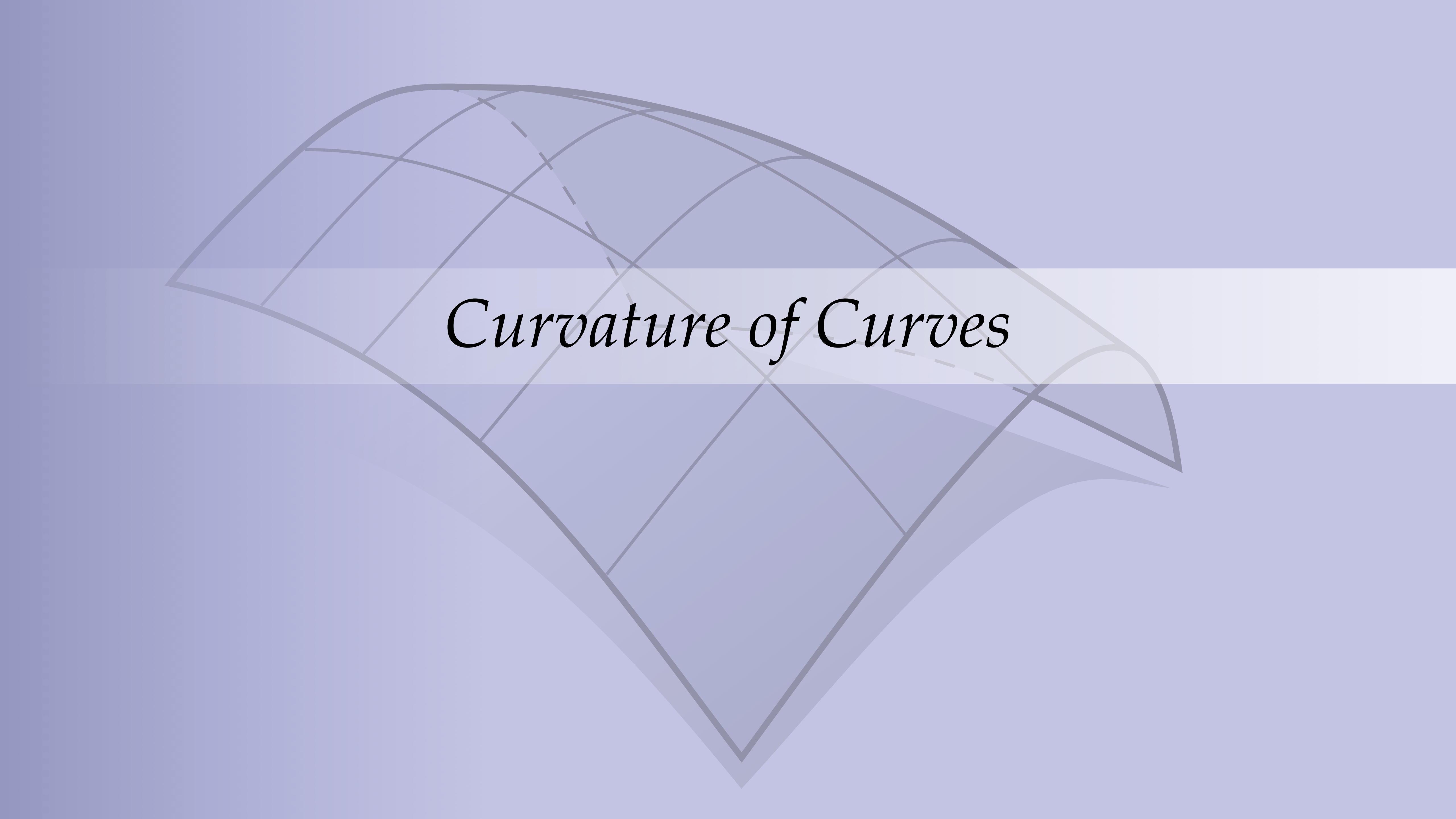
Grinspun et al 2003



Thürey et al 2010



Kass et al 1987

The background features a series of overlapping, curved lines that create a grid-like pattern. These lines are light gray and curve across the frame. A prominent white horizontal band runs through the center, providing a high-contrast area for the text. The overall color palette is a range of light blues and purples, with the white band acting as a focal point.

Curvature of Curves

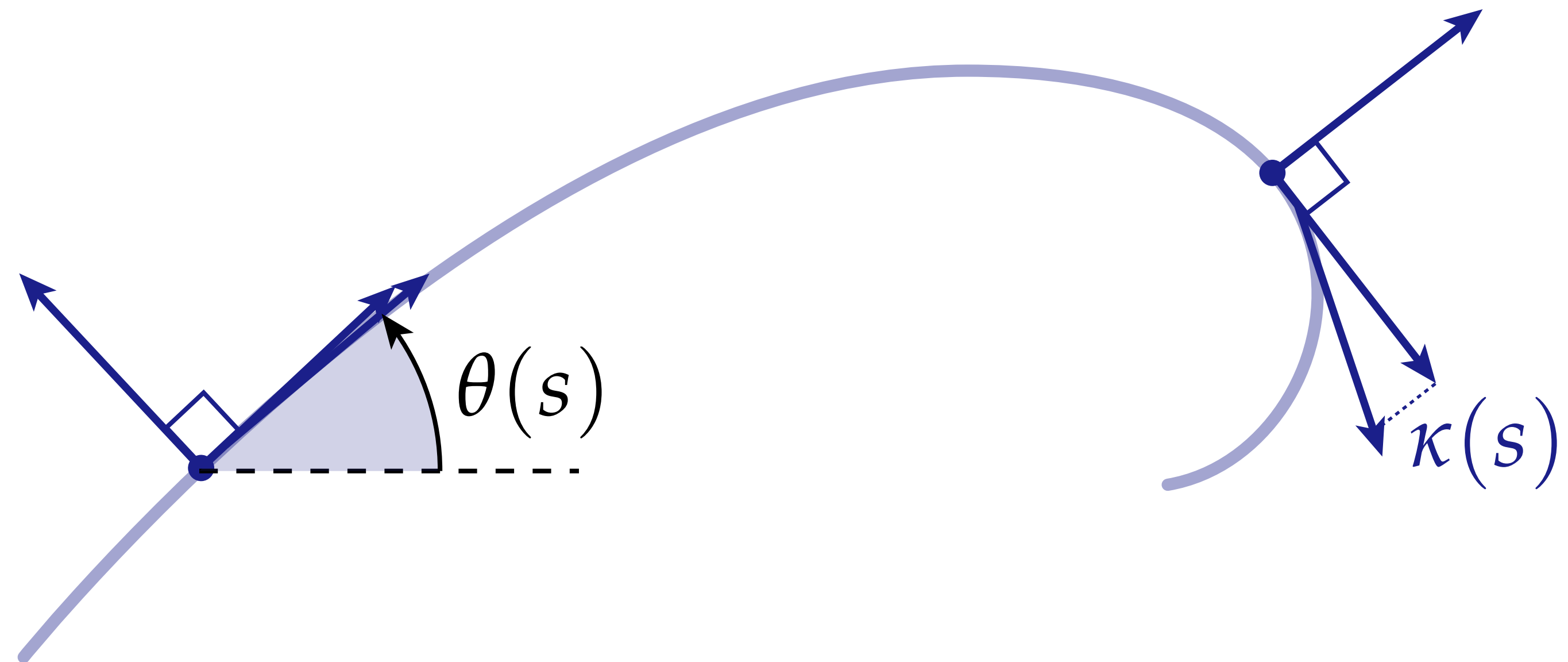
Review: Curvature of a Plane Curve

- Informally, curvature describes “how much a curve bends”
- More formally, the **curvature** of an arc-length parameterized plane curve can be expressed as the rate of change in the tangent

$$\begin{aligned}\kappa(s) &:= \langle N(s), \frac{d}{ds} T(s) \rangle \\ &= \langle N(s), \frac{d^2}{ds^2} \gamma(s) \rangle\end{aligned}$$

Equivalently:

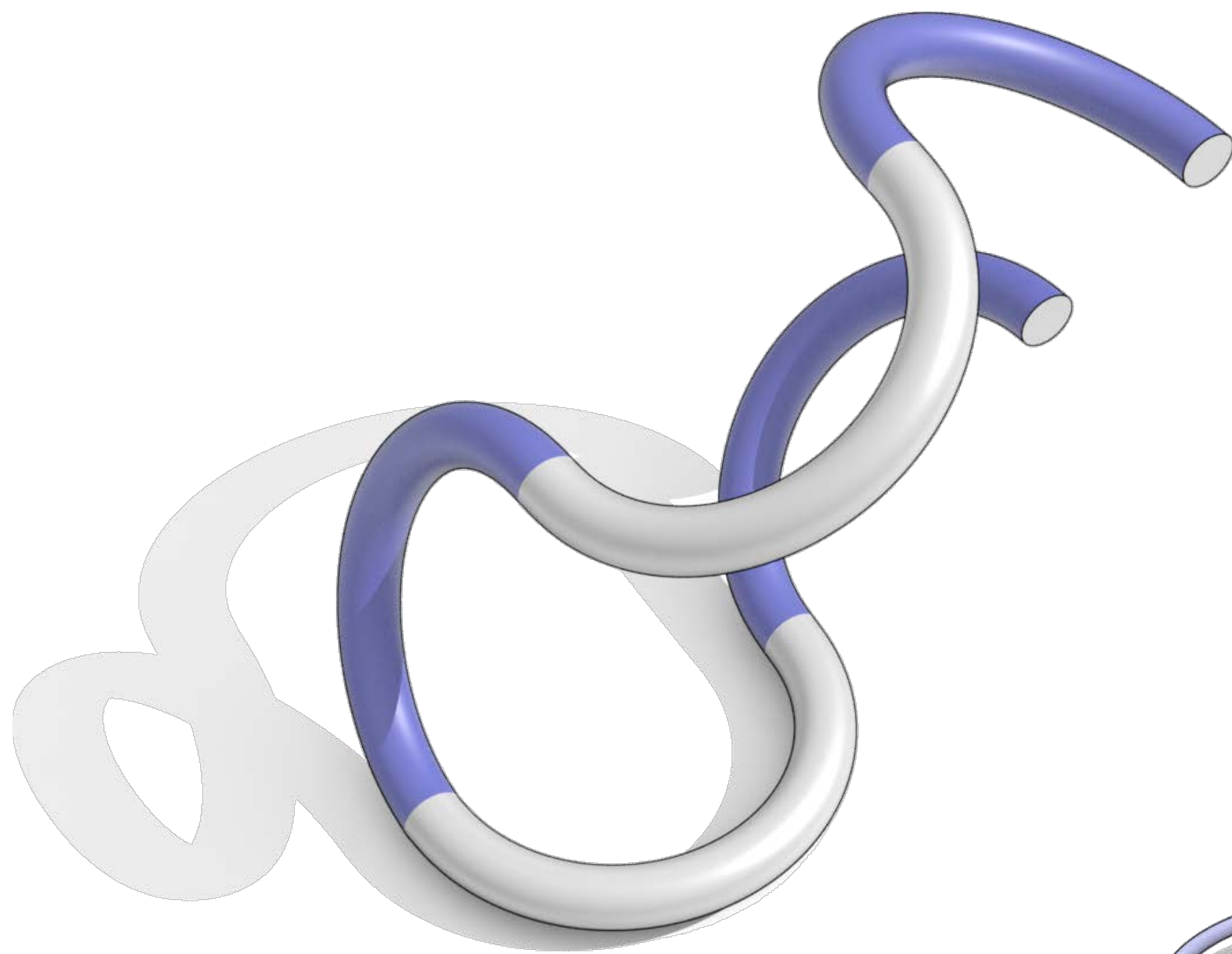
$$\kappa(s) = \frac{d}{ds} \theta(s)$$



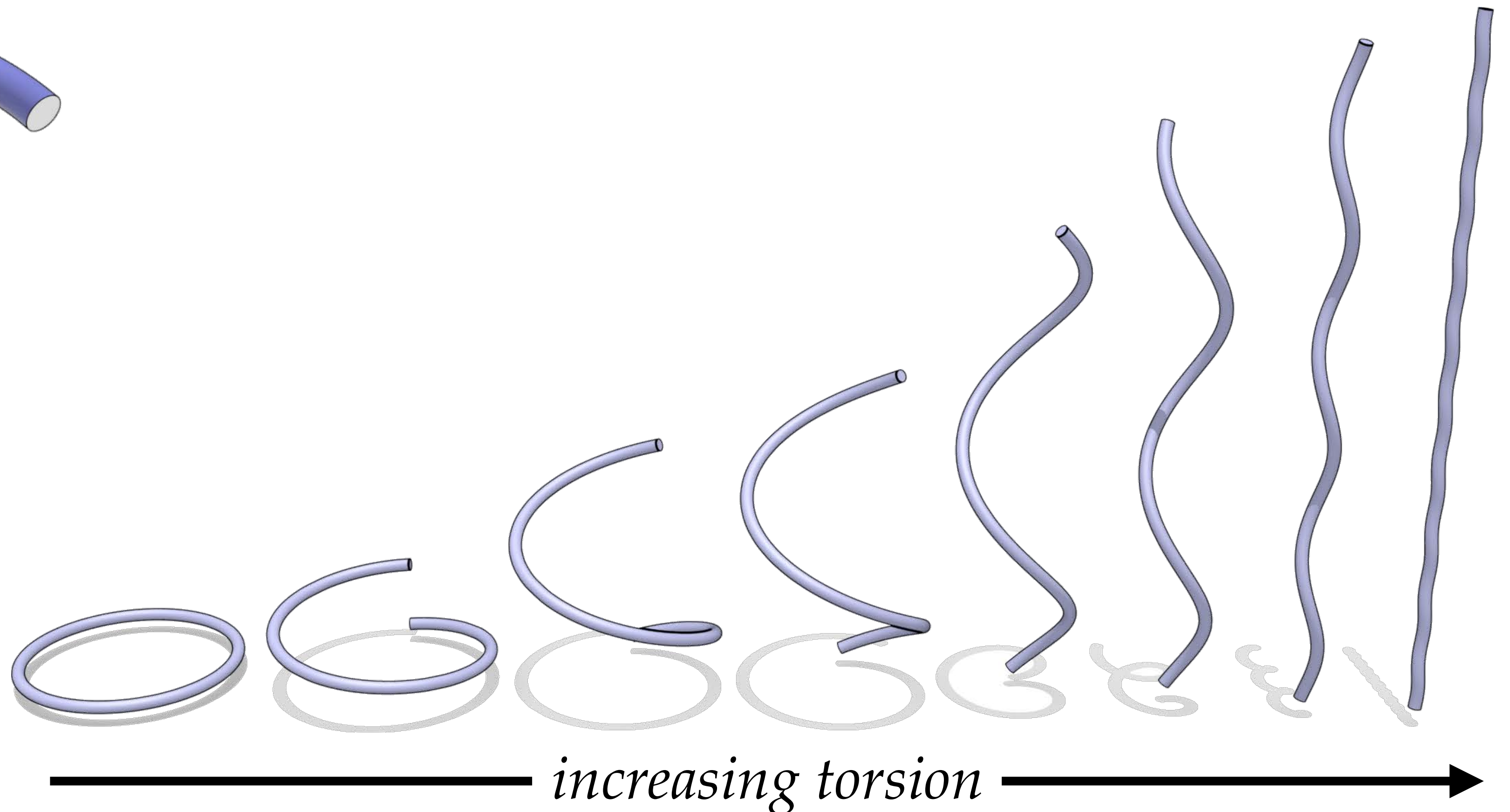
Here the angle brackets denote the usual dot product, i.e., $\langle (a, b), (x, y) \rangle := ax + by$.

Review: Curvature and Torsion of a Space Curve

- For a plane curve, *curvature* captured the notion of “bending”
- For a space curve we also have *torsion*, which captures “twisting”



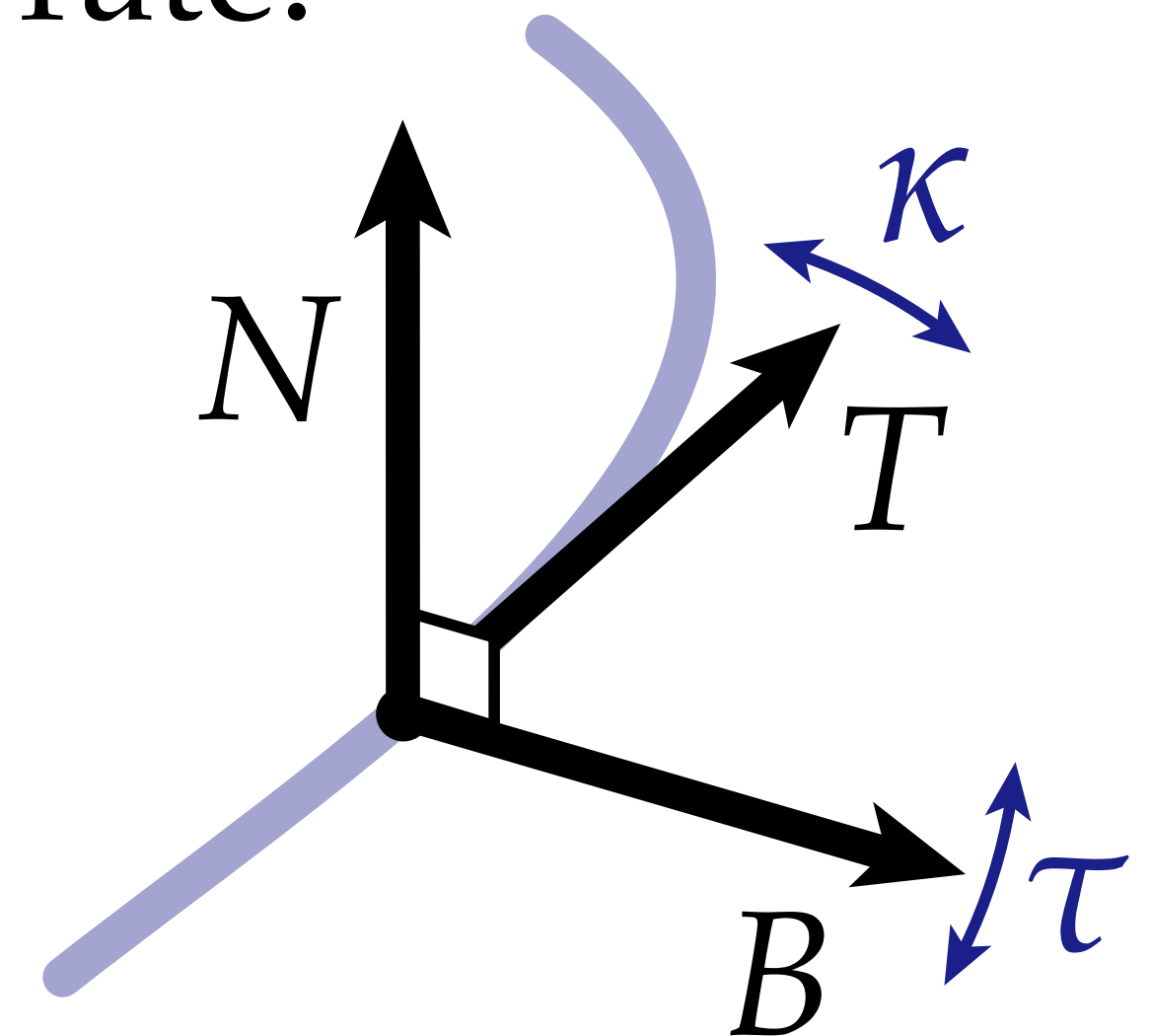
Intuition: torsion is
“out of plane bending”



Review: Fundamental Theorem of Space Curves

- The *fundamental theorem of space curves* tells that given the curvature κ and torsion τ of an arc-length parameterized space curve, we can recover the curve (up to rigid motion)
- Formally: integrate the *Frenet-Serret equations*; intuitively: start drawing a curve, bend & twist at prescribed rate.

$$\frac{d}{ds} \begin{bmatrix} T \\ N \\ B \end{bmatrix} = \begin{bmatrix} 0 & -\kappa & 0 \\ \kappa & 0 & -\tau \\ 0 & \tau & 0 \end{bmatrix} \begin{bmatrix} T \\ N \\ B \end{bmatrix}$$



Curvature of a Curve in a Surface

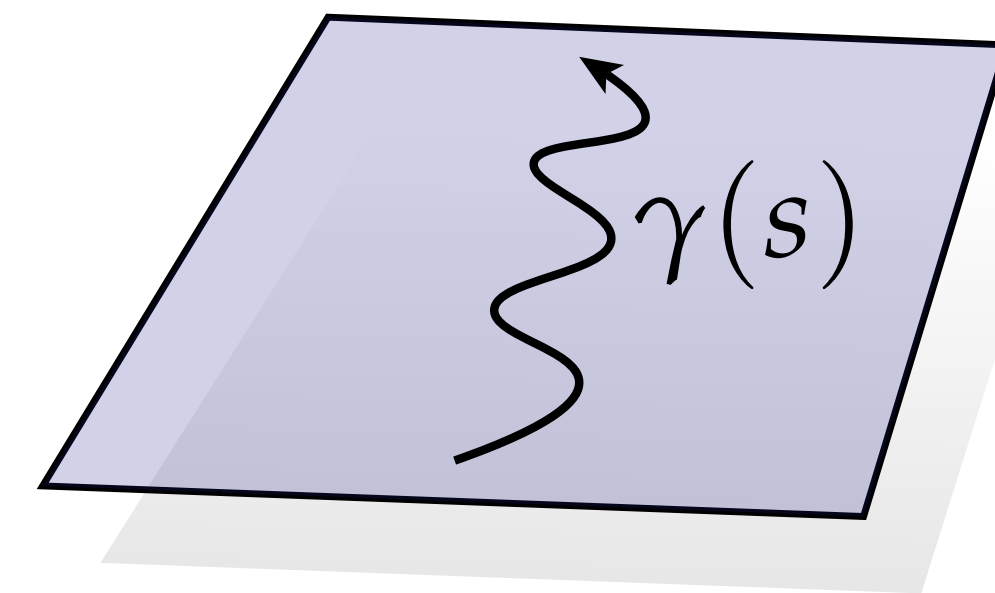
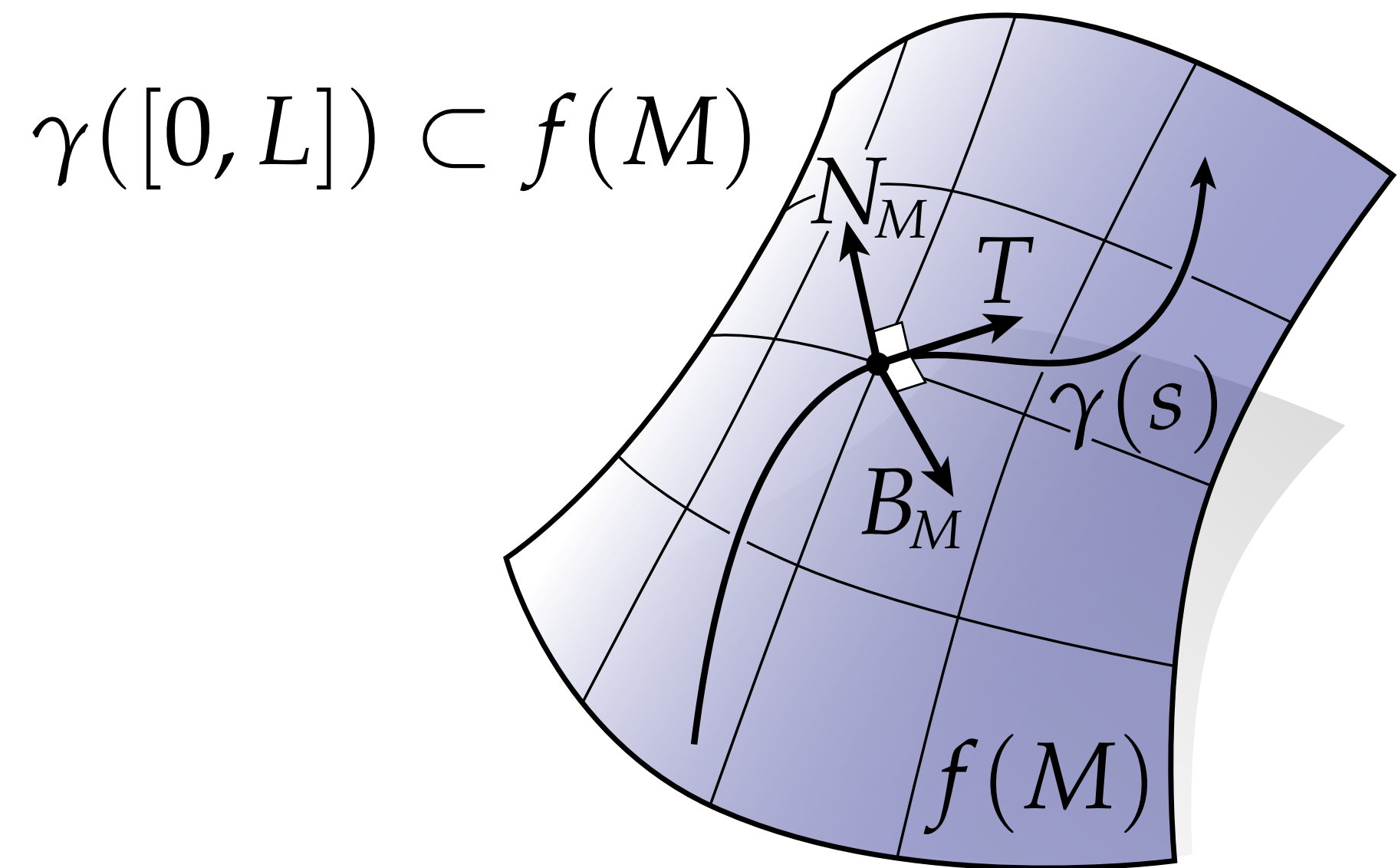
- Earlier, broke the “bending” of a space curve into curvature (κ) and torsion (τ)
- For a curve *in a surface*, can instead break into *normal* and *geodesic* curvature

$$\kappa_n := \langle N_M, \frac{d}{ds} T \rangle$$

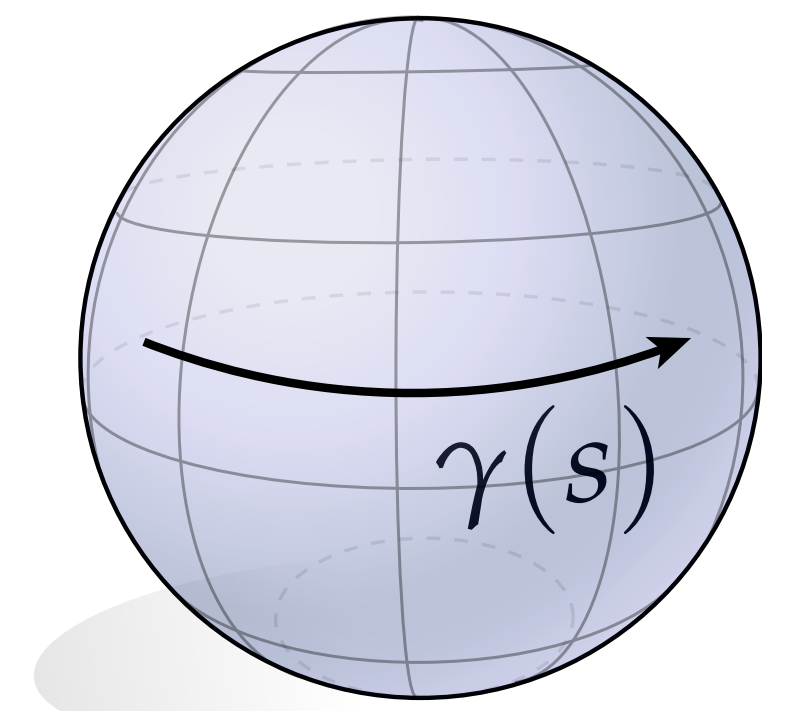
$$\kappa_g := \langle B_M, \frac{d}{ds} T \rangle$$

- T is still tangent of the curve; but unlike the Frenet frame, N_M is the normal of the surface and $B_M := T \times N_M$

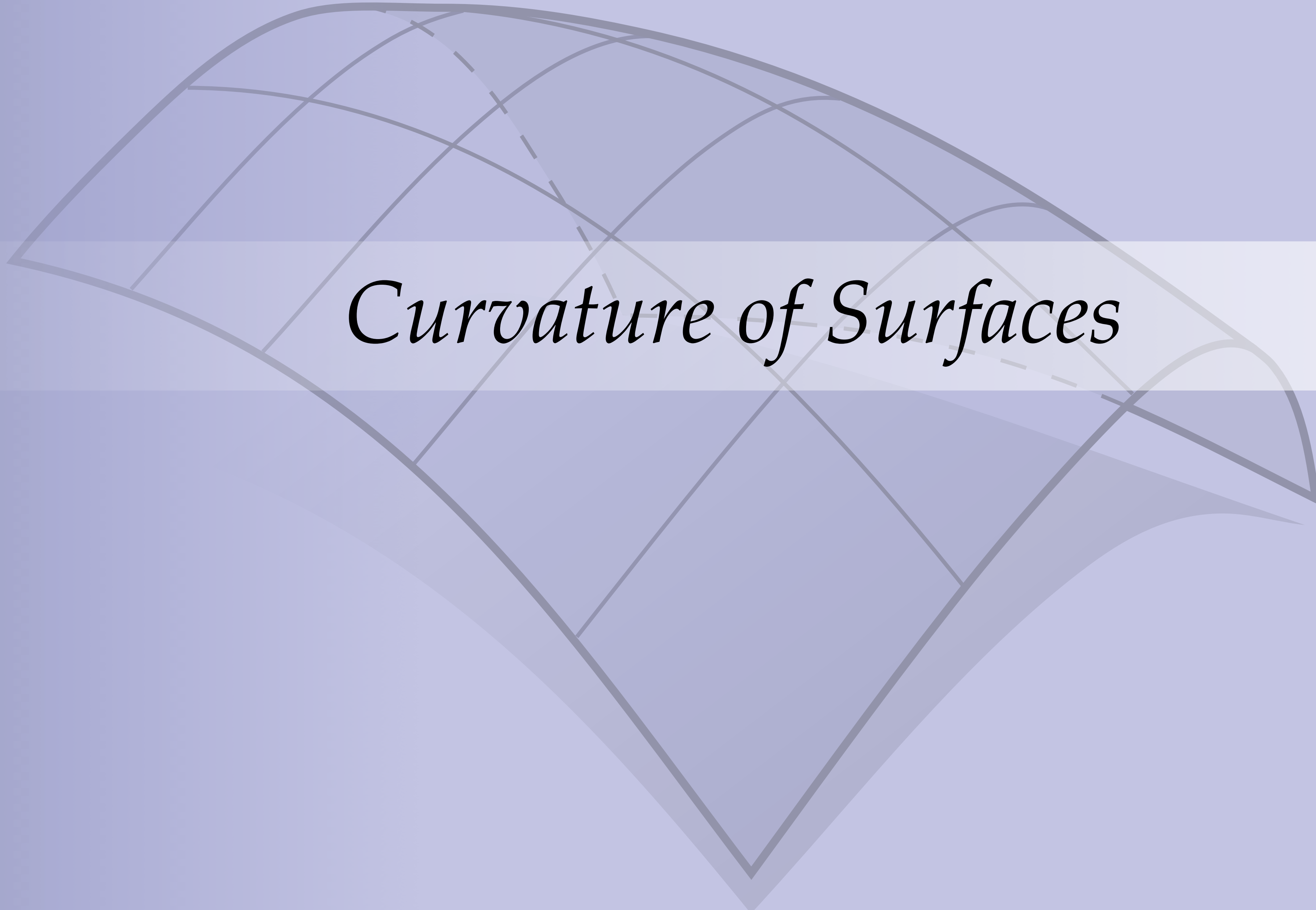
Q: Why no third curvature $\langle T_M, \frac{d}{ds} T \rangle$?



large κ_g ;
small κ_n



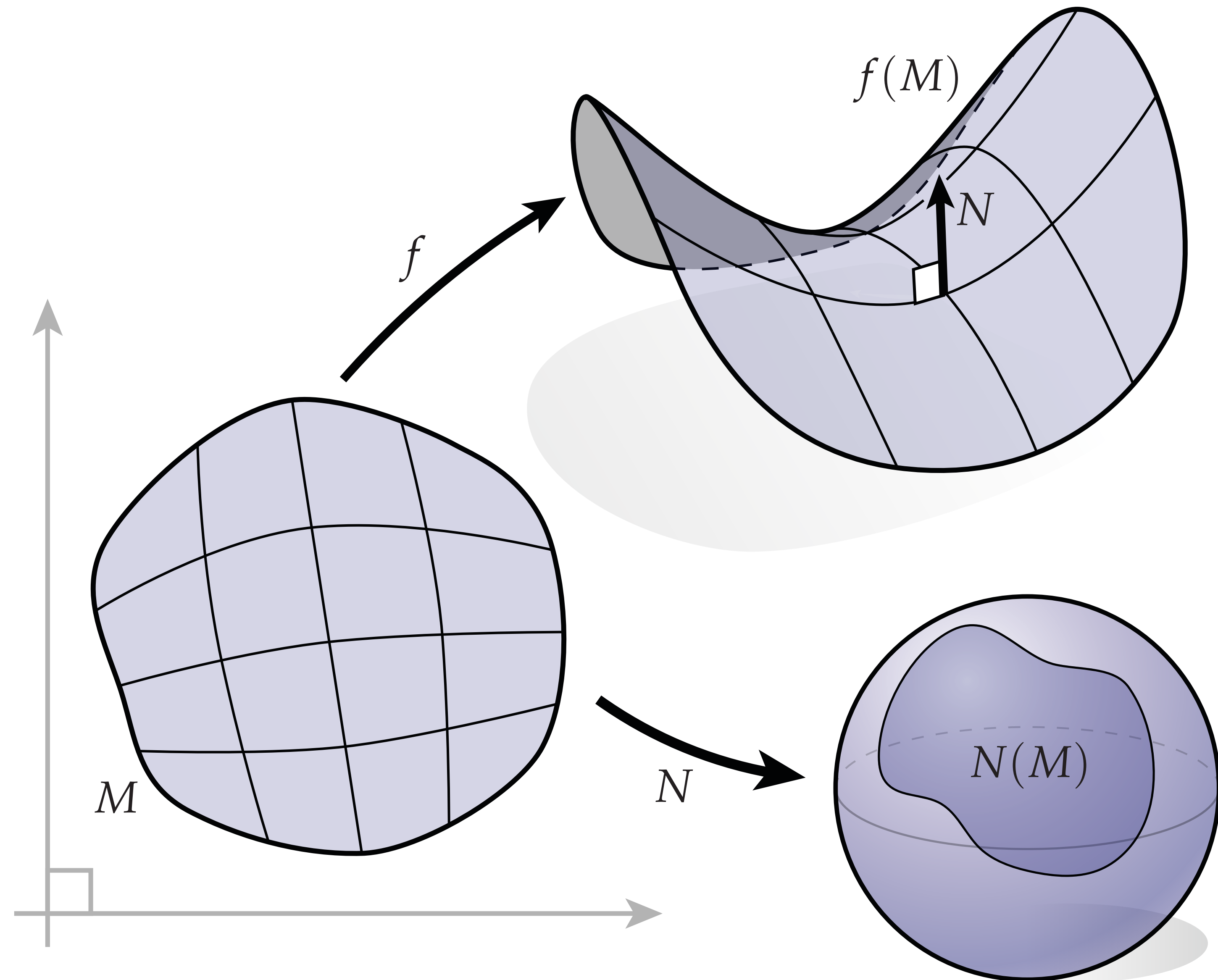
large κ_n ;
small κ_g



Curvature of Surfaces

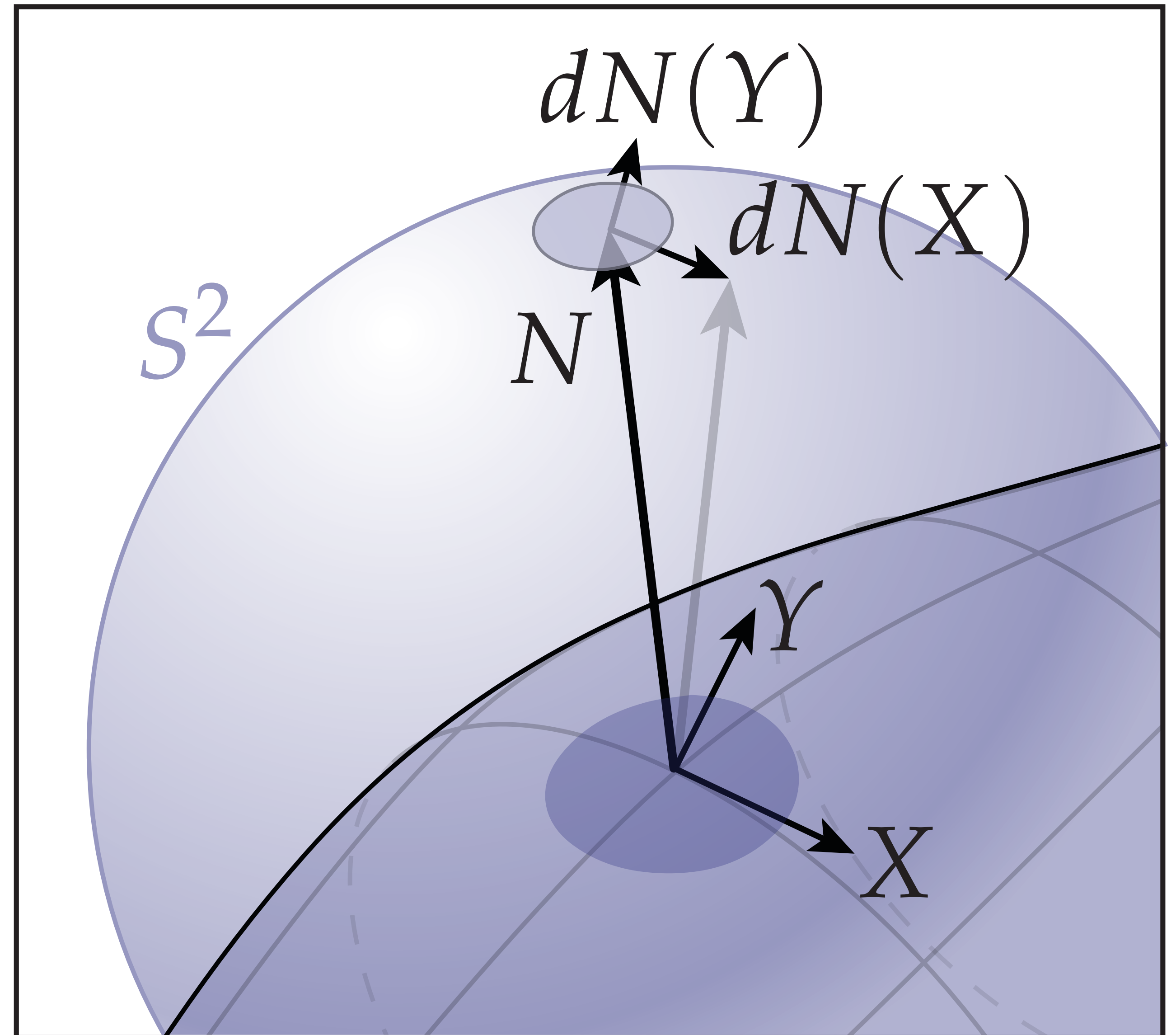
Gauss Map

- The **Gauss map** N is a *continuous* map taking each point on the surface to a *unit* normal vector
- Can visualize Gauss map as a map from the domain to the unit sphere



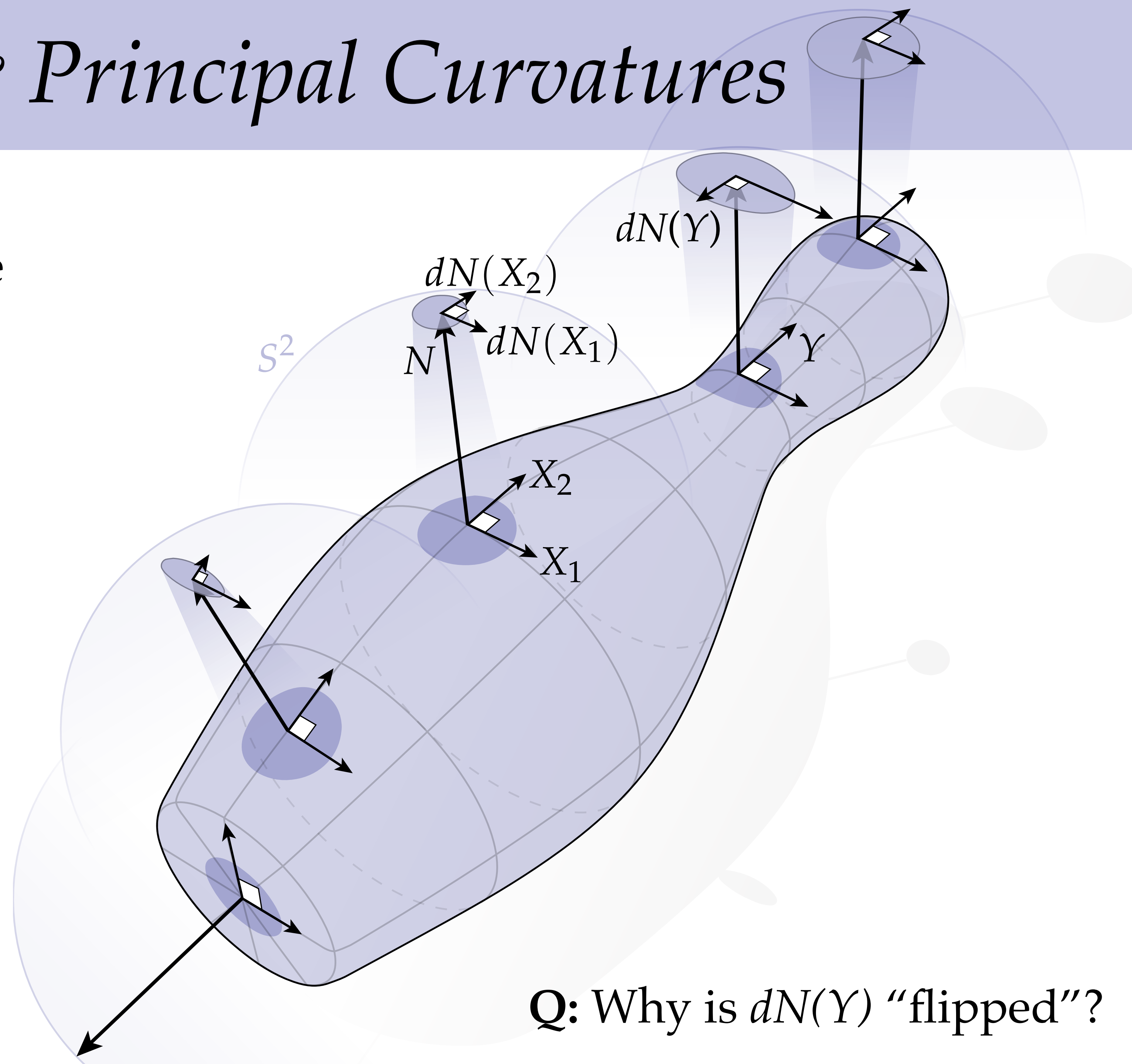
Weingarten Map

- The **Weingarten map** dN is the differential of the Gauss map N
- At any point, $dN(X)$ gives the change in the normal vector along a given direction X
- Since change in *unit* normal cannot have any component in the normal direction, $dN(X)$ is always tangent to the surface
- Can also think of $dN(X)$ as a vector tangent to the unit sphere S^2



Weingarten Map & Principal Curvatures

- In general, a tiny ball around a point will map to an *ellipse* on the unit sphere
- **Principal directions.**
Axes of this ellipse X_1 and X_2 describe the direction along which the normal changes the most/least
- **Principal curvatures.**
Corresponding radii of these ellipses, κ_1 and κ_2 describe the biggest/smallest rates of change



Q: Why is $dN(Y)$ "flipped"?

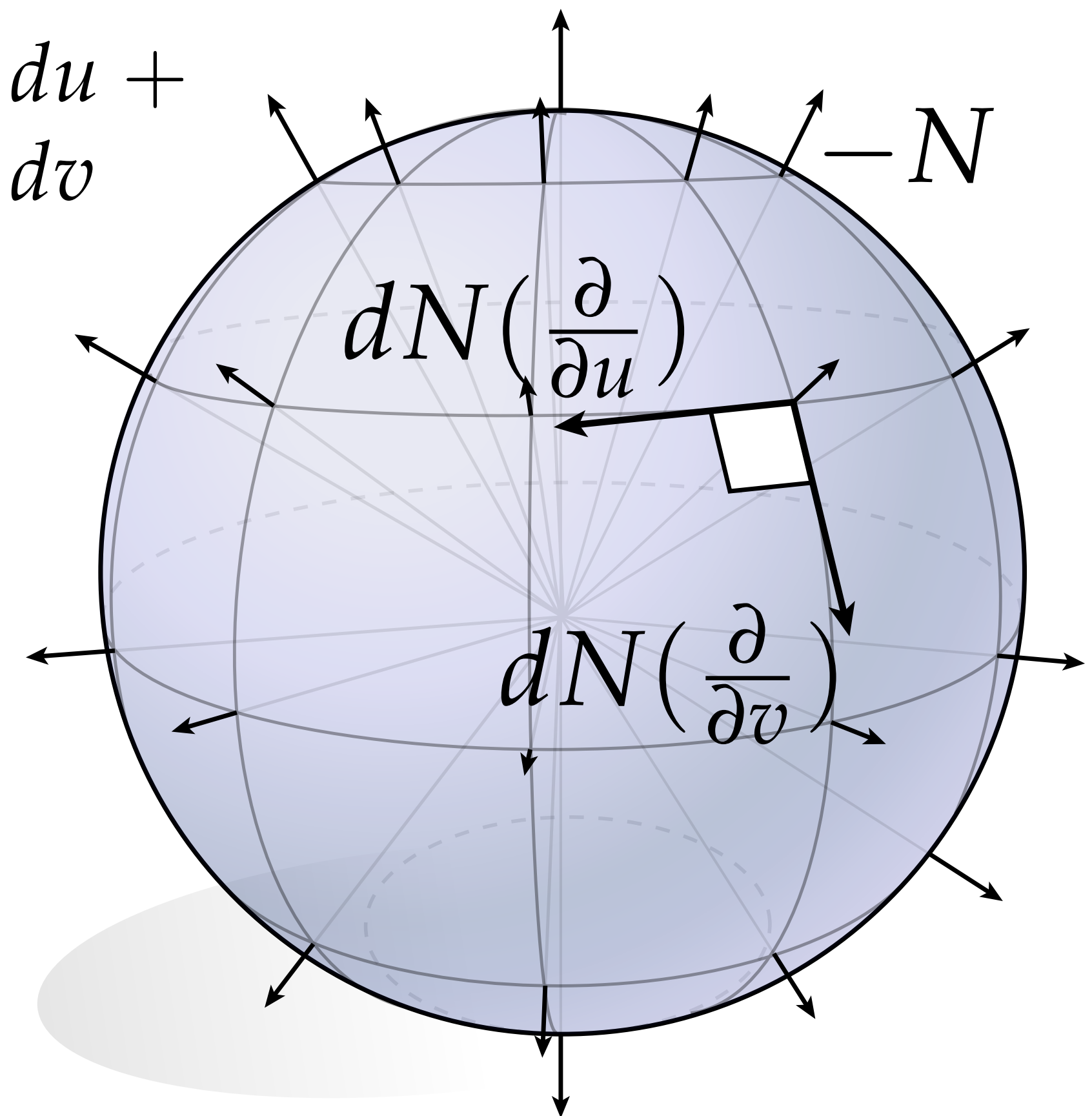
Weingarten Map—Example

- Recall that for the sphere, $N = -f$. Hence, Weingarten map dN is just $-df$:

$$f := (\cos(u) \sin(v), \sin(u) \sin(v), \cos(v))$$

$$df = \begin{pmatrix} -\sin(u) \sin(v) & \cos(u) \sin(v) & 0 \\ \cos(u) \cos(v) & \cos(v) \sin(u) & -\sin(v) \end{pmatrix} du +$$

$$dN = \begin{pmatrix} \sin(u) \sin(v) & -\cos(u) \sin(v) & 0 \\ -\cos(u) \cos(v) & -\cos(v) \sin(u) & \sin(v) \end{pmatrix} du$$



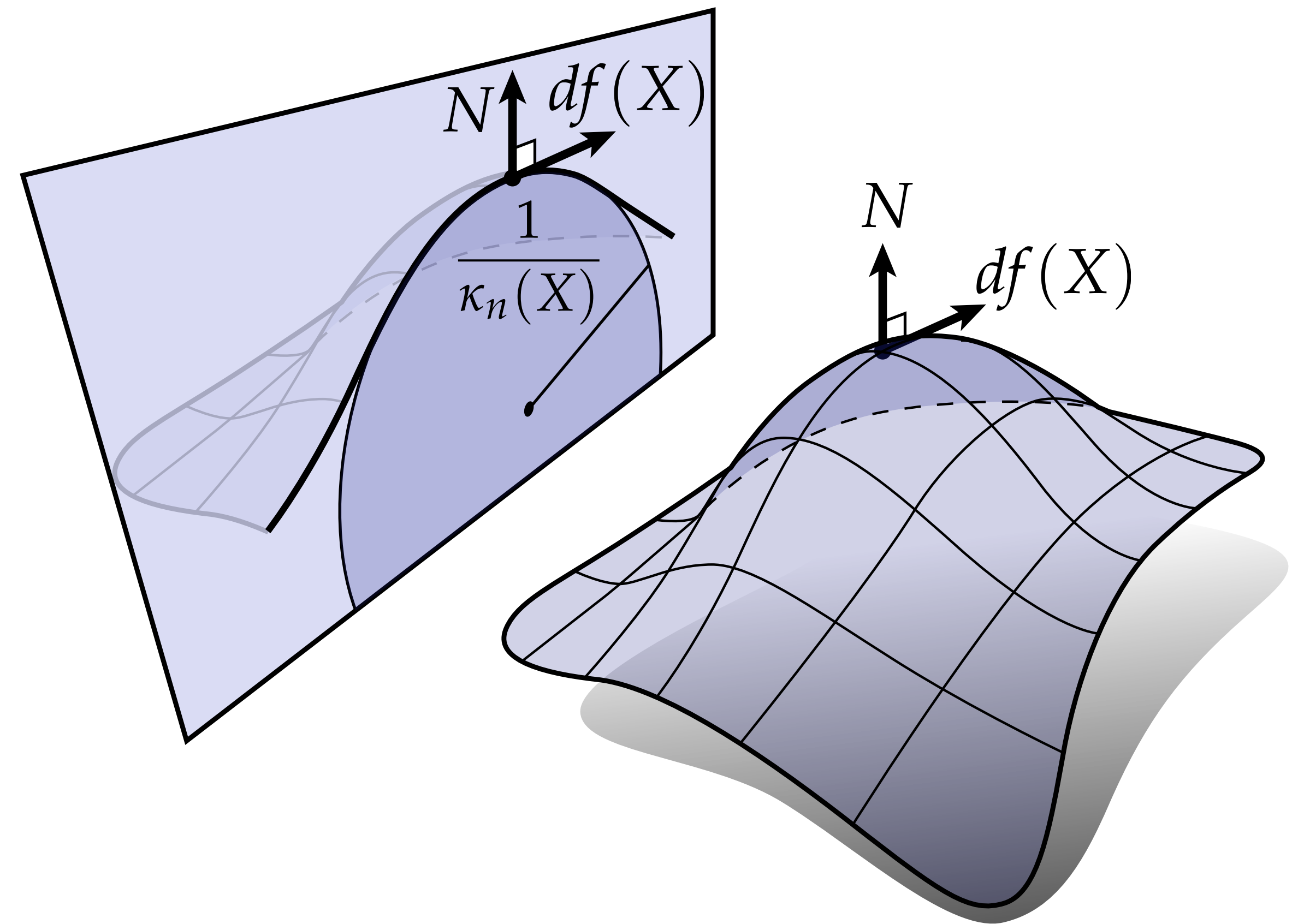
Key idea: computing the Weingarten map is no different from computing the differential of a surface.

Normal Curvature

- For curves, curvature was the rate of change of the *tangent*; for immersed surfaces, we'll instead consider how quickly the *normal* is changing.*
- In particular, **normal curvature** is rate at which normal is bending along a given tangent direction:

$$\kappa_N(X) := \frac{\langle df(X), dN(X) \rangle}{|df(X)|^2}$$

- Equivalent to intersecting surface with normal-tangent plane and measuring the usual curvature of a plane curve



*For plane curves, what would happen if we instead considered change in N ?

Normal Curvature—Example

Consider a parameterized cylinder:

$$f(u, v) := (\cos(u), \sin(u), v)$$

$$df = (-\sin(u), \cos(u), 0)du + (0, 0, 1)dv$$

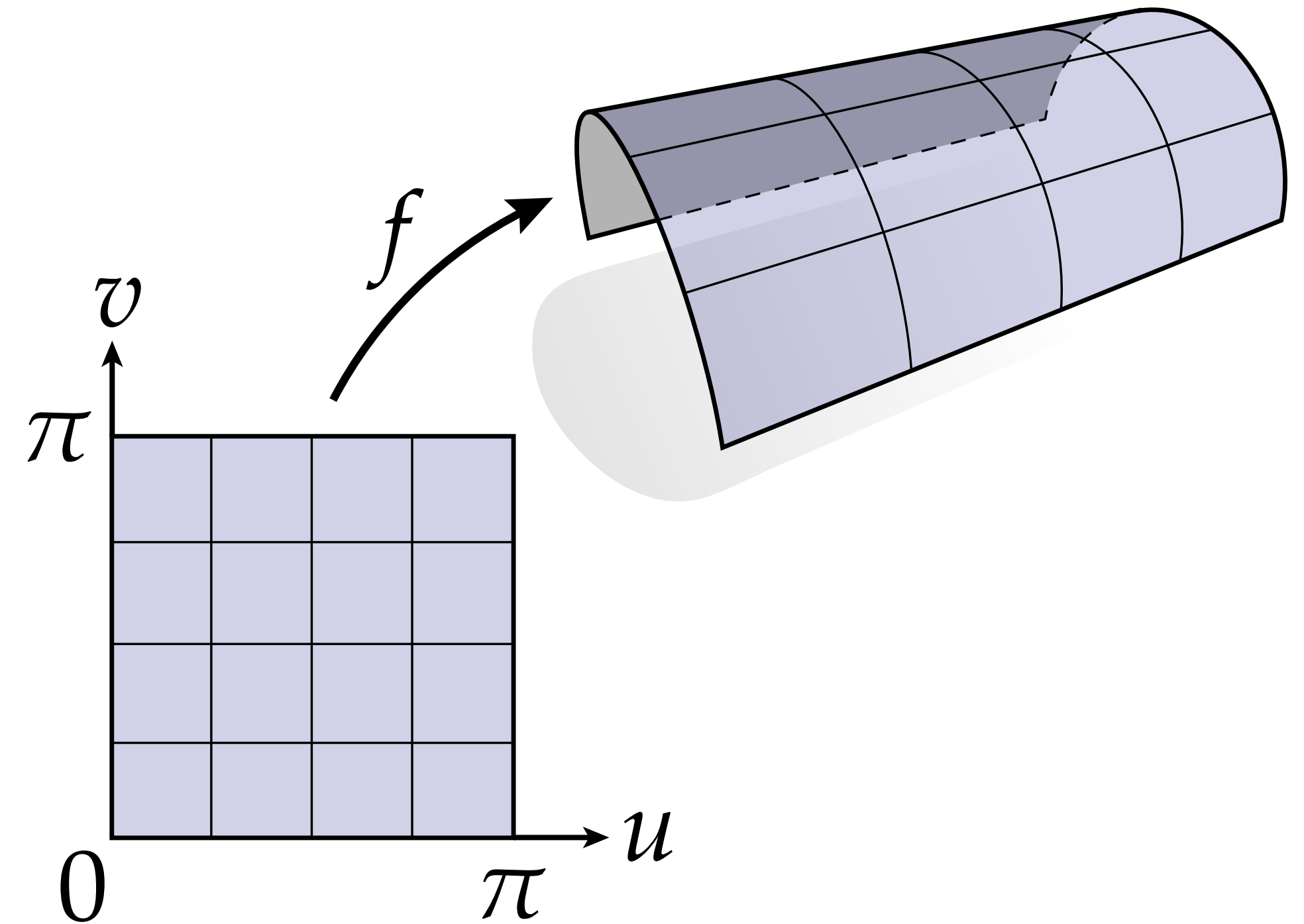
$$\begin{aligned} N &= (-\sin(u), \cos(u), 0) \times (0, 0, 1) \\ &= (\cos(u), \sin(u), 0) \end{aligned}$$

$$dN = (-\sin(u), \cos(u), 0)du$$

$$\kappa_N\left(\frac{\partial}{\partial u}\right) = \frac{\langle df\left(\frac{\partial}{\partial u}\right), dN\left(\frac{\partial}{\partial u}\right) \rangle}{|df\left(\frac{\partial}{\partial u}\right)|^2} = \frac{(-\sin(u), \cos(u), 0) \cdot (-\sin(u), \cos(u), 0)}{|(-\sin(u), \cos(u), 0)|^2} = 1$$

$$\kappa_N\left(\frac{\partial}{\partial v}\right) = \dots = 0$$

Q: Does this result make sense geometrically?

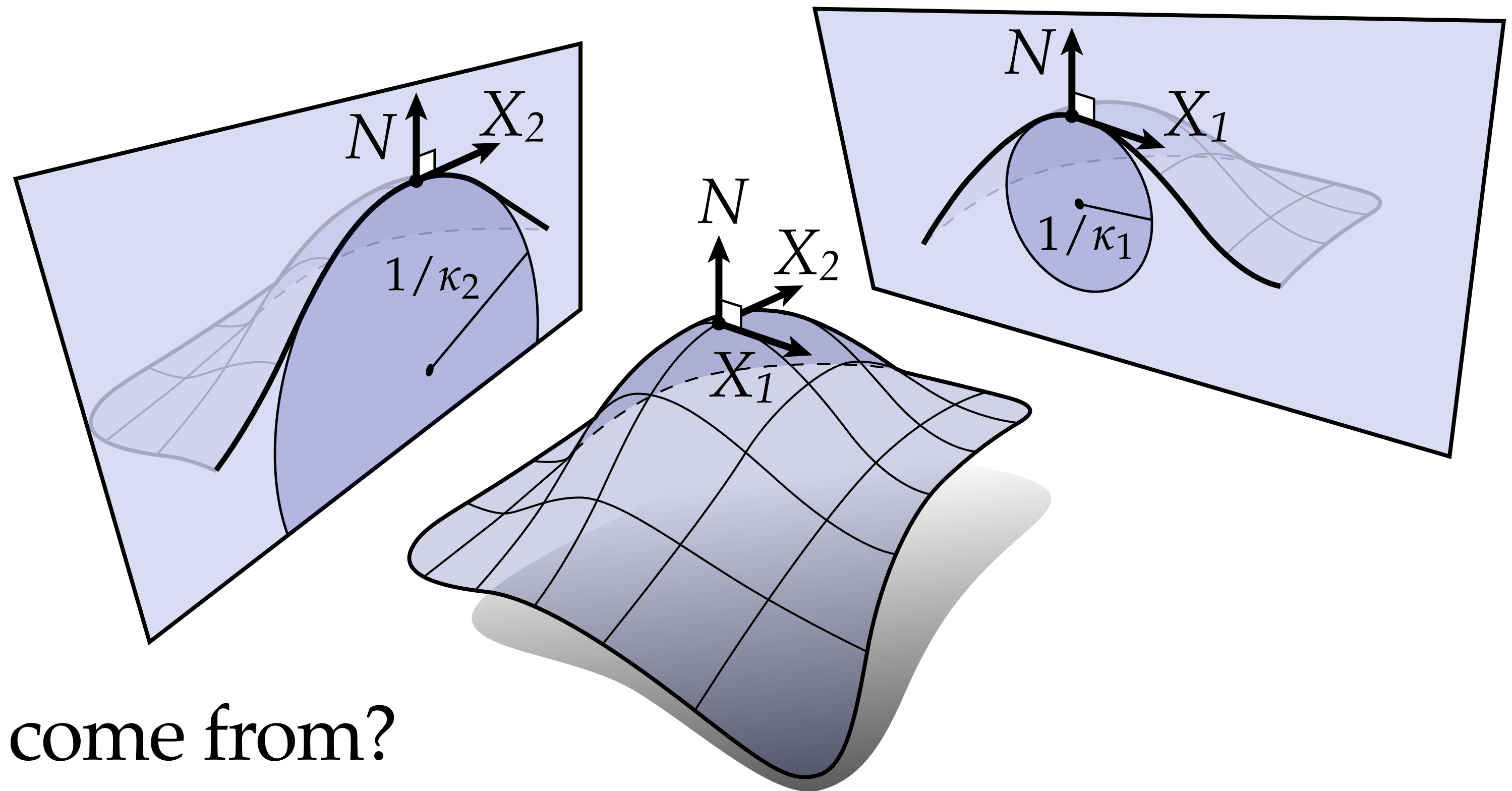


Principal Curvature

- Among all directions X , there are two **principal directions** X_1, X_2 where normal curvature has minimum / maximum value (respectively)
- Corresponding normal curvatures are the **principal curvatures**
- Two critical facts*:

1. $g(X_1, X_2) = 0$

2. $dN(X_i) = \kappa_i df(X_i)$



Where do these relationships come from?

Shape Operator

- The change in the normal N is always *tangent* to the surface
- Must therefore be some linear map S from tangent vectors to tangent vectors, called the **shape operator**, such that

$$df(SX) = dN(X)$$

- Principal directions are the *eigenvectors* of S
- Principal curvatures are *eigenvalues* of S
- **Note:** S is not a symmetric matrix! Hence, eigenvectors are not orthogonal in R^2 ; only orthogonal with respect to induced metric g .

Shape Operator—Example

Consider a nonstandard parameterization of the cylinder (*sheared* along z):

$$f(u, v) := (\cos(u), \sin(u), u + v) \quad df = (-\sin(u), \cos(u), 1)du + (0, 0, 1)dv$$

$$N = (\cos(u), \sin(u), 0) \quad dN = (-\sin(u), \cos(u), 0)du$$

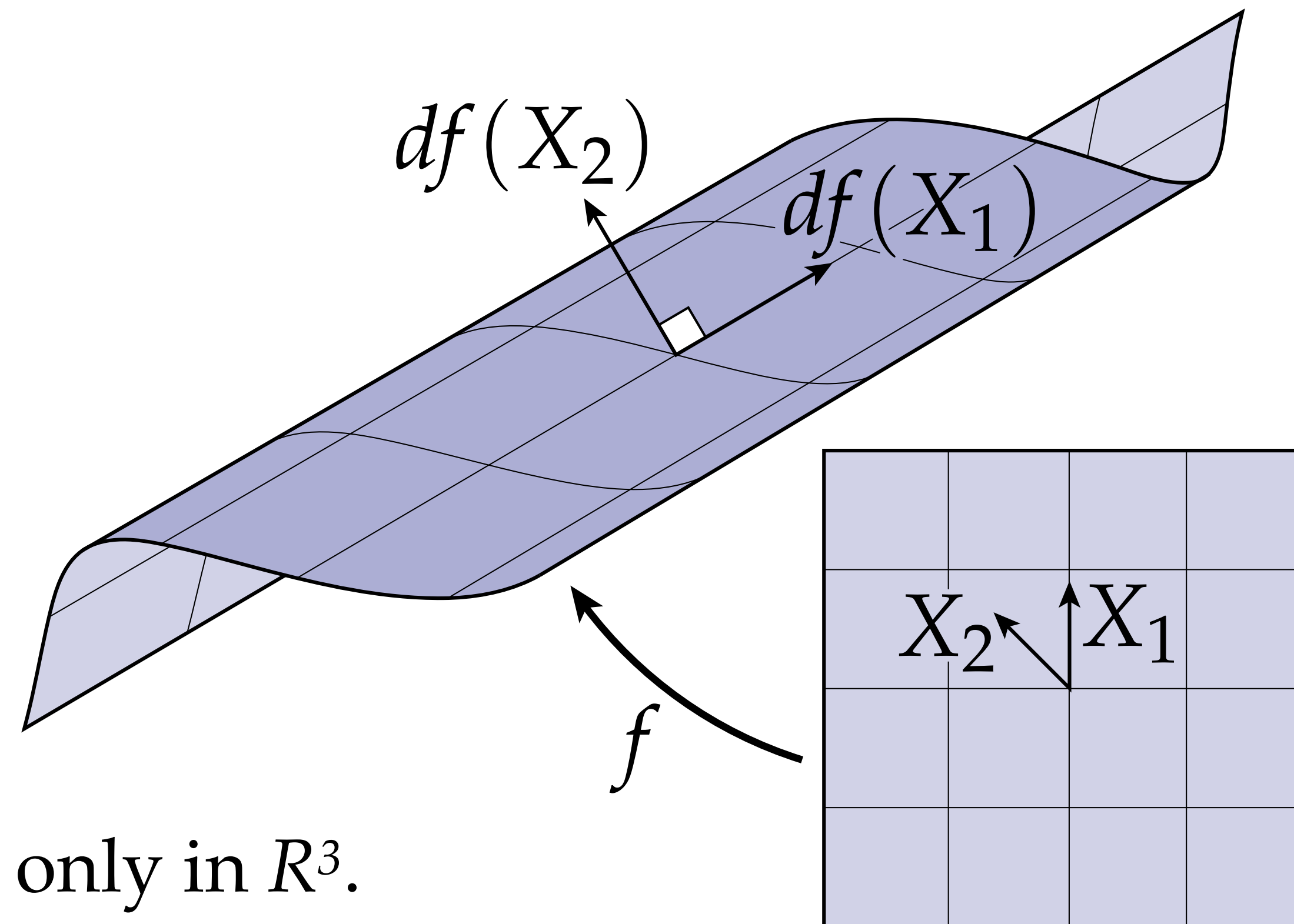
$$df \circ S = dN$$

$$\begin{bmatrix} -\sin(u) & 0 \\ \cos(u) & 0 \\ 1 & 1 \end{bmatrix} \begin{bmatrix} S_{11} & S_{12} \\ S_{21} & S_{22} \end{bmatrix} = \begin{bmatrix} -\sin(u) & 0 \\ \cos(u) & 0 \\ 0 & 0 \end{bmatrix}$$

$$\Rightarrow S = \begin{bmatrix} 1 & 0 \\ -1 & 0 \end{bmatrix} \quad X_1 = \begin{bmatrix} 0 \\ 1 \end{bmatrix} \quad X_2 = \begin{bmatrix} -1 \\ 1 \end{bmatrix}$$

$$df(X_1) = (0, 0, 1) \quad \kappa_1 = 0$$

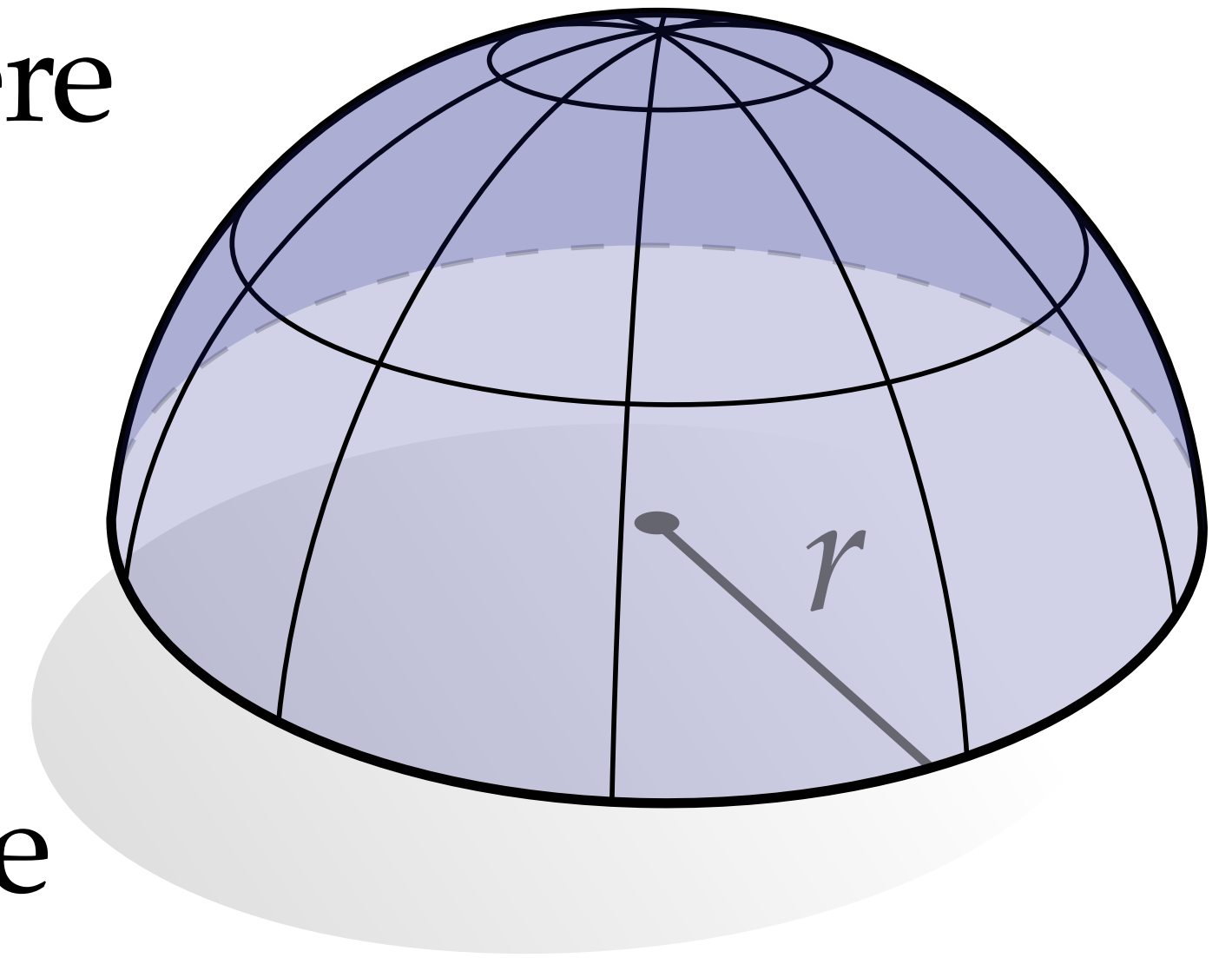
$$df(X_2) = (\sin(u), -\cos(u), 0) \quad \kappa_2 = 1$$



Key observation: principal directions orthogonal only in R^3 .

Umbilic Points

- Points where principal curvatures are equal are called **umbilic points**
- Principal *directions* are not uniquely determined here
- What happens to the shape operator S ?
 - May still have full rank!
 - Just have repeated eigenvalues, 2-dim. eigenspace

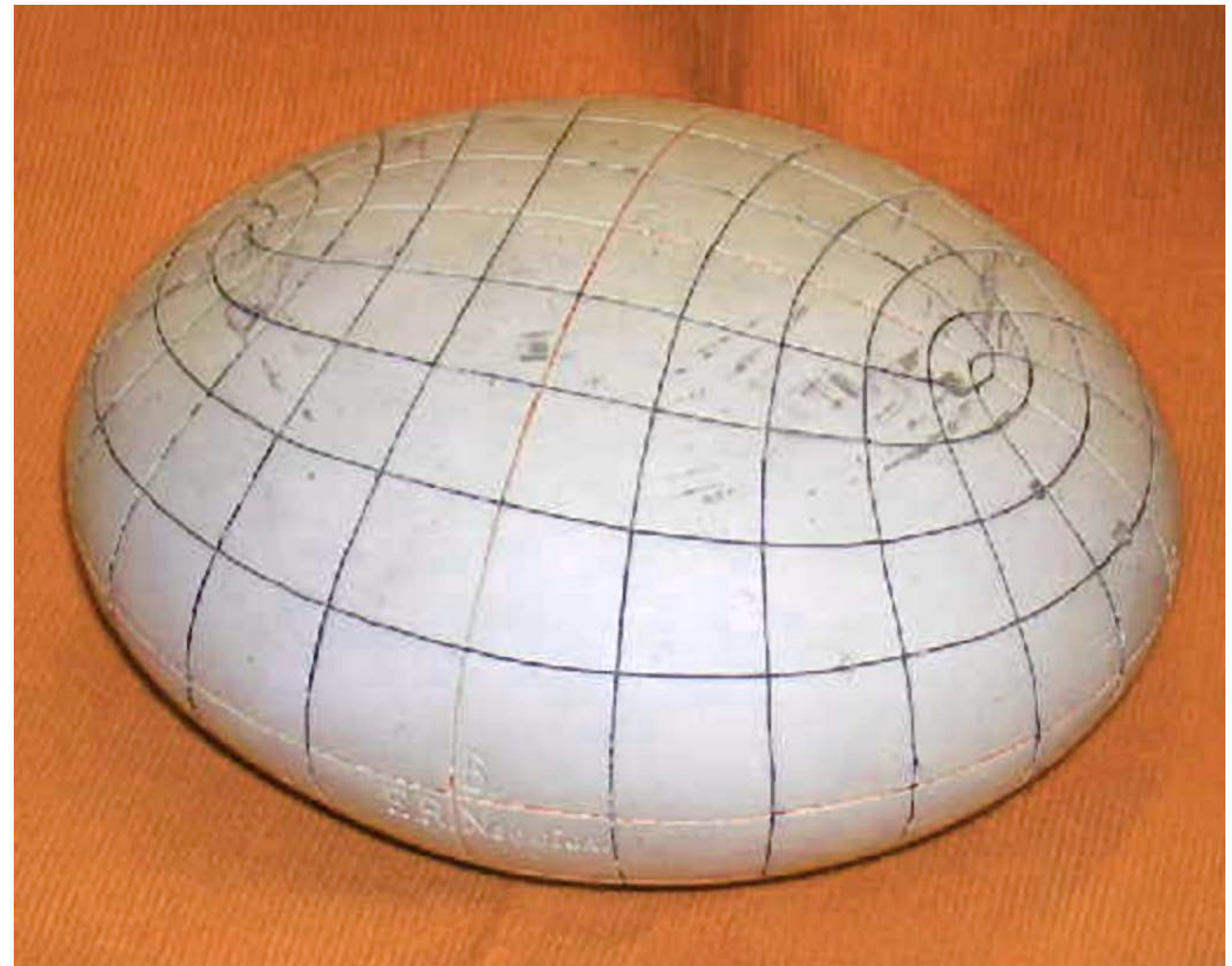
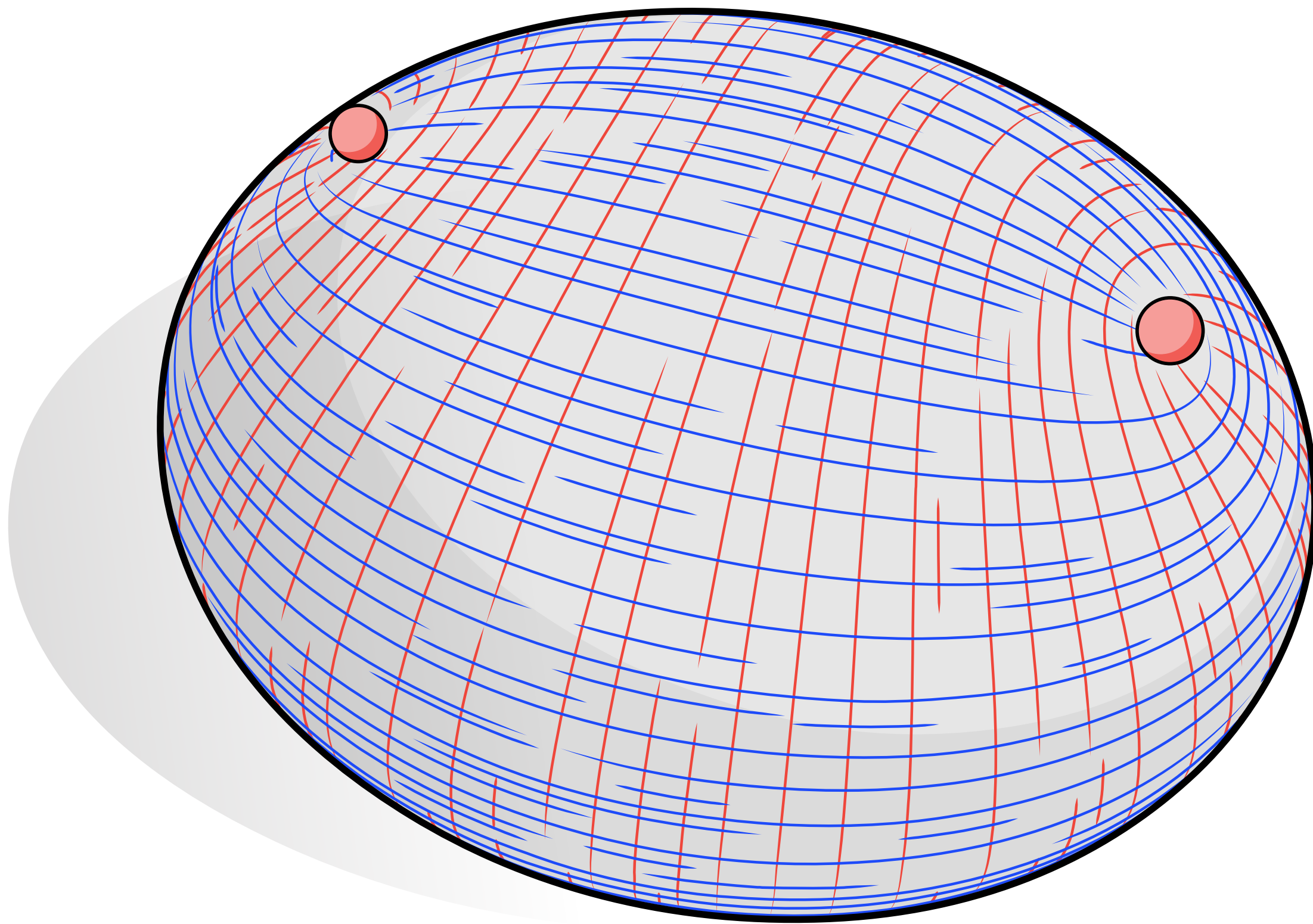


$$S = \begin{bmatrix} 1/r & 0 \\ 0 & 1/r \end{bmatrix} \quad \kappa_1 = \kappa_2 = \frac{1}{r} \quad \forall X, SX = \frac{1}{r}X$$

Could still of course choose (arbitrarily) an orthonormal pair $X_1, X_2 \dots$

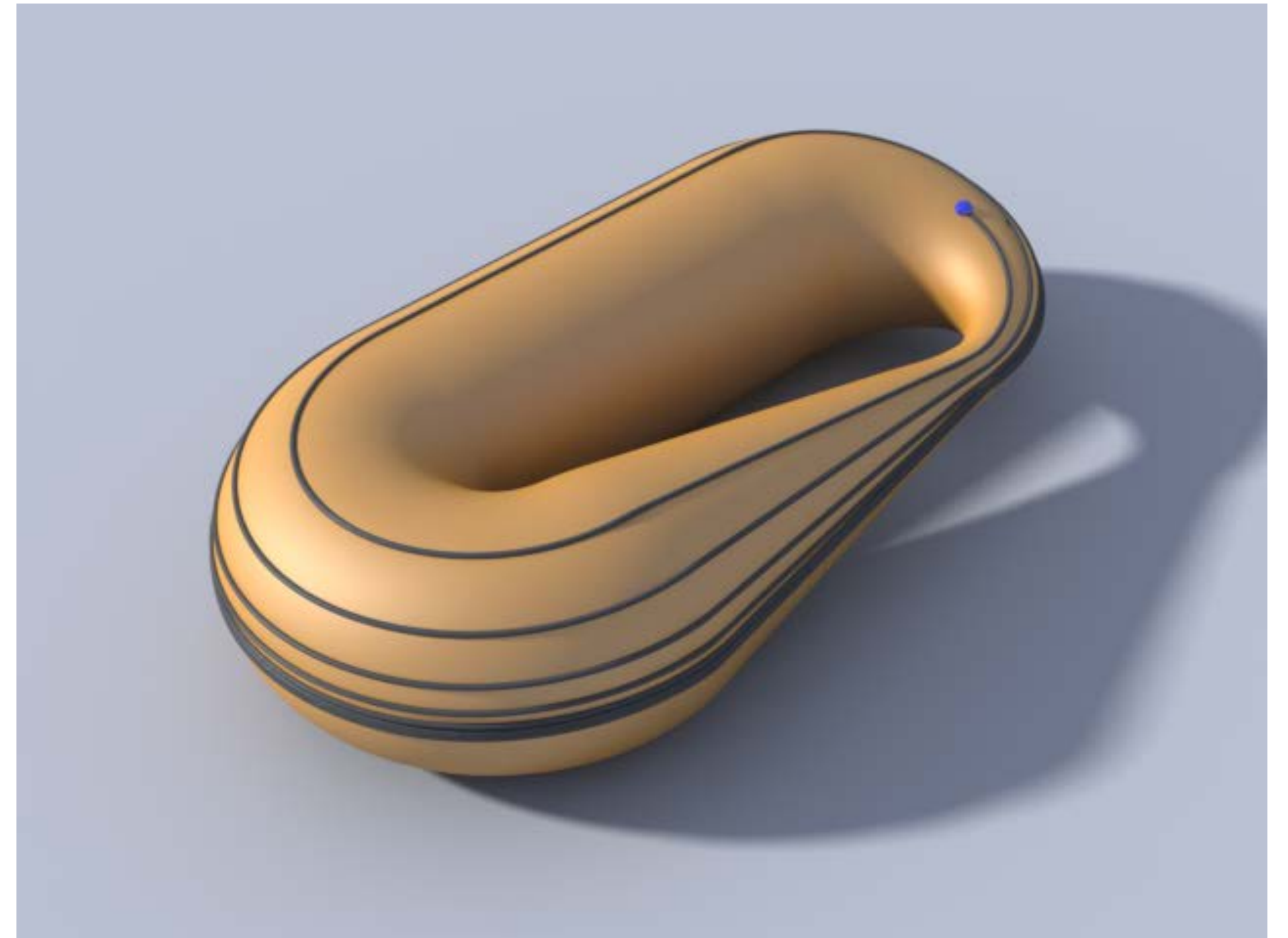
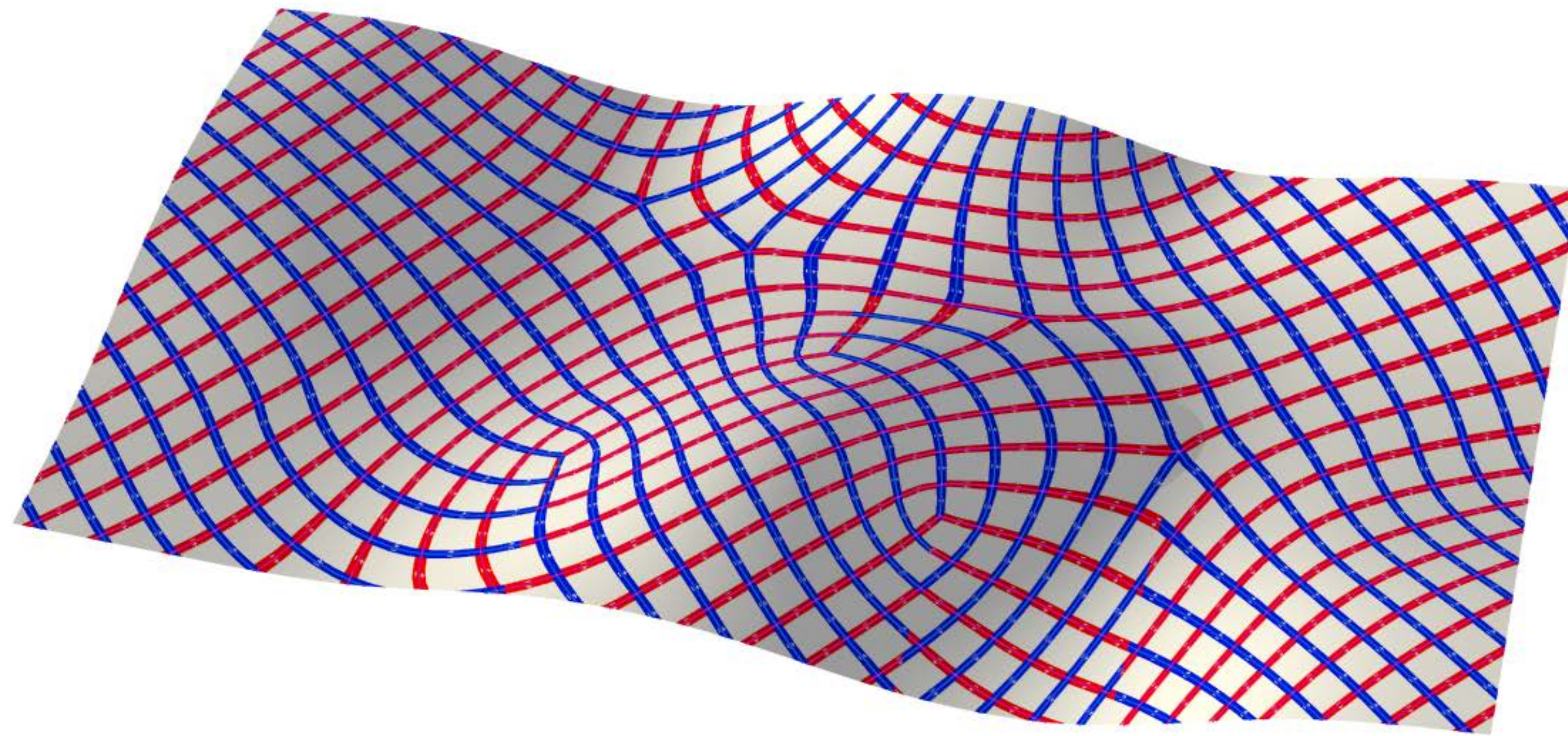
Principal Curvature Nets

- Walking along principal direction field yields **principal curvature lines**
- Collection of all such lines is called the **principal curvature network**



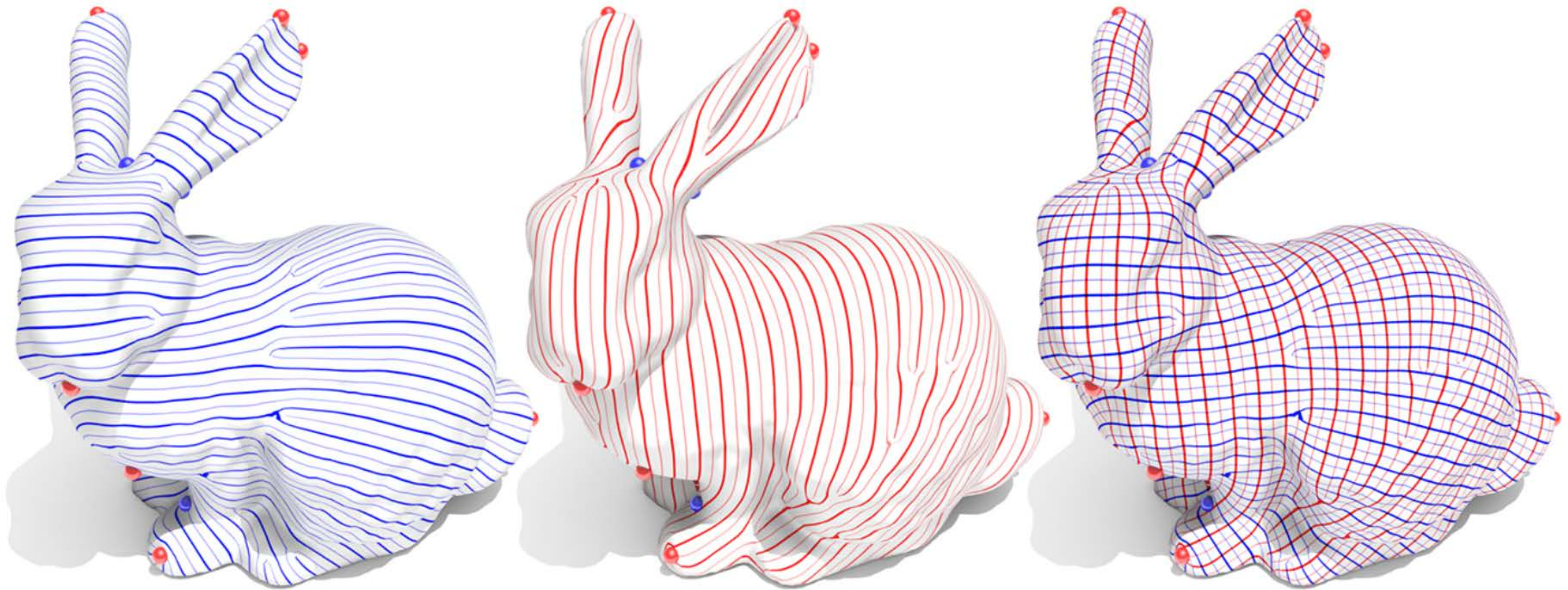
Separatrices and Spirals

- If we keep walking along a principal curvature line, where do we end up?
- Sometimes, a curvature line terminates at an umbilic point in both directions; these so-called **separatrices** (can) split network into regular patches.
- Other times, we make a closed loop. More often, however, behavior is *not* so nice!



Application—Quad Remeshing

- Recent approach to quad meshing: construct net *roughly* aligned with principal curvature (but in a way that avoids spirals!)

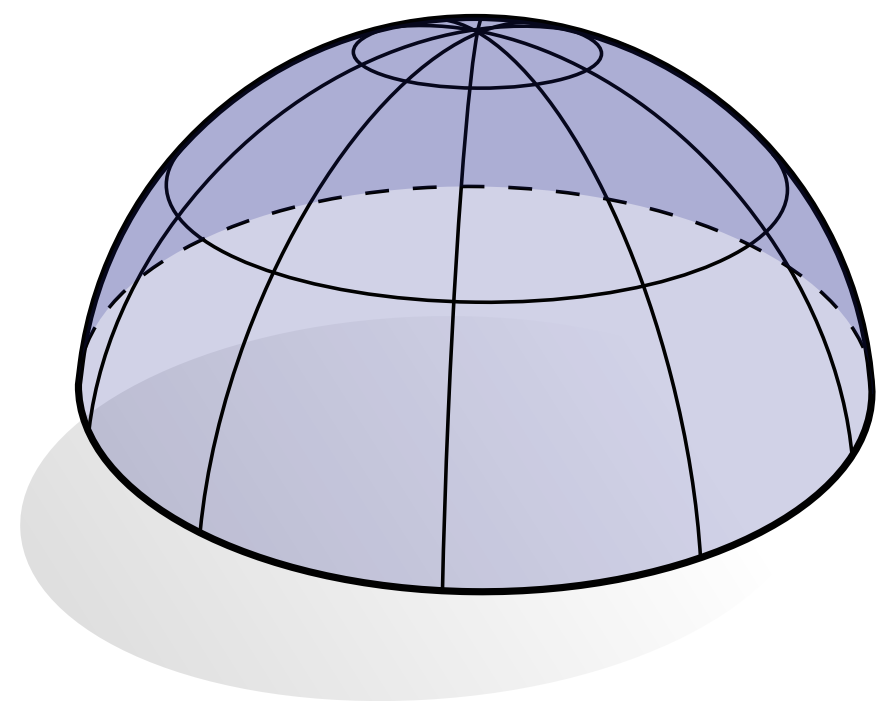


from Knöppel, Crane, Pinkall, Schröder, “*Stripe Patterns on Surfaces*”

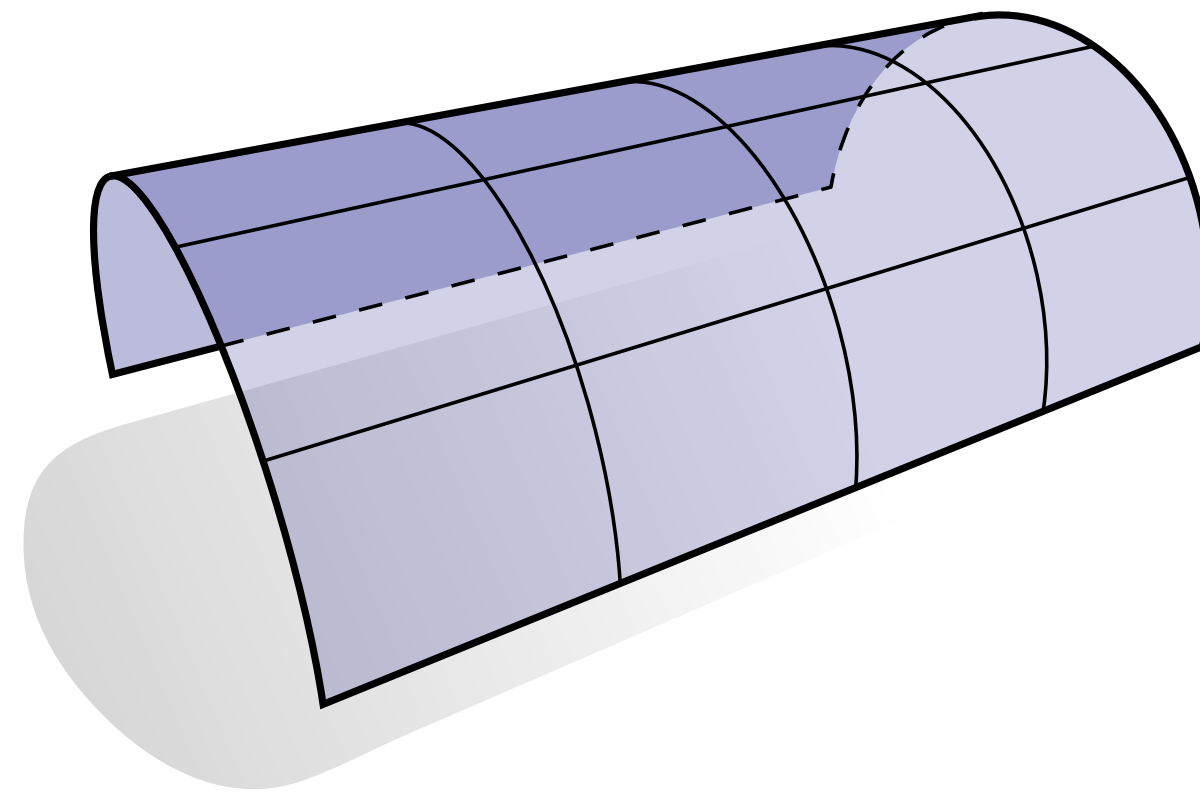
Gaussian and Mean Curvature

Gaussian and *mean* curvature also fully describe local bending:

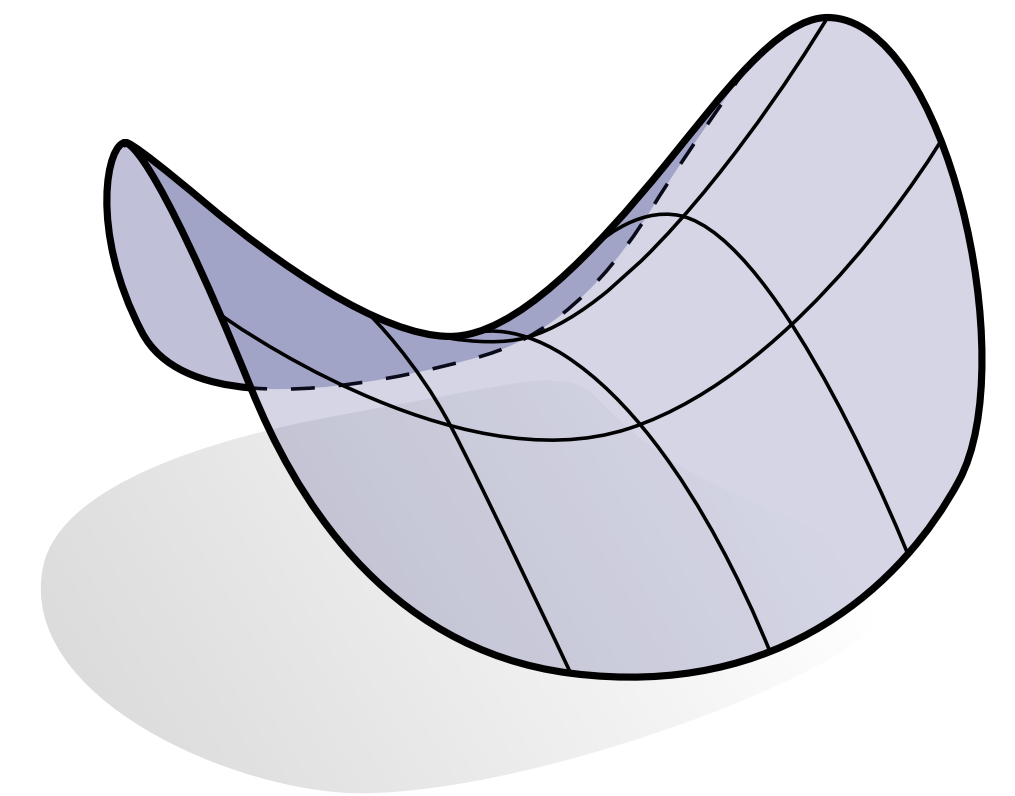
$$\begin{array}{ll} \text{Gaussian} & K := \kappa_1 \kappa_2 \\ \text{mean}^* & H := \frac{1}{2}(\kappa_1 + \kappa_2) \end{array}$$



“convex” $K > 0$
 $H \neq 0$



“developable” $K = 0$
 $H \neq 0$



$K < 0$
“minimal” $H = 0$

***Warning:** another common convention is to omit the factor of $1/2$

Gaussian Curvature—Intrinsic Definition

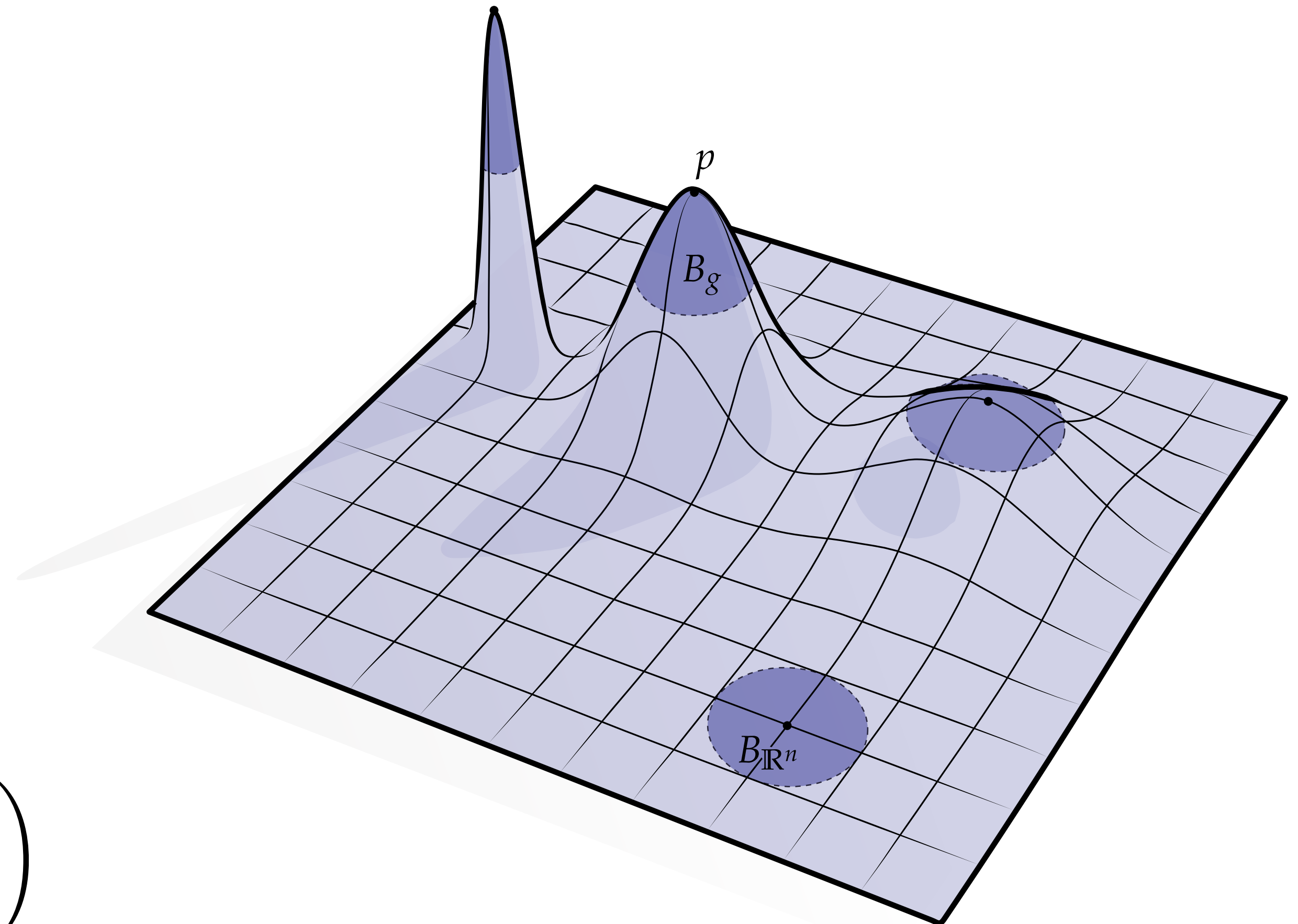
- Originally defined Gaussian curvature as product of principal curvatures
- Can also view it as “failure” of balls to behave like Euclidean balls

Roughly speaking,

$$K \propto 1 - \frac{|B_g|}{|B_{\mathbb{R}^2}|}$$

More precisely:

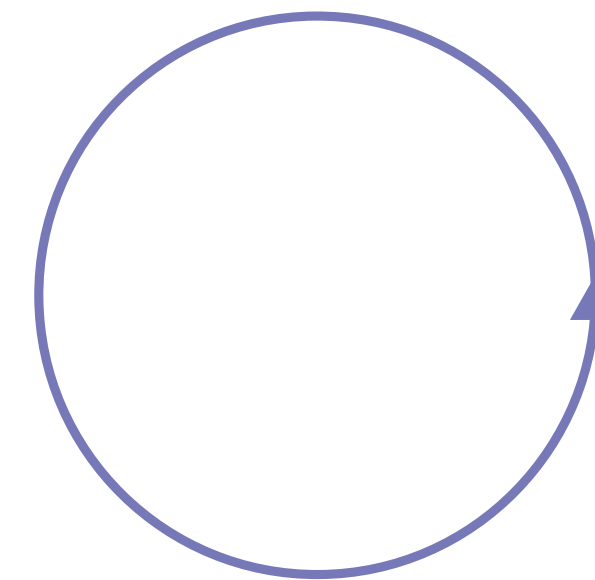
$$|B_g(p, \varepsilon)| = |B_{\mathbb{R}^2}(p, \varepsilon)| \left(1 - \frac{K}{12} \varepsilon^2 + O(\varepsilon^3) \right)$$



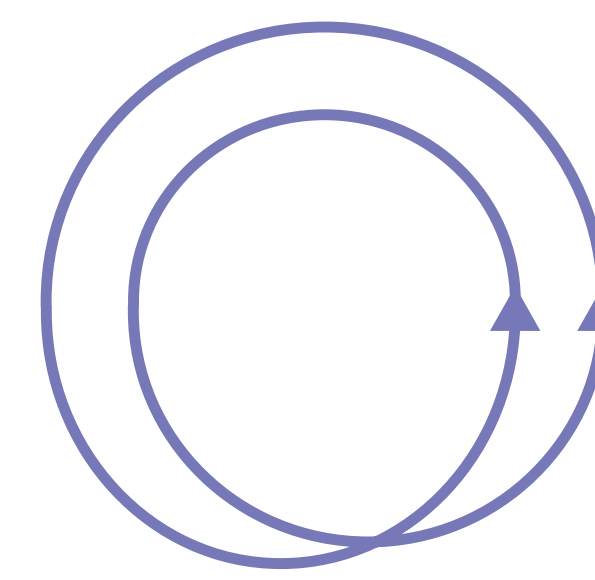
Gauss-Bonnet Theorem

- Recall that the total curvature of a closed plane curve was always equal to 2π times *turning number* k
- **Q:** Can we make an analogous statement about surfaces?
- **A:** Yes! Gauss-Bonnet theorem says total Gaussian curvature is always 2π times *Euler characteristic* χ
- For (closed, compact, orientable) surface of genus g , Euler characteristic given by

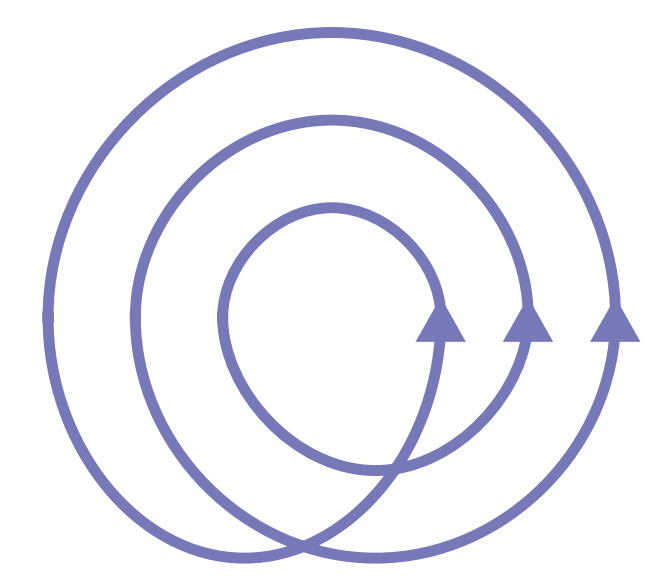
$$\chi := 2 - 2g$$



$k=1$



$k=2$



$k=3$



$g=0$



$g=1$



$g=2$



$g=3$

Curves

$$\int_0^L \kappa \, ds = 2\pi k$$

Surfaces

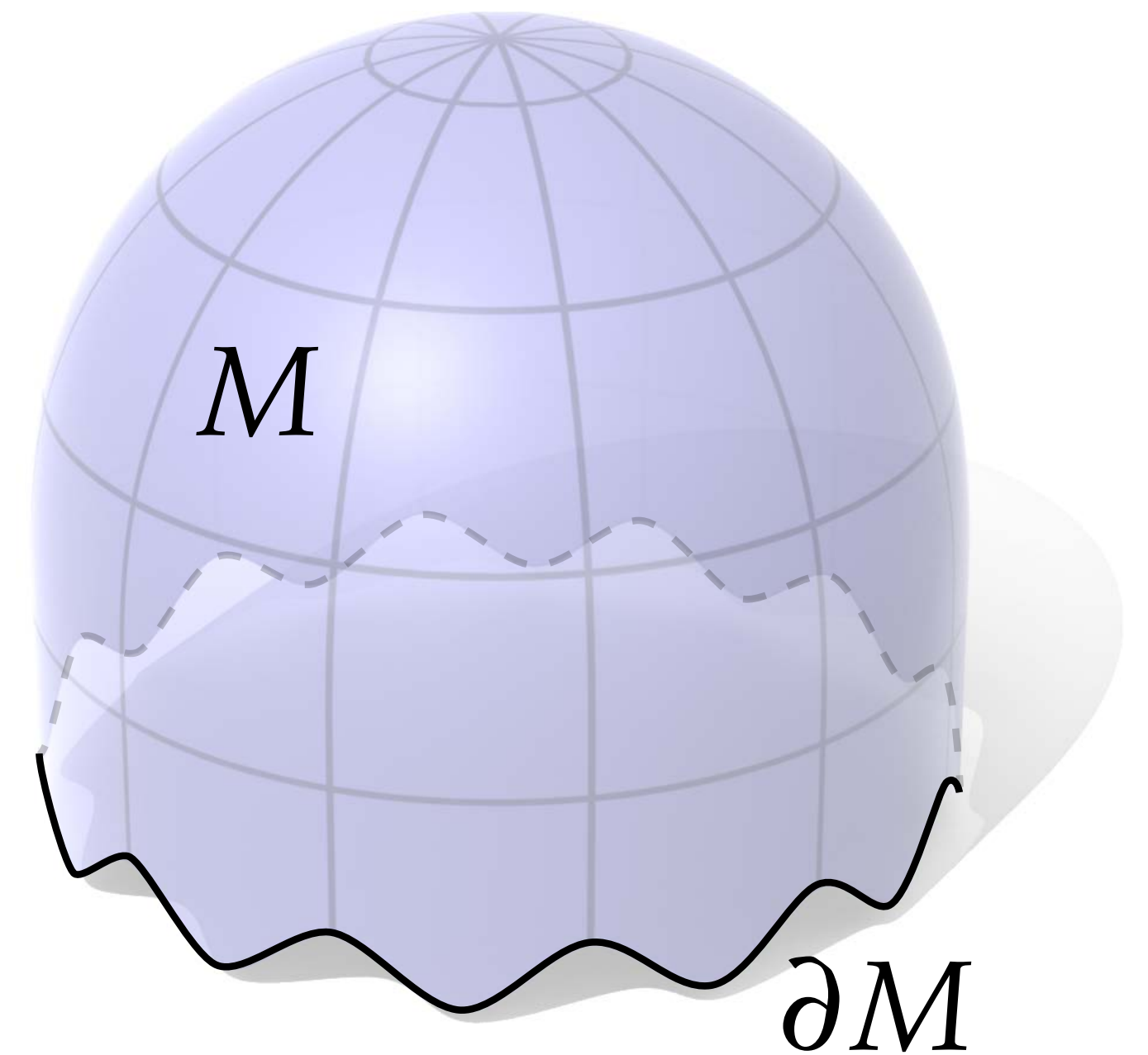
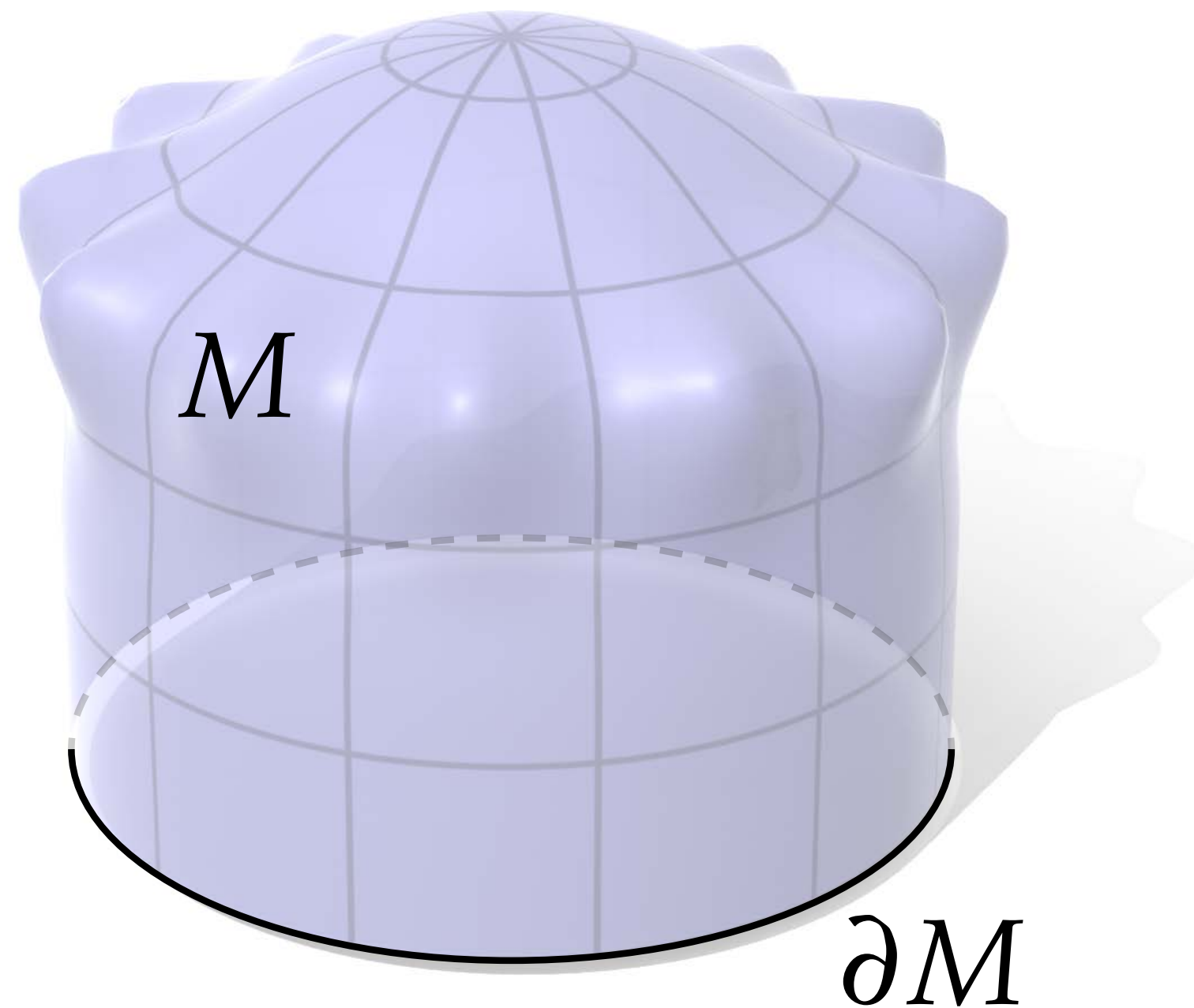
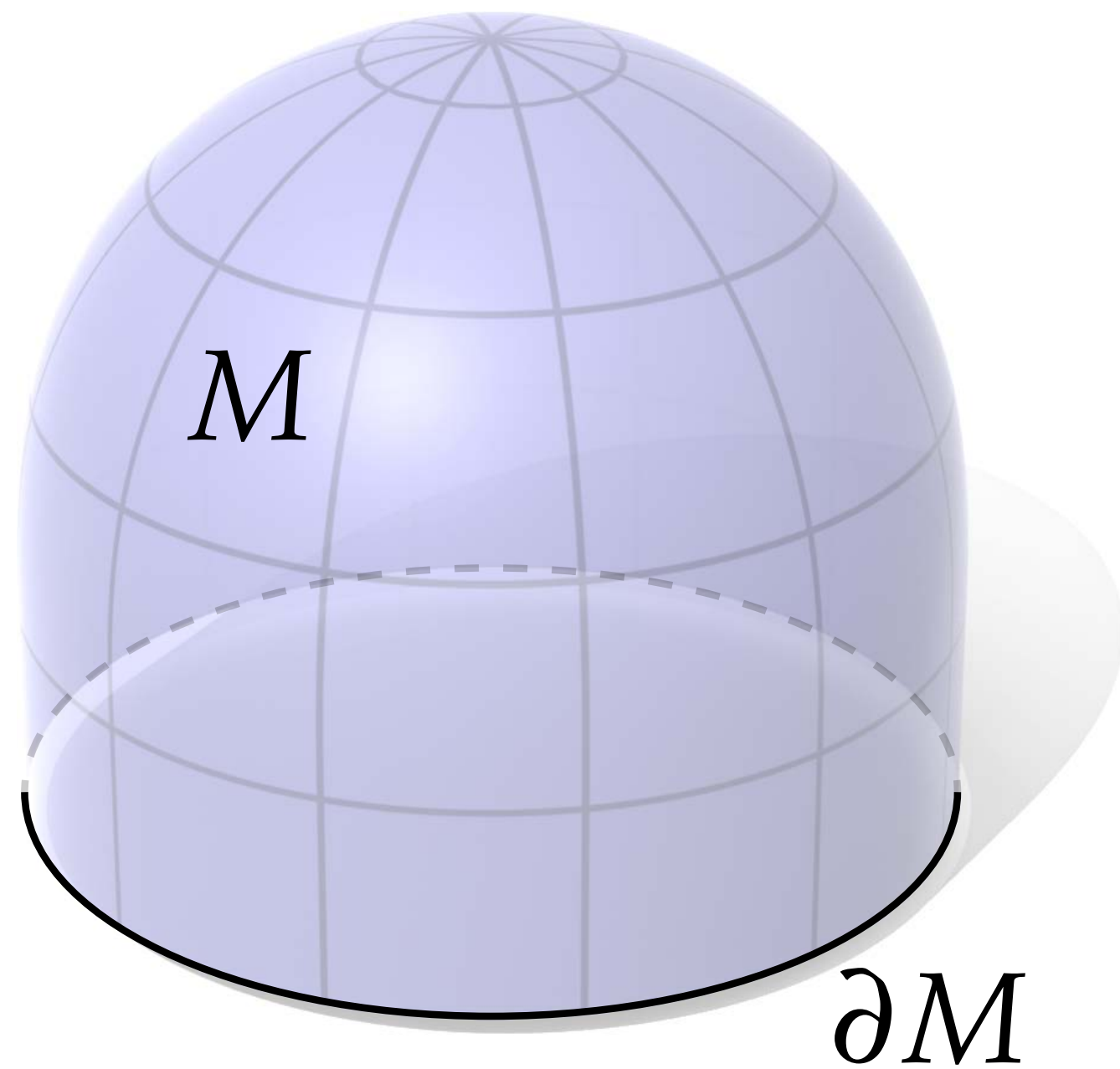
$$\int_M K \, dA = 2\pi \chi$$

Gauss-Bonnet Theorem with Boundary

Can easily generalize to surfaces with boundary:

$$\chi = 2 - 2g - b$$

$$\int_M K \, dA + \int_{\partial M} \kappa_g \, ds = 2\pi\chi$$



Key idea: neither changing a surface nor its boundary affects *total* curvature.

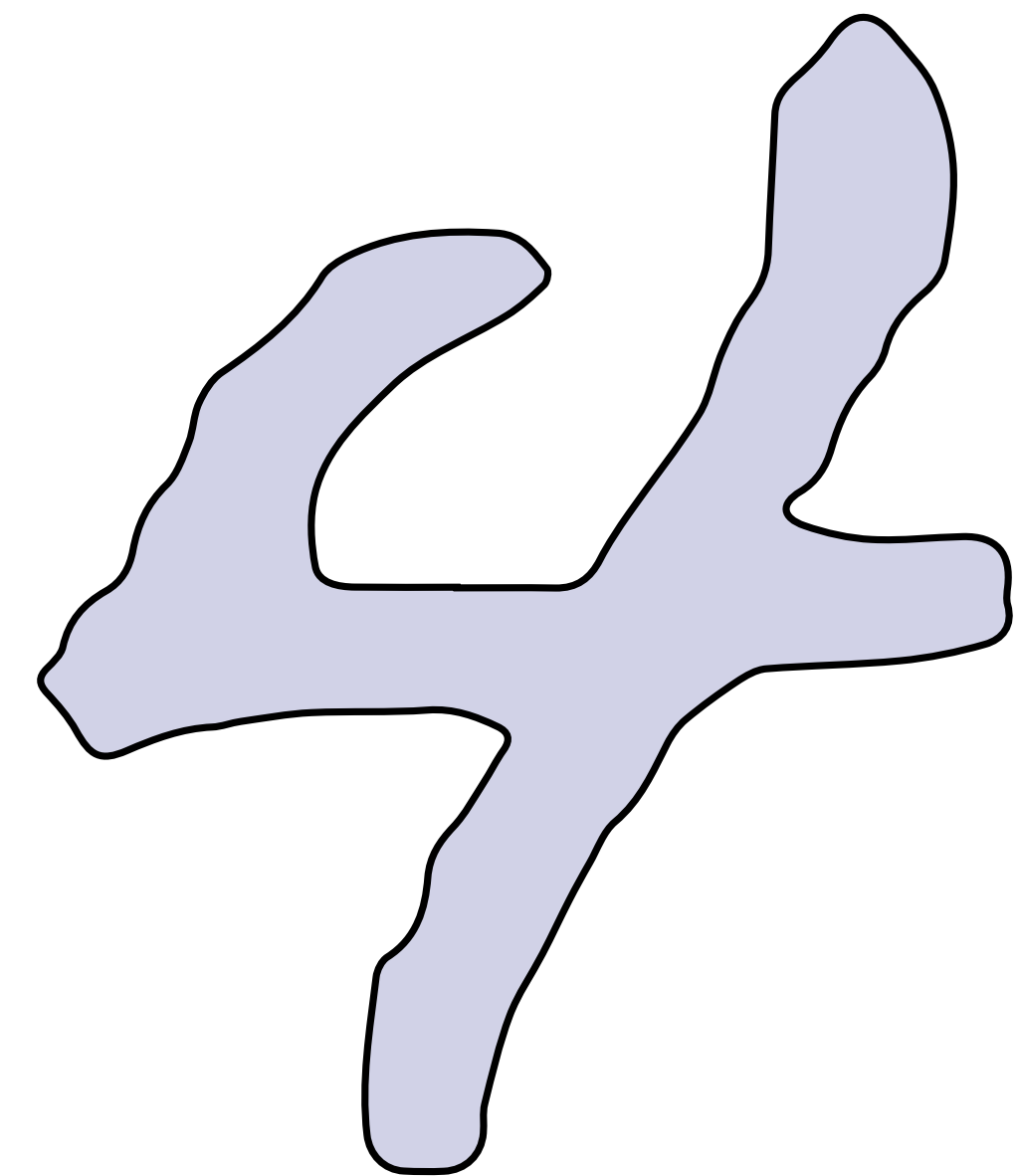
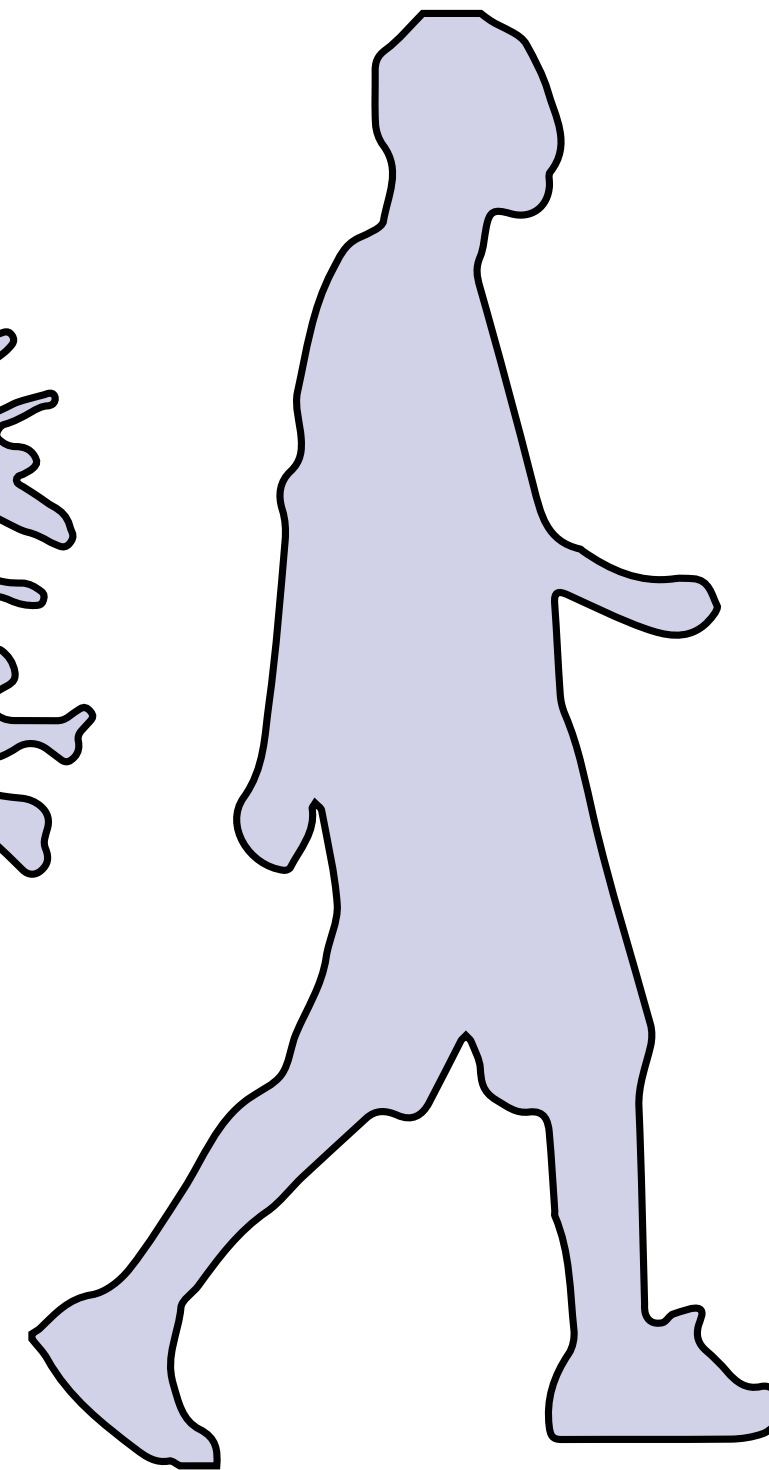
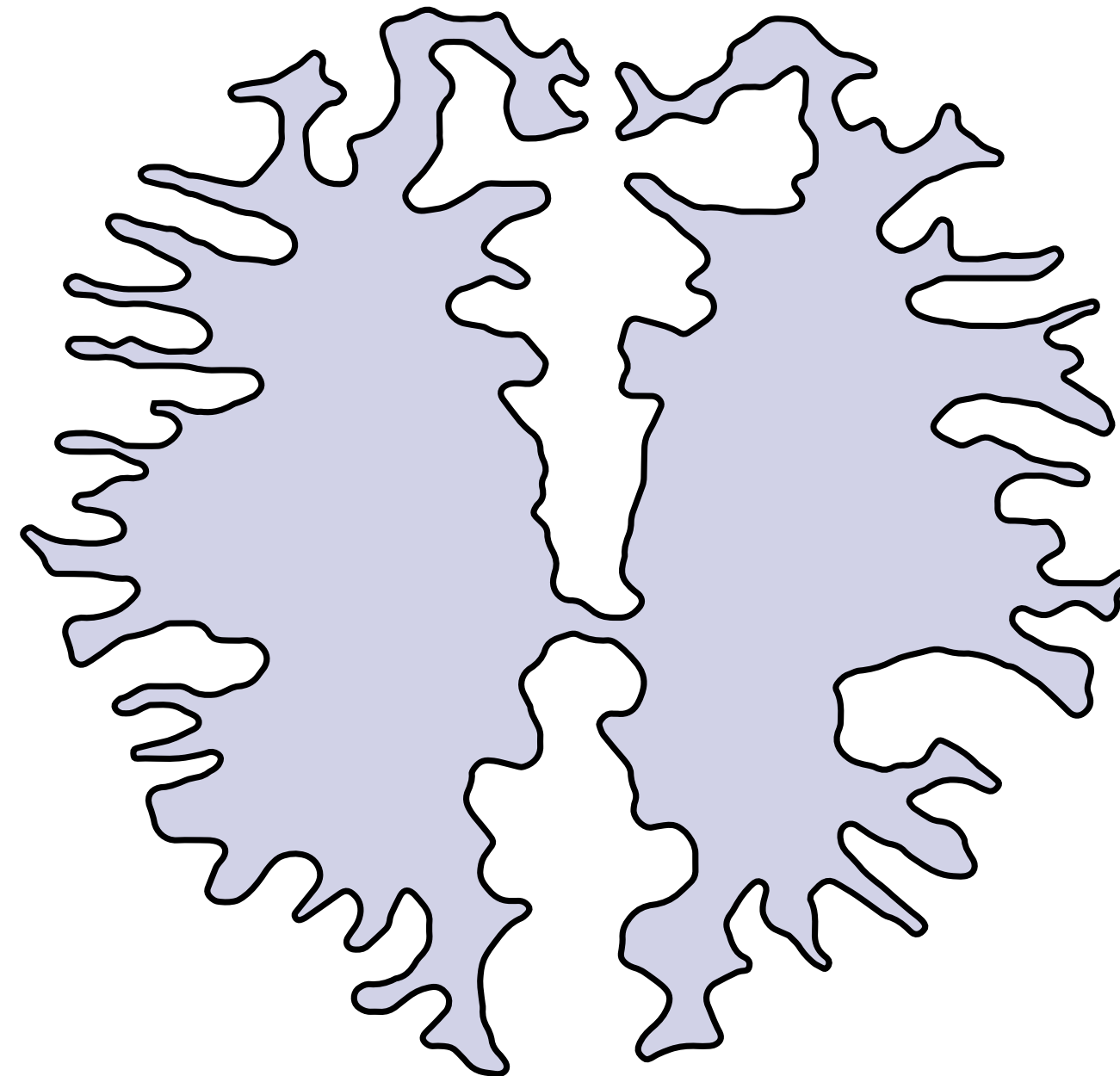
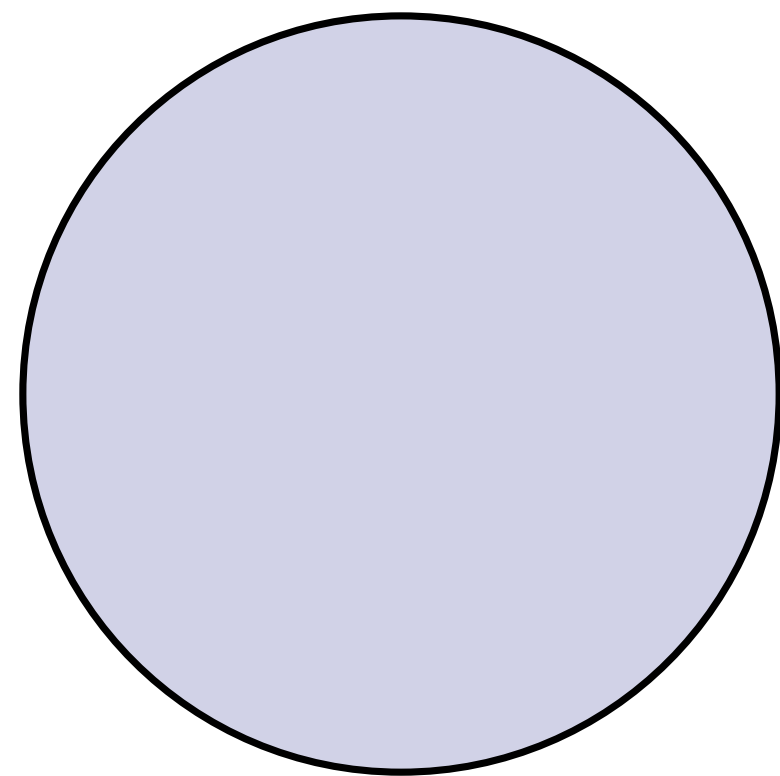
Example: Planar Disk

Q: What does Gauss-Bonnet tell us for a disk in the plane?

A: Total curvature of boundary is equal to 2π (turning number theorem)

$$K = 0$$

$$\chi = 1$$



$$\int_M K \, dA + \int_{\partial M} \kappa_g \, ds = 2\pi\chi$$

$$\int_{\partial M} \kappa_g \, ds = 2\pi$$

Total Mean Curvature?

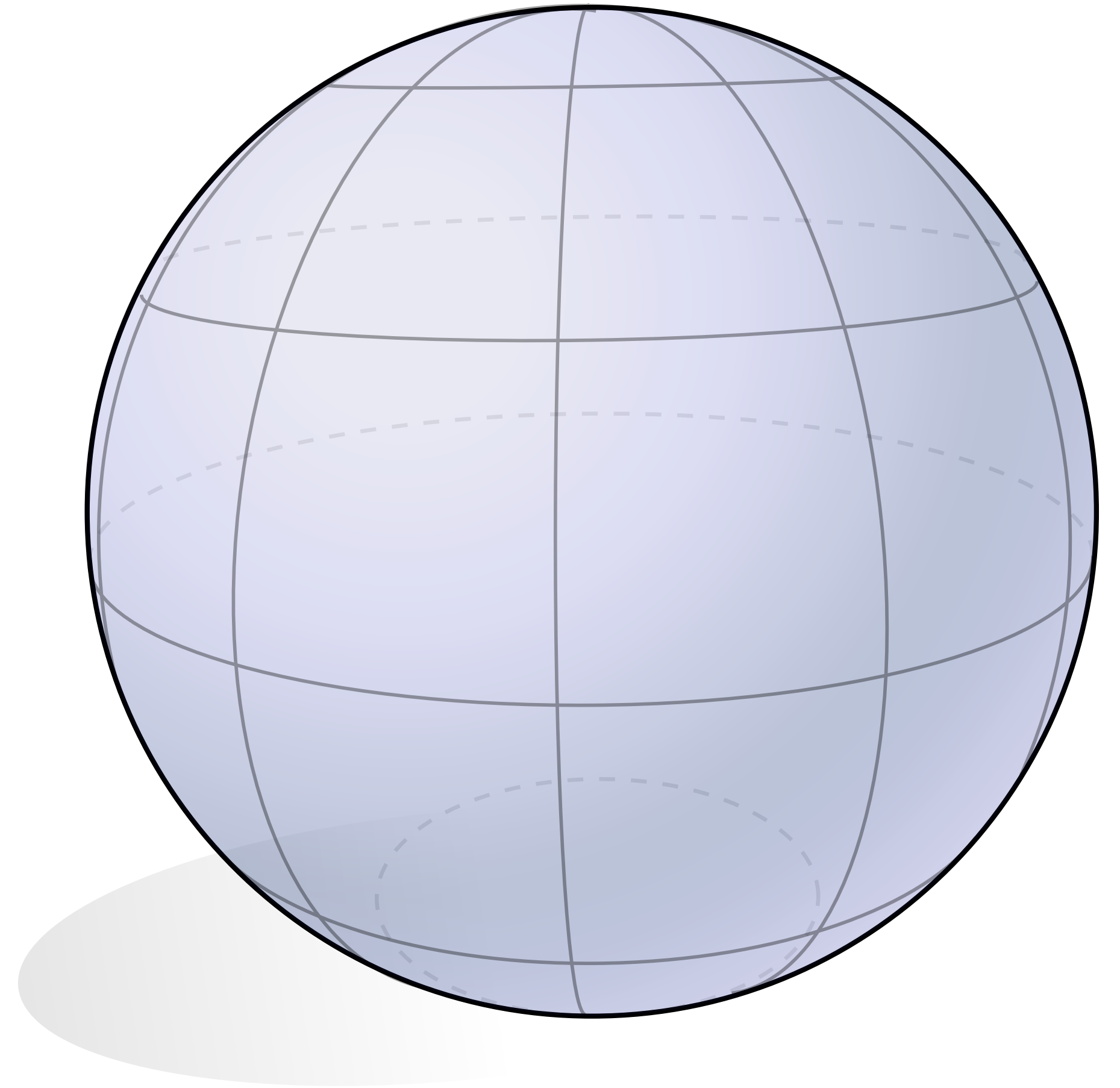
Theorem. (Minkowski): for a convex surface,

$$\int_M H \, dA \geq \sqrt{4\pi A}$$

Q: When do we get equality?

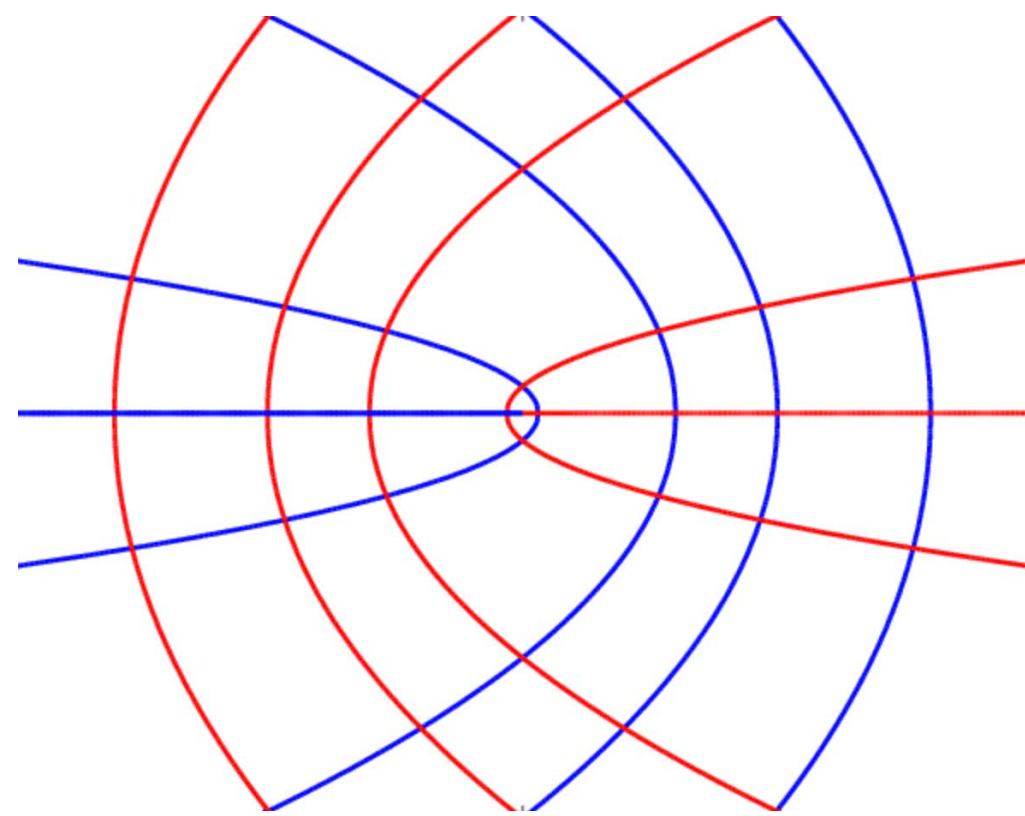
A: For a sphere.

Note: not a *topological invariant*; just an inequality.

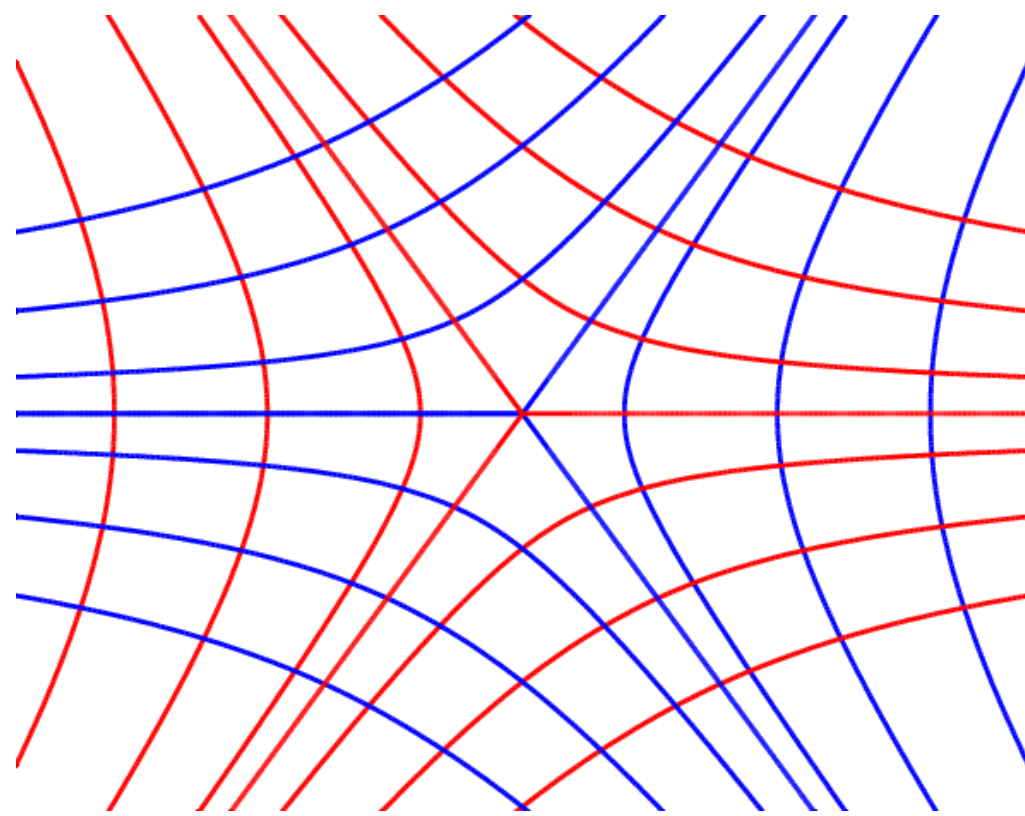


Topological Invariance of Umbilic Count

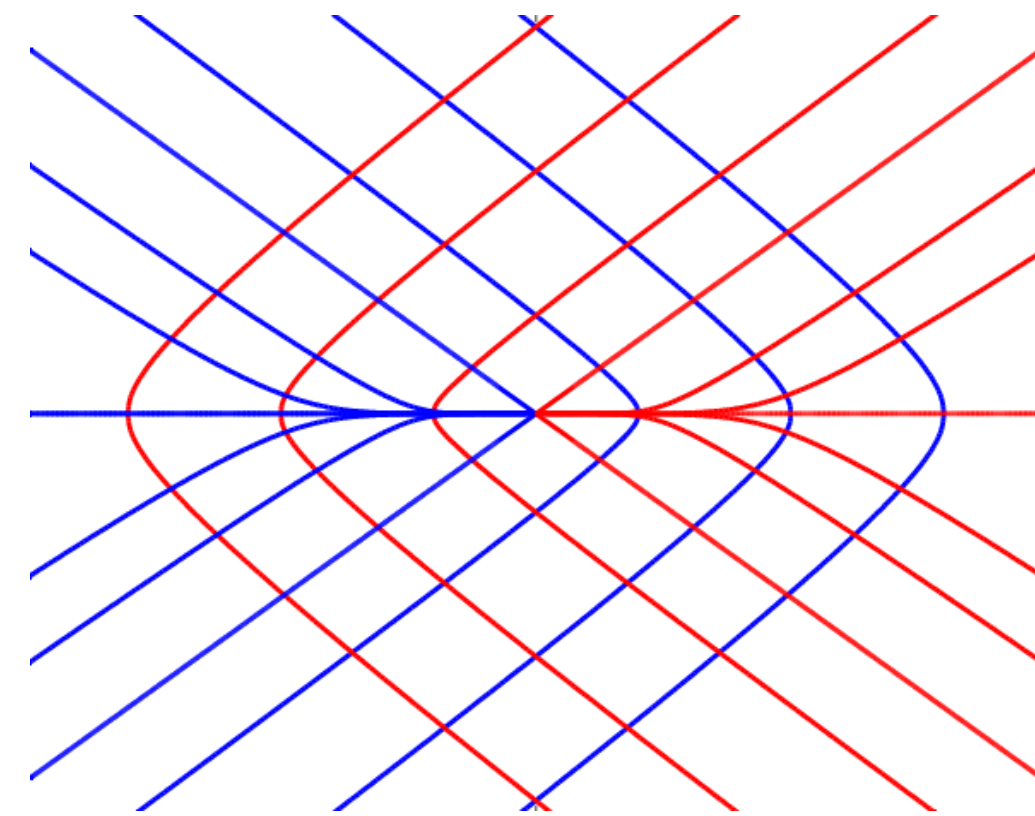
Can classify regions around (isolated) umbilic points into three types based on behavior of principal network:



lemon (k_1)



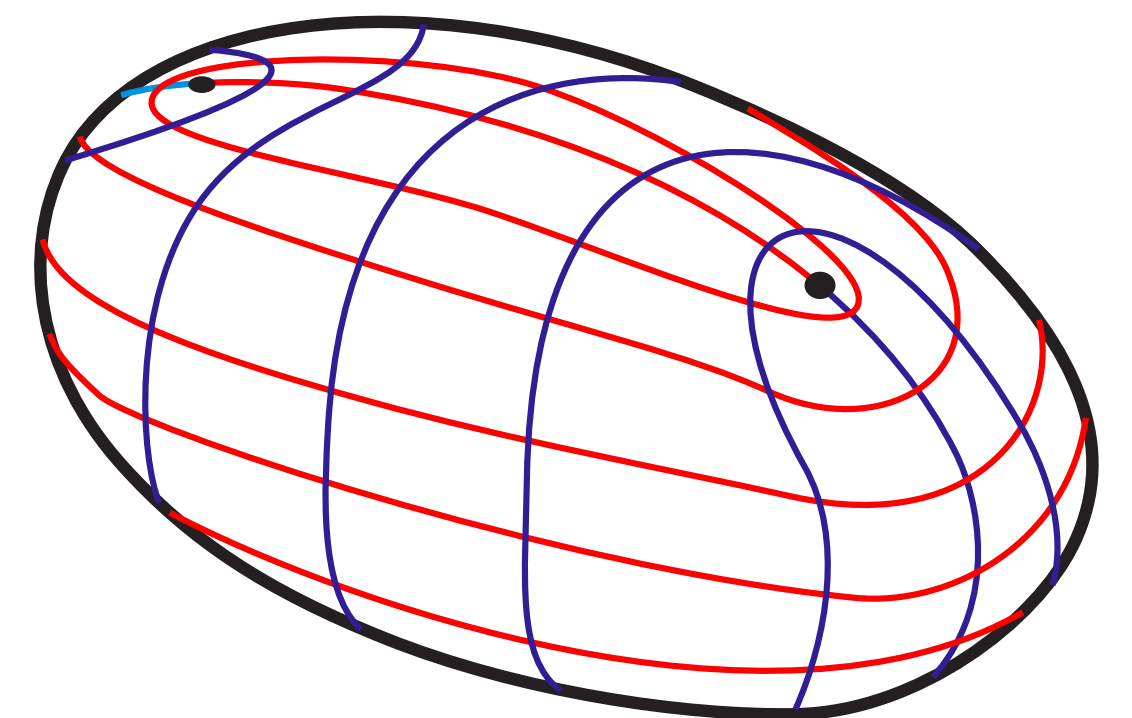
star (k_2)



monstar (k_3)

Fact. If k_1, k_2, k_3 are number of umbilics of each type, then

$$k_1 - k_2 + k_3 = 2\chi$$

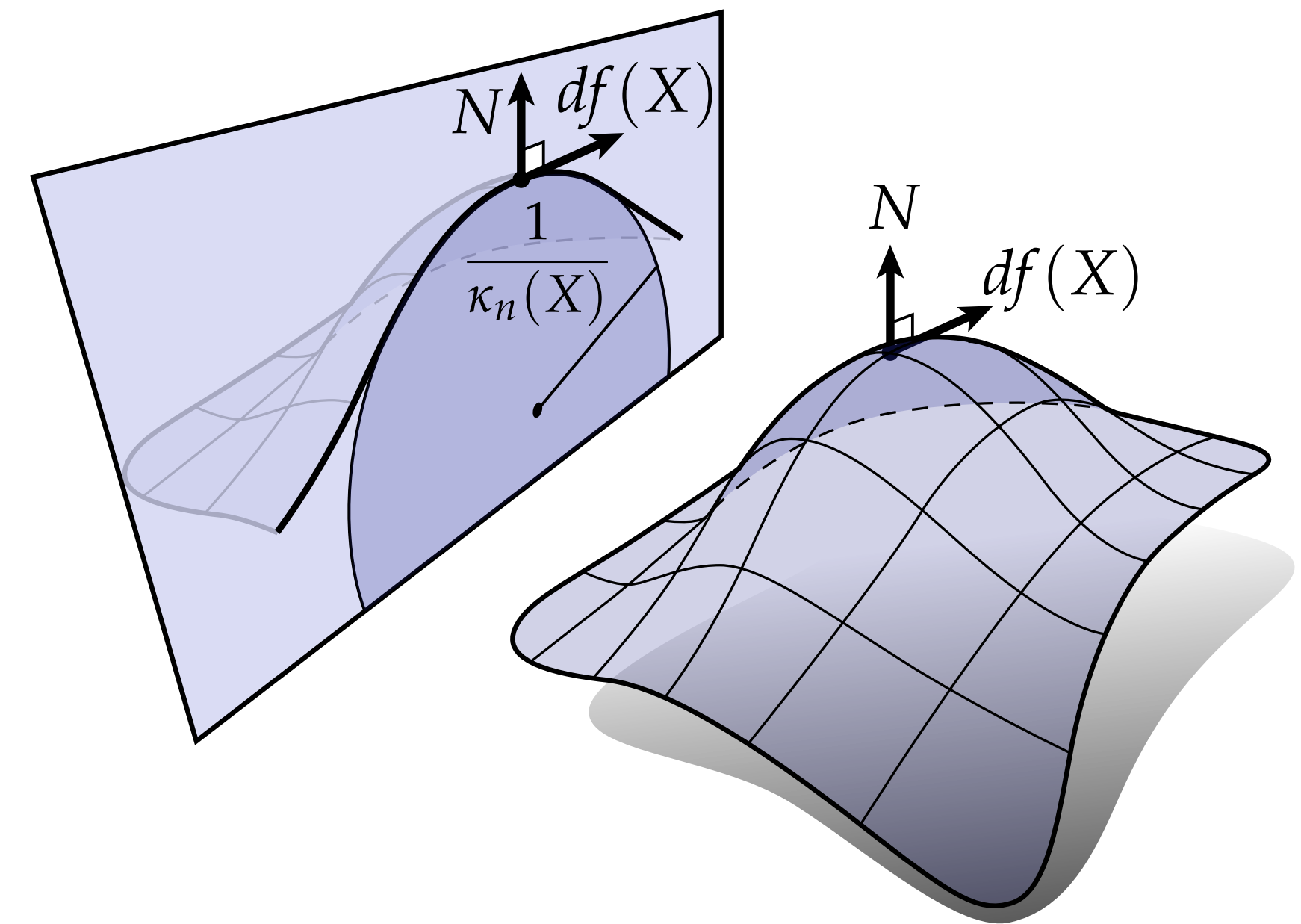


First & Second Fundamental Form

- *First fundamental form* $\mathbf{I}(X, Y)$ is another name for the Riemannian metric $g(X, Y)$
- *Second fundamental form* is closely related to normal curvature κ_N
- Second fundamental form also describes the *change* in first fundamental form under motion in normal direction
- Why “fundamental?” First & second fundamental forms play role in important theorem...

$$\mathbf{I}(X, Y) := \langle df(X), df(Y) \rangle$$

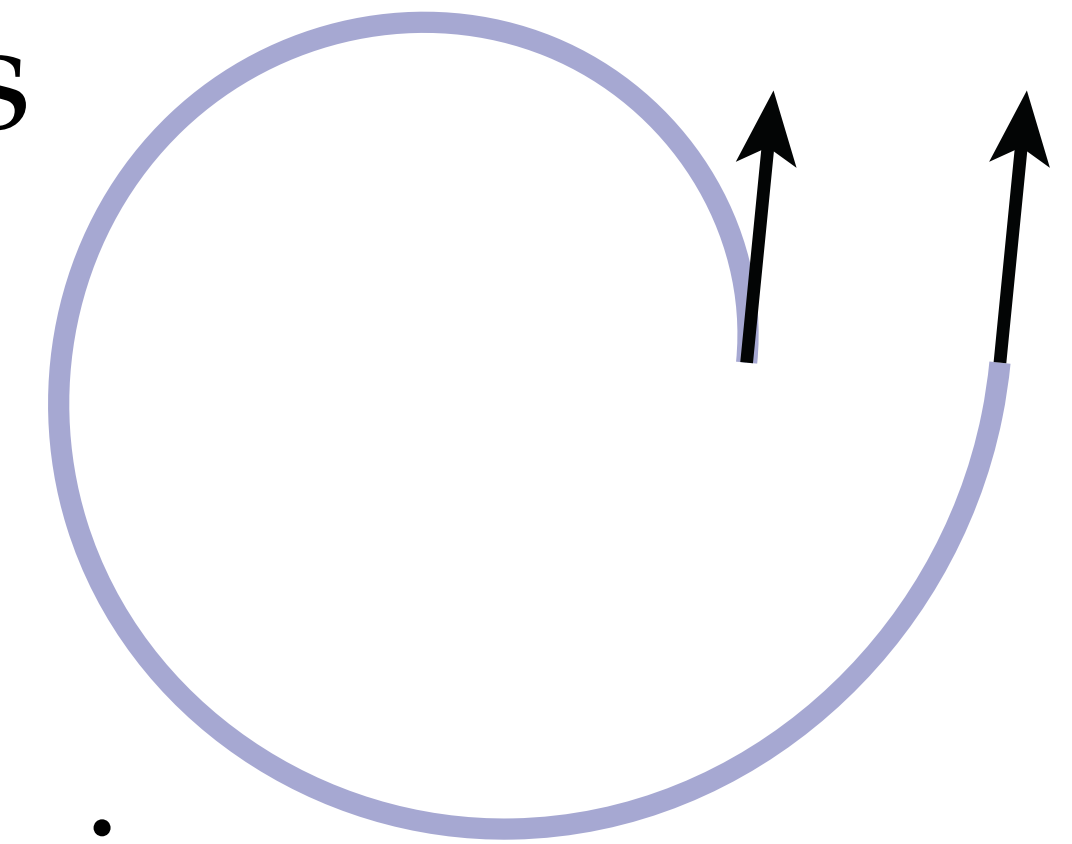
$$\mathbf{II}(X, Y) := \langle dN(X), df(Y) \rangle$$



$$\kappa_N(X) = \frac{\langle df(X), dN(X) \rangle}{|df(X)|^2} = \frac{\mathbf{II}(X, X)}{\mathbf{I}(X, X)}$$

Fundamental Theorem of Surfaces

- **Theorem.** Two surfaces in R^3 are identical up to rigid motions if and only if they have the same first and second fundamental forms.
 - However, not every pair of bilinear forms **I**, **II** describes a valid surface—must satisfy the *Gauss Codazzi* equations
- Analogous to fundamental theorem of plane curves: determined up to rigid motion by curvature
 - However, for *closed* curves not every curvature function is valid (*e.g.*, must integrate to $2k\pi$)



Fundamental Theorem of Discrete Surfaces

- **Fact.** Up to rigid motions, can recover a discrete surface from its *dihedral angles* and *edge lengths*.
- Fairly natural analogue of Gauss-Codazzi; data is split into edge lengths (encoding **I**) and dihedral angles (encoding **II**)
- Basic idea: construct each triangle from its edge lengths; use dihedral angles to globally glue triangles together



from Wang, Liu, and Tong,
“Linear Surface Reconstruction from Discrete Fundamental Forms on Triangle Meshes”

Other Descriptions of Surfaces?

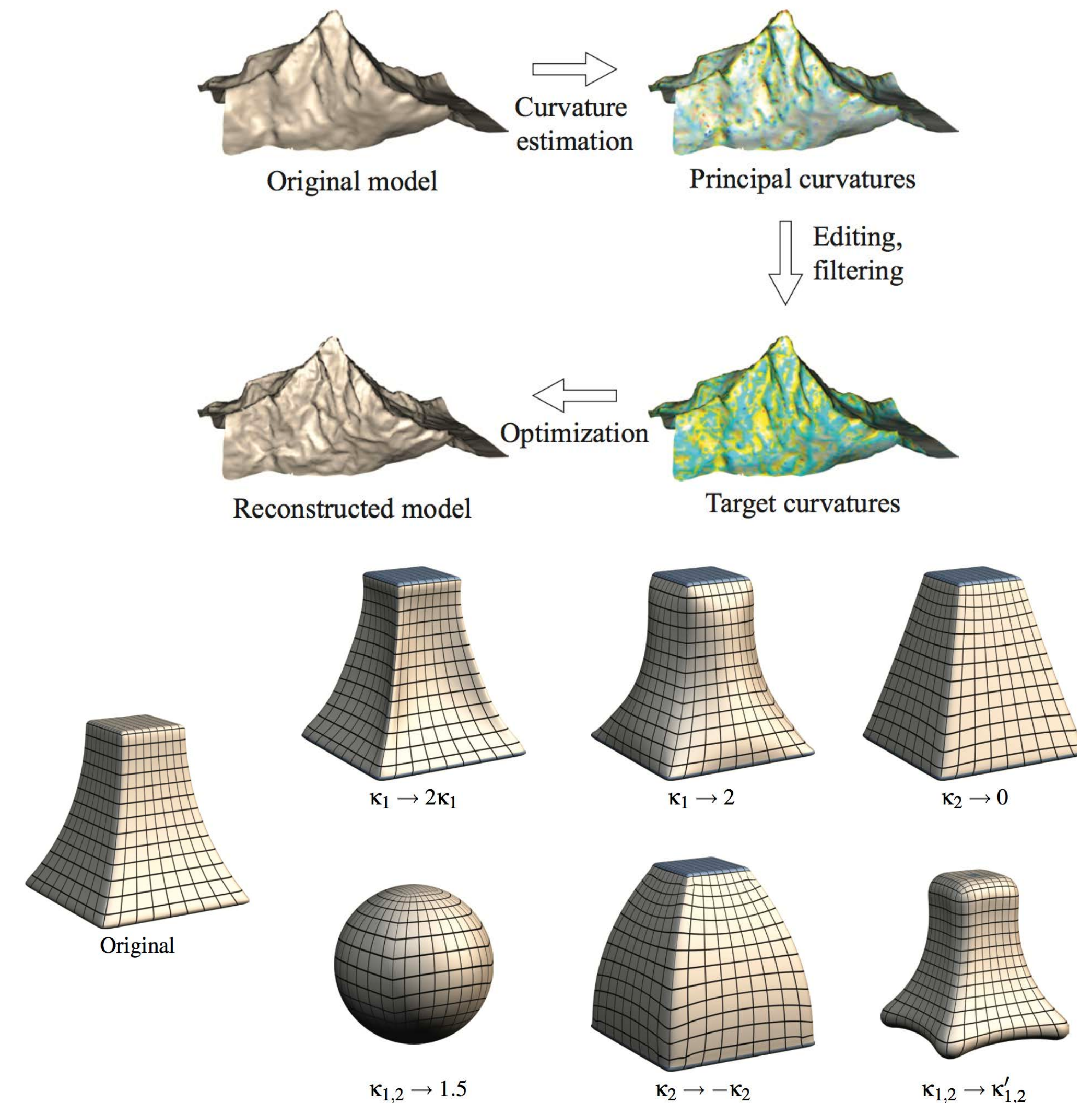
- Classic question in differential geometry:

“What data is sufficient to completely determine a surface in space?”

- Many possibilities...
 - first & second fundamental form (*Gauss-Codazzi*)
 - mean curvature and metric (up to “*Bonnet pairs*”)
 - convex surfaces: metric alone is enough (*Alexandrov/Pogorolev*)
 - Gauss curvature essentially determines metric (*Kazdan-Warner*)
- ...in general, still a surprisingly murky question!

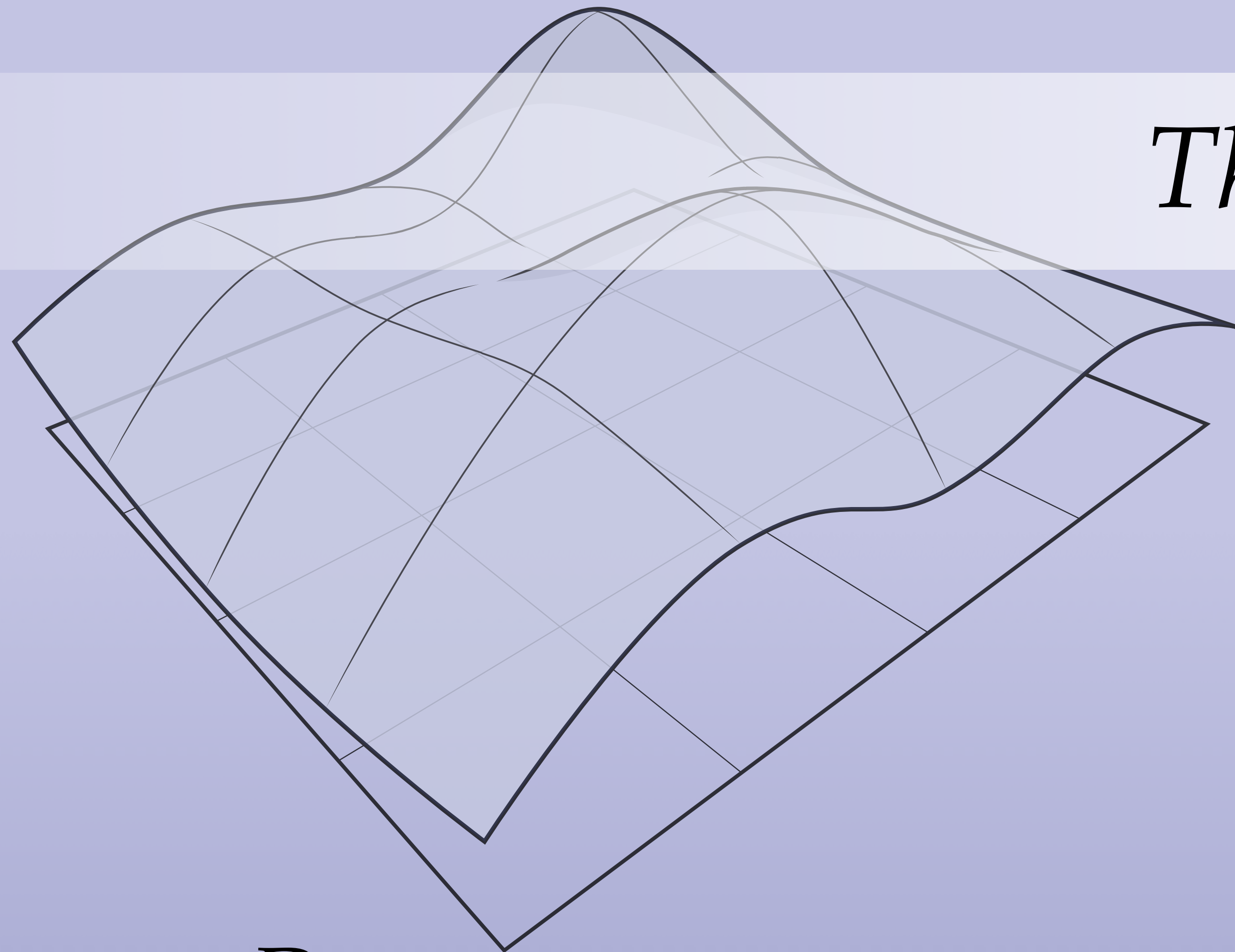
Open Challenges in Shape Recovery

- What other **discrete** quantities determine a surface?
- ...and how can we (efficiently) recover a surface from this data?
- Lengths + dihedral angles work in general (*fundamental theorem of discrete surfaces*); lengths alone are sufficient for convex surfaces. What about just dihedral angles?
- Next lecture: will have a variety of discrete curvatures. Which are sufficient to describe which classes of surfaces?
- *Why bother?* Offers new & different ways to analyze, process, edit, transmit, ... curved surfaces digitally.



from Eigensatz & Pauly, "Curvature Domain Shape Processing"

Thanks!



DISCRETE DIFFERENTIAL
GEOMETRY:
AN APPLIED INTRODUCTION

Keenan Crane • CMU 15-458/858