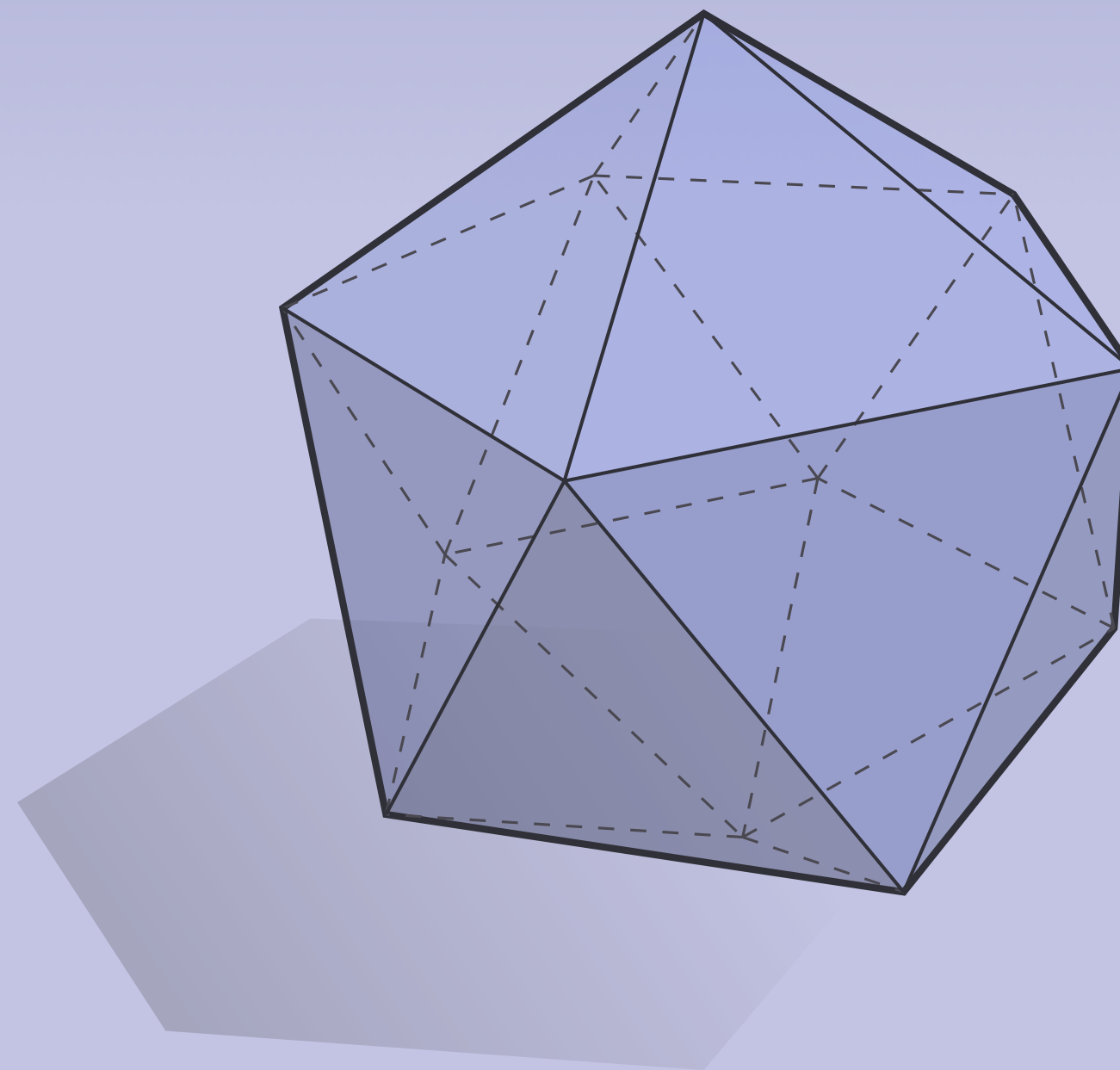


DISCRETE DIFFERENTIAL  
GEOMETRY:  
AN APPLIED INTRODUCTION  
Keenan Crane • CMU 15-458/858

# LECTURE 6: EXTERIOR DERIVATIVE



## DISCRETE DIFFERENTIAL GEOMETRY: AN APPLIED INTRODUCTION

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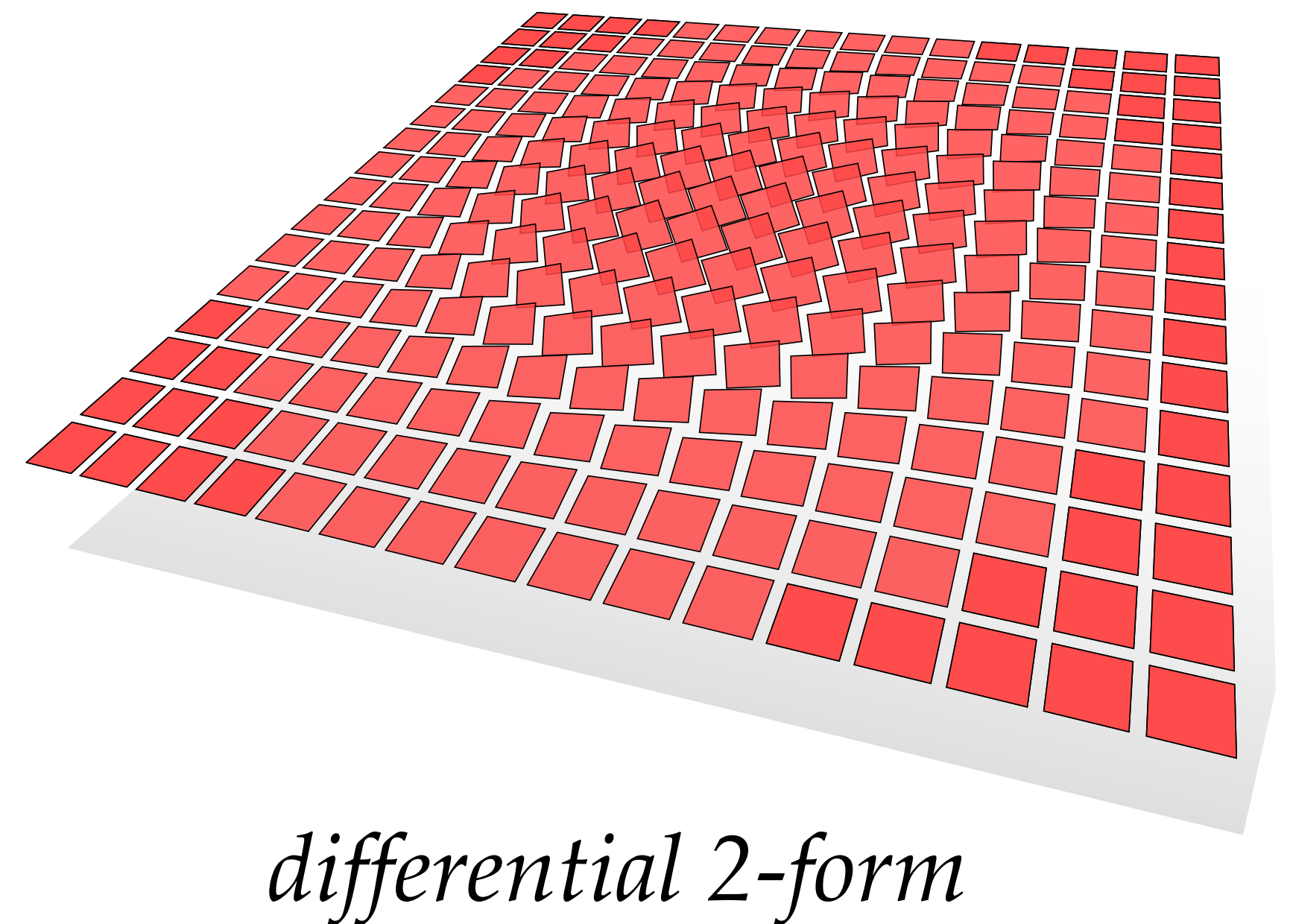
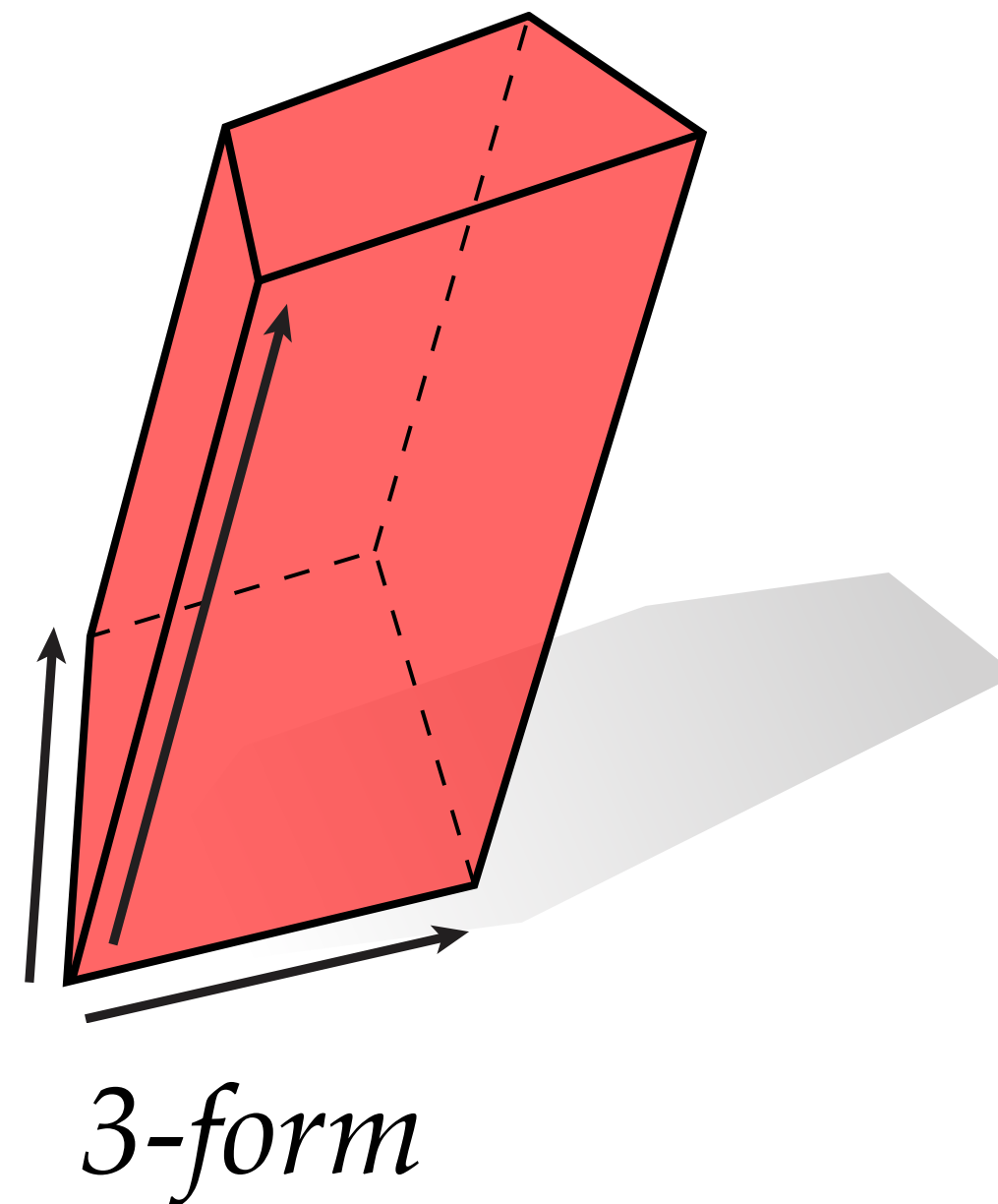
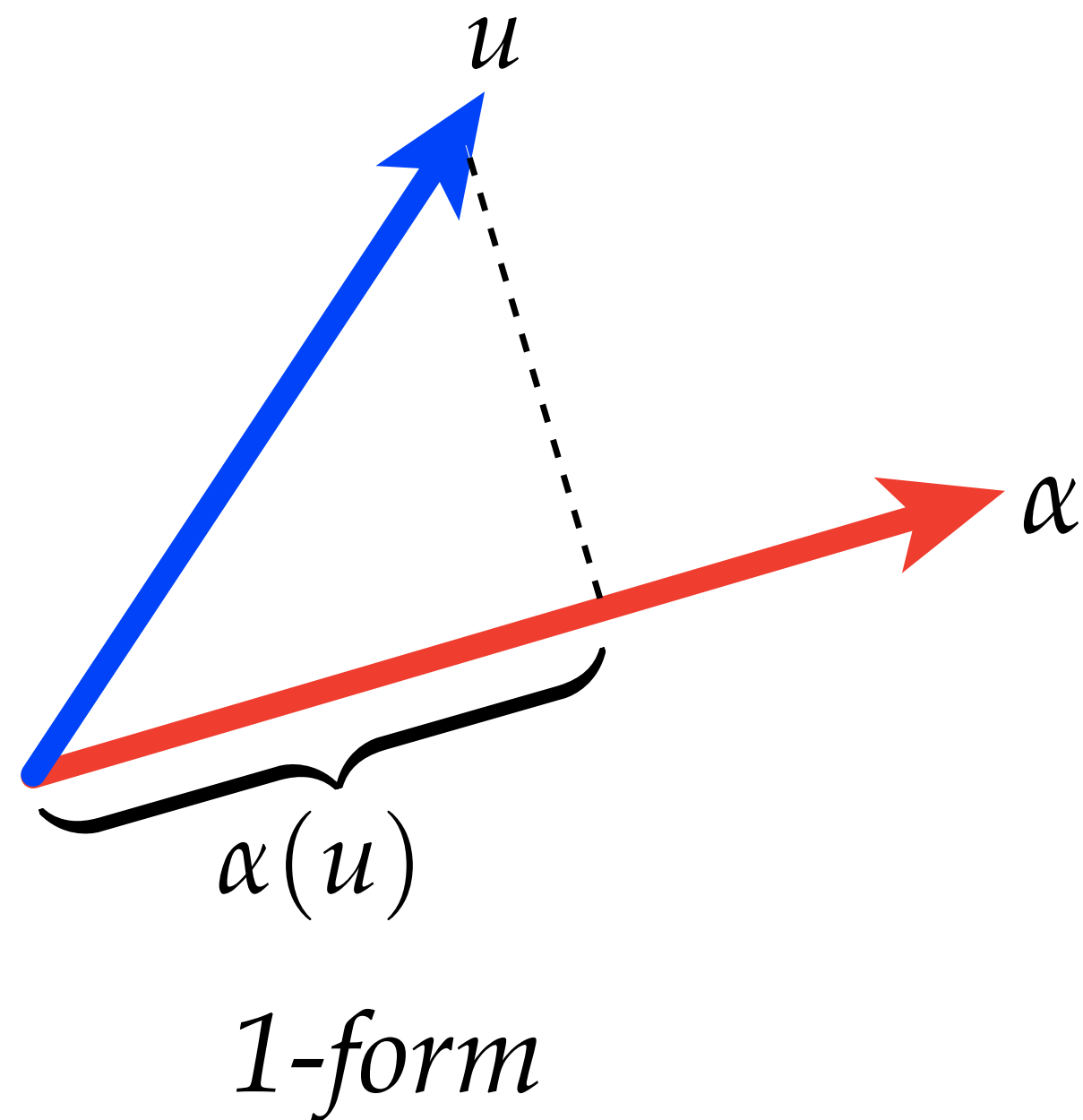
# Exterior Calculus—Overview

- *Previously:*

- **1-form**—linear measurement of a vector
- **$k$ -form**—multilinear measurement of volume
- **differential  $k$ -form**— $k$ -form at each point

- *Today: exterior calculus*

- how do  $k$ -forms *change*?
- how do we *integrate*  $k$ -forms?



# Integration and Differentiation

- Two big ideas in calculus:

- **differentiation**

- **integration**

- linked by *fundamental theorem of calculus*

- Exterior calculus generalizes these ideas

- **differentiation of  $k$ -forms** (exterior derivative)

- **integration of  $k$ -forms** (measure volume)

- linked by *Stokes' theorem*

- **Goal:** integrate differential forms over meshes to get *discrete exterior calculus (DEC)*

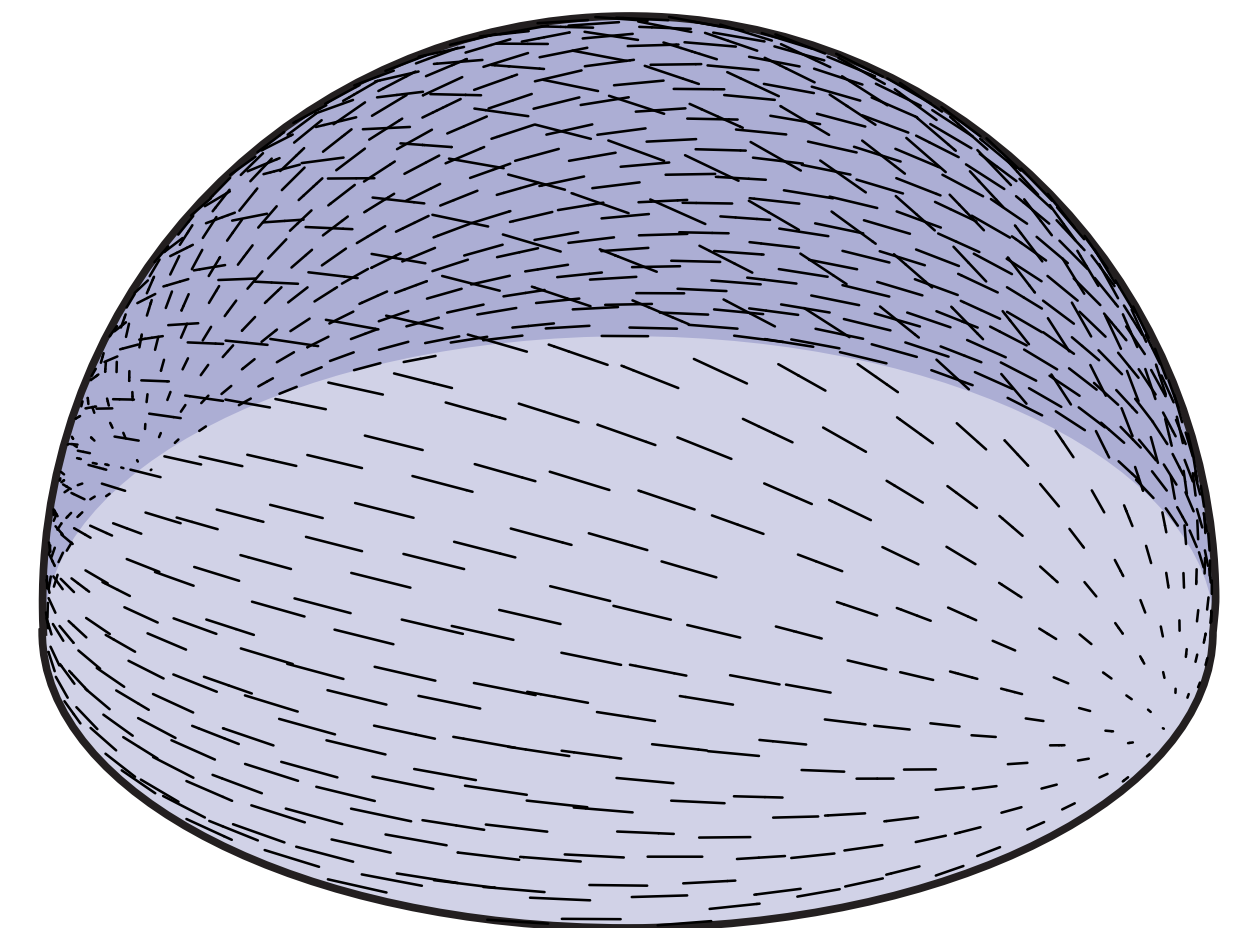
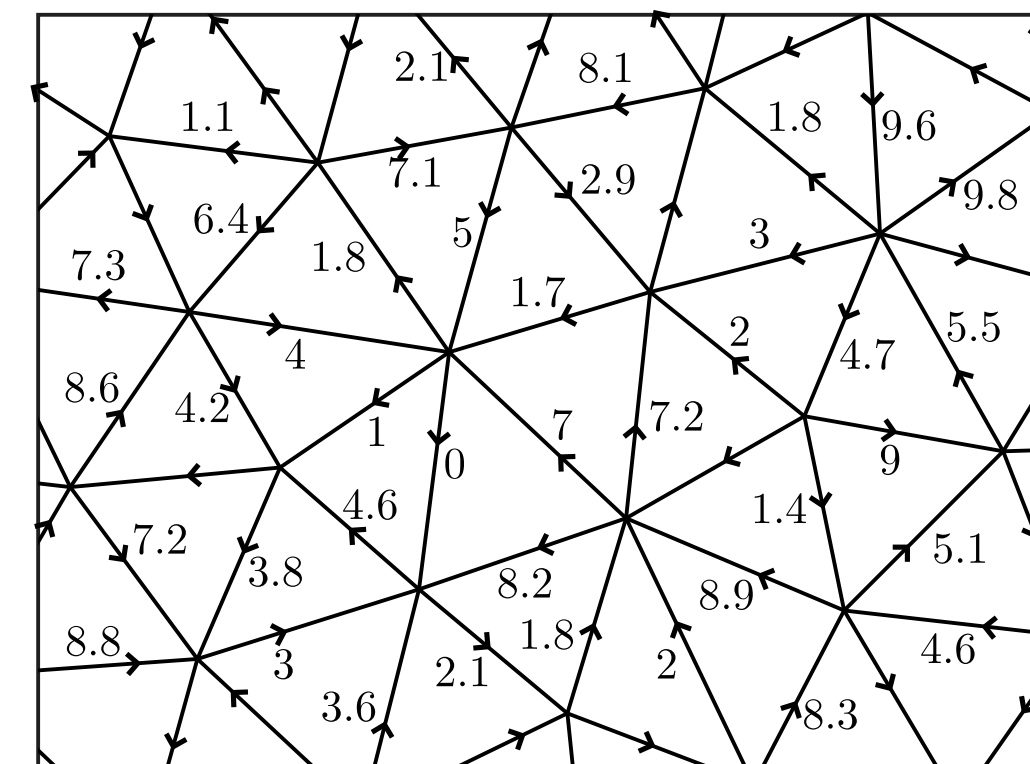
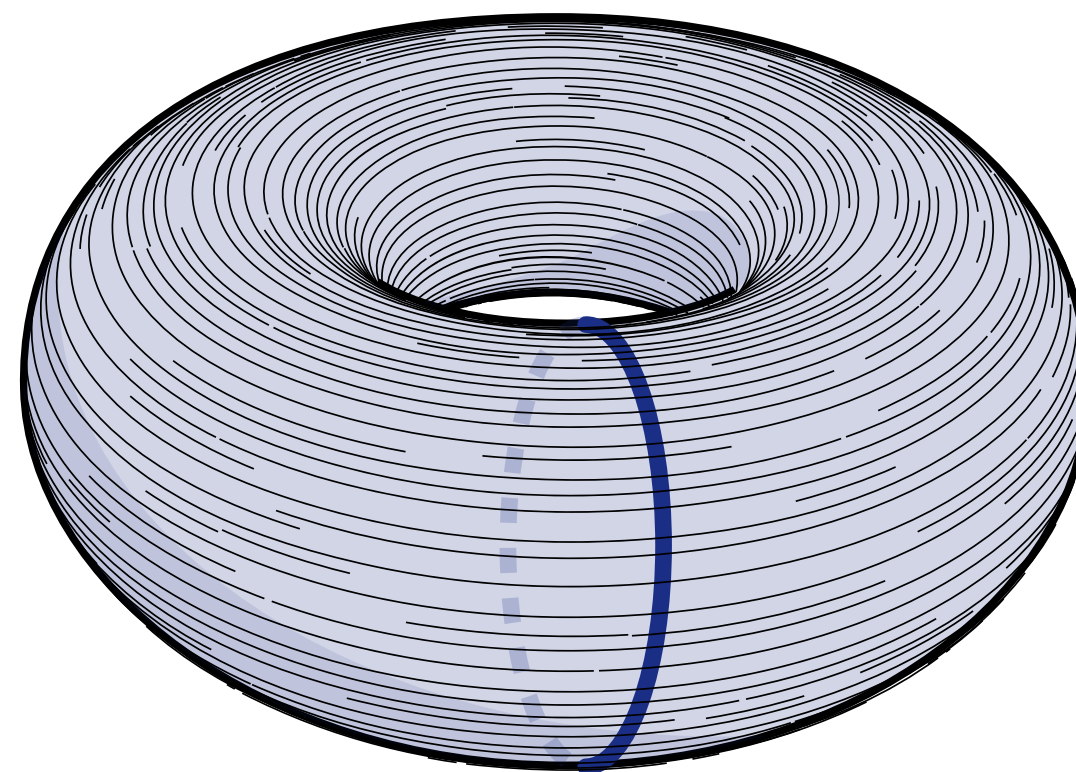
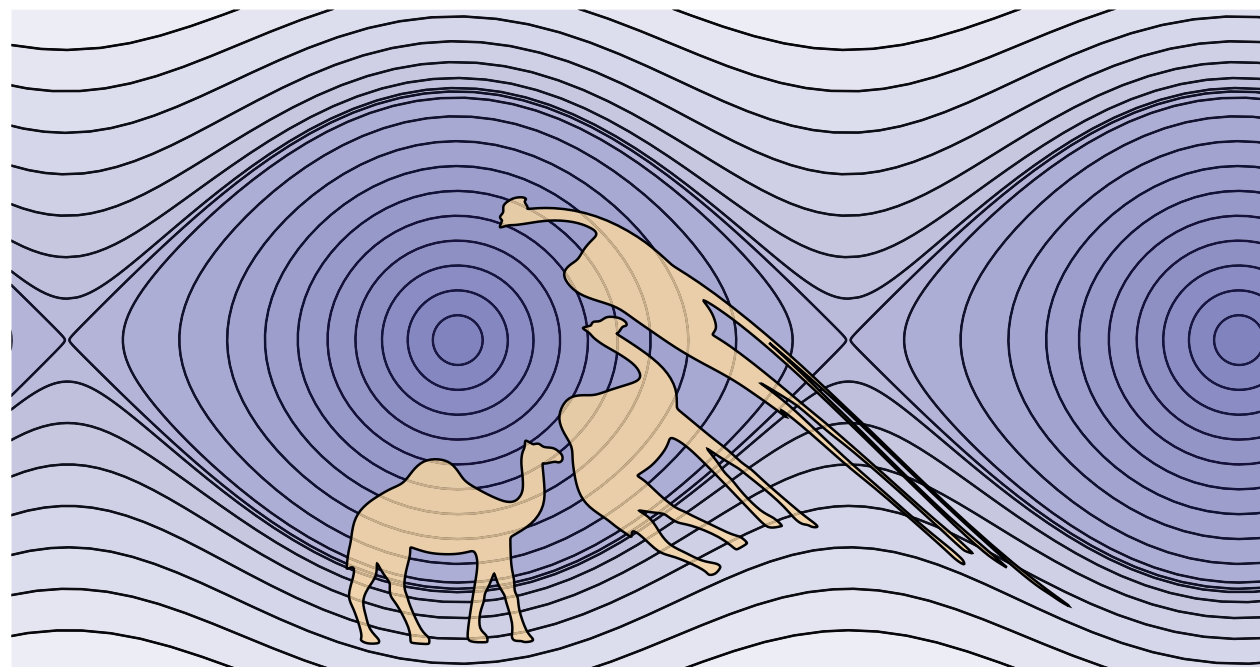
$$\int_a^b f' dx = f(b) - f(a)$$

$$\int_M d\alpha = \int_{\partial M} \alpha$$



# Motivation for Exterior Calculus

- Why generalize **vector** calculus to **exterior** calculus?
  - Hard to measure change in *volumes* using basic vector calculus
  - Duality clarifies the distinction between different concepts / quantities
  - **Topology**: notion of differentiation that does not require metric (e.g., *cohomology*)
  - **Geometry**: clear language for calculus on *curved* domains (Riemannian manifolds)
  - **Physics**: clear distinction between physical quantities (e.g., *velocity* vs. *momentum*)
  - **Computer Science**: *Leads directly to discretization/computation!*



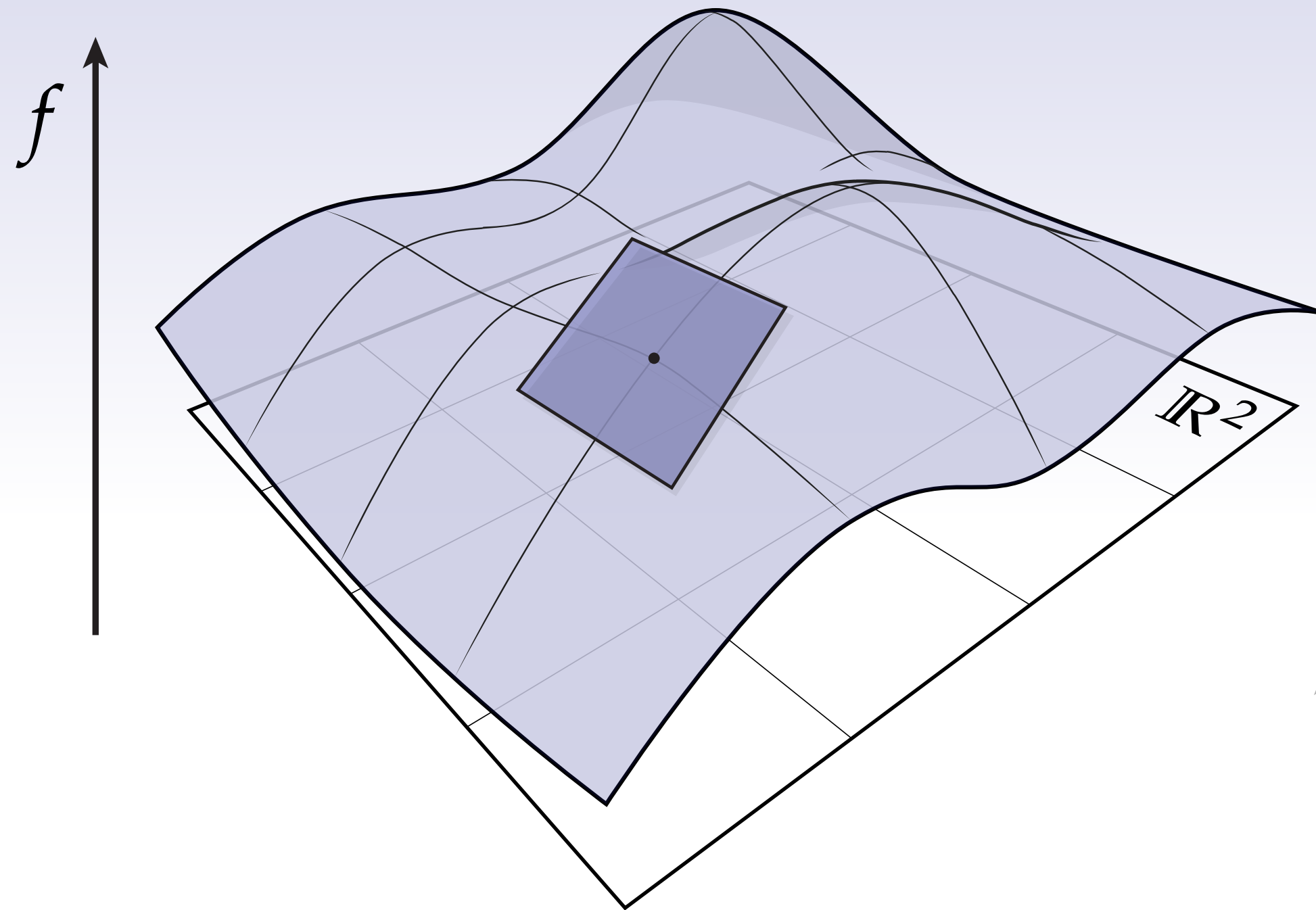


# *Exterior Derivative*



# Derivative—Many Interpretations...

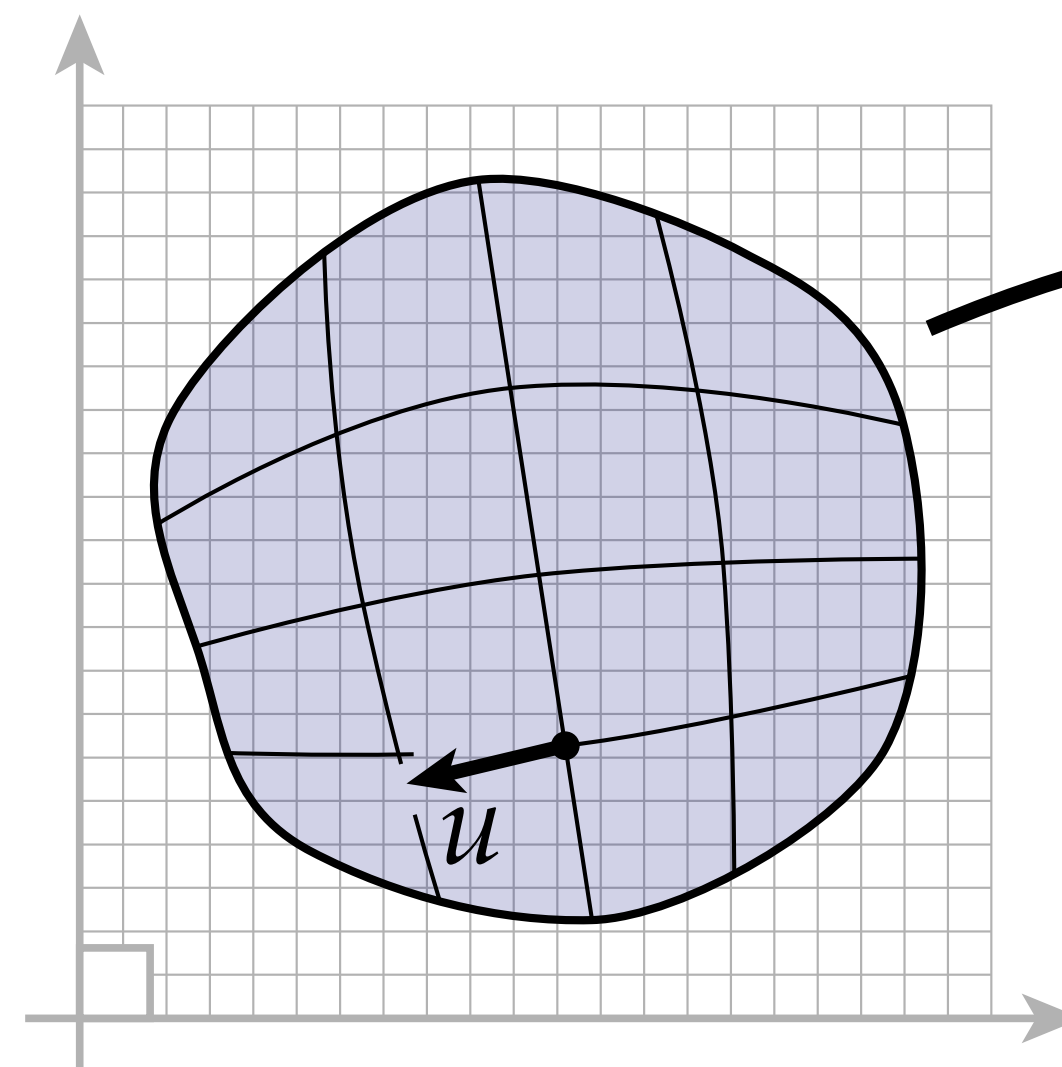
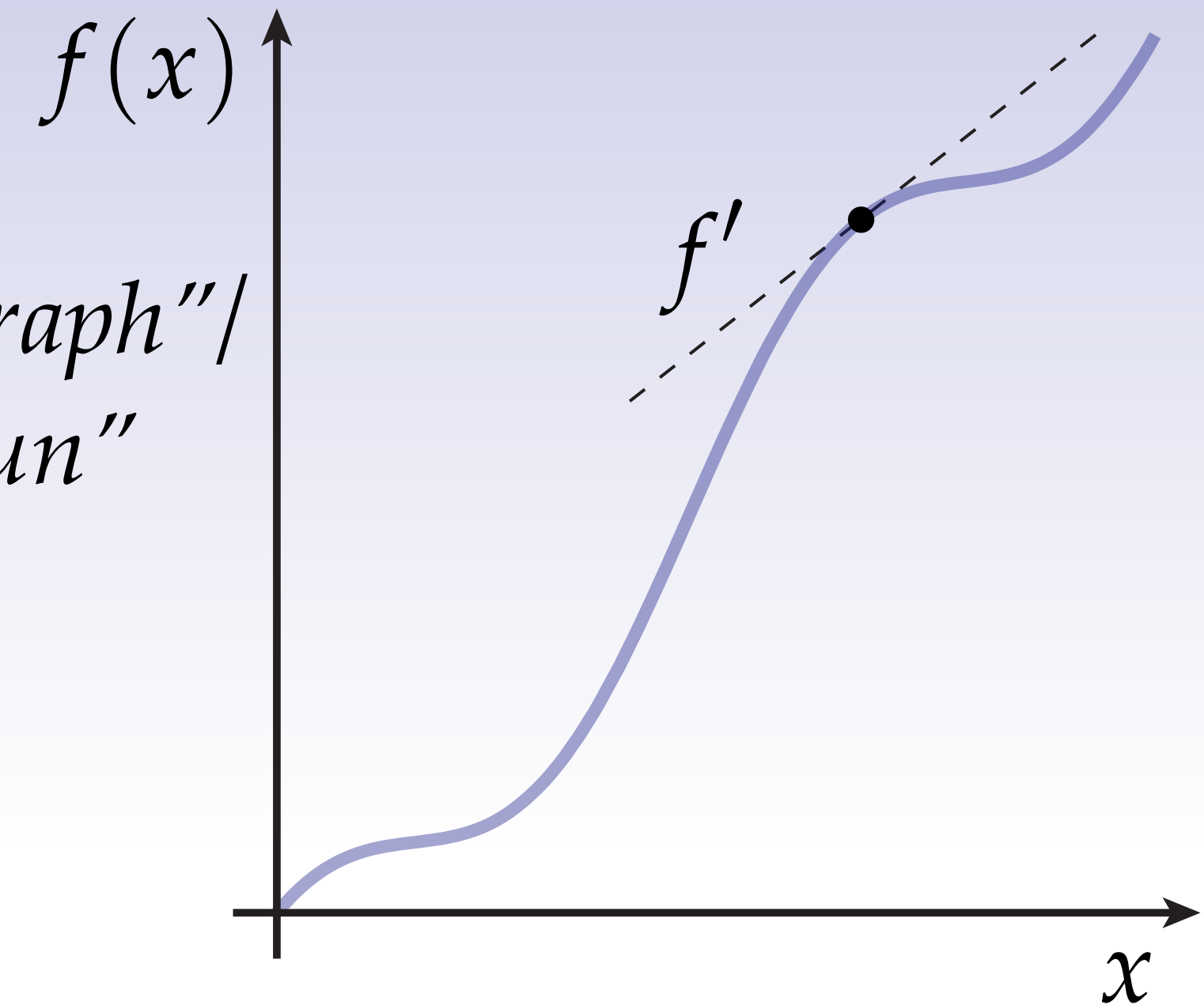
*“best linear approximation”*



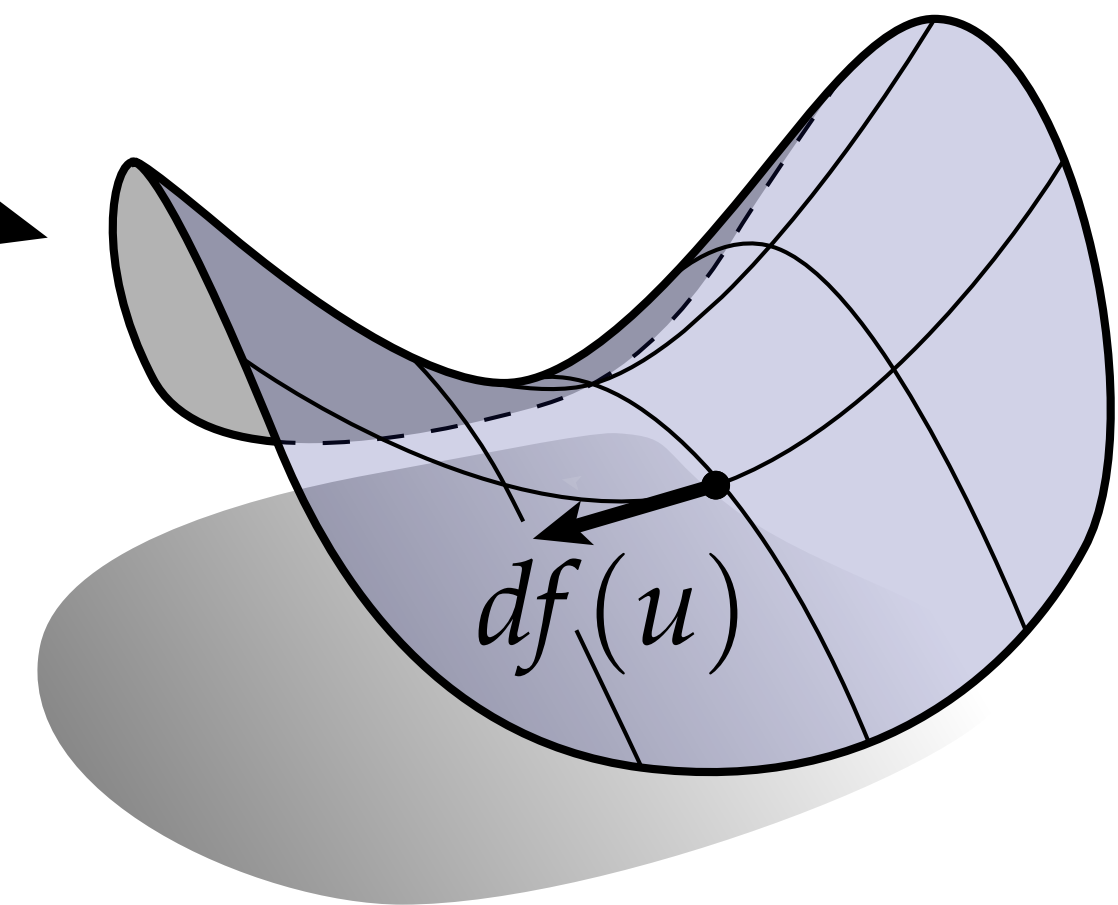
$$f'(x) := \lim_{\epsilon \rightarrow 0} \frac{f(x + \epsilon) - f(x)}{\epsilon}$$

*“rate of change”*

*“slope of the graph”/  
“rise over run”*



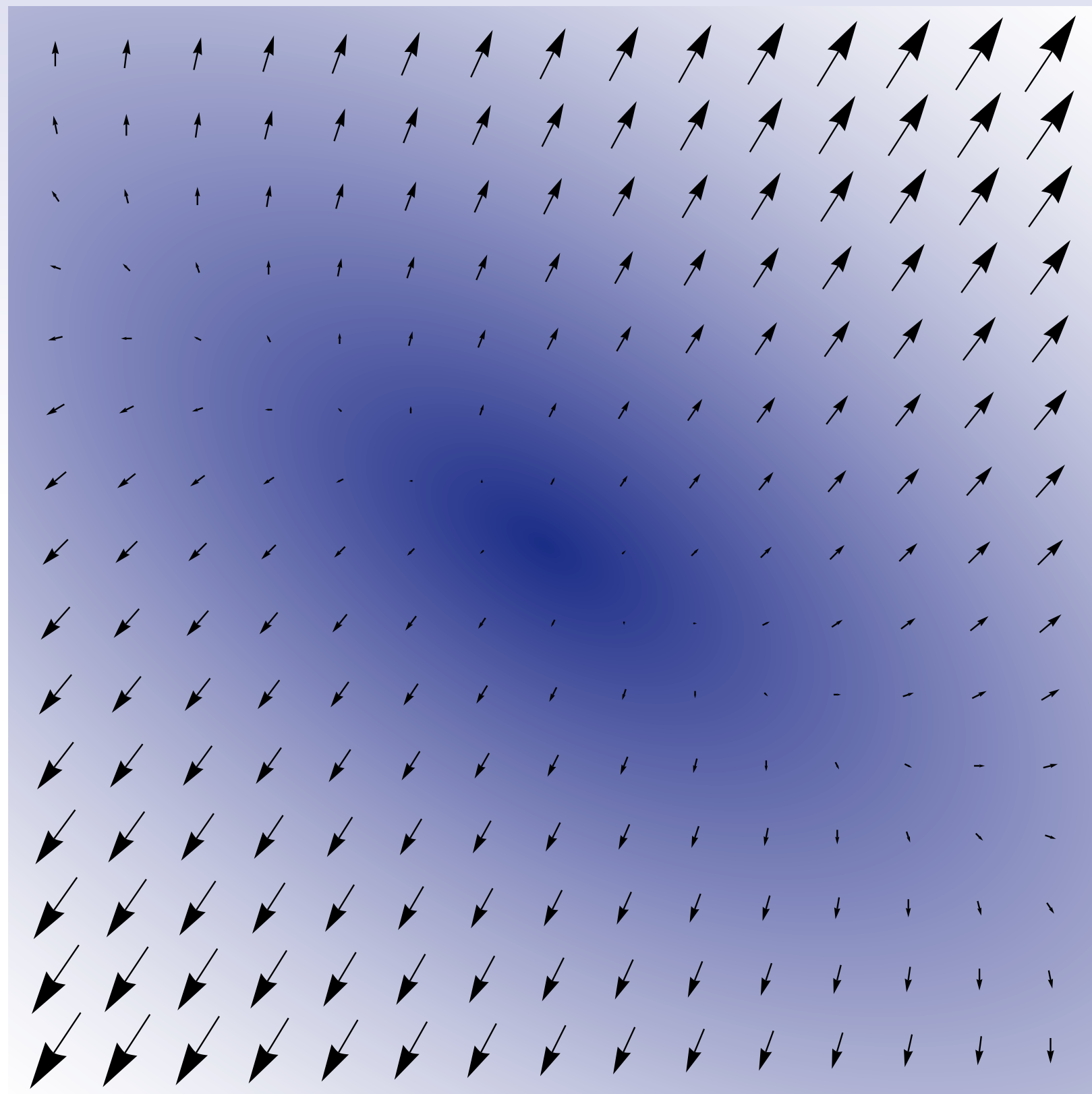
$f$



*“pushforward”*

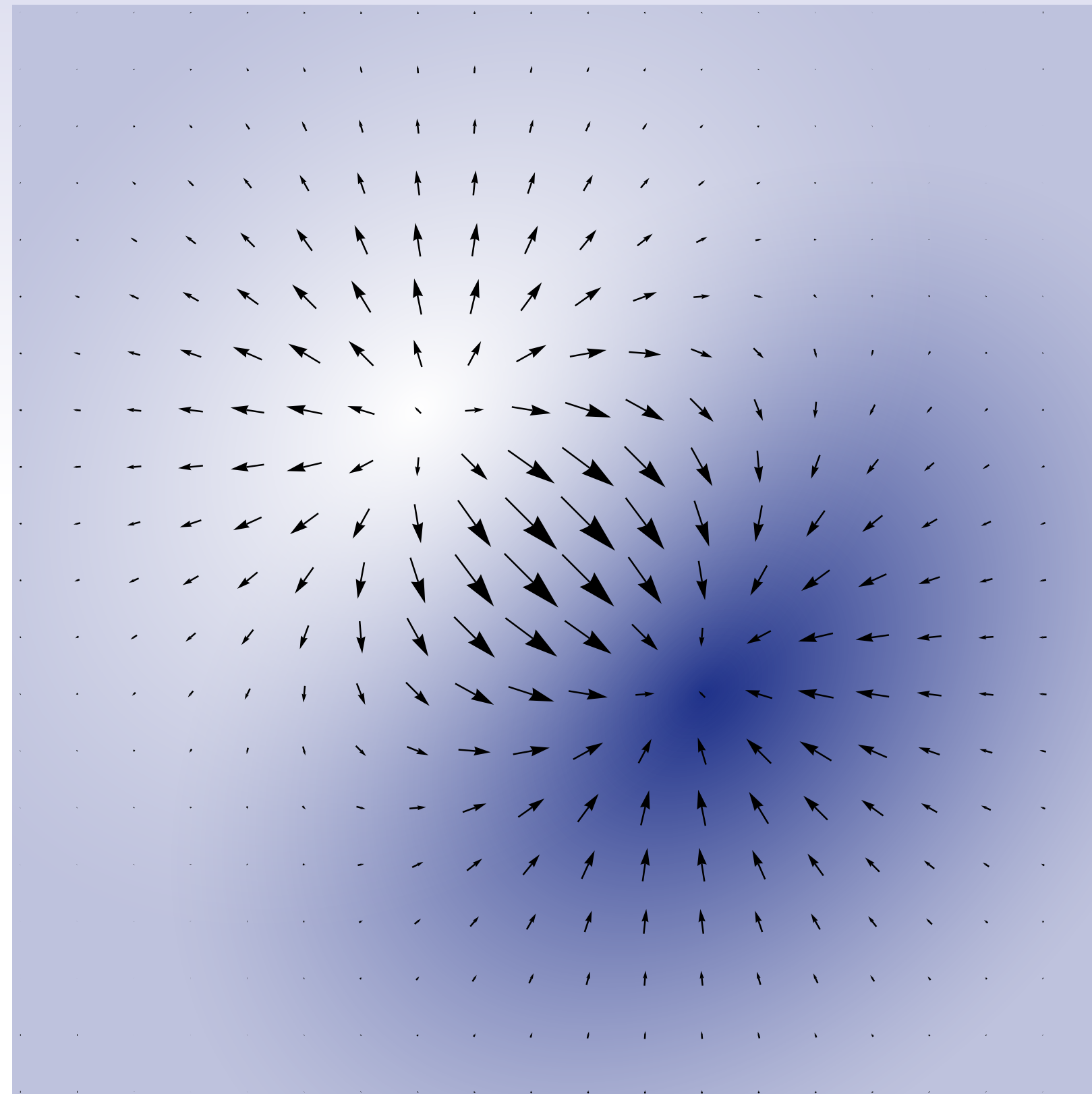
# *Review: Vector Derivatives*

$\phi$



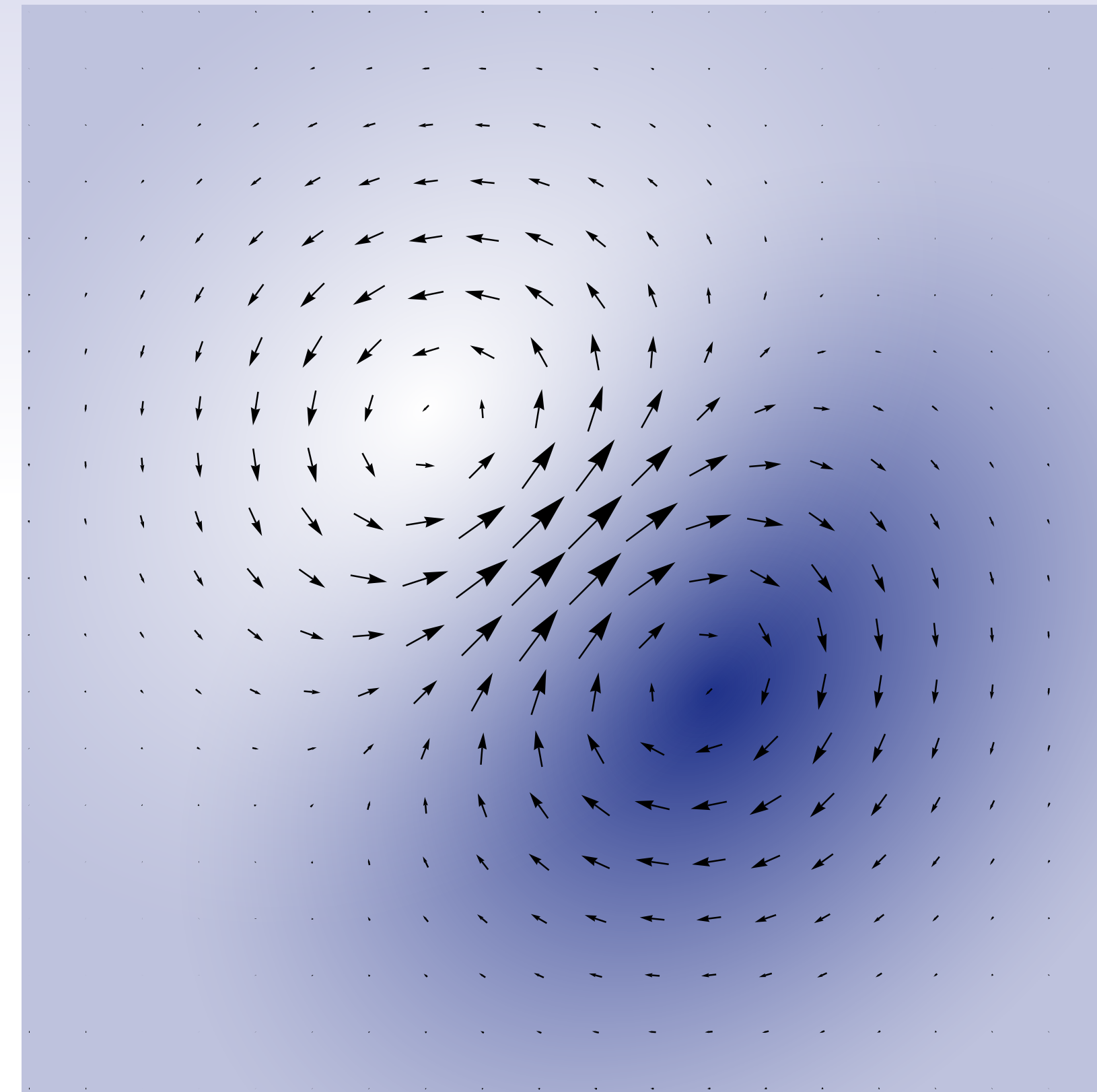
$\text{grad } \phi$

$X$



$\text{div } X$

$Y$



$\text{curl } Y$



# Review: Vector Derivatives in Coordinates

How do we express grad, div, and curl in coordinates?

Consider a scalar function  $\phi : \mathbb{R}^3 \rightarrow \mathbb{R}$  and a vector field

$$X = u \frac{\partial}{\partial x} + v \frac{\partial}{\partial y} + w \frac{\partial}{\partial z}$$

where  $u, v, w : \mathbb{R}^n \rightarrow \mathbb{R}$  are coordinate functions that vary over the domain, and  $\frac{\partial}{\partial x}, \frac{\partial}{\partial y}, \frac{\partial}{\partial z}$  are the standard basis vector fields.

## grad

$$\nabla \phi = \frac{\partial \phi}{\partial x} \frac{\partial}{\partial x} + \frac{\partial \phi}{\partial y} \frac{\partial}{\partial y} + \frac{\partial \phi}{\partial z} \frac{\partial}{\partial z}$$

## div

$$\nabla \cdot X = \frac{\partial u}{\partial x} + \frac{\partial v}{\partial y} + \frac{\partial w}{\partial z}$$

## curl

$$\begin{aligned} \nabla \times X = & \left( \frac{\partial w}{\partial y} - \frac{\partial v}{\partial z} \right) \frac{\partial}{\partial x} + \\ & \left( \frac{\partial u}{\partial z} - \frac{\partial w}{\partial x} \right) \frac{\partial}{\partial y} + \\ & \left( \frac{\partial v}{\partial x} - \frac{\partial u}{\partial y} \right) \frac{\partial}{\partial z} \end{aligned}$$

# *Exterior Derivative*

( $\Omega^k$  — space of all differential  $k$ -forms)

Unique *linear* map  $d : \Omega^k \rightarrow \Omega^{k+1}$  such that

**differential**      for  $k = 0$ ,  $d\phi(X) = D_X\phi$

**product rule**       $d(\alpha \wedge \beta) = d\alpha \wedge \beta + (-1)^k \alpha \wedge d\beta$

**exactness**       $d \circ d = 0$

Where do these rules come from?  
(What's the *geometric* motivation?)



# *Exterior Derivative—Differential*



# Review: Directional Derivative

- The *directional derivative* of a scalar function  $\phi$  at a point  $p$  with respect to a vector  $X$  is the rate at which that function increases as we walk away from  $p$  with velocity  $X$ .

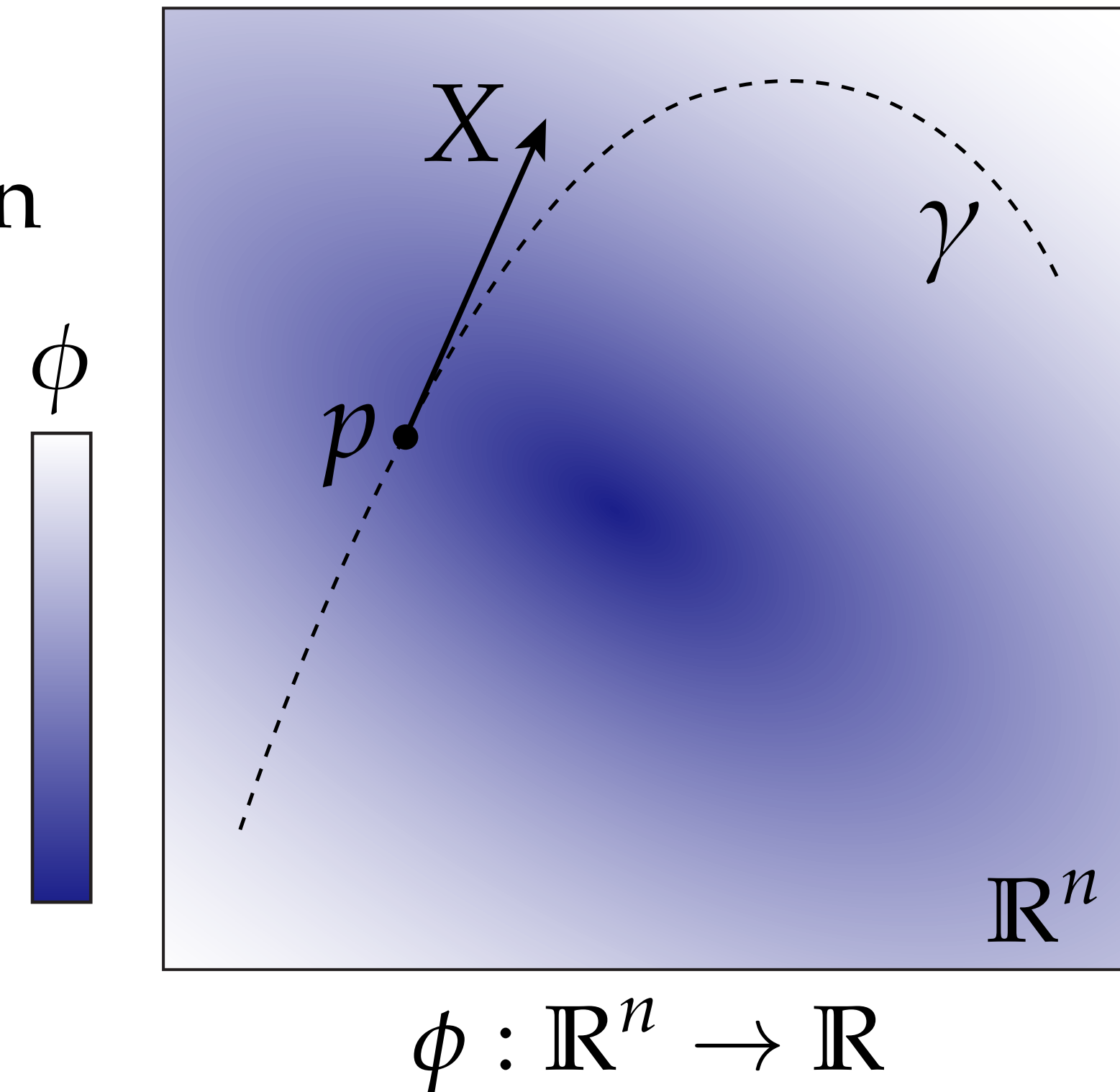
- More precisely:

$$D_X \phi \Big|_p := \lim_{\varepsilon \rightarrow 0} \frac{\phi(p + \varepsilon X) - \phi(p)}{\varepsilon}$$

- Alternatively, suppose that  $X$  is a *vector field*, rather than just a vector at a single point. Then we can write just:

$$D_X \phi$$

- The result is a *scalar function*, whose value at each point  $p$  is the directional derivative along the vector  $X(p)$ .



**Intuition:** as we walk along a curve  $\gamma$  tangent to  $X$ , how fast will an observed quantity  $\phi$  change as we pass through  $p$ ?

# Review: Gradient

Let  $\phi : \mathbb{R}^n \rightarrow \mathbb{R}$ . What is the *gradient* of  $\phi$ ?

**Geometric intuition.** “Uphill direction.”

**Coordinate approach.** In Euclidean  $\mathbb{R}^n$ , list of partials:

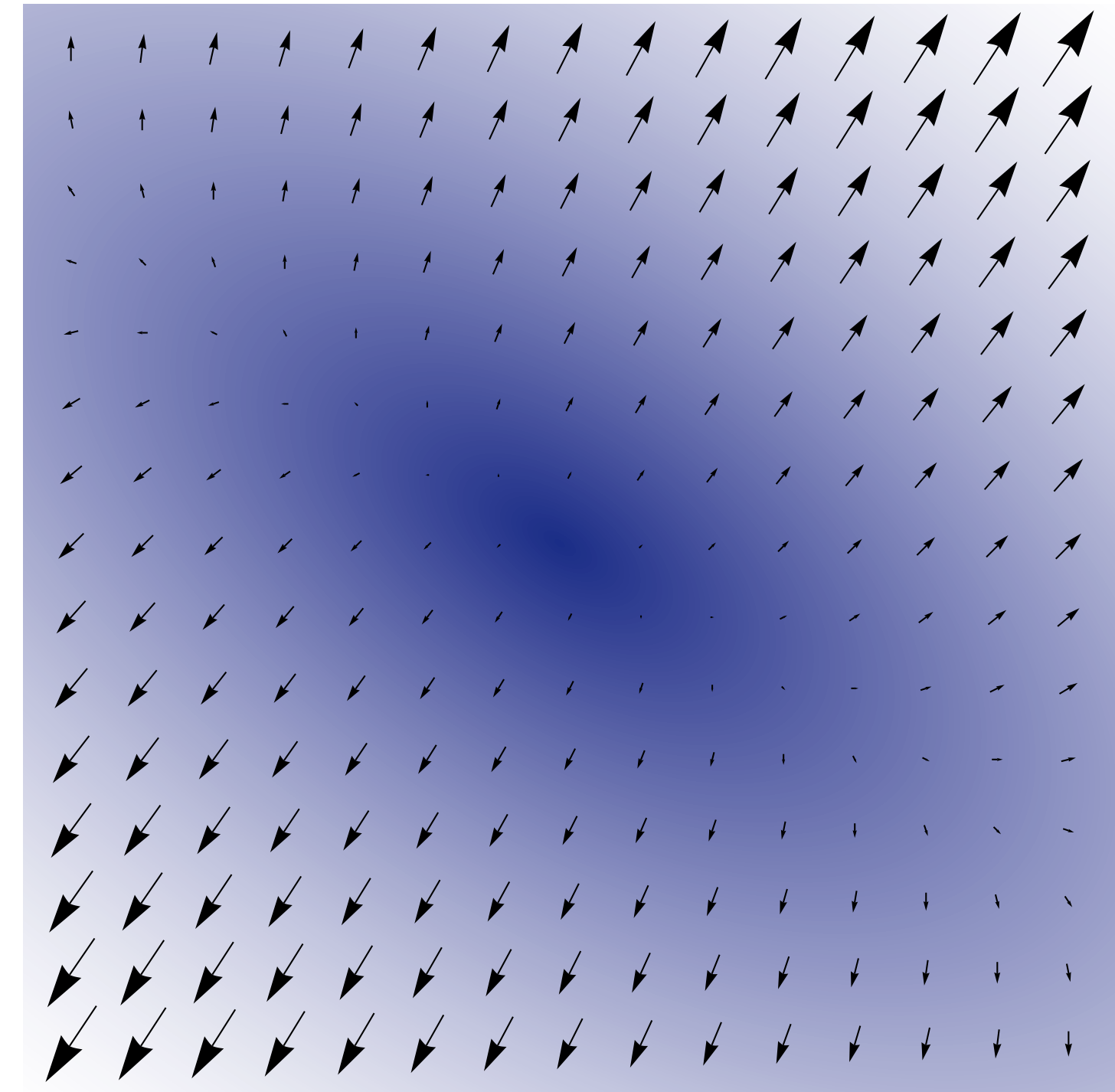
$$\nabla \phi = \frac{\partial \phi}{\partial x^1} \frac{\partial}{\partial x^1} + \cdots + \frac{\partial \phi}{\partial x^n} \frac{\partial}{\partial x^n} = \left[ \frac{\partial \phi}{\partial x^1} \quad \cdots \quad \frac{\partial \phi}{\partial x^n} \right]^\top$$

**Coordinate-free approach.**

$$\langle \nabla \phi, X \rangle = D_X \phi \quad \text{for all } X$$

*I.e.*, the gradient is the unique\* vector field  $\nabla \phi$  whose inner product with any vector field  $X$  yields the directional derivative  $D_X \phi$  along  $X$ .

\*If it exists! *I.e.*, assuming the function is *differentiable*.



# Differential of a Function

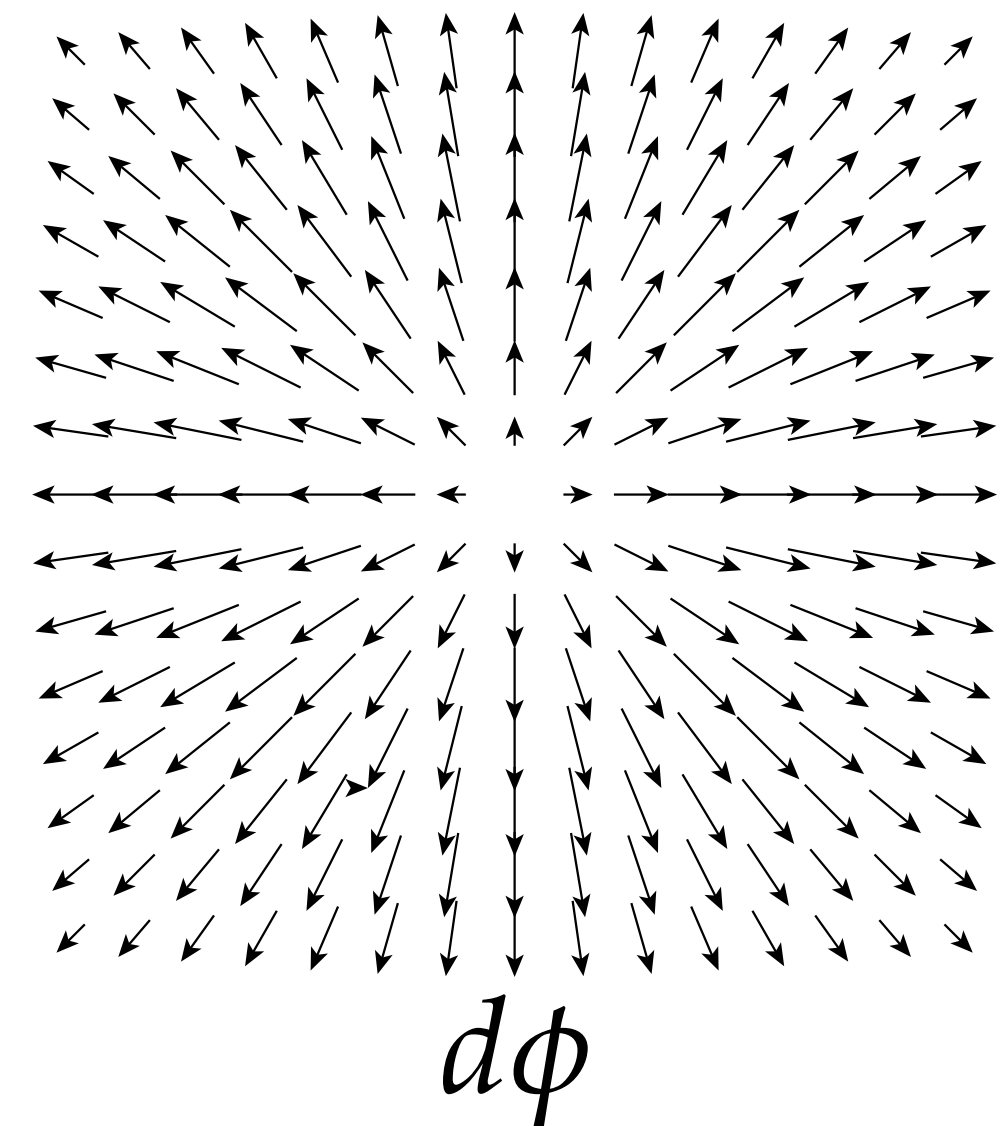
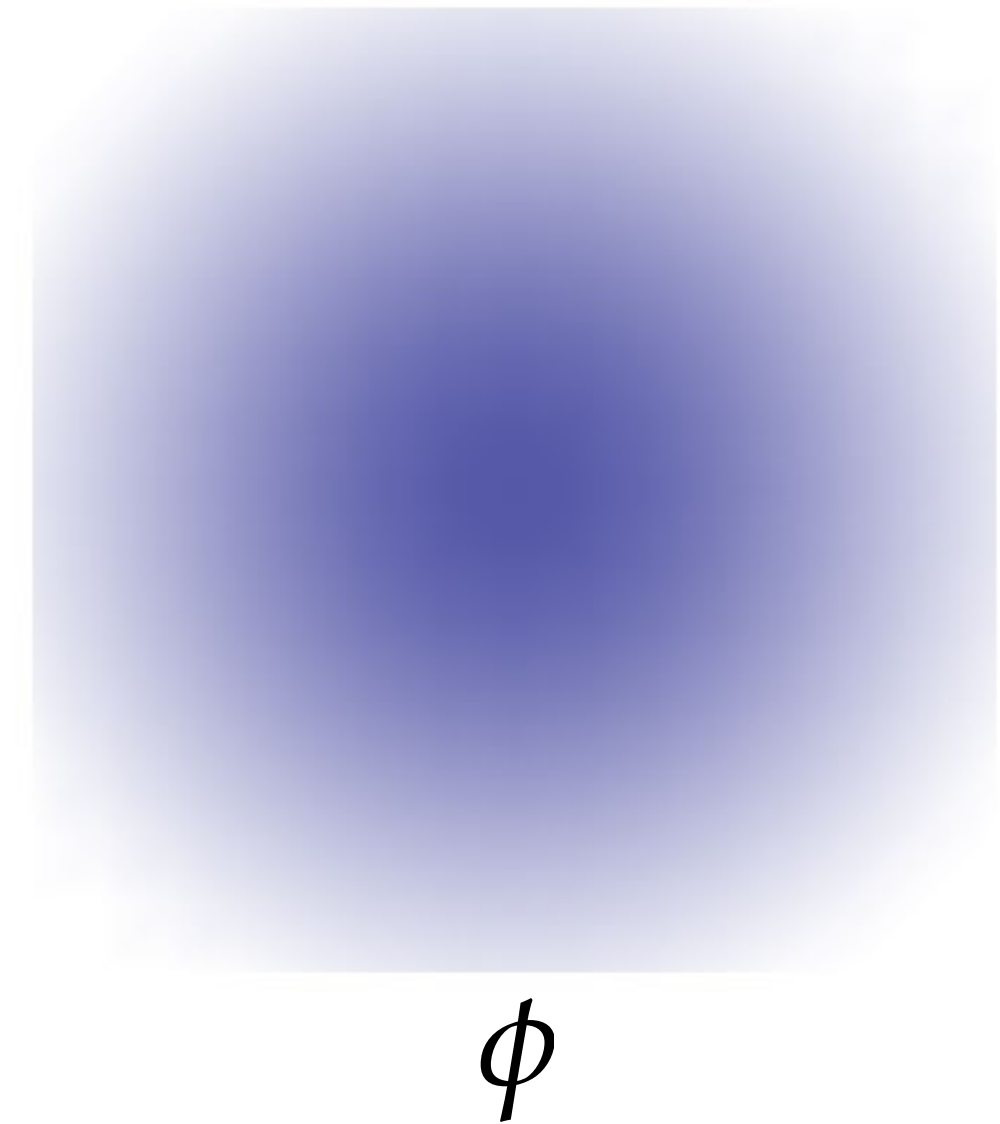
- Recall that differential 0-forms are just ordinary scalar functions
- Change in a scalar function can be measured via the *differential*
- Two ways to define differential:
  1. As unique 1-form such that applying to any vector field gives directional derivative along those directions:

$$d\phi(X) = D_X\phi$$

2. In coordinates:

$$d\phi := \frac{\partial\phi}{\partial x^1}dx^1 + \cdots + \frac{\partial\phi}{\partial x^n}dx^n$$

...but wait, isn't this just the same as the *gradient*?





# Gradient vs. Differential

- Superficially, gradient and differential look quite similar (but not identical!):

$$\langle \nabla \phi, X \rangle = D_X \phi$$

$$d\phi(X) = D_X \phi$$

- Especially in  $\mathbb{R}^n$ :

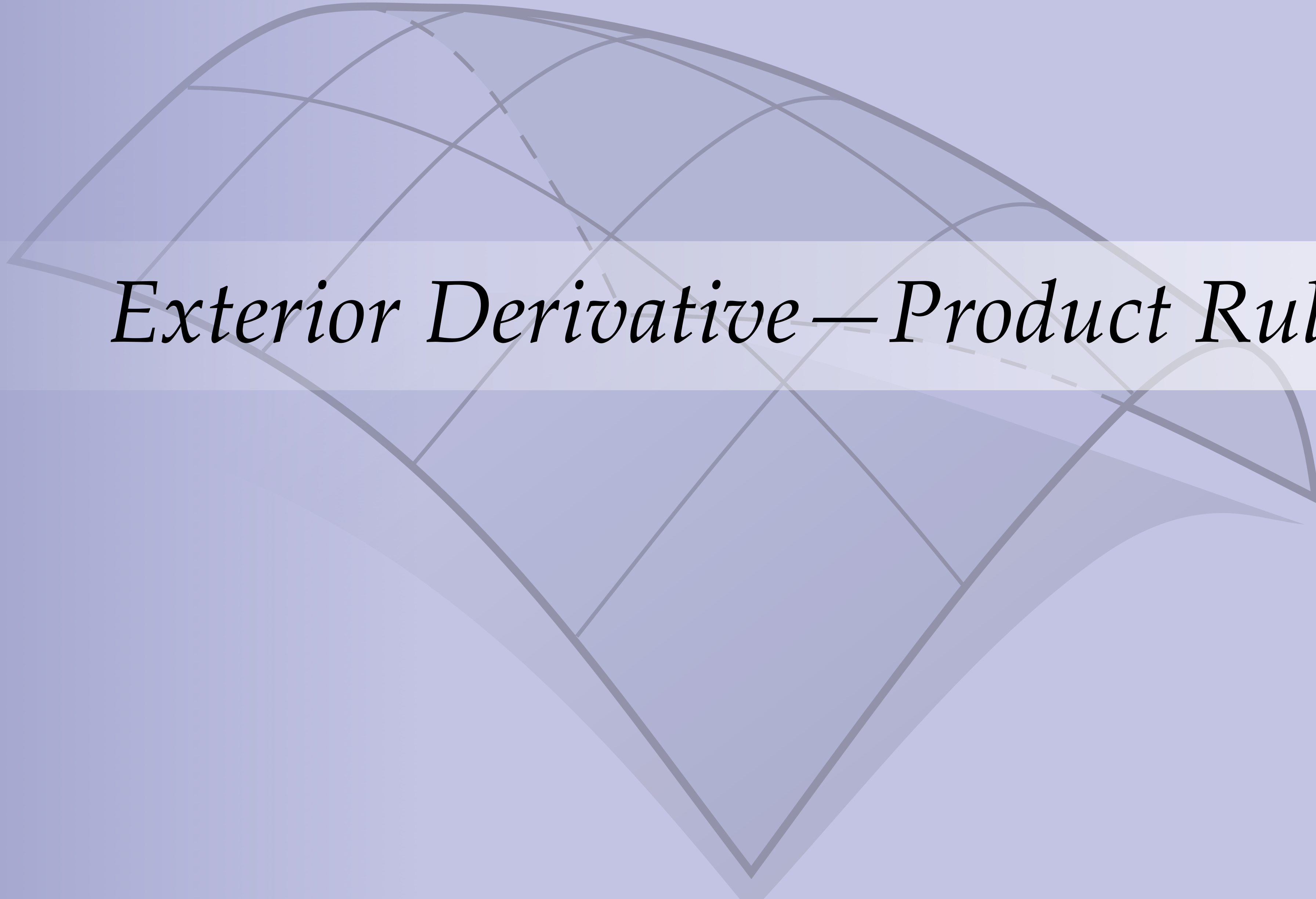
$$\nabla \phi = \frac{\partial \phi}{\partial x^1} \frac{\partial}{\partial x^1} + \cdots + \frac{\partial \phi}{\partial x^n} \frac{\partial}{\partial x^n}$$

$$d\phi = \frac{\partial \phi}{\partial x^1} dx^1 + \cdots + \frac{\partial \phi}{\partial x^n} dx^n$$

- So what's the difference?
  - For one thing, one is a *vector field*; the other is a *differential 1-form*
  - More importantly, gradient depends on *inner product*; differential doesn't

$$(d\phi)^\sharp = \nabla \phi \iff \boxed{d\phi(\cdot) = \langle \nabla \phi, \cdot \rangle} \iff (\nabla \phi)^\flat = d\phi$$

Makes a *big* difference when it comes to curved geometry, numerical optimization, ...



# *Exterior Derivative—Product Rule*

# *Exterior Derivative*

Unique *linear* map  $d : \Omega^k \rightarrow \Omega^{k+1}$  such that

**differential**      for  $k = 0$ ,  $d\phi(X) = D_X\phi$

**product rule**       $d(\alpha \wedge \beta) = d\alpha \wedge \beta + (-1)^k \alpha \wedge d\beta$

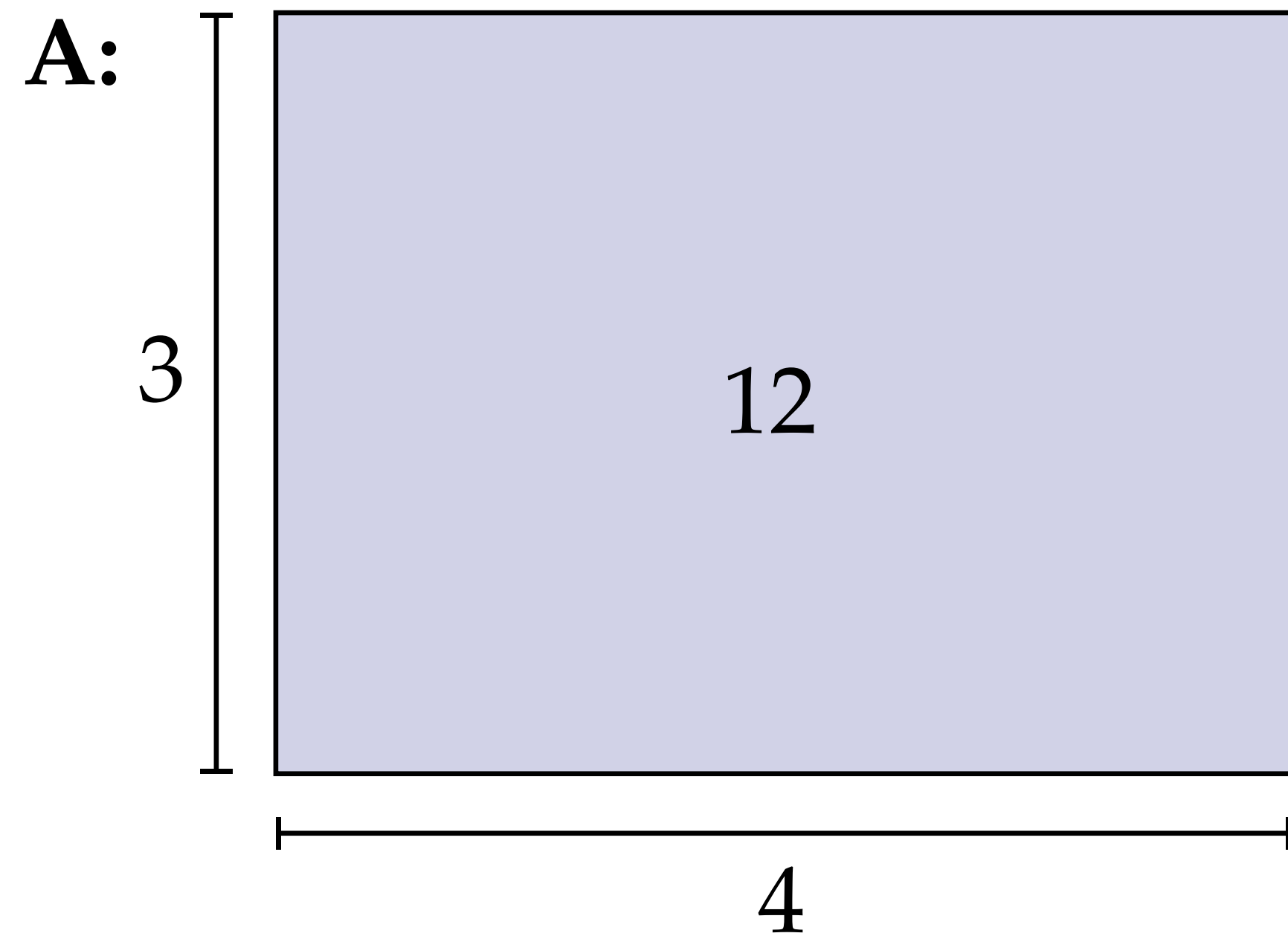
**exactness**       $d \circ d = 0$



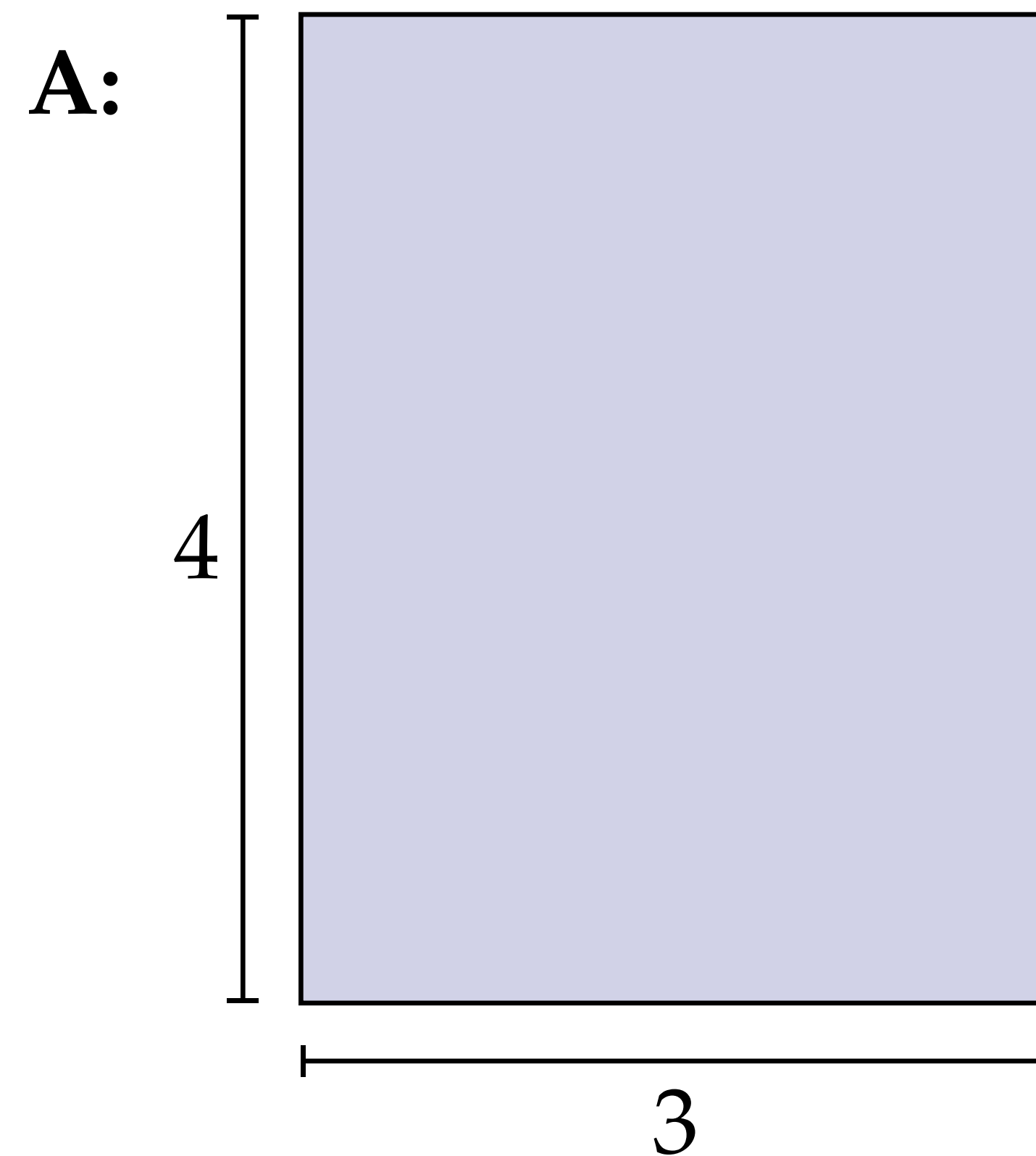
# *Review: Product of Numbers*

**Q:** Why is it true that  $ab = ba$  for any two real numbers  $a, b$ ?

**Q:** What's the geometric interpretation of the statement " $4 \times 3 = 12$ "?



**Q:** How about " $3 \times 4 = 12$ "?

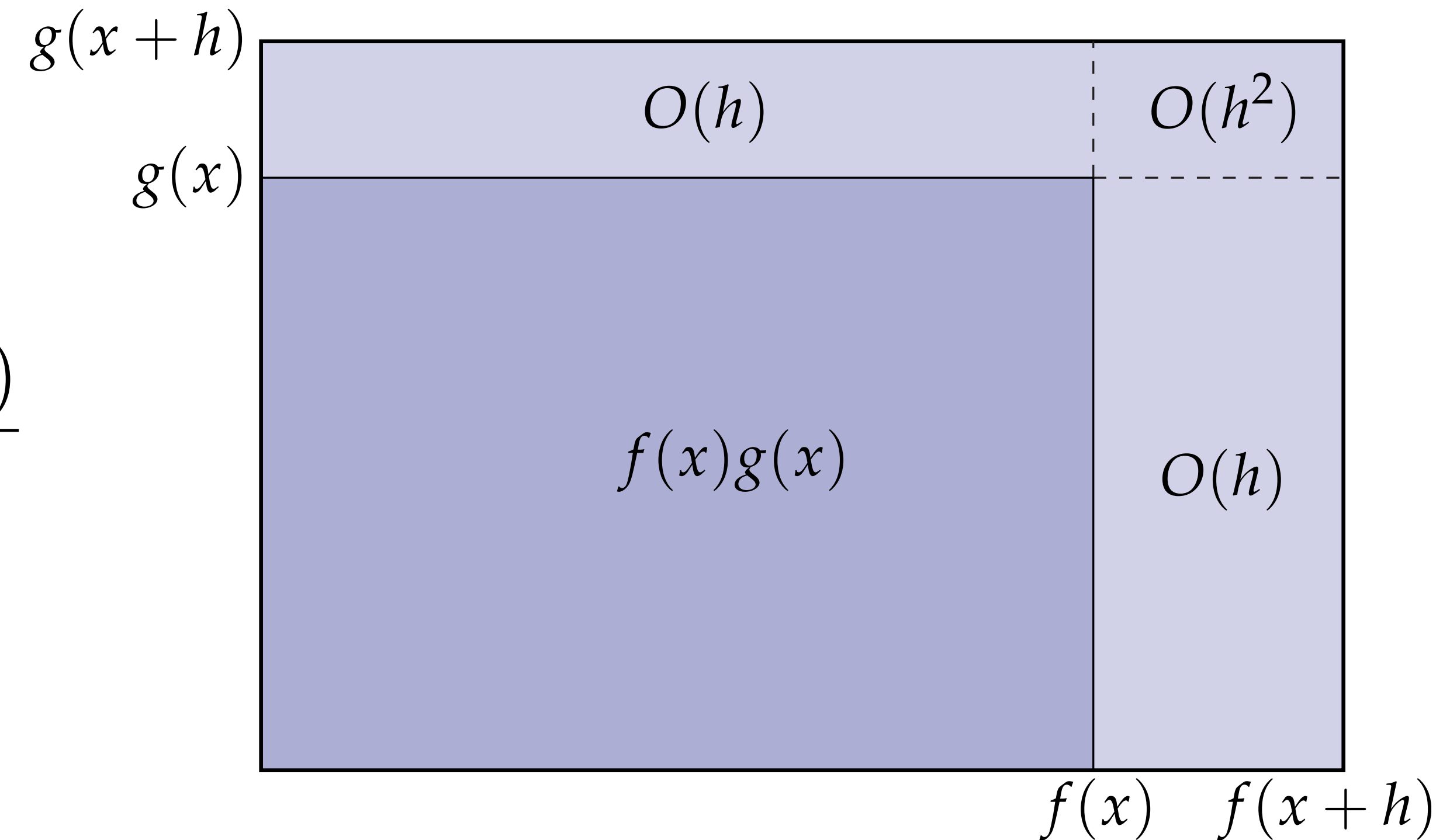


# Product Rule—Derivative

For any differentiable functions  $f, g : \mathbb{R} \rightarrow \mathbb{R}$ ,  $(fg)' = f'g + fg'$ .

**Q:** Why? What's the *geometric* interpretation?

$$(fg)'(x) = \lim_{h \rightarrow 0} \frac{f(x+h)g(x+h) - f(x)g(x)}{h}$$

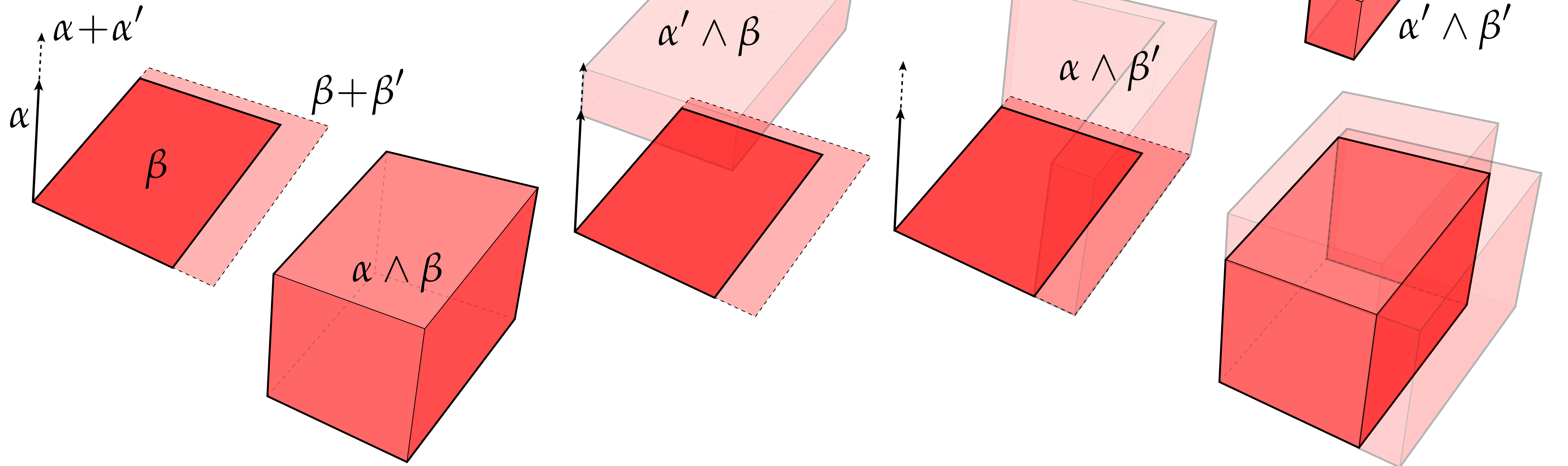


# Product Rule—Exterior Derivative

Let  $\alpha$  be a  $k$ -form and let  $\beta$  be an  $\ell$ -form. Then

$$d(\alpha \wedge \beta) = (d\alpha) \wedge \beta + (-1)^k \alpha \wedge (d\beta).$$

**Q:** Geometric intuition?



(Does this cartoon depict the *exterior derivative*? Or a *directional derivative*?)

$$\alpha \wedge \beta + \alpha' \wedge \beta + \alpha \wedge \beta'$$



# Product Rule—“Recursive Evaluation”

**Example.** Let  $\alpha := u \, dx$ ,  $\beta := v \, dy$ , and  $\gamma := w \, dz$  be differential 1-forms on  $\mathbb{R}^n$ , where  $u, v, w : \mathbb{R}^n \rightarrow \mathbb{R}$  are 0-forms, *i.e.*, scalar functions. Also, let  $\omega := \alpha \wedge \beta$ . Then

$$d(\omega \wedge \gamma) = (d\omega) \wedge \gamma + (-1)^2 \omega \wedge (d\gamma).$$

We can then “recursively” evaluate derivatives that appear on the right-hand side:

$$\begin{aligned} d\omega &= (d\alpha) \wedge \beta + (-1)^1 \alpha \wedge (d\beta), \\ d\alpha &= (du) \wedge dx + (-1)^0 u(\cancel{d}dx)^0, \\ d\beta &= (dv) \wedge dy + (-1)^0 v(\cancel{d}dy)^0, \\ d\gamma &= (dw) \wedge dz + (-1)^0 w(\cancel{d}dz)^0. \end{aligned}$$

**Key idea:** The “base case” is the 0-forms, *i.e.*, computing the final result boils down to taking the differential of ordinary scalar functions.

# *Exterior Derivative—Examples*

**Example.** Let  $\phi(x, y) := \frac{1}{2}e^{-(x^2+y^2)}$ . Then  $d\phi = \frac{\partial\phi}{\partial x}dx + \frac{\partial\phi}{\partial y}dy$   
$$= -2\phi(xdx + ydy)$$

**Example.** Let  $\alpha(x, y) = xdx + ydy$ . Then  $d\alpha =$   
$$\left(\frac{\partial x}{\partial x}dx + \frac{\partial x}{\partial y}dy\right) \wedge dx + \left(\frac{\partial y}{\partial x}dx + \frac{\partial y}{\partial y}dy\right) \wedge dy$$
$$= dx \wedge dx + dy \wedge dy = 0 + 0 = 0.$$

**Example.** Again let  $\alpha(x, y) = xdx + ydy$ . Then  $d \star \alpha = d(x \star dx + y \star dy)$   
$$= d(xdy - ydx)$$
$$= dx \wedge dy - dy \wedge dx$$
$$= 2dx \wedge dy.$$



# *Exterior Derivative—Exactness*



# *Exterior Derivative*

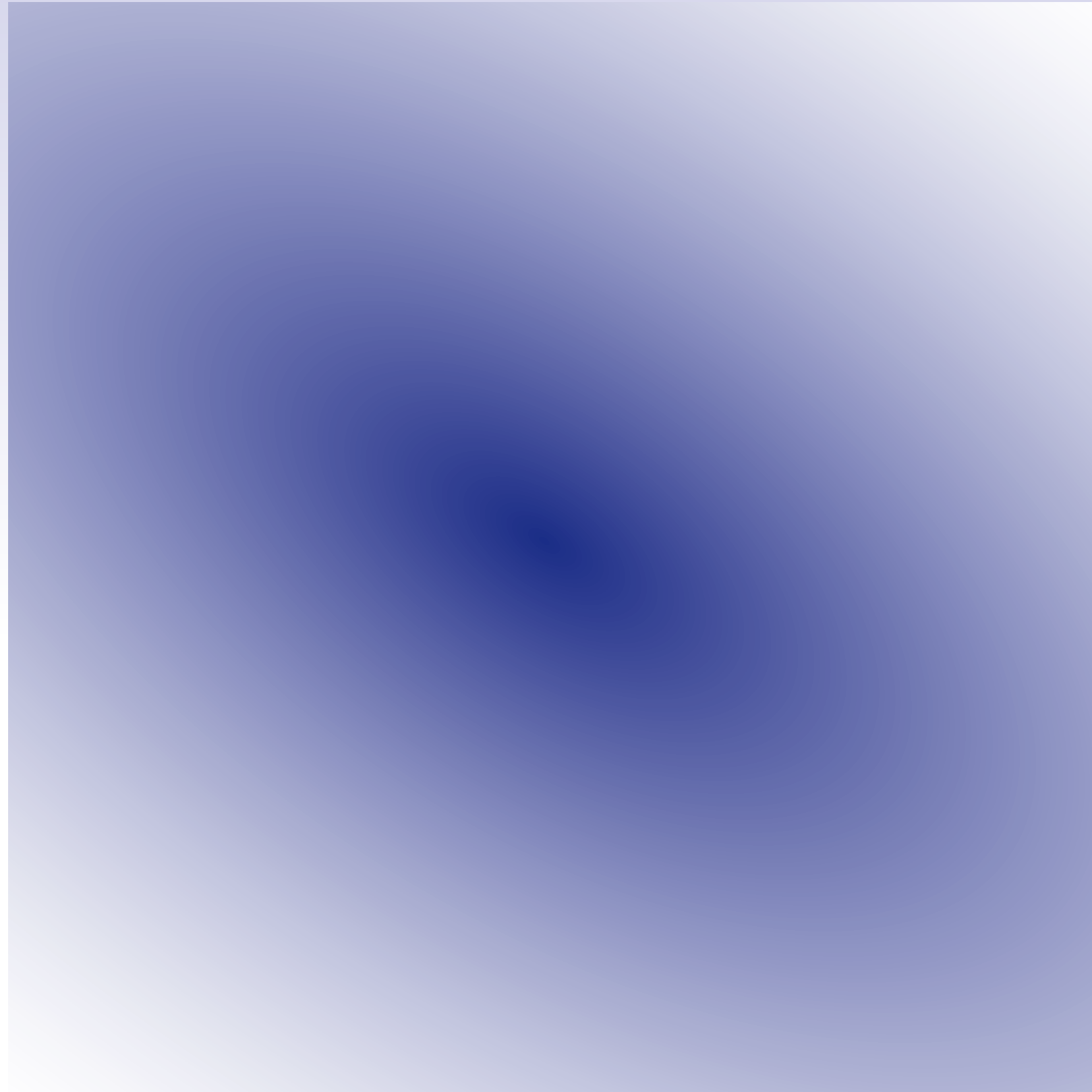
Unique *linear* map  $d : \Omega^k \rightarrow \Omega^{k+1}$  such that

**differential**      for  $k = 0$ ,  $d\phi(X) = D_X\phi$

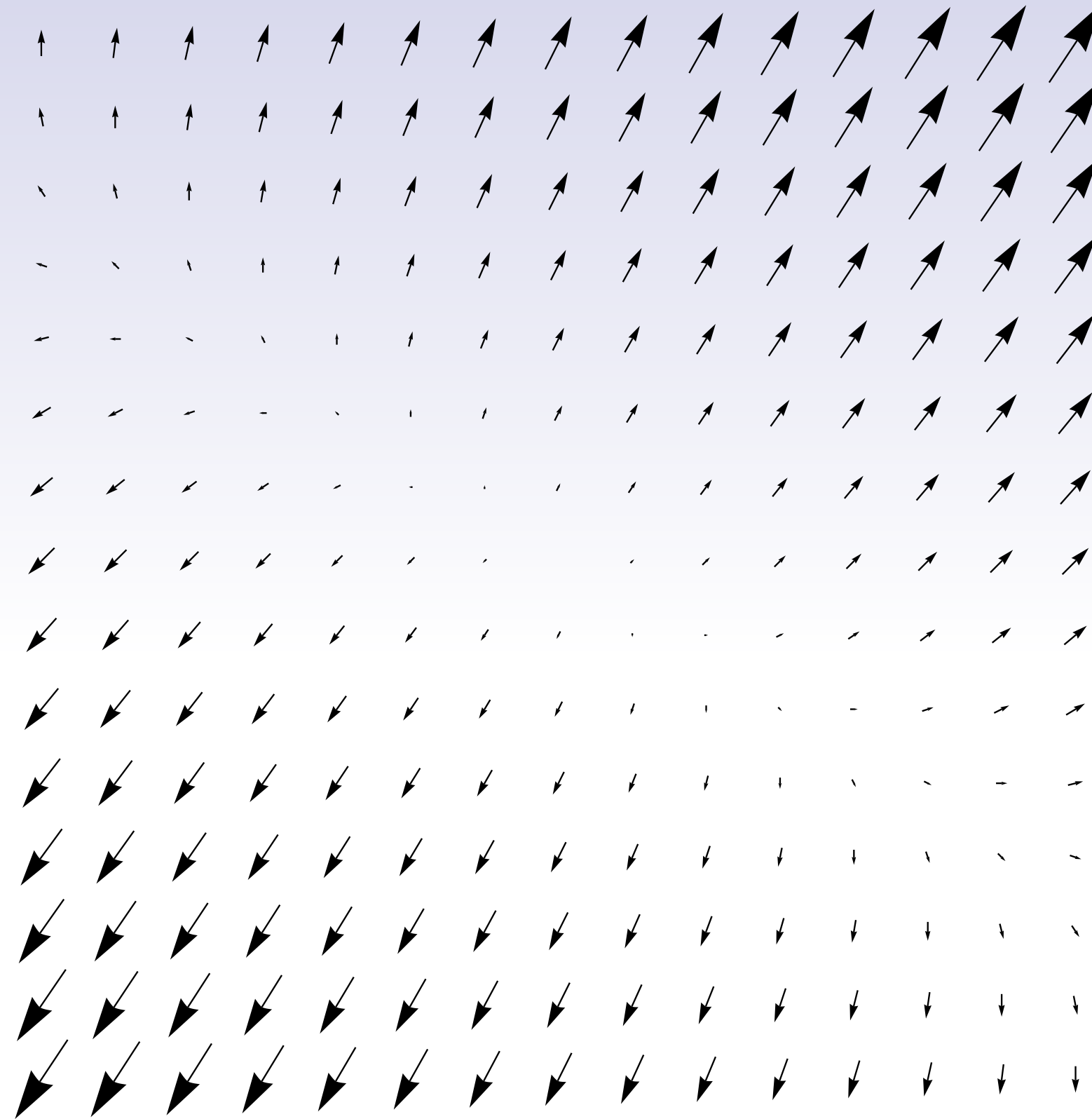
**product rule**       $d(\alpha \wedge \beta) = d\alpha \wedge \beta + (-1)^k \alpha \wedge d\beta$

**exactness**       $d \circ d = 0$

# *Review: Curl of Gradient*



$\phi$



$\text{grad } \phi$



$\text{curl} \circ \text{grad } \phi$

**Key idea:** exterior derivative should capture a similar idea.

# What Happens if $d \circ d = 0$ ?

**Q:** Consider a 1-form  $\alpha = udx + vdy + wdz$ , where the coefficients  $u, v, w$  are each scalar functions  $\mathbb{R}^3 \rightarrow \mathbb{R}$ . What is the exterior derivative  $d\alpha$  in coordinates  $x, y, z$ ?

$$\begin{aligned}
 \mathbf{A:} \quad d\alpha &= d(udx + vdy + wdz) = du \wedge dx + \cancel{u \cancel{d} dx}^0 + dv \wedge dy + \cancel{v \cancel{d} dy}^0 + dw \wedge dz + \cancel{w \cancel{d} dz}^0 \\
 &= \left( \frac{\partial u}{\partial x} dx + \frac{\partial u}{\partial y} dy + \frac{\partial u}{\partial z} dz \right) \wedge dx + \left( \frac{\partial v}{\partial x} dx + \frac{\partial v}{\partial y} dy + \frac{\partial v}{\partial z} dz \right) \wedge dy + \left( \frac{\partial w}{\partial x} dx + \frac{\partial w}{\partial y} dy + \frac{\partial w}{\partial z} dz \right) \wedge dz \\
 &= \left( \cancel{\frac{\partial u}{\partial x} dx \wedge dx}^0 + \frac{\partial u}{\partial y} dy \wedge dx + \frac{\partial u}{\partial z} dz \wedge dx \right) + \left( \frac{\partial v}{\partial x} dx \wedge dy + \cancel{\frac{\partial v}{\partial y} dy \wedge dy}^0 + \frac{\partial v}{\partial z} dz \wedge dy \right) + \left( \frac{\partial w}{\partial x} dx \wedge dz + \frac{\partial w}{\partial y} dy \wedge dz + \cancel{\frac{\partial w}{\partial z} dz \wedge dz}^0 \right) \\
 &= -\frac{\partial u}{\partial y} dx \wedge dy + \frac{\partial u}{\partial z} dz \wedge dx + \frac{\partial v}{\partial x} dx \wedge dy - \frac{\partial v}{\partial z} dy \wedge dz - \frac{\partial w}{\partial x} dz \wedge dx + \frac{\partial w}{\partial y} dy \wedge dz \\
 &= \left( \frac{\partial w}{\partial y} - \frac{\partial v}{\partial z} \right) dy \wedge dz + \left( \frac{\partial u}{\partial z} - \frac{\partial w}{\partial x} \right) dz \wedge dx + \left( \frac{\partial v}{\partial x} - \frac{\partial u}{\partial y} \right) dx \wedge dy.
 \end{aligned}$$

**Q:** Does this operation remind you of anything (*perhaps from vector calculus*)?



# Exterior Derivative and Curl

Suppose we have a *vector field*

$$X := u \frac{\partial}{\partial x} + v \frac{\partial}{\partial y} + w \frac{\partial}{\partial z}$$

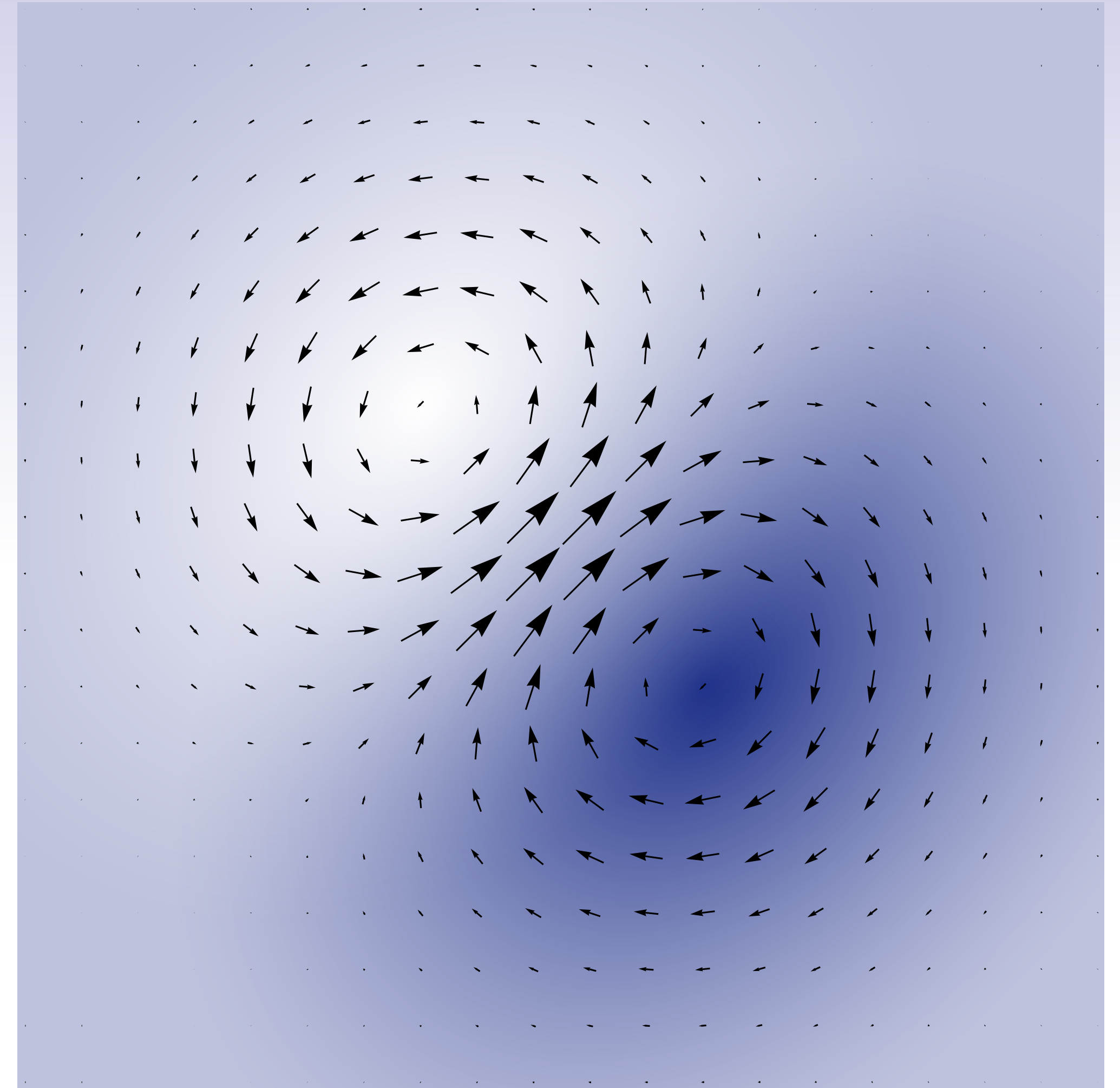
Its *curl* is then

$$\nabla \times X = \begin{pmatrix} \partial w / \partial y & - & \partial v / \partial z \\ \partial u / \partial z & - & \partial w / \partial x \\ \partial v / \partial x & - & \partial u / \partial y \end{pmatrix} \begin{pmatrix} \frac{\partial}{\partial x} \\ \frac{\partial}{\partial y} \\ \frac{\partial}{\partial z} \end{pmatrix} +$$

Looks an awful lot like...

$$d\alpha = \begin{pmatrix} \partial w / \partial y & - & \partial v / \partial z \\ \partial u / \partial z & - & \partial w / \partial x \\ \partial v / \partial x & - & \partial u / \partial y \end{pmatrix} \begin{pmatrix} dy \wedge dz \\ dz \wedge dx \\ dx \wedge dy \end{pmatrix} +$$

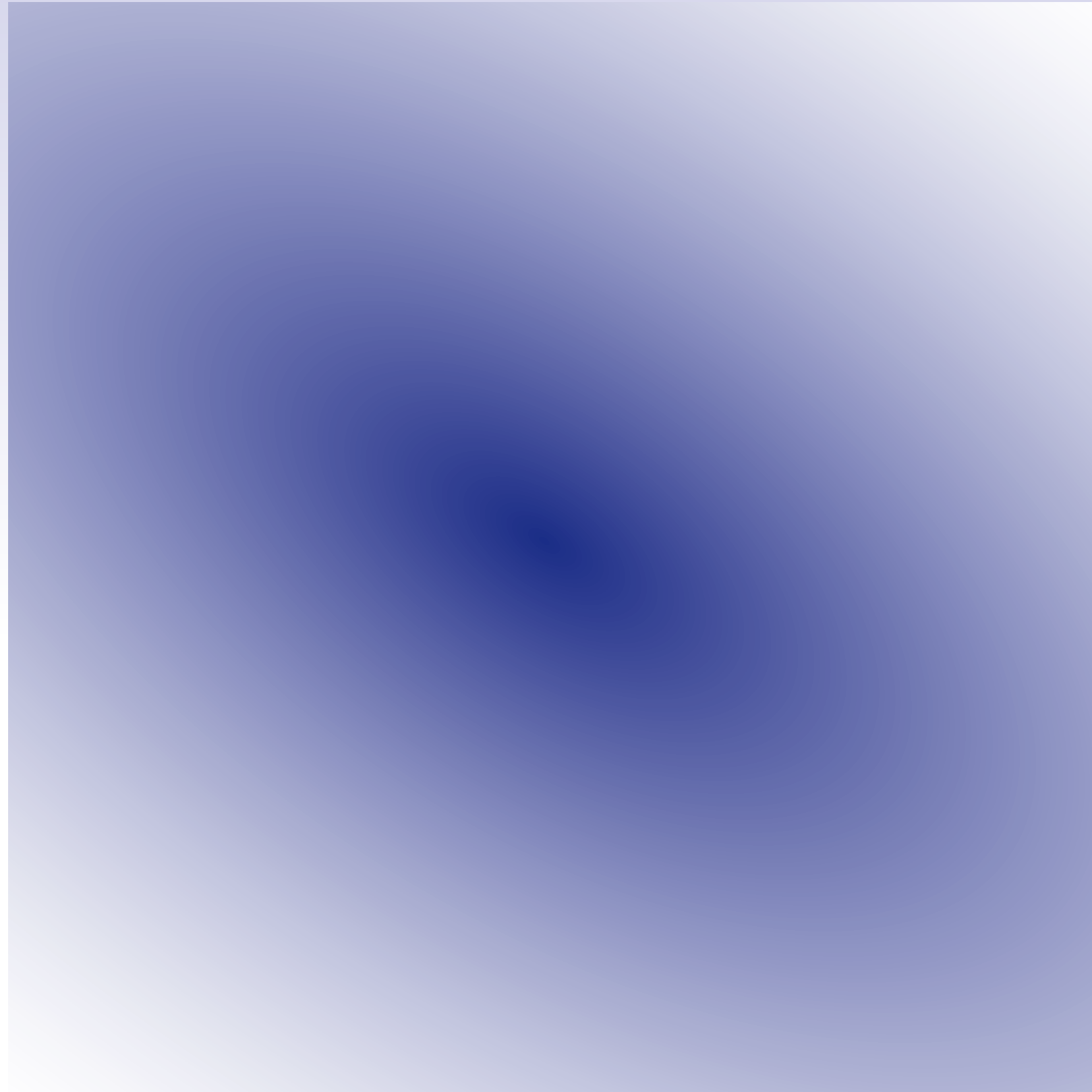
Especially if we then apply the *Hodge star*.



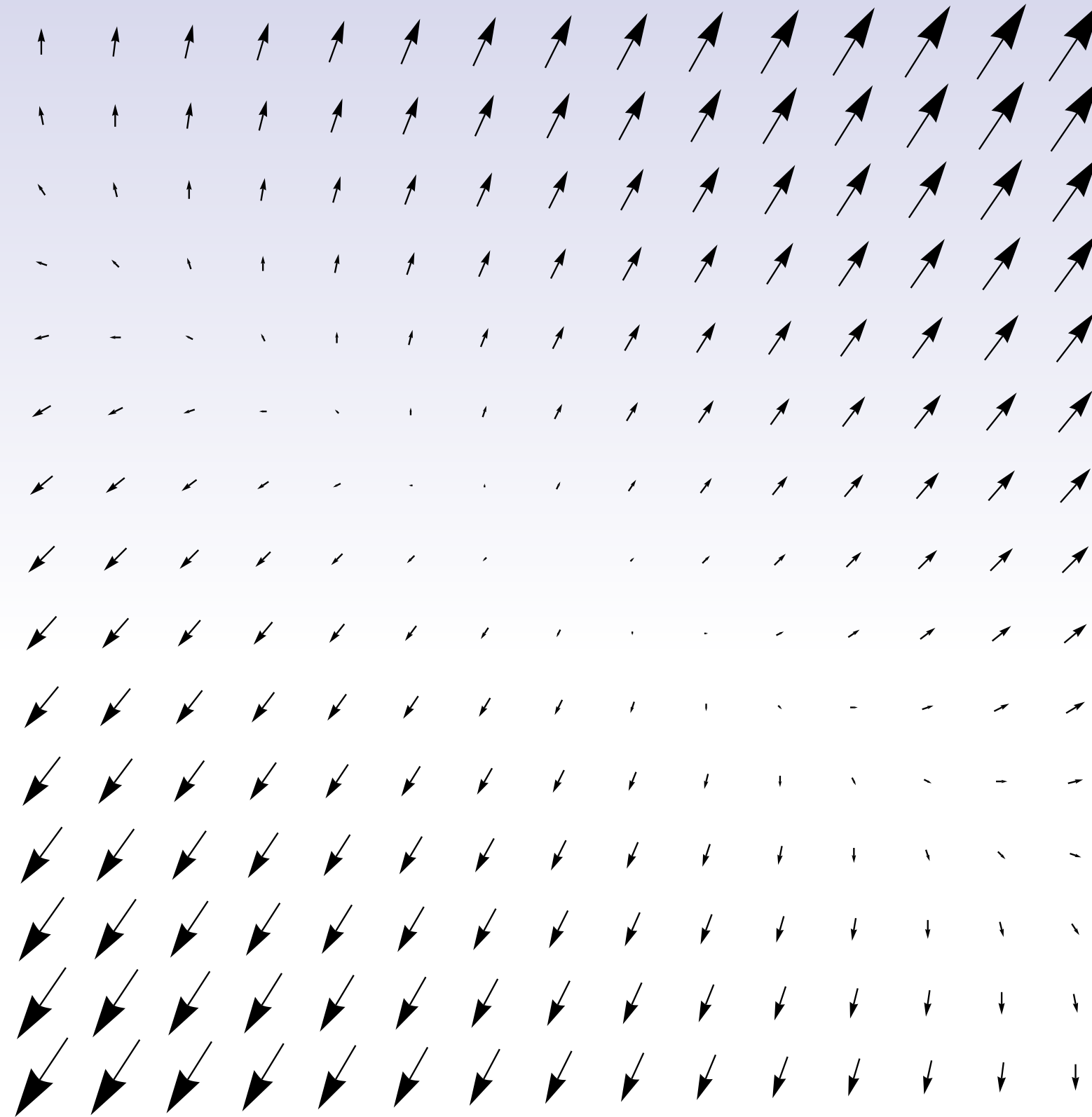
$$\nabla \times X \iff \star d\alpha$$

$$\nabla \times X = (\star dX^b)^\#$$

$$d \circ d = 0$$



$\phi$



$d\phi$



$dd\phi$

**Intuition:** in  $\mathbb{R}^n$ , first  $d$  behaves just like gradient; second  $d$  behaves just like curl.

# *Exterior Derivative in 3D (1-forms)*

**Q:** How about  $d \star \alpha$ ? (Still for  $\alpha = udx + vdy + wdz$ .)

**A:**

$$\begin{aligned} d \star \alpha &= d(\star(udx + vdy + wdz)) \\ &= d(udy \wedge dz + vdz \wedge dx + wdx \wedge dy) \\ &= du \wedge dy \wedge dz + dv \wedge dz \wedge dx + dw \wedge dx \wedge dy \\ &= \frac{\partial u}{\partial x} dx \wedge dy \wedge dz + \frac{\partial v}{\partial y} dy \wedge dz \wedge dx + \frac{\partial w}{\partial z} dz \wedge dx \wedge dy \\ &= \left( \frac{\partial u}{\partial x} + \frac{\partial v}{\partial y} + \frac{\partial w}{\partial z} \right) dx \wedge dy \wedge dz \end{aligned}$$

**Q:** Does this operation remind you of anything (*perhaps from vector calculus*)?



# Exterior Derivative and Divergence

Suppose we have a *vector field*

$$X := u \frac{\partial}{\partial x} + v \frac{\partial}{\partial y} + w \frac{\partial}{\partial z}$$

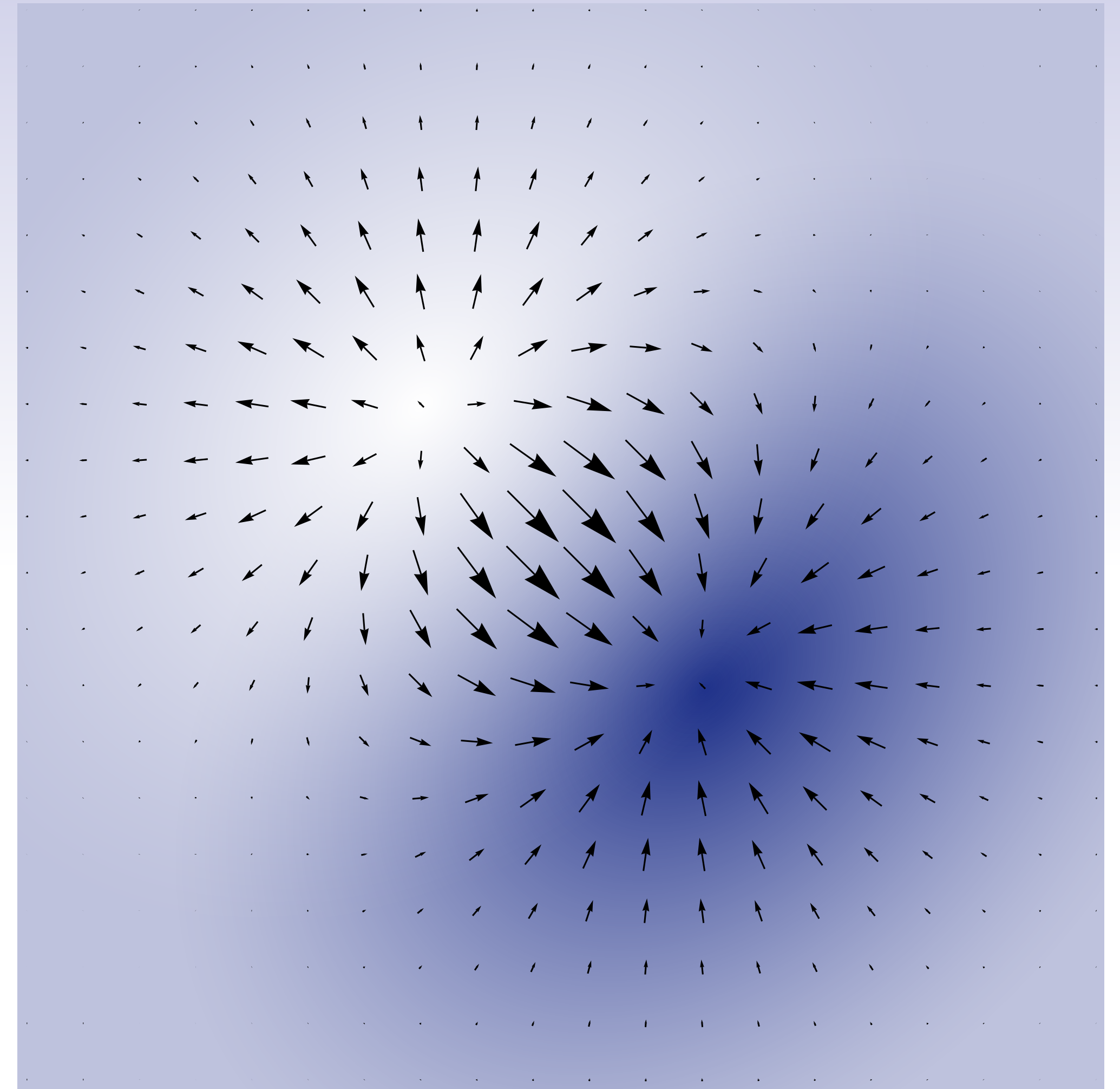
Its *divergence* is then

$$\nabla \cdot X = \frac{\partial u}{\partial x} + \frac{\partial v}{\partial y} + \frac{\partial w}{\partial z}$$

Looks an awful lot like...

$$d \star \alpha = \left( \frac{\partial u}{\partial x} + \frac{\partial v}{\partial y} + \frac{\partial w}{\partial z} \right) dx \wedge dy \wedge dz$$

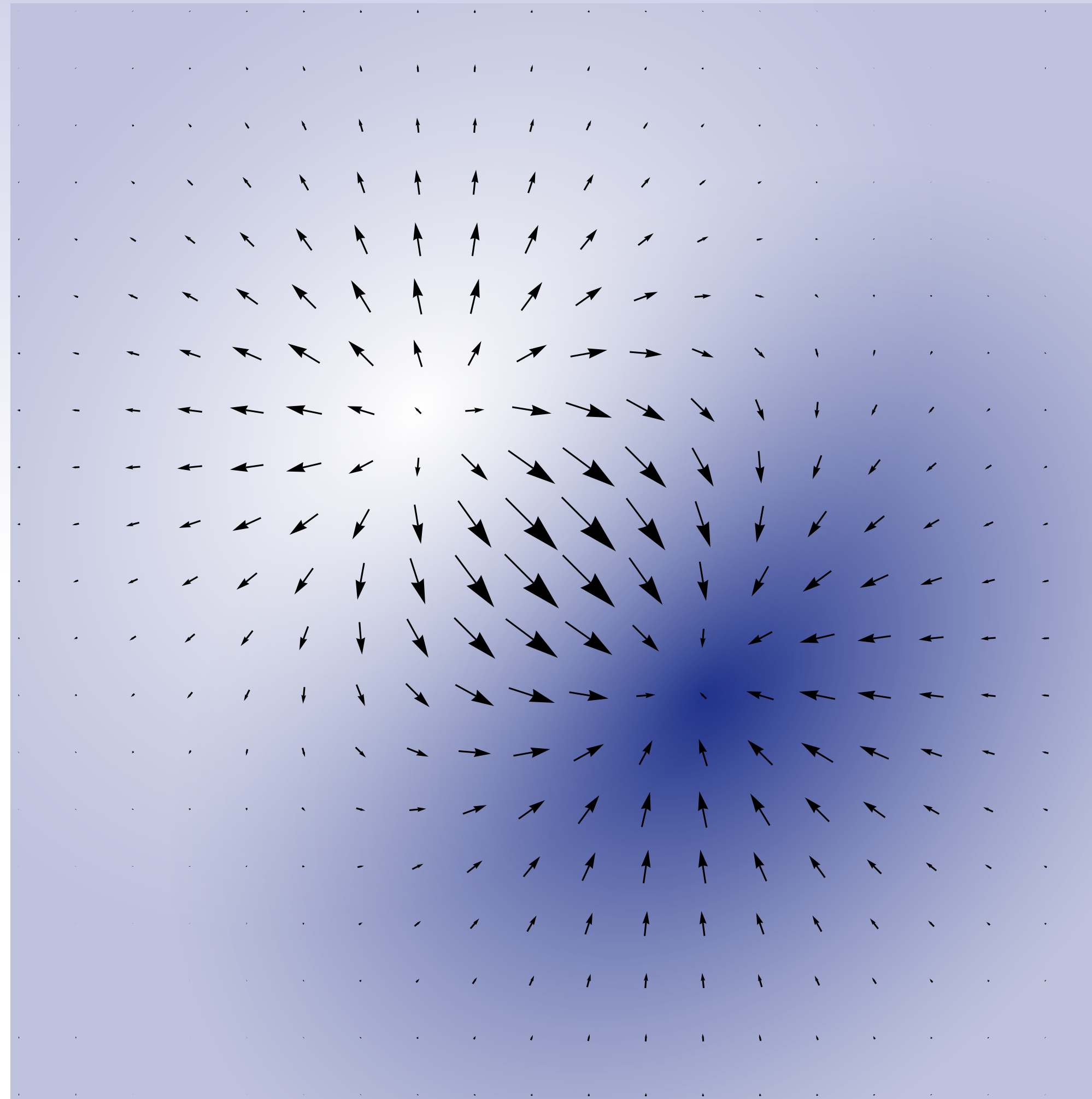
Especially if we then apply the *Hodge star*.



$$\nabla \cdot X \iff \star d \star \alpha$$
$$\nabla \cdot X = \star d \star X^{\flat}$$



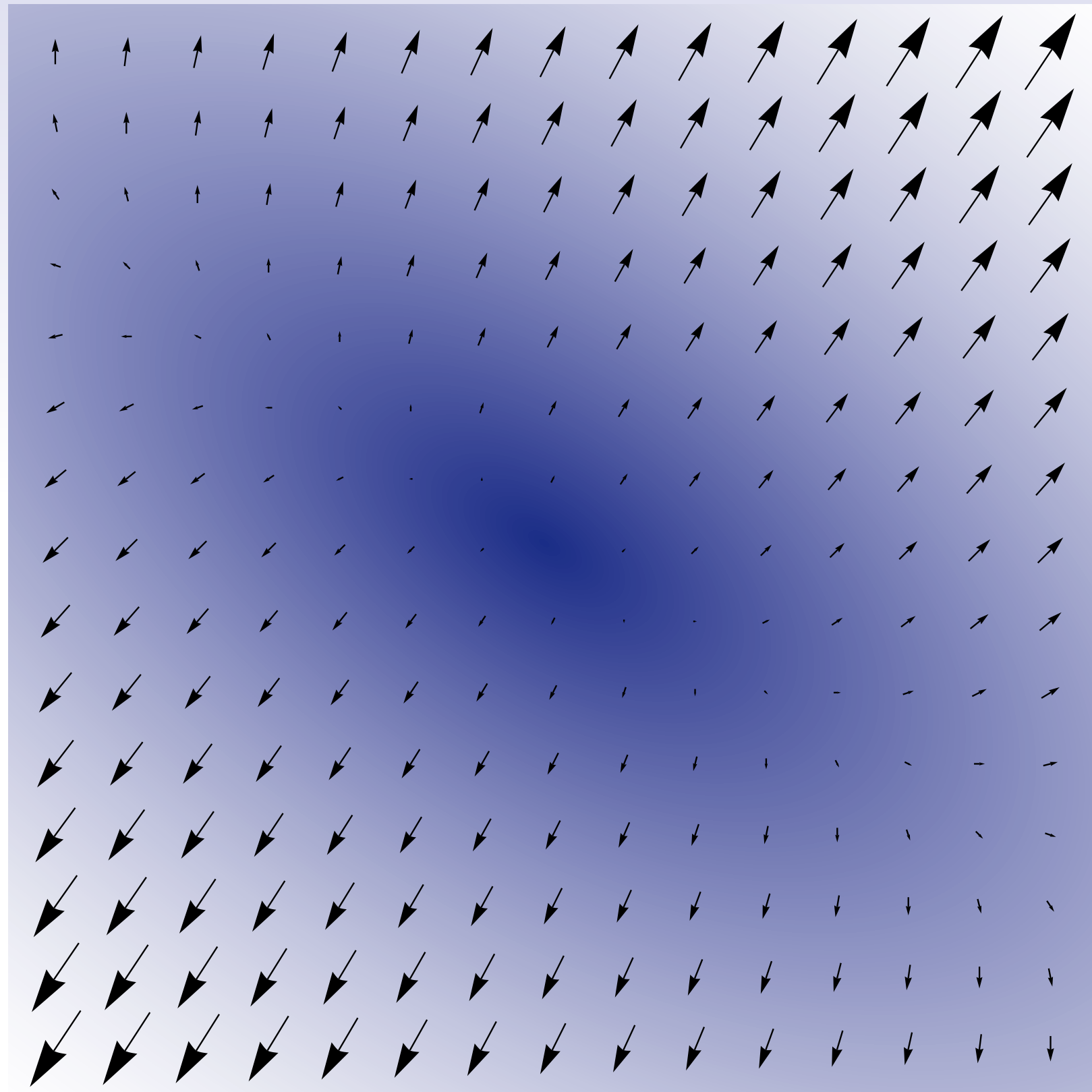
# *Exterior Derivative - Divergence*



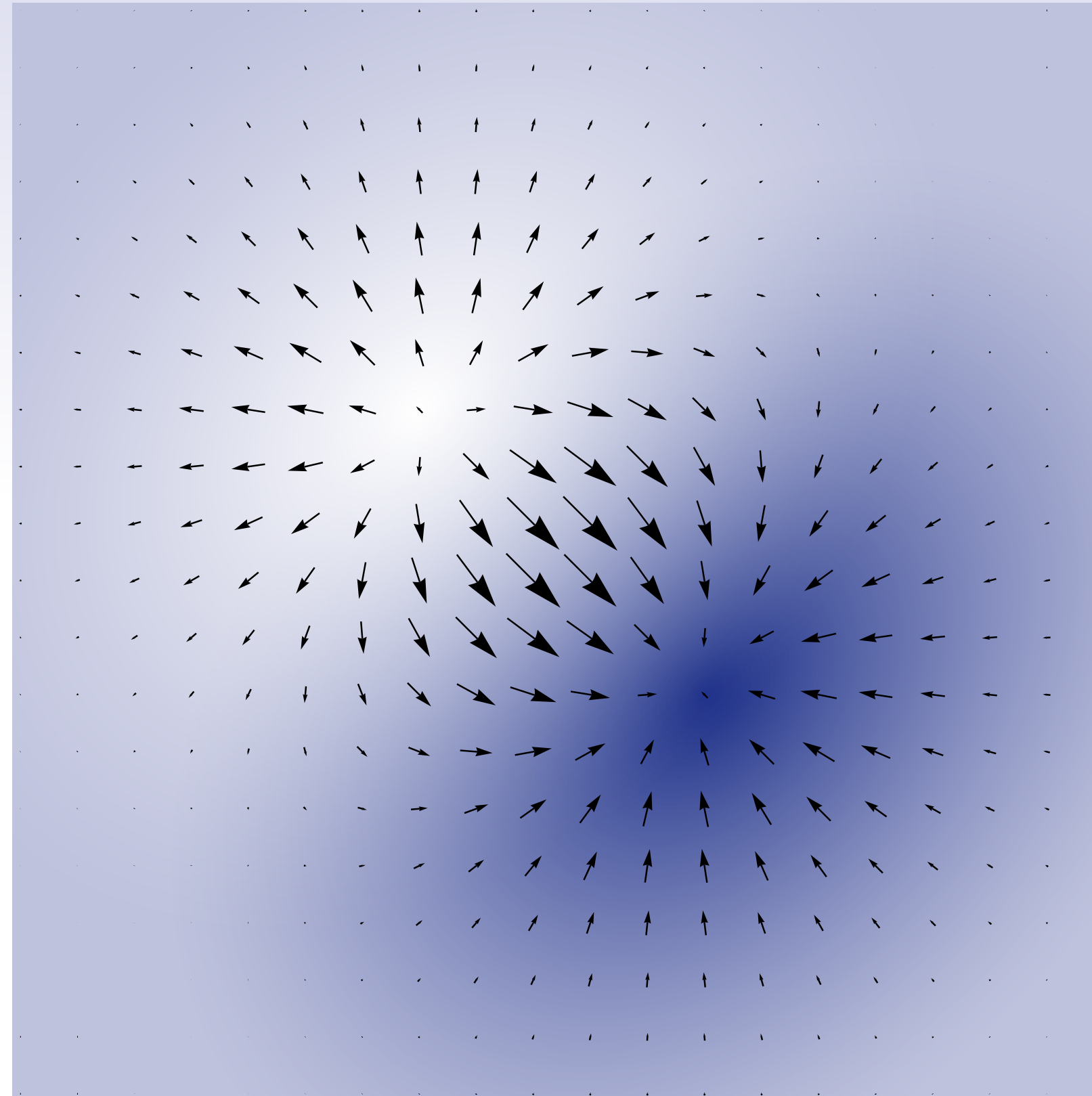
$$\nabla \cdot X = \star d(\star X^b)$$

( codifferential:  $\delta := \star d \star$  )

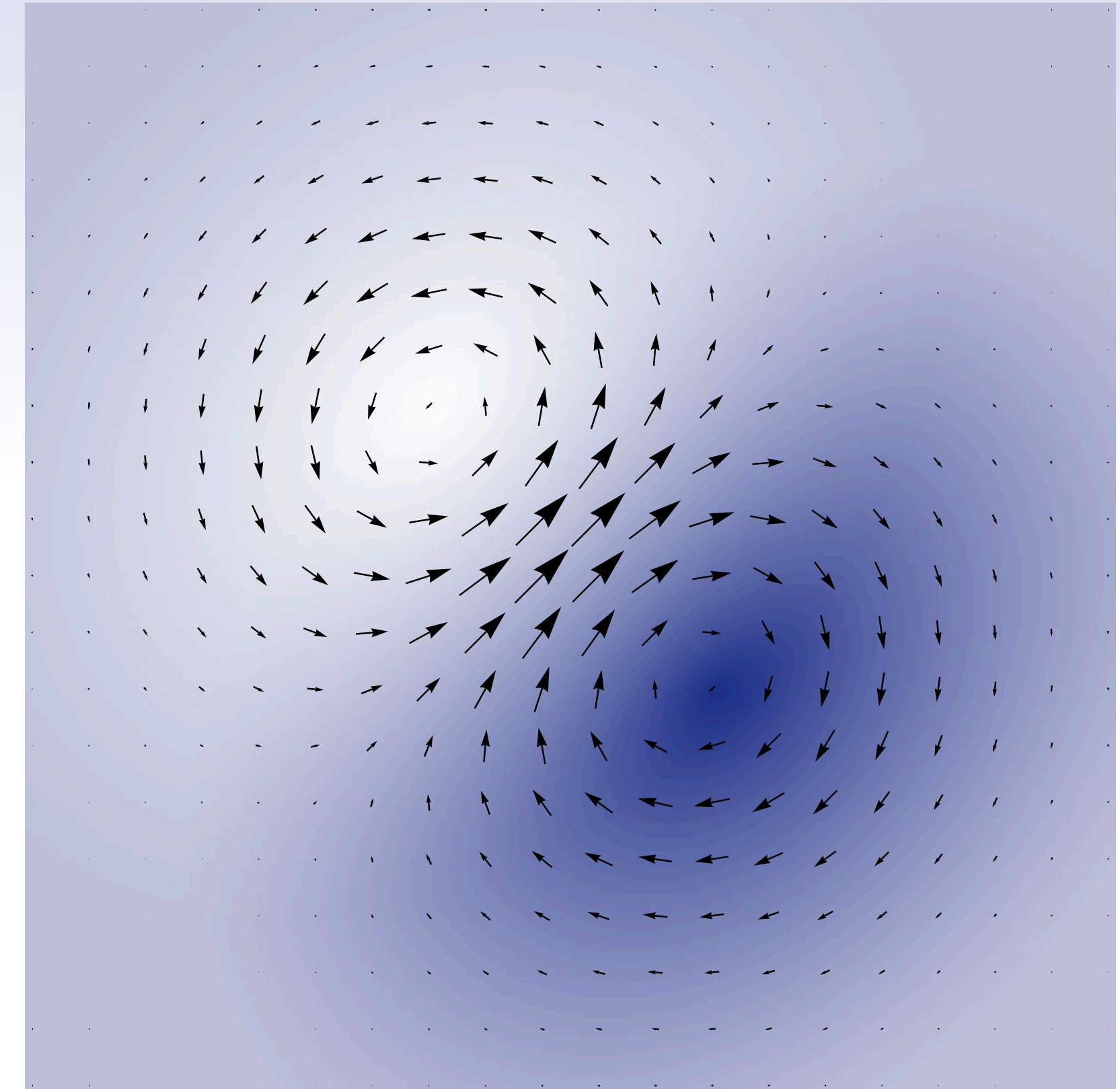
# *Exterior vs. Vector Derivatives—Summary*

 $\phi$ 

$\text{grad } \phi$   
 $(d\phi)^\sharp$

 $X$ 

$\text{div } X$   
 $\star d(\star X^\flat)$

 $Y$ 

$\text{curl } Y$   
 $(\star(dX^\flat))^\sharp$



# *Exterior Derivative—Summary*



# *Exterior Derivative*

Unique *linear* map  $d : \Omega^k \rightarrow \Omega^{k+1}$  such that

**differential**      for  $k = 0$ ,  $d\phi(X) = D_X\phi$

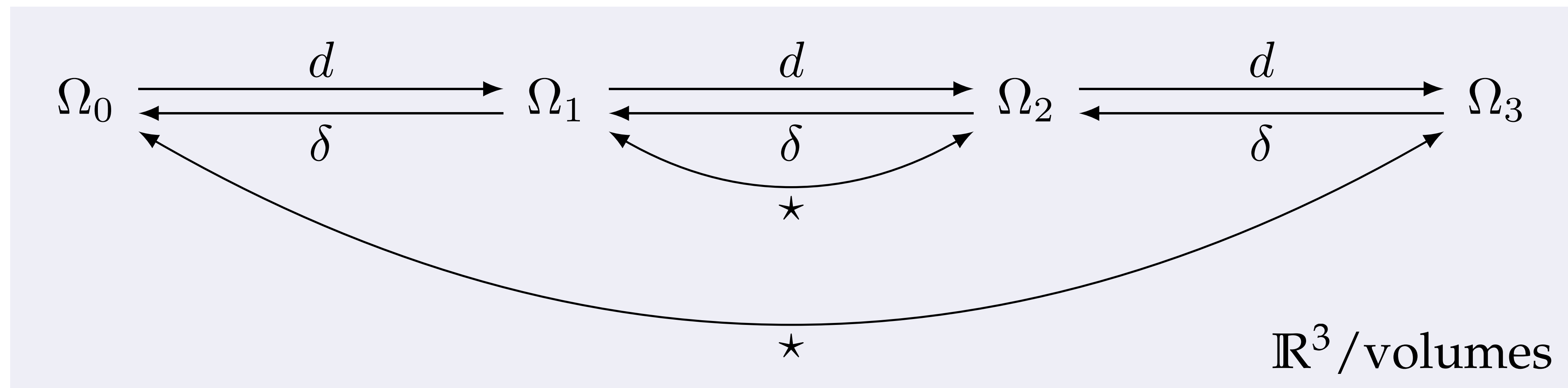
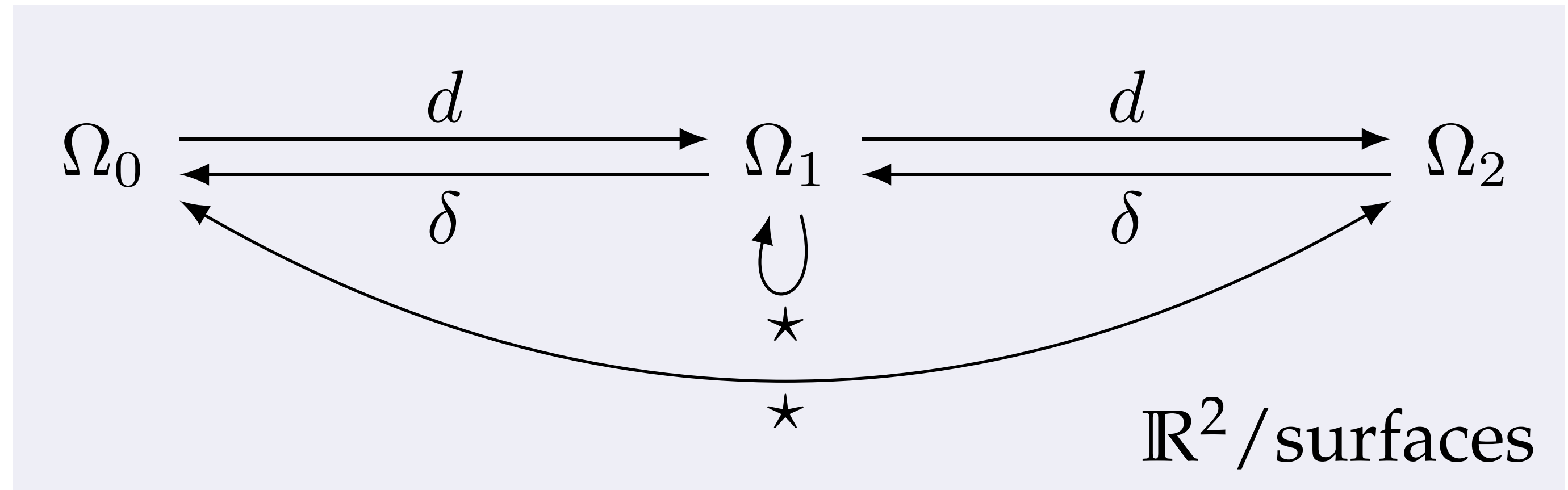
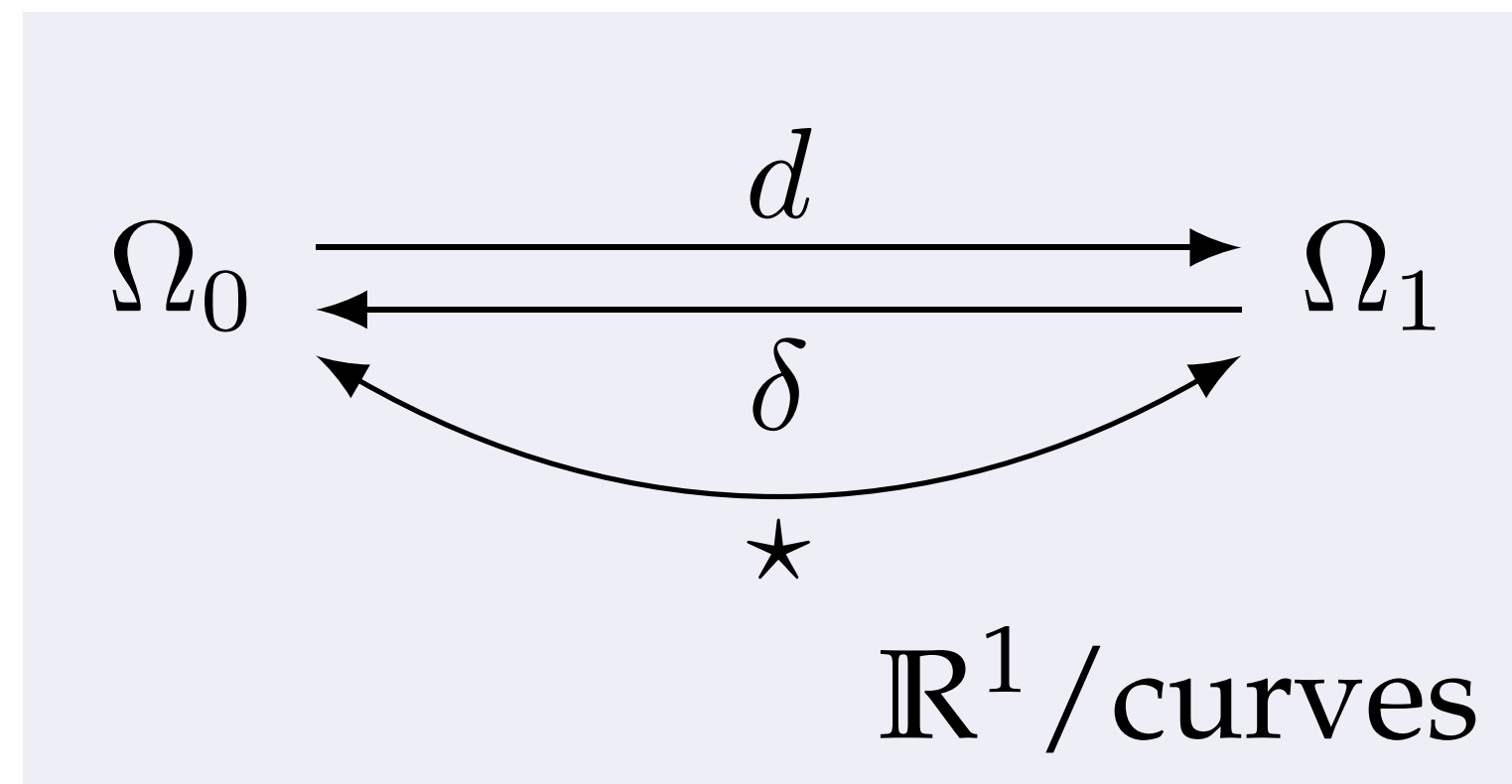
**product rule**       $d(\alpha \wedge \beta) = d\alpha \wedge \beta + (-1)^k \alpha \wedge d\beta$

**exactness**       $d \circ d = 0$



# Exterior Calculus—Diagram View

- Taking a step back, we can draw many of the operators seen so far as diagrams:



$\Omega_k$ —differential  $k$ -forms

# Laplacian

- Can now compose operators to get other operators
- E.g., *Laplacian* from vector calculus:

$$\Delta := \text{div} \circ \text{grad}$$

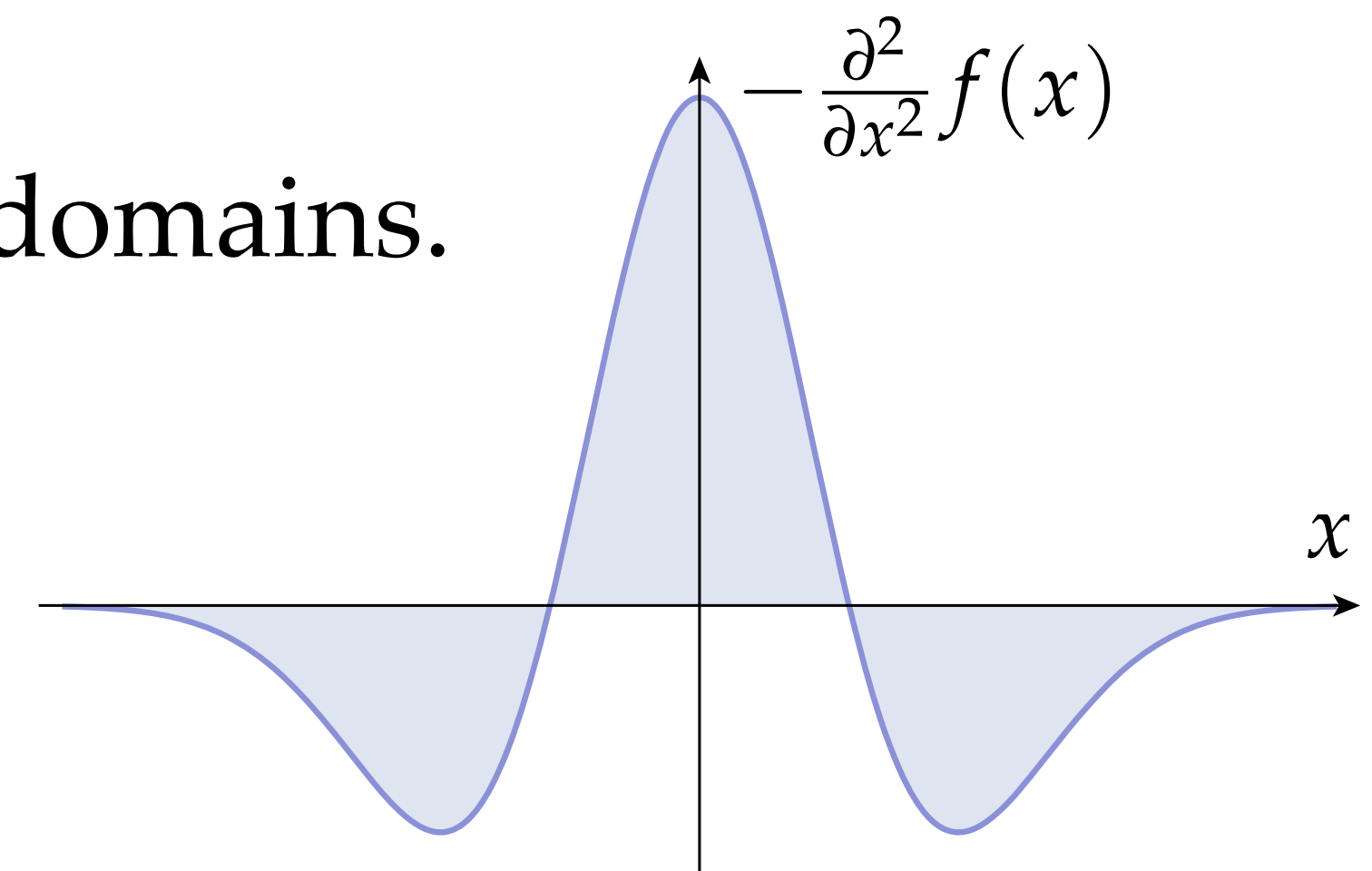
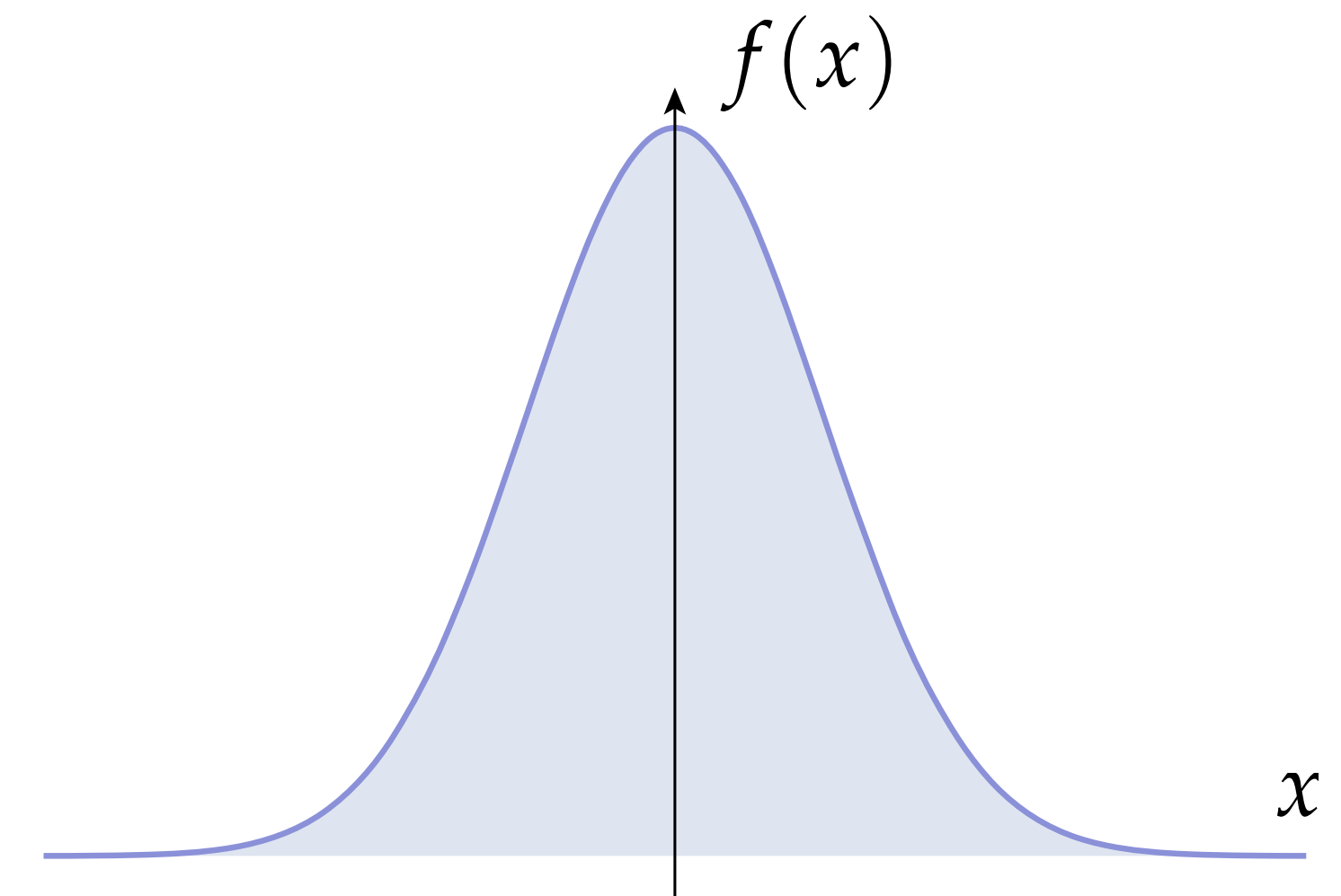
- Can express exact same operator via exterior calculus:

$$\Delta = \star d \star d$$

- ...except that this expression easily generalizes to curved domains.
- Can also generalize to  $k$ -forms:

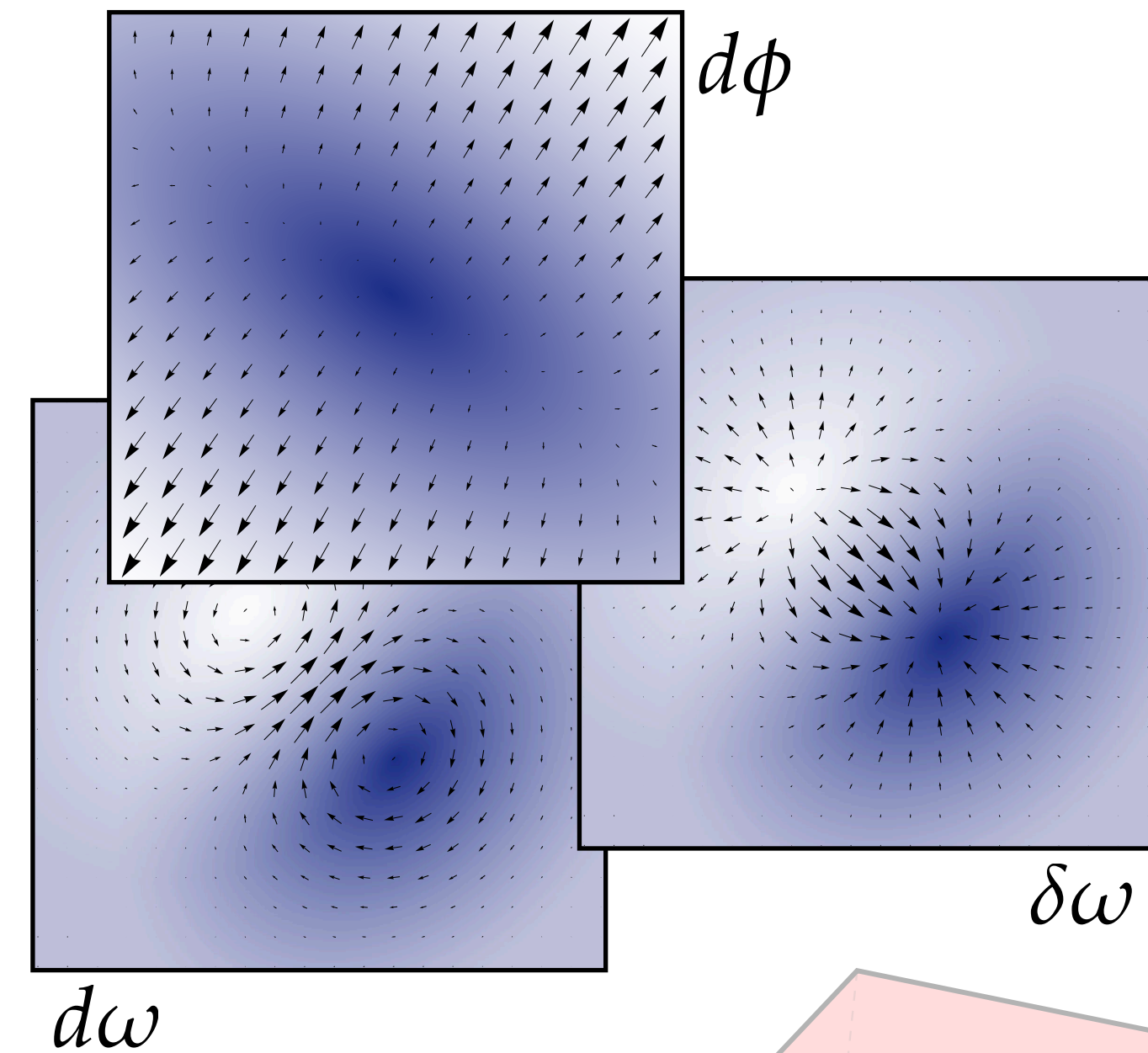
$$\Delta := \star d \star d + d \star d \star$$

- Will have **much** more to say about the Laplacian later on!

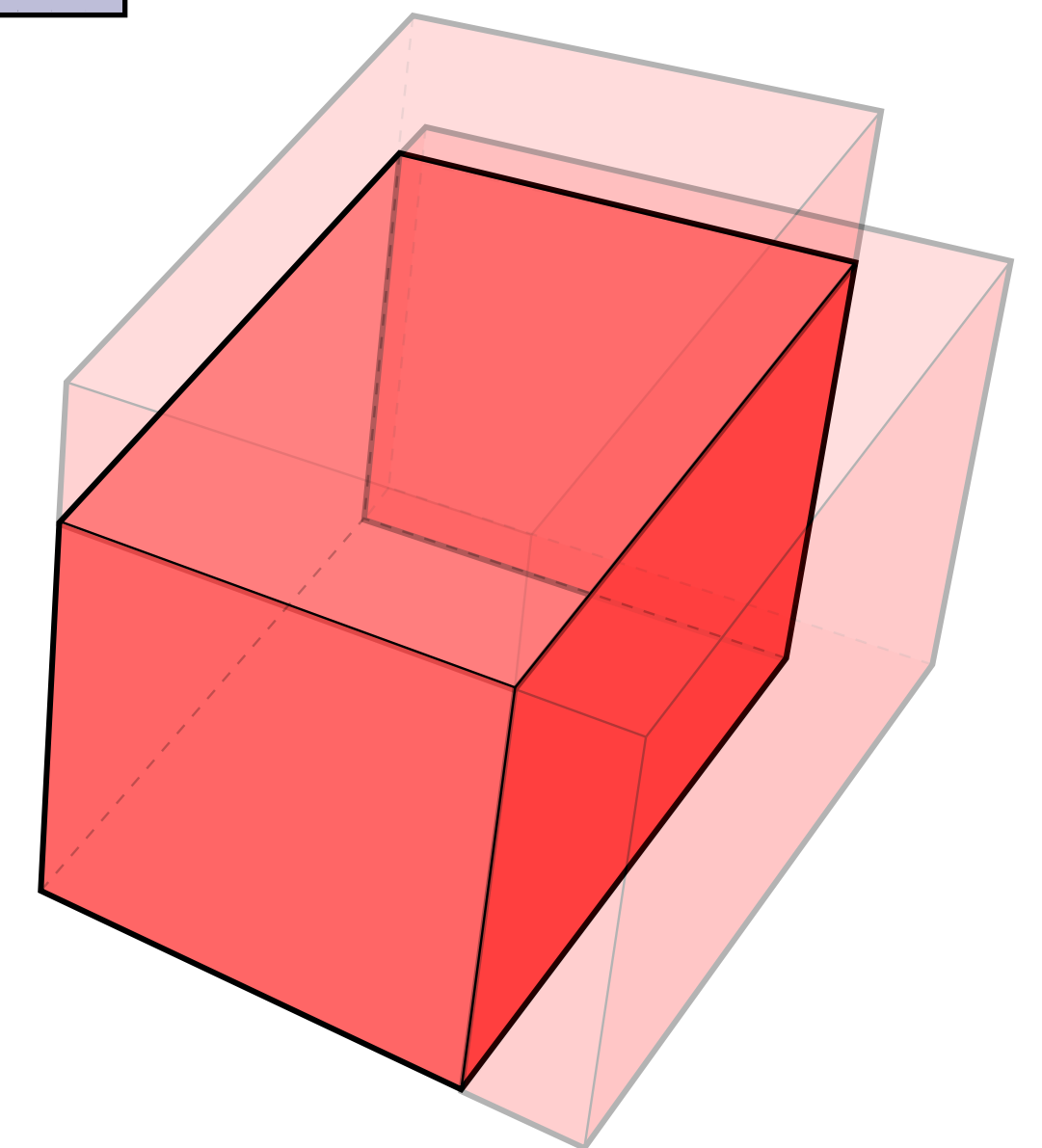


# Exterior Derivative - Summary

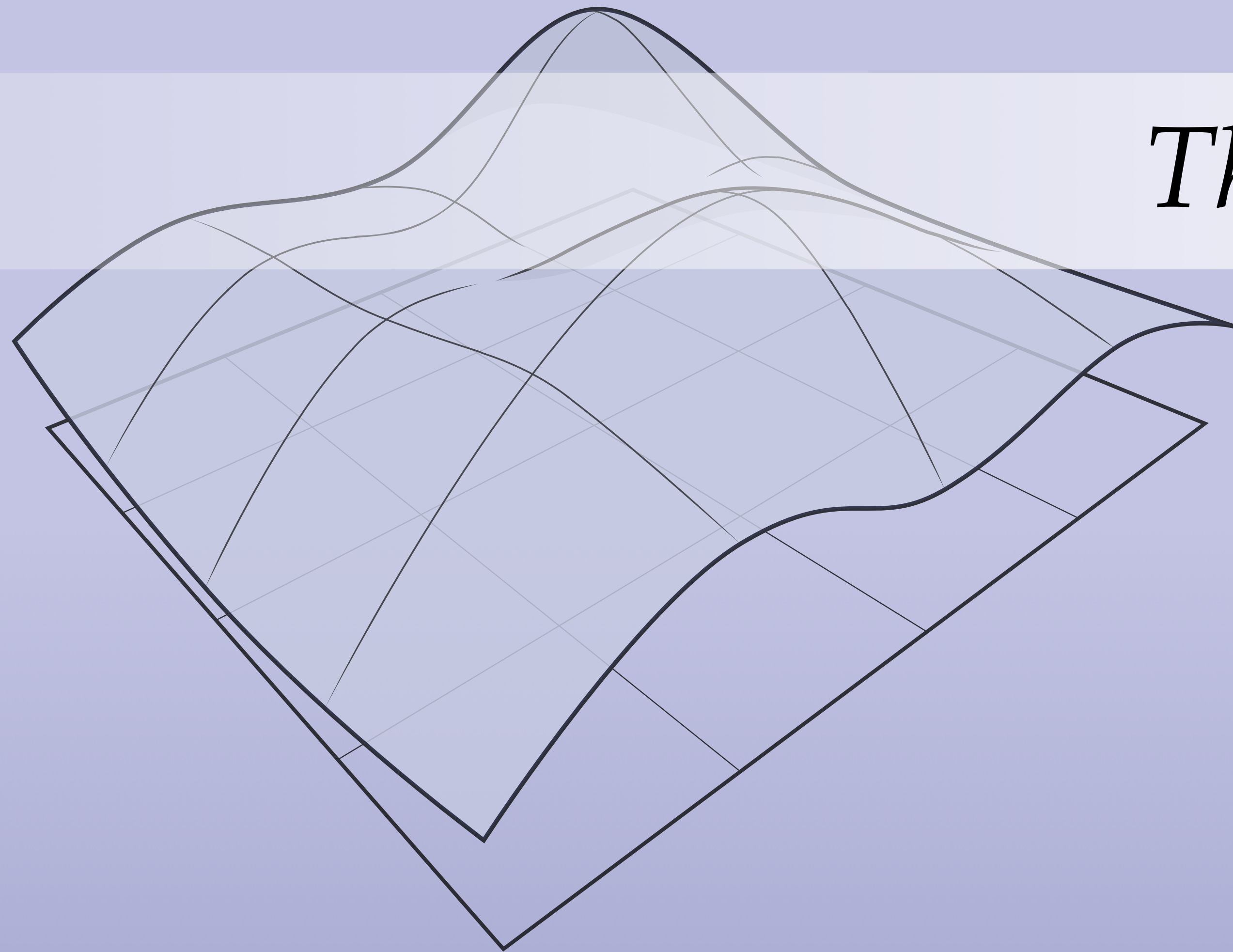
- Exterior derivative  $d$  used to differentiate k-forms
  - 0-form: “gradient”
  - 1-form: “curl”
  - 2-form: “divergence” (codifferential  $\delta$ )
  - and more...
- Natural product rule
- $d$  of  $d$  is zero
  - Analogy: curl of gradient
  - More general picture (soon!) via *Stokes’ theorem*



$$\Omega_0 \xrightarrow{d} \Omega_1 \xrightarrow{d} \Omega_2$$



*Thanks!*



# DISCRETE DIFFERENTIAL GEOMETRY

## AN APPLIED INTRODUCTION